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Deepak Premkumar Magnus Lofstrom Joseph Hayes Brandon Martin Sean Cremin

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ABSTRACT

Empirical Analysis of Racial Disparities in Policing^{*}

Racial disparities within the criminal justice system continue to be a pressing issue in the U.S. In this paper, we analyze data for almost four million stops by California's fifteen largest law enforcement agencies in 2019, examining the extent to which people of color experience searches, enforcement, intrusiveness, and use of force differently from white people. Black Californians are more likely to be searched than white Californians, but searches of Black civilians reveal less contraband and evidence. Black people are overrepresented in stops not leading to enforcement as well as in stops leading to an arrest. While differences in location and context for the stop significantly contribute to racial disparities, notable inequities remain after accounting for such factors. These disparities are concentrated in traffic stops. A notable proportion of which lead to no enforcement or discovery—suggesting that gains in efficiency and equity are possible. Through a "veil of darkness" analysis, we find evidence that racial bias may be a contributing factor to disparities in traffic stops for Black and Latino drivers. These findings suggest that traffic stops for non-moving violations deserve consideration for alternative enforcement strategies.

JEL Classification:J15, K42, K14, H41Keywords:policing, racial disparities, racial bias, stops, searches,
enforcement

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Introduction

California's Racial Justice Act (RJA) recently went into full effect, enshrining extra legal protections for equal racial treatment under the law. It outlines protections against cases of explicit racism and implicit bias in court or from law enforcement and racially disparate charging, convicting, or sentencing.¹ Though the scope of RJA claims is still being determined by courts, data and research will be pivotal in determining where these disparities persist. As PPIC research has shown, significant racial disparities exist throughout the criminal justice system, including law enforcement stops and arrests. In this piece, we examine the legislation, potential data sources that could be used, and existing PPIC work that could illuminate the RJA claims related to systemic disparities.

Inequities in policing are especially stark between Black and white individuals: while Black residents make up about 6% of California's population, roughly 16% of all arrests are of Black residents.² Disparities are even greater at later stages in the criminal justice process, where Black people account for about 25% of county jail populations, about 26% of the probation population, and 29% of the prison population.³

A recent PPIC survey found that 62% of Californians believe that the criminal justice system is biased against African Americans,⁴ Among African Americans, 88% hold this view.⁵ And while 54% of adults in California say police treat all racial and ethnic minorities fairly "almost always" or "most of the time," only 18% of African Americans share that view.⁶

Recognizing the need for data and research on law enforcement stops, the California legislature passed the Racial and Identity Profiling Act (RIPA) in 2015.⁷ The legislation—which was rolled out in waves based on the size of the agency-now requires all law enforcement agencies in California to collect officer-perceived demographic and other detailed data for all pedestrian and traffic stops.⁸ The data from 2019, before the COVID-19 pandemic, had four million stops made by the fifteen largest law enforcement agencies in the state.⁹

This article builds on the authors' previous work on arrests in California that found that criminal justice reforms implemented over the last decade have reduced racial disparities in arrests, bookings, and incarceration.¹⁰ However, wide gaps remain. The RJA elevates the importance of understanding these gaps across the full spectrum of criminal justice outcomes. Here, we broaden the scope of outcomes to law enforcement stops and eventually traffic stops, which include the many interactions Californians have with law enforcement that do not lead to arrests.

https://oag.ca.gov/sites/all/files/agweb/pdfs/ripa/ripa-board-report-2021.pdf.

¹ CAL. PENAL CODE § 745.

² See Sarah Bohn et al., Racial Disparities are Widespread in California, PUB. POL'Y INST. OF CAL. (Jun. 3, 2020), https://www.ppic.org/blog/racial-disparities-are-widespread-in-california/; Heather Harris & Sean Cremin, California's Prison Population, PUB. POL'Y INST. OF CAL. (Sept. 2024), https://www.ppic.org/publication/californias-prison-population/.
 ³ See Bohn et al., supra note 2; see also Harris & Cremin, supra note 2.
 ⁴ MARK BALDASSARE ET AL., PUB. POL'Y INST. OF CALL, PPIC STATEWIDE SURVEY: CALIFORNIANS AND THEIR

GOVERNMENT (2021), https://www.ppic.org/publication/ppic-statewide-survey-californians-and-their-government-march-2021.

⁵ Id.

⁶ Rachel Lawler & Deja Thomas, Black Californians Stand Out in Views of Police Treatment, PPIC BLOG, (Apr. 16, 2021), https://www.ppic.org/blog/black-californians-stand-out-in-views-of-police-treatment/. ⁷ A.B. 953, 2015 Gen. Assemb., Reg. Sess. (Cal. 2015).

⁸ Id.

⁹ RACIAL AND IDENTITY PROFILING ADVISORY BOARD, ANNUAL RIPA REPORT (2021)

¹⁰ Magnus Lofstrom et al., Proposition 47's Impact on Racial Disparity in Criminal Justice Outcomes, PUB. POLICY INST. OF CAL. (Jun. 2020), https://www.ppic.org/publication/proposition-47s-impact-on-racial-disparity-in-criminal-justice-outcomes/.

Given that the starkest disparities are between Black and white Californians, our research focuses on inequities between these groups in frequency of stops, reasons for stops, and outcomes to provide a more complete picture of what those experiences are like. We examine the likelihood that the individual stopped is searched, whether the search yielded any contraband or evidence, and if the stop resulted in any enforcement measures. We also examine intrusiveness and use of force, measured by reported outcomes such as being asked to step out of the vehicle, being handcuffed, and the involvement of an officer's weapon. We then separately analyze outcomes by statewide (California Highway Patrol) and local (police and sheriff's departments) jurisdictions. Finally, we investigate the potential role of racial bias in traffic stops, and we conclude with additional considerations for policy and practice based on this research.

Background on the Racial Justice Act

The RJA, passed in 2020, prohibits the state from "seeking a criminal conviction or sentence on the basis of race, ethnicity, or national origin" for a person in any case beginning on or after January 1, 2021.¹¹ In 2022, AB 256 amended the RJA to be applicable retroactively for a person in any case prior to 2021.¹² From the narrow standard set in McCleskey v. Kemp, which required a defendant to prove that purposeful and explicit discrimination was applied against them,¹³ the RJA fundamentally shifts how equal protection under the law is applied to Californians by expanding how a defendant can prove racially disparate treatment in their case. Defendants in California can now establish claims of discrimination in their cases by showing legal system actors exhibited explicit or *implicit* racial bias toward them or their race, or by showing statistical disparities in charging, convicting, or sentencing by race, ethnicity, or national origin in the same county.¹⁴ As this landmark legislation has the potential to transform California's criminal justice system, it also highlights the urgent need to use data and research to identify where systemic racial disparities occur.

Understanding how data and evidence are important to RJA claims requires a closer look at the specific Penal Code language. An RJA violation is established if the defendant proves at least one of four claims. Under the first two claims, a violation occurs if a defendant proves that a judge, attorney, law enforcement officer, expert witness, or juror involved in the case exhibits bias or uses "racially discriminatory language"¹⁵ toward a defendant's race, ethnicity, or national origin, "whether or not purposeful," in court or during proceedings.¹⁶ Importantly, these first two provisions allow for explicit or implicit bias directed toward defendants or their race by legal system actors to be sufficient for an RJA violation.

¹¹ A.B. 2542, 2020 Gen. Assemb., Reg. Sess. (Cal. 2020).

¹² See Racial Justice Act Retroactivity AB 256, OFFICE OF THE STATE PUB. DEFENDER, https://www.ospd.ca.gov/wp-content/uploads/2023/06/AB-256-Racial-Justice-Act-retroactivity_Accessible.pdf.

 ¹³ McCleskey v. Kemp, 481 U.S. 279 (1987).
 ¹⁴ CAL. PENAL CODE § 745.

¹⁵ Id. at § 745(h)(4). According to this code, racially discriminatory language is defined as "language that, to an objective observer, explicitly or implicitly appeals to racial bias, including, but not limited to, racially charged or racially coded language, language that compares the defendant to an animal, or language that references the defendant's physical appearance, culture, ethnicity, or national origin. Evidence that particular words or images are used exclusively or disproportionately in cases where the defendant is of a specific race, ethnicity, or national origin is relevant to determining whether language is discriminatory." *Id.* 16 *Id.* at §§ 745(a)(1)-(2).

This paper provides evidence related to the third and fourth RJA claims because they are focused on the use of statistical data to reveal potential systemic disparities by race, ethnicity, and national origin. The third type of RJA violation relates to whether a person is charged or convicted of more serious offenses than people of other races who have "engaged in similar conduct and are similarly situated" and the evidence establishes that the prosecution "more frequently sought or obtained" convictions for these more serious offenses against people with the same race as the defendant in the same county.¹⁷ The fourth violation is similar to the third but applies to sentencing. It says that a violation occurs if a longer or more severe sentence is imposed on a defendant relative to "other similarly situated individuals" convicted of the same offense and longer sentences were "more frequently imposed" for that offense on people of the same race as the defendant in the same county.¹⁸ In sum, an RJA violation may be established if defendants prove that racial disparities exist in charging, convicting, or sentencing for similar offenses in the same county that disproportionately impact people from their racial group. If a court rules that a violation has occurred, it is required to impose a specific remedy to the violation.¹⁹ Remedies include declaring a mistrial, discharging the jury and empaneling a new one, dismissing enhancements or special circumstances, reducing charges, and vacating convictions or sentences and ordering new proceedings.²⁰

Importantly, the 745(a)(3) and (a)(4) claims do not have any mentions of bias, which suggests that the appropriate test is examining racial disparities of individuals who engage in similar conduct after contextual factors are considered (similarly situated). Bias, implicit or explicit, implies some prejudicial behavior from a person, whereas a test of racial disparities highlights differing treatment under the law, regardless of intent or determinant of disparity, after ensuring similar conduct and situation.

Additional provisions of the RJA shed light on how and which types of data can be used to inform RJA claims of racial disparity and wider discussions of racial disparities in California's criminal justice system. First, the law clarifies that disparities in "more frequently sought or obtained" charges or convictions or "more frequently imposed" sentences are established if the "totality of the evidence demonstrates a significant difference comparing individuals who have engaged in similar conduct and are similarly situated" and the prosecution cannot establish race-neutral reasons for this difference.²¹ Importantly, this "significant difference" does not require "statistical significance"—though the court may consider it—and evidence can include "statistical evidence, aggregate data, or non-statistical evidence."²² When evaluating the "totality of evidence," the law requires courts to "consider whether systemic and institutional racial bias, racial profiling, and historical patterns of racially biased policing and prosecution may have contributed to, or caused differences observed in, the data or impacted the availability of data overall."23

Although the RJA legislation does not formally define individuals engaged in "similar conduct," one possible interpretation is individuals who commit similar criminal offenses. "Similarly situated" individuals refer to there being similar factors relevant in charging and sentencing across groups, but do not require individuals to be identical.²⁴ However, "conviction history may be a relevant factor to the severity of the charges, convictions, or sentences"-that is, when comparing outcomes between groups, one may need to consider criminal histories (i.e.,

¹⁷ *Id.* at § 745(a)(3). ¹⁸ *Id.* at § 745(a)(4). ¹⁹ *Id.* at § 745(e).

²⁰ *Id.* at \$ 745(e)(1)-(4). Once an RJA violation has been found in court, the defendant is no longer eligible for the death penalty.

Id. at § 745(h)(1).

²² CAL. PENAL CODE § 745(h)(1).

²³ *Id.* ²⁴ *Id.*

only comparing people with no criminal histories across racial groups).²⁵ As mentioned above, when comparing criminal histories, the court does need to consider whether systemic racial bias, profiling, and/or biased *policing* played a role in generating any differences in the criminal histories. Solidified through the Young decision (discussed below),²⁶ the RJA makes clear the value in understanding racial disparities in police stops, which provides essential context for understanding disparities in charging, sentencing, and convicting. Taken together, these RJA provisions motivate a range of analyses that can be used to identify racial gaps relevant not only to individual RJA claims, but also for accomplishing the legislation's ultimate intent to "eliminate racially discriminatory practices in the criminal justice system."²⁷ However, this can only be accomplished if relevant, high-quality criminal justice data exists.

Relevant RJA Court Cases

Given the unprecedented nature of the RJA, court cases continue to inform its implementation in practice. A 2022 appellate court ruling provided initial guidance on the RJA's discovery provision allowing a defendant to obtain relevant evidence of a violation "[u]pon a showing of good cause."²⁸ In Young v. Superior Court of Solano County, the defendant used publicly available statistics to argue that racial profiling in traffic stops led to his arrest for drug possession.²⁹ The defendant's discovery motion under the RJA that showed racial disparities in charges of drug possession was originally denied by a trial court.³⁰ However, an appellate court vacated that decision, ruling that Young was entitled to discovery based on "the minimal threshold showing that is required to ... provide ... Pitchess discovery."³¹ Although the appellate court did not go as far to grant Young's request for discovery, the decision signaled that potential racial disparities in traffic stop data is sufficient to trigger discovery in any relevant RJA claim. This decision underscores the importance of investigating potential disparities in law enforcement stops, which may inform RJA claims.

Subsequent court cases have set meaningful legal precedents regarding the RJA's application and how data can impact RJA litigation. An important early case addressed the "prima facie" standard of the RJA. Once a motion is filed in trial court and a defendant makes a prima facie showing of an RJA violation, the law states the court must hold a hearing.³² The law clarifies that a prima facie showing requires the defendant to establish that there is a "substantial likelihood"—more than a mere possibility, but less than more likely than not—that a violation occurred.³³ In Finley v. the Superior Court of San Francisco, the trial court determined that the defendant did not establish a prima facie violation of the RJA, as the defense's argument did not meet the substantial likelihood standard.³⁴ However, the *Finley* appellate ruling reversed this decision, holding that an RJA prima facie standard requires a lower threshold than a general habeas claim.³⁵ The appellate ruling also held that courts must accept a

²⁵ Id.

¹² *Ia.*²⁶ Young v. Super. Ct. of Solano Cnty., 79 Cal. App. 5th. 138 (Cal. Ct. App. 2022).
²⁷ A.B. 2542, 2020 Gen. Assemb., Reg. Sess. (Cal. 2020).
²⁸ CAL. PENAL CODE § 745(d).
²⁹ *Young*, 79 Cal. App. 5th. at 141.
³⁰ *Id.* at 144.
³¹ *Id.* 4144.

³¹ *Id.* at 141.

³² CAL. PENAL CODE § 745(c).

³³ Id. at § 745(h)(2).

³⁴ Finley v. Super. Ct. of S.F. Cnty., 95 Cal. App. 5th 12, 18 (Cal. Ct. App. 2023).

³⁵ *Id.* at 22.

defendant's factual allegations as true (unless allegations are clearly unsupported by evidence) at the prima facie stage and not make credibility determinations until evidentiary hearings.³⁶

Defendants are beginning to use data and evidence in court to support claims of RJA violations based on systemic racial disparities (745(a)(3) and 745(a)(4) RJA violations). In *People v. Windom*, four Black co-defendants were charged with murder, conspiracy, and gang allegations including a gang murder special circumstance—which carries life without parole—by the Contra Costa County District Attorney's Office.³⁷ Pursuant to the RJA, specifically California Penal Code Section 745(a)(3), the defendants successfully filed a motion to dismiss the gang murder special circumstance after showing racial disparities in charging practices in the county.³⁸ The defense used prosecutorial data to show that Black defendants who were "similarly situated" and engaged in "similar conduct" as non-Black defendants were 44% more likely to be charged with gang murder special circumstances in County.³⁹ The court found that this disparity was "significant" and "more likely than not" was caused by a defendant's race rather than random chance.⁴⁰ The court also found that the prosecution failed to show a "race-neutral cause of explanation" and the gang murder special circumstance charges were dismissed.⁴¹ This first-of-its-kind ruling highlights the relationship between data that show systemic racial disparities and the impact it can have on RJA litigation.

Data Sources

California provides some key databases to examine racial disparities in criminal justice outcomes. However, availability, granularity, and reliability vary between sources. In terms of publicly available data, the California Department of Justice (DOJ)'s OpenJustice Data Portal houses stop, use of force, and arrest information.⁴² The RIPA police stop data is the main focus of this article and is discussed in more detail below. We use RIPA data to examine racial disparities in law enforcement interactions and traffic stops.

Publicly available arrest data includes race and location information helpful for understanding aggregate trends. While this data is helpful to understand general disparities in arrests, more granular data is needed to satisfy the RJA's definition of racial disparity. The DOJ's Automated Criminal History System (ACHS), which is not publicly available, includes incident-level arrest information on offense level, violation type, and arrestee information such as gender, age, and race/ethnicity.⁴³ With more detailed criminal history information, ACHS data is helpful for satisfying the RJA's definition of "similar conduct" of "similarly situated" individuals. Researchers are already using ACHS data to highlight disparities, though data limitations remain.⁴⁴ Those

³⁶ *Id.* at 22-23.

³⁷ See Annelise Finney, *California's Groundbreaking Racial Justice Act Cuts its Teeth in Contra Costa*, KQED (Feb. 13, 2024), https://www.kqed.org/news/11975584/californias-groundbreaking-racial-justice-act-cuts-its-teeth-in-contra-costa. ³⁸ CAL. PENAL CODE § 745(a)(3); Finney, *supra* note 30.

 ³⁹ Evan Kuluk, Disparate Racial Impact of Discretionary Prosecutorial Charging Decisions in Gang-Related Murder Cases: Litigating the Racial Justice Act in People v. Windom, 29 BERKELEY J. CRIM. L. 71, 76 (2024).
 ⁴⁰ Id. at 77.

 $^{^{41}}$ Id. at 77-78.

⁴² See OpenJustice Data Portal, CA DOJ, https://openjustice.doj.ca.gov/data (last visited Oct. 17, 2024).

⁴³ See Data Request Process, ROB BONTA ATTORNEY GENERAL, https://oag.ca.gov/research-services/request-process (last visited Oct. 17, 2024).

⁴⁴ See e.g., Colleen Chien, W. David Ball & William Sundstrom, *Proving Actionable Racial Disparity Under the California Racial Justice Act*, 75 U. CAL. COLL. LAW JOURNAL 1 (2023).

researchers have created a RJA data tool for practitioners to assess racial disparities in a variety of criminal justice outcomes, from arrest to conviction and sentencing.⁴⁵

In California, certain district attorneys have partnered with data-proficient organizations to clean, format, and visualize trends in their data, which can be disaggregated by race. For example, the Yolo County District Attorney has partnered with Measures for Justice to develop a data dashboard that can examine the breakdown of case flows in the office by race to increase transparency and evaluate policy goals,⁴⁶ while the Los Angeles District Attorney has partnered with the California Policy Lab to release a Prosecution Data Hub to provide this information to researchers so they can evaluate the efficacy of policies.⁴⁷ Other datasets that could inform RJArelated claims are the New York University's (NYU) Jail Data Initiative,⁴⁸ which provide data on a handful of localities within California, and the Stanford Open Policing Project,⁴⁹ which maintains a website that houses stop data from many localities across the U.S. and produces its own research using these data.

RIPA data on police stops

The California state legislature passed the Racial and Identity Profiling Act (RIPA) in 2015 (AB 953), which required all law enforcement agencies in California to collect perceived demographic and other detailed data regarding all pedestrian and traffic stops by 2023.⁵⁰ A "stop" is defined as "any detention by a peace officer of a person, or any peace officer interaction with a person in which the officer conducts a search."⁵¹

The requirements for collecting California traffic and pedestrian stop data are arguably the largest and most expansive efforts in the United States, although other states have collection requirements as well. According to the NYU School of Law Policing Project, as of 2019, approximately twenty states have laws that mandate collection of stop data on varying amounts of traffic stops.⁵² Of these twenty states, only California, Oregon, and Illinois mandate data collection for both traffic and pedestrian stops.⁵³

States such as California, Illinois, North Carolina, and Maryland make their data publicly available and include regular reports that analyze that data.⁵⁴ The remaining states vary in their data availability and published reports. A number of cities and counties, in states with data collection laws and without, publish their own stop data.⁵⁵

 ⁴⁵ See Racial Justice Act Tool [beta], PAPER PRISONS (Sept. 16, 2024), https://rja.paperprisons.org/.
 ⁴⁶ See Yolo County, CA Case Flow Data, COMMONS SHARED BY MEASURES FOR JUST. (May 28, 2024),

https://commons.measuresforjustice.org/prosecutor/yoloda/case-flow.

⁴⁷ See Los Angeles Prosecutorial Data Hub, CAL. POL'Y LAB, https://capolicylab.org/data-resources/los-angeles-prosecutiondata-hub/ (last visited Oct. 17, 2023).

⁴⁸ See Jail Data Initiative, Soc. Sci. RSCH. COUNCIL PUB. SAFETY LAB, https://jaildatainitiative.org/ (last visited Oct. 17,

^{2023).} ⁴⁹ See The Open Policing Project, THE STANFORD OPEN POLICING PROJECT (2023), https://openpolicing.stanford.edu/ (last visited Oct. 17, 2023).

⁵⁰ A.B. 953, 2015 Gen. Assemb., Reg. Sess. (Cal. 2015); *see infra* Technical Appendix A for more details. 51 *Id*.

⁵² Marie Pryor, PhD, et al., Collecting, Analyzing, and Responding to Stop Data: A Guidebook for Law Enforcement Agencies, Government, and Communities, POLICING PROJECT NYU SCHOOL OF LAW,

https://www.policingproject.org/stopdata (last visited Oct. 17, 2023).

⁵³ See Hannah Rose Anderson and Alexa Perlmutter, It's time to start collecting stop data: A case for comprehensive statewide legislation, POLICING PROJECT NYU SCHOOL OF LAW (Sept. 30, 2019) https://www.policingproject.org/newsmain/2019/9/27/its-time-to-start-collecting-stop-data-a-case-for-comprehensive-statewide-legislation. ⁵⁴ Id.

⁵⁵ See Stop, Question and Frisk Data from New York Police Department, https://www.nyc.gov/site/nypd/stats/reportsanalysis/stopfrisk.page.

The data elements mandated by the RIPA statute include person-level and stop-level information. For personlevel data, which we refer to throughout as personal traits, officers are required to record their perception of the identity characteristics for each individual stopped, including:

- race or ethnicity •
- gender •
- approximate age .
- lesbian, gay, bisexual, or transgender (LGBT) status .
- English fluency
- disability (including behavioral health status).⁵⁶ •

Officers are prohibited from asking the person stopped to self-identify these characteristics.⁵⁷

Stop-level elements include:

- the reason for the stop (including a traffic violation, reasonable suspicion, parole/probation/mandatory supervision, knowledge of an outstanding arrest warrant/wanted person, and consensual encounter resulting in search)
- any action taken by an officer during the stop (such as whether the suspect was removed from the vehicle, • removed from the vehicle by physical contact, subject to curbside detention, handcuffed, subject to canine search, or an officer's use of an electronic device, chemical spray, or firearm)
- the reason for search (probable cause, consent, search warrant, visible contraband, odor of contraband, • etc.)
- any contraband or evidence discovered (such as guns, drugs, drug paraphernalia, alcohol, money, or • stolen property)
- the enforcement result of stop (including no action, warning, citation, cite and release, and booking).⁵⁸

The data do not allow for corroborating the accuracy of the reported information, including the race and identity of the individual stopped and the specific actions taken by the officer. Nor do the data include information on the race and ethnicity of the officer.

The data collection mandate for the pedestrian and traffic stops began in 2018, rolling out according to agency size based on the number of peace officers employed.⁵⁹ The largest agencies were required to submit their first reports by April 1, 2019 (commonly called Wave 1).60 Wave 1 included the eight largest agencies in CA employing 1,000 or more peace officers and stop data collected between July 1 and December 31, 2018.⁶¹ Wave 1 agencies include the California Highway Patrol, the police departments of the cities of Los Angeles, San Diego, and San Francisco, and the sheriff's departments of Los Angeles, San Bernardino, Riverside, and San Diego

⁵⁶ RACIAL AND IDENTITY PROFILING ADVISORY BOARD, ANNUAL RIPA REPORT 21 (2021) https://oag.ca.gov/sites/all/files/agweb/pdfs/ripa/ripa-board-report-2021.pdf.

⁵⁷ CAL. GOV'T CODE § 12525.5(b)(7). ⁵⁸ *Id.* at § 12525.5(b)(8).

⁵⁹ Id. at § 12525.5(a)(2).

⁶⁰ Id.

⁶¹ Id.

Counties.⁶² The second group of agencies, employing between 667 and 1,000 peace officers, began collecting stop data on January 1, 2019.⁶³ Wave 2 agencies included the police departments of the cities of Fresno, Long Beach, Oakland, Sacramento, and San Jose, and the sheriff's departments of Orange and Sacramento Counties.⁶⁴ After January 1, 2022, virtually all law enforcement agencies in California were required to collect stop data.⁶⁵

We examine pre-pandemic stops in 2019 from the fifteen largest law enforcement agencies in California. This includes California Highway Patrol (CHP), eight police departments (Los Angeles, San Diego, San Francisco, Sacramento, Fresno, San Jose, Long Beach, and Oakland) and six county sheriff's departments (Los Angeles, San Bernardino, Sacramento, San Diego, Riverside, and Orange County). These agencies recorded 3,992,074 stops of motorists and pedestrians during the 2019 calendar year.⁶⁶ Technical Appendix A provides details and a discussion of how the distribution of stops and outcomes vary across agencies.

Disparities in Stops and Reasons for Stops

A primary objective of this article is to examine disparities between the experiences and outcomes Black and white Californians have during a stop. To start, we must examine racial disparities in the frequency of being stopped by law enforcement, and disparities in the reported reason for the stop.

When we compare shares each group represents in stops to shares by population, we find considerable disproportionality statewide. Black residents accounted for 16% of stops made by all participating law enforcement agencies during 2019, but constituted only 7% of the state's population.⁶⁷ Residents identified by law enforcement as Middle Eastern or South Asian were also overrepresented in stops (5%) compared to their share of the state's population (2%).⁶⁸

White residents were represented fairly proportionally in stops (33%), compared with their population share (34%), as were Latino residents (39% and 41%, respectively).⁶⁹ Asian individuals were underrepresented in stops (6%) compared with their share of the population (12%), as were multiracial residents (1% and 3%, respectively).70

Individuals identified as Pacific Islanders were overrepresented (0.5% of stops, compared with 0.3% of the population) and those identified as Native American were underrepresented (0.2% and 0.3% for stops and population, respectively).⁷¹ The percentage-point differences are small, but as a proportion of the population

⁶² RACIAL AND IDENTITY PROFILING ADVISORY BOARD, ANNUAL RIPA REPORT 16 (2021) https://oag.ca.gov/sites/all/files/agweb/pdfs/ripa/ripa-board-report-2021.pdf.

⁶³ CAL. GOV'T CODE § 12525.5(a)(2).

⁶⁴ RACIAL AND IDENTITY PROFILING ADVISORY BOARD, ANNUAL RIPA REPORT 16 (2021) https://oag.ca.gov/sites/all/files/agweb/pdfs/ripa/ripa-board-report-2021.pdf.

⁶⁵ CAL. GOV'T CODE § 12525.5(a)(2).

⁶⁶ RACIAL AND IDENTITY PROFILING ADVISORY BOARD, ANNUAL RIPA REPORT 8 (2021) https://oag.ca.gov/sites/all/files/agweb/pdfs/ripa/ripa-board-report-2021.pdf.

See infra Figure 1.

⁶⁸ See infra Figure 1. ⁶⁹ See infra Figure 1.

⁷⁰ See infra Figure 1.

⁷¹ See infra Figure 1.

share, these differences are considerable. Again, the racial/ethnic identification comes solely from the officer making the stop.

FIGURE 1

Black residents are overrepresented in police stops



SOURCE: Author calculations using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019; RIPA Board Report 2021 population calculations using American Community Survey (2018).

The data also reveal differences between reasons for stopping people of different races. For example, while more than 90% of stops of individuals perceived to be Asian or of Middle East/South Asian origin are stopped for traffic violations, about 75% of Black Californians stopped are for traffic violations.⁷² Conversely, officers report reasonable suspicion in 21% of stops of Black people, while 11.7% of white people and 5.6% of Asian people are stopped for reasonable suspicion.⁷³

FIGURE 2

A greater share of Black people than white people are stopped for reasonable suspicion

⁷² See infra Figure 2.
⁷³ See infra Figure 2.



SOURCE: Author calculations using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019.

While fewer stops involve individuals known by the officer to be on parole or probation or to have an outstanding warrant, their status provides officers with rights to stop and search without consent or reasonable suspicion.⁷⁴ The percent of Black residents stopped who are on parole or probation is twice that of white residents (1.2% vs. 0.6%), and it is notably higher than Latino (0.8%) and Asian (0.2%) residents stopped as well.⁷⁵

The share of stops for an outstanding warrant is also twice as high for Black compared to white residents, also at 1.2% versus 0.6%.⁷⁶ Technical Appendix Table A2 details differences across race and ethnicity in officerperceived gender, age, mental health status, and whether the officer was responding to a call for services.

Differences in Stop Experiences

A key way this article extends the 2021 RIPA Board report is by taking a closer look at racial disparities in the experiences and outcomes of individuals after they are stopped by law enforcement.⁷⁷ More specifically, we analyze the following four stop outcomes:

• likelihood the individual stopped was searched;

⁷⁴ See CAL. PENAL CODE § 3067(b)(3).

⁷⁵ See supra Figure 2.

⁷⁶ See supra Figure 2.

⁷⁷ RACIAL AND IDENTITY PROFILING ADVISORY BOARD, ANNUAL RIPA REPORT (2021)

https://oag.ca.gov/sites/all/files/agweb/pdfs/ripa/ripa-board-report-2021.pdf.

- likelihood contraband or evidence (weapons, property, drugs or other, such as alcohol or cell phones) was found, if the person was searched;
- likelihood of enforcement, hierarchically defined below:
 - o at least a warning was issued;
 - at least a citation (for an infraction, such as a speeding ticket) was issued;
 - o an arrest (cite and release or booked into jail); or
 - booked into jail.
- likelihood of experiencing intrusive action or use of force, hierarchically defined below:
 - at least asked to step out of the vehicle;
 - at least some physical contact (such as removed from car);
 - at least detained (curbside or patrol car);
 - at least handcuffed;
 - o involved an officer's weapon (such as aiming a firearm, but not necessarily firing the weapon); or
 - o officer weapon used (including use of firearm, electronic device, chemical spray, or baton).

Of the almost four million reported stops in 2019, slightly more than 452,000 led to a person or property being searched.⁷⁸ In close to 97,000 of those searches—about 21%—the officer found some contraband or evidence.⁷⁹ That is, officers found contraband or evidence in about 2.4% of *all* police stops.⁸⁰

The most common contraband was drugs or drug paraphernalia, found in a little more than 60,000 searches.⁸¹ The second most common category is other, which includes alcohol and cell phones (presumably evidence).⁸² In 18,507 searches, the officer found a weapon or ammunition.⁸³ In more than 11,000 instances, the officer found property, which includes money that was either illegally held or was evidence.⁸⁴

In the vast majority of stops, about 88%, the officer issued at least a warning.⁸⁵ The officer issued at least a citation in 64% of all stops.⁸⁶ Officers made an arrest—either a cite and release, or a booking—in 11% of stops, and booked over 6% of stopped individuals into jail.⁸⁷

While most stops led to some level of enforcement, intrusive actions were less common. For example, individuals were at least asked to step out of the vehicle during about one in six stops.⁸⁸ Officers report some physical contact in over 14% of stops, most of which involved detaining a person curbside or in the patrol car.⁸⁹

- ⁷⁸ See infra Table 1.
- ⁷⁹ See infra Table 1.
- ⁸⁰ See infra Table 1.
- ⁸¹ See infra Table 1.
- ⁸² See infra Table 1.
- ⁸³ See infra Table 1.
 ⁸⁴ See infra Table 1.
- ⁸⁵ See infra Table 1.
- ⁸⁶ See infra Table 1.
- ⁸⁷ See infra Table 1.
- ⁸⁸ See infra Table 1.
- ⁸⁹ See infra Table 1.

In about 8% of stops, the person was at least handcuffed.⁹⁰ The percentage of stops that involved an officer's weapon (which captures an officer pointing a firearm as well as when the officer uses the firearm or other weapon) is relatively small, at 0.42%.⁹¹ However, while the percentage is small, there are 16,918 stops where the officer reports that their weapon was involved.⁹² In 1,930 instances (0.05% of stops), the officer used a weapon meaning the officer discharged a firearm or electric device such as a Taser, used a chemical spray or a baton, or a canine bit the stopped individual.⁹³ The stop data did not capture whether anyone was injured as a result of the use of a weapon, or any other action taken during the stop.

TABLE 1

Post-Stop Outcomes, All 15 Law Enforcement Agencies, 2019.

	Total	Share of All	Share of
	Number	Stops	Searches
Stops	3,992,074		
Searches	452,164	11.3%	
Contraband/Evidence Found			
Any	96,807	2.42%	21.4%
Drugs	60,493	1.52%	13.4%
Other	25,880	0.65%	5.7%
Weapon	18,509	0.46%	4.1%
Property	11,415	0.29%	2.5%
Enforcement at least			
Enforcement, at least			
Warning	3,515,247	88.1%	
Citation	2,553,928	64.0%	
Arrest	452,501	11.3%	
Booking	262,511	6.6%	
Intrusiveness/Use of Force, at			
least			
Step Out of Vehicle	653,728	16.4%	
Physical Contact	581,602	14.6%	
Detained (curbside/car)	571,713	14.3%	
Handcuffed	336,330	8.4%	
Officer Weapon Involved	16,918	0.42%	
Officer Weapon Used	1,930	0.05%	

SOURCES: Authors calculations using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019.

Black Californians are notably overrepresented in police stops and officers report reasons for stops that can vary across race and ethnicity, and across law enforcement agencies. We next consider the role of context of a stop in an effort to better understand underlying factors to the patterns observed in outcomes.

⁹⁰ See infra Table 1.
⁹¹ See infra Table 1.
⁹² See infra Table 1.
⁹³ See infra Table 1.

Differences Across Agencies

Unsurprisingly, stops were not distributed evenly among law enforcement agencies. As shown below in Figure 3, the California Highway Patrol, with jurisdiction over the entire geography of the state and an emphasis on enforcing traffic violations, had the lion's share of stops recorded by these fifteen agencies: 2,172,023, or more than half of the total for the year, 54%. Among the fifteen largest law enforcement agencies, stops made by police departments account for about 31% of total stops, with Los Angeles PD accounting for more than half of these stops, or 712,807, followed by San Diego PD with 187,231 stops.⁹⁴ Oakland PD reported the fewest stops, 24,395, among the state's eight largest police departments.⁹⁵ California's six largest county sheriff's departments account for about 15% of the stops, with the Los Angeles Sheriff's Department making the most stops, 196,850, followed by San Bernardino Sheriff's Department with 157,715 stops in 2019.96

Of course, each of these agencies serves a different jurisdiction, each with different populations and number of officers. For example, with a primary mission of highway safety, the CHP is a qualitatively different entity from either a county sheriff's department or a municipal police department, and is unique in that it patrols the entire state. To account for differences in size of the agencies, we also present in Technical Appendix Table A1 the number of stops per non-jail sworn officers. Combined, the fifteen agencies report about 105 stops per officer in 2019.97 Breaking it down by type of agency, we observe CHP with the highest number of stops per officer, 300, compared to sixty-eight stops per officer for the eight police departments and forty-six stops per officer for the six sheriff's departments.⁹⁸ San Diego and Sacramento PDs report the highest number of stops per officer among police departments, 106 and 100 per officer in 2019 respectively, while Oakland PD had the lowest ratio of thirtythree stops per officer.⁹⁹ Among sheriff's departments, the highest number of stops per office was in San Bernardino County at 120, four times that of the Los Angeles Sheriff's Department's thirty stops per officer.¹⁰⁰

Undoubtedly many factors contribute to differences in the number of stops made by agencies and the reasons for stops, including law enforcement agencies' primary mission, crime rates and types of crime, population density, driving patterns, and policing strategies. The RIPA data include information on the officer's reported reason for the stop, such as whether an officer stopped a motorist for a traffic violation; a reasonable suspicion of the individual having committed a crime; knowledge of an outstanding arrest warrant or the person being on probation or parole supervision; a juvenile believed to be truant or having violated education code, or if the stop was a consensual encounter (a situation where the individual and an officer interact, and the person is free to leave or decline to speak with the officer).¹⁰¹

As Figure 3 shows, traffic violations constituted by far the most commonly reported reason for a stop, at 85% across all fifteen agencies. Reasonable suspicion of some other violation accounted for another 12%, and consensual encounters represented about 1%, and remaining reasons constituted less than 1% each.¹⁰²

⁹⁴ See infra Technical Appendix Table A1.

⁹⁵ See infra Technical Appendix Table A1.

⁹⁶ See infra Technical Appendix Table A1.

⁹⁷ See infra Technical Appendix Table A1.

⁹⁸ See infra Technical Appendix Table A1.

⁹⁹ See infra Technical Appendix Table A1.

¹⁰⁰ See infra Technical Appendix Table A1. ¹⁰¹ CAL. GOV'T CODE § 12525.5(b)(8).

¹⁰² See infra Figure 3.

FIGURE 3



Most stops are for traffic violations but reasons for stops vary greatly across agencies.

However, as Figure 3 shows, this breakdown varies considerably between law enforcement agencies. While traffic violation was the most commonly reported reason for a stop in most of the law enforcement agencies, the percentage varied from 99.5% for CHP to 38.4% for Oakland PD.¹⁰³ Reasonable suspicion was the reported reason for the majority of stops, about 55% by Oakland and San Diego PDs, but only about 5% and 9% respectively in stops by Riverside and Orange Counties' Sheriff's Departments.¹⁰⁴ While stops for consensual encounters represent the third most common reason for a stop, it is only 0.1% of stops made by the CHP and 1.1% of stops made by police departments, but makes up 4.7% of stops by sheriff's Departments.¹⁰⁵ The highest shares of consensual encounter stops, 11.6%, were reported by San Bernardino Sheriff's Department.¹⁰⁶

Technical Appendix Table A2 shows the percentage of stops by detailed race and ethnicity category, and by the law enforcement agency conducting the stop. Column percentages add to 100%. It begins with the shares of demographic characteristics—gender, sexual orientation, age, English language proficiency, and disability, as perceived and reported by the law enforcement officer—of the persons stopped in 2019. Overall, officers

SOURCE: Author calculations using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019.

¹⁰³ See supra Figure 3.

¹⁰⁴ See supra Figure 3.

¹⁰⁵ See supra Figure 3.

¹⁰⁶ See supra Figure 3.

perceived 71% of stops to be of cisgender male subjects, and 29% to be of cisgender female subjects, with considerable variation by race and ethnicity.¹⁰⁷ Officers perceived fewer than 0.2% of their stops to be of transgender persons.¹⁰⁸

Whether accurate or not, officers perceived much higher percentages of Latino and Asian subjects to have limited English proficiency.¹⁰⁹ (Recall that the recorded race and ethnic designations are also as perceived by the officer, not as self-reported by the subject.) Officers also reported higher-than-average rates of disability among subjects they perceived to be Native American.¹¹⁰ At this level of disaggregation, however, those figures may be mainly a product of small sample sizes—at 0.2% of recorded 2019 stops, Native American subjects constitute the smallest race/ethnic group.¹¹¹

Technical Appendix Table A2 continues with the distribution of the reason for a stop, by race/ethnicity. This granular treatment of race/ethnicity demonstrates some distinctions that are typically elided by the grouping of smaller populations. For instance, people who appear to be Pacific Islanders are stopped much more frequently for "reasonable suspicion" than are people of apparent Asian or Middle Eastern/South Asian descent: 12.1%, compared to the 5% rate for all three groups in aggregate.¹¹² The rate of stops made in response to a call for service is more than twice as high for Pacific Islanders than for their Asian or Middle Eastern/South Asian counterparts.113

The incidence of the stated reason for a search also varies considerably by race/ethnicity. Note that these incidences are *not* contingent upon the officer having conducted a search. Rather, they are simply the number of times an officer recorded a certain reason for a search, divided by the number of times a person of that race/ethnicity was stopped. For instance, in 1.34% of stops made of a Black person, the officer recorded that visible contraband prompted a search.¹¹⁴ This percentage reflects many stops that did not result in a search.

Technical Appendix Table A2 also shows the incidence of an officer finding contraband as a result of a search. Similarly, these numbers are not contingent upon a search having been conducted. So, for instance, an officer found drugs in 1.86% of the stops conducted on a person who appeared to be Latino.¹¹⁵

Of the fifteen agencies contributing to the 2019 record keeping, the California Highway Patrol made the majority of the stops: 54% overall, but with considerable variation by race and ethnicity.¹¹⁶ That variation stems in part, of course, from the circumstances of the stop and the decisions each officer makes, but also from the different demographic makeup of the populations in the various geographic regions each agency serves.

¹⁰⁷ See infra Technical Appendix Table A2.

 ¹⁰⁸ See infra Technical Appendix Table A2.
 ¹⁰⁹ See infra Technical Appendix Table A2.
 ¹⁰⁰ See infra Technical Appendix Table A2.
 ¹¹⁰ See infra Technical Appendix Table A2.

¹¹¹ See infra Technical Appendix Table A2.

¹¹² See infra Technical Appendix Table A2.

¹¹³ See infra Technical Appendix Table A2.

 ¹¹⁴ See infra Technical Appendix Table A2.
 ¹¹⁵ See infra Technical Appendix Table A2.
 ¹¹⁶ See infra Technical Appendix Table A2.

Accounting for the Context of Stops

California passed the RIPA legislation in 2015 based on concerns about bias in policing that leads to different groups having different experiences with law enforcement. Beyond mandating collection of stop data, the legislation expanded and clarified the definition of racial and identity profiling to consider and rely on protected group status, such as race and ethnicity, in "deciding which persons to subject to a stop or in deciding upon the scope or substance of law enforcement activities following a stop."¹¹⁷

Research consistently finds evidence of racial bias, explicit and/or implicit, broadly in society.¹¹⁸ Furthermore, research has also found racial discrimination within the criminal justice system in jury, judge, and prosecutor decisions.¹¹⁹ It is perhaps unsurprising that these racial biases extend to policing, providing support to concerns historically raised by communities of color—concerns renewed in the wake of the killing of George Floyd.¹²⁰

Many factors contribute to whether an officer stops someone and to the officer's subsequent actions. And while the RIPA data quite strongly point toward differences in stop outcomes across race and ethnicity,¹²¹ these differences may echo circumstances that do not reflect an individual officer's bias. The reason and context for the stop likely influence an officer's decisions and actions—for example, an officer may simply warn a driver stopped for speeding. Hence, differences in stop experiences between Black and white people may reflect differences in the reasons for the stop.¹²²

Regardless of race and ethnicity, if an officer observes a person committing a crime or has an outstanding warrant or a weapon, that person likely will be detained and searched, and possibly booked into jail after a stop. Such situations may be more adversarial-including the potential for use of force-than a traffic stop. If an individual

https://oag.ca.gov/sites/all/files/agweb/pdfs/ripa/ripa-board-report-2021.pdf. ¹²² See supra Figure 2.

¹¹⁷ A.B. 953, 2015 Gen. Assemb., Reg. Sess. (Cal. 2015). ¹¹⁸ See *generally* Marianne Bertrand & Sendhil Mullainathan, *Are Emily and Greg More Employable Than Lakisha and Jamal? A Field Experiment on Labor Market Discrimination*, 94 (4) AM. ECON. REV. 94 991, 991–1013 (2004); Patrick Bayer et al., *Racial and Ethnic Price Differentials in the Housing Market*, 102 J. of URBAN ECON. 91, 91–105 (2017); RICHARD ROTHSTEIN, THE COLOR OF LAW: A FORGOTTEN HISTORY OF HOW OUR GOVERNMENT SEGREGATED AMERICA (2017); Carlos Avenancio-Leon & Troup Howard, *The Assessment Gap: Racial Inequalities in Property Taxation* Soc. Sci. RSCH. NETWORK SCHOLARLY PAPER ID 3465010 (October 16, 2019), https://doi.org/10.2139/ssrn.3465010; Raj Chetty et al., RSCH. NETWORK SCHOLARLY PAPER ID 3465010 (October 16, 2019), https://doi.org/10.2139/ssrn.3465010; Kaj Chetty et al., Race and Economic Opportunity in the United States: An Intergenerational Perspective, 135 (2) THE QUARTERLY J. OF ECON.711, 711–83 (2020); Patrick M. Kline, Evan K. Rose & Christopher R. Walters, Systemic Discrimination Among Large U.S. Employers, WORKING PAPER 29053, NATIONAL BUREAU OF ECON. RSCH. (2022), https://doi.org/10.3386/w29053. ¹¹⁹ See generally Shamena Anwar, Patrick Bayer & Randi Hjalmarsson, The Impact of Jury Race in Criminal Trials, 127(2) THE QUARTERLY J. OF ECON. 1017, 1017–55 (2012); David Arnold, Will Dobbie & Crystal S Yang, Racial Bias in Bail Decisions, 133(4) THE QUARTERLY J. OF ECON. 1885, 1885–1932 (2018); CarlyWill Sloan, Racial Bias by Prosecutors: Evidence from Pandem Assignment WORKING PAPER CLARED CLARED (SLOPE)

Evidence from Random Assignment, WORKING PAPER, CLAREMONT GRADUATE UNIVERSITY (2019), https://economics.nd.edu/assets/348622/sloan_jmp_cels2019_143.pdf. ¹²⁰ See generally Roland G. Fryer, *An Empirical Analysis of Racial Differences in Police Use of Force*, 127(3) JOURNAL OF POL. ECON. 1210, 1210–61 (2019); Elizabeth Luh, *Not So Black and White: Uncovering Racial Bias from Systematically Misreported Trooper Reports*, SOC. SCI. RSCH. NETWORK SCHOLARLY PAPER ID 3357063 (2019),

Misreported Trooper Reports, SoC. SCI. RSCH. NÉTWORK SCHOLARLY PAPER ID 3357063 (2019), https://doi.org/10.2139/ssrn.3357063; Mark Hoekstra & CarlyWill Sloan, *Does Race Matter for Police Use of Force? Evidence from 911 Calls*, WORKING PAPER 26774 NATIONAL BUREAU OF ECON. RSCH. (2020), https://doi.org/10.3386/w26774; Bocar A. Ba et al., *The Role of Officer Race and Gender in Police-Civilian Interactions in Chicago*, 371 (6530) SCIENCE 696, 696–702 (2021); Benjamin Feigenberg & Conrad Miller, *Would Eliminating Racial Disparities in Motor Vehicle Searches Have Efficiency Costs?* 137 (1) THE QUARTERLY J. OF ECON. 49, 49-113 (2022); Felipe Goncalves & Steven Mello, *A Few Bad Apples? Racial Bias in Policing*, 111 (5) AM. ECON. REV. 1406, 1406–41 (2021); Magnus Lofstrom, Brandon Martin & Steven Raphael, *Effect of Sentencing Reform on Racial and Ethnic Disparities in Involvement with the Criminal Justice System: The Case of California's Proposition* 47, 19 (4) CRIMINOLOGY & PUB. POL'Y, 1165, 1165-1207 (2020); Deepak Premkumar et al., *Police Use of Force and Misconduct*, PUB. POL'Y INSTITUTE OF CAL. (Oct. 2021), https://www.ppic.org/publication/police-use-of-force-and-misconduct-in-california/. ¹²¹RACIAL AND IDENTITY PROFILING ADVISORY BOARD, ANNUAL RIPA REPORT (2021), https://oag.ca.gov/sites/all/files/agweb/pdfs/rina/rina/board-report-2021 pdf

is acting erratically, possibly due to behavioral health issues, an officer may shift decisions and actions. The prevalence of such situations across race and ethnicity may contribute to differences in outcomes.

Additionally, younger/inexperienced drivers may be more likely to violate traffic laws, and hence are plausibly more likely to be stopped than older and more experienced drivers. With men and adolescents/younger adults engaging in relatively more criminal activity, officers may place more scrutiny on younger men when they are stopped than on older individuals or women, independent of race/ethnicity.¹²³

On average, Black Californians stopped by law enforcement are perceived to be younger compared to white Californians who are stopped.¹²⁴ People stopped are also more often males.¹²⁵ Relatively higher shares of Black persons are stopped for reasonable suspicion, outstanding warrant for an arrest, or mandatory supervision of a parolee/probationer.¹²⁶ The latter two categories make a search more likely, as a warrant for a search is not needed, nor is cause, in California.¹²⁷ Officers also report visibly seeing contraband in a higher share of stops of Black people than of white people.¹²⁸

Among the fifteen largest law enforcement agencies, California Highway Patrol made more than 60% of all stops in 2019 of white individuals, but only about 35% of stops of Black individuals.¹²⁹ And while Los Angeles Police Department (LAPD) accounts for almost 31% of stops of Black Californians, the agency made only 10% of stops of white Californians; partly reflecting that a higher share of the Los Angeles population is Black (about 8%) compared to statewide (about 6%).¹³⁰ Agency level differences in policing strategies, missions and roles, as well as officer behavior and biases, are also possible contributing factors.

Accounting for differences in personal traits and contexts

Differences in contexts, location, and agencies likely contribute to racial disparities in stop outcomes. Our goal here is to use regression models that adjust to account for differences across race/ethnic groups in such factors and move us towards more "apples-to-apples" comparisons. That is, we seek to compare stop outcomes across race/ethnicity for, say, individuals of the same age and gender, stopped for the same reasons by a given law enforcement agency. We also adjust for whether the officer reported seeing contraband and whether the person had an outstanding warrant or is on parole or probation. As we make these adjustments, we are evaluating differences of similarly situated individuals engaged in similar conduct. However, this analysis is far more restrictive and conservative about estimating racial differences than we interpret as necessary for a RJA claim, but is helpful in addressing concerns that the differences are associated with other environmental factors.¹³¹

Interpreting these findings

¹²³ See generally Jeffery T. Ulmer & Darrell Steffensmeier, The Age and Crime Relationship: Social Variation, Social *Explanations,* IN THE NURTURE VERSUS BIOSOCIAL DEBATE IN CRIMINOLOGY: ON THE ORIGINS OF CRIM. BEHAV. AND CRIMINALITY 377, 377-396 (2014). ¹²⁴ See infra Technical Appendix Table A2.

¹²⁶ See infra Technical Appendix Table A2.
¹²⁷ See CAL. PENAL CODE § 3067.
¹²⁸ See infra Technical Appendix Table A2.

¹²⁹ See infra Technical Appendix Table A1.

¹³⁰ See infra Technical Appendix Table A1.

¹³¹ See infra Technical Appendix B for a detailed discussion of the analysis and regression model.

This exercise should not be interpreted as a causal analysis of race and ethnicity on outcomes and experiences, where after we account for reported relevant factors and contexts, any remaining disparities between Black and white individuals represent police bias. It may overestimate actual officer bias because the data does not capture *all* relevant factors and contexts (e.g., history of violent crimes or substance abuse). Furthermore, crime rates are often higher in some areas of a jurisdiction than in others, and hence are likely to lead to different levels of police presence and activity. If people of color are overrepresented in low-income and high-crime areas of a jurisdiction, this difference can also contribute to racial disparities in police stops. Unfortunately, the data do not allow us to account for such a possibility.

The exercise might also underestimate the prevalence of police bias if the factors that we control for, such as the reported reason for the stop, themselves represent police bias. One example may be the higher likelihood of Black individuals being stopped for reasonable suspicion than white individuals. Additionally, while an individual's status of being on parole or probation or having an outstanding warrant, is a relevant factor to adjust for since officers have additional latitude in those cases, the status itself is influenced by myriad biases in the criminal justice system.¹³²

It is also important to keep in mind that the data examined is based on information an officer reports after the stop is completed, and hence provides an opportunity to report information aimed at hiding biases.¹³³ It is plausible that the fully adjusted racial gaps represent a conservative, lower-bound estimate of racial bias in policing, but further certainty on this point is beyond the scope of this report.

These estimated differences in outcomes across race and ethnicity serve as a starting point for understanding how experiences with law enforcement differ for people of color compared to white people. We aim to provide a more complete picture of what the data tell us these differences look like. As we will show, the approach provides information on how context affects an officer's actions and decisions, which may contribute to different experiences during a stop. Moreover, it also directs us towards contexts that deserve closer examination as particular sources of disparity.

¹³² See *generally* Shamena Anwar, Patrick Bayer & Randi Hjalmarsson, *The Impact of Jury Race in Criminal Trials*, 127 (2) THE QUARTERLY J. OF ECON. 1017–55 (2012); David Arnold, Will Dobbie & Crystal S. Yang, *Racial Bias in Bail Decisions*, 133(4) THE QUARTERLY J. OF ECON. 1885, 1885–1932 (2018); CarlyWill Sloan, *Racial Bias by Prosecutors: Evidence from Random Assignment*, WORKING PAPER, CLAREMONT GRADUATE UNIVERSITY (2019),

https://economics.nd.edu/assets/348622/sloan_jmp_cels2019_143.pdf; Evan K. Rose, *Who Gets a Second Chance? Effectiveness and Equity in Supervision of Criminal Offenders*, 136(2) THE QUARTERLY J. OF ECON. 1199, 1199–1253 (2021).

 ¹³³ See generally Elizabeth Luh, Not So Black and White: Uncovering Racial Bias from Systematically Misreported Trooper Reports, SOC. SCI. RSCH. NETWORK SCHOLARLY PAPER ID 3357063 (2019), https://doi.org/10.2139/ssrn.3357063.
 Additionally, recent research suggests that since administrative police data, such as the RIPA data, necessarily do not include individuals who officers observe, possibly engage with, but do not detain (as is a requirement for inclusion in the RIPA data), that this likely lead to underestimates of racial bias (See Dean Knox, Will Lowe & Jonathan Mummolo, Administrative Records Mask Racially Biased Policing, 114 (3) AM. POL. SCI. REV. 619, 619–37 (2020)).

Differences in Searches

Over 10% of all stops involve a search of the person or property.¹³⁴ For Black Californians, the likelihood of being searched is more than twice that of white Californians—a search rate of 20.5% and 8.2% respectively.¹³⁵ The disparity between Black and white people stands out compared to all other race/ethnic groups; furthermore, individuals perceived to be Asian or of South Asian/Middle East origin are less likely to be searched than white individuals.136

Black people are more likely than white to be searched, partly due to context of stop

Focusing on the Black-white inequities, after we adjust for officer-perceived personal traits such as age, gender, and disabilities, the gap shrinks somewhat, to 10.9 percentage points.¹³⁷ When we additionally adjust for differences in the reported reason for the stop, the gap in Black-white search rates drops to 7.2 percentage points.138

This difference is driven by significantly higher search rates of individuals on parole/probation and with outstanding warrants compared to traffic violations, combined with more Black than white persons stopped for being on correctional supervision or having an outstanding warrant.¹³⁹ Search rates vary notably across law enforcement agencies, reflecting differences in factors such as the mission of the agency (CHP vs. police department vs. sheriff's departments), jurisdictional crime rates, and policing practices.¹⁴⁰

Furthermore, demographic characteristics differ across jurisdictions. For example, Los Angeles has a higher share of Black people than San Francisco, while San Francisco has a higher share of Asians than Los Angeles.¹⁴¹ If, for example, Black residents tend to live in cities where law enforcement may conduct searches more often across all racial and ethnic groups, then the Black-white disparity in search rates may partly reflect location.

When we adjust for average differences in search rate across law enforcement agencies and for fixed characteristics of a jurisdiction, the Black-white gap drops further to 4.1 percentage points.¹⁴² In other words, adjusting for perceived personal traits, context of stop, and location reduces the gap by about two-thirds. And while this suggests that these factors matter, we also find that Black people are still 1.5 times more likely to be searched during a stop than white people.¹⁴³

FIGURE 4

Disparities in searches narrow when adjusting for personal traits and context of stop

¹³⁴ See infra Technical Appendix Table A6.

¹³⁵ See infra Figure 4.

¹³⁶ See infra Figure 4.

 ¹³⁷ See infra Figure 4, second column.
 ¹³⁸ See infra Figure 4, third column.

¹³⁹ See infra Technical Appendix Table A2.

¹⁴⁰ See infra Technical Appendix Table A2.

¹⁴¹ See U.S. Census Bureau, QuickFacts: San Francisco County, California (2023),

https://www.census.gov/quickfacts/fact/table/sanfranciscocountycalifornia/PST045222; U.S. Census Bureau, QuickFacts: Los Angeles County, California (2023),

https://www.census.gov/quickfacts/fact/table/losangelescountycalifornia/PST045223.

¹⁴² See infra Figure 4.
¹⁴³ See infra Figure 4.



SOURCE: Author estimates using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. NOTES: The bars represent percentage point differences in the likelihood of being searched between white Californians and each of the racial/ethnic groups identified in the RIPA data. All estimates are statistically significant at the 95% confidence level. The stop data are limited to the state's fifteen largest law enforcement agencies (LEA): California Highway Patrol; the police departments of the cities of Los Angeles, San Diego, San Francisco, Fresno, Long Beach, Oakland, Sacramento, and San Jose; and the sheriff's departments of Los Angeles, San Bernardino, Riverside, San Diego, Orange, and Sacramento Counties. Bars represent estimated gaps relative to white residents with consecutively added controls. Detailed regression results are presented in the Technical Appendix.

Contraband and evidence are found less in searches of Black people than white

As a share of *stops*, contraband and evidence are found relatively rarely—in only about 2.4% of stops.¹⁴⁴ So-called *unconditional* discovery or yield rates—the share of *stops*, as opposed to the share of *searches*, in which contraband or evidence was found—vary across perceived race and ethnic origin.¹⁴⁵ For example, officers found some contraband and evidence in 4.4% of stops of Black persons, 2.5% of Latino persons, 1.8% of white persons, and 1% of Asian persons.¹⁴⁶

As a share of *searches*, contraband or evidence was found more often—in 21.4% of searches.¹⁴⁷ The discovery rate, also known as *conditional* discovery or yield rate, varies little by race/ethnicity,¹⁴⁸ from 19.3% for those perceived to be of South Asian/Middle Eastern origin to 23.9% for those perceived to be multi-race/ethnicity.¹⁴⁹ Searches yield contraband or evidence in 0.6 percentage points fewer searches of Black people compared to searches of white people, or at rates of 21.6% and 22.2%, respectively.¹⁵⁰

The small Black-white gap *increases* as we control for personal traits and contexts reported by the officer. Officers are more likely to find contraband and evidence in searches of teenagers and younger adults compared to

¹⁴⁴ See infra Technical Appendix Table A6.

¹⁴⁵ See infra Technical Appendix Table A6. Although officers find the majority of contraband or evidence when they search a person or property, about 30% of the time contraband or evidence are found without a search.

¹⁴⁶ See infra Technical Appendix Table A7.

¹⁴⁷ See infra Technical Appendix Table A6.

¹⁴⁸ See infra Figure 5.

¹⁴⁹ See infra Technical Appendix Table A7.

¹⁵⁰ See infra Technical Appendix Table A7.

older adults, and in searches of men compared to women.¹⁵¹ Adjusting for perceived personal traits increases the gap to -0.8 percentage points, and adjusting for reason for the stop increases it to -1 percentage point.¹⁵²

The data also include information on the basis for the search, and searches most likely to yield contraband or evidence are searches that occur when the officer reports either seeing or smelling (which includes canines) contraband or evidence. Officers more often report such basis for searches in stops of Black individuals than white, which in turn means that when we adjust for the basis, the gap more than doubles to -2.3 percentage points.¹⁵³ Put differently, officers discover contraband in their searches of Black people about 10% less than in searches of white people.

Adjusting for differences across law enforcement agencies does not appreciably change the Black-white gap in yield rates. Furthermore, when we break down contraband and evidence by separate categories (weapons, drugs, property, or other), the discovery rate gap is entirely driven by a lower likelihood of finding drugs in searches of Black than white Californians. The estimated gap, adjusted for all factors, is a statistically significant difference of -2.7 percentage points between the Black and white yield rate for drugs.¹⁵⁴

¹⁵¹ See infra Technical Appendix Table B2.

¹⁵² See infra Figure 5.
¹⁵³ See infra Technical Appendix Table A2.

¹⁵⁴ See infra Technical Appendix Table B5.

FIGURE 5



Contraband or evidence is found in fewer searches of Black and Latino individuals than of white individuals

SOURCE: Author estimates using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. NOTES: The bars represent percentage point differences in the likelihood of discovering something while being searched between white Californians and each of the racial/ethnic groups identified in the RIPA data. All estimates are statistically significant at the 95-perent confidence level. The stop data are limited to the state's fifteen largest law enforcement agencies: California Highway Patrol, the police departments of the cities of Los Angeles, San Diego, San Francisco, Fresno, Long Beach, Oakland, Sacramento, and San Jose and the sheriff's departments of Los Angeles, San Bernardino, Riverside, San Diego, Orange and Sacramento Counties.

Differences in Enforcement

Officers issue at least a warning in about 88% of all stops; thus, most stops lead to some enforcement.¹⁵⁵ However, Black Californians are more likely to be stopped without any enforcement.¹⁵⁶

Black people are overrepresented in stops with no enforcement and with arrests

Officers issue at least a warning in fewer stops of Black persons compared to white, at 79.3% and 89.8% respectively.¹⁵⁷ Put differently, about one-fifth of stops of Black persons lead to no enforcement versus one-tenth of stops of white persons. The percentage-point gap is roughly the same if enforcement is at least a citation (53% and 64% respectively).¹⁵⁸

¹⁵⁵ See infra Technical Appendix Table A8.

¹⁵⁶ See infra Technical Appendix Table A8.

¹⁵⁷ See infra Figure 6; see also infra Technical Appendix Table A11.

¹⁵⁸ See infra Technical Appendix Table A11.

However, stops of Black individuals are *more* likely to result in an arrest, at 9.5% of stops compared with 5.6% of stops of white individuals resulting in a jail booking.¹⁵⁹ In other words, almost one in ten Black people stopped are booked, while slightly more than one in twenty white people are.

Adjusting for perceived personal traits reduces the Black-white gaps somewhat, by about one percentage point for lower levels of enforcement and about half a percentage point for the highest enforcement.¹⁶⁰ When we adjust for the reason for the stop, it reduces the estimated gaps notably: -6.3 percentage points for issuing at least a warning and 0.9 percentage points for likelihood of a booking.¹⁶¹ This is driven by more stops of Black people for reasons that do not lead to enforcement compared to white people, as well as high shares of booking, such as reasonable suspicion and parole/probation stops.

The drop in the gap around the likelihood of a booking is also partly due to most stops for an outstanding warrant that to a booking (almost 70%), and Black Californians are overrepresented in stops for this reported reason.¹⁶² Lastly, when we adjust for enforcement rates across law enforcement agencies, the Black-white gap in the likelihood of the stop leading to at least a warning narrows notably.¹⁶³ This shows that differences in enforcement rates are partly driven by more Black Californians than white Californians being stopped by law enforcement agencies that make more stops without enforcement. And while adjusting for all factors considered here lowers the observed gap notably, it also points towards widespread differences in enforcement across agencies.

FIGURE 6





- ¹⁶¹ See infra Figure 6.
- ¹⁶² See infra Technical Appendix Table A11.

¹⁵⁹ See infra Technical Appendix Table A11.

¹⁶⁰ See infra Figure 6.

¹⁶³ See infra Figure 6.

SOURCE: Author estimates using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. NOTES: The bars represent percentage point differences in the likelihood of enforcement between whites and each of the racial/ethnic groups identified in the RIPA data. All estimates are statistically significant at the 95% confidence level. The stop data are limited to the state's fifteen largest law enforcement agencies: California Highway Patrol, the police departments of the cities of Los Angeles, San Diego, San Francisco, Fresno, Long Beach, Oakland, Sacramento, and San Jose and the sheriff's departments of Los Angeles, San Bernardino, Riverside, San Diego, Orange, and Sacramento Counties.

Differences in Intrusive Actions

When law enforcement stops an individual, the interaction may be limited to verbal communication or it can widen to involve the use of force and weapons. With the reported information captured by the data, we can create hierarchical variables of increasing levels of intrusiveness up to the level of an officer's weapon being used.

Black people are more likely than white to experience intrusive actions

In 27.8% of stops of Black Californians, the officer asks the individual to step out of the vehicle or something more intrusive.¹⁶⁴ For stops of Latino Californians, the share is 17.2%, while for stops of white and Asian Californians, the shares are 12.8% and 7.5% respectively.¹⁶⁵

In other words, Black people are slightly more than twice as likely as white to at least be asked to step out of the vehicle. More generally, Black people are at least twice as likely as white people to experience each of the levels of intrusiveness defined here.¹⁶⁶

Adjusting for personal traits and context of the stop greatly reduces Black-white gaps in our measures of intrusiveness and use of force. While Black civilians are 7.5 percentage points more likely than white civilians to be at least handcuffed, that gap drops to 6.5 percentage points more when we adjust for personal traits.¹⁶⁷ Adjusting for the reason for the stop shrinks the gap to three percentage points.¹⁶⁸

Furthermore, there is tremendous variation across law enforcement agencies in the race/ethnicity of individuals stopped and in the level of intrusiveness. For example, CHP makes about 60% of all stops of white Californians versus 35% of all stops of Black Californians.¹⁶⁹ CHP also has the lowest share of stops where individuals are handcuffed, at 1.5% of all stops.¹⁷⁰

¹⁶⁴ See infra Technical Appendix Table A9.

¹⁶⁵ See infra Technical Appendix Table A9.

¹⁶⁶ See infra Figure 7.

¹⁶⁷ See infra Figure 7.

¹⁶⁸ See infra Figure 7.

¹⁶⁹ See infra Technical Appendix Table A2.

¹⁷⁰ See infra Technical Appendix Table A5.

Therefore, when we adjust for differences across agencies, the Black-white gap related to handcuffing drops to 1.5 percentage points.¹⁷¹ In other words, for a Black person with otherwise the same personal traits as a white person, stopped for the same reason, by the same law enforcement agency, the likelihood of being handcuffed is one-fifth of the gap of 7.5 percentage points.¹⁷² Still, Black Californians are statistically significantly more likely to be handcuffed than white Californians, even after adjusting for the above factors—by 1.5 percentage points.¹⁷³

¹⁷¹ See infra Figure 7.
¹⁷² See infra Figure 7.
¹⁷³ See infra Figure 7.

FIGURE 7

Black Californians are more likely than white Californians to experience greater intrusiveness



SOURCE: Author estimates using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. NOTES: The bars represent percentage point differences in the likelihood of the mentioned intrusive action between whites and each of the racial/ethnic groups identified in the RIPA data. All estimates are statistically significant at the 95% confidence level. The stop data are limited to the state's fifteen largest law enforcement agencies: California Highway Patrol, the police departments of the cities of Los Angeles, San Diego, San Francisco, Fresno, Long Beach, Oakland, Sacramento, and San Jose and the sheriff's departments of Los Angeles, San Bernardino, Riverside, San Diego, Orange and Sacramento Counties.

An officer's weapon is more likely to be involved in stops of Black people than white

Officers report that 16,918 out of the 3,992,074 stops (0.4%) involve an officer's weapon.¹⁷⁴ This includes an officer pointing a firearm at the individual (14,988 of stops) as well as an officer's weapon being used, which includes firearm, electric device such as a Taser, chemical spray, baton, or bitten by a canine (1,930 of all stops).¹⁷⁵

Stops of Black individuals are more likely to involve an officer's weapon than stops of white individuals.¹⁷⁶ But adjusting for differences in shares of stops where either a weapon is found, the stop is made for reasonable suspicion, or includes an individual with an outstanding warrant for an arrest reduces the Black-white gaps markedly.

Black Californians are roughly three times more likely than white Californians to experience a stop that involves a weapon, at about a 0.6 percentage point higher likelihood.¹⁷⁷ Adjusting for personal traits—such as more young Black adults than white stopped—reduces the gap to about 0.5 percentage points.¹⁷⁸ As stops based on reasonable suspicion—especially an outstanding warrant—are more likely to involve weapons than all other reasons for

¹⁷⁴ See infra Technical Appendix Table A9.

¹⁷⁵ See infra Technical Appendix A9.

¹⁷⁶ See infra Figure 8; see also infra Technical Appendix Table A9.

¹⁷⁷ See infra Figure 8.

¹⁷⁸ See infra Figure 8.

stops, and with Black individuals overrepresented in these categories, adjusting for such differences reduces the Black-white gap to 0.3 percentage points.¹⁷⁹

However, a weapon found during a search is most strongly associated with a stop involving an officer's weapon, increasing the likelihood by almost ten percentage points versus no contraband or evidence found.¹⁸⁰ This adjustment reduces the Black-white gap to about 0.2 percentage points.¹⁸¹ While reported incidents of officers using a weapon are rare, the Black-white gap and patterns of adjustments are similar.

FIGURE 8

When a weapon is found a stop is more likely to involve an officer's weapon



1.00%

NOTES: The bars represent percentage point differences in the likelihood of having a weapon involved between whites and each of the racial/ethnic groups identified in the RIPA data. All estimates are statistically significant at the 95% confidence level. The stop data are limited to the state's fifteen largest law enforcement agencies: California Highway Patrol, the police departments of the cities of Los Angeles, San Diego, San Francisco, Fresno, Long Beach, Oakland, Sacramento, and San Jose and the sheriff's departments of Los Angeles, San Bernardino, Riverside, San Diego, Orange and Sacramento Counties.

Differences in Agency Stops

Are racial disparities in outcomes greater in traffic stops than in stops for reasonable suspicion—the two most common reasons for stops? Do they differ across agency type? To answer these questions, we examine Black-

SOURCE: Author estimates using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019.

¹⁷⁹ See infra Figure 8.

¹⁸⁰ See infra Technical Appendix Table A9.

¹⁸¹ See infra Figure 8.

white differences in outcomes separately by reason for stop and agency: the statewide California Highway Patrol compared to local law enforcement (that is, police and sheriff's departments).

Traffic stops by police and sheriff's departments show greatest disparities

Generally, traffic stops have the greatest Black-white disparities, especially among local law enforcement agencies. Roughly two-thirds of traffic stops are for moving violations, while about one-third are for equipment and non-moving violations; in these traffic stops, more than three times the share of Black Californians than white Californians are then searched by police and sheriff departments.¹⁸²

CHP traffic stops rarely result in a search, and the Black-white disparity is notably less; Black drivers are searched at a rate of 1.5% of stops, and white drivers are searched at a rate of 1.2%.¹⁸³ While search rates are much higher in stops for reasonable suspicion, for individuals with a warrant, or for someone on parole/probation, the disparity is much less.¹⁸⁴ This is true whether the stop is made by local law enforcement agencies or CHP, but for those types of CHP stops, search rates of Black people are even lower than for stops of white people.¹⁸⁵

When drivers are searched during stops for traffic violations, the search is less likely to yield contraband or evidence than when the stop is for reasonable suspicion, outstanding warrant, or known parole/probation, especially in the relatively rare searches in CHP stops.¹⁸⁶

However, when local law enforcement agencies search white Californians during traffic stops, the yield rate is somewhat higher than during stops for reasonable suspicion, outstanding warrant, or parole/probation.¹⁸⁷ The Black-white gap for yield rate is notable: some contraband is found in 25.1% of searches of white people and in 19.1% of searches of Black people.¹⁸⁸ Both local and statewide agencies report higher yield rates for Black than white Californians when stopping for reasonable suspicion.¹⁸⁹

FIGURE 9

Traffic stops by local law enforcement show higher Black-white gaps for searches and discovery rates

¹⁸² See infra Figure 9; see also Technical Appendix Table A10.
¹⁸³ See infra Technical Appendix Table A10.
¹⁸⁴ See infra Figure 9; see also Technical Appendix Table A10.
¹⁸⁵ See infra Technical Appendix Table A10.
¹⁸⁶ See infra Technical Appendix Table A10.
¹⁸⁷ See infra Technical Appendix Table A10.

¹⁸⁷ See infra Technical Appendix Table A10.

¹⁸⁸ See infra Technical Appendix Table A10. Another notable disparity is searches of individuals with a warrant or on parole/probation made by CHP, but they are quite uncommon (230 in 2019).

¹⁸⁹ See infra Technical Appendix Table A10.



SOURCE: Author estimates using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. NOTES: The bars represent percentage point differences in the likelihood of enforcement between whites and each of the racial/ethnic groups identified in the RIPA data. All estimates are statistically significant at the 95% confidence level. The stop data are limited to the state's fifteen largest law enforcement agencies: California Highway Patrol, the police departments of the cities of Los Angeles, San Diego, San Francisco, Fresno, Long Beach, Oakland, Sacramento, and San Jose and the sheriff's departments of Los Angeles, San Bernardino, Riverside, San Diego, Orange and Sacramento Counties.

When police and sheriff's departments make stops for traffic violations, a higher share of Black drivers are stopped without the officer issuing a warning compared to white drivers: 23.3% and 11.2% respectively.¹⁹⁰ In CHP stops for traffic violations, almost everyone, Black or white, receives at least a warning, 98.5% and 98.6%, respectively.¹⁹¹ While being stopped for a traffic violation rarely results in a booking, both state and local law enforcement agencies book Black drivers more often than white, about 3.5% and 2.5% respectively.¹⁹²

FIGURE 10

Black-white gaps for no-enforcement and booking are greatest among local law enforcement agencies

¹⁹⁰ See infra Figure 10; see also Technical Appendix Table A10.

 ¹⁹¹ See infra Technical Appendix Table A10.
 ¹⁹² See infra Technical Appendix Table A10.



SOURCE: Author estimates using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. NOTES: The bars represent percentage point differences in the likelihood of enforcement between whites and each of the racial/ethnic groups identified in the RIPA data. All estimates are statistically significant at the 95% confidence level. The stop data are limited to the state's fifteen largest law enforcement agencies: California Highway Patrol, the police departments of the cities of Los Angeles, San Diego, San Francisco, Fresno, Long Beach, Oakland, Sacramento, and San Jose and the sheriff's departments of Los Angeles, San Bernardino, Riverside, San Diego, Orange and Sacramento Counties.

Furthermore, when local law enforcement agencies make stops for traffic violations, Black drivers are more likely to experience more intrusive actions than white drivers. For example, in stops by the fourteen police and sheriff's departments included in the 2019 RIPA data, 8.6% of Black drivers were handcuffed compared to 3.5% of white drivers. For CHP, the shares were 1.5% and 1.1% respectively.¹⁹³

Traffic stops that involve an officer's weapon are very unusual, but Black drivers are overrepresented in those instances (0.17% and 0.05% of traffic stops for Black and white drivers, respectively).¹⁹⁴ Stops made for reasonable suspicion or of individuals with a warrant or on parole/probation are markedly more likely to involve a weapon than traffic stops, and also more likely in stops of Black Californians than white Californians.¹⁹⁵ For example, when local law enforcement agencies stop for reasonable suspicion, interactions involve a weapon in almost twice the share of stops of Black people compared to white people, 2.9% and 1.5% respectively (for CHP stops for reasonable suspicion, the shares are 2.4% for Black people and 1.6% for white people).¹⁹⁶

Given the notable differences between CHP and the local law enforcement agencies, and the type of stop, we also estimated regression models restricted to traffic stops separately for statewide and local law enforcement

¹⁹³ See infra Technical Appendix Table A10.

¹⁹⁴ See infra Technical Appendix Table A10.

¹⁹⁵ See infra Technical Appendix Table A10.

¹⁹⁶ See infra Technical Appendix Table A10. We estimated all of the separate regression models by reason for the stop, and also broke them down by CHP and local law enforcement agencies, but given the numerous regressions involved, the results are not all presented in the technical appendix. The regressions that were excluded are available upon request. We do find that the factors discussed above contribute to the observed disparity, and when adjustments are made, the disparities are reduced. This is arguably not surprising given that we found that adjustments for reason for the stop, as well as law enforcement agency, were important factors.

agencies.¹⁹⁷ Broadly, the results show that the estimated Black-white gaps in the post-stop experiences in traffic stops made by police and sheriff's departments are much less sensitive to inclusion of demographics and the contextual factors included in our analysis.¹⁹⁸ In other words, the notable disparity discussed above remains, and additionally, fully adjusted Black-white gaps in traffic stops made by CHP are substantially smaller. Black-white disparities in the likelihood of being booked, however, are not appreciably smaller for CHP traffic stops than for those made by local law enforcement agencies and are greater once we adjust for all of the factors.

Traffic Stops are a Key Driver of Disparities

Because of the stark racial disparities in traffic stops, in this section, we work to identify traffic stops that may deserve consideration for alternative enforcement practices. Traffic stops that could be enforced using alternative methods would be those that are unlikely to jeopardize public or road safety but that could: (1) improve safety for officers and civilians, (2) increase police efficiency, and (3) reduce racial disparities. Since agencies have substantial differences in their primary missions, objectives, and jurisdictions, we examine stop outcomes by type of law enforcement agency (the California Highway Patrol or local law enforcement; the latter can be further separated into police and sheriff's departments). Furthermore, we analyze traffic stops for both moving violations (e.g., speeding or failure to stop) and non-moving violations (e.g., improper display of a license plate, expired registration tag, or failure to maintain vehicle light equipment). Non-moving violations may especially be an area where alternative enforcement—such as mailing the vehicle owner a "fix-it ticket" and/or citation¹⁹⁹—is feasible and safe.

Traffic stops that do not lead to any enforcement or discovery of contraband or evidence deserve special attention—while these incidents are a small minority of all stops, they fall disproportionately on people of color and may not be an efficient use of law enforcement officers' time. The "intrusiveness" of these stops, as measured by outcomes such as whether individuals were asked to step out of the vehicle, searched, detained, or handcuffed, and whether an officer aimed or used a weapon, is another critical factor that could affect the relationship between community members and law enforcement. Such information can be used to determine when changes in policing practices may be warranted and could help guide potential changes.

One key question is whether racial disparities in traffic stops occur because of bias or targeting from law enforcement. While disparities could be driven by racial bias, other factors may also play a role. For example, vehicle condition as well as driving patterns and behavior may differ across race/ethnicity and could lead to disparities in the likelihood of being stopped for a traffic violation. To examine the potential role of racial bias in traffic stops, we employ the "veil of darkness" theory, which posits that it is more difficult for officers to ascertain a person's race or ethnicity during dark hours. If officers are racially profiling drivers, the share of people of color in traffic stops would be lower during dark hours, compared to light hours, holding everything else constant. Using the shift to and from Daylight Saving Time, we examine if people of color are more or less likely to be

¹⁹⁷ See infra Technical Appendix Tables B17-B21.

 ¹⁹⁸ See infra Technical Appendix Tables B17-B21.
 ¹⁹⁹ See Megan Cassidy, "Why S.F. might be about to prohibit police from making low-level traffic stops," San Francisco Chronicle (2022), https://www.sfchronicle.com/sf/article/Why-S-F-might-be-about-to-prohibit-police-from-17166395.php.

stopped for a traffic violation when, for a given time of the day, sudden changes in light conditions make it easier or harder, respectively, to determine an individual's race or ethnicity.

Note that the test of the "veil of darkness" theory only applies to the likelihood of being stopped for a traffic violation and cannot be applied to other stop outcomes, as once a stop has been made, the officer has determined (the perceived) race/ethnicity of the driver. Furthermore, while nighttime conditions make it more difficult to determine a driver's race/ethnicity than during daytime, there are contexts and locations, such as where there are streetlights, when racial/ethnic identification may still be possible. Officers may also use type, make, and condition of a vehicle to infer race/ethnicity. If such factors are indeed correlated with race/ethnicity, racial profiling may also be possible during dark hours.

Breakdown of traffic stops

We focus on all traffic stops in the 2019 RIPA data (3,394,392 stops, about 85% of all 2019 stops) reported by the fifteen largest law enforcement agencies in the state.²⁰⁰ Consistent with its organizational mission, the CHP makes many more traffic stops than police or sheriff's departments. Overall, the CHP made 64% of the nearly 3.4 million traffic stops (almost 2.2 million), while the eight police departments made 24% of these stops (about 809,000) and the six sheriff's departments made about 12% of these stops (about 425,000).²⁰¹

About two-thirds of traffic stops are for moving violations, while about one-third are for equipment and nonmoving violations.²⁰² Examples of some of the most common equipment/non-moving violations are lack of registration (287,900 stops), improper display of a license plate (167,800), and failure to maintain vehicle light equipment (67,100).²⁰³

Stops with no enforcement or discovery of contraband

In the vast majority of stops, there is at least some enforcement, measured here as at least a warning being issued. Traffic stops that lead to *no* enforcement and that *do not* yield any contraband or evidence are arguably the types of stops most deserving of closer examination, as they could potentially be considered for alternative enforcement methods without endangering public safety.

We define enforcement in this report as a warning, a citation, an arrest resulting in cite and release, or an arrest resulting in a booking into jail. While most searches—roughly four out of every five—do not yield contraband or evidence, most traffic stops result in some enforcement.²⁰⁴ Of the close to 3.4 million traffic stops made by these fifteen law enforcement agencies in 2019, only about 6% (about 211,000 stops) led to no enforcement or discovery of any contraband or evidence.²⁰⁵ When we extend the definition of no enforcement to define a warning as no enforcement (i.e., enforcement is defined to be a citation, an arrest resulting in cite and release, or an arrest

²⁰⁰ RACIAL AND IDENTITY PROFILING ADVISORY BOARD, APPENDICIES – 2021 RIPA BOARD REPORT (2021), https://oag.ca.gov/sites/all/files/agweb/pdfs/ripa/ripa-appendices-2021.pdf?.

²⁰¹ See infra Technical Appendix Table A3.

²⁰² See infra Figure 11.

²⁰³ Authors' estimates from the California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019.

²⁰⁴ See infra Figure 11; see also Technical Appendix Table A6.

²⁰⁵ See infra Technical Appendix Table A5.

leading to a jail booking), the number of no-enforcement/no-discovery stops increases to about 1.1 million, or 33% of traffic stops.²⁰⁶

Figure 11 shows that stops by local law enforcement officers, especially police officers, disproportionately result in no enforcement or discovery. The CHP makes only 15% of traffic stops that result in no enforcement or discovery, despite making the majority of stops overall (64%).²⁰⁷ While the eight police departments account for slightly less than a fourth of overall traffic stops (24%), they make more than half of the traffic stops with no enforcement or discovery (59%).²⁰⁸ The six sheriff's departments make about 13% of overall traffic stops and 26% of those with no enforcement or discovery.²⁰⁹ For local law enforcement, these stops are more likely to be for non-moving violations rather than moving violations.²¹⁰

FIGURE 11



Stops by local law enforcement disproportionately result in no enforcement or discovery

SOURCES: Authors' calculations using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. NOTES: No enforcement is defined as not even a warning was issued. The figure shows the shares of moving and non-moving violation traffic stops made by each type of law enforcement agency in which there is no enforcement/no discovery of contraband or evidence (left three bars) and amongst all traffic stops (right three bars).

Lastly, as shown in Table 2, stops with no enforcement or discovery comprise a meaningful amount of officers' (and civilians') time. On average, these stops last about twenty-three minutes, but this is skewed by a relatively small share (about 5%) of stops in which the officer reports a duration longer than an hour.²¹¹ The median duration for this kind of traffic stop is ten minutes.²¹² In addition, the length of the stop varies by agency type and

²⁰⁶ Authors' estimates from the California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. ²⁰⁷ See infra Figure 11.

²⁰⁸ See infra Figure 11.

²⁰⁹ See infra Figure 11.

²¹⁰ See infra Figure 11.

²¹¹ See infra Table 2.

²¹² See infra Table 2.
to some extent the type of traffic violation. Notably, officers spent more than 80,000 total hours in 2019 on these types of stops (or 7% of total officer hours spent on traffic stops).²¹³ For police departments, close to 28,000 of these hours were stops made for non-moving violations.²¹⁴

TABLE 2

Officers spent more than 80,000 hours on no-enforcement/no-discovery stops in 2019

	All LEAs	CHP		Police		Sheriff	
Traffic Stops with No Enforcement/No Discovery		Moving	Non- Moving	Moving	Non- Moving	Moving	Non- Moving
Number of Stops Share	211,086 100%	17,777 8.4%	13,296 6.3%	56,215 26.6%	69,193 32.8%	17,599 8.3%	37,006 17.5%
Stop Duration							
Median (minutes)	10	10	15	12	12	7	7
Average (minutes)	23	30	39	27	24	10	10
Total (hours)	80,307	8,963	8,652	25,340	27,937	3,042	6,374

SOURCES: Authors' calculations using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. NOTE: No enforcement is defined as not even a warning was issued.

In stops that lead to no enforcement or discovery, local agencies are more likely than the CHP to take intrusive actions

The interaction between a civilian and an officer during a traffic stop can vary considerably. In addition to searches, officer actions can range from verbal communication to the civilian being asked to step out of the vehicle, to the civilian being detained or handcuffed, to—in rare cases—an officer aiming or using a weapon. We refer to this wide range of potential officer behaviors that extend beyond verbal communication as "intrusive actions."

While the majority of no-enforcement/no-discovery traffic stops entail only verbal communication with the officer, a number of these stops include intrusive actions, as shown in Table 3. For example, in 24% of these stops (nearly 50,000), the individual was asked to step out of the vehicle.²¹⁵ The individual and/or vehicle was searched for contraband or evidence in about 18% of these stops (almost 37,400), and the person was detained curbside or in a patrol car during 17% of these stops (about 35,700).²¹⁶ In about 7% of no-enforcement/no-discovery stops (nearly 15,000), the person was temporarily handcuffed and then released.²¹⁷ Out of the roughly 211,000 no-enforcement/no-discovery stops, an officer aimed a weapon in 361 of these stops (0.1%) and used a weapon in thirty-three of these stops (0.02%).²¹⁸

- ²¹⁵ See infra Table 3.
- ²¹⁶ See infra Table 3.
- ²¹⁷ See infra Table 3.

²¹³ See infra Table 2.

²¹⁴ See infra Table 2.

²¹⁸ See infra Table 3.

TABLE 3

Many traffic stops with no discovery or enforcement involve intrusive actions, especially in stops by police

	All LEAs	СНР		Police		Sheriff	
Traffic Stops with no enforcement/no discovery		Moving	Non- Moving	Moving	Non- Moving	Moving	Non- Moving
Search	37,377	81	63	13,264	17,694	1,942	4,333
Intrusiveness (at least)							
Out of Vehicle Curbside/Patrol Car	49,971	148	108	16,609	22,681	3,275	7,150
Detention	35,661	96	98	11,741	15,785	2,331	5,610
Handcuffed	14,951	81	82	5,889	7,364	434	1,101
Involves Weapon	361	8	6	139	98	51	59
Weapon Used	33	2	3	11	12	0	5
Total number of stops	211,086	17,777	13,296	56,215	69,193	17,599	37,006

SOURCES: Authors' calculations using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. NOTE: No enforcement is defined as not even a warning was issued.

These patterns differ across law enforcement agencies and types of violations. Table 3 shows that regardless of level, intrusive experiences are most common in stops for non-moving violations made by local law enforcement agencies. For example, in the nearly 15,000 instances in which the officer reported handcuffing the individual without any further enforcement or discovery, almost half were in stops for a non-moving violation made by the eight police departments.²¹⁹

Black and Latino drivers are overrepresented in these intrusive no-enforcement/nodiscovery

As noted above, a small number of traffic stops involve intrusive actions despite not even a warning being issued and no contraband or evidence being found. Such stops occur disproportionately with Latino and Black individuals. For example, out of almost 36,000 traffic stops that involve at least a curbside or patrol car detention, 46% are in stops of Latino drivers and 36% in stops of Black drivers.²²⁰ The Black share is especially striking: Black drivers are about 2.5 times more likely than white drivers (14%) to be detained, despite comprising a significantly lower share of the population.²²¹ Similar levels of racial disparity are present across other intrusive actions.

FIGURE 12

Black drivers comprise over a third of no-enforcement/no-discovery stops that involve intrusive actions

²¹⁹ See supra Table 3.
²²⁰ See infra Figure 12.
²²¹ See infra Figure 12.



SOURCE: Authors' calculations using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. NOTE: The numbers in parentheses refer to the total number of stops where the person experienced at least this level of intrusiveness, out of the 211,089 traffic stops with no enforcement and there was no discovery of contraband or evidence.

The main source of inequity in intrusive experiences is local law enforcement stops, especially police stops, and the majority of these are for non-moving violations. For example, police departments account for 89% of the nearly 15,000 no-enforcement/no-discovery stops in which the individual is handcuffed (49% for non-moving violations: 40% for moving violations).²²² Meanwhile, sheriff's departments account for 10% of these stops (7% non-moving violations; 3% moving violations).²²³ Finally, the CHP makes up only 1% of no-enforcement/nodiscovery stops in which the individual is handcuffed (0.5% non-moving violations; 0.5% moving violations).²²⁴

Overall, Black drivers are notably overrepresented in traffic stops relative to their share of the population (14% of traffic stops vs. 6% of the population), and these disparities vary by agency type.²²⁵ In stops by police departments, for example, Black drivers make up as many as a third of traffic stops in the hours after midnight. roughly twice the share of white drivers.²²⁶ Racial disparities in search and discovery rates are also more evident among local law enforcement stops. We also see racial disparities in enforcement. For local law enforcement agencies, almost a third of stops of Black drivers around midnight do not result in any enforcement or discovery.²²⁷ Finally, Black and Latino drivers are overrepresented among no-enforcement/no-discovery stops that involve intrusive actions, including being asked to step out of the vehicle, being detained, being handcuffed, or an officer aiming or using a weapon.²²⁸

²²⁵ See infra Technical Appendix Table A2.

²²² See supra Table 3.

²²³ See supra Table 3.

²²⁴ See supra Table 3.

²²⁶ Authors' estimates from the California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. ²²⁷ Id.

Public safety implications

Interactions between civilians and police, whether for a traffic stop or another reason, carry inherent risks. In 2019, 799 assaults on police officers occurred during traffic pursuits and stops in California (7.6% of total assaults on law enforcement)— fifty-five of which involved a firearm (19% of all firearm-related assaults on law enforcement).²²⁹ In addition, in a study of police use of force, Premkumar et al. found that traffic and pedestrian stops account for about 15% of police encounters in which a civilian is seriously injured or killed.²³⁰ Overall, there are stark racial disparities in civilians injured during law enforcement encounters.²³¹ Black Californians are about three times more likely to be seriously injured, shot, or killed by the police relative to their share of the state's population.²³² Concerns about these racial disparities in use of force have motivated several statewide policing reforms. In addition, a few cities in California, including Los Angeles,²³³ San Francisco,²³⁴ and Berkeley,²³⁵ have implemented reforms to the enforcement of some traffic violations.

However, a small share of these traffic stops involves a firearm being confiscated. In 2019, these fifteen law enforcement agencies made 905 traffic stops that resulted in officers confiscating firearms (0.03% of 3,394,392 traffic stops, 0.5% of 171,472 searches during traffic stops).²³⁶ Of these stops, 51% (463) were for non-moving violations (320 by police officers, 98 by sheriff deputies, and 45 by the CHP).²³⁷ Altogether, traffic stops involving seizure of a firearm represented about 30% of the 3,024 stops of any kind in which a firearm was seized by these law enforcement agencies in 2019.²³⁸ Looking at the eight largest police departments in the state (Los Angeles, San Diego, Sacramento, San Francisco, San Jose, Fresno, Long Beach, and Oakland), departments that conduct proportionally more searches during traffic stops typically confiscate lower shares of firearms.²³⁹ Two types of searches that require a lower level of evidence of criminal misconduct— those conducted with the consent of a stopped individual and those based on supervision status (e.g., parole or probation)—result in notably smaller shares of firearm confiscation with fewer than a fifth and a half of the share of firearms confiscated on average, respectively.²⁴⁰ Other search types—such as warrant searches, searches prompted by evidence of a crime, and searches under exigent circumstances (urgent or dangerous situations where discretion is low)-resulted in much higher shares of firearm confiscation.²⁴¹

²⁴¹ Id.

²²⁹ Authors' estimates from the California Department of Justice, Law Enforcement Officers Killed or Assaulted data, 2019. ²³⁰ Deepak Premkumar et al., Police Use of Force and Misconduct in California, PUB. POL'Y INST. OF CAL. 3 (2021), https://www.ppic.org/publication/police-use-of-force-and-misconduct-in-california/. ²³¹ *Id.* at 18-19. ²³² *Id.* at 3.

²³³ Kevin Rector, New Limits on 'Pretextual Stops' by LAPD Officers Approved, Riling Police Union, L.A. TIMES (March 1, 2022, 7:32 PM), https://www.latimes.com/california/story/2022-03-01/new-limits-on-pretextual-stops-by-lapd-to-take-effectthis-summer-after-training.

²³⁴ Megan Cassidy, Why S.F. Might be About to Prohibit Police From Making Low-Level Traffic Stops, S.F. CHRONICLE (May 11, 2022 6:36 PM), https://www.sfchronicle.com/sf/article/Why-S-F-might-be-about-to-prohibit-police-from-17166395.php.

²³⁵ Sarah Ravani, Berkeley Adopts Sweeping Police Reforms Including Taking Cops Off Routine Traffic Stops, S.F. CHRONICLE (Feb. 23, 2021 9:16 PM), https://www.sfchronicle.com/bayarea/article/Berkeley-to-consider-sweeping-policereforms-15971071.php.

²³⁶ There are eighty traffic stops where a firearm was confiscated without a search being performed, but the overall confiscation rate rounded to the nearest tenth of a percent is the same. Authors' estimates from the California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. ²³⁷ *Id.* ²³⁸ *Id.*

²³⁹ Deepak Premkumar et al., How Often Are Firearms Confiscated During Traffic Stops?, PUB. POL'Y INST. OF CAL. (2023), https://www.ppic.org/blog/how-often-are-firearms-confiscated-during-traffic-stops/.

²⁴⁰ *Id*.

Testing for Racial Bias in Police Stops for Traffic Violations

Does racial bias in policing contribute to racial disparities in traffic stop outcomes? Given the previously mentioned research findings and literature that demonstrate the broad prevalence of bias in our society, it may not be surprising to find evidence of racial bias in the RIPA data.

Our analysis above shows that Black drivers are overrepresented in traffic stops relative to their share of the population.²⁴² However, this in and of itself is not necessarily indicative of racial bias. Driving patterns and behaviors (due to work, school, shopping, and entertainment)-as well as vehicle conditions-may also differ across race/ethnicity.²⁴³ These differences mean that the demographic composition of drivers in any particular area and at a particular time may differ from the residential population, rendering the residential population an inappropriate benchmark to represent the likelihood that different racial/ethnic groups would be stopped for traffic violations. To circumvent some of these challenges, we employ an analytical method based on the "veil of darkness" theory to test for racial bias in traffic stops.

The veil-of-darkness theory posits that light conditions affect officers' ability to determine the race/ethnicity of a driver and that it is more difficult to ascertain a person's race or ethnicity during dark hours.²⁴⁴ If racial profiling is a factor influencing officers' decisions to stop drivers, the share of people of color in traffic stops would be lower during dark hours, compared to light hours, holding everything else constant. But simply comparing daytime and nighttime stops would not account for differences in driving patterns and behaviors across racial/ethnic groups and times of day. Instead, we exploit the sudden change in daylight that occurs at specific and location-dependent times in early March and November during the annual shift to and from Daylight Saving Time (DST). For example, in Southern California, it was light between 6:00 a.m. and 6:55 a.m. before DST started on March 10, 2019, but dark between 6:00 a.m. and 6:55 a.m. right after the switch. There was also an opposite switch, from dark to light, between 6:40 p.m. and 7:35 p.m. on March 10. Similar changes in light conditions can also be identified in November. The veil-of-darkness theory predicts that if there is racial bias in traffic stops, the share of people of color stopped will decrease when light conditions switch from light to dark and increase when light conditions switch from dark to light.²⁴⁵

Given that there are light-to-dark and dark-to-light switches on each DST switch date in March and November, our approach has the benefit of predicting opposite changes to the shares of Black and Latino drivers for a given DST switch date and is hence less susceptible to concerns about underlying trends and seasonality. Given that we see distinct differences in racial disparity in traffic stops between CHP and local law enforcement, and that their

²⁴² See supra Figure 1 and accompanying text.

²⁴³ See Jeffrey Grogger & Greg Ridgeway, *Testing for Racial Profiling in Traffics Stops From Behind a Veil of Darkness*, 101 (475) J. AM. STAT. ASS'N 878, 878-87 (2006); William C. Horrace & Shawn M. Rohlin, *How Dark is Dark? Bright*

Lights, Big City, Racial Profiling, 98(2) REV. ECON. & STAT. 226, 232 (2016). ²⁴⁴ The veil-of-darkness approach was first used in the police bias context by Grogger and Ridgeway who examined 7,600 traffic stops made by the Oakland Police Department in 2003. Grogger & Ridgeway, *supra* note 228 at 880. The study finds no convincing evidence of racial profiling in traffic stops. *Id.* at 885. Since then, a number of studies have been produced examining traffic stops in a number of states (including Connecticut, Minnesota, New York, Oregon, Rhode Island, and Texas), generating mixed results regarding bias in policing. *See* Jesse Kalinowski, Matthew B. Ross & Stephen L. Ross, *Addressing Seasonality in Veil of Darkness Tests for Discrimination: An Instrumental Variables Approach*, UNIV. OF CONN., DEP'T OF ECON. WORKING PAPER NO. 2019-07 (2019) for a summary of findings. In an application of this approach using a comprehensive dataset covering law enforcement agencies throughout the country, Emma Pierson et al., found that Black drivers were less likely to be stopped after sunset than white drivers, suggesting bias in officer stop decisions. Emma Pierson et al., A Large-Scale Analysis of Racial Disparities in Police Stops across the United States, 4 NATURE HUM. BEHAV. 4: 736, 745 (2020). ²⁴⁵ Grogger & Ridgeway, *supra* note 228.

missions and objectives differ, we separately test this theory for each type of law enforcement agency. In our analysis, we assume that driving behavior and patterns do not sharply change during these sudden switches in light conditions, or that changes are uniform across race/ethnicity.²⁴⁶ As light conditions are seasonal and change over time, we limit our study period to the two-week periods before and after the DST switches in March and November.²⁴⁷

As with most tests of the veil-of-darkness theory, our analysis may be limited by lack of statistical power meaning we may not find evidence of bias even if it exists. Given that we focus on brief, specific times of the day, for only four weeks, and we examine racial/ethnic groups and law enforcement agencies separately, our sample sizes are limited. This is a particular concern for studying Black drivers, who, although they are overrepresented compared to their share of the statewide population, are a relatively small minority of drivers during the hours examined here.248

Another important note is that this is a single and specific test of racial bias. Though an affirmative result would provide evidence that racial bias contributes to the observed racial disparities, a negative result would not conclusively show that there is no racial bias in policing, but rather indicate that there is no evidence of it in the decision to stop someone for a traffic violation during the morning and evening hours analyzed—times of the day when racial disparities are not especially large, as our analysis above shows.

RIPA data shows some evidence of racial bias in policing

Our estimates provide some evidence of racial bias in the likelihood of being stopped for a traffic violation. As Figure 13 shows, in stops made by local law enforcement agencies, we find *decreases* in stops of Black and Latino drivers when conditions suddenly switch from light to dark.²⁴⁹ Specifically, the shares of stops fall by 2.2 percentage points when we combine Black and Latino drivers, and by 2.5 percentage points and 2.8 percentage points, respectively, when we estimate the effects separately.²⁵⁰ Conversely, the shares of stops of Black and

²⁴⁹ See infra Figure 13.

²⁴⁶ To adjust for possible broader changes that coincide with the DST switches, we subtract out pre-post changes in the racial composition during the same hours, but on calendar dates adjacent to the DST we switch dates (in other words, we are estimating "difference-in-differences" models). The number of local law enforcement agency traffic stops of white, Latino, and Black drivers drops somewhat from the two-week pre-DST switch period compared to the two-week post-DST switch period, from 71,731 to 66,847, a decrease of 6.8%. Importantly, the percentage decrease is identical, 6.8%, during the hours subject to changes in light conditions as a result of DST as they are during the comparison hours (those hours in which the light conditions remain the same). The number of CHP traffic stops also decline by about 7% in the post-DST switch period compared to the pre-DST period (from 141,714 to 131,524). However, the percentage decrease is somewhat greater for traffic stops during the so-called treatment hours (dropping from 20,719 to 18,238, a decrease of 12%) compared to the comparison hours (decreasing by 6.4%, from 120,995 to 113,286).

Specifically, we estimate linear probability models (LPM) of the likelihood that the person stopped is a person of color, estimated jointly for Black and Latino individuals, as well as separately, relative to white individuals:

POCit=0+1LTtoDarkt+2DarktoLTt+3Postt+4Post*LTtoDarkt+5Post*DarktoLTt+it where *LTtoDark* and *DarktoLT* are indicator variables for the relevant time period in which light conditions switch from light to dark and dark to light, respectively, at the date of DST, and *Post* is an indicator variable equal to one for the two-week to dark and dark to light, respectively, at the date of DS1, and *Post* is an indicator variable equal to one for the two-week period on and after the DST switches. We limit the sample to traffic stops two weeks pre- and post-DST switches, and to stops between 4 a.m.–8 a.m. and 4 p.m.–8 p.m. Some models include demographic controls. The estimated coefficients and standard errors are shown in Tables C1–C5 in Technical Appendix C. ²⁴⁸ The number of CHP stops of white, Latino, and Black drivers during the hours subject to changes in light conditions as a result of DST are 16,492, 18,123, and 4,342, respectively, over the four-week period examined (two weeks prior to the DST switch and two weeks after the DST switch). For local law enforcement, the numbers are 5,294, 9,787, and 4,721, respectively. Authors: actimates from the California Department of Lytica. Pacial and Identity. Profiling Act (PIRA) Waya 2

respectively. Authors' estimates from the California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019.

²⁵⁰ This change translates to about 3% when we combine Black and Latino drivers, and about 5% and 4% fewer stops, respectively, when estimated separately. See infra Technical Appendix Tables C1-C5.

Latino drivers *increase* by 1.4–2.0 percentage points when light conditions switch suddenly from dark to light.²⁵¹ The estimates are at least statistically significant at the 10% level, except for the change in the share of Black drivers during the switch from dark to light.

For CHP stops, we do not find evidence of police bias for Black drivers, but there is some evidence of bias in stops of Latinos, limited to the switch from dark to light. The share of Latino drivers stopped increases by 1.8 percentage points, while the share of Black drivers is essentially unchanged.²⁵²

FIGURE 13

RIPA data provide some evidence of racial bias in local law enforcement's stopping behavior before and after Daylight Savings Time



SOURCE: Authors' calculations using California Department of Justice, Racial and Identity Profiling Act (RIPA) data, 2018–2020. NOTES: The numbers by the orange markers represent the estimated change in the share of Black and Latino drivers stopped for a traffic violation, relative to white drivers, as a result of the sudden changes in light conditions, as a result of DST switches. The length of the bars represent 90% confidence intervals. Estimates with bars not crossing the horizontal axis (at zero) are statistically significant at the 10% level.

In some cases, it is possible that officers could have more difficulty ascertaining a driver's race and ethnicity for moving violations (such as a speeding violation) than for non-moving violations (such as improper display of license plate).²⁵³ To examine and account for such possible differences, we estimate separate models for moving

²⁵¹ This change translates to about 3% for both Black and Latino drivers. *See infra* Technical Appendix Tables C1-C5 for detailed results.

²⁵² See infra Figure 13; see also infra Technical Appendix Tables C1–C3. The size of these estimates are generally not very sensitive to the inclusion of other controls, such as differences in officer-perceived demographic traits and characteristics, whether the stop was in response to a call for service and/or for a moving or non-moving violation. However, when we include these controls, the estimates are not statistically significant at conventional levels, with the exception of our estimates of the combined share of people of color in stops by local law enforcement officers. Estimates for the effects during both switches from light to dark and dark to light are statistically significant at least at the 10% level (and at the 5% level for switches during the dark-to-light time period). These patterns are likely a result of the very small sample sizes for anyone of a given demographic characteristic and type of violation. When we combine Black and Latino drivers (hence increasing the sample size), statistical significance remains. ²⁵³ Key factors affecting the ability of an officer to determine a driver's race or ethnicity are the speed and proximity of the

officer's and driver's vehicles.

and non-moving violations. This approach, however, is challenged further by sample size limitations, resulting in less precise estimates.

The estimates potentially suggest greater racial bias in stops by local law enforcement of Black drivers for nonmoving violations. The share of Black drivers stopped for non-moving violations decreases by about four percentage points when conditions switch from light to dark, and it is statistically significant at the 10% level.²⁵⁴ This is roughly twice the estimated decrease in the share of Black drivers in stops for moving violations. The estimated increase in the share of Black drivers when light conditions switch from dark to light is roughly the same for moving and non-moving violations.²⁵⁵

In contrast, the estimates for local law enforcement stops point toward greater racial bias in stops of Latino drivers for moving violations. The share of Latino drivers decreases by a statistically significant 2.7 percentage points (at the 10% level) when light conditions switch from light to dark and increases by 3.1 percentage points (statistically significant at the 5% level) when conditions change from dark to light.²⁵⁶ The estimates for non-moving violations are not statistically different from no change, but given their imprecision (possibly due to the fact that the sample size is less than half of the sample size for stops for moving violations), we also cannot reject the hypothesis that they are the same as for stops for moving violations.

The analysis of CHP stops does not reveal any evidence of racial bias for moving violations but provides some evidence of racial bias for non-moving violations. The shares of Black and Latino drivers decrease with the switch from light to dark but only the change in the share of Black drivers (dropping by 2.5 percentage points) is statistically significant at the 10% level.²⁵⁷ The share of Latino drivers stopped for non-moving violations by the CHP increases by 2.3 percentage points when going from dark to light, but this is not statistically significant.²⁵⁸

Our tests of racial bias in local law enforcement stops motivated by the veil-of-darkness theory point consistently toward bias in stop decisions of both Latino and Black drivers, with some possible differences between stops for moving and non-moving violations. The evidence of racial bias is less consistent in traffic stops made by the CHP, though it is somewhat stronger in CHP stops for non-moving violations.

Conclusion and Recommendations

To effectively enforce the RJA in California, there needs to be an understanding of racial disparities in charging, convicting, and sentencing, and what potential determinants of those disparities may be. After controlling for differences in contextual factors across stops, this report provides widespread evidence of racial disparities in law enforcement interactions across a variety of outcomes, including racial bias in traffic stops and disparities in which stops end with an arrest. These are relevant considerations, all of which ultimately affect who is charged,

²⁵⁴ See infra Technical Appendix Table C4.

 ²⁵⁵ See infra Technical Appendix Table C4.
 ²⁵⁶ See infra Technical Appendix Table C4.
 ²⁵⁷ See infra Technical Appendix Table C5.
 ²⁵⁸ See infra Technical Appendix Table C5.

convicted, and sentenced, as discussed in the *Young* decision²⁵⁹ and further undergirded by RJA's call to consider how previous biases may have affected criminal history.

Our analysis of the 2019 RIPA data, which includes nearly four million stops from the fifteen largest law enforcement agencies in California, reveals notable differences across race/ethnicity in experiences with law enforcement during a stop.²⁶⁰ These differences partially stem from context of the stop, agency and jurisdiction characteristics, and personal civilian traits. However, even after adjusting for these factors, stark racial disparities persist—particularly between Black and white civilians—and likely provide a conservative estimate of racial bias.

Black Californians are significantly more likely to be stopped than white Californians, and experiences during stops and outcomes afterward also vary.²⁶¹ We find that Black individuals are more than twice as likely to be searched as white individuals, but a lower share of those *searches* of Black people yield contraband, suggesting an inefficient practice at the very least.²⁶² Overall, searches yield some kind of contraband or evidence in slightly more than one-fifth of searches.²⁶³

Black people are also overrepresented among stops not leading to enforcement as well as in those leading to an arrest.²⁶⁴ The seemingly contradictory pattern is partly due to a higher share of Black people stopped for reasonable suspicion, having an outstanding warrant, or being on parole/probation—contexts where stops are investigatory and do not lead to any enforcement, or they are more serious and may result in a booking.²⁶⁵ Black people are 14% more likely to be arrested with the most restrictive set of controls, which contributes to differences in arrest history and a racially disparate set of individuals presented to the prosecutor for charging decisions.²⁶⁶

We also find that Black people are at least twice as likely as whites to experience so-called intrusive outcomes, ranging from being asked to step out of a vehicle, to being handcuffed, to the stop involving a weapon.²⁶⁷ While relatively rare, officers report that about 0.4% of stops involve an officer's weapon.²⁶⁸ Stops of Black individuals, however, are three times more likely to involve a weapon than stops of white individuals.²⁶⁹ Accounting for context reduces the disparity, but stops of Black Californians are almost twice as likely to involve an officer's weapon as stops of white Californians.²⁷⁰

These racial inequities persist despite adjusting for context, providing empirical support for concerns historically voiced by communities of color. However, context around a stop *does* explain part of the observed racial gap. Differences in context—such as whether a person was stopped because of a traffic violation versus an outstanding arrest warrant—expose officers to varying risk levels when interacting with the community. Law enforcement might examine whether traffic stops in particular can be reduced without leading to any negative impact on public safety.

²⁵⁹ Young, 79 Cal. App. 5th 138.

²⁶⁰ See infra Technical Appendix Table A2.

²⁶¹ See supra Figure 1 and infra Appendix Table A6–A11.

²⁶² See supra Figure 4; see also supra Figure 5.

²⁶³ See supra Table 1.

²⁶⁴ See supra Figure 6.

²⁶⁵ See infra Technical Appendix Table A10.

²⁶⁶ See supra Figure 6.

²⁶⁷ See supra Figure 8.

²⁶⁸ See infra Technical Appendix Table A9.

²⁶⁹ See supra Figure 8; see also infra Technical Appendix Table A9.

²⁷⁰ See supra Figure 8.

While traffic stops are intended to make our streets and highways safer to travel on, they represent the majority of stops and interactions between officers and the community, generating many of the inequities in experiences after a stop. This focus holds particular relevance for police and sheriff's departments, where more than one-third of traffic stops are for an equipment or non-moving violation (e.g., expired registration or overly tinted windows). By reducing these stops, law enforcement could mitigate some of the racially disparate experiences communities of color face, as well as reduce the risk of injury present for both officers and individuals.

While most traffic stops result in some enforcement (i.e., at least a warning) or discovery of contraband or evidence, officers in the state's fifteen largest law enforcement agencies reported about 211,000 stops in 2019 that led to no enforcement or discovery.²⁷¹ Altogether, no-enforcement/no-discovery stops took more than 80,000 hours of officer time.²⁷² Stops by police departments for non-moving violations account for close to 28,000 of these hours.²⁷³

Our analysis also finds that Black and Latino drivers are notably more likely to be stopped for a traffic violation that does not result in any enforcement or discovery of contraband or evidence.²⁷⁴ Furthermore, Latino drivers and, especially, Black drivers are more likely than white drivers to experience intrusive actions during these stops.²⁷⁵ While the vast majority of these stops do not go beyond verbal communication with the officer, thousands of them involve being searched (37,400 stops), detained (35,700), or handcuffed (15,000).²⁷⁶ In rare cases, officers aim or use a weapon during traffic stops that do not lead to any enforcement or discovery.²⁷⁷

Potential alternative approaches to enforce traffic laws include mailing warnings or citations to the registered owner of the vehicle, especially if the reason for the stop is a non-moving violation and concerns about road safety may not be immediate. Alternative enforcement methods for moving violations are also possible. While automated speed cameras are not broadly legal in California (though they are being piloted in six cities starting in 2024),²⁷⁸ they are used in many jurisdictions across the nation, and the National Transportation Safety Board found them to be an effective tool to reduce speeding-related crashes.²⁷⁹ Red light cameras are legal and used in California and have been found by the Insurance Institute for Highway Safety to reduce traffic violations and crashes.²⁸⁰ These strategies have the additional advantage of reducing discretion in enforcement decisions, which potentially could also lead to decreases in racial inequities in policing.²⁸¹

Implementation of alternative enforcement should be balanced against the possibility that changes may hamper efforts to confiscate dangerous contraband, especially firearms, a concern at times voiced by law enforcement. The RIPA data show that some guns are indeed seized during traffic stops, though it is rare. Overall, officers confiscated firearms in 905 out of the close to 3.4 million traffic stops (0.03%) that took place in 2019 (officers

²⁷¹ See infra Technical Appendix Table A5.

²⁷² See supra Table 2.

²⁷³ See supra Table 2.

²⁷⁴ See supra Figure 12.

²⁷⁵ See supra Figure 12.
²⁷⁶ See supra Figure 12.

²⁷⁷ See supra Figure 12.

²⁷⁸ AB 645, 2023 Gen. Assemb., Reg. Sess. (Cal. 2023),

https://leginfo.legislature.ca.gov/faces/billTextClient.xhtml?bill id=202320240AB645

²⁷⁹ *Reducing Speeding-Related Crashes Involving Passenger Vehicles*, NAT'L TRANSP. SAFETY BD. 34-43 (2017), https://www.ntsb.gov/safety/safety-studies/Documents/SS1701.pdf; *Id*.

Effectiveness of Cameras, INS. INST. FOR HIGHWAY SAFETY (2022), https://www.iihs.org/topics/red-lightrunning#effectiveness-of-cameras.

²⁸¹COUNCIL ON CRIM. JUST., IMPLICIT BIAS TRAINING 1 (2021), https://assets.foleon.com/eu-central-1/de-uploads-7e3kk3/41697/implicit bias.524b7c301e55.pdf.

also seized firearms in 2.119 out of the roughly 600.000 non-traffic stops).²⁸² Slightly more than half of these stops were for non-moving violations, primarily made by police departments. Police departments that conducted proportionally more searches during traffic stops typically confiscate lower shares of firearms. Consent and supervision-status searches have more lower confiscation shares than searches driven by evidence or urgency.

Lastly, our results from testing the veil-of-darkness theory provide evidence of racial bias as a contributing factor to racial disparities in traffic stops for Black and Latino drivers, underscoring the urgency of efforts that can reduce these inequities. While implicit bias training for officers is a frequent tool, research support of its effectiveness is not strong²⁸³ and further evaluative research is needed.²⁸⁴ Another approach to consider is diversifying police staff. While there are practical challenges to recruiting diverse police staff, recent research finds evidence that such efforts may well reduce racial inequities, and suggests reallocating officers to calls from same-race/ethnicity neighborhoods as a complementing approach.²⁸⁵ Officer experience and seniority is another factor that likely matters, and Ba et al. find evidence suggesting that equalizing officer seniority across districts within a law enforcement agency jurisdiction may reduce racial inequities and improve public safety.²⁸⁶

Given the inherent risks involved in traffic stops, successful implementation of alternative enforcement strategies for non-moving violations has the potential to maintain public and road safety, while improving officer and civilian safety, enhancing police efficiency, and reducing racial inequities. Implementation of these efforts should include rigorous assessments of their impacts on these important outcomes.

²⁸² Authors' estimates from the California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019.

²⁸³ *Id.* at 3-4.

²⁸⁴ See Mychal Machado & Ashley Lugo, A Behavioral Analysis of Two Strategies to Eliminate Racial Bias in Police Use of *Force* BEHAV. ANALYSIS IN PRAC. 2 (2021), https://www.researchgate.net/publication/350022930_A_Behavioral_Analysis_of_Two_Strategies_to_Eliminate_Racial_Bia

nttps://www.researchgate.net/publication/350022930_A_Benavioral_Analysis_o1_1wo_Strategies_to_Eliminate_Ractal_1 s in Police_Use_of Force.
 ²⁸⁵ See generally Bocar A. Ba et al., The Role of Officer Race and Gender in Police-Civilian Interactions in Chicago, 371 (6530) SCIENCE 696, 696–702 (2021); see also Mark Hoekstra & CarlyWill Sloan, Does Race Matter for Police Use of Force? Evidence from 911 Calls, WORKING PAPER NO. 26774, NAT'L BUREAU OF ECON. RSCH., (2020) https://doi.org/10.3386/w26774.

²⁸⁶ See Bocar Ba et al., Police Officer Assignment and Neighborhood Crime, WORKING PAPER NO. 29243, NAT'L BUREAU OF ECON. RSCH. (2021), https://www.nber.org/system/files/working papers/w29243/w29243.pdf.



Racial Disparities in Law Enforcement Stops

Technical Appendices

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Appendix A. Racial and Identity Profiling Act (RIPA) and

Descriptive Statistics

AB 953: The Racial and Identity Profiling Act of 2015

The data utilized was made possible by legislation passed in 2015 by the California Legislature, known as the Racial and Identity Profiling Act (RIPA) of 2015.²⁸⁵ While issues of race and policing were not new, numerous high-profile officer-involved shootings in the years preceding 2015 had again brought police violence against communities of color into the state and national spotlight. The legislature believed this legislation was needed to examine these issues, and to unite community members and law enforcement in an effort to develop solutions to eliminate racial and identity profiling in law enforcement. The Racial and Identity Profiling Act of 2015, also known as AB 953, included three important actions:

- 1. Required law enforcement agencies to begin collecting and reporting data on citizen complaints that allege racial and identity profiling;
- 2. Required law enforcement agencies to collect perceived demographic and other detailed data regarding pedestrian and traffic stops;
- 3. Created the Racial and Identity Profiling Advisory (RIPA) Board, for the purpose of eliminating racial and identity profiling and improving diversity and racial and identity sensitivity in law enforcement.²⁸⁶

The pedestrian and vehicle stop data requirement is what allows us to conduct this research. Specifically, the law requires California law enforcement agencies employing peace officers to annually report their stop data to the California Attorney General, where a "stop" is defined as any detention by a peace officer of a person, or any peace officer interaction with a person in which the officer conducts a search.²⁸⁷

The statutorily mandated data elements include person-level and stop-level information. Officers are required to record their perception of the identity characteristics pertaining to each stopped person, including their race or ethnicity, gender, approximate age, lesbian, gay, bisexual, or transgender (LGBT) status, English fluency, and disability. Officers are prohibited from asking the person stopped to self-identify these characteristics.²⁸⁸ Consequently, officer perceptions of identity characteristics may differ from how an individual self-identifies. In addition to these person-level observations, a number of data elements provide stop-level information. These elements include: reason for stop (includes, for example, for a traffic violation, reasonable suspicion,

²⁸⁵ A.B. 953, 2015 Gen. Assemb., Reg. Sess. (Cal. 2015).

 ²⁸⁶ Id.
 ²⁸⁷ Id.
 ²⁸⁸ Id.

parole/probation/PRCS/mandatory supervision, and knowledge of outstanding arrest warrant/wanted person, and consensual encounter resulting in search); action taken by officer during stop (such as suspect removed from vehicle, removed from vehicle by physical contact, curbside detention, handcuffed, canine search, use of electronic device, chemical spray, and use of firearm); reason for search (probable cause, consent, etc.); contraband or evidence discovered (such as guns, drugs, drug paraphernalia, alcohol, money, or stolen property); and enforcement result of stop (includes no action, warning, citation, cite and release, booking, and psychiatric hold).²⁸⁹

TABLE A1

California's 15 Largest Law Enforcement Agencies Reported almost 4 Million Stops in 2019.

	Number of	Number of	Number of
	Stops	Sworn Officers	Stops per
			Officer
All 15 Agencies	3,992,074	38,172	105
Law Enforcement Agency			
California Highway Patrol	2,172,023	7,230	300
Police Departments	1,230,738	18,173	68
Los Angeles	712,807	9,947	72
San Diego	187,231	1,764	106
San Francisco	101,614	2,279	45
Sacramento	68,012	678	100
Fresno	51,849	806	64
San Jose	44,306	1,150	39
Long Beach	40,524	809	50
Oakland	24,395	740	33
Sheriff Departments	589,313	12,769	46
Los Angeles County	196,850	6,647	30
San Bernardino County	157,715	1,314	120
Sacramento County	65,029	1,400	46
San Diego County	60,944	865	70
Riverside County	58,379	1,453	40
Orange County	50,396	1,090	46

SOURCES: Authors calculations using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019 and Criminal Justice Personnel, 2019. Law Enforcement Personnel is limited to full-time non-jail personnel.

TABLE A2

Perceived Personal Traits and Contexts of Stops by Perceived Race/Ethnicity

	White	Black	Latino	Asian	Middle East/ South Asian	Pacific Islander	Native American	Multi Race/ Ethnicity
Demographics								
Male	67.0%	70.7%	74.7%	66.0%	81.1%	67.0%	55.0%	68.0%
Female	32.9%	29.0%	25.2%	33.9%	18.8%	32.1%	36.6%	30.2%
Transgender Man	0.06%	0.15%	0.08%	0.03%	0.02%	0.09%	0.17%	0.54%
Transgender Woman	0.04%	0.10%	0.04%	0.02%	0.01%	0.06%	0.15%	0.12%
Gender Nonconforming	0.04%	0.04%	0.02%	0.03%	0.02%	0.75%	8.06%	1.09%
LGBT	0.7%	0.9%	0.6%	0.5%	0.3%	1.0%	1.1%	1.8%
Age	39.7	35.2	34.3	38.3	37.0	36.2	38.4	34.6
Limited English								
Proficiency	0.5%	0.9%	8.3%	6.9%	3.6%	1.4%	1.0%	2.0%
Disability								
No Disability Mental Health	98.7%	98.1%	99.3%	99.0%	99.5%	98.5%	90.4%	98.5%
Condition	0.93%	1.41%	0.46%	0.65%	0.33%	1.14%	1.05%	1.06%
Development Disability	0.08%	0.11%	0.05%	0.08%	0.03%	0.13%	0.15%	0.14%
Multiple Disabilities	0.09%	0.12%	0.04%	0.07%	0.03%	0.12%	8.00%	0.17%
Reason For Stop								
Traffic Stop	85.5%	74.7%	86.4%	93.3%	95.4%	84.8%	83.2%	83.3%
Reasonable Suspicion	11.7%	21.0%	10.7%	5.6%	4.0%	12.1%	12.7%	13.2%
Parole/Probation	0.55%	1.23%	0.75%	0.18%	0.10%	0.63%	0.93%	0.93%
Outstanding Warrant Consensual	0.59%	1.19%	0.70%	0.28%	0.18%	0.98%	1.29%	0.86%
Encounter/Search School/Education	1.23%	1.35%	1.09%	0.44%	0.22%	1.02%	1.27%	1.26%
Violation	0.45%	0.53%	0.39%	0.23%	0.13%	0.54%	0.63%	0.50%
Call for Services	5.17%	8.36%	4.00%	3.03%	2.17%	5.96%	5.65%	6.57%
Basis For Search								
Search Warrant	0.09%	0.22%	0.17%	0.15%	0.06%	0.21%	0.12%	0.16%
Parole/Probation	1.67%	5.46%	2.30%	0.63%	0.38%	2.15%	1.80%	2.97%
Visible Contraband	0.24%	1.34%	0.53%	0.13%	0.11%	0.27%	0.21%	0.72%
Odor of Contraband	0.12%	1.45%	0.51%	0.11%	0.09%	0.22%	0.18%	0.63%
Contraband Found								
Any Contraband	1.82%	4.43%	2.54%	0.98%	0.60%	2.32%	2.15%	3.12%
Weapon	0.37%	1.08%	0.60%	0.25%	0.17%	0.69%	0.69%	0.75%
Property	0.27%	0.66%	0.32%	0.20%	0.11%	0.40%	0.16%	0.47%
Drugs	1.55%	3.22%	1.86%	0.74%	0.45%	1.72%	1.96%	2.46%
Other	0.78%	1.95%	1.42%	0.45%	0.33%	1.09%	1.17%	1.42%
Law Enforcement Agency California Highway								
Patrol	60.7%	35.0%	54.4%	61.1%	68.8%	56.1%	61.6%	47.8%
Police Departments								
Los Angeles	10.0%	30.6%	21.1%	11.5%	13.5%	8.2%	5.6%	9.9%
San Diego	6.02%	5.84%	3.45%	3.91%	2.60%	6.77%	4.35%	4.01%

San Francisco	2.66%	3.80%	1.25%	5.12%	3.98%	5.28%	1.70%	6.71%		
Sacramento	1.51%	4.24%	0.93%	1.54%	0.88%	2.46%	1.10%	2.59%		
Fresno	1.05%	1.14%	1.68%	1.08%	0.94%	0.51%	1.04%	0.68%		
San Jose	0.77%	0.67%	1.41%	2.27%	0.88%	1.68%	0.79%	2.01%		
Long Beach	0.71%	1.75%	0.95%	0.86%	0.30%	1.93%	0.48%	6.18%		
Oakland	0.25%	2.02%	0.39%	0.51%	0.31%	0.84%	0.35%	0.76%		
Sheriff Departments										
Los Angeles	3.42%	5.52%	6.12%	5.80%	2.42%	4.61%	1.46%	7.39%		
San Bernardino	4.59%	4.32%	3.79%	2.08%	1.47%	3.25%	5.11%	5.59%		
San Diego	2.61%	0.84%	1.24%	1.11%	1.11%	2.98%	4.84%	1.04%		
Sacramento	2.05%	2.89%	0.65%	0.93%	0.77%	2.44%	1.23%	3.32%		
Riverside	1.71%	1.01%	1.63%	0.84%	0.58%	1.48%	1.86%	1.40%		
Orange County	1.93%	0.31%	1.02%	1.35%	1.43%	1.48%	8.45%	0.63%		
		635,09								
Number of Stops	1,322,201	2	1,552,485	228,790	187,128	21,092	8,271	37,015		
SOURCES: Racial and Identity	SOURCES: Racial and Identity Profiling Act (RIPA) stop data, 2019.									
NOTES: The 2019 Wave 2 data	are limited to Califo	ornia's fiftee	en largest law en	forcement age	encies.					

Table A3 shows the rate at which each law enforcement agency conducted a search during a stop, and whether it encountered any type of contraband during that search. The lowest search rate belongs to the CHP, which is perhaps not surprising, given its emphasis on traffic violations. CHP officers conducted a search only 1.6% of the time. By contrast, the Oakland Police Department searched fully half of the people it stopped. On average, police departments showed a slightly higher search rate (24%) than did sheriff's departments (21%), but there is clearly plenty of variation between individual departments.

Once an officer conducts a search, the yield rate shows what percentage of the time some contraband turned up. For instance, of the searches that the Orange County Sheriff's Department conducted, they discovered contraband 31.2% of the time, with drugs as the most commonly found type, at 24.7%. Drugs are the most commonly discovered type of contraband for each of the law enforcement agencies. (The columns typically add to more than the rate of "Any" type of contraband, since more than one type may be found during any search.)

TABLE A3

Search Rates and Results, by Law Enforcement Agency

			Yield Rate	s:					
									No. of
		Searc		Weapo	Propert			No. of	Searche
		h Rate	Any	n	У	Drug	Other	Stops	S
Agency									
:									
								2,172,02	
	СНР	1.6%	11.1%	1.7%	1.0%	8.6%	2.1%	3	34,920
Sheriff D	epartments								
						18.2			
	Los Angeles	17.9%	25.2%	3.2%	1.5%	%	5.3%	196,850	35,151
	San					10.3			
	Bernardino	31.9%	15.7%	3.1%	2.2%	%	2.7%	157,715	50,244
						17.7			
	San Diego	17.9%	23.0%	3.0%	2.6%	%	4.0%	65,029	11,630
	Sacramento	28.1%	16.0%	3.8%	2.9%	8.3%	4.9%	60,944	17,147
						13.4			
	Riverside	5.9%	19.1%	2.5%	2.3%	%	3.6%	58,379	3,469
						24.7			
	Orange	17.4%	31.2%	2.6%	2.9%	%	5.5%	50,396	8,752
Police De	epartments								
						11.6			
	Los Angeles	24.1%	20.4%	4.5%	2.2%	%	6.4%	712,807	172,018
	-					16.3			
	San Diego	21.1%	23.6%	3.7%	2.7%	%	5.5%	187,231	39,528
	C					16.5	12.3		
	San Francisco	17.8%	33.0%	6.9%	7.6%	%	%	101,614	18,133
						18.1			
	Sacramento	31.5%	27.5%	4.8%	3.5%	%	7.1%	68,012	21,392
						11.0			
	Fresno	10.5%	21.3%	5.4%	2.5%	%	5.7%	51,849	5,429

						24.8			
S	an Jose	31.2%	34.5%	5.3%	4.5%	%	8.3%	44,306	13,832
L	ong Beach	20.5%	18.5%	4.1%	2.0%	9.7%	5.3%	40,524	8,289
						14.0	10.0		
C	Dakland	50.1%	29.1%	9.0%	3.4%	%	%	24,395	12,230

Table A4 summarizes the minimum level of enforcement that officers from each agency levied on the stops they conducted. CHP officers issued at least a warning nearly all of the time (98.5%)—among the highest rates of any agency. They issued at least a citation in 74.4% of all stops—again, among the highest. By contrast, CHP officers' rate of making at least an arrest (either a cite and release or a booking) was the lowest of any agency, at 4.1%, and also booked the lowest share (3.3%) of individuals stopped into jail.

These rates vary widely between agencies. Note that the Los Angeles and Riverside Sheriff's Departments posted similar rates of issuing at least a warning (91.3% and 93.1%, respectively), but ended up with very different rates of issuing at least a citation (67.8% and 7.1%, respectively). Citation rates cluster together somewhat more closely among police departments.

TABLE A4

Minimum Enforcement Level of Stop, by Law Enforcement Agency

		No. of				Bookin
		Stops	Warning	Citation	Arrest	g
Agency:						
	СНР	2,172,023	98.5%	74.4%	4.1%	3.3%
Sheriff De	partments					
	Los Angeles	196,850	91.3%	71.8%	67.8%	11.7%
	San Bernardino	157,715	62.5%	29.3%	15.6%	13.5%
	San Diego	65,029	75.2%	48.5%	13.4%	10.6%
	Sacramento	60,944	66.3%	23.6%	18.0%	15.7%
	Riverside	58,379	93.1%	76.4%	7.1%	4.0%
	Orange	50,396	81.3%	55.7%	11.8%	5.9%
Police Dep	partments					
	Los Angeles	712,807	77.8%	53.3%	11.1%	8.9%
	San Diego	187,231	58.5%	41.8%	18.7%	13.5%
	San Francisco	101,614	81.6%	57.1%	22.4%	9.6%
	Sacramento	68,012	58.3%	32.2%	14.8%	11.3%
	Fresno	51,849	89.2%	73.7%	14.7%	7.8%
	San Jose	44,306	73.0%	49.7%	22.0%	14.1%
	Long Beach	40,524	73.0%	52.3%	12.7%	7.4%
	Oakland	24,395	69.0%	53.5%	28.6%	23.9%

Table A5 captures the minimum level of intrusiveness of the actions that an officer took during a stop. As with the level of enforcement, we present these as a hierarchy—for instance, CHP officers at least ordered the subject to step out of their vehicle 2.7% of the time. This occurred with considerably more frequency among the other agencies—from 8.0% in the Riverside Sheriff's Department, to 54.8% in the Oakland Police Department. Incrementally more intrusive levels of involvement occurred with incrementally less frequency as we move to some physical contact, to being detained. In most agencies, there is then a subsequent discrete drop-off in the frequency of being at least handcuffed (e.g., 45.7% to 28.0% in Sacramento's Sheriff's Department, and from 31.1% to 17.2% in its police department). Similarly, we see a universal drop-off between that and the next two level of intrusiveness: brandishing a weapon to obtain compliance and actually using a weapon.

TABLE A5

Minimum Level of Intrusiveness or Use of Force, by Law Enforcement Agency

			Intrusiveness:									
				Out of				Force/				
		No. of	No	Vehicl		Detaine	Handcuffe	Weapo	Weapo			
		Stops	Action	е	Contact	d	d	n	n Used			
Agency:												
		2,172,02										
	CHP	3	97.3%	2.7%	1.8%	1.7%	1.5%	0.0%	0.0%			
Sheriff De	epartments											
	Los Angeles	196,850	71.7%	28.3%	26.6%	25.5%	8.6%	0.4%	0.1%			
	San Bernardino	157,715	65.3%	34.7%	31.5%	30.5%	15.4%	1.3%	0.1%			
	San Diego	65,029	74.6%	25.4%	23.7%	23.5%	13.7%	0.4%	0.1%			
	Sacramento	60,944	50.8%	49.2%	45.9%	45.7%	28.0%	2.3%	0.2%			
	Riverside	58,379	92.0%	8.0%	7.1%	7.0%	3.8%	0.2%	0.0%			
	Orange	50,396	78.0%	22.0%	19.6%	19.3%	5.6%	0.4%	0.0%			
Police De	partments											
	Los Angeles	712,807	66.8%	33.2%	29.6%	29.5%	17.8%	0.9%	0.1%			
	San Diego	187,231	63.2%	36.8%	35.2%	34.9%	26.8%	0.5%	0.1%			
	San Francisco	101,614	64.6%	35.4%	33.9%	33.2%	14.1%	0.4%	0.1%			
	Sacramento	68,012	64.2%	35.8%	34.6%	31.1%	17.2%	1.7%	0.1%			
	Fresno	51,849	77.6%	22.4%	18.9%	18.7%	7.8%	0.5%	0.0%			
	San Jose	44,306	60.8%	39.2%	31.9%	31.5%	21.7%	1.7%	0.2%			
	Long Beach	40,524	66.3%	33.7%	31.8%	31.4%	10.6%	1.2%	0.1%			
	Oakland	24,395	45.2%	54.8%	51.8%	51.5%	39.7%	2.6%	0.3%			

Table A6 shows one way of examining disproportionality in the racial and ethnic distribution of stops and searches, along with the results of those searches. The italicized numbers show the share of each type of incident. Recall that Black residents composed 6% of California's population in 2019; here we see that they constituted 15.9% of the stops that these agencies made. Furthermore, they were the subject of 28.8% of the searches that the agencies conducted. Compare this with the white residents, who were 36% of the population, but made up 33.1% of the stops, and only 23.9% of the subsequent searches.

These rates must be accounted for when considering each racial/ethnic group's contribution to the resulting discovery of various types of contraband. For instance, Latino subjects accounted for 39% of the incidents in which officers found drugs. But officers' searches of Latinos constituted 42.1% of all searches—a percentage slightly larger than Latinos' representation in the overall population (39%).

TABLE A6

				Middle					
				Eastern	Multi	Native	Pacific		
				/ South	Race/	America	Islande		
	Asian	Black	Latino	Asian	Ethnic	n	r	White	Total
	228,79	635,09	1,552,48		37,01			1,322,20	3,992,07
Number Stops	0	2	5	187,128	5	8,271	21,092	1	4
Shares of Total	5.7%	15.9%	38.9%	4.7%	0.9%	0.2%	0.5%	33.1%	
Searche		130,34							
S	9,709	4	190,167	5,789	4,841	888	2,178	108,248	452,164
	2.1%	28.8%	42.1%	1.3%	1.1%	0.2%	0.5%	23.9%	11.3%
Contraband found:									
Any	2,253	28,152	39,455	1,119	1,155	178	490	24,005	96,807
	2.3%	29.1%	40.8%	1.2%	1.2%	0.2%	0.5%	24.8%	21.4%
Weapon	464	5,737	7,808	250	228	45	117	3,860	18,509
	2.5%	31.0%	42.2%	1.4%	1.2%	0.2%	0.6%	20.9%	4.1%
Propert									
у	380	3,487	4,241	176	145	11	65	2,910	11,415
	3.3%	30.5%	37.2%	1.5%	1.3%	0.1%	0.6%	25.5%	2.5%
Drugs	1,416	17,097	23,597	676	713	121	293	16,580	60,493
-	2.3%	28.3%	39.0%	1.1%	1.2%	0.2%	0.5%	27.4%	13.4%
Other	575	7,554	12,007	282	324	38	139	4,961	25,880
	2.2%	29.2%	46.4%	1.1%	1.3%	0.1%	0.5%	19.2%	5.7%

Table A7 demonstrates another way of presenting disproportionality in searches. These are incidences of searches turning up various types of contraband. The italicized percentages are conditional upon a search having been conducted—as we saw in Table A6, those rates vary considerably between races/ethnicities. The un-italicized percentages are unconditional—they simply show the percentage of all stops of a person of that race/ethnicity that turned up a contraband item.

				Latin	Middle Eastern / South	Multi Race/ Ethni	Native America	Pacific Islande	Whit	
		Asian	Black	0	Asian	С	n	r	е	Total
			20.5							11.3
Search Rate		4.2%	%	12.2%	3.1%	13.1%	10.7%	10.3%	8.2%	%
Yield Rates:										
Unconditional	Any	1.0%	4.4%	2.5%	0.6%	3.1%	2.2%	2.3%	1.8%	2.4%
		23.2	21.6						22.2	21.4
Conditional		%	%	20.7%	19.3%	23.9%	20.0%	22.5%	%	%
	Weapon	0.2%	0.9%	0.5%	0.1%	0.6%	0.5%	0.6%	0.3%	0.5%
		4.8%	4.4%	4.1%	4.3%	4.7%	5.1%	5.4%	3.6%	4.1%
	Propert									
	у	0.2%	0.5%	0.3%	0.1%	0.4%	0.1%	0.3%	0.2%	0.3%
		3.9%	2.7%	2.2%	3.0%	3.0%	1.2%	3.0%	2.7%	2.5%
	Drugs	0.6%	2.7%	1.5%	0.4%	1.9%	1.5%	1.4%	1.3%	1.5%
		14.6	13.1						15.3	13.4
		%	%	12.4%	11.7%	14.7%	13.6%	13.5%	%	%
	Other	0.3%	1.2%	0.8%	0.2%	0.9%	0.5%	0.7%	0.4%	0.6%
		5.9%	5.8%	6.3%	4.9%	6.7%	4.3%	6.4%	4.6%	5.7%

TABLE A7

Search and Yield Rates, by Race/Ethnicity

Table A8 shows the minimum level of enforcement that law enforcement officers levied on people from each racial/ethnic group that they stopped in 2019, by absolute number and share of the total. That is, of those to whom officers issued at least a warning upon being stopped, 5% appeared to be of Middle Eastern/South Asian descent. Among Asian and white subjects, the general trend is that, as the enforcement level increases, a smaller portion of their stops are subjected to that level. That is, 33.1% of those who were at least cited were white, while just 28.4% of those booked were white. However, among Black and Latino subjects, that share tends to increase with the severity of enforcement. Of those issued at least a citation, 13.1% were Black; of those booked into jail, 23% were Black.

TABLE A8

Minimum Enforcement Following a Stop, by Race/Ethnicity

									Booking/Arrest
	Warni	ing	Citatio	n	Arre	st	Booki	ing	S
	Number	Share							
Asian	215,090	6.1%	165,299	6.5%	21,466	4.7%	7,028	2.7%	32.7%
		14.3		13.1		20.0		23.0	
Black	503,703	%	335,597	%	90,562	%	60 <i>,</i> 352	%	66.6%
	1,374,40	39.1	1,027,60	40.2	193,68	42.8	111,15	42.3	
Latino	0	%	5	%	8	%	7	%	57.4%
Middle Eastern/									
South Asian	176,935	5.0%	137,339	5.4%	10,011	2.2%	4,243	1.6%	42.4%
Multiracial	32,017	0.9%	23,320	0.9%	4,657	1.0%	2,718	1.0%	58.4%
Native American	7,381	0.2%	5,135	0.2%	1,214	0.3%	892	0.3%	73.5%
Pacific Islander	18,717	0.5%	13,999	0.5%	2,729	0.6%	1,585	0.6%	58.1%
	1,187,00	33.8		33.1	128,17	28.3		28.4	
White	4	%	845,634	%	4	%	74,536	%	58.2%
	3,515,24	88.1	2,553,92	64.0	452,50	11.3	262,51		
Total	7	%	8	%	1	%	1	6.6%	58.0%

Table A9 describes the minimum level of intrusiveness that officers impose during stops, by race and ethnicity of the subjects. The italicized numbers register the share of all stops experiencing a certain minimum level of intrusiveness that were of persons of a particular race/ethnicity. That is, of all stops in which the officer at least handcuffed the subject, 2.4% appeared to the officer to be Asian, 26.8% Black, 41.2% Latino, 26.2% white, and so forth. As the level of intrusiveness increases, say, to the point of brandishing a weapon, those figures change to 2.2% Asian, 29.1% Black, 43.1% Latino, and 20.5% white.

					Middle Eastern / South	Multi Race/ Ethni	Native America	Pacific Islande		
		Asian	Black	Latino	Asian	С	n	r	White	Total
		17,24	176,48	267,28					169,65	
#	Out of Vehicle	9	2	8	11,468	6,885	1,351	3,347	8	653,728
Share		2.6%	27.0%	40.9%	1.8%	1.1%	0.2%	0.5%	26.0%	16.4%
		15,07	156,85	235,13					154,26	
	Physical Contact	7	8	0	9,915	6,099	1,219	3,042	2	581,602
		2.6%	27.0%	40.4%	1.7%	1.0%	0.2%	0.5%	26.5%	14.6%
		14,58	154,57	231,84					150,98	
	Detained	9	0	7	9,487	6,024	1,217	2,996	3	571,713
		2.6%	27.0%	40.6%	1.7%	1.1%	0.2%	0.5%	26.4%	14.3%
				138,52						
	Handcuffed	8,224	90,296	1	5,111	3,312	803	1,855	88,208	336,330
		2.4%	26.8%	41.2%	1.5%	1.0%	0.2%	0.6%	26.2%	8.4%
	Involves Weapon	370	5,219	7,298	219	192	30	118	3,472	16,918
		2.2%	30.8%	43.1%	1.3%	1.1%	0.2%	0.7%	20.5%	0.4%
	Weapon Used	43	561	747	31	29	3	17	499	1,930
		2.2%	29.1%	38.7%	1.6%	1.5%	0.2%	0.9%	25.9%	0.0%
	Used/Involves	11.6%	10.7%	10.2%	14.2%	15.1%	10.0%	14.4%	14.4%	11.4%

TABLE A9

Minimum Level of Intrusiveness or Use of Force, by Race/Ethnicity

TABLE A10

Post-Stop Outcomes, by Reason for Stop, Statewide CHP and Local Law Enforcement Agencies, and Race/Ethnicity

	A	.II	Police/	'Sheriff	CH	ΗP		
	Black	White	Black	White	Black	White		
			Search	n Rate				
Traffic Violation	11.1%	2.6%	19.5%	6.1%	1.5%	1.2%		
Reasonable Suspicion	43.8%	33.9%	44.0%	34.2%	17.7%	18.7%		
Warrant/Parole/Probation	72.3%	66.4%	72.8%	67.5%	22.3%	26.1%		
		(Conditional	litional Yield Rates				
		Some C	ontraband	or Evidence	e Found			
Traffic Violation	18.6%	21.2%	19.1%	25.1%	11.9%	12.8%		
Reasonable Suspicion	25.5%	24.8%	25.5%	24.9%	26.1%	20.4%		
Warrant/Parole/Probation	21.0%	23.3%	21.0%	23.2%	21.6%	35.5%		
			Enforcem	ent Rates				
			At least a	Warning				
Traffic Violation	86.8%	95.7%	76.7%	88.8%	98.5%	98.6%		
Reasonable Suspicion	59.5%	57.2%	59.2%	56.3%	95.3%	95.8%		
Warrant/Parole/Probation	55.6%	62.2%	55.2%	61.3%	91.6%	97.3%		
			At least a	a Citation				
Traffic Violation	56.7%	68.2%	42.9%	61.8%	72.5%	70.8%		
Reasonable Suspicion	42.0%	38.8%	41.9%	38.5%	47.9%	53.4%		
Warrant/Parole/Probation	51.8%	58.7%	51.4%	57.7%	88.6%	94.6%		
		Arrest (Cite and Re	elease or B	ooking)			
Traffic Violation	7.7%	6.0%	10.4%	13.2%	4.5%	3.1%		
Reasonable Suspicion	32.9%	29.6%	32.8%	29.2%	41.8%	46.9%		
Warrant/Parole/Probation	51.1%	57.4%	50.7%	56.5%	86.1%	90.0%		
			Воо	king				
Traffic Violation	3.5%	2.5%	3.5%	2.5%	3.4%	2.5%		
Reasonable Suspicion	26.0%	22.4%	25.9%	22.1%	30.6%	34.4%		
Warrant/Parole/Probation	46.5%	50.9%	46.3%	50.4%	65.7%	68.8%		
		Int	trusiveness	/Use of For	се			
		At leas	t asked to s	step out of	vehicle			
Traffic Violation	16.0%	5.2%	27.5%	12.4%	2.8%	2.1%		
Reasonable Suspicion	62.5%	57.2%	62.8%	57.9%	23.5%	25.3%		
Warrant/Parole/Probation	72.8%	76.5%	73.4%	77.8%	21.7%	31.0%		
		At le	ast some p	hysical cor	ntact			
Traffic Violation	12.4%	4.0%	21.8%	10.6%	1.7%	1.3%		
Reasonable Suspicion	61.1%	56.1%	61.4%	56.9%	21.5%	22.4%		
Warrant/Parole/Probation	69.5%	74.7%	70.1%	75.9%	21.1%	29.3%		
			At least o	detained				
Traffic Violation	12.1%	3.8%	21.2%	9.9%	1.7%	1.3%		
Reasonable Suspicion	60.7%	55.8%	61.1%	56.5%	21.4%	22.4%		
Warrant/Parole/Probation	69.1%	74.2%	69.6%	75.5%	20.5%	27.8%		
			At least ha	andcuffed				
Traffic Violation	5.3%	1.8%	8.6%	3.5%	1.5%	1.1%		
Reasonable Suspicion	40.6%	35.1%	40.8%	35.4%	19.4%	20.2%		

Warrant/Parole/Probation	52.5%	52.0%	52.9%	52.8%	17.5%	23.4%
		O	fficer weap	on involve	d	
Traffic Violation	0.17%	0.05%	0.26%	0.11%	0.06%	0.03%
Reasonable Suspicion	2.86%	1.54%	2.87%	1.54%	2.36%	1.60%
Warrant/Parole/Probation	3.45%	2.54%	3.44%	2.54%	4.22%	2.44%
			Officer We	apon Used		
Traffic Violation	0.02%	0.01%	0.04%	0.02%	0.01%	0.01%
Reasonable Suspicion	0.29%	0.20%	0.29%	0.20%	0.28%	0.21%
Warrant/Parole/Probation	0.29%	0.26%	0.28%	0.25%	0.60%	0.49%

Race/ethnicit		Warning	Citation	Arrest	Booking
у	All Stops	/ Total	/ Total	/ Total	/ Total
Asian	228,790	94.0%	72.2%	9.4%	3.1%
Black	635,092	79.3%	52.8%	14.3%	9.5%
	1,552,48				
Latino	5	88.5%	66.2%	12.5%	7.2%
ME_SA	187,128	94.6%	73.4%	5.3%	2.3%
Multi	37,015	86.5%	63.0%	12.6%	7.3%
Native	8,271	89.2%	62.1%	14.7%	10.8%
PacIsl	21,092	88.7%	66.4%	12.9%	7.5%
	1,322,20				
White	1	89.8%	64.0%	9.7%	5.6%
	3,992,07				
Total	4	88.1%	64.0%	11.3%	6.6%

 TABLE A11

 Rates of Minimum Enforcement Level of Stop, by Race/Ethnicity

Appendix B. Regression Model Specifications and Results

To examine race/ethnicity/origin group differences in stop outcomes, we examine conditional probabilities of a set of stop outcomes:

- i) Probability that the stop resulted in a search of person or property (i.e. search rate).
- ii) Given the stop involved a search, the probability that the search yielded contraband (i.e. hit or yield rate).
- iii) Probability that the stop resulted in some level of enforcement (i.e. enforcement rate).
- iv) Probability that the stop resulted in some "intrusive" action and/or use of force.

To do so, we estimate various linear probability models of the (conditional) probability of the above stop outcomes, of the following general specification:

Where Y_{ijk} , represent stop outcomes for individual *i*, by law enforcement agency *j* nearest city *k*. *Race_i* is a vector of perceived race/ethnicity/origin indicator variables, with parameter vector $\boldsymbol{\beta}$ to be estimated where the estimates represents the difference in the outcome between individuals of perceived non-white race/ethnicity *j* and whites (i.e. white is the reference group). *Demog_i* is a matrix of perceived personal or demographic traits, such as gender, age, LGBT, limited English proficiency and disabilities (including mental health status). *RFS_{ij}* is a vector of reported reasons for the stop of individual I by law enforcement agency j, *LEA_j* are law enforcement fixed effects and *City_k* are fixed effects of the location of the stop (nearest city).

TABLE **B1**

Search rates, relative to those of omitted categories

	Model:	(1)	(2)	(3)	(4)
Included variables		(-)	(-)	(-)	(· /
Black		0.123***	0.109***	0.073***	0.042***
		(0.001)	(0.001)	(0.000)	(0.016)
Latino		0.041***	0.025***	0.032***	0.019***
		(0.000)	(0.000)	(0.000)	(0.006)
Asian		-0.039***	-0.041***	-0.010***	-0.014***
		(0.000)	(0.000)	(0.000)	(0.002)
Middle Eastern/South Asian		-0.051***	-0.064***	-0.021***	-0.019***
		(0.000)	(0.000)	(0.000)	(0.002)
Native American		0.025***	0.009**	0.016***	0.019***
		(0.003)	(0.004)	(0.003)	(0.004)
Pacific Islander		0.021***	0.012***	0.012***	0.011***
		(0.002)	(0.002)	(0.002)	(0.004)
Multi Race/Ethnicity		0.049***	0.035***	0.029***	0.018***
		(0.002)	(0.002)	(0.002)	(0.005)
Female			-0.069***	-0.049***	-0.049***
			(0.000)	(0.000)	(0.011)
Transgender Man			0.079***	0.043***	-0.002
			(0.009)	(0.008)	(0.009)
Transgender Woman			0.072***	-0.013	-0.045***
			(0.011)	(0.011)	(0.015)
Gender Nonconforming			-0.004	0.007	-0.027
			(0.009)	(0.009)	(0.018)
LGBT			0.065***	-0.001	0.008
			(0.003)	(0.002)	(0.006)
Ages 15-17			0.002	0.092***	0.096***
			(0.005)	(0.005)	(0.011)
Ages 18-24			-0.126***	0.057***	0.070***
			(0.005)	(0.005)	(0.016)
Ages 25-34			-0.118***	0.057***	0.069***
			(0.005)	(0.005)	(0.020)
Ages 35-44			-0.139***	0.036***	0.053**
			(0.005)	(0.005)	(0.025)
Ages 45-54			-0.165***	0.015***	0.034
			(0.005)	(0.005)	(0.027)
Ages 55-64			-0.186***	0.002	0.023
			(0.005)	(0.005)	(0.029)
Ages 65+			-0.206***	-0.002	0.019
			(0.005)	(0.005)	(0.028)
Limited English Proficiency			0.027***	0.016***	0.005
			(0.001)	(0.001)	(0.006)
Disability: Deafness			0.108***	0.021***	-0.010
			(0.008)	(0.007)	(0.011)

Disability: Speech	0.147***	0.028***	0.003
	(0.009)	(0.008)	(0.012)
Disability: Blindness	0.253***	0.060***	0.041**
	(0.017)	(0.016)	(0.020)
Disability: Mental Health	0.395***	0.070***	0.067***
	(0.003)	(0.003)	(0.020)
Disability: Development	0.195***	-0.041***	-0.039***
	(0.012)	(0.012)	(0.011)
Disability: Hyperactivity	-0.088	-0.210***	-0.198**
	(0.071)	(0.066)	(0.087)
Disability: Other	0.194***	0.024***	0.009
	(0.006)	(0.006)	(0.010)
Disability: Multiple	0.191***	-0.027***	-0.032*
	(0.008)	(0.008)	(0.019)
Call for Service		0.106***	0.098***
		(0.001)	(0.010)
Reason for Stop: Reasonable Suspicion		0.311***	0.264***
		(0.001)	(0.022)
RfS: Parole/Probation		0.678***	0.616***
		(0.003)	(0.012)
RfS: Outstanding Warrant		0.527***	0.469***
0		(0.003)	(0.023)
RfS: Consensual Encounter/Search		0.803***	0.728***
		(0.002)	(0.045)
RfS: School/Education Violation		0.183***	0.139***
······································		(0.004)	(0.026)
Los Angeles County Sheriff		(/	0.092***
			(0.021)
Los Angeles PD			0.141***
0			(0.010)
Riverside County Sheriff			0.033***
			(0.007)
San Bernardino County Sheriff			0.129***
			(0.015)
San Diego County Sheriff			0.049***
			(0.011)
San Diego PD			0.025**
			(0.011)
San Francisco PD			0.030*
			(0.018)
Fresno PD			0.008**
			(0.004)
Long Beach PD			0.074***
0			(0.008)
Oakland PD			0.251***
			(0.018)
Orange County Sheriff			0.098***

				(0.015)
Sacramento County Sheriff				0.082***
				(0.012)
Sacramento PD				0.133***
				(0.009)
San Jose PD				0.130***
				(0.009)
Constant	0.082***	0.245***	0.004	-0.040*
	(0.000)	(0.005)	(0.005)	(0.022)
Observations	2 002 074	2 002 072	2 002 072	2 002 070
Observations	5,992,074	5,992,072	5,992,072	3,992,070
R-squared	0.023	0.054	0.278	0.233
Number of City				842

Robust standard errors in parentheses

*** p<0.01, ** p<0.05, * p<0.1

SOURCE: Author regression results using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. NOTES: Omitted dummy variables (in each category) are: white (race/ethnicity); male (gender); 1 -14 (age group); none (disability); traffic violation (reason for stop); and CHP (law enforcement agency).

TABLE B2

Yield rates, relative to those of omitted categories

	Model:	(1)	(2)	(3)	(4)	(5)
Included variables		Yield: Any	Yield: Any	Yield: Any	Yield: Any	Yield: Any
Black		-0.006***	-0.008***	-0.011***	-0.023***	-0.022***
		(0.002)	(0.002)	(0.002)	(0.002)	(0.005)
Latino		-0.014***	-0.018***	-0.018***	-0.019***	-0.014***
		(0.002)	(0.002)	(0.002)	(0.002)	(0.004)
Asian		0.010**	0.013***	0.013***	0.001	-0.011
		(0.004)	(0.004)	(0.004)	(0.004)	(0.007)
Middle Eastern/South Asian		-0.028***	-0.028***	-0.031***	-0.040***	-0.036***
		(0.005)	(0.005)	(0.005)	(0.005)	(0.005)
Native American		-0.021	-0.023*	-0.020	-0.018	-0.010
		(0.013)	(0.013)	(0.014)	(0.013)	(0.014)
Pacific Islander		0.003	0.004	0.002	0.002	-0.010
		(0.009)	(0.009)	(0.009)	(0.009)	(0.011)
Multi Race/Ethnicity		0.017***	0.016***	0.018***	0.009	-0.006
		(0.006)	(0.006)	(0.006)	(0.006)	(0.009)
Female			-0.005***	-0.007***	-0.016***	-0.017***
			(0.002)	(0.002)	(0.002)	(0.003)
Transgender Man			-0.028**	-0.041***	-0.032**	-0.008
			(0.013)	(0.013)	(0.013)	(0.013)
Transgender Woman			0.022	0.007	0.010	0.014
-			(0.018)	(0.018)	(0.017)	(0.012)
Gender Nonconforming			0.002	0.002	0.018	-0.028
C C			(0.018)	(0.018)	(0.017)	(0.029)
LGBT			-0.003	-0.005	-0.005	-0.015*
			(0.006)	(0.006)	(0.006)	(0.009)
Ages 15-17			0.042***	0.042***	0.038***	0.035***
0			(0.008)	(0.008)	(0.008)	(0.008)
Ages 18-24			0.029***	0.039***	0.032***	0.033***
0			(0.008)	(0.008)	(0.007)	(0.008)
Ages 25-34			0.015**	0.026***	0.038***	0.036***
			(0.007)	(0.007)	(0.007)	(0.007)
Ages 35-44			0.022***	0.032***	0.051***	0.045***
			(0.007)	(0.007)	(0.007)	(0.009)
Ages 45-54			0 027***	0 034***	0.056***	0.048***
NBC3 13 3 1			(0.008)	(0.008)	(0.007)	(0.010)
Ages 55-61			0.030***	0.034***	0.052***	0.048***
			(U UUS)	(0 0024 (0 008)	(0 007)	(0 012)
Ages 65+					0.007	0.012)
ABGS 00+			-0.00Z (0.000)	(0 000)	(0 000)	0.020
Limited English Profisions			(U.UU9) 0.001	0.009)	0.009)	(0.015)
Limited English Proficiency			0.001	-0.004		
			(0.003)	(0.003)	(0.003)	(0.006)
Disability: Deatness			0.001	-0.002	0.010	0.008

	(0.017)	(0.017)	(0.017)	(0.021)
Disability: Speech	0.025	0.019	0.018	-0.021
	(0.018)	(0.017)	(0.017)	(0.020)
Disability: Blindness	0.015	0.013	0.012	-0.007
	(0.024)	(0.024)	(0.024)	(0.019)
Disability: Mental Health	-0.095***	-0.103***	-0.067***	-0.072***
	(0.003)	(0.003)	(0.003)	(0.010)
Disability: Development	-0.103***	-0.109***	-0.083***	-0.093***
	(0.014)	(0.014)	(0.014)	(0.012)
Disability: Hyperactivity	0.579***	0.587***	0.299	0.288*
	(0.175)	(0.160)	(0.202)	(0.174)
Disability: Other	0.029***	0.026**	0.024**	0.018**
,	(0.010)	(0.010)	(0.010)	(0.008)
Disability: Multiple	-0.077***	-0.078***	-0.048***	-0.052***
	(0.011)	(0.011)	(0.011)	(0.013)
Call for Service	()	-0.064***	-0.045***	-0.065***
		(0.002)	(0.002)	(0.011)
Reason for Stop: Reasonable Suspicion		0.101***	0.101***	0.075***
		(0.002)	(0.001)	(0.006)
RfS: Parole/Probation		0.014***	0.049***	0.037***
		(0.003)	(0.003)	(0.005)
RfS: Outstanding Warrant		0.039***	0.029***	-0.015
		(0.003)	(0.003)	(0.010)
RfS: Consensual Encounter/Search		-0 028***	0 023***	0.013***
his. consensual encountery search		(0.002)	(0,002)	(0.005)
RfS: School/Education Violation		0.023***	0.033***	0.0000
		(0.006)	(0.005)	(0.008)
Basis for Search: Officer Safety		(0.000)	-0.032***	-0 022***
basis for Scaren. Officer Safety			(0.002)	(0.022
BfS: Search Warrant			0.002)	0.000
bis. scarch warrant			(0,008)	(0 0 28)
RfS: Parole/Probation			0.008)	0.028
			0.042	0.033
RfS: Suspect Weapon			0.002)	0.017
bis. Suspect weapon			0.038	(0.014)
RfS: Vicible Contraband			(0.003)	0.010)
			0.021	(0.017)
RfS: Odor of Contraband			(0.003)	0.019)
bis. Odor of contraband			0.424	0.423 (0.01E)
RfS: Capina Datast			0.004)	0.013)
bis. Califie Detect			0.408	0.499
PfS: Evidence			(0.022)	0.052)
bis. Evidence			(0.005)	0.562 (0.0E1)
RfS: Incident			0.003)	(U.UJ) 0 10/***
נוס. ווונועפוונ			(0.000)	(0.124
RfS. Evigent Circumstances			(0.002) 0 175***	(U.UIZ) 0 10/***
			(0.011)	(0.022)
			(0.011)	(0.023)

BfS: Vehicle Inventory				0.211***	0.215***
				(0.004)	(0.015)
BfS: School Policy				0.538***	0.541***
				(0.029)	(0.060)
Los Angeles County Sheriff					0.170***
					(0.018)
Los Angeles PD					0.131***
					(0.013)
Riverside County Sheriff					0.040
					(0.037)
San Bernardino County Sheriff					0.171***
					(0.027)
San Diego County Sheriff					0.185***
					(0.015)
San Diego PD					0.211***
					(0.010)
San Francisco PD					0.186***
					(0.046)
Fresno PD					0.179***
					(0.015)
Long Beach PD					0.147***
					(0.033)
Oakland PD					0.094***
					(0.032)
Orange County Sheriff					0.254***
					(0.035)
Sacramento County Sheriff					0.042*
					(0.023)
Sacramento PD					0.149***
					(0.023)
San Jose PD					0.315***
					(0.011)
Constant	0.222***	0.206***	0.168***	0.065***	-0.071***
	(0.001)	(0.008)	(0.008)	(0.007)	(0.011)
	450.464	450.465	450.463	454 746	454 700
Upservations	452,164	452,164	452,164	451,/40	451,/39
R-squared	0.000	0.003	0.016	0.115	0.118
Number of City					/36

Robust standard errors in parentheses

*** p<0.01, ** p<0.05, * p<0.1

SOURCE: Author regression results using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. NOTES: Omitted dummy variables (in each category) are: white (race/ethnicity); male (gender); 1 -14 (age group); none (disability); traffic violation (reason for stop); consent given (basis for search) and CHP (law enforcement agency).

TABLE B3

Weapon yield rates, relative to those of omitted categories

	Model:	(6)	(7)	(8)	(9)	(10)
		Yield:	Yield:	Yield:	Yield:	Yield:
Included variables		Weapon	Weapon	Weapon	Weapon	Weapon
		0.008**				
Black		*	0.007***	0.007***	0.005***	0.002
		(0.001) 0.005**	(0.001)	(0.001)	(0.001)	(0.002)
Latino		*	0.004***	0.006***	0.004***	0.004**
		(0.001) 0.012**	(0.001)	(0.001)	(0.001)	(0.002)
Asian		*	0.011***	0.011***	0.007***	0.005
		(0.002) 0.008**	(0.002)	(0.002)	(0.002)	(0.003)
Middle Eastern/South Asian		*	0.006**	0.005*	0.001	0.002
		(0.003)	(0.003)	(0.003)	(0.003)	(0.004)
Native American		0.015**	0.016**	0.016**	0.015**	0.014*
		(0.007) 0.018**	(0.007)	(0.007)	(0.007)	(0.008)
Pacific Islander		*	0.018***	0.017***	0.015***	0.013**
		(0.005) 0.011**	(0.005)	(0.005)	(0.005)	(0.006)
Multi Race/Ethnicity		*	0.011***	0.012***	0.011***	0.009***
		(0.003)	(0.003)	(0.003)	(0.003)	(0.004)
			-			
Female			0.013***	-0.015***	-0.017***	-0.017***
			(0.001)	(0.001)	(0.001)	(0.002)
Transgender Man			0.007	0.005	0.005	0.005
			(0.007)	(0.007)	(0.007)	(0.004)
Iransgender Woman			0.006	0.002	0.001	-0.002
			(0.009)	(0.009)	(0.009)	(0.009)
Gender Nonconforming			-0.006	-0.007	-0.005	-0.010
			(0.008)	(0.008)	(0.008)	(0.009)
LGB1			-0.005*	-0.008****		-0.005***
Ages 15 17			(0.003)	(0.003)	(0.003)	(0.002)
Ages 15-17			0.002 (0.005)	0.004		(0.005)
Agos 19 24			0.011**	(0.003)	(0.005)	(0.005)
Ages 10-24			-0.011	-0.004	(0.001	(0.001
			-	(0.004)	(0.004)	(0.003)
Ages 25-34			0.016***	-0.010**	-0.003	-0.002
			(0.004)	(0.004)	(0.004)	(0.005)
			-	(0.00)	(0.00)	(0.000)
Ages 35-44			0.014***	-0.009**	-0.001	-0.001
			(0.004)	(0.004)	(0.004)	(0.006)

	-				
Ages 45-54	0.015***	-0.011**	-0.003	-0.002	
	(0.004)	(0.004)	(0.004)	(0.006)	
	-				
Ages 55-64	0.013***	-0.010**	-0.003	-0.001	
	(0.005)	(0.005)	(0.004)	(0.006)	
Ages 65+	-0.006	-0.003	0.002	0.004	
	(0.005)	(0.005)	(0.005)	(0.007)	
Limited English Proficiency	-0.001	-0.003**	-0.005***	-0.007***	
	(0.001)	(0.001)	(0.001)	(0.002)	
Disability: Deafness	0.006	0.004	0.006	0.005	
	(0.009)	(0.009)	(0.009)	(0.009)	
Disability: Speech	0.004	-0.001	-0.002	-0.010	
	(0.009)	(0.009)	(0.009)	(0.008)	
Disability: Blindness	0.008	0.004	0.002	-0.001	
	(0.012)	(0.012)	(0.012)	(0.010)	
Disability: Mental Health	0.012***	0.000	0.004**	0.002	
,	(0.002)	(0.002)	(0.002)	(0.003)	
	-	()	(,	()	
Disability: Development	0.019***	-0.025***	-0.023***	-0.023***	
	(0.007)	(0.007)	(0.007)	(0.007)	
Disability: Hyperactivity	0.150	0.151	0.103	0.110	
	(0.177)	(0.174)	(0.158)	(0.097)	
Disability: Other	0.017***	0.013**	0.011**	0.009**	
,	(0.005)	(0.005)	(0.005)	(0.005)	
Disability: Multiple	0.003	-0.005	-0.002	-0.003	
, ,	(0.006)	(0.006)	(0.006)	(0.005)	
Call for Service	()	0.011***	0.013***	0.008***	
		(0.001)	(0.001)	(0.002)	
Reason for Stop: Reasonable Suspicion		0.020***	0.013***	0.007***	
		(0.001)	(0.001)	(0.001)	
RfS: Parole/Probation		0.004***	0.012***	0.010***	
		(0,001)	(0,001)	(0,003)	
RfS: Outstanding Warrant		0.016***	0.006***	-0.003	
		(0,002)	(0,002)	(0.003)	
RfS: Consensual Encounter/Search		-0.008***	0.001	0.000	
		(0.001)	(0,001)	(0,002)	
RfS: School/Education Violation		0.001)	0.005	0.002	
		(0.003)	(0.003)	(0.003)	
Basis for Search: Officer Safety		(0.005)	0.005	0.006***	
basis for Search. Oncer Safety			(0.001)	(0.000	
BfS: Search Warrant			(0.001) 0 163***	0.161***	
			(0.006)	(0.015)	
RfS: Parole/Probation			0.000	0.015	
				(0.003	
RfC. Suspect Weapon			(U.UU1) 0 000***	(0.002) 0.002***	
bis. Suspect weapon					
			(0.002)	(0.013)	
BfS: Visible Contraband				0.061***	0.060***
-------------------------------	-------------------------	---------------------	---------------------	--------------------------------	--------------------------------
BfS: Odor of Contraband				(0.003) 0.020*** (0.002)	(0.004) 0.018*** (0.002)
BfS: Canine Detect				(0.002) 0.029*** (0.009)	(0.002) 0.041** (0.018)
BfS: Evidence				0.054***	0.056***
BfS: Incident				0.023***	0.030***
BfS: Exigent Circumstances				0.154***	0.156***
BfS: Vehicle Inventory				0.063***	0.063***
BfS: School Policy				0.096***	0.101***
Los Angeles County Sheriff				(0.020)	0.019*** (0.006)
Los Angeles PD					0.033*** (0.004)
Riverside County Sheriff					-0.014 (0.013)
San Bernardino County Sheriff					0.041*** (0.011)
San Diego County Sheriff					0.022*** (0.006)
San Diego PD					0.043*** (0.009)
San Francisco PD					0.061*** (0.021)
Fresno PD					0.036*** (0.003)
Long Beach PD					0.037 (0.033)
Oakland PD					0.026*
Orange County Sheriff					0.033***
Sacramento County Sheriff					0.027***
Sacramento PD					0.041***
San Jose PD					0.040***
Constant	0.036** * (0.001)	0.052*** (0.004)	0.036*** (0.004)	0.010** (0.004)	-0.019** (0.008)

Observations	452,164	452,164	452,164	451,740	451,739
R-squared	0.000	0.001	0.005	0.024	0.022
Number of City					736
Debust standard arrars in paranthasas					

*** p<0.01, ** p<0.05, * p<0.1

Property yield rates, relative to those of omitted categories

	Model:	(11)	(12)	(13)	(14)	(15)
		Yield:	Yield:	Yield:	Yield:	Yield:
Included variables		Property	Property	Property	Property	Property
Black		-0.000	0.000	0.000	0.003***	0.002**
		(0.001)	(0.001)	(0.001)	(0.001)	(0.001)
Latino		-0.005***	-0.006***	-0.004***	-0.003***	-0.002
		(0.001)	(0.001)	(0.001)	(0.001)	(0.002)
Asian		0.012***	0.012***	0.012***	0.008***	0.005*
		(0.002)	(0.002)	(0.002)	(0.002)	(0.002)
Middle Eastern/South Asian		0.004	0.004	0.003	0.000	-0.001
		(0.002)	(0.002)	(0.002)	(0.002)	(0.002)
Native American		-0.014***	-0.015***	-0.014***	-0.015***	-0.012**
		(0.004)	(0.004)	(0.004)	(0.004)	(0.006)
Pacific Islander		0.003	0.003	0.002	0.001	-0.002
		(0.004)	(0.004)	(0.004)	(0.004)	(0.005)
Multi Race/Ethnicity		0.003	0.003	0.004	0.004*	0.001
		(0.002)	(0.003)	(0.002)	(0.002)	(0.003)
Female			0.009***	0.008***	0.002**	0.002
			(0.001)	(0.001)	(0.001)	(0.002)
Transgender Man			-0.007	-0.010**	-0.008*	-0.005
			(0.005)	(0.005)	(0.005)	(0.004)
Transgender Woman			0.012	0.008	0.006	0.003
			(0.008)	(0.008)	(0.008)	(0.006)
Gender Nonconforming			0.006	0.005	0.007	-0.005
			(0.008)	(0.007)	(0.007)	(0.013)
LGBT			-0.001	-0.003	-0.005**	-0.006
			(0.002)	(0.002)	(0.002)	(0.004)
Ages 15-17			0.006*	0.007**	0.011***	0.010**
			(0.003)	(0.003)	(0.003)	(0.005)
Ages 18-24			-0.001	0.005	0.007**	0.006
			(0.003)	(0.003)	(0.003)	(0.006)
Ages 25-34			-0.002	0.004	0.006*	0.004
			(0.003)	(0.003)	(0.003)	(0.007)
Ages 35-44			-0.002	0.003	0.004	0.003
			(0.003)	(0.003)	(0.003)	(0.007)
Ages 45-54			-0.001	0.003	0.003	0.001
			(0.003)	(0.003)	(0.003)	(0.009)
Ages 55-64			-0.002	0.001	-0.001	-0.001
			(0.003)	(0.003)	(0.003)	(0.010)
Ages 65+			-0.005	-0.002	-0.006	-0.006
			(0.004)	(0.004)	(0.004)	(0.011)
Limited English Proficiency			0.013***	0.011***	0.008***	0.006
			(0.001)	(0.001)	(0.001)	(0.007)
Disability: Deafness			-0.005	-0.006	-0.004	-0.004

	(0.006)	(0.006)	(0.006)	(0.004)
Disability: Speech	-0.002	-0.006	-0.007	-0.011
	(0.007)	(0.007)	(0.007)	(0.009)
Disability: Blindness	-0 013**	-0 016**	-0 017**	- በ በ19***
bisability: billioness	(0.007)	(0.007)	(0.007)	(0.006)
	(0.007)	(0.007)	(0.007)	-
Disability: Mental Health	-0.017***	-0.025***	-0.018***	0.018***
	(0.001)	(0.001)	(0.001)	(0.001)
Disability: Development	-0.010*	-0.015***	-0.013**	-0.013*
<i>i</i> .	(0.006)	(0.006)	(0.006)	(0.007)
				-
Disability: Hyperactivity	-0.036***	-0.035***	-0.057***	0.057***
	(0.003)	(0.007)	(0.019)	(0.013)
Disability: Other	0.004	0.001	-0.001	-0.002
	(0.004)	(0.004)	(0.004)	(0.005)
				-
Disability: Multiple	-0.016***	-0.021***	-0.015***	0.014***
	(0.003)	(0.003)	(0.003)	(0.004)
Call for Service		-0.004***	-0.003***	-0.008*
		(0.001)	(0.001)	(0.005)
Reason for Stop: Reasonable Suspicion		0.031***	0.028***	0.023***
		(0.001)	(0.001)	(0.004)
RfS: Parole/Probation		0.006***	0.011***	0.010***
		(0.001)	(0.001)	(0.003)
RfS: Outstanding Warrant		0.025***	0.009***	0.001
		(0.001)	(0.001)	(0.004)
RfS: Consensual Encounter/Search		-0.003***	0.004***	0.002
		(0.001)	(0.001)	(0.002)
RfS: School/Education Violation		0.006***	0.004*	-0.001
		(0.002)	(0.002)	(0.004)
		ι <i>γ</i>	. ,	-
Basis for Search: Officer Safety			-0.010***	0.009***
			(0.000)	(0.002)
BfS: Search Warrant			0.187***	0.187***
			(0.006)	(0.045)
BfS: Parole/Probation			0.003***	0.002
			(0.001)	(0.002)
				-
BfS: Suspect Weapon			-0.012***	0.008***
			(0.001)	(0.001)
BfS: Visible Contraband			0.011***	0.011**
			(0.002)	(0.005)
BfS: Odor of Contraband			0.001	0.001
			(0.001)	(0.004)
BfS: Canine Detect			0.096***	0.100***
			(0.013)	(0.014)
BfS: Evidence			0.066***	0.067***

BfS: Incident				(0.003) 0.022*** (0.001)	(0.012) 0.028*** (0.003)
BfS: Exigent Circumstances				0.033***	0.035***
BfS: Vehicle Inventory				(0.005) 0.064*** (0.002)	(0.009) 0.064*** (0.006)
BfS: School Policy				0.008	0.014
Los Angeles County Sheriff				(0.010)	0.010***
Los Angeles PD					0.012***
Riverside County Sheriff					0.029
San Bernardino County Sheriff					0.054***
San Diego County Sheriff					0.017**
San Diego PD					0.017***
San Francisco PD					0.086***
Fresno PD					0.025***
Long Beach PD					0.020*
Oakland PD					-0.007
Orange County Sheriff					0.029***
Sacramento County Sheriff					0.030***
Sacramento PD					0.039***
San Jose PD					(0.004) 0.055*** (0.004)
Constant	0.027*** (0.000)	0.027*** (0.003)	0.008*** (0.003)	-0.004 (0.003)	0.024*** (0.008)
Observations R-squared Number of City	452,164 0.000	452,164 0.002	452,164 0.010	451,740 0.034	451,739 0.034 736

Robust standard errors in parentheses *** p<0.01, ** p<0.05, * p<0.1

Drug yield rates, relative to those of omitted categories

	Model	(16)	(17)	(18)	(19)	(20)
	Wiouci.	Viold.	(17) Vield:	(10) Vield:	Viold:	Viold:
Included variables		Drug	Drug	Drug	Drug	Drug
		2.08	2100	2100	2100	2.00
						-
Black		-0.022***	-0.022***	-0.025***	-0.037***	0.027***
		(0.001)	(0.001)	(0.001)	(0.001)	(0.004)
						-
Latino		-0.029***	-0.028***	-0.033***	-0.032***	0.026***
		(0.001)	(0.001)	(0.001)	(0.001)	(0.003)
Asian		-0.007*	-0.002	-0.001	-0.009***	-0.015**
		(0.004)	(0.004)	(0.004)	(0.004)	(0.007)
_						-
Middle Eastern/South Asian		-0.036***	-0.034***	-0.033***	-0.039***	0.034***
		(0.004)	(0.004)	(0.004)	(0.004)	(0.006)
Native American		-0.017	-0.018	-0.018	-0.014	-0.009
		(0.012)	(0.012)	(0.012)	(0.011)	(0.012)
Pacific Islander		-0.019**	-0.017**	-0.017**	-0.016**	-0.021**
		(0.007)	(0.007)	(0.007)	(0.007)	(0.008)
Multi Race/Ethnicity		-0.006	-0.005	-0.006	-0.014***	-0.020**
		(0.005)	(0.005)	(0.005)	(0.005)	(0.008)
Female			0.001	0.004***	-0.002	-0.004*
			(0.001)	(0.001)	(0.001)	(0.002)
Transgender Man			-0.023**	-0.030***	-0.022**	0.002
			(0.011)	(0.011)	(0.010)	(0.009)
Transgender Woman			0.018	0.014	0.018	0.032***
			(0.015)	(0.015)	(0.015)	(0.012)
Gender Nonconforming			0.005	0.009	0.021	-0.013
			(0.015)	(0.015)	(0.015)	(0.029)
LGBI			-0.002	0.002	0.003	-0.010
			(0.005)	(0.005)	(0.005)	(0.006)
Ages 15-17			0.032***	0.027***	0.023***	0.022***
			(0.005)	(0.005)	(0.005)	(0.007)
Ages 18-24			0.064***	0.057***	0.04/***	0.049***
A 25 24			(0.005)	(0.005)	(0.004)	(0.004)
Ages 25-34			0.064***	0.058***	0.065***	0.063***
A 25 44			(0.005)	(0.005)	(0.004)	(0.005)
Ages 35-44					0.079***	0.073***
			(U.UU5) 0.072***	(U.UU5)	(0.004)	(U.UU/)
Ages 45-54			U.U/3***			
			(0.005)	(U.UU5)	(U.UU5) 0.07C***	(U.UU/)
Ages 55-64						(0.071^{***})
			(U.UU5) 0.020***	(U.UU5) 0.025***	(U.UU5) 0.025***	(U.UU/) 0.024***
Ages 65+			U.U28 ^{***}	0.025***	U.U35 ^{***}	0.034***
			(0.006)	(0.006)	(0.006)	(0.007)

Limited English Proficiency	-0.022*** (0.002)	-0.021*** (0.002)	-0.020*** (0.002)	-0.015*
Disability: Deafness	-0.010	-0.002	-0.000	-0.001
Disubility. Dearless	(0.014)	(0.014)	(0.014)	(0.018)
Disability: Speech	-0.003	0.003	0.004	-0.022*
	(0.014)	(0.014)	(0.013)	(0.013)
Disability: Blindness	-0.003	0.005	0.005	-0.010
	(0.020)	(0.020)	(0.019)	(0.016)
	(0:020)	(0.020)	(0.010)	-
Disability: Mental Health	-0.094***	-0.076***	-0.048***	0.051***
	(0.002)	(0.002)	(0.002)	(0.008)
				-
Disability: Development	-0.087***	-0.077***	-0.057***	0.069***
	(0.010)	(0.010)	(0.010)	(0.009)
Disability: Hyperactivity	0.103	0.111	-0.096	-0.110
	(0.173)	(0.164)	(0.184)	(0.168)
Disability: Other	-0.004	0.001	0.002	-0.001
	(0.008)	(0.008)	(0.008)	(0.009)
				-
Disability: Multiple	-0.074***	-0.057***	-0.033***	0.038***
	(0.007)	(0.007)	(0.007)	(0.008)
		0.000***	0 050***	-
Call for Service		-0.069***	-0.052***	0.062***
		(0.001)	(0.001)	(0.008)
Reason for Stop: Reasonable Suspición		0.032***	0.037***	0.020***
		(0.001)	(0.001)	(0.004)
RTS: Parole/Probation		0.01/***	0.036***	0.028***
		(0.003)	(0.003)	(0.005)
RfS: Outstanding Warrant		0 002	-0 001	- በ በንዩ***
		(0.002)	(0.003)	(0.020
RfS: Consensual Encounter/Search		-0 014***	0.023***	0.013***
		(0,002)	(0.023)	(0.004)
RfS: School/Education Violation		-0.012***	-0.001	-0 015**
		(0.0012)	(0.001)	(0.008)
		(0.00+)	(0.004)	-
Basis for Search: Officer Safety			-0.024***	0.014***
			(0.001)	(0.004)
BfS: Search Warrant			0.308***	0.319***
			(0.008)	(0.050)
BfS: Parole/Probation			0.041***	0.036**
			(0.002)	(0.015)
BfS: Suspect Weapon			-0.010***	0.007*
			(0.002)	(0.004)
BfS: Visible Contraband			0.451***	0.451***
			(0.005)	(0.030)
BfS: Odor of Contraband			0.409***	0.414***
			(0.004)	(0.019)

BfS: Canine Detect BfS: Evidence				0.383*** (0.022) 0.248***	0.395*** (0.031) 0.248***
BfS: Incident				(0.005) 0.061*** (0.002)	(0.044) 0.082*** (0.009)
BfS: Exigent Circumstances				(0.002) 0.046*** (0.007)	(0.060*** (0.009)
BfS: Vehicle Inventory				0.119*** (0.003)	0.122*** (0.012)
BfS: School Policy				0.398*** (0.030)	0.392*** (0.075)
Los Angeles County Sheriff					0.126*** (0.016)
Los Angeles PD					0.072*** (0.012)
Riverside County Sheriff					0.012 (0.026)
San Bernardino County Sheriff					0.125*** (0.021)
San Diego County Sheriff					0.153*** (0.012)
San Diego PD					0.157*** (0.011)
San Francisco PD					0.023
Fresno PD					0.102***
Long Beach PD					0.076*** (0.025)
Oakland PD					-0.011 (0.013)
Orange County Sheriff					0.195***
Sacramento County Sheriff					-0.020
Sacramento PD					0.070***
San Jose PD					(0.017) 0.236*** (0.010)
Constant	0.153*** (0.001)	0.092*** (0.005)	0.100*** (0.005)	0.025*** (0.005)	0.060*** (0.010)
Observations R-squared Number of City	452,164 0.001	452,164 0.005	452,164 0.011	451,740 0.104	451,739 0.107 736

*** p<0.01, ** p<0.05, * p<0.1

SOURCE: Author regression results using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019.

NOTES: Omitted dummy variables (in each category) are: white (race/ethnicity); male (gender); 1 -14 (age group); none (disability); traffic violation (reason for stop); consent given (basis for search) and CHP (law enforcement agency).

Other yield rates, relative to those of omitted categories

	Model:	(21)	(22)	(23)	(24)	(25)
		Yield:	Yield:	Yield:	Yield:	Yield:
Included variables		Other	Other	Other	Other	Other
Black		0.012***	0.009***	0.008***	0.006***	-0.001
		(0.001)	(0.001)	(0.001)	(0.001)	(0.001)
Latino		0.017***	0.012***	0.013***	0.013***	0.012**
		(0.001)	(0.001)	(0.001)	(0.001)	(0.005)
Asian		0.013***	0.012***	0.011***	0.007***	-0.001
		(0.002)	(0.002)	(0.002)	(0.002)	(0.004)
Middle Eastern/South Asian		0.003	0.001	-0.000	-0.004	-0.006**
		(0.003)	(0.003)	(0.003)	(0.003)	(0.003)
Native American		-0.003	-0.004	-0.002	-0.001	0.003
		(0.007)	(0.007)	(0.007)	(0.007)	(0.006)
Pacific Islander		0.018***	0.016***	0.015***	0.015***	0.007
		(0.005)	(0.005)	(0.005)	(0.005)	(0.007)
Multi Race/Ethnicity		0.021***	0.019***	0.020***	0.018***	0.010*
		(0.004)	(0.004)	(0.004)	(0.004)	(0.005)
Female			-0.001	-0.003***	-0.007***	-0.006***
			(0.001)	(0.001)	(0.001)	(0.001)
Transgender Man			-0.015**	-0.021***	-0.019***	-0.019**
			(0.007)	(0.007)	(0.007)	(0.009)
Transgender Woman			-0.004	-0.012	-0.012	-0.019*
			(0.010)	(0.010)	(0.010)	(0.011)
Gender Nonconforming			0.002	0.001	0.004	-0.010
			(0.010)	(0.010)	(0.010)	(0.011)
LGBT			0.002	0.000	0.000	0.001
			(0.004)	(0.004)	(0.004)	(0.005)
Ages 15-17			0.013**	0.014**	0.015***	0.013
			(0.006)	(0.006)	(0.006)	(0.009)
Ages 18-24			-0.007	0.001	0.001	-0.000
			(0.005)	(0.005)	(0.005)	(0.005)
Ages 25-34			-0.019***	-0.012**	-0.008	-0.008*
			(0.005)	(0.005)	(0.005)	(0.005)
Ages 35-44			-0.022***	-0.016***	-0.010**	-0.010**
			(0.005)	(0.005)	(0.005)	(0.005)
Ages 45-54			-0.023***	-0.018***	-0.012**	-0.013***
			(0.005)	(0.005)	(0.005)	(0.005)
Ages 55-64			-0.017***	-0.014***	-0.009*	-0.008
			(0.005)	(0.005)	(0.005)	(0.005)
Ages 65+			-0.017***	-0.013**	-0.010*	-0.009
			(0.006)	(0.006)	(0.006)	(0.008)
Limited English Proficiency			0.018***	0.015***	0.013***	0.009***
			(0.002)	(0.002)	(0.002)	(0.003)
Disability: Deafness			-0.009	-0.011	-0.008	-0.009

	(0.009)	(0.009)	(0.009)	(0.014)
Disability: Speech	0.012	0.008	0.007	-0.004
	(0.011)	(0.011)	(0.011)	(0.011)
Disability: Blindness	0.004	0.001	0.001	-0.005
	(0.013)	(0.013)	(0.014)	(0.013)
Disability: Mental Health	-0.029***	-0.037***	-0.027***	-0.031***
	(0.001)	(0.001)	(0.001)	(0.004)
Disability: Development	-0.021**	-0.026***	-0.020**	-0.020**
	(0.009)	(0.009)	(0.008)	(0.008)
Disability: Hyperactivity	0.522**	0.523**	0.455**	0.447***
	(0.215)	(0.211)	(0.208)	(0.063)
Disability: Other	0.013**	0.010*	0.009	0.005
	(0.006)	(0.006)	(0.006)	(0.005)
Disability: Multiple	-0.015**	-0.019***	-0.011*	-0.012**
<i>,</i> ,	(0.006)	(0.006)	(0.006)	(0.006)
Call for Service	,	-0.023***	-0.017***	-0.025***
		(0.001)	(0.001)	(0.007)
Reason for Stop: Reasonable Suspicion		0.050***	0.050***	0.044***
		(0.001)	(0.001)	(0.007)
RfS: Parole/Probation		0.002*	0.017***	0.016***
		(0.001)	(0.002)	(0.002)
RfS: Outstanding Warrant		0.036***	0.031***	0.020***
		(0.002)	(0.002)	(0.003)
RfS: Consensual Encounter/Search		-0.012***	0.000	0.006***
		(0.001)	(0.001)	(0.002)
RfS: School/Education Violation		0.024***	0.026***	0.031***
		(0.003)	(0.003)	(0.007)
Basis for Search: Officer Safety		(0.000)	-0.009***	-0.010***
			(0.001)	(0.003)
BfS: Search Warrant			0.170***	0.170***
			(0.007)	(0.015)
BfS: Parole/Probation			0.002**	-0.002
			(0,001)	(0.004)
BfS: Suspect Weapon			-0.002	-0.004
			(0,002)	(0, 004)
BfS: Visible Contraband			0.181***	0.176***
			(0,004)	(0.018)
BfS: Odor of Contraband			0.091***	0.085***
			(0,003)	(0.013)
RfS [.] Canine Detect			0.052***	0.063***
			(0.012)	(0.014)
RfS [,] Evidence			0.098***	0.096***
			(0.003)	(0,009)
RfS: Incident			0.019***	0.026***
			(0.001)	(0,006)
BfS: Exigent Circumstances			0.041***	0.044**
			(0.007)	(0.017)
			(0.007)	(0.0±/)

BfS: Vehicle Inventory				0.093***	0.092***
				(0.003)	(0.010)
BfS: School Policy				0.122***	0.128*
				(0.024)	(0.067)
Los Angeles County Sheriff					0.032***
					(0.006)
Los Angeles PD					0.045***
					(0.007)
Riverside County Sheriff					0.021*
					(0.013)
San Bernardino County Sheriff					0.009
					(0.007)
San Diego County Sheriff					0.021***
					(0.006)
San Diego PD					0.038***
					(0.005)
San Francisco PD					0.175***
					(0.067)
Fresno PD					0.043***
					(0.005)
Long Beach PD					0.042***
					(0.014)
Oakland PD					0.026
					(0.025)
Orange County Sheriff					0.032***
					(0.009)
Sacramento County Sheriff					0.041***
					(0.005)
Sacramento PD					0.057***
					(0.005)
San Jose PD					0.076***
					(0.005)
Constant	0.046***	0.066***	0.043***	0.017***	-0.017**
	(0.001)	(0.005)	(0.005)	(0.005)	(0.007)
Observations	452,164	452,164	452,164	451,740	451,739
R-squared	0.001	0.003	0.013	0.040	0.039
Number of City					736

*** p<0.01, ** p<0.05, * p<0.1

Rates of enforcement level: warning, relative to those of omitted categories

	Model:	(6)	(7)	(8)	(9)	(10)
Included variables		Warning	Warning	Warning	Warning	Warning
		-	-	-	-	-
Black		-0.105***	-0.094***	-0.063***	-0.066***	-0.037***
		(0.001)	(0.001)	(0.001)	(0.001)	(0.014)
Latino		-0.012***	-0.006***	-0.012***	-0.013***	-0.011**
		(0.000)	(0.000)	(0.000)	(0.000)	(0.005)
Asian		0.042***	0.041***	0.014***	0.015***	0.013***
		(0.001)	(0.001)	(0.000)	(0.000)	(0.003)
Middle Eastern/South Asian		0.048***	0.051***	0.015***	0.016***	0.007*
		(0.001)	(0.001)	(0.001)	(0.001)	(0.004)
Native American		-0.005	0.027***	0.020***	0.019***	0.018
		(0.003)	(0.004)	(0.003)	(0.003)	(0.012)
Pacific Islander		-0.010***	-0.004*	-0.005***	-0.006***	-0.002
		(0.002)	(0.002)	(0.002)	(0.002)	(0.005)
Multi Race/Ethnicity		-0.033***	-0.023***	-0.019***	-0.021***	-0.010
		(0.002)	(0.002)	(0.002)	(0.002)	(0.008)
Female			0.033***	0.016***	0.018***	0.017***
			(0.000)	(0.000)	(0.000)	(0.006)
Transgender Man			-0.115***	-0.080***	-0.079***	-0.072***
			(0.009)	(0.009)	(0.009)	(0.026)
Transgender Woman			-0.057***	0.018	0.018*	0.014
			(0.011)	(0.011)	(0.011)	(0.038)
Gender Nonconforming			0.001	-0.008	-0.013	0.027
			(0.011)	(0.010)	(0.010)	(0.064)
LGBT			-0.072***	-0.015***	-0.014***	0.011
			(0.003)	(0.002)	(0.002)	(0.013)
Ages 15-17			0.129***	0.047***	0.042***	0.032**
			(0.006)	(0.005)	(0.005)	(0.013)
Ages 18-24			0.261***	0.086***	0.082***	0.067***
			(0.005)	(0.005)	(0.005)	(0.017)
Ages 25-34			0.260***	0.091***	0.088***	0.077***
			(0.005)	(0.005)	(0.005)	(0.020)
Ages 35-44			0.275***	0.106***	0.103***	0.088***
			(0.005)	(0.005)	(0.005)	(0.023)
Ages 45-54			0.284***	0.112***	0.110***	0.093***
			(0.005)	(0.005)	(0.005)	(0.024)
Ages 55-64			0.300***	0.121***	0.120***	0.099***
			(0.005)	(0.005)	(0.005)	(0.026)
Ages 65+			0.314***	0.121***	0.120***	0.097***
			(0.005)	(0.005)	(0.005)	(0.026)
Limited English Proficiency			-0.001	0.009***	0.008***	0.014*

	(0.001)	(0.001)	(0.001)	(0.008)
Disability: Deafness	-0.141***	-0.063***	-0.062***	-0.019***
	(0.009)	(0.008)	(0.008)	(0.007)
Disability: Speech	-0.148***	-0.047***	-0.048***	-0.004
	(0.009)	(0.009)	(0.009)	(0.017)
Disability: Blindness	-0.232***	-0.074***	-0.077***	-0.032
	(0.017)	(0.016)	(0.016)	(0.021)
Disability: Mental Health	-0.536***	-0.270***	-0.258***	-0.249***
	(0.003)	(0.003)	(0.003)	(0.024)
Disability: Development	-0.367***	-0.171***	-0.160***	-0.132***
	(0.013)	(0.012)	(0.012)	(0.019)
Disability: Hyperactivity	0.220***	0.460***	0.446***	0.371***
	(0.054)	(0.060)	(0.061)	(0.051)
Disability: Other	-0.202***	-0.061***	-0.064***	-0.039***
	(0.006)	(0.006)	(0.005)	(0.012)
Disability: Multiple	-0.377***	-0.197***	-0.188***	-0.167***
	(0.009)	(0.008)	(0.008)	(0.043)
Call for Service		-0.012***	-0.006***	-0.007
		(0.001)	(0.001)	(0.016)
Reason for Stop: Reasonable Suspicion		-0.312***	-0.340***	-0.227***
		(0.001)	(0.001)	(0.024)
RfS: Parole/Probation		-0.588***	-0.615***	-0.500***
		(0.003)	(0.003)	(0.032)
RfS: Outstanding Warrant		-0.101***	-0.128***	-0.043**
		(0.002)	(0.002)	(0.017)
RfS: Consensual Encounter/Search		-0.579***	-0.600***	-0.471***
		(0.002)	(0.002)	(0.015)
RfS: School/Education Violation		-0.504***	-0.516***	-0.362***
		(0.004)	(0.004)	(0.020)
Unconditional Hit Rate: Weapon			0.088***	0.103***
			(0.003)	(0.009)
Unconditional Hit Rate: Property			0.170***	0.165***
			(0.003)	(0.012)
Unconditional Hit Rate: Drug			0.148***	0.173***
			(0.002)	(0.043)
Unconditional Hit Rate: Other			0.168***	0.174***
			(0.002)	(0.023)
Los Angeles County Sheriff				-0.040***
				(0.009)
Los Angeles PD				-0.159***
				(0.006)
Riverside County Sheriff				-0.005
				(0.021)
San Bernardino County Sheriff				-0.290***
				(0.036)

San Diego County Sheriff					-0.196***
					(0.024)
San Diego PD					-0.256***
					(0.008)
San Francisco PD					-0.108***
					(0.025)
Fresno PD					-0.042***
					(0.005)
Long Beach PD					-0.176***
					(0.007)
Oakland PD					-0.119***
					(0.017)
Orange County Sheriff					-0.154***
					(0.015)
Sacramento County Sheriff					-0.197***
					(0.019)
Sacramento PD					-0.302***
					(0.013)
San Jose PD					-0.176***
					(0.009)
Constant	0.898***	0.618***	0.843***	0.844***	0.911***
	(0.000)	(0.005)	(0.005)	(0.005)	(0.020)
Observations	3.992.074	3.992.072	3.992.072	3.992.072	3.992.070
R-squared	0.016	0.048	0.195	0.205	0.164
Number of City					842
· · ·					

*** p<0.01, ** p<0.05, * p<0.1

Rates of enforcement level: citation, relative to those of omitted categories

		14 - 1	(())	16.01	10.00	(4 =)
to also de al consta la la c	Model:	(11)	(12)	(13)	(14)	(15) Citation
Included variables		Citation	Citation	Citation	Citation	Citation
Diask		0 1 1 1 * * *	0 105 ***	0 005***	0 000***	0 0 0 0 * * *
ВІАСК		-0.111****	-0.105****	-0.085***	-0.089***	-0.063***
Letine.		(0.001)	(0.001)	(0.001)	(0.001)	(0.021)
Latino		0.022***	0.026***	0.022***	0.020***	0.005
A		(0.001)	(0.001)	(0.001)	(0.001)	(0.009)
Asian		0.083***	0.082***	0.064***	0.064***	0.046***
		(0.001)	(0.001)	(0.001)	(0.001)	(0.006)
Middle Eastern/South Asian		0.094***	0.100***	0.076***	0.077***	0.050***
		(0.001)	(0.001)	(0.001)	(0.001)	(0.004)
Native American		-0.019***	-0.002	-0.008	-0.010*	0.026
		(0.005)	(0.006)	(0.005)	(0.005)	(0.019)
Pacific Islander		0.024***	0.027***	0.025***	0.024***	0.018**
		(0.003)	(0.003)	(0.003)	(0.003)	(0.007)
Multi Race/Ethnicity		-0.010***	-0.005**	-0.003	-0.006**	0.009
		(0.003)	(0.003)	(0.002)	(0.002)	(0.012)
Female			0.051***	0.041***	0.043***	0.040***
			(0.001)	(0.001)	(0.001)	(0.009)
Transgender Man			-0.107***	-0.083***	-0.082***	-0.072**
			(0.009)	(0.010)	(0.010)	(0.034)
Transgender Woman			-0.068***	-0.017	-0.017	-0.015
			(0.012)	(0.012)	(0.012)	(0.038)
Gender Nonconforming			0.025**	0.019*	0.013	0.078
			(0.012)	(0.011)	(0.011)	(0.079)
LGBT			-0.042***	-0.005	-0.004	0.025
			(0.003)	(0.003)	(0.003)	(0.022)
Ages 15-17			0.151***	0.096***	0.089***	0.077***
			(0.005)	(0.005)	(0.005)	(0.013)
Ages 18-24			0.306***	0.187***	0.182***	0.157***
			(0.005)	(0.005)	(0.005)	(0.017)
Ages 25-34			0.273***	0.158***	0.153***	0.134***
			(0.005)	(0.005)	(0.005)	(0.019)
Ages 35-44			0.273***	0.157***	0.154***	0.129***
			(0.005)	(0.005)	(0.005)	(0.022)
Ages 45-54			0.277***	0.160***	0.157***	0.127***
			(0.005)	(0.005)	(0.005)	(0.024)
Ages 55-64			0.298***	0.177***	0.175***	0.138***
			(0.005)	(0.005)	(0.005)	(0.028)
Ages 65+			0.277***	0.147***	0.146***	0.109***
			(0.005)	(0.005)	(0.005)	(0.029)
Limited English Proficiency			-0.015***	-0.008***	-0.010***	0.001
-			(0.001)	(0.001)	(0.001)	(0.010)
Disability: Deafness			-0.188***	-0.136***	-0.135***	-0.077***
			(0.010)	(0.010)	(0.010)	(0.011)

Disability: Speech	-0.170***	-0.100***	-0.102***	-0.047**
	(0.010)	(0.010)	(0.010)	(0.019)
Disability: Blindness	-0.178***	-0.074***	-0.078***	-0.022*
	(0.017)	(0.017)	(0.017)	(0.012)
Disability: Mental Health	-0.389***	-0.209***	-0.193***	-0.194***
	(0.003)	(0.003)	(0.002)	(0.019)
Disability: Development	-0.327***	-0.196***	-0.182***	-0.144***
	(0.012)	(0.011)	(0.011)	(0.017)
Disability: Hyperactivity	-0.057	0.126	0.109	-0.016
	(0.090)	(0.081)	(0.078)	(0.147)
Disability: Other	-0.190***	-0.097***	-0.101***	-0.070***
	(0.006)	(0.006)	(0.006)	(0.009)
Disability: Multiple	-0.239***	-0.117***	-0.104***	-0.103**
<i>,</i> .	(0.008)	(0.008)	(0.007)	(0.049)
Call for Service	. ,	-0.005***	0.001	0.025
		(0.001)	(0.001)	(0.022)
Reason for Stop: Reasonable Suspicion		-0.219***	-0.255***	-0.118***
		(0.001)	(0.001)	(0.019)
RfS: Parole/Probation		-0.367***	-0.405***	-0.243***
		(0.003)	(0.003)	(0.036)
RfS: Outstanding Warrant		0.145***	0.109***	0.234***
		(0.002)	(0.003)	(0.025)
RfS: Consensual Encounter/Search		-0.362***	-0.391***	-0.194***
		(0.002)	(0.002)	(0.017)
RfS: School/Education Violation		-0.380***	-0.396***	-0.181***
		(0.003)	(0.003)	(0.030)
Unconditional Hit Rate: Weapon		()	0.156***	0.178***
			(0.003)	(0.010)
Unconditional Hit Rate: Property			0.235***	0.237***
			(0.004)	(0.024)
Unconditional Hit Rate: Drug			0.210***	0.246***
			(0.002)	(0.064)
Unconditional Hit Rate: Other			0 185***	0 193***
			(0.002)	(0.033)
Los Angeles County Sheriff			(01002)	-0.039
				(0.051)
Los Angeles PD				-0 146***
				(0.007)
Riverside County Sheriff				-0.021
Averside county sherin				(0.021)
San Bernardino County Sheriff				-0 448***
San Semarano County Sherm				(0 038)
San Diego County Sheriff				-0 22***
				(0.062)
San Diego PD				-0.265***
San Dicgo I D				-0.205 (0.012)
San Francisco PD				-0 102***
				-0.100

					(0.024)
Fresno PD					-0.020***
					(0.006)
Long Beach PD					-0.246***
					(0.008)
Oakland PD					-0.182***
					(0.020)
Orange County Sheriff					-0.184***
					(0.067)
Sacramento County Sheriff					-0.443***
					(0.015)
Sacramento PD					-0.344***
					(0.013)
San Jose PD					-0.302***
					(0.012)
Constant	0.640***	0.348***	0.499***	0.500***	0.593***
	(0.000)	(0.005)	(0.005)	(0.005)	(0.018)
Observations	3,992,074	3,992,072	3,992,072	3,992,072	3,992,070
R-squared	0.013	0.024	0.055	0.063	0.056
Number of City					842

*** p<0.01, ** p<0.05, * p<0.1

Rates of enforcement level: arrest, relative to those of omitted categories

	Madal	(10)	(17)	(10)	(10)	(20)
Included variables	wodel:	(10) Arroct	(1/) Arroct	(18) Arroct	(19) Arroct	(ZU) Arrect
		Arrest	Arrest	Arrest	Arrest	Arrest
Plack		0 016***	0 012***	0 015***	0 000***	0.000
DIACK		(0.001)	(0.001)	(0.000)	(0,000)	0.000
Latino		0.001)	(0.001)	(0.000)	(0.000)	(0.002)
Latino		(0.028	(0.024	(0.028	(0.020)	$(0.010^{-0.01})$
Asian		0.000)	(0.000)	(0.000)	(0.000)	(0.001)
Asian		-0.003	-0.004	(0.001)	(0.001)	0.000
Middle Fastern/South Asian		-0.043***	-0.046***	(0.001) _0 019***	-0.016***	(0.004) -0.011***
		(0.001)	(0.001)	(0.01)	(0.010	(0.003)
Native American		0.050***	0.046***	0.050***	0.001)	0.057***
Native American		(0.004)	(0,004)	(0.004)	(0 004)	(0.005)
Pacific Islander		0.032***	0.004)	0.004/	0.004)	0.015***
		(0.002)	(0.002)	(0.002)	(0.002)	(0.003)
Multi Bace/Ethnicity		0.029***	0.024***	0.020***	0.015***	-0.005
		(0,002)	(0.002)	(0.002)	(0.002)	(0.005)
Female		(0.002)	-0.011***	0.001**	0.005***	-0.003**
			(0,000)	(0,000)	(0,000)	(0.002)
Transgender Man			0.006	-0 023***	-0 021***	0.026**
Hunsgehaer Man			(0.008)	(0.007)	(0.007)	(0.012)
Transgender Woman			0 047***	-0 022**	-0 023**	0.010
Hansgehael Wollian			(0,011)	(0.010)	(0,009)	(0.021)
Gender Nonconforming			0.014*	0.022***	0.013*	-0.001
			(0.008)	(0.008)	(0.007)	(0.001)
IGBT			0.100***	0.052***	0.053***	0.029***
2001			(0.003)	(0.003)	(0.003)	(0.004)
Ages 15-17			-0.023***	0.042***	0.030***	0.047***
			(0.004)	(0.004)	(0.004)	(0.010)
Ages 18-24			-0.056***	0.077***	0.068***	0.083***
0			(0.004)	(0.004)	(0.004)	(0.011)
Ages 25-34			-0.044***	0.084***	0.076***	0.092***
5			(0.004)	(0.004)	(0.004)	(0.011)
Ages 35-44			-0.049***	0.079***	0.073***	0.088***
5			(0.004)	(0.004)	(0.004)	(0.011)
Ages 45-54			-0.058***	0.072***	0.068***	0.083***
5			(0.004)	(0.004)	(0.004)	(0.010)
Ages 55-64			-0.063***	0.072***	0.069***	0.082***
-			(0.004)	(0.004)	(0.004)	(0.010)
Ages 65+			-0.079***	0.067***	0.065***	0.075***
-			(0.004)	(0.004)	(0.004)	(0.010)
Limited English Proficiency			0.017***	0.006***	0.005***	0.031***
- •			(0.001)	(0.001)	(0.001)	(0.004)
Disability: Deafness			0.035***	-0.029***	-0.028***	-0.019
-			(0.007)	(0.007)	(0.006)	(0.012)

Disability: Speech	0.144***	0.056***	0.054***	0.008
	(0.009)	(0.009)	(0.009)	(0.011)
Disability: Blindness	0.180***	0.045***	0.039***	0.055***
	(0.016)	(0.015)	(0.015)	(0.017)
Disability: Mental Health	0.080***	-0.155***	-0.133***	-0.113***
	(0.002)	(0.002)	(0.002)	(0.017)
Disability: Development	0.061***	-0.104***	-0.083***	-0.074***
	(0.010)	(0.010)	(0.010)	(0.010)
Disability: Hyperactivity	0.224**	0.136	0.113	-0.104
	(0.091)	(0.086)	(0.079)	(0.183)
Disability: Other	0.133***	0.008	0.002	0.007
	(0.005)	(0.005)	(0.005)	(0.013)
Disability: Multiple	0.014**	-0.141***	-0.122***	-0.109***
	(0.006)	(0.006)	(0.006)	(0.013)
Call for Service		0.105***	0.112***	0.102***
		(0.001)	(0.001)	(0.009)
Reason for Stop: Reasonable Suspicion		0.232***	0.180***	0.174***
		(0.001)	(0.001)	(0.025)
RfS: Parole/Probation		0.186***	0.122***	0.128***
		(0.003)	(0.002)	(0.013)
RfS: Outstanding Warrant		0.697***	0.642***	0.554***
-		(0.002)	(0.003)	(0.034)
RfS: Consensual Encounter/Search		0.188***	0.138***	0.093***
		(0.002)	(0.002)	(0.013)
RfS: School/Education Violation		0.124***	0.098***	0.107***
		(0.003)	(0.003)	(0.017)
Unconditional Hit Rate: Weapon			0.292***	0.293***
			(0.003)	(0.016)
Unconditional Hit Rate: Property			0.300***	0.309***
			(0.004)	(0.024)
Unconditional Hit Rate: Drug			0.409***	0.376***
			(0.002)	(0.052)
Unconditional Hit Rate: Other			0.150***	0.139***
			(0.002)	(0.022)
Los Angeles County Sheriff				0.542***
				(0.057)
Los Angeles PD				0.003
				(0.012)
Riverside County Sheriff				0.008
				(0.013)
San Bernardino County Sheriff				-0.011
				(0.014)
San Diego County Sheriff				-0.006
				(0.007)
San Diego PD				0.017
				(0.012)
San Francisco PD				0.046***

					(0.017)
Fresno PD					0.001
					(0.004)
Long Beach PD					-0.001
					(0.009)
Oakland PD					0.026*
					(0.015)
Orange County Sheriff					0.020**
					(0.008)
Sacramento County Sheriff					-0.020
					(0.013)
Sacramento PD					-0.029***
					(0.008)
San Jose PD					0.042***
					(0.007)
Constant	0.097***	0.152***	-0.019***	-0.017***	-0.048***
	(0.000)	(0.004)	(0.004)	(0.004)	(0.012)
Observations	3,992,074	3,992,072	3,992,072	3,992,072	3,992,070
R-squared	0.005	0.008	0.114	0.162	0.214
Number of City					842

*** p<0.01, ** p<0.05, * p<0.1

Rates of enforcement level: booking, relative to those of omitted categories

	Model:	(21)	(22)	(23)	(24)	(25)
Included variables		Booking	Booking	Booking	Booking	Booking
Black		0.039***	0.033***	0.009***	0.005***	0.008***
		(0.000)	(0.000)	(0.000)	(0.000)	(0.001)
Latino		0.015***	0.008***	0.012***	0.011***	0.010***
		(0.000)	(0.000)	(0.000)	(0.000)	(0.001)
Asian		-0.026***	-0.028***	-0.010***	-0.009***	-0.007***
		(0.000)	(0.000)	(0.000)	(0.000)	(0.001)
Middle Eastern/South Asian		-0.034***	-0.039***	-0.015***	-0.013***	-0.011***
		(0.000)	(0.000)	(0.000)	(0.000)	(0.001)
Native American		0.051***	0.047***	0.051***	0.049***	0.047***
		(0.003)	(0.004)	(0.003)	(0.003)	(0.004)
Pacific Islander		0.019***	0.015***	0.012***	0.011***	0.012***
		(0.002)	(0.002)	(0.002)	(0.002)	(0.002)
Multi Race/Ethnicity		0.017***	0.011***	0.006***	0.003**	0.006***
		(0.001)	(0.001)	(0.001)	(0.001)	(0.002)
Female			-0.023***	-0.013***	-0.009***	-0.011***
			(0.000)	(0.000)	(0.000)	(0.001)
Transgender Man			0.030***	0.007	0.008	0.010
			(0.007)	(0.007)	(0.007)	(0.011)
Transgender Woman			0.057***	-0.003	-0.004	-0.001
			(0.010)	(0.009)	(0.009)	(0.014)
Gender Nonconforming			0.010	0.018***	0.011*	0.022**
			(0.007)	(0.007)	(0.006)	(0.010)
LGBT			0.077***	0.034***	0.035***	0.037***
			(0.002)	(0.002)	(0.002)	(0.003)
Ages 15-17			-0.006*	0.054***	0.045***	0.045***
			(0.004)	(0.004)	(0.004)	(0.010)
Ages 18-24			-0.032***	0.090***	0.084***	0.083***
			(0.003)	(0.003)	(0.003)	(0.011)
Ages 25-34			-0.018***	0.099***	0.093***	0.094***
			(0.003)	(0.003)	(0.003)	(0.011)
Ages 35-44			-0.025***	0.092***	0.088***	0.088***
			(0.003)	(0.003)	(0.003)	(0.010)
Ages 45-54			-0.037***	0.081***	0.079***	0.080***
			(0.003)	(0.003)	(0.003)	(0.010)
Ages 55-64			-0.046***	0.077***	0.075***	0.076***
			(0.003)	(0.003)	(0.003)	(0.010)
Ages 65+			-0.064***	0.070***	0.069***	0.069***
			(0.003)	(0.003)	(0.003)	(0.010)
Limited English Proficiency			0.029***	0.019***	0.018***	0.021***
			(0.001)	(0.001)	(0.001)	(0.003)
Disability: Deafness			0.042***	-0.014***	-0.015***	-0.011
			(0.006)	(0.006)	(0.006)	(0.012)

Disability: Speech	0.076***	-0.003	-0.005	0.001
	(0.007)	(0.007)	(0.007)	(0.009)
Disability: Blindness	0.161***	0.040***	0.037***	0.042***
	(0.015)	(0.014)	(0.014)	(0.011)
Disability: Mental Health	0.108***	-0.109***	-0.094***	-0.090***
	(0.002)	(0.002)	(0.002)	(0.016)
Disability: Development	0.063***	-0.088***	-0.072***	-0.069***
	(0.009)	(0.009)	(0.009)	(0.008)
Disability: Hyperactivity	0.009	-0.081	-0.099**	-0.109***
	(0.058)	(0.056)	(0.046)	(0.028)
Disability: Other	0.112***	-0.001	-0.005	-0.001
	(0.005)	(0.005)	(0.005)	(0.011)
Disability: Multiple	0.032***	-0.112***	-0.098***	-0.094***
	(0.006)	(0.006)	(0.006)	(0.013)
Call for Service		0.133***	0.135***	0.137***
		(0.001)	(0.001)	(0.014)
Reason for Stop: Reasonable Suspicion		0.185***	0.147***	0.158***
		(0.001)	(0.001)	(0.007)
RfS: Parole/Probation		0.191***	0.142***	0.153***
		(0.003)	(0.002)	(0.019)
RfS: Outstanding Warrant		0.644***	0.600***	0.603***
		(0.003)	(0.003)	(0.022)
RfS: Consensual Encounter/Search		0.172***	0.135***	0.135***
		(0.002)	(0.002)	(0.016)
RfS: School/Education Violation		0.121***	0.102***	0.111***
······································		(0.003)	(0.003)	(0.012)
Unconditional Hit Rate: Weapon		()	0.333***	0.334***
			(0.003)	(0.014)
Unconditional Hit Rate: Property			0.319***	0.320***
			(0.004)	(0.026)
Unconditional Hit Rate: Drug			0.298***	0.298***
			(0,002)	(0.037)
Unconditional Hit Rate: Other			0.064***	0.068*
			(0.002)	(0.039)
Los Angeles County Sheriff			(0.002)	0.029**
Los Augeles county sherin				(0.014)
Los Angeles PD				-0 017***
				(0.003)
Riverside County Shariff				-0.016
Averside county sherin				(0.010)
San Bernardino County Sheriff				-0.010
San Bernaramo County Sherm				(0 011)
San Diego County Sheriff				-0 010***
San Diego county Sherm				(0 004)
San Diego PD				(0.004) _0 025***
שמו שוכבט ו ש				(0 00/1)
San Francisco PD				-0.060***
				-0.000

					(0.008)
Fresno PD					-0.050***
					(0.003)
Long Beach PD					-0.042***
					(0.003)
Oakland PD					-0.017**
					(0.008)
Orange County Sheriff					-0.037***
					(0.005)
Sacramento County Sheriff					-0.039***
					(0.008)
Sacramento PD					-0.058***
					(0.005)
San Jose PD					-0.028***
					(0.004)
Constant	0.056***	0.093***	-0.062***	-0.061***	-0.055***
	(0.000)	(0.003)	(0.003)	(0.003)	(0.011)
Observations	3,992,074	3,992,072	3,992,072	3,992,072	3,992,070
R-squared	0.006	0.013	0.155	0.206	0.192
Number of City					842

*** p<0.01, ** p<0.05, * p<0.1

Rates of intrusiveness level: ordered from vehicle, relative to those of omitted categories

	Model:	(5)	(6)	(7)	(8)	(9)
		Out of	Out of	Out of	Out of	Out of
Included variables		Vehicle	Vehicle	Vehicle	Vehicle	Vehicle
Black		0.150***	0.133***	0.083***	0.078***	0.039***
		(0.001)	(0.001)	(0.001)	(0.001)	(0.012)
Latino		0.044***	0.026***	0.035***	0.033***	0.020***
		(0.000)	(0.000)	(0.000)	(0.000)	(0.005)
Asian		-0.053***	-0.056***	-0.017***	-0.016***	-0.024***
		(0.001)	(0.001)	(0.001)	(0.001)	(0.003)
Middle Eastern/South Asian		-0.067***	-0.080***	-0.028***	-0.025***	-0.021***
		(0.001)	(0.001)	(0.001)	(0.001)	(0.002)
Native American		0.035***	0.003	0.014***	0.011***	0.021**
		(0.004)	(0.004)	(0.003)	(0.003)	(0.009)
Pacific Islander		0.030***	0.019***	0.017***	0.016***	0.011***
		(0.003)	(0.002)	(0.002)	(0.002)	(0.003)
Multi Race/Ethnicity		0.058***	0.040***	0.033***	0.028***	0.008
. ,		(0.002)	(0.002)	(0.002)	(0.002)	(0.005)
Female		, , , , , , , , , , , , , , , , , , ,	-0.064***	-0.042***	-0.037***	-0.037***
			(0.000)	(0.000)	(0.000)	(0.005)
Transgender Man			0.070***	0.015*	0.016**	-0.029**
0			(0.009)	(0.008)	(0.008)	(0.013)
Transgender Woman			0.182***	0.056***	0.055***	0.016**
0			(0.012)	(0.011)	(0.011)	(0.008)
Gender Nonconforming			0.069***	0.082***	0.074***	0.026
C C			(0.011)	(0.010)	(0.009)	(0.053)
LGBT			0.107***	0.019***	0.020***	0.020***
			(0.003)	(0.003)	(0.003)	(0.007)
Ages 15-17			-0.031***	0.089***	0.077***	0.086***
C .			(0.006)	(0.005)	(0.005)	(0.013)
Ages 18-24			-0.203***	0.047***	0.038***	0.053**
C			(0.005)	(0.005)	(0.005)	(0.022)
Ages 25-34			-0.193***	0.047***	0.039***	0.052**
C			(0.005)	(0.005)	(0.005)	(0.026)
Ages 35-44			-0.216***	0.024***	0.018***	0.035
C			(0.005)	(0.005)	(0.005)	(0.028)
Ages 45-54			-0.243***	0.002	-0.003	0.018
-			(0.005)	(0.005)	(0.005)	(0.029)
Ages 55-64			-0.268***	-0.015***	-0.018***	0.007
			(0.005)	(0.005)	(0.005)	(0.029)
Ages 65+			-0.299***	-0.024***	-0.026***	-0.001
-			(0.005)	(0.005)	(0.005)	(0.030)
Limited English Proficiency			0.051***	0.031***	0.030***	0.020***
- · · ·			(0.001)	(0.001)	(0.001)	(0.004)
Disability: Deafness			0.165***	0.045***	0.046***	0.004

	(0.009)	(0.009)	(0.008)	(0.008)
Disability: Speech	0.248***	0.084***	0.082***	0.049***
, ,	(0.010)	(0.009)	(0.009)	(0.012)
Disability: Blindness	0 345***	0.099***	0.091***	0.070*
Disability. Dimaness	(0.017)	(0.017)	(0.017)	(0.027)
Disability Mantal Haalth	(0.017)	(0.017)	(0.017)	(0.057)
Disability: Mental Health	0.551	0.114	0.135	0.135***
	(0.003)	(0.003)	(0.003)	(0.023)
Disability: Development	0.334***	0.027**	0.048***	0.045***
	(0.013)	(0.012)	(0.012)	(0.011)
Disability: Hyperactivity	-0.199***	-0.414***	-0.441***	-0.412***
	(0.070)	(0.070)	(0.072)	(0.079)
Disability: Other	0.295***	0.068***	0.062***	0.040***
	(0.006)	(0.006)	(0.006)	(0.013)
Disability: Multiple	0 295***	0.005	0 023***	0.024
	(0.000)	(0.008)	(0.008)	(0.024
Call for Comico	(0.009)	(0.008)	(0.008)	0.023
Call for Service		0.162	(0.001)	0.160***
		(0.001)	(0.001)	(0.009)
Reason for Stop: Reasonable Suspicion		0.455***	0.405***	0.322***
		(0.001)	(0.001)	(0.018)
RfS: Parole/Probation		0.577***	0.515***	0.424***
		(0.003)	(0.003)	(0.043)
RfS: Outstanding Warrant		0.631***	0.579***	0.487***
		(0.003)	(0.003)	(0.024)
RfS: Consensual Encounter/Search		0.413***	0.363***	0.273***
,		(0.002)	(0.002)	(0.032)
RfS: School/Education Violation		0 341***	0 315***	0 241***
		(0, 004)	(0, 004)	(0.018)
Los Angolos County Shariff		(0.004)	(0.004)	0.104***
Los Aligeles County Sherin				(0.040)
				(0.048)
Los Angeles PD				0.18/***
				(0.004)
Riverside County Sheriff				0.046***
				(0.009)
San Bernardino County Sheriff				0.145***
				(0.016)
San Diego County Sheriff				0.099***
с ,				(0.013)
San Diego PD				0 113***
04110106010				(0.010)
San Francisco PD				0.110**
				(0.045)
				(0.045)
				0.086***
				(0.002)
Long Beach PD				0.159***
				(0.005)
Oakland PD				0.178***
				(0.006)

Orange County Sheriff					0.126***
					(0.021)
Sacramento County Sheriff					0.218***
					(0.007)
Sacramento PD					0.126***
					(0.006)
San Jose PD					0.130***
					(0.006)
Unconditional Hit Rate: Weapon				0.269***	0.246***
				(0.003)	(0.012)
Unconditional Hit Rate: Property				0.138***	0.144***
				(0.004)	(0.015)
Unconditional Hit Rate: Drug				0.415***	0.382***
				(0.002)	(0.019)
Unconditional Hit Rate: Other				0.182***	0.160***
				(0.002)	(0.014)
Constant	0.128***	0.365***	0.044***	0.046***	-0.016
	(0.000)	(0.005)	(0.005)	(0.005)	(0.025)
Observations	3,992,074	3,992,072	3,992,072	3,992,072	3,992,070
R-squared	0.025	0.060	0.290	0.322	0.268
Number of City					842

*** p<0.01, ** p<0.05, * p<0.1

Rates of intrusiveness level: physical contact, relative to those of omitted categories

	Model	(10)	(11)	(12)	(13)	(14)
	widdei.	Physical	(±±) Physical	Physical	Physical	(1-7) Physical
Included variables		Contact	Contact	Contact	Contact	Contact
included valuates		contact	contact	contact	contact	contact
Black		0.130***	0.115***	0.065***	0.060***	0.026***
Diddit		(0,001)	(0, 001)	(0.001)	(0.001)	(0,006)
Latino		0.035***	0.020***	0.030***	0.028***	0.016***
20000		(0.000)	(0.000)	(0.000)	(0.000)	(0.004)
Asian		-0.051***	-0.053***	-0.013***	-0.013***	-0.019***
, olan		(0.001)	(0.001)	(0.000)	(0.000)	(0.002)
Middle Fastern/South Asian		-0.064***	-0.074***	-0.022***	-0.019***	-0.016***
		(0.001)	(0.001)	(0.001)	(0.000)	(0.002)
Native American		0.031***	0.002	0.013***	0.011***	0.021***
		(0.004)	(0.004)	(0.003)	(0.003)	(0.007)
Pacific Islander		0.028***	0.018***	0.016***	0.015***	0.010***
		(0.002)	(0.002)	(0.002)	(0.002)	(0.003)
Multi Race/Ethnicity		0.048***	0.033***	0.026***	0.022***	0.003
		(0.002)	(0.002)	(0.002)	(0.002)	(0.005)
Female		(0100_)	-0.058***	-0.036***	-0.032***	-0.032***
			(0.000)	(0.000)	(0.000)	(0.004)
Transgender Man			0.079***	0.022***	0.024***	-0.013
			(0.009)	(0.008)	(0.008)	(0.010)
Transgender Woman			0.185***	0.058***	0.057***	0.024**
			(0.012)	(0.011)	(0.011)	(0.010)
Gender Nonconforming			0.020*	0.034***	0.026***	-0.010
5			(0.011)	(0.009)	(0.009)	(0.043)
LGBT			0.105***	0.015***	0.017***	0.015***
			(0.003)	(0.002)	(0.002)	(0.006)
Ages 15-17			-0.044***	0.077***	0.067***	0.075***
C			(0.006)	(0.005)	(0.005)	(0.013)
Ages 18-24			-0.213***	0.040***	0.032***	0.045**
C			(0.005)	(0.005)	(0.005)	(0.020)
Ages 25-34			-0.197***	0.045***	0.038***	0.049**
-			(0.005)	(0.005)	(0.005)	(0.023)
Ages 35-44			-0.214***	0.029***	0.024***	0.038
-			(0.005)	(0.005)	(0.005)	(0.024)
Ages 45-54			-0.237***	0.010**	0.006	0.024
-			(0.005)	(0.005)	(0.005)	(0.024)
Ages 55-64			-0.260***	-0.005	-0.008	0.014
			(0.005)	(0.005)	(0.005)	(0.025)
Ages 65+			-0.291***	-0.013***	-0.015***	0.006
			(0.005)	(0.005)	(0.005)	(0.025)
Limited English Proficiency			0.040***	0.019***	0.018***	0.011***
_ ,			(0.001)	(0.001)	(0.001)	(0.003)
Disability: Deafness			0.148***	0.027***	0.027***	-0.007

	(0.009)	(0.008)	(0.008)	(0.007)
Disability: Speech	0.230***	0.064***	0.062***	0.037***
<i>i</i> .	(0.010)	(0.009)	(0.009)	(0.013)
Disability: Blindness	0 331***	0 081***	0 075***	0.058*
bisability. billianess	(0.017)	(0.017)	(0.017)	(0.025)
Disability, Montal Health	(0.017)	(U.UI7) 0 100***	(0.017)	0.142***
Disability. Melital Health	(0.002)	0.125	0.145	0.145
	(0.003)	(0.003)	(0.003)	(0.022)
Disability: Development	0.334***	0.024*	0.042***	0.041***
	(0.013)	(0.012)	(0.012)	(0.011)
Disability: Hyperactivity	-0.172**	-0.389***	-0.412***	-0.396***
	(0.071)	(0.071)	(0.072)	(0.080)
Disability: Other	0.267***	0.037***	0.032***	0.014
	(0.006)	(0.006)	(0.006)	(0.012)
Disability: Multiple	0.307***	0.015*	0.031***	0.031
	(0.009)	(0.008)	(0.008)	(0.019)
Call for Service		0.160***	0.167***	0.157***
		(0.001)	(0.001)	(0.008)
Reason for Stop: Reasonable Suspicion		0.464***	0.419***	0.350***
		(0, 001)	(0, 001)	(0.015)
RfS: Parole/Probation		0 571***	0.515***	0/138***
		(0.002)	(0.002)	(0.430
PfC: Outstanding Warrant		(0.005)	(0.005)	(U.U39) 0 F12***
RIS. Outstanding warrant		(0.002)	0.592	(0.022)
		(0.003)	(0.003)	(0.022)
RfS: Consensual Encounter/Search		0.405***	0.360***	0.284***
		(0.002)	(0.002)	(0.029)
RfS: School/Education Violation		0.344***	0.321***	0.262***
		(0.004)	(0.004)	(0.016)
Los Angeles County Sheriff				0.184***
				(0.048)
Los Angeles PD				0.153***
				(0.004)
Riverside County Sheriff				0.040***
				(0.008)
San Bernardino County Sheriff				0.118***
				(0.014)
San Diago County Shoriff				0.014)
San Diego County Sherin				0.004
Can Diago DD				(U.UII)
San Diego PD				0.088
				(0.008)
San Francisco PD				0.108***
				(0.039)
Fresno PD				0.070***
				(0.002)
Long Beach PD				0.140***
				(0.004)
Oakland PD				0.150***
				(0.005)

Orange County Sheriff					0.104***
					(0.017)
Sacramento County Sheriff					0.190***
					(0.007)
Sacramento PD					0.128***
Can loss PD					(U.UUb)
Sall Jose PD					(0.005)
Unconditional Hit Rate: Weapon				0 262***	0.003)
onconditional fit Nate. Weapon				(0.003)	(0.013)
Unconditional Hit Rate: Property				0.164***	0.170***
				(0.004)	(0.013)
Unconditional Hit Rate: Drug				0.362***	0.335***
-				(0.002)	(0.026)
Unconditional Hit Rate: Other				0.162***	0.144***
				(0.002)	(0.012)
Constant	0.117***	0.351***	0.026***	0.028***	-0.024
	(0.000)	(0.005)	(0.005)	(0.005)	(0.022)
Observations	3,992,074	3,992,072	3,992,072	3,992,072	3,992,070
R-squared	0.022	0.058	0.316	0.345	0.288
Number of City					842

*** p<0.01, ** p<0.05, * p<0.1

Rates of intrusiveness level: detained, relative to those of omitted categories

	Model:	(15)	(16)	(17)	(18)	(19)
Included variables		Detained	Detained	Detained	Detained	Detained
Black		0.129***	0.114***	0.064***	0.059***	0.026***
		(0.001)	(0.001)	(0.001)	(0.001)	(0.006)
Latino		0.035***	0.021***	0.030***	0.028***	0.016***
		(0.000)	(0.000)	(0.000)	(0.000)	(0.004)
Asian		-0.050***	-0.052***	-0.013***	-0.012***	-0.019***
		(0.001)	(0.001)	(0.000)	(0.000)	(0.002)
Middle Eastern/South Asian		-0.063***	-0.074***	-0.022***	-0.019***	-0.017***
		(0.001)	(0.001)	(0.000)	(0.000)	(0.002)
Native American		0.033***	0.005	0.016***	0.014***	0.023***
		(0.004)	(0.004)	(0.003)	(0.003)	(0.006)
Pacific Islander		0.028***	0.018***	0.017***	0.015***	0.011***
		(0.002)	(0.002)	(0.002)	(0.002)	(0.003)
Multi Race/Ethnicity		0.049***	0.034***	0.027***	0.023***	0.004
. ,		(0.002)	(0.002)	(0.002)	(0.002)	(0.005)
Female		(,	-0.058***	-0.036***	-0.032***	-0.032***
			(0.000)	(0.000)	(0.000)	(0.004)
Transgender Man			0.081***	0.024***	0.025***	-0.015
			(0.009)	(0.008)	(0.008)	(0.010)
Transgender Woman			0.188***	0.060***	0.059***	0.026***
			(0.012)	(0.011)	(0.011)	(0.008)
Gender Nonconforming			0.015	0.028***	0.021**	-0.014
			(0.011)	(0.009)	(0.009)	(0.042)
LGBT			0.104***	0.015***	0.016***	0.019***
			(0.003)	(0.002)	(0.002)	(0.005)
Ages 15-17			-0.042***	0.079***	0.069***	0.076***
0			(0.006)	(0.005)	(0.005)	(0.013)
Ages 18-24			-0.209***	0.042***	0.035***	0.047**
0			(0.005)	(0.005)	(0.005)	(0.020)
Ages 25-34			-0.194***	0.048***	0.041***	0.051**
5			(0.005)	(0.005)	(0.005)	(0.023)
Ages 35-44			-0.210***	0.032***	0.026***	0.040*
0			(0.005)	(0.005)	(0.005)	(0.024)
Ages 45-54			-0.233***	0.013***	0.009*	0.026
5			(0.005)	(0.005)	(0.005)	(0.024)
Ages 55-64			-0.256***	-0.001	-0.004	0.015
-			(0.005)	(0.005)	(0.005)	(0.025)
Ages 65+			-0.286***	-0.010**	-0.012**	0.008
5			(0.005)	(0.005)	(0.005)	(0.025)
Limited English Proficiencv			0.040***	0.019***	0.018***	0.010***
			(0.001)	(0.001)	(0.001)	(0.003)
Disability: Deafness			0.146***	0.026***	0.026***	-0.008

	(0.009)	(0.008)	(0.008)	(0.007)
Disability: Speech	0.223***	0.058***	0.056***	0.033**
	(0.010)	(0.009)	(0.009)	(0.013)
Disability: Blindness	0.326***	0.078***	0.071***	0.057*
,	(0.017)	(0.017)	(0.008) 0.056*** (0.009) 0.071*** (0.017) 0.143*** (0.003) 0.037*** (0.012) -0.475*** (0.057) 0.030*** (0.006) 0.27*** (0.008) 0.165*** (0.001) 0.418*** (0.001) 0.513*** (0.003) 0.592*** (0.003) 0.348*** (0.002) 0.321*** (0.004)	(0.034)
Disability: Mental Health	0.563***	0.124***	0.143***	0.143***
	(0.003)	(0.003)	(0.003)	(0.022)
Disability: Development	0 327***	0.019	0 037***	0.037***
	(0.013)	(0.012)	(0.012)	(0.011)
Disability: Hyperactivity	-0.226***	(0.012) _0 452***	0.012	(0.011) _0 /52***
	-0.230	-0.452	-0.475	-0.450
Disability, Other	0.005	0.035	0.037	0.012
Disability. Other	(0.000)	0.055	0.030	0.015
	(0.006)	(0.006)	(0.006)	(0.012)
Disability: Multiple	0.301***	0.011	0.027***	0.028
	(0.009)	(0.008)	(0.008)	(0.019)
Call for Service		0.157***	0.165***	0.156***
		(0.001)	(0.001)	(0.008)
Reason for Stop: Reasonable Suspicion		0.464***	0.418***	0.351***
		(0.001)	(0.001)	(0.015)
RfS: Parole/Probation		0.569***	0.513***	0.439***
		(0.003)	(0.003)	(0.039)
RfS: Outstanding Warrant		0.639***	0.592***	0.514***
		(0.003)	(0.003)	(0.022)
RfS: Consensual Encounter/Search		0.392***	0.348***	0.277***
		(0.002)	(0.002)	(0.029)
RfS: School/Education Violation		0.343***	0.321***	0.264***
		(0.004)	(0.004)	(0.015)
Los Angeles County Sheriff				0.178***
				(0.048)
Los Angeles PD				0.154***
-				(0.004)
Riverside County Sheriff				0.038***
,				(0.008)
San Bernardino County Sheriff				0.110***
······································				(0.016)
San Diego County Sheriff				0.082***
				(0.012)
San Diego PD				0.012/
5411 51650 1 5				(0.005)
San Francisco PD				0.000
				(0.102
Fresho PD				0.050
				(0 002)
Long Roach PD				(U.UUZ) 0 125***
LUIS DEALITED				0.122
Oakland PD				(0.004) 0 1/17***
σακιατία ε σ				(0.005)
				(0.005)

Orange County Sheriff					0.099***
					(0.016)
Sacramento County Sheriff					0.187***
					(0.007)
Sacramento PD					0.095***
San Jaco DD					(0.006)
Sall Jose PD					(0.001
Unconditional Hit Rate: Weapon				0 26/***	0.005
				(0.003)	(0.013)
Unconditional Hit Rate: Property				0.162***	0.168***
. ,				(0.004)	(0.013)
Unconditional Hit Rate: Drug				0.358***	0.332***
_				(0.002)	(0.026)
Unconditional Hit Rate: Other				0.161***	0.144***
				(0.002)	(0.012)
Constant	0.114***	0.345***	0.021***	0.023***	-0.026
	(0.000)	(0.005)	(0.005)	(0.005)	(0.022)
Observations	3,992,074	3,992,072	3,992,072	3,992,072	3,992,070
R-squared	0.022	0.058	0.318	0.346	0.290
Number of City					842

*** p<0.01, ** p<0.05, * p<0.1

Rates of intrusiveness level: handcuffed, relative to those of omitted categories

	Model:	(20)	(21)	(22)	(23)	(24)
		Handcuffe	Handcuffe	Handcuffe	Handcuffe	Handcuffe
Included variables		d	d	d	d	d
Black		0.075***	0.065***	0.030***	0.026***	0.015***
		(0.000)	(0.000)	(0.000)	(0.000)	(0.003)
Latino		0.023***	0.013***	0.019***	0.018***	0.014***
		(0.000)	(0.000)	(0.000)	(0.000)	(0.004)
Asian		-0.031***	-0.032***	-0.006***	-0.005***	-0.004**
		(0.000)	(0.000)	(0.000)	(0.000)	(0.002)
Middle Eastern/South Asian		-0.039***	-0.046***	-0.011***	-0.009***	-0.009***
		(0.000)	(0.000)	(0.000)	(0.000)	(0.001)
Native American		0.030***	0.011***	0.019***	0.017***	0.019***
		(0,003)	(0.003)	(0.003)	(0,003)	(0.004)
Pacific Islander		0.021***	0.015***	0.013***	0.011***	0.012***
		(0.002)	(0,002)	(0.002)	(0.002)	(0.002)
Multi Bace/Ethnicity		0.023***	0.013***	0.002/	0.002/	0.007**
Walth Racey Ethnicity		(0.001)	(0.001)	(0.001)	(0.001)	(0.003)
Female		(0.001)	-0.041***	-0.026***	-0.023***	-0 022***
remaie			(0,000)	(0.000)	(0.000)	(0.004)
Transgender Man			0.077***	0.040***	0.0/1***	0.014*
			(0.008)	(0.007)	(0.007)	(0.002)
Transgender Woman			0.118***	0.030***	0.028***	0.011
			(0.011)	(0.010)	(0.020	(0.011)
Gender Nonconforming			-0.007	0.003	-0.003	0.000
Gender Noncomorning			(0,009)	(0.003)	(0.008)	(0.030)
LGBT			0.077***	0.016***	0.017***	0.023***
			(0.003)	(0.002)	(0.002)	(0,004)
Ages 15-17			-0.006	0.078***	0.069***	0.071***
/ ges 15 1/			(0.005)	(0.005)	(0.005)	(0.011)
Δσρς 18-74			-0 117***	0.055***	0.049***	0.054***
7,503 10 24			(0.005)	(0.004)	(0.004)	(0.021)
Δσes 25-34			-0 107***	0.058***	0.053***	0.059***
NGC3 23 34			(0.005)	(0.004)	(0.004)	(0.022)
Ages 35-11			-0 118***	0.047***	0.043***	0.051**
Ages 33 ++			(0.005)	(0.004)	(0.004)	(0.022)
Ages 15-51			-0 136***	0.032***	0.004/	0.038
Ages +5 5+			(0.005)	(0.004)	(0.004)	(0.023)
Ages 55-64			-0 151***	0.023***	0.004/	0.030
Ages 55 04			(0.005)	(0.004)	(0.004)	(0.024)
Agos 65+			(0.003) _0 170***	0.004)	0.004)	(0.024)
7803 031			(0.005)	(0.004)	(0.004)	(0.025)
Limited English Profisionsy			0.000)	0.004)	0.004)	0.023)
Limited English Proficiency			(0.001)	(0.001)	(0.001)	(0.007
Disphility Doctross			(U.UUI) 0.070***	(0.001)	(0.001)	(0.003)
Disability. Deathess			0.079	-0.004	-0.004	-0.019

	(0.007)	(0.007)	(0.006)	(0.009)	
Disability: Speech	0.141***	0.027***	0.026***	0.024**	
	(0.009)	(0.008)	<pre>(0.006) * 0.026*** (0.008) * 0.040*** (0.015) * 0.188*** (0.003) 0.002 (0.011) ** -0.251*** (0.005) * 0.034*** (0.003) * 0.155*** (0.001) * 0.266*** (0.001) * 0.311*** (0.003) * 0.510*** (0.003) * 0.153*** (0.002) * 0.165*** (0.003)</pre>	(0.011)	
Disability: Blindness	0.215***	0.044***	0.040***	0.032	
,	(0.016)	(0.015)	(0.015)	(0.023)	
Disability: Mental Health	0.483***	0.173***	0.188***	0.179***	
	(0,003)	(0.003)	(0.003)	(0.032)	
Disability: Development	0 201***	-0.014	0.002	-0.004	
Disability. Development	(0.012)	-0.014	(0.002	-0.00+	
Dischility of the over etherity	(0.012)	(0.011)	(0.011)	(0.014)	
	-0.101	-0.234	-0.251	-0.231	
	(0.058)	(0.054)	(0.053)	(0.055)	
Disability: Other	0.143***	-0.016***	-0.020***	-0.027**	
	(0.005)	(0.005)	(0.005)	(0.013)	
Disability: Multiple	0.225***	0.021***	0.034***	0.028	
visability: Speech visability: Blindness visability: Mental Health visability: Development visability: Development visability: Hyperactivity visability: Multiple visability: Multiple visability: Multiple visability: Multiple visability: Multiple visability: Probation visability: Consensual Encounter/Search viss: School/Education Violation os Angeles County Sheriff an Bernardino County Sheriff an Diego County Sheriff an Diego PD an Francisco PD vison PD	(0.008)	(0.008)	(0.008)	(0.018)	
Call for Service		0.153***	0.155***	0.162***	
		(0.001)	(0.001)	(0.013)	
Reason for Stop: Reasonable Suspicion		0.302***	0.266***	0.235***	
		(0.001)	(0.001)	(0.013)	
RfS: Parole/Probation		0.357***	0.311***	0.287***	
		(0.003)	(0.003)	(0.025)	
RfS: Outstanding Warrant		0.550***	0.510***	0.495***	
		(0.003)	(0.003)	(0.026)	
RfS: Consensual Encounter/Search		0 188***	0 153***	0 1/18***	
Ris. conscisual encountery scarch		(0.002)	(0.002)	(0.019)	
PfS: School/Education Violation		(0.002)	(0.002)	0 151***	
		(0.002)	0.103	(0.022)	
		(0.003)	(0.003)	(0.022)	
Los Angeles County Sheriff				-0.017*	
				(0.009)	
Los Angeles PD				0.068***	
				(0.006)	
Riverside County Sheriff				0.007	
				(0.004)	
San Bernardino County Sheriff				0.007	
				(0.009)	
San Diego County Sheriff				0.014	
				(0.010)	
San Diego PD				0.080***	
C .				(0.007)	
San Francisco PD				-0.023***	
				(0.004)	
Fresno PD				-0 020**	
				(0 002)	
Long Roach PD				0.005	
				-0.023	
Optional PD				(U.UU4) 0.100***	
				0.100****	
				(0.011)	
Orange County Sheriff					-0.032***
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Sacramento County Sheriff					(0.008) 0.077***
Sacramento County Sherm					(0.011)
Sacramento PD					0.003
					(0.007)
San Jose PD					0.017***
					(0.005)
Unconditional Hit Rate: Weapon				0.316***	0.307***
				(0.003)	(0.009)
Unconditional Hit Rate: Property				0.272***	0.280***
				(0.004)	(0.014)
Unconditional Hit Rate: Drug				0.276***	0.272***
				(0.002)	(0.035)
Unconditional Hit Rate: Other				0.070***	0.067***
				(0.002)	(0.025)
Constant	0.067***	0.199***	-0.021***	-0.021***	-0.036
	(0.000)	(0.005)	(0.004)	(0.004)	(0.023)
Observations	3,992,074	3,992,072	3,992,072	3,992,072	3,992,070
R-squared	0.012	0.047	0.248	0.282	0.241
Number of City					842

Robust standard errors in parentheses

*** p<0.01, ** p<0.05, * p<0.1

SOURCE: Author regression results using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. NOTES: Omitted dummy variables (in each category) are: white (race/ethnicity); male (gender); 1 -14 (age group); none (disability); traffic violation (reason for stop); and CHP (law enforcement agency).

Rates of intrusiveness level: weapon involved, relative to those of omitted categories

	Model:	(25)	(26)	(27)	(28)	(29)
		Involves	Involves	Involves	Involves	Involves
Included variables		Weapon	Weapon	Weapon	Weapon	Weapon
Black		0.006***	0.005***	0.003***	0.002***	0.002***
		(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
Latino		0.002***	0.001***	0.002***	0.001***	0.001***
		(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
Asian		-0.001***	-0.001***	0.001***	0.000***	0.001***
		(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
Middle Eastern/South Asian		-0.001***	-0.002***	0.000**	0.000***	0.001***
		(0.000)	(0.000)	(0.000)	(0.000)	(0.000)
Native American		0.001	0.000	0.001	0.000	0.000
		(0.001)	(0.001)	(0.001)	(0.001)	(0.001)
Pacific Islander		0.003***	0.003***	0.002***	0.002***	0.002***
		(0.001)	(0.001)	(0.001)	(0.001)	(0.001)
Multi Race/Ethnicity		0.003***	0.002***	0.001***	0.001***	0.001
		(0.000)	(0.000)	(0.000)	(0.000)	(0.001)
Female			-0.003***	-0.002***	-0.001***	-0.001***
			(0.000)	(0.000)	(0.000)	(0.000)
Transgender Man			0.006***	0.004*	0.004*	0.003*
			(0.002)	(0.002)	(0.002)	(0.002)
Transgender Woman			0.004	-0.002	-0.002	-0.002
			(0.003)	(0.003)	(0.003)	(0.004)
Gender Nonconforming			0.003	0.004*	0.003	0.001
			(0.002)	(0.002)	(0.002)	(0.004)
LGBT			0.002***	-0.002***	-0.001**	-0.000
			(0.001)	(0.001)	(0.001)	(0.001)
Ages 15-17			0.002	0.007***	0.006***	0.006***
			(0.001)	(0.001)	(0.001)	(0.002)
Ages 18-24			-0.009***	0.002	0.002	0.002
			(0.001)	(0.001)	(0.001)	(0.003)
Ages 25-34			-0.009***	0.001	0.001	0.001
			(0.001)	(0.001)	(0.001)	(0.003)
Ages 35-44			-0.010***	0.000	0.000	0.001
			(0.001)	(0.001)	(0.001)	(0.003)
Ages 45-54			-0.012***	-0.001	-0.001	-0.000
			(0.001)	(0.001)	(0.001)	(0.003)
Ages 55-64			-0.013***	-0.002	-0.001	-0.001
			(0.001)	(0.001)	(0.001)	(0.003)
Ages 65+			-0.013***	-0.001	-0.001	-0.000
			(0.001)	(0.001)	(0.001)	(0.003)
Limited English Proficiency			0.001***	0.000	-0.000	-0.000
			(0.000)	(0.000)	(0.000)	(0.000)
Disability: Deafness			0.004**	-0.001	-0.002	-0.002

	(0.002)	(0.002)	(0.002)	(0.002)
Disability: Speech	0.004**	-0.003*	-0.004**	-0.004**
	(0.002)	(0.002)	(0.002)	(0.002)
Disability: Blindness	0.013***	0.002	0.001	0.001
	(0.004)	(0.004)	(0.004)	(0.005)
Disability: Mental Health	0.013***	-0.007***	-0.006***	-0.005**
	(0.001)	(0.001)	(0.001)	(0.002)
Disability: Development	0.004*	-0 010***	-0.007***	-0.007***
bisability: bevelopment	(0,002)	(0.003)	(0.002)	(0.003)
Disability: Hyperactivity	0.002	0.003	(0.002) _0 026***	-0.025***
	-0.010	-0.022	-0.020	-0.025
Disability: Other	0.001)	0.002	0.003	0.007
Disability. Other	0.009	-0.002	-0.005	-0.005
	(0.001)	(0.001)	(0.001)	(0.001)
Disability: Multiple	0.004**	-0.009***	-0.007***	-0.007***
	(0.002)	(0.002)	(0.002)	(0.002)
Call for Service		0.010***	0.010***	0.008***
		(0.000)	(0.000)	(0.002)
Reason for Stop: Reasonable Suspicion		0.021***	0.015***	0.016***
		(0.000)	(0.000)	(0.002)
RfS: Parole/Probation		0.009***	0.003***	0.003***
		(0.001)	(0.001)	(0.001)
RfS: Outstanding Warrant		0.045***	0.039***	0.039***
		(0.001)	(0.001)	(0.006)
RfS: Consensual Encounter/Search		0.001***	-0.002***	-0.005***
		(0.000)	(0.000)	(0.001)
RfS: School/Education Violation		0.006***	0.004***	0.003
		(0.001)	(0.001)	(0.002)
Los Angeles County Sheriff		()	()	-0.003***
				(0.001)
Los Angeles PD				0.001
				(0, 001)
Riverside County Sheriff				0.001
Riverside County Sherin				(0.001)
San Pernarding County Shoriff				0.001)
San bernardino County Sherin				(0.007
San Diago County Chariff				(0.002)
San Diego County Sherin				-0.002*
				(0.001)
San Diego PD				-0.008***
				(0.001)
San Francisco PD				-0.007***
				(0.001)
Fresno PD				-0.000
				(0.001)
Long Beach PD				0.004***
				(0.001)
Oakland PD				0.005**
				(0.002)

Orange County Sheriff					0.001 (0.001)
Sacramento County Sheriff					0.012***
Sacramento PD					(0.003) 0.008***
San Jose PD					(0.002) 0.004***
				0 005 ***	(0.001)
Unconditional Hit Rate: Weapon				(0.002)	(0.006)
Unconditional Hit Rate: Property				0.074***	0.074***
Unconditional Hit Rate: Drug				(0.003) 0.012*** (0.001)	(0.010) 0.012*** (0.002)
Unconditional Hit Rate: Other				0.020***	0.020***
Constant	0.003*** (0.000)	0.014*** (0.001)	-0.000 (0.001)	(0.001) -0.001 (0.001)	(0.004) -0.001 (0.003)
Observations	3,992,074	3,992,072	3,992,072	3,992,072	3,992,070
R-squared Number of City	0.001	0.002	0.019	0.041	0.038 842

Robust standard errors in parentheses

*** p<0.01, ** p<0.05, * p<0.1

SOURCE: Author regression results using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. NOTES: Omitted dummy variables (in each category) are: white (race/ethnicity); male (gender); 1 -14 (age group); none (disability); traffic violation (reason for stop); and CHP (law enforcement agency).

Rates of intrusiveness level: weapon used, relative to those of omitted categories

	Model:	(30)	(31)	(32)	(33)	(34)
		Weapon	Weapon	Weapon	Weapon	Weapon
Included variables		Used	Used	Used	Used	Used
Black		0.00051***	0.00042***	0.00022***	0.00016***	0.00018***
		(0.00004)	(0.00004)	(0.00004)	(0.00004)	(0.00003)
Latino		0.00010***	0.00004*	0.00009***	0.00006**	0.00006**
		(0.00002)	(0.00003)	(0.00003)	(0.00003)	(0.00003)
		-	-			
Asian		0.00019***	0.00019***	-0.00004	-0.00004	-0.00002
		(0.00003)	(0.00003)	(0.00003)	(0.00003)	(0.00003)
		-	-			
Middle Eastern/South Asian		0.00021***	0.00027***	-0.00007**	-0.00006*	-0.00004
		(0.00003)	(0.00004)	(0.00003)	(0.00003)	(0.00004)
Native American		-0.00001	-0.00017	-0.00010	-0.00014	-0.00011
		(0.00021)	(0.00023)	(0.00023)	(0.00023)	(0.00020)
Pacific Islander		0.00043**	0.00038*	0.00036*	0.00033*	0.00032
		(0.00020)	(0.00020)	(0.00020)	(0.00019)	(0.00025)
Multi Race/Ethnicity		0.00041***	0.00033**	0.00029**	0.00025*	0.00024
		(0.00015)	(0.00015)	(0.00015)	(0.00015)	(0.00015)
			-		-	-
Female			0.00043***	-0.00035***	0.00031***	0.00032***
			(0.00002)	(0.00002)	(0.00002)	(0.00004)
Transgender Man			0.00110	0.00091	0.00089	0.00089
			(0.00088)	(0.00088)	(0.00088)	(0.00117)
Transgender Woman			-0.00035	-0.00091	-0.00091	-0.00089
			(0.00079)	(0.00079)	(0.00079)	(0.00076)
Gender Nonconforming			0.00038	0.00046	0.00043	0.00018
			(0.00091)	(0.00091)	(0.00091)	(0.00094)
LGBT			0.00035	-0.00005	-0.00002	-0.00001
			(0.00022)	(0.00022)	(0.00022)	(0.00020)
Ages 15-17			0.00054**	0.00109***	0.00102***	0.00103***
			(0.00025)	(0.00025)	(0.00025)	(0.00021)
Ages 18-24			0.00046**	0.00154***	0.00154***	0.00157***
			(0.00023)	(0.00023)	(0.00023)	(0.00034)
Ages 25-34			0.00066***	0.00170***	0.00171***	0.00174***
			(0.00022)	(0.00023)	(0.00023)	(0.00034)
Ages 35-44			0.00057**	0.00161***	0.00162***	0.00166***
			(0.00023)	(0.00023)	(0.00023)	(0.00032)
Ages 45-54			0.00041*	0.00146***	0.00150***	0.00153***
			(0.00023)	(0.00023)	(0.00023)	(0.00030)
Ages 55-64			0.00027	0.00136***	0.00140***	0.00144***
			(0.00023)	(0.00023)	(0.00023)	(0.00030)
Ages 65+			0.00020	0.00138***	0.00142***	0.00146***
			(0.00023)	(0.00023)	(0.00023)	(0.00030)

Limited English Proficiency	0.00011*	-0.00000	-0.00002	-0.00002
	(0.00006)	(0.00006)	(0.00006)	(0.00006)
Disability: Deafness	0.00032	-0.00019	-0.00022	-0.00024
	(0.00054)	(0.00054)	(0.00055)	(0.00060)
Disability: Speech	0.00086	0.00011	0.00009	0.00005
	(0.00077)	(0.00077)	(0.00077)	(0.00082)
Disability: Blindness	0.00194	0.00086	0.00082	0.00085
	(0.00171)	(0.00171)	(0.00171)	(0.00209)
Disability: Mental Health	0.00544***	0.00328***	0.00336***	0.00337***
	(0.00045)	(0.00046)	(0.00046)	(0.00047)
Disability: Development	0.00154	0.00012	0.00029	0.00026
	(0.00116)	(0.00115)	(0.00116)	(0.00097)
Disability: Hyperactivity	-0.00030*	-0.00110***	- 0.00151***	- 0.00134***
	(0.00016)	(0.00026)	(0.00048)	(0.00049)
Disability: Other	0.00102**	0.00001	-0.00006	-0.00005
	(0.00049)	(0.00049)	(0.00049)	(0.00049)
Disability: Multiple	0.00150*	0.00008	0.00020	0.00017
, .	(0.00082)	(0.00081)	(0.00081)	(0.00072)
Call for Service	. ,	0.00189***	0.00180***	0.00179***
		(0.00015)	(0.00015)	(0.00022)
Reason for Stop: Reasonable Suspicion		0.00158***	0.00118***	0.00113***
		(0.00007)	(0.00007)	(0.00008)
RfS: Parole/Probation		0.00071***	0.00029	0.00026
		(0.00020)	(0.00020)	(0.00018)
RfS: Outstanding Warrant		0.00362***	0.00316***	0.00311***
		(0.00039)	(0.00038)	(0.00049)
RfS: Consensual Encounter/Search		0.00019	-0.00009	-0.00012
		(0.00014)	(0.00014)	(0.00021)
RfS: School/Education Violation		0.00053*	0.00036	0.00023
		(0.00029)	(0.00029)	(0.00035)
Los Angeles County Sheriff				0.00039
				(0.00034)
Los Angeles PD				0.00002
				(0.00007)
Riverside County Sheriff				-0.00001
				(0.00023)
San Bernardino County Sheriff				0.00007
				(0.00017)
San Diego County Sheriff				0.00023
				(0.00021)
San Diego PD				0.00019***
				(0.00007)
				-
San Francisco PD				0.00031***
				(0.00010)

Fresno PD					0.00028***
Long Beach PD					(0.00004) 0.00049***
Oskland PD					(0.00015)
Oakianu PD					0.00009
Orango County Shariff					0.00018)
Grange County Sherin					-0.00020
Sacramento County Sheriff					0.00012)
Sucramento county sherin					(0.00016)
					-
Sacramento PD					0.00043***
					(0.00011)
San Jose PD					0.00102***
					(0.00008)
Unconditional Hit Rate: Weapon				0.00939***	0.00936***
				(0.00072)	(0.00093)
Unconditional Hit Rate: Property				0.00338***	0.00339***
				(0.00072)	(0.00106)
Unconditional Hit Rate: Drug				0.00088***	0.00086**
				(0.00021)	(0.00036)
Unconditional Hit Rate: Other				0.00110***	0.00114**
				(0.00027)	(0.00057)
Constant	0 00038***	-0 00002	-0 00139***	- 0 00143***	- 0.00150***
constant	(0.00002)	(0.00022)	(0.00023)	(0.00023)	(0.00034)
	(0.00002)	(0.00022)	(0.00020)	(0.00020)	(0.0000.)
Observations	3,992,074	3,992,072	3,992,072	3,992,072	3,992,070
R-squared	0.00008	0.00066	0.00203	0.00330	0.00302
Number of City					842

Robust standard errors in parentheses

*** p<0.01, ** p<0.05, * p<0.1

SOURCE: Author regression results using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. NOTES: Omitted dummy variables (in each category) are: white (race/ethnicity); male (gender); 1 -14 (age group); none (disability); traffic violation (reason for stop); and CHP (law enforcement agency).

Search rates, relative to those of omitted categories, resulting from traffic stops by law enforcement agency type

	Tr	affic – Local I	.aw Enforcem	ent		Traffi	c - CHP	
	(1)	(2)	(3)	(4)	(1)	(2)	(3)	(4)
VARIABLES	Search	Search	Search	Search	Search	Search	Search	Search
Black	0.134***	0.115***	0.115***	0.095***	0.003***	0.002***	0.002***	0.002***
	(0.001)	(0.001)	(0.001)	(0.024)	(0.000)	(0.000)	(0.000)	(0.001)
Latino	0.069***	0.047***	0.047***	0.037***	0.007***	0.004***	0.004***	0.005***
	(0.001)	(0.001)	(0.001)	(0.012)	(0.000)	(0.000)	(0.000)	(0.001)
Asian	-0.033***	-0.032***	-0.032***	-0.038***	-0.004***	-0.005***	-0.005***	-0.005***
	(0.001)	(0.001)	(0.001)	(0.005)	(0.000)	(0.000)	(0.000)	(0.001)
Middle								
Eastern/South								
Asian	-0.033***	-0.049***	-0.049***	-0.047***	-0.006***	-0.008***	-0.008***	-0.007***
	(0.001)	(0.001)	(0.001)	(0.004)	(0.000)	(0.000)	(0.000)	(0.001)
Native								
American	0.009	0.005	0.006	0.011	0.020***	0.020***	0.019***	0.018***
	(0.006)	(0.009)	(0.009)	(0.013)	(0.002)	(0.002)	(0.002)	(0.003)
Pacific Islander	0.017***	0.009**	0.008**	0.007	0.005***	0.004***	0.004***	0.003**
	(0.003)	(0.003)	(0.003)	(0.009)	(0.001)	(0.001)	(0.001)	(0.001)
Multi								
Race/Ethnicity	0.059***	0.039***	0.039***	0.033***	0.005***	0.002**	0.002**	0.003***
	(0.003)	(0.003)	(0.003)	(0.011)	(0.001)	(0.001)	(0.001)	(0.001)
Female		-0.097***	-0.096***	-0.091***		-0.006***	-0.006***	-0.007***
		(0.000)	(0.000)	(0.016)		(0.000)	(0.000)	(0.000)
Transgender								
Man		0.039***	0.039***	0.030*		0.017	0.019	0.019**
		(0.011)	(0.011)	(0.016)		(0.018)	(0.018)	(0.008)
Transgender								
Woman		0.001	0.001	-0.008		0.110	0.112	0.111**
		(0.015)	(0.015)	(0.024)		(0.073)	(0.073)	(0.054)
Gender								
Nonconformin								
g		-0.005	-0.006	-0.025				
		(0.012)	(0.012)	(0.026)				
LGBT		-0.012***	-0.013***	-0.010		0.033***	0.032***	0.031***
		(0.004)	(0.004)	(0.018)		(0.003)	(0.003)	(0.004)
Ages 15-17		0.103***	0.103***	0.106***		-0.004	0.005	0.005
		(0.008)	(0.008)	(0.027)		(0.007)	(0.007)	(0.007)
Ages 18-24		0.019***	0.020***	0.024***		-0.004	0.006	0.006
		(0.007)	(0.007)	(0.008)		(0.007)	(0.007)	(0.007)
Ages 25-34		0.013*	0.014**	0.017		-0.003	0.007	0.008
		(0.007)	(0.007)	(0.013)		(0.007)	(0.007)	(0.007)
Ages 35-44		-0.015**	-0.014**	-0.008		-0.008	0.002	0.003
		(0.007)	(0.007)	(0.020)		(0.007)	(0.007)	(0.007)
Ages 45-54		-0.047***	-0.046***	-0.038		-0.012*	-0.002	-0.001
		(0.007)	(0.007)	(0.024)		(0.007)	(0.007)	(0.007)
Ages 55-64		-0.071***	-0.070***	-0.060**		-0.013**	-0.003	-0.002

	(0.007)	(0.007)	(0.026)		(0.007)	(0.007)	(0.007)
Ages 65+	-0.086***	-0.085***	-0.072***		-0.015**	-0.005	-0.004
	(0.007)	(0.007)	(0.024)		(0.007)	(0.007)	(0.007)
Limited English							
Proficiency	0.009***	0.008***	-0.003		0.014***	0.013***	0.014***
	(0.001)	(0.001)	(0.005)		(0.001)	(0.001)	(0.003)
Disability:							
Deafness	0.029***	0.028***	0.023***		0.021**	0.019**	0.018*
	(0.009)	(0.009)	(0.007)		(0.010)	(0.010)	(0.010)
Disability:							
Speech	0.039***	0.037***	0.031		-0.009	-0.008	-0.009
	(0.010)	(0.010)	(0.024)		(0.006)	(0.006)	(0.006)
Disability:							
Blindness	0.142***	0.140***	0.126***		0.065*	0.059*	0.054
	(0.026)	(0.026)	(0.041)		(0.037)	(0.036)	(0.035)
Disability:							
Mental Health	0.173***	0.160***	0.159***		0.190***	0.151***	0.149***
	(0.014)	(0.013)	(0.037)		(0.022)	(0.022)	(0.025)
Disability:							
Development	0.082***	0.080***	0.073***		0.070***	0.056**	0.054**
	(0.025)	(0.025)	(0.028)		(0.023)	(0.022)	(0.023)
Disability:					. ,		. ,
Hyperactivity	0.105***	0.102***	0.096***		0.066***	0.053***	0.050***
	(0.009)	(0.009)	(0.009)		(0.010)	(0.010)	(0.010)
Disability:					. ,		. ,
Other	-0.028*	-0.029**	0.002		0.075***	0.060***	0.057**
	(0.015)	(0.015)	(0.030)		(0.023)	(0.023)	(0.024)
Call for Service	· · · ·	0.095***	0.091***		, , , , , , , , , , , , , , , , , , ,	0.167***	0.166***
		(0.004)	(0.015)			(0.004)	(0.018)
Los Angeles		, , , , , , , , , , , , , , , , , , ,	, ,			, , ,	, , , , , , , , , , , , , , , , , , ,
County Sheriff			0.006				
,			(0.019)				
Riverside			()				
County Sheriff			0.050				
,			(0.048)				
San Bernardino			(,				
County Sheriff			0.196***				
			(0.043)				
San Diego			(0.0.00)				
County Sheriff			-0.173***				
			(0.052)				
San Diego PD			-0.143***				
5411 516861 5			(0.049)				
San Francisco			(0.0.0)				
PD			-0.067				
			(0.043)				
Fresno PD			0.892***				
			(0.065)				
Long Beach PD			-0 033*				
			(0.033				
			(0.010)	1			

Oakland PD				0.145**				
				(0.060)				
Orange County Sheriff				0.063				
Sacramento				(0.042)				
County Sheriff				0.292***				
				(0.045)				
Sacramento PD				0.326***				
San Jose PD				(0.045) 0 575***				
5411 3050 1 D				(0.024)				
Constant	0.061***	0.113***	0.111***	0.051***	0.012***	0.022***	0.011	0.010
	(0.000)	(0.007)	(0.007)	(0.015)	(0.000)	(0.007)	(0.007)	(0.007)
Observations	1,233,346	1,233,346	1,233,346	1,233,346	2,161,046	2,161,046	2,161,046	2,161,046
R-squared	0.029	0.060	0.061	0.048	0.001	0.004	0.014	0.014
Number of City				518				531
Robust								
standard errors								
in parentheses								
*** p<0.01, **								
p<0.05, * p<0.1								

SOURCE: Author regression results using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. NOTES: Omitted dummy variables (in each category) are: white (race/ethnicity); male (gender); 1 -14 (age group); none (disability); and LAPD (local law enforcement agency).

Yield rates, relative to those of omitted categories, resulting from traffic stops by local law enforcement

		Traffic –	Local Law En	forcement	
	(1)	(2)	(3)	(4)	(5)
VARIABLES	Yield	Yield	Yield	Yield	Yield
Black	-				
Didek	0.060***	-0.059***	-0.058***	-0.070***	-0.054***
	(0.004)	(0.004)	(0.004)	(0.003)	(0.005)
Latino	-				
	0.060***	-0.057***	-0.057***	-0.054***	-0.038***
	(0.003)	(0.004)	(0.004)	(0.003)	(0.005)
Asian	-0.006	-0.004	-0.004	-0.009	-0.028***
	(0.010)	(0.010)	(0.010)	(0.009)	(0.007)
Middle Eastern/South Asian	- 0 000***	0 0 2 7 * *	0 0 2 7 * *	0 0 0 0 * * *	0 000***
	(0.011)	-0.027	-0.027	-0.038	-0.032
Nativo Amorican	(0.011)	(0.011)	(0.011)	(0.011)	(0.011)
Native American	-0.008	-0.009	-0.009	-0.017	-0.020
Dacific Islandor	(0.037)	(0.037)	(0.037)	(0.035)	(0.030)
	-0.017	-0.014	-0.014	-0.008	-0.027
	(0.020)	(0.020)	(0.020)	(0.018)	(0.021)
Multi Race/Ethnicity	-0.026**	-0.023**	-0.023**	-0.035***	-0.034**
Ferreda	(0.011)	(0.011)	(0.011)	(0.010)	(0.015)
Female		0.021***	0.021***	0.006*	-0.002
		(0.004)	(0.004)	(0.003)	(0.004)
Transgender Man		-0.062**	-0.062**	-0.021	0.015
		(0.027)	(0.027)	(0.026)	(0.020)
Iransgender Woman		-0.018	-0.018	-0.002	0.022
		(0.044)	(0.044)	(0.041)	(0.036)
Gender Nonconforming		-0.025	-0.025	-0.002	-0.030
		(0.030)	(0.030)	(0.028)	(0.034)
LGBI		0.025	0.024	0.010	-0.008
		(0.016)	(0.016)	(0.015)	(0.016)
Ages 15-17		0.021	0.021	0.014	0.007
		(0.025)	(0.025)	(0.023)	(0.022)
Ages 18-24		0.010	0.010	-0.003	-0.009
		(0.024)	(0.024)	(0.022)	(0.019)
Ages 25-34		-0.012	-0.012	0.001	-0.006
		(0.024)	(0.024)	(0.022)	(0.018)
Ages 35-44		-0.007	-0.007	0.015	0.006
		(0.024)	(0.024)	(0.022)	(0.018)
Ages 45-54		0.001	0.001	0.025	0.014
		(0.024)	(0.024)	(0.022)	(0.018)
Ages 55-64		0.013	0.012	0.028	0.018
		(0.024)	(0.024)	(0.023)	(0.018)
Ages 65+		-0.023	-0.024	-0.012	-0.018
		(0.028)	(0.028)	(0.026)	(0.019)

Limited English Proficiency	-0.025***	-0.025***	-0.026***	-0.024***
	(0.005)	(0.005)	(0.005)	(0.004)
Disability: Deafness	-0.002	-0.002	0.014	0.027
	(0.031)	(0.031)	(0.028)	(0.026)
Disability: Speech	-0.008	-0.009	-0.014	-0.056**
	(0.032)	(0.032)	(0.030)	(0.027)
Disability: Blindness	-0.022	-0.022	-0.020	-0.026
	(0.048)	(0.048)	(0.046)	(0.038)
Disability: Mental Health	-0.049**	-0.052**	-0.047**	-0.052*
	(0.021)	(0.021)	(0.021)	(0.027)
Disability: Development	-0.140***	-0.141***	-0.084**	-0.111***
	(0.036)	(0.036)	(0.035)	(0.019)
Disability: Hyperactivity	0.013	0.012	0.007	0.010
	(0.021)	(0.021)	(0.021)	(0.021)
Disability: Other	0.009	0.009	0.040	0.040
	(0.049)	(0.049)	(0.048)	(0.049)
Call for Service		0.012	-0.018**	-0.030**
		(0.008)	(0.008)	(0.013)
Basis for Search: Officer Safety			-0.006**	-0.005
			(0.003)	(0.005)
BfS: Search Warrant			0.197***	0.188***
			(0.036)	(0.041)
BfS: Parole/Probation			0.026***	0.014
			(0.002)	(0.009)
BfS: Suspect Weapon			0.096***	0.105***
			(0.005)	(0.011)
BfS: Visible Contraband			0.607***	0.600***
			(0.007)	(0.016)
BfS: Odor of Contraband			0.427***	0.420***
			(0.005)	(0.019)
BfS: Canine Detect			0.469***	0.445***
			(0.034)	(0.048)
BfS: Evidence			0.437***	0.420***
			(0.009)	(0.059)
BfS: Incident			0.195***	0.189***
			(0.004)	(0.015)
BfS: Exigent Circumstances			0.191***	0.194***
			(0.029)	(0.039)
BfS: Vehicle Inventory			0.151***	0.143***
			(0.005)	(0.018)
BfS: School Policy			0.919***	0.920***
			(0.007)	(0.015)
Los Angeles County Sheriff				0.035
				(0.043)
Riverside County Sheriff				0.118
				(0.174)
San Bernardino County Sheriff				0.141

					(0.153)
San Diego County Sheriff					0.170
					(0.186)
San Diego PD					0.236
					(0.189)
Fresno PD					-0.391***
					(0.041)
Long Beach PD					-0.130*
					(0.071)
Orange County Sheriff					0.084
					(0.191)
Sacramento County Sheriff					-0.098***
					(0.002)
Constant	0.251***	0.251***	0.251***	0.137***	0.117***
	(0.003)	(0.024)	(0.024)	(0.022)	(0.033)
Observations	140,806	140,806	140,806	140,796	140,796
R-squared	0.003	0.004	0.004	0.159	0.155
Number of City					384
Robust standard errors in					
parentheses					

*** p<0.01, ** p<0.05, * p<0.1

SOURCE: Author regression results using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. NOTES: Omitted dummy variables (in each category) are: white (race/ethnicity); male (gender); 1 -14 (age group); none (disability); consent given (basis for search); and LAPD (local law enforcement agency).

Yield rates, relative to those of omitted categories, resulting from traffic stops by CHP

	Traffic- CHP				
	(1)	(2)	(3)	(4)	(5)
VARIABLES	Yield	Yield	Yield	Yield	Yield
Black	-0.010	-0.012*	-0.013**	-0.018***	-0.006
	(0.007)	(0.007)	(0.007)	(0.006)	(0.007)
Latino	-0.037***	-0.041***	-0.042***	-0.028***	-0.015***
	(0.004)	(0.004)	(0.004)	(0.004)	(0.004)
Asian	-0.054***	-0.056***	-0.057***	-0.043***	-0.030***
	(0.009)	(0.009)	(0.009)	(0.007)	(0.008)
Middle Eastern/South Asian	-0.040***	-0.044***	-0.045***	-0.041***	-0.021***
	(0.011)	(0.011)	(0.011)	(0.009)	(0.008)
Native American	0.013	0.012	0.013	0.022	0.005
	(0.028)	(0.028)	(0.028)	(0.026)	(0.029)
Pacific Islander	-0.025	-0.025	-0.026	-0.002	0.010
	(0.022)	(0.022)	(0.022)	(0.020)	(0.020)
Multi Race/Ethnicity	0.023	0.026	0.027	0.004	0.007
	(0.022)	(0.023)	(0.023)	(0.019)	(0.022)
Female		-0.026***	-0.026***	-0.019***	-0.019***
		(0.004)	(0.004)	(0.004)	(0.004)
Transgender Man		-0.051	-0.052	-0.026	0.015
		(0.092)	(0.092)	(0.070)	(0.088)
Transgender Woman		-0.144***	-0.148***	-0.096***	-0.092*
		(0.027)	(0.027)	(0.023)	(0.051)
LGBT		-0.022	-0.021	-0.004	0.002
		(0.015)	(0.015)	(0.014)	(0.014)
Ages 15-17		0.153	0.155	0.127	0.108
		(0.096)	(0.096)	(0.120)	(0.107)
Ages 18-24		0.020	0.022	0.057	0.045
		(0.092)	(0.092)	(0.117)	(0.109)
Ages 25-34		0.014	0.016	0.062	0.050
		(0.092)	(0.092)	(0.117)	(0.108)
Ages 35-44		0.024	0.026	0.073	0.060
		(0.092)	(0.092)	(0.117)	(0.108)
Ages 45-54		0.013	0.015	0.064	0.050
		(0.092)	(0.092)	(0.117)	(0.109)
Ages 55-64		0.004	0.006	0.056	0.040
		(0.092)	(0.092)	(0.117)	(0.109)
Ages 65+		-0.039	-0.036	0.024	0.003
		(0.092)	(0.092)	(0.118)	(0.109)
Limited English Proficiency		-0.011*	-0.010	-0.010*	-0.014**
		(0.006)	(0.006)	(0.006)	(0.006)
Disability: Deafness		-0.033	-0.032	-0.022	-0.030
		(0.075)	(0.074)	(0.064)	(0.060)
Disability: Speech		-0.134***	-0.136***	-0.093***	-0.106***

		(0.006)	(0.006)	(0.006)	(0.006)
Disability: Blindness		0.164	0.168	0.194	0.191
		(0.218)	(0.223)	(0.218)	(0.225)
Disability: Mental Health		-0.039	-0.032	-0.016	-0.018
		(0.031)	(0.031)	(0.026)	(0.022)
Disability: Development		-0.014	-0.010	-0.008	-0.015
		(0.072)	(0.073)	(0.077)	(0.079)
Disability: Hyperactivity		-0.011	-0.008	-0.017	-0.028
		(0.040)	(0.040)	(0.033)	(0.036)
Disability: Other		0.050	0.053	-0.018	-0.008
		(0.095)	(0.094)	(0.067)	(0.062)
Call for Service			-0.024***	-0.002	-0.010
			(0.006)	(0.006)	(0.007)
Basis for Search: Officer Safety				-0.056**	-0.058**
				(0.025)	(0.029)
BfS: Search Warrant				-0.068	-0.034
				(0.058)	(0.058)
BfS: Parole/Probation				-0.010	-0.009
				(0.049)	(0.048)
BfS: Suspect Weapon				0.174***	0.169***
				(0.042)	(0.046)
BfS: Visible Contraband				0.698***	0.690***
				(0.039)	(0.039)
BfS: Odor of Contraband				0.671***	0.645***
				(0.032)	(0.035)
BfS: Canine Detect				0.440***	0.439***
				(0.040)	(0.045)
BfS: Evidence				0.687***	0.676***
				(0.031)	(0.036)
BfS: Incident				-0.051**	-0.039
				(0.024)	(0.029)
BfS: Exigent Circumstances				0.220***	0.226***
				(0.068)	(0.077)
BfS: Vehicle Inventory				0.130***	0.134***
				(0.027)	(0.032)
Constant	0.128***	0.121	0.121	0.080	0.074
	(0.003)	(0.092)	(0.092)	(0.120)	(0.111)
Observations	30,666	30,666	30,666	30,666	30,666
R-squared	0.004	0.007	0.008	0.210	0.190
Number of City					445

Robust standard errors in

parentheses *** p<0.01, ** p<0.05, * p<0.1 SOURCE: Author regression results using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. NOTES: Omitted dummy variables (in each category) are: white (race/ethnicity); male (gender); 1 -14 (age group); none (disability); consent given (basis for search).

Booking rates, relative to those of omitted categories, resulting from traffic stops by local law enforcement

	Traffic - Loca	Law Enforce	ement		
	(21)	(22)	(23)	(24)	(25)
VARIABLES	Booking	Booking	Booking	Booking	Booking
Black	0.010***	0.008***	0.008***	0.001**	0.002*
	(0.000)	(0.000)	(0.000)	(0.000)	(0.001)
Latino	0.011***	0.007***	0.007***	0.005***	0.004***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.001)
Asian	-0.015***	-0.015***	-0.015***	-0.012***	-0.011***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.001)
Middle Eastern/South Asian	-0.016***	-0.019***	-0.019***	-0.014***	-0.012***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.001)
Native American	0.006	0.007	0.008	0.007	0.006
	(0.004)	(0.006)	(0.006)	(0.005)	(0.006)
Pacific Islander	0.004*	0.002	0.002	0.001	0.001
	(0.002)	(0.002)	(0.002)	(0.002)	(0.002)
Multi Race/Ethnicity	0.010***	0.007***	0.007***	0.003**	0.000
	(0.002)	(0.002)	(0.002)	(0.001)	(0.002)
Female		-0.018***	-0.018***	-0.011***	-0.011***
		(0.000)	(0.000)	(0.000)	(0.001)
Transgender Man		-0.015***	-0.015***	-0.014***	-0.007
		(0.006)	(0.006)	(0.005)	(0.005)
Transgender Woman		0.002	0.002	-0.001	0.004
		(0.009)	(0.009)	(0.009)	(0.008)
Gender Nonconforming		0.004	0.003	0.003	0.002
		(0.007)	(0.007)	(0.007)	(0.014)
LGBT		0.013***	0.013***	0.012***	0.010***
		(0.002)	(0.002)	(0.002)	(0.004)
Ages 15-17		0.005	0.005	-0.005	-0.003
		(0.004)	(0.004)	(0.004)	(0.004)
Ages 18-24		-0.002	-0.000	-0.003	-0.002
		(0.003)	(0.003)	(0.003)	(0.003)
Ages 25-34		0.008**	0.010***	0.009***	0.010***
		(0.003)	(0.003)	(0.003)	(0.004)
Ages 35-44		0.008**	0.009***	0.010***	0.011***
		(0.003)	(0.003)	(0.003)	(0.003)
Ages 45-54		0.002	0.003	0.006*	0.007**
		(0.003)	(0.003)	(0.003)	(0.003)
Ages 55-64		-0.004	-0.003	0.002	0.003
		(0.003)	(0.003)	(0.003)	(0.003)
Ages 65+		-0.014***	-0.012***	-0.006*	-0.004
		(0.003)	(0.003)	(0.003)	(0.003)
Limited English Proficiency		0.013***	0.011***	0.012***	0.016***
		(0.001)	(0.001)	(0.001)	(0.003)
Disability: Deafness		0.003	0.002	-0.002	-0.002

	(0.005)	(0.005)	(0.005)	(0.008)
Disability: Speech	0.015**	0.013**	0.011*	0.009
	(0.006)	(0.006)	(0.006)	(0.006)
Disability: Blindness	0.086***	0.082***	0.074***	0.071***
	(0.020)	(0.020)	(0.019)	(0.016)
Disability: Mental Health	0.097***	0.078***	0.070***	0.071***
,	(0.010)	(0.010)	(0.010)	(0.023)
Disability: Development	-0.001	-0.004	-0.003	-0.005
, ,	(0.011)	(0.011)	(0.010)	(0.009)
Disability: Other	0.050***	0.045***	0.035***	0.036***
,	(0.006)	(0.006)	(0.006)	(0.008)
Disability: Multiple	-0.018**	-0.019**	-0.015*	-0.008
	(0,009)	(0.009)	(0.008)	(0.012)
Call for Service	(0.000)	0.138***	0.127***	0.127***
		(0.004)	(0.003)	(0.010)
Unconditional Hit Rate: Weapon		(0.001)	0 377***	0 375***
enconational interacte. Weapon			(0.007)	(0.019)
Unconditional Hit Rate:			(0.007)	(0.013)
Property			0.404***	0.405***
			(0.010)	(0.049)
Unconditional Hit Rate: Drug			0.299***	0.292***
			(0.003)	(0.057)
Unconditional Hit Rate: Other			0 138***	0 140***
			(0.005)	(0 039)
Los Angeles County Sheriff			(0.005)	0.066**
				(0.026)
Riverside County Sheriff				0.020
inverside councy sherin				(0.032)
San Bernardino County Sheriff				0.052
San Bernaramo county Sherm				(0.000
San Diego County Sheriff				0.055
San Diego county Sherin				(0.000
San Diego PD				0.031)
San Diego i D				(0.077
San Francisco PD				(0.031)
San Trancisco FD				-0.014 /0.012)
Fresno PD				0.012)
				(0.027)
Long Beach PD				0.027
				(0.010
Oakland PD				0.023)
				(0.019
Orango County Shariff				(0.025)
Grange County Sherin				(0.032)
Sacramonto County Shariff				(0.030)
Sacramento County Sherin				U.U83*** (0.022)
Corramenta DD				(U.U33)
Sacramento PD				0.064*

					(0.034)
San Jose PD					0.160***
					(0.049)
Constant	0.025***	0.028***	0.025***	0.015***	-0.048***
	(0.000)	(0.003)	(0.003)	(0.003)	(0.014)
Observations	1 222 246	1 222 246	1 222 246	1 777 746	1 222 246
Observations	1,233,340	1,233,340	1,233,340	1,233,340	1,233,340
R-squared	0.002	0.007	0.013	0.137	0.135
Number of City					518

Robust standard errors in parentheses

*** p<0.01, ** p<0.05, * p<0.1

SOURCE: Author regression results using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. NOTES: Omitted dummy variables (in each category) are: white (race/ethnicity); male (gender); 1 -14 (age group); none (disability); and LAPD (local law enforcement agency).

Booking rates, relative to those of omitted categories, resulting from traffic stops by CHP

	Traffic -	CHP Only			
	(21)	(22)	(23)	(24)	(25)
VARIABLES	Booking	Booking	Booking	Booking	Booking
Black	0.009***	0.007***	0.007***	0.007***	0.005***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.001)
Latino	0.014***	0.009***	0.010***	0.010***	0.010***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.001)
Asian	-0.007***	-0.010***	-0.009***	-0.008***	-0.008***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.001)
Viddle Eastern/South Asian	-0.013***	-0.017***	-0.017***	-0.015***	-0.014***
	(0.000)	(0.000)	(0.000)	(0.000)	(0.001)
Native American	0.048***	0.048***	0.047***	0.044***	0.045***
	(0.004)	(0.004)	(0.004)	(0.004)	(0.005)
Pacific Islander	0.010***	0.008***	0.009***	0.009***	0.008***
	(0.002)	(0.002)	(0.002)	(0.002)	(0.002)
Multi Race/Ethnicity	0.005***	0.000	0.000	-0.000	0.001
	(0.001)	(0.001)	(0.001)	(0.001)	(0.002)
emale		-0.010***	-0.010***	-0.009***	-0.010***
		(0.000)	(0.000)	(0.000)	(0.001)
ransgender Man		0.035	0.037	0.039	0.042**
		(0.024)	(0.024)	(0.024)	(0.016)
ransgender Woman		0.189**	0.193**	0.197**	0.194***
-		(0.090)	(0.090)	(0.090)	(0.062)
GBT		0.057***	0.055***	0.053***	0.052***
		(0.003)	(0.003)	(0.003)	(0.007)
Ages 15-17		-0.040***	-0.024**	-0.027**	-0.027
-		(0.012)	(0.012)	(0.012)	(0.020)
Ages 18-24		-0.030***	-0.013	-0.014	-0.014
-		(0.011)	(0.012)	(0.012)	(0.020)
Ages 25-34		-0.029**	-0.011	-0.012	-0.011
-		(0.011)	(0.012)	(0.012)	(0.020)
Ages 35-44		-0.040***	-0.022*	-0.023*	-0.021
-		(0.011)	(0.012)	(0.012)	(0.020)
Ages 45-54		-0.047***	-0.030**	-0.030**	-0.027
-		(0.011)	(0.012)	(0.012)	(0.020)
Ages 55-64		-0.049***	-0.032***	-0.032***	-0.028
-		(0.011)	(0.012)	(0.012)	(0.020)
Ages 65+		-0.054***	-0.036***	-0.036***	-0.032
-		(0.011)	(0.012)	(0.012)	(0.020)
imited English Proficiency		0.020***	0.018***	0.017***	0.020***
		(0.001)	(0.001)	(0.001)	(0.005)
Disability: Deafness		0.025**	0.021*	0.022*	0.020*
		(0 012)	(0 012)	(0 012)	(0.011)
Jisahility: Speech		-0.012**	-0 017*	-0 027**	-0 027**

		(0.009)	(0.009)	(0.011)	(0.013)
Disability: Blindness		0.110**	0.100**	0.087*	0.084
		(0.047)	(0.046)	(0.046)	(0.052)
Disability: Mental Health		0.154***	0.087***	0.074***	0.068**
		(0.021)	(0.022)	(0.022)	(0.028)
Disability: Development		0.047**	0.022	0.019	0.017
		(0.022)	(0.022)	(0.021)	(0.020)
Disability: Other		0.106***	0.084***	0.069***	0.065***
		(0.012)	(0.012)	(0.012)	(0.013)
Disability: Multiple		0.066***	0.040*	0.034	0.030
		(0.023)	(0.025)	(0.025)	(0.029)
Call for Service			0.290***	0.278***	0.277***
			(0.004)	(0.004)	(0.024)
Unconditional Hit Rate: Weapon				0.418***	0.415***
				(0.019)	(0.021)
Unconditional Hit Rate: Property				0.311***	0.310***
				(0.026)	(0.030)
Unconditional Hit Rate: Drug				0.535***	0.531***
				(0.008)	(0.015)
Unconditional Hit Rate: Other				0.445***	0.442***
				(0.015)	(0.028)
Constant	0.025***	0.067***	0.048***	0.047***	0.045**
	(0.000)	(0.011)	(0.012)	(0.012)	(0.020)
Observations	2,161,046	2,161,046	2,161,046	2,161,046	2,161,046
R-squared	0.003	0.007	0.021	0.051	0.051
Number of City					531
Robust standard errors in					
parentheses					
*** p<0.01, ** p<0.05, * p<0.1					

SOURCE: Author regression results using California Department of Justice, Racial and Identity Profiling Act (RIPA) Wave 2 data, 2019. NOTES: Omitted dummy variables (in each category) are: white (race/ethnicity); male (gender); 1 -14 (age group); none (disability).

Appendix C. Veil of Darkness Regression Results

Table C1

Testing the Veil of Darkness (VOD) theory, OLS Regression results, share of people of color (POC) stopped for a traffic violation.

	Local	Local LEAs		СНР			
VARIABLES	(1)	(2)	(1)	(2)			
	POC (Black and Latino Drivers)						
Light_Dark	0.044***	0.031***	-0.002	-0.006			
	(0.006)	(0.006)	(0.005)	(0.004)			
Dark_Light	0.016**	0.007	0.003	0.001			
	(0.007)	(0.007)	(0.006)	(0.006)			
Post	0.003	-0.001	-0.004**	-0.004**			
	(0.003)	(0.003)	(0.002)	(0.002)			
Post_Light_Dark	-0.022**	-0.015*	-0.001	0.006			
	(0.009)	(0.009)	(0.007)	(0.007)			
Post_Dark_Light	0.015	0.019**	0.015*	0.011			
	(0.010)	(0.009)	(0.008)	(0.007)			
Female		-0.066***		-0.061***			
		(0.003)		(0.002)			
Transgender Male		0.163***		-0.585***			
		(0.036)		(0.017)			
Transgender Female		0.138***		-0.500***			
		(0.050)		(0.064)			
Nonconforming		-0.084		-0.065**			
		(0.067)		(0.029)			
LGBT		-0.119***		-0.040**			
		(0.016)		(0.017)			
Age 1-14		0.011		-0.173***			
		(0.027)		(0.060)			
Age 15-17		0.078***		0.059			
		(0.025)		(0.059)			
Age 18-24		0.027		0.051			
		(0.025)		(0.059)			
Age 25-34		-0.030		-0.001			
		(0.025)		(0.059)			
Age 35-44		-0.090***		-0.060			
		(0.025)		(0.059)			
Age 45-54		-0.170***		-0.182***			
		(0.025)		(0.059)			
Age 55-64		-0.276***		-0.306***			
		(0.026)		(0.059)			
LEP		0.259***		0.417***			
		(0.003)		(0.002)			
Disability (Deafness)		-0.022		-0.113*			
		(0.035)		(0.063)			
Disability (Speech)		0.115***		-0.059			

		(0.036)		(0.102)
Disability (Blind)		0.147*		-0.001
		(0.081)		(0.135)
Disability (MH Condition)		-0.064		-0.190***
,		(0.046)		(0.070)
Disability (Development)		-0.032		-0.086
		(0.094)		(0.104)
Disability (Other)		0.001		-0.118**
		(0.033)		(0.049)
Disability (Multiple)		-0.140		-0.160
		(0.101)		(0.103)
Call for Service		-0.005		-0.070***
		(0.011)		(0.012)
Non-Moving		0.069***		0.053***
		(0.002)		(0.002)
year = 2019	-0.022***	-0.022***	0.006**	0.006**
	(0.003)	(0.003)	(0.003)	(0.003)
year = 2020	-0.006*	-0.006*	0.027***	0.026***
	(0.004)	(0.003)	(0.003)	(0.003)
Constant	0.715***	0.723***	0.563***	0.565***
	(0.003)	(0.025)	(0.002)	(0.059)
Observations	107,356	107,356	273,238	273,238
R-squared	0.001	0.075	0.001	0.069

NOTES: Estimates for linear probability models (LPM) of the likelihood the person stopped is a person of color, estimated for people of color (POC) relative to white individuals: where *LitoDark* and *DarktoLT* are indicator variables for the relevant time period in which light conditions switch from light to dark and dark to light, respectively at the date of DST, and Post is an indicator variable equal to one for the two-week period on and after the DST switches. X represents a matrix with demographic and stop controls. We limit the sample to traffic stops two weeks pre- and post-DST switches, and to stops between 4am-8am and 4pm-8pm. Robust standard errors in parentheses *** p<0.01, ** p<0.05, * p<0.1

Table C2

Testing the Veil of Darkness (VOD) theory, OLS Regression results, share of Black drivers stopped for a traffic violation.

	Local LEAs		СНР		
VARIABLES	(1)	(2)	(1)	(2)	
		Black I	Drivers		
Light_Dark	0.066***	0.049***	-0.003	-0.003	
	(0.010)	(0.010)	(0.005)	(0.005)	
Dark_Light	0.022**	0.006	-0.004	-0.002	
	(0.011)	(0.010)	(0.006)	(0.006)	
Post	0.004	-0.001	0.000	0.001	
	(0.004)	(0.004)	(0.002)	(0.002)	
Post_Light_Dark	-0.025*	-0.020	-0.003	0.001	
	(0.014)	(0.014)	(0.008)	(0.008)	
Post_Dark_Light	0.014	0.019	0.002	-0.001	
	(0.015)	(0.015)	(0.009)	(0.009)	
Female		-0.059***		0.011***	
T 1 1 (1		(0.004)		(0.002)	
Transgender Male		0.141**		-0.206***	
		(0.064)		(0.019)	
Transgender Female		0.202***		-0.183***	
		(0.074)		(0.035)	
Nonconforming		-0.125		-0.07/8**	
LODE		(0.087)		(0.031)	
LGBT		-0.110***		0.001	
A 1 1 4		(0.020)		(0.018)	
Age 1-14		-0.024		-0.1/9**	
A 15 17		(0.042)		(0.0/2)	
Age 15-1/		(0.001)		-0.041	
A and 18 24		(0.038)		(0.0/1)	
Age 18-24		(0.014)		(0.002)	
A go 25 34		(0.038)		(0.071)	
Age 23-34		-0.080°		-0.043	
$\Lambda = 35 - 11$		-0.131***		(0.071)	
Age 33-44		(0.038)		(0.071)	
$\Delta \sigma e A 5_5 A$		-0 162***		-0.121*	
11gc +3-3+		(0.038)		(0.071)	
Age 55-64		-0.236***		-0.163**	
1180 33 01		(0.039)		(0.071)	
LEP		0.096***		0.013	
		(0.018)		(0.021)	
Disability (Deafness)		-0.028		0.007	
		(0.052)		(0.062)	
Disability (Speech)		-0.112		-0.018	
····· · · · · · · · · · · · · · · · ·		(0.128)		(0.098)	
Disability (Blind)		0.317**		-0.164***	
		(0.127)		(0.021)	
Disability (MH Condition)		0.076		-0.001	

		(0.057)		(0.066)
Disability (Development)		-0.131		0.088
		(0.143)		(0.114)
Disability (Other)		0.065		-0.009
		(0.044)		(0.046)
Disability (Multiple)		-0.128		-0.169***
		(0.119)		(0.024)
Call for Service		0.020		-0.058***
		(0.018)		(0.011)
Non-Moving		0.161***		0.043***
		(0.004)		(0.002)
year = 2019	-0.027***	-0.032***	0.010***	0.010***
	(0.005)	(0.005)	(0.003)	(0.003)
year = 2020	0.003	-0.001	0.028***	0.031***
	(0.005)	(0.005)	(0.003)	(0.003)
Constant	0.439***	0.463***	0.197***	0.235***
	(0.005)	(0.038)	(0.003)	(0.071)
Observations	71,728	71,728	147,784	147,784
R-squared	0.002	0.063	0.001	0.018

NOTES: Estimates for linear probability models (LPM) of the likelihood the person stopped is a person of color, estimated for Black individuals, relative to white individuals: where *LttoDark* and *DarktoLT* are indicator variables for the relevant time period in which light conditions switch from light to dark and dark to light, respectively at the date of DST, and Post is an indicator variable equal to one for the two-week period on and after the DST switches. X represents a matrix with demographic and stop controls. We limit the sample to traffic stops two weeks pre- and post-DST switches, and to stops between 4am-8am and 4pm-8pm. Robust standard errors in parentheses *** p<0.01, ** p<0.05, * p<0.1

Table C3

Testing the Veil of Darkness (VOD) theory, OLS Regression results, share of Latino drivers stopped for a traffic violation.

	Local LEAs		CHP		
VARIABLES	(1)	(2)	(1)	(2)	
	Latino Drivers				
Light_Dark	0.046***	0.030***	-0.001	-0.006	
	(0.008)	(0.007)	(0.005)	(0.005)	
Dark_Light	0.018**	0.008	0.005	0.001	
	(0.008)	(0.008)	(0.006)	(0.006)	
Post	0.003	-0.000	-0.006**	-0.005**	
	(0.003)	(0.003)	(0.002)	(0.002)	
Post_Light_Dark	-0.028**	-0.017	-0.000	0.006	
	(0.011)	(0.011)	(0.008)	(0.007)	
Post_Dark_Light	0.020*	0.022**	0.018**	0.015*	
	(0.012)	(0.011)	(0.008)	(0.008)	
Female		-0.081***		-0.082***	
		(0.003)		(0.002)	
Transgender Male		0.190***		-0.535***	
		(0.043)		(0.018)	
I ransgender Female		0.123*		-0.439***	
		(0.070)		(0.068)	
Nonconforming		-0.083		-0.058*	
LODT		(0.075)		(0.030)	
LGB1		-0.129***		-0.053^{***}	
A co 1 14		(0.019)		(0.018) 0.120**	
Age 1-14		(0.032)		-0.129	
A go 15 17		0.111***		(0.000)	
Age 13-17		(0.031)		(0.095)	
Age 18-24		0.039		0.070	
1190 10 21		(0.03)		(0.065)	
Age 25-34		-0.014		0.018	
1160 20 5 1		(0.031)		(0.065)	
Age 35-44		-0.087***		-0.042	
2		(0.031)		(0.065)	
Age 45-54		-0.194***		-0.175***	
C		(0.032)		(0.065)	
Age 55-64		-0.296***		-0.294***	
-		(0.032)		(0.065)	
LEP		0.345***		0.474***	
		(0.004)		(0.002)	
Disability (Deafness)		-0.017		-0.156**	
		(0.039)		(0.062)	
Disability (Speech)		0.164***		-0.063	
		(0.039)		(0.103)	
Disability (Blind)		0.045		0.040	
		(0.118)		(0.134)	
Disability (MH Condition)		-0.217***		-0.252***	

		(0.059)		(0.066)
Disability (Development)		0.013		-0.162
		(0.107)		(0.107)
Disability (Other)		-0.055		-0.148***
		(0.041)		(0.047)
Disability (Multiple)		-0.179*		-0.100
		(0.106)		(0.103)
Call for Service		-0.021		-0.062***
		(0.013)		(0.012)
Non-Moving		0.043***		0.050***
		(0.003)		(0.002)
year = 2019	-0.025***	-0.022***	0.003	0.004
	(0.004)	(0.004)	(0.003)	(0.003)
year = 2020	-0.012***	-0.010**	0.024***	0.022***
	(0.004)	(0.004)	(0.003)	(0.003)
Constant	0.633***	0.638***	0.510***	0.496***
	(0.004)	(0.031)	(0.003)	(0.065)
Observations	107,356	107,356	241,927	241,927
R-squared	0.001	0.075	0.001	0.086

NOTES: Estimates for linear probability models (LPM) of the likelihood the person stopped is a person of color, estimated for Latino individuals, relative to white individuals: where *LttoDark* and *DarktoLT* are indicator variables for the relevant time period in which light conditions switch from light to dark and dark to light, respectively at the date of DST, and Post is an indicator variable equal to one for the two-week period on and after the DST switches. X represents a matrix with demographic and stop controls. We limit the sample to traffic stops two weeks pre- and post-DST switches, and to stops between 4am-8am and 4pm-8pm. Robust standard errors in parentheses *** p<0.01, ** p<0.05, * p<0.1

Table C4.

Testing the Veil of Darkness (VOD) theory, OLS Regression results, share of People of color stopped for a traffic violation by local law enforcement agencies.

	Local Law Enforcement						
	Non-Moving Traffic Violation			Moving Traffic Violation			
VARIABLES	POC	Black	Latino	POC	Black	Latino	
Light_Dark	0.032***	0.058***	0.033**	0.046***	0.058***	0.049***	
	(0.010)	(0.016)	(0.013)	(0.008)	(0.012)	(0.009)	
Dark_Light	0.009	0.013	0.011	0.013	0.008	0.016	
	(0.010)	(0.017)	(0.014)	(0.009)	(0.013)	(0.010)	
Post	0.003	0.003	0.004	0.001	0.000	0.001	
	(0.004)	(0.007)	(0.006)	(0.003)	(0.005)	(0.004)	
Post_Light_Dark	-0.026*	-0.040*	-0.031	-0.021*	-0.018	-0.027*	
	(0.014)	(0.023)	(0.019)	(0.012)	(0.018)	(0.014)	
Post_Dark_Light	0.007	0.017	0.005	0.026**	0.022	0.031**	
	(0.015)	(0.024)	(0.020)	(0.012)	(0.019)	(0.014)	
year = 2019	-0.028***	-0.036***	-0.036***	-0.024***	-0.034***	-0.023***	
	(0.006)	(0.009)	(0.007)	(0.004)	(0.006)	(0.005)	
year = 2020	-0.011*	-0.001	-0.022***	-0.005	0.001	-0.008	
	(0.006)	(0.010)	(0.008)	(0.004)	(0.006)	(0.005)	
Constant	0.778***	0.565***	0.688***	0.687***	0.385***	0.611***	
	(0.005)	(0.009)	(0.007)	(0.004)	(0.006)	(0.005)	
Observations	46,380	24,473	32,854	92,198	47,255	74,502	
R-squared	0.001	0.002	0.001	0.001	0.002	0.001	

NOTES: Estimates for linear probability models (LPM) of the likelihood the person stopped is a person of color, estimated for people of color (POC) and separately for Black and Latino individuals, relative to white individuals: where *LttoDark* and *DarktoLT* are indicator variables for the relevant time period in which light conditions switch from light to dark and dark to light, respectively at the date of DST, and Post is an indicator variable equal to one for the two-week period on and after the DST switches. X represents a matrix with demographic and stop controls. We limit the sample to traffic stops two weeks pre- and post-DST switches, and to stops between 4am-8am and 4pm-8pm. Robust standard errors in parentheses *** p<0.01, ** p<0.05, * p<0.1

Table C5

Testing the Veil of Darkness (VOD) theory, OLS Regression results, share of People of color stopped for a traffic violation by CHP.

	CHP							
	Non-Mov	Non-Moving Traffic Violation			Moving Traffic Violation			
VARIABLES	POC	Black	Latino	POC	Black	Latino		
Light_Dark	0.002	0.008	-0.000	-0.003	-0.008	-0.001		
	(0.008)	(0.010)	(0.009)	(0.006)	(0.006)	(0.006)		
Dark_Light	-0.000	0.005	-0.002	0.008	-0.005	0.012		
	(0.010)	(0.013)	(0.011)	(0.007)	(0.007)	(0.007)		
Post	-0.001	0.003	-0.002	-0.005*	-0.000	-0.006**		
	(0.004)	(0.004)	(0.004)	(0.003)	(0.003)	(0.003)		
Post_Light_Dark	-0.019	-0.025*	-0.016	0.008	0.008	0.007		
	(0.013)	(0.015)	(0.014)	(0.009)	(0.009)	(0.009)		
Post_Dark_Light	0.016	-0.006	0.023	0.012	0.003	0.014		
	(0.014)	(0.017)	(0.015)	(0.009)	(0.010)	(0.010)		
year = 2019	-0.001	0.009*	-0.005	0.009***	0.011***	0.007**		
	(0.004)	(0.005)	(0.005)	(0.003)	(0.003)	(0.003)		
year = 2020	0.019***	0.016***	0.020***	0.037***	0.038***	0.032***		
	(0.005)	(0.006)	(0.005)	(0.003)	(0.003)	(0.004)		
Constant	0.605***	0.231***	0.552***	0.539***	0.180***	0.487***		
	(0.004)	(0.005)	(0.004)	(0.003)	(0.003)	(0.003)		
Observations	89,789	46,164	78,639	183,449	101,620	163,288		
R-squared	0.000	0.000	0.001	0.001	0.002	0.001		

bod the person stopped is a person of color, estimated for people of color (POC) and separately for

NOTES: Estimates for linear probability models (LPM) of the likelihood the person stopped is a person of color, estimated for people of color (POC) and separately for Black and Latino individuals, relative to white individuals: where *LttoDark* and *DarktoLT* are indicator variables for the relevant time period in which light conditions switch from light to dark and dark to light, respectively at the date of DST, and Post is an indicator variable equal to one for the two-week period on and after the DST switches. X represents a matrix with demographic and stop controls. We limit the sample to traffic stops two weeks pre- and post-DST switches, and to stops between 4am-8am and 4pm-8pm. Robust standard errors in parentheses *** p<0.01, ** p<0.05, * p<0.1