UC Irvine

UC Irvine Electronic Theses and Dissertations

Title

Structural racism in the criminal justice system and psychiatric emergencies among Black Americans

Permalink

https://escholarship.org/uc/item/0xb4k0w6

Author

Das, Abhery

Publication Date

2023

Copyright Information

This work is made available under the terms of a Creative Commons Attribution License, available at https://creativecommons.org/licenses/by/4.0/

Peer reviewed|Thesis/dissertation

UNIVERSITY OF CALIFORNIA, IRVINE

Structural	racism	in the	criminal	justice	system	and	psychiatric	emergencies	among	Black
					Americ	ans				

DISSERTATION

submitted in partial satisfaction of the requirements for the degree of

DOCTOR OF PHILOSOPHY

in Public Health

by

Abhery Das

Dissertation Committee: Professor Tim A. Bruckner, Chair Associate Professor Annie Ro Professor Emily Owens

DEDICATION

To my son, Iman. I promise I will always be there for you. Thank you for making me a mom and letting me marvel at the world once again – it's an honor.

TABLE OF CONTENTS

	Page
LIST OF TABLES	iv
LIST OF FIGURES	vii
ACKNOWLEDGMENTS	ix
VITA	Х
ABSTRACT OF THE DISSERTATION	xiii
CHAPTER 1: Introduction	1
CHAPTER 2: New York City's Stop, Question, and Frisk Policy and Psychiatric Emergencies among Black Americans	17
CHAPTER 3: Emergency Department Visits for Depression Following Police Killings of Unarmed Black Americans	48
CHAPTER 4: Incarceration and Psychiatric Emergency Department Visits among Black Americans	72
CHAPTER 5: Conclusion	105
REFERENCES	112
APPENDICES	130

LIST OF TABLES

		Page
Table 2.1	Characteristics of monthly psychiatric Emergency Department visits, police stops, stops including frisking, and stops including use of force among Black Americans in New York City, 2006-2015.	36
Table 2.2	Time-series results predicting the psychiatric Emergency Department visits among Black Americans in New York City from 2006-2015, as a function of police stops, stops including frisking, and stops including use of force among Black Americans.	41
Table 2.3	Outlier-adjusted time series results predicting psychiatric Emergency Department visits among Black Americans in New York City from 2006-2015, as a function of police stops, stops including frisking, and stops including use of force among Black Americans.	44
Table 2.4	Time series results predicting psychiatric Emergency Department visits among Black Americans in New York City from 2006-2015, as a function of police stops, stops including frisking, and stops including use of force that did not result in an arrest.	45
Table 2.5	Time series results predicting psychiatric Emergency Department visits among whites in New York City from 2006-2015, as a function of police stops, stops including frisking, and stops including use of force among Black Americans.	46
Table 2.6	Time series results predicting psychiatric Emergency Department visits among whites in New York City from 2006-2015, as a function of the Floyd et al. class action lawsuit filed against the NYPD in May 2012.	47
Table 3.1	Descriptive attributes of study covariates across 75 counties (5 states: AZ, KY, NJ, NY, NC), over 36 months (2013-2015).	63
Table 3.2	OLS fixed effects regression results predicting log transformed ED visits for depression (per 100,000 population) among Black Americans as a function of 0- to 3-month lags of police killing of unarmed Black Americans.	67
Table 3.3	OLS fixed effects regression results predicting log transformed ED visits for depression (per 100,000 population) among Black Americans as a function of 0- to 6- month lags of police killing of unarmed Black Americans (binary), monthly arrest rates for violent crime, number of hospitals/EDs per county-month.	68

Table 3.4	OLS fixed effects regression results predicting log transformed ED visits for depression (per 100,000 population) among Black Americans as a function of 0- to 3- month lags of police killing of <u>armed</u> Black Americans.	69
Table 3.5	OLS fixed effects regression results predicting log transformed ED visits for depression (per 100,000 population) among whites as a function of 0- to 3- month lags of police killing of unarmed Black Americans.	70
Table 3.6	OLS fixed effects regression results predicting log transformed ED visits for all psychiatric conditions, substance use, and anxiety (per 100,000 population) among Black Americans as a function of 0- to 3-month lags of police killing of unarmed Black Americans.	71
Table 4.1	County-level emergency department, incarceration, and socioeconomic characteristics of 404 counties from ten US states ^a , 2006-2015.	94
Table 4.2	Ordinary Least Squares fixed effects regression results predicting log transformed psychiatric ED visits (per 100k population) among Black Americans as a function of incarceration among Black Americans (per 100k population) in 404 counties from ten US states, 2006-2015.	98
Table 4.3	Ordinary Least Squares fixed effects regression results predicting log transformed psychiatric ED visits (per 100k population) among Black Americans as a function of the ratio of incarceration of Black Americans to white Americans in 404 counties from ten US states, 2006-2015.	99
Table 4.4	Outlier-adjusted linear fixed effects regression results predicting log transformed psychiatric ED visits (per 100k population) among Black Americans as a function of incarceration among Black Americans (per 100k population) in 404 counties from ten US states, 2006-2015.	100
Table 4.5	Ordinary Least Squares fixed effects regression results predicting psychiatric ED visits (per 100k population) without log-transformation among Black Americans as a function of incarceration among Black Americans (per 100k population) in 404 counties from ten US states, 2006-2015.	101
Table 4.6	Ordinary Least Squares fixed effects regression results predicting log transformed psychiatric ED visits (per 100k population) among Black Americans as a function of the difference in incarceration between Black Americans and white Americans in 404 counties from ten US states, 2006-2015.	102

Table 4.7	Ordinary Least Squares fixed effects regression results predicting log transformed psychiatric ED visits (per 100k population) among whites as a function of incarceration among whites (per 100k population) in 404 counties from ten US states, 2006-2015.	103
Table 4.8	Ordinary Least Squares fixed effects regression results predicting log transformed psychiatric ED visits (per 100,000 population) among white Americans as a function of the ratio of incarceration among Black Americans to whites in 404 counties from ten US states, 2006-2015.	104

LIST OF FIGURES

		Page
Figure 2.1	Count of psychiatric Emergency Department visits among Black Americans over 120 months in New York City, 2006-2015.	37
Figure 2.2	Count of total police stops among Black Americans over 120 months in New York City, 2006-2015.	38
Figure 2.3	Count of police stops including frisking among Black Americans over 120 months in New York City, 2006-2015.	39
Figure 2.4	Count of police stops including use of force among Black Americans over 120 months in New York City, 2006-2015.	40
Figure 2.5	Residual count of psychiatric ED visits among Black Americans in New York City, 2006-2015, with mean=0, after controlling for psychiatric ED visits among whites and removal of autocorrelation. First four months lost to time-series modelling.	42
Figure 2.6	Count of psychiatric Emergency Department visits among whites over 120 months in New York City, 2006-2015.	43
Figure 3.1	Trend in ED visits for depression among Black Americans (per 100,000 population) across 75 counties (5 states: AZ, KY, NC, NJ, NY), over 36 months (2013-2015).	64
Figure 3.2	Monthly police killings of unarmed Black Americans over 36 months (2013-2015) aggregated for 75 counties (5 states: AZ, KY, NC, NJ, NY)	65
Figure 3.3	Frequency distribution of ED visits for depression among Black Americans (per 100,000 population) across 75 counties (5 states: AZ, KY, NC, NJ, NY), over 36 months (2013-2015).	66

Figure 4.1	Frequency distribution of psychiatric ED visits among Black Americans (per 100,000 population) across 404 counties (10 states: AZ, CA, FL, KY, MA, MD, NJ, NY, RI, NC), over 10 years, 2006-2015.	92
Figure 4.2	Frequency distribution of psychiatric ED visits among Black Americans following log-transformation (per 100,000 population) across 404 counties (10 states: AZ, CA, FL, KY, MA, MD, NJ, NY, RI, NC), over 10 years, 2006-2015.	93
Figure 4.3	Psychiatric ED visits per 100,000 population from 404 counties in ten US states, 2006-2015.	95
Figure 4.4	Incarceration per 100,000 population among Black Americans in 404 counties from ten US states, 2006-2015.	96
Figure 4.5	The ratio of incarceration of Black Americans to white Americans in 404 counties from ten US states 2006-2015	97

ACKNOWLEDGMENTS

My doctoral career would not have been possible without the support and guidance of my mentors, colleagues, family, and friends. Tim Bruckner, thank you for the kind of mentorship I did not expect to find. You have helped me discover my path, my voice, and my strengths – for that, I am endlessly grateful. I can only hope to emulate your brilliance, kindness, and devotion to my own students one day. Annie Ro and Emily Owens, thank you for your guidance as I made my way through my doctoral education. It has been a pleasure working with you both, and I appreciate the time you put into my development as a scholar. To my lab-mates, both old and new, thank you for being in my corner both professionally and personally over the past few years. Asok (Baba), Aparna (Ma), and Ananya (Didi), we are cut from the same cloth, branches from the same tree, four parts to a whole; this is as much yours as it is mine. Luol and Joakim, my pups, my furry research assistants, thank you for the comfort you have provided me over the years. Your excitement and pitter-patter around the house mean more than you will ever know. Luke, I am still unsure of how I got lucky enough to find you. Your love and compassion are the only reason I am here today. Together we can do anything – always and forever.

VITA

Abhery Das

EDUCATION

University of California, Irvine Doctor of Philosophy, Public Health Graduated, September 2023

Johns Hopkins Bloomberg School of Public Health Master of Health Sciences, Mental Health Graduated, May 2018

University of Chicago Bachelor of Arts, Public Policy Studies Minor, Visual Arts Graduated with Honors, June 2010

RESEARCH

National Institute of Mental Health, Ruth L. Kirschstein National Research Predoctoral Fellow

 F31 Predoctoral Fellowship Project: Exposure to Firearms and African American Youth Suicide by Firearm: A Social Ecological Framework

UC Irvine Program in Public Health, Graduate Student Researcher September 2018 – September 2023

- o Present peer-reviewed literature on structural racism, racial health disparities, and policy
- o Read in, merge, and analyze large mental health datasets (>100 million records) using SAS and Stata
- o Collaborate with Inland Empire Health Plan to evaluate a psychiatric training program
- o Validate econometric specifications for various regression approaches independently
- o Draft manuscripts for publication

The World Bank Group, Health, Nutrition & Population, Research Assistant May 2020 – September 2023

- o Draft narrative review on mental health among vulnerable populations during COVID-19
- Assist with conducting mental health workforce projections and drafting manuscripts for publication

Johns Hopkins School of Public Health, Substance Use Epidemiology Lab, Research Assistant September 2017 – May 2018

- o Conduct literature reviews on drug usage behaviors in underrepresented populations
- Analyze data using the Youth Risk Behavior Surveillance System (YRBSS)

PEER-REVIEWED PUBLICATIONS

- 17. Das A, Morey B, Bruckner T. Mental health symptoms following the January 6th attack on the United States Capitol. Social Science & Medicine. https://doi.org/10.1016/j.socscimed.2023.116015
- 16. Das A, Bruckner T. New York City's Stop, Question, and Frisk Policy and Psychiatric Emergency Department Visits among Black Americans. The Journal of Urban Health. https://doi.org/10.1007/s11524-022-00710-x
- 15. Bruckner T, Das A, Duncan G. Thanksgiving and Christmas gatherings before the 2020-21 winter surge of COVID-19 in the United States. Preventive Medicine Reports. doi: 10.1016/j.pmedr.2022.101911
- 14. Das A, Gailey S. Green exercise, mental health symptoms, and state lockdown policies: a longitudinal study. Journal of Environmental Psychology. https://doi.org/10.1016/j.jenvp.2022.101848

- 13. Yoon J, Patrick R, Das A, Bruckner T (2022). Firearm Availability, Suicide, and the Role of Public Mental Health Capacity. The Journal of Mental Health Policy and Economics.
- 12. Hard G, Johnson J, Das A, Jones, A (2022). Medical Marijuana Laws and Adolescent Alcohol Use Initiation. Cannabis. doi: 10.26828/cannabis/2022.02.001
- 11. Das A, Singh P, Bruckner T (2021). Firearm Permissiveness, Gun Culture, and Suicides by Firearm, 2000-2016. Public Health in Practice. https://doi.org/10.1016/j.puhip.2021.100218.
- 10. Das A, Singh, P, Bruckner, T (2021). State Lockdown Policies, Mental Health Symptoms, and Using Substances. Addictive Behaviors. https://doi.org/10.1016/j.addbeh.2021.107084.
- 9. Bruckner T, Catalano R, Das A, Lu Y (2021). Cohort Selection in Utero Against Male Twins and Childhood Cancers: A Population-Based Register Study. Cancer Epidemiology, Biomarkers & Prevention. doi: 10.1158/1055-9965.EPI-21-0053.
- 8. Bruckner, T, Das, A, Singh, P; Boden-Albala B (2021). SARS-CoV-2: An Empirical Investigation of Rose's Population-based Logic. Epidemiology. doi: 10.1097/EDE.00000000001405.
- 7. Bruckner, T.A., Gailey, S., Das, A. et al. (2021). Stillbirth as left truncation for early neonatal death in California, 1989–2015: a time-series study. BMC Pregnancy Childbirth. https://doi.org/10.1186/s12884-021-03852-z.
- 6. Das A, Johnson J, Hard G, Jones A (2021). State Medical Marijuana Laws and Initiation of Cigarettes among Adolescents in the U.S., 1991-2015. Cannabis. doi: 10.26828/cannabis/2021.01.004.
- 5. Singh, P., Das, A., William, J. et al. (2021). Fertility, economic development, and suicides among women in India. Social Psychiatry Psychiatric Epidemiology. https://doi.org/10.1007/s00127-021-02054-4.
- 4. Das A, Singh P, Kulkarni AK, Bruckner TA (2021). Emergency Department visits for depression following police killings of unarmed African Americans. Social Science & Medicine. doi:10.1016/j.socscimed.2020.113561.
- 3. Das A, Singh P, Bruckner T (2020). Continuity of Mental Health Care at Community Health Centers and Reduced Emergency Department Visits for Suicidal Ideation/Self-Harm. Community Mental Health Journal. https://doi.org/10.1007/s10597-020-00745-x.
- 2. Das A, Singh P, Bruckner T (2020). Racial Disparities in Pediatric Psychiatric Emergencies: A Health Systems Approach. Journal of Psychiatry and Brain Science. https://doi.org/10.20900/jpbs.20200006.
- 1. Jones A., Dyer TV, Das A, et al. (2018). Risky Sexual Behaviors, Substance Use, & Perceptions of Risky Behaviors among Criminal Justice Involved Women Who Trade Sex. Journal of Drug Issues. https://doi.org/10.1177/0022042618795141.

PUBLICATIONS UNDER REVIEW

Singh P, Gailey S, Das A, Bruckner T. National trends in suicides and male twin live births in the US, 2003 to 2019: an updated test of collective optimism and selection in utero.

REPORTS

Das A, Bruckner T, Saxena S, Alqunaibet A, Almudarra S, Herbst C, Alsukait R, El-Saharty S, Algwaizini A. COVID-19 and Mental Health in Vulnerable Populations: A Narrative Review. 2020. The World Bank Group Health, Nutrition, and Population Discussion Papers.

PRESENTATIONS

2023 Annual Meeting, Society for Pediatric and Perinatal Epidemiologic Research (SPER)

Poster, Preterm births increase with racial and economic segregation in the US, 1998-2018, June 12-13, 2023.

2023 Annual Meeting, Population Association of America (PAA)

Poster, Mental health symptoms following the January 6th attack on the United States Capitol. April 12-15, 2023.

2022 Annual Meeting, Interdisciplinary Association for Population Health Sciences (IAPHS)

Speaker, Pathways to Inequality: Structural Racism and the Production of Population Health. Incarceration and Psychiatric Emergency Department Visits among Black Americans. September 21-23, 2022.

2022 Annual Meeting, Society for Epidemiologic Research (SER)

Speaker, Policing and Prison as Determinants of Health Inequities. New York City's Stop, Question, and Frisk Policy and Psychiatric Emergency Department Visits among Black Americans. June 15-June 17, 2022.

2022 Annual Meeting, Population Association of America (PAA)

Speaker, Racism, Xenophobia, and Pain in Population Health Disparities. The police killing of George Floyd and mental health among Black Americans. April 6-8, 2022.

2022 Annual Meeting, International Center of Mental Health Policy and Economics

Speaker, Mental Health Services, Economics, and Policy Research. New York City's Stop, Question, and Frisk Policy and Psychiatric Emergency Department Visits among Black Americans. March 25-27, 2022.

2021 Annual Meeting, Interdisciplinary Association for Population Health Sciences (IAPHS)

Speaker, Social Vulnerability and Mental Health. State lockdown policies, mental health symptoms, and using substances. October 19, 2021.

2021 Annual Meeting, Population Association of America (PAA)

Speaker, Discrimination and Health Disparities in the US. Emergency Department visits for depression following police killings of unarmed African Americans. May 5, 2021.

2020 Annual Meeting, Society for Epidemiologic Research (SER)

Speaker, Causal Solutions in Psychiatric Epidemiology. Permissiveness of State Firearm Laws and Increased Suicides by Firearm in the US. December 16, 2020.

2020 Annual Research Meeting, Academy Health

Poster, Mental Health and Substance Use. Continuity of Mental Health Care at Community Health Centers and Reduced Emergency Department Visits for Suicidal Ideation/Self Harm. August 6, 2020.

2020 Annual Research Meeting, American Public Health Association

Speaker, Leveraging Upstream and Strength-Based Approaches to Mental Health Promotion. Permissiveness of Firearm Laws and Suicides by Firearm in the US, 2000-2016. October 26, 2020.

2018 Child Maltreatment Symposium, Johns Hopkins Bloomberg School of Public Health

1st Place Poster, Moore Center for Prevention of Child Sexual Abuse. A Review of American Indian/Alaska Native Youth Suicide Prevention Programs in the United States. May 3, 2018.

2018 Johns Hopkins Public Health Student Forum, Johns Hopkins University

Poster, 9th Annual Conference in Public Health. A Review of American Indian/Alaska Native Youth Suicide Prevention Programs in the United States. May 10, 2018.

TEACHING EXPERIENCE

Foundations in Public Health, Teaching Assistant, Johns Hopkins University, 2017-2018 Principles of Public Health, Teaching Assistant University of California Irvine, Fall 2018 Health Policy, Teaching Assistant, University of California, Irvine, Winter 2019 Principles of Public Health, Teaching Assistant, University of California, Irvine, Spring 2019 Foundations in Community Health, Teaching Assistant, University of California, Irvine, Spring 2022

ABSTRACT OF THE DISSERTATION

Structural racism in the criminal justice system and psychiatric emergencies among Black

Americans

by

Abhery Das

Doctor of Philosophy in Public Health
University of California, Irvine, 2023
Professor Tim A. Bruckner, Chair

Black Americans experience more prevalent—as well as more severe and disabling—chronic depression compared to other races/ethnicities. Suicide rates among Black youth have also increased substantially in the past two decades. Many scholars attribute a portion of race-related differences in health outcomes to structural racism. Structural racism comprises methods of reinforcing inequitable systems that societies use to foster racial discrimination. In the justice system, Black Americans have a higher likelihood of police stops, police killings, and incarceration (vs. whites) after accounting for criminality. Such racially disparate systems may have implications for mental health within the broader Black community through perceived unfair discrimination, hypervigilance, vicarious racism, and disruption of family networks and social capital. In three analytic studies, I test whether increases in (i.) police stops, (ii.) police killings of unarmed Black Americans, and (iii.) incarceration correspond with greater psychiatric help-seeking among Black Americans.

Following the New York City Stop, Question, and Frisk (SQF) policy, police stopped Black Americans at 2.5 times the rate of whites, after controlling for crime and precinct differences. I examined whether police stops following the SQF policy in New York City corresponded with greater psychiatric Emergency Department (ED) visits among Black Americans. Through

pathways of perceived unfair discrimination and hypervigilance, police stops may precede greater mental health symptoms within the Black community. Using time-series methodology to control for seasonality and other patterning, I find that police stops correspond with a 0.02 increase in psychiatric ED visits among Black Americans. Stops including frisking coincide with a 0.05 increase in psychiatric ED visits and stops including use of force show a 0.11 increase in psychiatric ED visits among Black Americans. Use of force had the greatest influence as perceived threats of physical violence towards others may incite greater psychiatric symptoms within the community.

Police are almost 3.5 times more likely to kill Black Americans than whites. Additionally, Black Americans have nearly 1.5 times the likelihood of being unarmed when killed compared to whites. I investigated whether and to what extent police killings of unarmed Black Americans precede a severe and acute mental health outcome among Black Americans: depression-related ED visits. Theories on vicarious racism and linked fate posit that individuals indirectly experience racism targeted at other persons of color. I examined the relation across 75 counties from five US states between 2013-2015. Fixed effect linear regression analyses controlled for time-invariant county factors. I also accounted for the number of hospitals and arrests for violent crimes (per 100,000 population). I find that police killings of unarmed Black Americans correspond with an 11% increase in ED visits related to depression (per 100,000 population) among Black Americans in the concurrent month and three months following the exposure.

The justice system incarcerates nearly 2.3 million individuals in the US. Black Americans comprise 40% of those incarcerated despite representing less than 15% of the population.

Theoretical work postulates that mass incarceration erodes social capital and family networks within Black communities. I examine the relation between incarceration and psychiatric Emergency Department (ED) visits among Black Americans. I also estimate whether the ratio of Black American to white incarceration (an estimate of structural racism in the justice system)

corresponds with an increase in psychiatric help-seeking among Black Americans. I find that a one unit increase in incarceration (per 100,000 population) corresponds with a 1.4% increase in psychiatric ED visits (per 100,000 population) among Black Americans. Structural racism in incarceration (i.e., one unit increase in ratio Black and white incarceration) also varies positively, with a 2.2% increase in psychiatric ED visits (per 100,000 population).

Police stops, police killings of unarmed Black Americans, and incarceration have substantial adverse psychiatric implications for Black communities. A reduction in racial disparities through policies enforcing changes in policing behavior and sentencing reforms may modestly reduce adverse mental health among Black Americans. Additionally, this work adds to the emerging theoretical and empirical literature on structural racism and its presence in the justice system. Inequitable social systems may significantly influence mental health among Black Americans.

CHAPTER 1: INTRODUCTION

Scholars argue that racism remains pervasive in the United States and contributes to adverse physical and mental health among historically disadvantaged populations.¹ One theoretical framework for racism presents three different levels to evaluate health outcomes: 1) internalized; 2) personally mediated; and 3) institutionalized.² Internalized racism denotes the acceptance of negative messages about one's abilities and worth.² Personally mediated racism signifies acts of prejudice and discrimination between persons.² Institutionalized racism refers to differential access to goods, services, and opportunities by race that follow from formal legislation or the actions by the State that reinforce racial/ethnic biases.²

Critical Race Theory (CRT) asserts that institutions perpetuate racial inequality for Black

Americans through social, economic, and legal disparities.³ CRT distinguishes itself from

progressive, color-blind, and civil rights approaches as they rely on the current legal system.⁴

Scholars argue that although acts or prejudice play a role in racial domination, social institutions shape the system of racial domination.⁵ The system subsequently continues as individuals abide by social institutions rooted in racism.⁶

In sociological theory, "The Color Line" refers to the legalized segregation and racial discrimination experienced by Black Americans from the continued division of opportunities and resources following the abolition of slavery. Scholars also posit that discriminatory practices and racialized institutions develop for the subordination of People of Color communities by whites. Foundational and pervasive racism within social structures shape white-dominated societies to generate wealth and support the intergenerational transmission of resources. Theorists further assert that legalized structural racism did not conclude following the termination of Jim Crow laws or the Civil Rights Act of 1964. Racial inequality continued through invisible pathways and practices that often appear non-racially motivated.

Black American and white racial disparities exist in major sub-systems within America, including employment, education, residential segregation, housing, health care, and the criminal justice system. The components, theorists argue, create an integrated system, The Race Discrimination System, through which sub-systems have reciprocal relationships and feedback loops. Interrelated disparities comprise a system that produces societal-level discrimination. Scholars argue that in order to develop effective remedies to racial disparities, research must recognize the overall system of racial discrimination, or 'über discrimination', and how subsystems relate to each other.

Some contend that negative racial stereotypes and beliefs, of Black Americans, influence societal policies and institutions.¹ Data examining trends in racial attitudes from the 1940s to the 21st century reveal that whites' views toward principles of equality, such as racial integration in education and voting for Black American presidential candidates, have progressed over time.¹¹ Views concerning decreased social distance among racial groups (i.e., interracial marriage) have also improved.¹¹ However, many whites show lesser support for policies that would implement equality, such as policies intended to reduce employment and housing discrimination.¹¹ Additionally, another study reports that many whites continue to hold negative stereotypes regarding the intelligence, determination, welfare use, and violent tendencies of Black Americans and other minority populations.¹²

Mental health among Black Americans

In the 19th century, policymakers often utilized racial disparities in health as a scientific rationale to implement discriminatory policies.¹³ After the 1840 US Census, one scientific report falsified Black American 'insanity' rates.¹⁴ The report indicated that the further North Black Americans lived, the higher the rates of Black American lunacy – implying freedom among Black Americans

corresponded with 'insanity'.¹⁴ Early studies of mental illness among Black Americans mostly examined patients in state hospitals and did not account for racial differences in treatment options.¹³ After World War II, the US improved its measurement methods by utilizing community surveys with random sampling strategies. However, the field of psychiatry had yet to standardize a diagnostic system for psychiatric illness.¹³

In the 1970s, the field progressed substantially and issued The National Institute of Mental Health Epidemiologic Catchment Area (ECA) Study. ¹⁵ This landmark study provided estimates of the prevalence and incidence of psychiatric disorders (current and lifetime) in representative samples of institutionalized and non-institutionalized persons. ¹⁵ The ECA reported that whites and Black Americans had similar rates of depressive disorders; however, Black Americans showed higher rates of anxiety disorders. ¹⁵ In 1994, the National Comorbidity Survey (NCS) surveyed psychiatric illness among a national probability sample. ¹⁶ Findings indicated that Black Americans had lower rates for depression and substance use, as compared to whites. ¹⁶ A growing body of epidemiologic work has shown that rates of psychiatric disorders remain lower or similar in Black populations when compared to whites, despite facing greater societal and economic strain. ^{17–19} Lower rates of mental illness, specifically depression, have led scholars to label this observation as the "Black-white mental health paradox." ^{17–19}

The paradox challenges expectations of stress theory, in which greater exposure to stressors and lesser access to treatment or coping resources may indicate an increased risk of adverse mental health. Some studies, however, find conflicting results among subgroups of Black Americans or types of psychiatric illness. For example, one study reports that Black women experience greater rates of lifetime post-traumatic stress disorder (PTSD) when compared to whites. Previous work has also found no race-related differences in clinical diagnoses for Major Depressive Disorder when using DSM criteria, as well as a semi-structured instrument to diagnose patients. Black Americans have a higher likelihood of misdiagnosis when compared

to whites.²¹ Specifically, Black individuals remain 'under-diagnosed' for mood disorders due to not only differences in symptom expression but also ethnocentric bias from clinicians.²¹ Additionally, in 2007, the National Survey of American Life reported that Black Americans and whites had similar rates of 12-month Major Depressive Disorder and that Black Americans led all other race/ethnicities in chronic depression.²⁰ Relative to whites, Black Americans rated their depression as more severe and disabling.²⁰

Moreover, The Environmental Affordances Model asserts that Black populations cope with additional exposure to stressors by engaging in unhealthy behaviors including smoking, drinking alcohol, and consuming calorie-dense foods. This coping purportedly leads to greater physical illness but protects against mental illness by way of physiological pathways. The model contends that unhealthy behaviors block the neurologic cascade by way of the hypothalamic-pituitary-adrenocortical (HPA) axis and other biological systems. The HPA axis inhibits the release of corticotropin-releasing factor from the hypothalamus and therefore limits the physiological and psychological experiences of mental distress. Researchers, however, find conflicting empirical evidence to support the model when examining nationally representative samples, over time.

Racism and mental health

Research indicates that exposure to discrimination corresponds with adverse health outcomes. One review of the research in 2003 finds stronger associations between discrimination and mental health as opposed to physical health.²⁴ Of the 32 published studies examining exposure to discrimination and adverse mental health, 25 reported a positive relation.²⁵ A meta-analysis and systematic review of 293 studies between 1983 and 2013 finds that self-reported racism corresponds with poorer mental health.²⁵ With the majority of studies on Black Americans, results indicate that race/ethnicity strongly amplifies the relation between acts of racism and adverse mental health.²⁵ Another review of 138 empirical studies indicates that the strongest

associations exist between self-reported racism and negative mental health outcomes, as opposed to negative physical health outcomes. Longitudinal studies within the review further indicate temporal order in that self-reported racism precedes adverse mental health among individuals. Further research also indicates mediating pathways between self-reported racism and adverse mental health, such as racial identity, and moderating pathways, such as psychosocial behaviors. However, given the self-reported nature of both the exposure (acts of racism) and the outcome (mental health symptoms), scholars note the potential for spurious associations. Studies included in both the meta-analysis and systematic review do not include previous mental health diagnosis as a potential confounder, which may also influence the relation between acts of racism and mental health.

Among Black Americans, scholars find that internalized racism, or acceptance of negative beliefs about oneself, also corresponds with adverse mental health such as alcohol consumption, psychological distress, lower self-esteem, and symptoms of depression. ^{28,29} Several studies focus on experiences of discrimination (personally-mediated racism) and mental health. ¹ In line with theories on distributive justice, which concern perceived fairness and allocation of rewards and costs, the perception of unequal treatment arguably precedes increased psychological distress. ^{30,31} The National Survey of Black Americans, for instance, finds that self-reported discriminatory acts in the past month correlate positively with greater psychological distress, unhappiness, and life dissatisfaction. ²⁴

Some social scientists assert that differences in socioeconomic status (SES) between races remain responsible for racial variations in health.³² Large racial differences in socioeconomic status exist between racial/ethnic minorities and white populations.^{32–34} For example, Black Americans have twice the unemployment rate as whites and earn 72% of full-time employment earnings.³³ Along with Hispanic populations, Black Americans are also more likely to attend

high-poverty schools with less educational resources.³³ Scholars posit that racism at the societal and institutional-level shape socioeconomic opportunities for racial/ethnic groups.³² Healthenhancing resources from policies and systems, such as healthcare and education, remain scarce for racial/ethnic minoritized groups – creating a greater risk for lower SES.³² Cross-sectional studies find that indicators for SES also correlate inversely with adverse mental health.^{15,16,35,36} In the ECA Study, adults in the lowest SES quartile have three times the likelihood of having a psychiatric disorder.¹⁵ Additionally, the National Comorbidity Survey finds that individuals in the lowest quartiles of income and education had twice the likelihood of psychiatric illness.¹⁶

The criminal justice system and mental health

The criminal justice system in the US comprises law enforcement, courts, and corrections.³⁷
Black Americans show a higher likelihood of arrest, conviction, incarceration, and longer prison sentences than any other race/ethnicity.³⁷ Scholars have previously attributed punitive drug-related policies to the racial disparity in incarceration. For drug-related offenses, Black Americans have ten times the likelihood of conviction as compared to whites.³⁸ Police contact remains the most common encounter within the criminal justice system, especially in adolescents.³⁹ Among 15-year-old urban males, 27% report encountering a police stop and 53% report witnessing and knowing someone stopped by the police.³⁹ Additionally, police stops in the United States remain racially patterned, with Black American and Hispanic populations disproportionately stopped by police.³⁹ Research also finds that police stops with Black Americans result in greater confrontation, use of force, and killings of unarmed individuals.³⁹

Literature reports greater mental health symptoms among individuals and families involved in the criminal justice system. 40,41 Given the expansion of the carceral state in the US over the past 40 years, many researchers have examined how incarceration may precede adverse mental

health. One study, following incarcerated individuals over time, finds that incarceration precedes mood disorders, such as depression, bipolar disorder, and dysthymia, as well as disability among those formerly incarcerated. Scholars using longitudinal data from the Fragile Families and Child Wellbeing Study report that current or recent incarceration increases the risk of depression. They also document that challenges of social and economic reintegration, after incarceration, partially explain the relation.

Further research documents a relation between children and partners of incarcerated individuals and adverse mental health. Scholars using the National Longitudinal Study of Adolescent Health, which follows children through adolescence, report a positive relation between parental incarceration in childhood and depression, post-traumatic stress disorder, and anxiety during adolescence. And Mental disorder in children differs, however, based on paternal or maternal incarceration. Utility Studies report paternal incarceration precedes increases in externalizing and internalizing behavior among children whereas scholars find conflicting results for maternal incarceration. As tudy using nationally representative data from the National Survey of American Life examined familial incarceration and mental health among Black women. Their findings indicate that familial incarceration corresponds with higher levels of depression and psychological distress in Black women. Moreover, analyses report that having fixed roles in the community, such as employment, attenuated the relation between incarceration and adverse mental health.

Interaction with police, by way of police stop and frisks or use of force, also precedes mental health symptoms among individuals tied to the event. A longitudinal study of adolescents reports a positive relation between personal police contact and vicarious police contact with depressive symptoms.⁴¹ This study controlled for several parental and individual characteristics, including youth delinquency, which may confound the relation between police contact and

mental health. 41,47 They find that the relationship between direct and vicarious police contact and depressive symptoms concentrates among Black Americans and women. 41 Scholars examining stressful police stops among at-risk youth, over time, report that age did not correlate with adverse mental health. 48 However, repeated police stops, stops at school, and officer intrusiveness preceded increases in emotional distress and post-traumatic stress. 48 Using population-representative data from the National Longitudinal Survey of Adolescent to Adult Health, researchers examined whether police stops preceded mental health symptoms among Black American and white young adults. 39 Encounters with police preceded increases in mental health symptoms among both race/ethnicities. 9 For Black Americans, previous criminal justice contact and criminal behavior attenuated the relation suggesting that adolescents who have frequent contact with the justice system may not have as extensive mental health symptoms. Alternatively, those with previous criminality may also experience symptoms through more externalizing channels, such as violence, as opposed to internalizing characteristics such as depression and anxiety. Among whites, by contrast, past criminal behavior explained much of the relation between the exposure and outcome. 39

Literature documents an increase in mental health symptoms following individual involvement with the criminal justice system through police encounters and incarceration. A0,41,49 Research also indicates that parental incarceration precedes greater adverse mental health among adolescents. A3,44,50 However, limited research examines the spillover effects concerning mental health, of such exposures. In the field of Economics, spillover effects — also known as externalities — occur when costs or benefits influence a third party not directly involved in the event. Spillover effects may exert positive or negative influences, depending on whether costs or benefits spillover onto others. Police encounters or incarceration may have negative spillover effects onto individuals not directly tied to the event, indicating population-level

changes in mental health, by way of unfair discrimination, hypervigilance, vicarious racism, the disruption of familial networks, and the erosion of social capital and control.

A few foundational studies invoke prior theory and investigate the spillover effects of police stops, police killings of unarmed Black Americans, and incarceration as they relate to mental health symptoms at higher levels of social ecology (i.e., neighborhood- or county-level). Theory and empirical findings from these studies may indicate heightened psychiatric help-seeking among Black Americans following increases in regional indicators of structural racism in the criminal justice system: 1) police stops; 2) police killings of unarmed Black Americans; and 3) incarceration.

Police stops and psychological distress

Recent literature has examined the collateral consequences of aggressive policing in communities. Sewell, Jefferson, and Lee examine the relation between neighborhood-level aggressive policing and psychological distress in New York City. ⁵² Past studies indicate that police stops have become chronic stressors in certain neighborhoods. ^{53,54} The over-policing and hyper-surveillance coupled with the repetitive nature of stops, in racial/ethnic communities, may portend greater adverse mental health. The theoretical mechanisms by which this may occur include 1) unfair discrimination; and 2) hypervigilance.

Brunson and Miller (2008) find that when policing in neighborhoods frequently escalates to frisking and use of force, residents perceive stops as discriminatory and unfair.⁵³ Perceived unfairness from discrimination, as evidenced by Kessler et al., correlates with psychological distress.³⁰ Additionally, many scholars report that residents live in a climate of fear from the

potential of criminalization.^{55–58} This circumstance creates greater hypervigilance which may not only spur physiological changes but may also lead to greater anxiety and depression.⁵⁵

In the NYC study by Sewell and colleagues (described above), the Authors utilize the Kessler-6 measure of psychological distress as their outcome. ⁵² As their exposure, they aggregate three measures of police stops at the neighborhood level: 1) total stops; 2) proportion of police stops including frisking; and 3) proportion of police stops including use of force. They report that overall stops do not correspond with psychological distress. ⁵² Neighborhood-level police stops including frisking and use of force, however, correspond with greater mental health symptoms overall, including severe feelings of nervousness and worthlessness. ⁵² After stratifying by gender, this relation concentrates among men as opposed to women. ⁵²

This study has limitations that I aim to address in my research. The Authors did not examine how police stops correspond with mental health by race/ethnicity. Black Americans comprise the majority of police stops during New York City's Stop, Question, and Frisk policy as compared to other race/ethnicities.⁵⁹ As such, this exposure may particularly influence Black American mental health through theoretical pathways such as hypervigilance and unfair discrimination. Additionally, I intend to examine whether police stops conducted during the policy may extend to more acute forms of adverse mental health, such as psychiatric help-seeking. Lastly, this study did not investigate the natural experiment that the exposure presents.⁶⁰ In 2013, a class action lawsuit found the NYPD liable for racial profiling and unconstitutional stops.⁵⁹ This ruling preceded a substantial drop in police stops, especially among Black Americans.⁵⁹ I intend to utilize the lawsuit as an exogenous shock that may precede a decrease in mental health emergencies among Black Americans.

Police remain 3.5 times more likely to kill Black Americans than whites, after adjusting for criminality. ^{61,62} Black Americans have 1.5 times the likelihood of being unarmed when killed compared to whites with similar criminal disposition. ^{61,62} A manuscript written by Bor and colleagues examines whether police killings of unarmed Black Americans precede increases in population-level mental health among Black Americans at the county level. ⁶³ The Authors utilize vicarious racism as the primary theoretical mechanism by which this relation may occur.

Research suggests that individuals of color can experience racism vicariously, wherein individuals indirectly experience racism targeted at other persons of color. 41,64 Studies also suggest that Black Americans and other racial/ethnic minorities experience vicarious racism frequently. 65,66 Two studies indicate a relation between vicarious racism and adverse mental health. Mason and coauthors examined mental health among Black Americans young adults following the George Zimmerman and Trayvon Martin trial. They report that racial identity intensified negative psychological reactions among Black American young adults. This work suggests that components of racial identity sensitize Black Americans to incidents of racism that happen to other Black Americans, leading to negative psychological reactions when these events occur. Turney (2020) also reports increases in depressive symptoms following vicarious interactions with the police, after controlling for prior mental disorder, delinquency, and impulsivity. Turney reports that the relation concentrates among Black Americans and girls. Turney reports that the relation concentrates among Black Americans and girls.

Bor and colleagues (described above) utilize the Behavioral Risk Factor Surveillance System (BRFSS) from 2013-2015 for their outcome: the number of days in the previous month in which individuals reported their mental health as "not good". As their exposure, they obtained the Mapping Police Violence dataset from 2013-2015 for data on police killings of unarmed Black

Americans.⁶³ They found an increase in bad mental health days among Black Americans, in the general population, during the concurrent month and the month following the police killing.⁶⁷

Using a similar theoretical framework, Curtis and colleagues assess whether public anti-Black violence corresponds with poor mental health days among Black Americans and national measures of psychological distress.⁶⁸ Public anti-Black violence included police killings of Black Americans, decisions not to indict or convict officers involved in police killings, and hate crime murders.⁶⁸ The Authors utilize interrupted time series methods to account for autocorrelation and seasonality and report that Black Americans experience 0.26 greater poor mental health days during weeks with two or more racial incidents relative to none.⁶⁸ As a falsification, they examined whether this relation held among white populations and the authors report no relation between incidents of public anti-Black violence and poor mental health days among white individuals.⁶⁸ However, when assessing national measures of psychological distress as a function of incidents of police killings of Black Americans, individually, the Authors report an inverse relation.⁶⁸ They find no relation between police killings of Black Americans and poor mental health days in the Black community.⁶⁸

These studies include limitations. Scholars suggest that Black Americans lead all other race/ethnicities in chronic depression, with over 56% experiencing prolonged depressive symptoms. ²⁰ I do not know whether exogenous shocks, such as police killings of unarmed Black Americans, may further exacerbate population-level mental health symptoms, requiring emergency assistance, among Black Americans. Additionally, the two studies find conflicting results when examining poor mental health days among Black persons as a function of police killings of Black Americans. ^{67,68} This may result from the researchers aggregating police killings of the armed and unarmed status of the individual, as the exposure, whereas Bor and colleagues examine adverse mental health resulting from police killings of unarmed Black Americans. ^{67,68}

The US criminal justice system comprises 2.3 million individuals, or 700 per 100,000 population. Black American men have eight times the likelihood of going to prison than white men. Phe prison boom of the 1980s and 1990s, or what scholars refer to as mass incarceration, specifically increased imprisonment of low-income and less educated Black American men. Siegiven this background, Hatzenbuehler and colleagues investigated whether residence in neighborhoods with high incarceration preceded greater psychiatric morbidity among non-incarcerated community members. The authors invoked two primary mechanisms by which greater incarceration rates may increase adverse mental health among non-incarcerated community members: disruption of familial networks and the erosion of social capital and control.

Incarceration may create strain and loss of support, both monetary and non-monetary, for families involved in the penal system. T1,72 Incarceration also contributes to the loss of workingage adults within communities, the separation of families, and the disruption of adolescent development among those with incarcerated parents. Scholars theorize that incarceration may break down social capital and social control within neighborhoods. Although various definitions exist, the Organization for Economic Co-operation and Development defines social capital as ...networks together with shared norms, values, and understandings that facilitate cooperation within or among groups. Commonly utilized to understand crime and delinquency, social control refers to societal processes that regulate individual and group behavior to gain conformity to established norms or rules. Researchers in the field utilize Shaw and McKay's social disorganization theory to conceptualize the effects of incarceration on social control. This theory posits that communities with high levels of aggregate poverty, joblessness, and single-parent households do not submit to social controls.

assertion that communities lacking social integration – through religion, family, community, or employment – may lack adequate social control to function adequately.⁷⁷

A small subset of studies has examined the empirical relation between incarceration and its indirect influence on family networks, social capital, and social control.⁷⁵ Some scholars report that imprisonment reduces labor force participation and income at the individual- and countylevel. 75 Prison admission rates also correspond positively with the number of female-headed household in urban counties among Black Americans as opposed to whites.⁷⁵ Qualitative work has further investigated the influence of incarceration on partners and families of male prisoners. 78 One study reports that female partners experience severe financial hardship and difficulty caring for children alone. 79 Another study examines the relation between neighborhood incarceration rates and collective efficacy and community solidarity.⁸⁰ Scholars define collective efficacy as a group's belief in their ability to organize and execute courses of action required to manage future situations.⁸¹ Researchers find conflicting results depending on the outcome variable used. They document a positive relation between neighborhood incarceration and collective efficacy, but also report an inverse relation between neighborhood incarceration and community solidarity.⁸⁰ These conflicting results may arise in part due to the potential societal benefit in which incarceration reduces the prevalence in the community of criminally-involved persons. The ambiguity of the expected association between incarceration and community mental health, therefore, would appear to call for a two-tailed test.

Using these theories and prior empirical literature to examine incarceration and mental health among non-incarcerated community members, Hatzenbuehler and colleagues conducted four telephone surveys from 2008-2011.⁷⁰ As their exposure, they utilized prison admission rates per 1,000 adults from the Justice Atlas of Sentencing and Corrections.⁷⁰ They designated zip codes as having low or high incarceration.⁷⁰ As their outcome they obtained Patient Health

Questionnaire-9 and Generalized Anxiety Disorder-7 scales to determine depression and anxiety symptoms.⁷⁰ Their findings indicate that individuals living in neighborhoods with greater prison admission rates correspond with greater current and lifetime depression and anxiety, as compared to individuals living in neighborhoods with lower prison admission rates.⁷⁰

Hatzenbuehler and colleagues' study, while suggestive, has limitations. Incarceration's influence on mental health may differ by race/ethnicity, given the substantial disparity in incarceration among Black Americans (vs. whites). Additionally, incarceration may precede changes in more acute forms of adverse mental health such as psychiatric help-seeking in the Black community. Lastly, incarceration has shown substantial variation over the past decade due to changes in state-level drug reform policies. Evaluation of multiple counties would leverage changes in incarceration across the US. County-level analyses may also assess whether changes in psychiatric help-seeking extend to ecological units beyond the neighborhood-level.

In Chapters 2, 3, and 4 I will utilize three indicators of structural racism in the justice system (police stops, police killings of unarmed Black Americans, and incarceration) to estimate the extent to which they vary with population-level changes in mental health emergencies in the Black community.

CHAPTER 2: NEW YORK CITY'S STOP, QUESTION, AND FRISK POLICY AND PSYCHIATRIC EMERGENCIES AMONG BLACK AMERICANS¹

.

¹ This article was published in Journal of Urban Health, 100, Das, A., Bruckner, T.A., New York City's Stop, Question, and Frisk Policy and Psychiatric Emergencies among Black Americans, 225-268, Copyright Springer Nature (2023).

Introduction

In 2011, the New York Police Department (NYPD) conducted 685,000 police stops under the Stop, Question, and Frisk (SQF) Policy. 82 Black and Hispanic New Yorkers accounted for more than 80% of police stops, despite comprising less than 50% of the population. 82 Although stops increased substantially under the SQF policy, 90% of stops resulted in no arrest. 82 Scholars find racial disparities in police stops with one study reporting that the NYPD stopped Black Americans at greater than two times the rate of whites, after controlling for arrests and precinct differences. 83,84 Racial disparities also exist in post-stop outcomes, such as frisking and use of force. 85 Scholars posit that police stops serve as the most common institutional source of maltreatment among Black, Indigenous, and People of Color (BIPOC) communities. 86 The racial bias in police stops therefore incites greater distrust of police and holds broader health implications in these communities. 86

Based on Broken Windows Policing, the SQF policy directed police action against lower levels of crime to create greater social order and prevent the proliferation of more serious crimes. The concept of broken windows policing, developed in 1982, utilizes empirical evidence from a 1969 experiment in which social psychology researchers placed two abandoned cars in Palo Alto, CA and Brooklyn, NY. Individuals vandalized and removed parts of the car in Brooklyn almost immediately. The car placed in Palo Alto, however, remained untouched until researchers began to break its windows at which point individuals also started vandalizing the car. The theory claims that the juxtaposition between Brooklyn and Palo Alto illuminates the breakdown of social control within communities and posits that even communities such as Palo Alto, with residents of higher socioeconomic status, can become unstable when undesirable public behavior remains neglected. This may allow for more serious crimes to flourish as property becomes abandoned, families leave, and individuals gather on street corners. The Broken Windows theorists argue that the police's role remains reinforcing informal control within

communities to prevent "broken windows" rather than protecting communities and their individuals.⁸⁷

Broken Windows theorists misconstrued findings from the original social psychology experiment in 1969 as social psychologists posited that a breakdown of social cohesion produces greater anonymity and that individuals outside the conventional social reward structure remain apathetic towards traditional social norms. Additionally, a number of studies have since disproven the validity of Broken Windows theory, wherein police action against lower levels of crime does not reduce the occurrence of more violent crimes. Nevertheless, as a result of Broken Windows Theory, the SQF policy allowed officers to stop, question, and search individuals under reasonable suspicion in the early 2000s.

Substantial research finds disproportionate police practices and misconduct on the Black community including surveillance, stops, disrespectful treatment, verbal abuse, police deviance, arrests, and fewer police protections. Distrust in the police results from personal experiences, as well as the overall nature of policing within Black communities. Scholars find that Black perceptions of unfair treatment from the police results regardless of whether police behavior meets legal standards. Some qualitative research finds that proactive policing from frequent pedestrian and police stops becomes regarded as unfair and routine harassment within a community. In a nationally representative study, Kessler and colleagues find that perceptions of unfairness from discrimination correspond with greater psychological distress and Major Depressive Disorder. After disaggregating results by types of unfairness from discrimination, the Authors report a positive relation between being hassled by the police and Major Depressive Disorder. Additionally, scholars report that residents live in a climate of fear from the potential of criminalization. Scholars report that residents live in a climate of fear from the potential of criminalization. This circumstance creates greater hypervigilance in which individuals constantly assess potential threats and exhibit a state of increased alertness.

suggests that police altercations, as opposed to community violence, result in greater hypervigilance and physiological changes such as higher blood pressure.⁵⁷ Additionally, indepth qualitative interviews with Black men in urban cities find that following police interactions, individuals experience greater anger and sadness, psychophysiological symptoms of hypervigilance, avoidance, and dissociation, as well as concerns and fear of fatal targeting by police.^{57,92} Scholars also find that youth with anticipatory stress from police violence experience greater symptoms of anxiety, depression, and post-traumatic stress disorder.⁹⁴

Much literature examines the mental health of individuals following police stops. Longitudinal studies, following Black youth over time, find that individuals experience greater depressive and post-traumatic stress symptoms, as well as heightened anger, feeling unsafe, and emotional distress following police stops. 41,48,95,96 Additionally, one cross-sectional study reports elevated mental health symptoms among men living in neighborhoods with heightened police stops. 56 Other scholars report that individuals living in neighborhoods with greater police stops and reporting poor health show less frequent use of the Emergency Department (ED) due to "system avoidance". 97,98 Justice-involved individuals may avoid surveilling institutions that implicate criminality. 98 Another study examined police stops in New York City (NYC) during SQF and reported that neighborhood-level police stops including frisking or use of force correspond with greater mental health symptoms, including severe feelings of nervousness and worthlessness. 52

The current literature, although suggestive, remains limited in the following ways. First, previous work is cross-sectional and therefore cannot examine whether police stops during SQF in NYC preceded greater help-seeking for psychiatric conditions—including among those not directly involved in the stop. Police stops may affect not only Black Americans who themselves are stopped, but also a broader group who senses elevated hypervigilance by the State, or heightened targeting in their community. Additionally, although scholars have previously

reported greater mental health symptoms in neighborhoods with heightened police stops during the SQF policy, I examine whether police stops may influence more acute forms of adverse mental health that require emergency psychiatric care.

Second, an examination of police stops and ED visits has previously assessed overall ED utilization rather than psychiatric help-seeking in the ED. Unlike overall ED utilization, Black Americans – despite notions of "system avoidance" – continually show disproportionate use of emergency psychiatric services. ⁹⁹ Researchers find that in addition to mental health system characteristics, such as access to outpatient care, sociocultural and community characteristics play a role in the disparate use of the ED for psychiatric care. ⁹⁹ Characteristics such as personal distress in disadvantaged communities and greater stigmatizing attitudes towards routine mental health treatment contribute to the overuse of the ED setting for psychiatric care by Black Americans in the US. ⁹⁹ Scholars further find that untreated mental illness often results in seeking emergency care. ⁹⁹ Increased police stops may especially incite greater psychiatric help-seeking by way of greater perceived discrimination and hypervigilance.

Third, previous ecological research on police stops during SQF and mental health does not examine racial/ethnic differences. At the height of the SQF policy, Black Americans in NYC comprised 52% of police stops and only 23% of the population. Hispanic populations also experienced a disproportionate number of police stops when compared to the ethnic makeup of NYC (31% of stops vs. 29% of the population), although to a much lesser extent than do Black individuals. Additionally, Hispanic communities, on average, report fewer mental health concerns than do native-born Americans, often referred to as the "Hispanic Paradox." This paradox has also been shown in Black populations; however, studies report that differences in symptom expression as well as underdiagnosis of mood disorders by clinicians may drive the Black-white paradox. Moreover, frameworks such as the Environmental Affordances

Model posit that Black populations cope with additional exposure to stressors by engaging in unhealthy behaviors. ²² This coping leads to greater physical illness but protects against mental illness by way of physiological pathways. ²² Researchers, however, find conflicting empirical evidence to support the model when examining nationally representative samples, over time. ²³ For these reasons, I focused on the relation between SQF and mental health among Black (relative to white) residents. As such, this exposure may particularly influence mental health in the NYC Black community more broadly through unfair discrimination and hypervigilance. Given that Black Americans also show the highest prevalence of chronic Major Depressive Disorder, elevated hypervigilance as a result of SQF may lead to an increase in psychiatric emergencies in this subgroup. ²⁰

Fourth, no research has measured the relation between SQF police stops and mental health among Black Americans following the Floyd et al. v. City of New York class action lawsuit in which police stops substantially decreased for Black and Latinx communities. The landmark ruling found the NYPD liable for violating the Fourth Amendment by conducting unreasonable searches in a racially discriminatory manner. The significant decrease in police stops following the lawsuit may coincide with changes in mental health in the Black community, while also demonstrating the influence of class action lawsuits against police in other urban localities with racially disparate police stops.

I address these limitations and extend previous literature by examining whether police stops during NYC's SQF policy correspond positively with greater psychiatric ED visits among Black Americans. I leverage month-to-month variation in police stops and psychiatric emergency department visits among Black Americans in NYC between 2006-2015. Given the study design characteristics of the analysis, results may hold particular relevance to understanding the

potentially causal role of hypervigilance and discrimination from police encounters on Black Americans' mental health.

Materials and Methods

Study Population

I retrieved the outcome, incidence of outpatient psychiatric ED visits among non-Hispanic Black Americans, from the Statewide Emergency Department Database (SEDD). 105 Under the Healthcare Cost and Utilization Project, the Agency for Healthcare Research and Quality makes SEDD available for purchase. Participating states provide information on over 99% of all outpatient ED visits through SEDD. 105 SEDD contains encounter-level information on all hospital-affiliated ED visits. 105 The psychiatric epidemiology literature consistently uses this high-quality database. 106–108 I selected the five counties within NYC which correspond with the five boroughs in the city (New York County – Manhattan, Kings County – Brooklyn, Bronx County – Bronx, Richmond County – Staten Island, and Queens County – Queens). 109 These data uniformly report county identifiers, race/ethnicity, and month of visit, allowing for time series analysis at the city-month from 2006-2015. 105 The NYPD comprises 77 police precincts within NYC that span its five boroughs. 110 Given that the SQF policy directed NYPD actions within the entire city of New York, I aggregated data to the NYC level to capture whether the policy coincided with city-level mental health sequelae among Black Americans.

Measures

I retrieved outpatient psychiatric ED visits from encounter-level diagnoses of ICD-10 codes for psychiatric disorders among Black Americans. Consistent with previous literature, I classified psychiatric ED visits using ICD-10 diagnostic codes contained within Clinical Classification Software (CCS) categories for psychiatric disorders (including mood, anxiety, conduct, behavioral disorders, self-harm, suicidal ideation, substance use, and others).^{106–108} I obtained

monthly counts of psychiatric ED visits among Black and white individuals in NYC from 2006 to 2015.

For the exposure, I obtained administrative data on pedestrian police stops from 2006-2015 from the New York City Police Department's New York City - Stop, Question, and Frisk database. 111 This database enjoys widespread use in the literature. 52,83,86 The NYPD conducts multiple audits to ensure the validity of police stops.⁸⁴ Although stops may occur that police do not document, the police department incentivizes officers by having police stops serve as an indicator of productivity. These data provide stop-level information on race/ethnicity, date of stop, and post-stop outcomes. 111 I examined monthly counts of police stops and two post-stop outcomes among Black Americans: stops including frisking and use of force. Stops including frisking involve patting hands over a pedestrian's clothes and through pockets. 111 Use of force measures nine outcomes: use of officer's hands, placing a suspect on the ground, placing a suspect against the wall, drawing the officer's weapon, pointing the weapon at the suspect, using a baton, using handcuffs, using pepper spray, or using another physical object. 111 Consistent with previous literature, I examined stops including frisking and use of force independently as they provide differential and sequential levels of physical contact and violence that may uniquely coincide with adverse mental health in the broader population.⁵² Additionally. in keeping with prior work on criminal justice exposures and mental health outcomes, I specified 0- to 3-month lags in which police stops may precede help-seeking among Black Americans. 67,112 Lagged dependent variables not only establish temporal order between the exposure and the outcome, but also greater context regarding the induction of mental health outcomes. Specifically, previous work utilizes a three-month induction period as adverse mental health or psychiatric help-seeking may require longer amounts of time to manifest than the concurrent month. ^{67,112} Justice system exposures have previously shown to correspond with mental health outcomes up to three months following the event. 67,112 Together, the NYC

psychiatric ED and police stop data created a time series of 120 months from January 2006 to December 2015.

Analysis

I test whether psychiatric ED visits increase within 0-3 months following total police stops. Previous literature has utilized an induction period of three months for mental health outcomes.^{67,112} I then test psychiatric ED visits as a function of two subsets of overall police stops: 1) stops including frisking; and 2) stops including use of force. Psychiatric ED visits may exhibit patterns over time, also referred to as autocorrelation.^{113,114} Autocorrelation may include trend, seasonality, or the tendency to remain elevated or depressed following high or low values.^{113,114} Autocorrelation violates the assumption of correlational tests because, in this case, the expected value of psychiatric ED visits in any month would not equal the mean value of psychiatric ED visits across all months, but rather the values predicted from autocorrelation.^{113,114}

To address this issue, I conducted Autoregressive, Integrated, Moving Average (ARIMA) analysis methods using Scientific Computing Associates (SCA) software.¹¹⁵ I utilized the following steps, consistent with the time-series literature, to identify and remove autocorrelation:

- 1. I regressed monthly counts of psychiatric ED visits among whites to remove autocorrelation shared with Black Americans.¹¹⁶ The use of non-Hispanic white psychiatric ED visits as a control variable adjusts for well-documented secular increases in help-seeking for psychiatric care in the US, as well as shared seasonality and other patterns in ED utilization across the two race/ethnicities.¹¹⁴
- 2. I used Box-Jenkins time series methods to identify and model autocorrelation in the residuals of the monthly counts of psychiatric ED visits for Black Americans.¹¹⁶

- 3. I added the SQF exposure variable and specified a Box-Jenkins test equation accounting for autocorrelation. I added 0–3-month lags to the exposure variable, consistent with previous research which has reported a three-month induction period.¹¹⁶
- 4. I estimated the following equation:

$$BV_t = c + \omega 1WV_t + \omega 2BP_t + \omega 3BP_{t-1} + \omega 4BP_{t-2} + \omega 5BP_{t-3} + (1-\theta B^q)/(1-\phi B^p) a_t$$

Where

 $\mbox{\bf BV}_t$ is the count of psychiatric ED visits among Black Americans in month t

c is a constant

ω1 through ω5 are effect parameters

WV is the count of psychiatric ED visits among whites in month t

BP_{t-1} through **BP**_{t-3} are the lagged count variable of Black American police stops in months t, t-1, t-2, t-3

 θ is a moving average parameter

φ is an autoregressive parameter

B is the "backshift operator," or value of a for month t-q or at month t-p at is the residual of the model at month t

 I conducted an outlier analysis to determine whether outliers in psychiatric ED visits among Black Americans distorted the estimation by inflating standard errors and whether high or low values drive the association.

- 6. I conducted a sensitivity analysis in which I utilized police stops, stops including frisking, and stops including use of force that did not result in an arrest. This analysis accounts for arrests that may have resulted in psychiatric ED visits.
- 7. I conducted a falsification test in which I assessed whether police stops among Black Americans corresponded with increases in psychiatric ED visits among whites.
- 8. I estimated whether the reversal of the SQF policy, through the Floyd et al. class action lawsuit, and the subsequent decrease in police stops correspond with lesser than expected psychiatric ED visits among Black Americans. I indicated May 2012 as the starting point for SQF's reversal as the Judge residing on the case ruled it a class action lawsuit during this month. Specifically, individuals unconstitutionally stopped by the NYPD in NYC since January 2005 could claim themselves as a plaintiff in the lawsuit, making the case larger in scope than when initially filed in January 2008. For the exposure, I created a binary indicator for the class action lawsuit (0; before the lawsuit, 1; after the lawsuit) for the 120 months in the time series.

The institution's Institutional Review Board deemed this study exempt owing to the use of publicly available, de-identified data. The National Institute of Mental Health (R21 MH110815) provided support for this study.

Results

Figure 2.1 plots the observed count of psychiatric ED visits among Black Americans in NYC (mean monthly count = 7,819.63; SD=2,668.10). Black Americans in NYC have a mean monthly count of 18,235.03 police stops (SD=10,621.21) with a range of 626 to 36,346 stops (Table 2.1). Figures 2.2-2.4 show the observed count of police stops, stops including frisking, and stops

including use of force among Black Americans over 120 months (January 2006-December 2015). Stops including use of force account for between 20% to 35% of all police stops (depending on the month).

As described in the *Materials and Methods*, I began my analyses by building a base model in which I estimated monthly changes in psychiatric ED visits among Black Americans as a function of the monthly changes in psychiatric ED visits among whites (Figure 2.6). The Autocorrelation Function and Partial Autocorrelation Function revealed patterning and I inserted an autoregressive parameter at lag one month to control for the observation that high or low values of ED visits were followed, albeit in diminishing amounts, with similarly high or low values one month later. After adding the police stop exposure variable, I detected high or low values in psychiatric ED visits that 'echoed' at month five and therefore inserted another autoregressive parameter at lag five months. The residuals of this equation exhibited no remaining autocorrelation, had a mean of zero, and all estimated ARIMA coefficients exceeded at least twice their standard errors. Figure 2.5 plots the residual count of psychiatric ED visits among Black Americans after removal of autocorrelation.

Table 2.2 presents results from the three final models predicting psychiatric ED visits as a function of (i.) police stops, (ii.) stops including frisking, and (iii.) stops including use of force. Total police stops coincide with an increase of 0.02 psychiatric ED visits among Black Americans in the same month [95% CI= 0.006,0.043] (Model A). Similarly, stops including frisking and stops including use of force show a positive relation with psychiatric ED visits in the same month (for frisking, coef: 0.05, [95% CI= 0.015,0.080] and for use of force, coef: 0.11, [95% CI= 0.028,0.190] (Model B&C). Results from the outlier adjusted models produced a similar inference to the original tests (Table 2.3).

To give the reader a sense of the magnitude of the relation, I estimated (from Table 2.2) the number of psychiatric ED visits among Black Americans statistically attributable to one standard deviation increase in all police stops, stops including frisking, and stops including use of force. The monthly standard deviation in the count of all stops (10,621.21) multiplied by the coefficient in Table 2.2 (0.02 at no lag) indicates 212.42 greater than expected psychiatric ED visits among Black Americans per month in which police stops for Black Americans rose by one standard deviation. Application of this increase to the mean equates to 2.72% increase in psychiatric ED visits among Black Americans in these months. Using the same method, a standard deviation increase in stops including frisking equates to a 3.78% increase, and for stops including use of force, I find a 3.71% increase in psychiatric ED visits among Black Americans.

Some police stops may result in a police-initiated psychiatric ED visit. As such, I conducted a sensitivity analysis in which I removed from the exposure variable police stops that resulted in an arrest. I then examined its relation with psychiatric ED visits. This sensitivity analysis examines whether the detected positive relation in the original test could arise from arrests that "convert" into a police-initiated psychiatric ED visit. Inference from the sensitivity analysis, however, remains essentially unchanged from the original findings (Table 2.4), which precludes the possibility that this explanation drives the results. I also estimated, as a falsification test, whether police stops among Black Americans coincided with psychiatric ED visits among whites. I find no relation between police stops, frisks, or use of force among Black Americans and psychiatric ED visits among whites during the study period (Table 2.5). Lastly, I assessed whether reversal of the SQF policy, through the Floyd et al. class action lawsuit against the NYPD, and the subsequent decrease in police stops precedes a decrease in psychiatric ED visits among Black Americans. The Floyd et al. class action lawsuit does not correspond with a decrease in psychiatric ED visits in the NYC Black community (Table 2.6).

Discussion

The NYC SQF policy increased the number of stops by 600% from 2002 to 2011. Even after adjustment for arrest rates and precinct differences, studies report that police disproportionately stopped Black and Hispanic individuals. ^{83,84} I examined whether police stops and stops including frisking or use of force correspond with an increase in psychiatric ED visits among Black Americans. I find that monthly police stops modestly correspond with detectable increases in psychiatric ED visits in that same month. All police stops, stops including frisking, and stops including use of force vary positively with psychiatric help-seeking for a broader population of Black Americans, much of whom are unlikely to have been directly connected to any stop and frisk event.

Theories on policing and the Black American experience offer a plausible explanation for these results. Police encounters as well as greater frisking and use of force may correspond with increased perceptions of unfair discrimination and the need for emergent psychiatric care. 30,90 This response may occur by way of greater depressive and anxiety symptoms or by an acute awareness of these existing symptoms. 30,90 My findings further support this notion in that frisking has a stronger relation than does regular stops, and stops with use of force show the strongest relation. Use of force may have the greatest mental health consequences due to perceived threats of physical violence or bodily harm to other members of the targeted group. Further research would benefit from examining whether police stops may precede greater ED visits associated with physical health such as cardiac arrest. Psychiatric ED utilization comprises visits related to various mental health diagnoses including anxiety, depression, and substance use. 117 I urge future work to develop hypotheses about diagnostic-specific responses and investigate whether a subset of these ED visits increases in months of heightened police stops. Additionally, the influence of police stops on psychiatric help-seeking and mental health symptomology may decrease over time. The study reports heightened psychiatric help-seeking

only in the concurrent month and not months following an increase in police stops. This may build on the current theoretical understanding of policing and health as the psychiatric effects remain immediate and do not last over a long period of time. Use of datasets such as the Fragile Families and Child Wellbeing Study may further examine whether this phenomenon occurs among Black youth or adults over the life course.¹¹⁸

Strengths of the study include that I measure a time-varying aspect of a plausible manifestation of structural racism, which allows us to rigorously examine the relation between police stops and a clinically meaningful health outcome (i.e., psychiatric ED visit). The associations, moreover, cannot arise from shared seasonality or a 'third variable' that exhibits autocorrelation (i.e., arrests for criminal activity), because I removed such autocorrelation from psychiatric ED visits among Black Americans. Identifying the temporal behavior of the outcome and using that as an independent variable removes the possibility that a 'third variable' drives a relation between the exposure and the outcome. 114 This method derives from the Granger-Weiner rule in which the exposure cannot cause an outcome unless it predicts the outcome better than the history of the outcome itself. 114 Adjusting for psychiatric ED visits among whites also minimizes the threat of confounding by variables that influence help-seeking of psychiatric ED visits in both whites and Black Americans. 114 Removing trends and seasonality after controlling for white ED utilization also adjusts for differences in the level of help-seeking whites and Black Americans. Additionally, I used a comprehensive dataset comprising the census of psychiatric ED visits in NYC spanning the five counties (boroughs). I also utilized clinically diagnosed psychiatric ED visits based on ICD-10 codes. Lastly, I obtained surveillance data on Black American police stops that plausibly capture the mental health effects of others in the Black community. 119,120

Limitations include the inability to examine whether police initiated a psychiatric ED visit among individuals they stopped. Individual-level registries or information on police-initiated ED visits

may provide the data necessary to conduct such a test. Although the SEDD does not provide information on police-initiated ED visits for the state of New York, I approximated police-initiated ED visits by analyzing stops that did not result in an arrest and the possible transfer to an ED or an involuntary commitment. 105 Results remain consistent with the original findings for stops including frisking and stops including use of force. In addition, the discovered coefficients likely represent the lower bound of acute mental health in the population as not all individuals with acute symptoms seek emergency psychiatric care. Lastly, the intensity of police stops may vary by NYC borough or police precinct. Further analysis at more finely-grained geographic and spatial resolution (i.e., NYC United Hospital Funds, census tracts) may provide targeted, neighborhood-level identification of the relation between police stops and psychiatric emergencies. However, given that the SQF policy encompassed all of NYC, a policy-relevant examination of the external validity of my results appears warranted. Cities such as Los Angeles, for example, currently surveil and report racial disparities in police stops; such data, when combined with psychiatric ED data, may permit replication of this work. 121 In addition, the results may hold relevance to other urban areas as researchers find a higher prevalence of smoking, physical inactivity, and poor physical health in neighborhoods that experience more police encounters (e.g., in New Orleans). 122

The SQF policy not only targeted racial/ethnic minoritized groups but also directed police action against men in NYC – with men constituting 88% of police stops. ⁸⁴ One study also reports greater post-stop outcomes (i.e., frisking, use of force, arrests) among Black men and women than their white counterparts. ¹²³ Although I did not have any specific hypotheses regarding the gendered component of NYC's SQF policy, I speculate that theories on intersectionality and Black feminist theory may provide further insight into heightened adverse mental health following aggressive policing. ¹²⁴ Overlapping and interdependent systems of discrimination and disadvantage, resulting from intersectionality, may particularly have health implications from

policing in the Black community. Moreover, examining subgroups within the Black community that police may not have targeted (i.e., women, older adults) could assess the complexities of the spillover effects of aggressive policing practices.

Previous literature finds police killings of unarmed Black Americans precede an increase in bad mental health days and ED visits for depression among Black Americans.^{67,112} The police killing of George Floyd prompted urgent calls for racial equity in policing and other systems in the US – bringing concerns of structural racism to the forefront. Researchers also report that police killings of unarmed Black Americans may serve as indicators of structural racism.^{67,112,125,126} The SQF policy, and the disproportionate police stops among Black and Hispanic communities, may constitute as a structurally racist policy in the criminal justice system.

Origins of the Black Lives Matter movement began following the police killing of Trayvon Martin and the subsequent acquittal of Officer George Zimmerman in 2013. Demonstrations and protests supporting the movement have continued following police brutality and killings in later years. A systematic review on the influence of protests and riots on mental health finds that a majority of studies report an increase in depression following a major protest. This relation persists regardless of personal involvement in protests, suggesting a broader influence on a community. However, a few studies suggest that protests may reduce depression due to greater collective action and social cohesion. These results warrant further investigation into the potential benefits of collective action and whether the Black Lives Matter protests may have a protective influence on psychiatric help-seeking.

Black American youth suicides have increased drastically in the past two decades, with certain age groups surpassing rates of whites. ^{129,130} Risk factors include, among others, exposure to trauma and racial discrimination. ¹³¹ A current body of literature finds that police stops precede

greater adverse mental health in youth. 41,48,95,96 However, police encounters may also influence youth suicide rates in the Black community given that psychiatric disorders remain a significant risk factor for suicide. 132 Literature also reports that youth involved in the juvenile justice system have higher rates of mental health disorders and traumatic experiences. 133,134 An important priority of subsequent research in this area involves an examination of whether racially biased and unconstitutional police encounters among Black youth may worsen various aspects of mental health in this high-risk population.

In August 2013, the Floyd et al. v. City of New York class action lawsuit found the NYPD liable for a pattern and practice of racial profiling and unconstitutional stops. ¹⁰⁰ Following the landmark ruling, NYPD police stops declined by approximately 96%. ⁵⁹ Scholars assessing whether the ruling preceded a decline in racial disparities in stops, found that Black Americans have a lower likelihood of police stops, frisks, and use of force following the 2013 ruling. ¹³⁵ The study used both external and internal benchmarking methods (e.g., race of the residential population, similarly situated stops) to report that the racial composition of census tracts no longer predicted stops, frisks, or use of force rates after accounting for reported crime, socioeconomic factors, and police precincts. ¹³⁵ Their analysis of similarly situated stops indicated that differences in stops by race/ethnicity declined substantially following the class action lawsuit. ¹³⁵ Although studies on the Floyd et al. class action lawsuit remain limited, another study finds an inverse relation between the lawsuit's ruling and complaints for crime in NYC; however, results do not reach conventional levels of statistical detection. ¹³⁶

My analysis also does not report changes in psychiatric help-seeking following the class action lawsuit. Both studies conducted previously utilized annual data from before and after the ruling and indicated 2013 as the year in which the ruling took place. Since my study leveraged monthly resolution, I indicated May 2012 as the month in which the lawsuit took place, given

that it became much larger in scope as a class action matter for the NYPD. The timing of the ruling remains questionable as the lawsuit spanned 2008 to 2013 with police stops peaking in 2011 and becoming class action in 2012. My inconclusive findings may also reflect the need for further investigation at more granular geographic units such as boroughs, census tracts, or NYC United Hospital Funds. Place may particularly play a role as indicated in MacDonald and colleagues' finding that racial disparities in police stops decrease following the ruling by census tract-year. Smaller units of aggregation, as opposed to a city-wide evaluation, may specifically examine areas in which police stops decreased below expected values for minoritized race/ethnicities following the ruling. Given that healthcare catchment areas in NYC do not overlap with police precincts, this assessment may require geographic weighting and other advanced place-based methodologies.

Table 2.1. Characteristics of monthly psychiatric Emergency Department visits, police stops, stops including frisking, and stops including use of force among Black Americans in New York City, 2006-2015.

Variable	Mean (SD)
Psychiatric ED visits among Black Americans	7,819.63 (2,668.10)
Psychiatric ED visits among whites	5,729.63 (1,795.80)
Police stops among Black Americans	18,235.03 (10,621.21)
Police stops including frisking among Black Americans	10,179.66 (5,907.63)
Police stops including use of force among Black Americans	4,035.29 (2420.24)

Figure 2.1. Count of psychiatric Emergency Department visits among Black Americans over 120 months in New York City, 2006-2015.

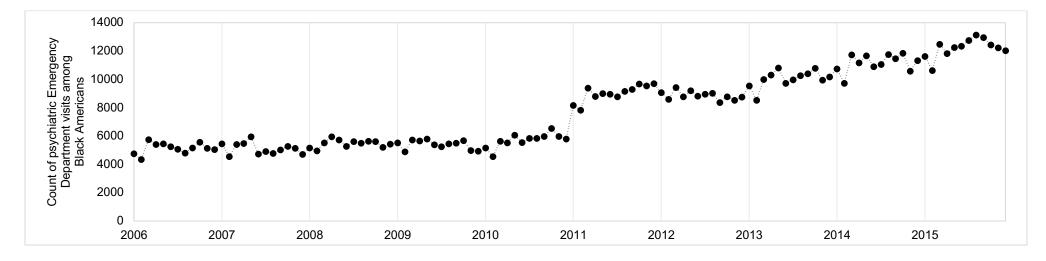


Figure 2.2. Count of total police stops among Black Americans over 120 months in New York City, 2006-2015.

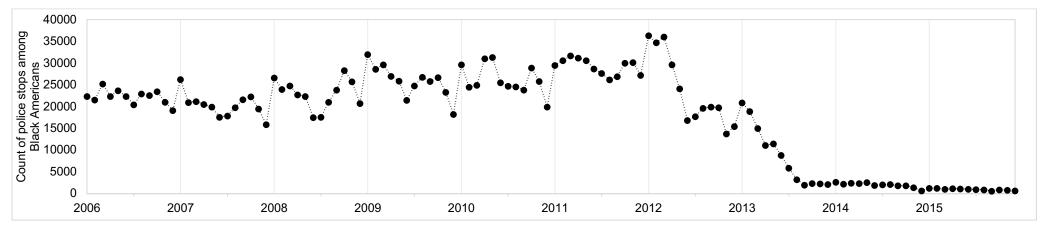


Figure 2.3. Count of police stops including frisking among Black Americans over 120 months in New York City, 2006-2015.

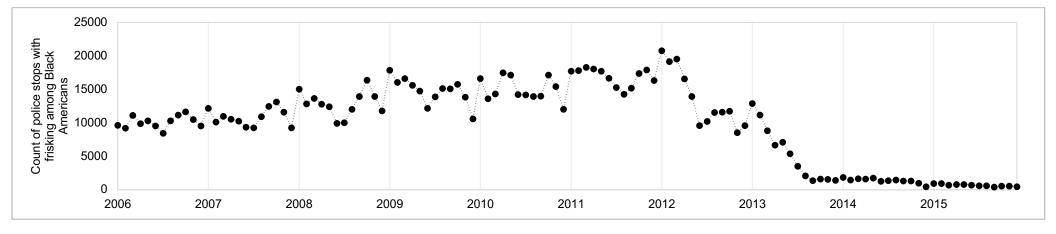


Figure 2.4. Count of police stops including use of force among Black Americans over 120 months in New York City, 2006-2015.

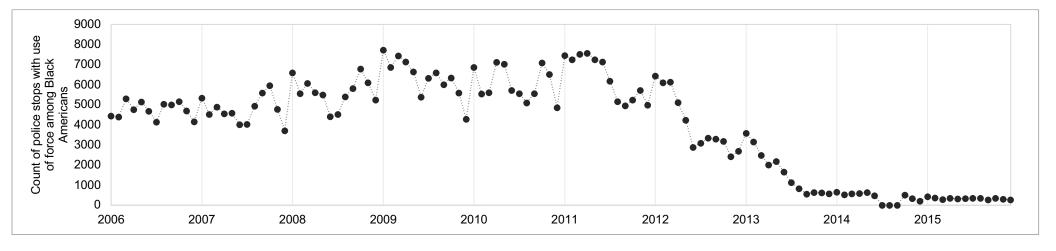


Table 2.2. Time-series results predicting the psychiatric Emergency Department visits among Black Americans in New York City from 2006-2015, as a function of police stops, stops including frisking, and stops including use of force among Black Americans.

	Model A Police Stops		Model B Stops Including frisking		Model C Stops Including Use of force	
Parameter	Point Estimate	(95% CI)	Point Estimate	(95% CI)	Point Estimate	(95% CI)
Police stops at t	0.024	(0.006,0.043)*	0.048	(0.015,0.080)**	0.1087	(0.028,0.190)**
at t+1	-0.009	(-0.026,0.008)	-	-	-	-
at t+2	-0.001	(-0.020,0.017)	ı	-	-	-
at t+3	0.001	(-0.017,0.020)	-	-	-	-
Psychiatric ED visits among whites at t	1.307	(1.218,1.395)**	1.260	(1.169,1.351)**	1.269	(1.174,1.364)**
Autoregressive parameter (AR) at t-1	0.770	(0.638,0.902)**	0.820	(0.701,0.939)**	0.837	(0.722,0.953)**
Autoregressive parameter (AR) at t-5	0.292	(0.096,0.487)**	0.301	(0.107,0.495)**	0.278	(0.083,0.473)**

^{*}p<0.05; **p<.001

Figure 2.5. Residual count of psychiatric ED visits among Black Americans in New York City, 2006-2015, with mean=0, after controlling for psychiatric ED visits among whites and removal of autocorrelation. First four months lost to time-series modelling.

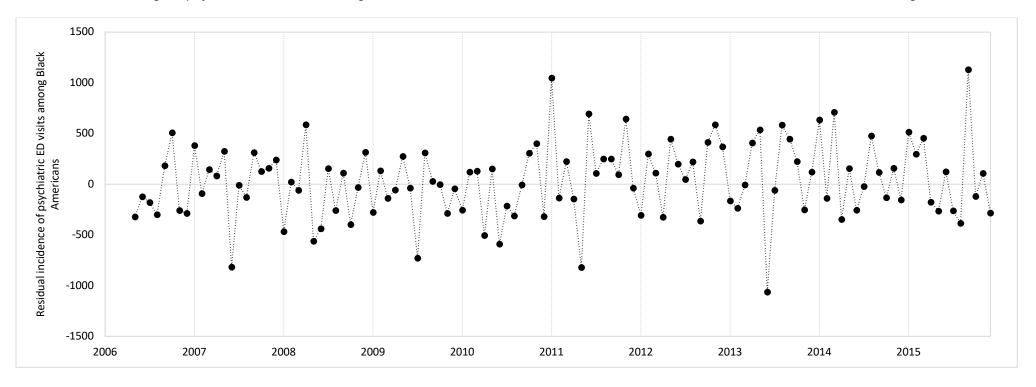


Figure 2.6. Count of psychiatric Emergency Department visits among whites over 120 months in New York City, 2006-2015.

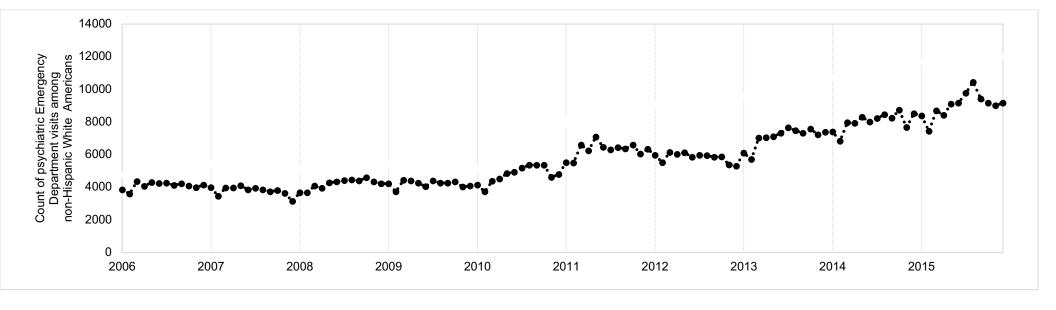


Table 2.3. Outlier-adjusted time series results predicting psychiatric Emergency Department visits among Black Americans in New York City from 2006-2015, as a function of police stops, stops including frisking, and stops including use of force among Black Americans.

	Model A Police stops		Model B Stops including frisking		Model C Stops including use of force	
	Point		Point		Point	
Parameter	Estimate	95%CI	Estimate	95%CI	Estimate	95%CI
Police stops at t	0.016	(0.001,0.030)*	0.025	(.007,0.043)**	0.058	(0.013,0.102)*
at t+1	-0.005	(-0.019,0.008)	-	-	-	-
at t+2	0.003	(-0.011,0.017)	-	-	-	-
at t+3	-4E-04	(-0.015,0.014)	-	-	-	-
Psychiatric ED visits among whites at t	1.234	(1.193,1.274)**	1.221	(1.183,1.259)**	1.222	(1.185,1.260)**
Autoregressive parameter (AR) at t-1	0.629	(0.476,0.781)**	0.635	(0.486,0.785)**	0.425	(0.276,0.574)**
Autoregressive parameter (AR) at t-5	0.320	(0.133,0.507)**	0.313	(0.129,0.497)**	0.309	(0.124,0.493)**

^{*}p<0.05; **p<.001

Table 2.4. Time series results predicting psychiatric Emergency Department visits among Black Americans in New York City from 2006-2015, as a function of police stops, stops including frisking, and stops including use of force that did not result in an arrest.

	Model A Police stops		Model B Stops including frisking		Model C Stops including use of force	
Parameter	Point Estimate	95%CI	Point Estimate	95%CI	Point Estimate	95%CI
Police stops at t	0.025	(0.006,0.045)*	0.050	(0.031,0.070)**	0.120	(0.029,0.211)**
at t+1	-0.010	(-0.028,0.008)	-	-	-	-
at t+2	-0.001	(-0.020,0.019)	-	-	-	-
at t+3	0.002	(-0.018,0.021)	-	-	-	-
Psychiatric ED visits among whites at t	1.306	(1.217,1.395)**	1.272	(1.183,1.360)**	1.273	(1.181,1.366)**
Autoregressive parameter (AR) at t-1	0.771	(0.639,0.903)**	0.817	(0.697,0.937)**	0.834	(0.717,0.950)**
Autoregressive parameter (AR) at t-5	0.291	(0.095,0.487)**	0.301	(0.107,0.494)**	0.278	(0.084,0.483)**

^{*}p<0.05; **p<.001

Table 2.5. Time series results predicting psychiatric Emergency Department visits among white in New York City from 2006-2015, as a function of police stops, stops including frisking, and stops including use of force among Black Americans.

	Model A Police stops		Model B Stops including frisking		Model C Stops including use of force	
- ·	Point	•	Point		Point	•
Parameter	Estimate	95%CI	Estimate	95%CI	Estimate	95%CI
Police stops at t	0.002	(-0.012,0.015)	0.002	(-0.023,0.026)	0.004	(-0.056,0.064)
at t+1	-0.004	(-0.017,0.009)	-0.011	(-0.035,0.013)	-0.023	(-0.081,0.036)
at t+2	0.007	(-0.007,0.020)	0.013	(-0.011,0.036)	0.027	(-0.031,0.086)
at t+3	-0.012	(-0.025,3.40E-4)	-0.022	(-0.045,0.002)	-0.047	(-0.103,0.010)
Psychiatric ED visits among Black Americans at t	0.475	(0.388,0.561)**	0.473	(0.385,0.561)**	0.477**	(0.389,0.565)
Moving Average parameter (MA) at t-1	0.263	(0.079,0.446)*	0.262	(0.079,0.446)*	0.245*	(0.062,0.428)
Autoregressive parameter (AR) at t-6	-0.363	(-0.554,-0.172)*	-0.358	(-0.549,-0.166)*	-0.354*	(-0.545,0.162)

^{*}p<0.05; **p<.001

Table 2.6. Time series results predicting psychiatric Emergency Department visits among whites in New York City from 2006-2015, as a function of the Floyd et al. class action lawsuit filed against the NYPD in May 2012.

	Point	
Parameter	Estimate	95%CI
Floyd et al. class action lawsuit at t	417.590	(-282.004,1117.184)
at t+1	-3.912	(-719.053,711.228)
at t+2	-22.931	(-743.270,697.409)
at t+3	228.244	(-468.336,924.823)
Psychiatric ED visits among whites at t	1.309	(1.237,1.382)**
Autoregressive parameter (AR) at t-1	0.716	(0.579,0.853)**
Autoregressive parameter (AR) at t-5	0.242	(0.046,0.438)*

^{*}p<0.05; **p<.001

CHAPTER 3: EMERGENCY DEPARTMENT VISITS FOR DEPRESSION FOLLOWING POLICE KILLINGS OF UNARMED BLACK AMERICANS²

² This article was published in Social Science & Medicine, 269, Das, A., Singh, P., Kulkarni, A.K., Bruckner, T.A., Emergency Department visits for depression following police killings of unarmed African Americans, 113561, Copyright Elsevier Ltd. (2020).

Introduction

Since 2015, police in the United States have killed approximately 5,400 individuals.^{61,62}
Annually, about 1,000 people die from police shootings.^{61,62} Police are almost 3.5 times more likely to kill Black Americans than whites, after adjusting for criminality.^{62,126} Additionally, Black Americans have almost 1.5 times the likelihood of being unarmed when killed compared to whites.^{61,62} The recent video footage of George Floyd's death, while being subdued by police officers, has brought much media and popular attention to this issue.

Various forms of institutional oppression toward Black Americans have persisted over the course of US history. After the Civil Rights movement, origins of Critical Race Theory (CRT) emerged to transform the ideas of race, racism, and power.⁶ Established in the legal field during the 1980s, CRT asserts that institutions perpetuate racial inequality, for Black Americans, through social, economic, and legal disparities.⁶ CRT distinguishes itself from progressive, color-blind, and civil rights approaches as they rely on the current legal system and support integration of racial/ethnic groups into broader social systems.¹³⁷ Rather than assimilation, CRT focuses on power relations between groups and the oppression of groups of color.¹³⁸ The theory posits that advancement of groups of color (through court decisions or legal changes) only occurs when benefiting whites in power.¹³⁸

Scholars argue that although acts of prejudice play a role in racial domination, social institutions shape the system of racial domination.⁵ Systemic racism theory posits that structural inequities drive wealth-generating resources for white Americans, allowing for the intergenerational transmission of resources and materials within white communities.⁸ Elite whites, therefore, maintain the racial hierarchy and continue the cycle of oppression through oppressive social systems.⁸ As with historical acts of lynching, police killings of unarmed Black Americans remain

features of a racialized America that has normalized such patterns of oppression in the criminal-legal system, specifically.⁶ Theorists and empirical scholars have argued that police killings of unarmed Black Americans may serve as an indicator of structural racism.^{125,126}

Mesic and colleagues report that, across states, measures of structural racism strongly predict the Black-white disparity in unarmed police shootings. Ross further finds that racial bias occurs in police killings more often in urban counties. Research also suggests that individuals of color can experience racism vicariously, wherein individuals indirectly experience racism targeted at other persons of color. Several studies suggest that Black Americans and other racial/ethnic minorities experience vicarious racism frequently. Similarly, the theory of linked fate captures personalized emotions following acts of racial violence towards others in the Black community through ethno-racial identification. One study reports that perceptions of linked fate correspond with greater depressive and anxiety symptoms among Black Americans.

One study examined the relationship between vicarious racism and mental health after the highly publicized police killing of Trayvon Martin. 65,139 Their research indicates that racial identity sensitized Black youth to race-related violence toward other Black Americans, which positively correlated with depressive symptoms. 55 Scholars also report that two or more incidents of public anti-Black violence in a week (i.e., police killings of Black Americans, decisions not to indict or convict officers involved in police killings, and hate crime murders) correspond with greater poor mental health days among Black individuals. The survey scholars utilized defines poor mental health days as "days with stress, depression, and problems with emotions." 68 However, after stratifying results by type of anti-Black violence, they do not report increases in poor mental health days in the Black community as a function of police killings among Black Americans. Additionally, the study reports an inverse relation between police killings of Black residents and psychological distress. Conversely, a separate ecological study finds that

counties with police killings of unarmed Black Americans correspond positively with selfreported adverse mental health days (stress, depression, emotional problems) among Black Americans a few months after the killings.⁶⁷

The above work, while suggestive, is limited in the following ways. First, much literature on racism and adverse mental health focuses on individual-level exposures rather than structural racism. ^{140,141} Individual-level exposures include internalized or personally-mediated racism which encompass accepting negative messages about one's own worth and acts of prejudice, respectively. ² Structural racism, however, captures dimensions of racism embedded in social, legal, and economic institutions. ² Although examination of individual-level factors has advanced knowledge of health inequities, it ignores the broader ecological context of racism embedded in societal institutions. ¹⁴⁰ Additionally, facets of structural racism may have a stronger relation to population health, given its widespread influence on historically disadvantaged communities. ¹⁴⁰

Second, previous ecological literature finds conflicting results regarding whether police killings of unarmed Black Americans correspond positively with adverse mental health days.⁶⁷ It does not, however, examine whether the exposure precedes increases in help-seeking for psychiatric conditions, such as depression. Additionally, scholars suggest that Black Americans lead all other race/ethnicities in chronic depression, with over 56% experiencing prolonged depressive symptoms.²⁰ I do not know whether exogenous shocks, such as police killings of unarmed Black Americans, may further exacerbate population-level depressive symptoms, requiring emergency assistance.

I address these limitations and extend previous work by examining whether police killings of unarmed Black Americans correspond positively with Emergency Department (ED) visits related to depression among Black Americans. I examine 331,171 outpatient ED visits related to

depression in 75 counties from five states between 2013-2015. Results from this study may hold particular relevance to understanding the ecology of unarmed Black American police killings as it relates to ED visits for depression among Black Americans.

Methods

Study Population

I retrieved the dependent variable, psychiatric ED visits for depression among non-Hispanic Black Americans (per 100,000 population), from the Statewide Emergency Department Database (SEDD). The SEDD is made available for purchase by the Agency for Healthcare Research and Quality (AHRQ) under the Healthcare Cost and Utilization Project (HCUP). States that participate in HCUP provide information on over 99% of all outpatient ED visits through SEDD. This high-quality database enjoys widespread use in psychiatric epidemiological research. Selected states included in SEDD that uniformly report county identifiers, race/ethnicity per ED visit, and month of visit, allowing longitudinal analysis over the study period of interest at the county-month resolution. These inclusion criteria yielded the following state-years: Arizona, Kentucky, North Carolina, New Jersey, and New York, from 2013 to 2015 (i.e., 36 months per state).

Study Measures

I retrieved psychiatric ED visits pertaining to depression using visit-level diagnoses based on ICD-10 codes for all types of depression and mood disorders (Appendix Table A.1). For ED visits with mental health or substance use as the primary diagnosis, surveillance studies from the past two decades find that depression ED visits constitute the third largest proportion of visits. I aggregated a total of 331,171 depression-related ED visits among Black Americans by county-month, and converted these counts to population prevalence estimates (per 100,000).

population) using race-specific population denominators obtained from the US Census Bureau's Population Estimates database.¹⁴⁴

I retrieved data on police killings of unarmed Black Americans from the Mapping Police Violence (MPV) database by county-month for the study regions and time period. 62 The MPV database contains information on police killings obtained from crowdsourcing of reports (media and others), which overcomes the limitations of under-reported administrative datasets. 62 Police killings reported in the MPV undergo validation through triangulation with official police records, news reports, social media references, and obituaries. The reliability of these data are further evidenced by their utilization in extant research.^{67,125} In keeping with prior work that utilizes the MPV dataset, I specified, as the exposures, 0- to 3-month lags of whether one or more police killings of Black Americans occurred in a county-month (binary indicator; 1 = Yes, 0 = No). Lags allow for examination of whether the exposure precedes the outcome while also capturing whether the outcome has an induction period that manifests at a later time period than the concurrent temporal resolution measured in the analyses. According to previous work, exogenous criminal justice exposures may coincide with changes in health up to three months following the event. 67 I also obtained information on police killings of armed Black Americans from the MPV to utilize as a sensitivity test, by county-month (binary indicator; 1 = Yes, 0 = No). Given that metropolitan counties account for over 96% of police killings of unarmed Black Americans in these data, I restricted the analysis to metropolitan counties (Appendix, Table A.2). These restrictions yielded a final analytic sample of 75 counties over 36 months (i.e., 2,700 county-months from 2013- 2015).

Arrest rates may confound the analysis in that greater incidence of violent crime (e.g., homicide, assault) may correspond with higher ED visits for depression as well as heightened police activity and police killings in a county. ¹⁴⁵ To control for this plausible endogeneity, I retrieved

data on arrests for violent crimes reported per county-month from one of the most extensively used, publicly available crime statistics repository in the US – the Uniform Crime Records (UCR) database. The UCR is made available through the Federal Bureau of Investigation's UCR Program and provides information on arrests for violent crimes by nearly all law enforcement agencies at the county-level, per month. I converted monthly arrest counts to population prevalence estimates (per 100,000 population) and utilized this arrest rate as a control variable in the analysis.

Analysis

I test whether police killing of unarmed Black Americans precedes an increase in ED visits for depression among Black Americans. I use 0- to 3-month lags of the exposure (police killing of unarmed Black Americans) and estimate the following model using Ordinary Least Squares (OLS) regression analysis:

$$Y_{c,m} = \beta_0 + \beta_1 X_{c,m0} + \beta_2 X_{c,m-1} + \beta_3 X_{c,m-2} + \beta_4 X_{c,m-3} + \beta_5' H_{c,m} + \beta_6' A_{c,m} \beta_7' County_c$$
$$+ \beta_8' Month_j + \beta_9' Year_k + \beta_{10}' State_s * Linear time + \varepsilon_{c,m}$$

- Equation 1

where:

 $Y_{c,m}$ is the population rate of ED visits for depression (per 100,000 population) among Black Americans in county c during month m. $X_{c,m0}$, $X_{c,m-1}$, $X_{c,m-2}$ and $X_{c,m-3}$ are 0, 1, 2 and 3 month lags (respectively) of exposure X (police killing of unarmed Black Americans), for the concurrent month (m0) to 3 month lag (m-3), in county c. β_1 , β_2 , β_3 and β_4 are the key coefficients of interest in the analysis.

 $H_{c,m}$ is the number of Emergency Departments (or reporting hospitals) within a county c, during month m, that report data on depression-related ED visits. Inclusion of this control variable accounts for changes over time in ED visits following closure or opening of EDs. $A_{c,m}$ is the population rate of arrests for violent crimes (per 100,000 population) in county c, during month m. Inclusion of this control variable accounts for heightened crime or police activity in a county-month.

 $County_c$ is the vector of indicator variables for individual counties (county fixed effects). $Month_j$ is the vector of month indicators that control for seasonality in ED visits for depression.

 $Year_k$ is the vector of year indicators that control for year-specific changes in ED visit rates (e.g., policy changes such as the Affordable Care Act) across all counties. $State_s * Linear time$ is the vector of state-specific (s) linear time trend (1 to 36 months) that accounts for unobserved factors which trend linearly over the study period. $\varepsilon_{c,m}$ is the heteroscedasticity-robust standard error term to account for correlated residual errors.

The model specification (Equation 1) controls for several sources of potential confounding. First, I include county fixed effects. The use of county fixed effects forces within-county identification of the relation between outcome and exposure and accounts for time-invariant attributes of a county that may correspond with police killings as well as depression-related ED visits. Second, I included indicators for month in order to control for seasonality in depression-related ED visits. Previous literature finds seasonal patterns in psychiatric ED visits such as increased visits at the beginning of each calendar year. ^{150,151} I also specified year fixed effects to control for year-specific factors (e.g., policy changes such as the Affordable Care Act) that may correspond with an increase or decrease in depression-related ED visits. Third, I include arrests for violent

crimes (per 100,000 population) to control for heightened criminal or police activity. Scholars suggest heightened criminal activity (as measured by arrests) corresponds with adverse mental health symptoms and may also correspond with increased police killings.^{152,153}

I also conducted two sensitivity tests. First, I re-estimated Equation 1 and specified 0- to 6-month lags of the exposure to examine the potential of an extended elevation of ED visits for depression or any seasonality. Second, I used as the exposure (X) a binary indicator of police killings of armed Black Americans (0- to 3-month lags, other covariates specified identical to Equation 1). This additional analysis gauged whether police killings of armed Black Americans correspond with depression-related ED visits. This sensitivity test examined whether any changes in depression-related ED visits observed in the main analysis also correspond with an exposure that reflects (relatively) lower racial targeting of Black Americans. Lastly, I conducted a falsification test to examine whether police killings of unarmed Black Americans corresponded with depression-related ED visits among non-Hispanic whites.

I also conducted an exploration of whether police killings of unarmed Black Americans coincided with greater ED visits for other mental health diagnoses such as anxiety-related visits, substance use, as well as overall psychiatric ED visits. According to surveillance studies, substance use, and anxiety-related diagnoses comprise a substantial portion of psychiatric ED visits overall. Consistent with previous literature, I classified ED visits using ICD-10 diagnostic codes contained within Clinical Classification Software (CCS) categories for psychiatric disorders (including mood, anxiety, conduct, behavioral disorders, self-harm, suicidal ideation, substance use, and others). Conducted all analyses in Stata SE version 16.0.

Results

ED visits for depression (per 100,000 population) among Black Americans average about 100 per county per month, with the highest (mean) rates observed for Kentucky and lowest for New York (Table 3.1). Out of a total of 26 county-months with police killings of unarmed Black Americans, New York state accounts for 13 (i.e., 50%) and Kentucky reports zero.

Figure 3.1 shows the ED visits for depression (per 100,000 population) over time, averaged per county, per month in the study sample. This upward trend aligns with secular increases in ED visits for psychiatric conditions reported in the literature. The sharp increase in ED visits around March 2015 arises from increases in the number of (new) hospitals included in the SEDD from that period onwards (based on monthly counts of hospitals reporting to SEDD). Figure 2 shows the monthly trend in occurrence of police killings of unarmed Black Americans. Within the study region, I observe an average of 5 to 7 months per year (2013-2015) with at least one police killing of an unarmed Black American.

Table 3.2 presents the results from OLS fixed effects regression analyses predicting log-transformed ED visits for depression (per 100,000 population) as a function of 0-, 1-, 2- and 3-month lags of police killings of unarmed Black Americans. I use a log transformed outcome for analysis as this variable shows a skewed distribution (Figure 3.3). Regression results indicate an increase of approximately 11% in depression-related ED visits at 0 and 3 months after the police killing of unarmed Black Americans in a county (p<0.05). Sensitivity tests show that this pattern does not persist beyond exposure lag 3, demonstrating that the finding does not result from autocorrelation (Table 3.3). Depression-related ED visits among Black Americans also show no relation to police killings of armed Black Americans (Table 3.4). This indicates that the findings do not persist without a racism-related indicator of the exposure, the unarmed status of the individual (Table 3.4). The falsification test shows police killings of unarmed Black

Americans do not correspond with depression-related ED visits among whites (Table 3.5). Exploration of ED visits related to diagnoses for all psychiatric conditions, substance use, and anxiety also show no relation to police killings of unarmed Black Americans (Table 3.6).

Discussion

Police kill unarmed Black Americans at 3.5 times the rate of unarmed whites. Vicarious racism plays a role in the adverse mental health experienced by Black Americans following police killings. In this study, I examined the relation between unarmed Black American police killings and ED visits for depression (per 100,000 population). I find that unarmed Black American police killings correspond with an 11% increase in ED visits for depression per 100,000 population among Black Americans in the concurrent month and three months after the police killing.

Strengths of this study include the use of a comprehensive statewide dataset comprising the census of ED visits for depression spanning five states from regions including the Northeast, South, and West. 155 I used clinically diagnosed ED visits for depression based on ICD-10 codes. 143 The MPV database comprises three of the most comprehensive police killing databases in the country and undergoes further quality control to ensure completeness of the data. 62 As opposed to other databases, it also utilizes consistent definitions for armed status. 62 The longitudinal analyses, which span three years (36 months), establish precise temporal order (exposure precedes the outcome) and account for county, month, and year fixed effects. These fixed effects control for variations across place, time, and seasonality in help-seeking for depression in the ED. I also controlled for other time-varying confounders, such as number of hospitals as well as arrest rates for violent crime that may influence the variation in the outcome and exposure. Taken together, the use of high-quality data, longitudinal study design, and fixed effects-based analytic approach offer strong reliability and validity to this study.

Limitations of the study could include residual confounding by unmeasured factors. Such an unmeasured factor would have to correlate positively with ED visits for depression and with police killings of unarmed Black Americans, not be captured by county-specific time-invariant fixed effects, and also not be accounted for by seasonality (month fixed effects) and temporal changes/trends (year fixed effects, linear time trends). I know of no such factor. Second, prior literature reports that Black Americans rely on EDs for psychiatric care at disproportionately higher rates relative to other race/ethnicities. 99 Owing to data limitations within the SEDD, I am unable to differentiate between emergent versus routine/non-emergent ED visits in the analysis. I contend that the increase in ED visits for depression observed in the analyses arises from emergent visits as I do not have a priori expectations of why routine/non-emergent ED visits would respond, within 0 to 3 months, to police killings of unarmed Black Americans. However, future research may extend the present study and examine differences by emergent versus non-emergent psychiatric ED visits, among Black Americans, following this exposure. Lastly, whereas many scholars have used the MPV database in research, data on police killings remains crowd-sourced and likely under-reported, given the censuring of official police data provided by states and local departments. ^{67,125} The findings may therefore represent the lower bound of the reported association.

In alignment with previous literature, this study suggests that police killings may exacerbate depressive symptoms and adverse mental health among Black Americans, provoking an ED visit for depression.⁶⁷ The increase in ED visits for depression in the concurrent month and three months after the police killing underscores the possibility that individuals may experience police killings as traumatic events. In 2007, Carter proposed the Theory of Race-Based Traumatic Stress in which individuals who face racial discrimination experience symptoms similar to post-traumatic stress.^{156,157} Symptoms include adverse mental health such as depression and

anxiety, in addition to avoidance, reactivity, and cognitive changes.¹⁵⁸ Additionally, post-traumatic stress symptoms usually begin three months after the event occurs.¹⁵⁸ This theory warrants further empirical investigation into whether police killings precede increased diagnosis of post-traumatic stress in Black Americans.

The study's findings and previous literature on adverse mental health symptoms may not fully capture changes in population-level help-seeking following police killings of unarmed Black Americans. While EDs serve as safety nets, particularly for acute, episodic mental health emergencies, individuals may also opt to seek care in non-ED settings following exposure to ambient stressors. Community Health Centers, primary care physicians, or other mental health professionals may experience increases in Black American patients seeking help following police killings. An exploration of other health systems may provide insight into other mental health sequelae and/or potential changes in help-seeking among Black Americans. Additionally, individuals may internalize or externalize adversity. Those internalizing adversity experience symptoms of anxiety, depression, or somatizations. Externalization includes hostility or aggression, which may lead to heightened crime, arrest rates, or involuntary psychiatric holds/examinations for danger to self or others. This speculation warrants further refinement and empirical testing.

In 2014, the UN Committee Against Torture criticized the United States for its failure to evaluate use-of-force by its police following the uncovering of race- and sexuality-based brutality. They specifically noted the lack of 1) statistical data on allegations of police brutality; and 2) information on the result of investigations undertaken after those allegations. Unlike many official police sources, several current, public-access, crowd-sourced projects do not censure police killing data. Investigations regarding police killings and the subsequent acquittals of police officers involved in highly publicized cases have led to public unrest, movements such as

Black Lives Matter, and the 2014 President's Task Force on 21st Century Policing. ^{161,162} Although limited research examines whether these developments or future movements have changed racial bias in policing, the mental health implications of such racial bias remain understudied.

The frequency of police killings, as well as the racial bias associated with these killings, have remained consistent over the past five years. Researchers, community organizations, and policy experts suggest several avenues for preventing police killings of unarmed Black Americans, including: 1) terminating "broken windows" policing for minor crimes and activities; 2) ceasing profiling based on race/ethnicity and "stop and frisk" procedures; and 3) establishing alternative approaches to mental health crises than policing. Researchers also find that implementing consistent supervisory meetings between officers and sergeants corresponds with more measured responses to incidents on the street.

Video footage of police killings has become widespread through technological improvements such as camera phones, police dashboard/body cameras, and the internet. Extensive media coverage of collective traumas (traumatic events that affect an entire society), however, may trigger psychological distress. A study on the Boston Marathon bombings in 2013 found that repeated media exposure to collective traumas corresponded with higher acute stress. Additionally, researchers found higher stress levels among those who watched media coverage when compared to those directly exposed (at or near) the bombing. The field concerned with structural racism and health would benefit from understanding the extent to which media coverage of police killings or other social and information pathways adversely affect Black Americans.

Black Americans have less access to mental health care than do whites and delay seeking care more often than other race/ethnicities. ^{168,169} When seeking care, Black Americans utilize the ED for psychiatric care at a greater rate. ¹⁶⁹ Scholars attribute less help-seeking to low access, poor quality of care when accessed, socio-cultural barriers to help-seeking, and racial discrimination within the healthcare system. ⁹⁹ Black Americans also have stronger beliefs about racial discrimination in healthcare than do other race/ethnicities and, as a result, prefer Black American physicians. ¹⁷⁰ Other research indicates that increases in health care providers in underserved communities correspond with greater health care access for minorities, decreased discrimination, improved patient-provider communication, and improved patient quality and satisfaction outcomes. ¹⁷¹ As Black youth suicide rates steadily increase nationwide, increased access to mental health care for this population may be particularly beneficial. ¹²⁹ In addition, given that depression remains a strong risk factor for suicidal ideation and self-harm, further research should evaluate whether elements of structural racism may correspond with suicides among Black youth. ¹⁷²

Table 3.1: Descriptive attributes of study covariates across 75 counties (5 states: AZ, KY, NJ, NY, NC), over 36 months (2013-2015).

Variables	Statistics
ED visits for depression (per	Mean (SD)
100,000 population) among Black	
Americans per county-month	
Overall	100.25 (10.10)
Arizona	84.95 (18.28)
Kentucky	128.05 (19.18)
New Jersey	104.82 (11.81)
New York	74.17 (6.10)
North Carolina	102.18 (8.95)
County-months with police killings	N (%)
of unarmed Black Americans	
Overall	26 (100)
Arizona	4 (15.38)
Kentucky	0 (0)
New Jersey	5 (19.23)
New York	13 (50.00)
North Carolina	4 (15.38)

Figure 3.1: Trend in ED visits for depression among Black Americans (per 100,000 population) across 75 counties (5 states: AZ, KY, NC, NJ, NY), over 36 months (2013-2015).

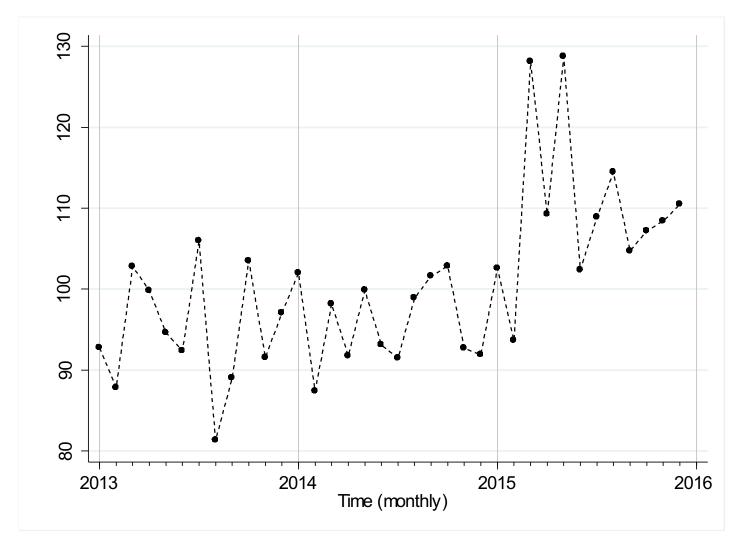


Figure 3.2: Monthly police killings of unarmed Black Americans over 36 months (2013-2015) aggregated for 75 counties (5 states: AZ, KY, NC, NJ, NY)

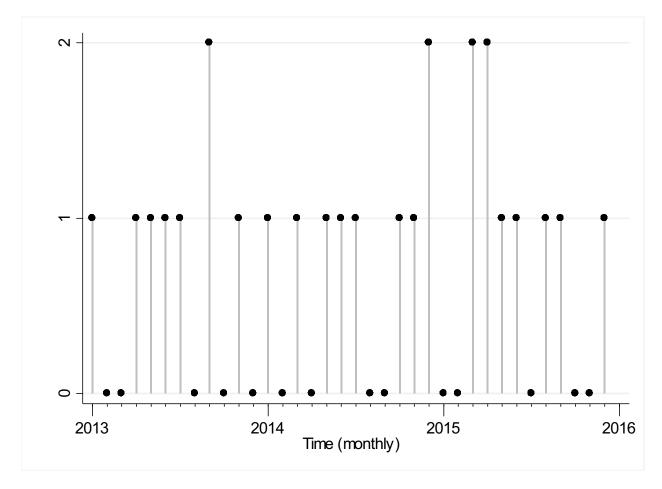


Figure 3.3 Frequency distribution of ED visits for depression among Black Americans (per 100,000 population) across 75 counties (5 states: AZ, KY, NC, NJ, NY), over 36 months (2013-2015).

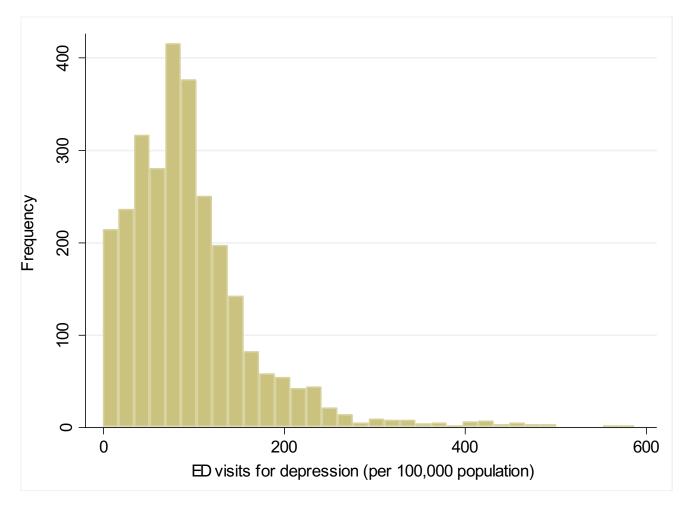


Table 3.2: OLS fixed effects regression results predicting log transformed ED visits for depression (per 100,000 population) among Black Americans as a function of 0- to 3-month lags of police killing of unarmed Black Americans.

Covariates	Coefficient	SE ^a
Police killing of unarmed Black Americans (reference = No)		
Month lag 0	0.11*	0.05
Month lag 1	0.05	0.04
Month lag 2	0.09	0.05
Month lag 3	0.11*	0.04
Number of EDs/hospitals reporting to SEDD	0.17*	0.07
Arrests for violent crime (per 100,000 population)	80.69	248.30
Month (reference: January)		
February	-0.08*	0.04
March	0.03	0.04
April	0.02	0.04
May	0.05	0.04
June	0.02	0.04
July	0.04	0.05
August	-0.01	0.06
September	4.85E-3	0.06
October	6.09E-4	0.06
November	-0.07	0.07
December	-0.06	0.07
Year (reference: 2013)		
2014	-0.02	0.10
2015	-0.06	0.16
State linear time trends (State*Month-Year) (reference: Arizona)		
Kentucky	0.01	0.01
North Carolina	0.01	0.01
New Jersey	0.01	0.01
New York	0.01	0.01

^{*}p<0.05; ** p<0.01; *** p<0.001
aRobust standard errors

Table 3.3 OLS fixed effects regression results predicting log transformed ED visits for depression (per 100,000 population) among Black Americans as a function of 0- to 6- month lags of police killing of unarmed Black Americans.

Covariates	Coefficient	(SE) ^a
Police killing of unarmed Black Americans (reference = No)		
Month lag 0	0.09	(0.06)
Month lag 1	0.04	(0.05)
Month lag 2	0.07	(0.05)
Month lag 3	0.10*	(0.04)
Month lag 4	0.08	(0.05)
Month lag 5	-0.01	(0.05)
Month lag 6	-0.00	(0.05)
Number of EDs/hospitals reporting to SEDD	0.15*	(0.07)
Arrests for violent crime (per 100,000 population)	42.28	(274.58)
Month (reference: January)		
February		0.04
March	0.02	0.04
April 0		0.04
May 0		0.05
June	0.02	0.05
July	0.02	0.05
August		0.05
September -0	-0.01	0.06
October		0.06
November	-0.08	0.06
December	-0.07	0.07
Year (reference: 2013)		
2014		0.10
2015	-0.09	0.16
State linear time trends (State*Month-Year) (reference: Arizona)		
Kentucky		8.72E-3
North Carolina		0.01
New Jersey		7.90E-3
New York	0.01	7.64E-3

^{*}p<0.05; ** p<0.01; *** p<0.001

^a Robust standard errors

Table 3.4: OLS fixed effects regression results predicting log transformed ED visits for depression (per 100,000 population) among Black Americans as a function of 0 to 3 month lags of police killing of <u>armed</u> Black Americans.

Covariates	Coefficient	(SE) ^a
Police killing of unarmed Black Americans (reference = No)		
Month lag 0	0.01	(0.05)
Month lag 1	0.04	(0.04)
Month lag 2	-0.00	(0.04)
Month lag 3	0.01	(0.05)
Number of EDs/hospitals reporting to SEDD	0.16*	(0.07)
Arrests for violent crime (per 100,000 population)	66.38	(248.28)
Month (reference: January)		
February	-0.08*	0.04
March	0.03	0.04
April	0.02	0.04
May	0.05	0.04
June	0.03	0.04
July	0.04	0.05
August	-7.91E-3	0.06
September	7.38E-3	0.06
October	1.47E-3	0.06
November	-0.07	0.06
December	-0.06	0.70
Year (reference: 2013)		
2014	-0.02	0.10
2015	-0.05	0.16
State linear time trends (State*Month-Year) (reference: Arizona)		
Kentucky	7.54E-3	8.50E-3
North Carolina	5.71E-3	0.01
New Jersey	4.65E-3	0.01
New York	9.65E-3	0.01

^{*}p<0.05; ** p<0.01; *** p<0.001
aRobust standard errors

Table 3.5: OLS fixed effects regression results predicting log transformed ED visits for depression (per 100,000 population) among whites as a function of 0- to 3-month lags of police killing of unarmed Black Americans.

Covariates	Coefficient	SE ^a
Police killing of unarmed Black Americans (reference = No)		
Month lag 0	0.04	0.04
Month lag 1	0.05	0.03
Month lag 2	3.61E-3	0.05
Month lag 3	0.04	0.04
Number of EDs/hospitals reporting to SEDD	0.04	0.02
Arrests for violent crime (per 100,000 population)	9.11E-5	1.09E-3
Month (reference: January)		
February	-0.11***	0.02
March 0		0.02
April		0.03
May	0.10**	0.03
June		0.04
July	0.03	0.04
August	0.03	0.04
September		0.04
October -		0.04
November	-0.07	0.05
December	-0.02	0.05
Year (reference: 2013)		
2014		0.06
2015	0.03	0.10
State linear time trends (State*Month-Year) (reference: Arizona)		
Kentucky		9.74E-3
North Carolina		0.02
New Jersey		6.53E-3
New York	4.78E-4	6.10E-3

^{*}p<0.05; ** p<0.01; *** p<0.001 aRobust standard errors

Table 3.6: OLS fixed effects regression results predicting log transformed ED visits for all psychiatric conditions, substance use, and anxiety (per 100,000 population) among Black Americans as a function of 0- to 3-month lags of police killing of unarmed Black Americans.

	Psychiatric	Psychiatric ED visits		Substance use ED visits		ED visits
Covariates	Coefficient	SEª	Coefficient	SE ^a	Coefficie nt	SEª
Police killing of unarmed Black						
Americans (reference = No)						
Month lag 0	0.04	0.05	-0.08	0.07	0.07	0.05
Month lag 1	0.04	0.05	-0.09	0.08	0.05	0.05
Month lag 2	0.06	0.05	2.06E-3	0.11	0.07	0.04
Month lag 3	0.04	0.05	6.20E-3	0.11	0.07	0.04
Number of EDs/hospitals reporting to SEDD	0.10*	0.05	0.15**	0.06	0.11*	0.05
Arrests for violent crime (per 100,000 population)	189.06	139.76	101.46	277.14	240.15	300.73
Month (reference: January)						
February	-0.13***	0.03	-0.08	0.05	-0.06	0.04
March	2.84E-03	0.03	0.06	0.04	0.06	0.04
April	0.07	0.04	0.26***	0.04	0.05	0.03
May	0.12***	0.03	0.26***	0.04	0.10**	0.04
June	0.08**	0.03	0.27***	0.05	0.09	0.04
July	0.13***	0.03	0.32***	0.04	0.13***	0.03
August	0.11**	0.04	0.29***	0.05	0.10	0.04
September	0.14**	0.04	0.28***	0.05	0.10*	0.04
October	0.12**	0.04	0.88***	0.06	0.07	0.05
November	0.04	0.05	0.78***	0.06	0.02	0.05
December	0.13**	0.05	0.83***	0.07	0.03	0.05
Year (reference: 2013)						
2014	0.15*	0.06	0.09	0.06	0.05	0.06
2015	0.34**	0.10	0.67***	0.12	0.11	0.10
State linear time trends (State*Month-Year) (reference: Arizona)						
Kentucky	-0.01	0.01	-2.72E-3	7.25E-4	-1.32E-4	6.79E-3
North Carolina	0.01	0.01	0.03**	8.66E-3	5.92E-3	8.96E-3
New Jersey	-4.84E-3	0.01	0.01	6.42E-3	5.62E-3	5.56E-3
New York	-3.61E-3	4.95E-3	2.70E-3	6.06E-4	8.94E-4	5.09E-3

^{*}p<0.05; ** p<0.01; *** p<0.001 a Robust standard errors

CHAPTER 4: INCARCERATION AND PSYCHIATRIC EMERGENCY DEPARTMENT VISITS AMONG BLACK AMERICANS

Introduction

In 2020, the US incarcerated nearly two million individuals.¹⁷³ With a rate of 573 per 100,000 population, incarceration in the US exceeds that of any other nation.³⁸ Black Americans have an incarceration rate of 2,306 per 100,000 population as opposed to whites with a rate of 450 per 100,000 population.³⁸ Additionally, one in three Black men can expect to go to prison in their lifetime.³⁸

In the 1970s, the US government declared a 'War on Drugs' to reduce illicit drug use and crime. These measures included the creation of the federal Drug Enforcement Agency (DEA) and the introduction of policies that required mandatory minimum sentencing for drug-related activity. 174 Well-documented racial bias in the justice system that followed disproportionately imprisoned communities of color, specifically among young, Black men of lower education levels. 69,174–176 Racial disparities in drug arrests, harsher sentencing, and mandatory minimums brought on by the 1986 Anti-Drug Abuse Act for crack cocaine, as opposed to powder cocaine, further exacerbated racial/ethnic disparities in incarceration. 174,177,178 Crack cocaine use concentrated in low-income communities that comprised many Black Americans, whereas affluent whites often used the more expensive powder cocaine. 177 Implementation of the mandatory minimum resulted in the same five-year prison sentence for possession of five grams of crack cocaine, as opposed to 500 grams of powder cocaine. This policy increased the average drug sentencing among Black Americans from 11% greater than white populations to 49% greater. 174,177

Mass incarceration refers to the concentration of imprisonment among Black Americans as well as the consistency in which it has become a normal stage within the life course in the Black community. Theorists also suggest that as with slavery and segregation, the US government utilizes mass incarceration as an instrument for racialized oppression.

Incarceration may therefore serve as an indicator for structural racism within the justice system. 10,181,182

Previous work indicates that incarceration has contributed to restructuring households as well as infringing on social networks in the Black community. ^{69,73,175,183} Two ethnographies conducted in Washington DC and New York City document that incarceration strains family relationships, depletes financial resources, and leads to greater social and emotional isolation for the family of the incarcerated person. ^{184,185} Moreover, recent data from 2018 show that families who experience parental incarceration have a higher likelihood of disadvantage prior to the event. ¹⁸⁶ Incarceration then amplifies the existing disadvantage for families in the subsequent years. ¹⁸⁶ Although scholars assert that moderating factors such as mental illness, addiction, or intimate partner violence may provide relief for families upon incarceration, the majority of families, by and large, experience further disadvantage following incarceration. ¹⁸⁶ Lastly, social network studies also report that children with incarcerated parents participate in more antisocial peer networks by befriending peers who exhibit less academic success and greater delinquency. ^{187,188}

Scholars theorize that social networks create the foundation for social capital – defined as networks with shared norms, values, and understandings that facilitate cooperation within or among groups. ^{73,74} Incarceration removes an individual from a household and therefore breaks strong ties within the family network. ^{73,189} Incarceration of a family member may also reduce the potential for weak ties formed through employment or community activities for family members, partners, or children of those incarcerated. ^{73,189} Given the substantial proportion of incarcerated men from low-income Black communities, scholars find that women in these communities often do not replace strong ties after losing their incarcerated male partners. ^{69,73} This circumstance may lead to permanently broken, strong ties with the incarcerated family member or significant

monetary and time investments in maintaining the ties.⁷³ Additionally, scholars assert that weak ties create bridges from family units to other social networks – thereby building social capital.⁷³ Men in prison do not have the opportunity to create connections to beneficial job- or community-related networks for their families, thereby reducing the overall capacity for social capital in these communities.⁷³ Although empirical findings in this area remain limited, one study reports that incarceration varies inversely with community attachment and organizational participation.⁸⁰

Research that invokes Durkheim's theory on social isolation and psychological well-being consistently reports that social ties have salutary benefits on mental health. ^{189–191} Scholars contend that relationships between humans comprise three layers that collectively influence psychological well-being: 1) intimate ties (familial ties); 2) network relations (close relatives and friends); and 3) community participation (participation in voluntary activities or religious organizations). ^{191,192} Although weak ties such as community participation do not provide greater personal interaction, theorists posit that they nonetheless enhance psychological well-being. ¹⁹² Empirical work on network analysis in this area finds that outer layers support inner layers, such that greater community participation makes it possible to create closer relationships with relatives and friends. ¹⁹²

Individual-level studies utilizing longitudinal data and rigorous methodologies report that familial incarceration precedes adverse mental health among children and partners of those incarcerated. Scholars theorize that forced separation from a parent, material deprivation from loss of financial support, and compromised parent relationships can harm children's social and emotional well-being following parental incarceration. Two studies using the Fragile Families and Child Well-Being Study find greater physically aggressive behaviors and problematic externalizing behaviors among children following paternal incarceration, specifically. Another study that leverages panel data from the National Longitudinal Study

of Adolescent Health reports a positive relation between parental incarceration in childhood and depression, post-traumatic stress disorder, and anxiety during adolescence. These studies, however, utilize self-reported behavioral and mental health symptoms, which may encounter confounding due to recall or response bias. In addition, Wakefield and colleagues employ three different data sources and report greater externalizing and internalizing behavior among children following paternal incarceration. Their study also finds greater racial disparities in childhood behavioral problems as a function of the increased risk of Black paternal incarceration (1990 incarceration rates) as compared to simulated incarceration rates from the 1970s or no incarceration.

A smaller body of work empirically assesses the mental health of women following incarceration of their male partners. 194,197 A study using nationally representative data from the National Survey of American Life examined familial incarceration and mental health among Black women. 46 Their findings indicate that familial incarceration corresponds with higher levels of depression and psychological distress in Black women. 46 Moreover, analyses report that having fixed roles in the community, such as employment, attenuated the relation between incarceration and adverse mental health. 46 Another longitudinal study using the Fragile Families and Child Wellbeing Study examined whether recent partner incarceration among women corresponded with their own drug, alcohol, and cigarette use. 197 Using both linear probability models and propensity score matching, the Authors find a positive relation between partner incarceration and drug use. 197 Furthermore, this relation concentrates in Black women and women who previously lived with their incarcerated partners. 197

At the population level, scholars report a multitude of adverse health outcomes, including preterm birth, sexually transmitted disease, cardiovascular disease, mortality, mental health, as well as changes in health service utilization that correspond positively with county and state-

level incarceration. 70,182,198-202 In an ecological study conducted between 1999 and 2015, researchers report greater odds of preterm birth among Black and white women living in counties with the highest quintile of jail incarceration compared to women living in the lowest quintile of jail incarceration in the US. 182 As a measure of structural racism that leverages elements of the Ecosocial theory, the Authors also test whether the difference in county jail incarceration among Black and white populations corresponds with greater preterm birth among women. 182 This test examines whether the racial/ethnic inequities in incarceration contribute to similar inequities reported in preterm birth. The study finds that the difference in county jail incarceration coincides with greater preterm birth among both Black and white women in the highest quintile of incarceration when compared to the lowest quintile of incarceration. 182 Additionally, one study reports increased Emergency Department (ED) visits per 1,000 residents as a function of a greater proportion of former inmates within a state after controlling for between-state heterogeneity. 198 Theoretically, the researchers argue that having a greater proportion of former inmates results in an increased number of uninsured individuals that utilize the ED for healthcare services. 198 They support this hypothesis using results from individuallevel data, but also report the "spillover effects" of former incarceration on the broader population in aggregate-level analyses examining within-state changes in ED visits. 198

Of most relevance to my analysis, Hatzenbuehler and colleagues assess mental health among individuals living in neighborhoods with heightened incarceration.⁷⁰ Substantial work on incarceration and mental health previously focused on the mental health of those formerly incarcerated or family members of incarcerated individuals.⁷⁰ This study, by contrast, reports the first ecological test of community-level incarceration and the mental health of those not directly tied to incarceration.⁷⁰ Surveying a panel of individuals over four waves, the scholars utilized clinically valid and reliable measures of depression and anxiety to assess mental health changes over time.⁷⁰ Individuals living in neighborhoods with greater prison admission rates in

Detroit have a higher likelihood of current and lifetime Major Depressive Disorder and Generalized Anxiety Disorder than those living in neighborhoods with lower prison admission rates after accounting for individual and neighborhood characteristics. ⁷⁰ Sensitivity analyses controlling for personal contact with the justice system do not change inference from the original test. ⁷⁰

The current literature on this topic remains limited in the following ways. First, previous work does not examine whether incarceration corresponds with greater psychiatric help-seeking, such as seeking emergency care due to acute mental health needs. Although studies have shown increases in adverse mental health and ED utilization following current and former incarceration, respectively, further examination of psychiatric ED visits may indicate greater mental health service needs in communities with heightened incarceration. Second, studies do not assess whether racial/ethnic inequities in incarceration coincide with greater adverse mental health in Black Americans. Previous work finds a relation between racial/ethnic inequities in incarceration and preterm birth, suggesting that justice-related indicators for structural racism may also precede changes in adverse mental health. 182 Third, previous studies do not assess adverse mental health as a function of incarceration at the county level. The long-arm of incarceration may contribute to adverse mental health in populations beyond the neighborhood, as studies have found changes in birth outcomes, sexually transmitted diseases, and mortality as a function of incarceration within counties. 182,199-201 Counties may serve as a critical level of aggregation due to county-level policies, jail administration, and litigation. Fourth, there are only a limited set of ecological analyses that would inform theory linking incarceration and adverse mental health through the potential erosion of social capital and breakdown of family networks. Any discovered 'indirect effect' of incarceration could have implications for psychiatric helpseeking beyond the individuals and families of those incarcerated.

I address these limitations and extend previous literature by examining whether incarceration corresponds positively with psychiatric ED visits among Black Americans. I use annual variation in psychiatric ED visits among Black Americans as a function of incarceration and the ratio of Black to white incarceration in 404 counties in the US between 2006-2015. Results may hold particular relevance to understanding the ecology of the justice system and its potential to exacerbate acute mental health needs in the Black community beyond expected levels.

Methods

Study Population

I obtained the outcome, psychiatric ED visits among non-Hispanic Black Americans (per 100,000 population) from the Statewide Emergency Department Database (SEDD). ¹⁰⁵ The Agency for Healthcare Research and Quality (AHRQ) makes SEDD available for purchase under the Healthcare Cost and Utilization Project (HCUP). ¹⁰⁵ Participating states contract with HCUP to make visit-level data available for purchase from all hospitals with an ED. ¹⁰⁵ Following cross-validation with American Hospital Association surveys, SEDD provides 99% of all ED visits for participating states. ¹⁰⁵ Much epidemiologic and healthcare services research utilizes this high-quality database. ^{106,107,112} This study comprised counties from ten US states that report county identifiers and year of visit. States in the study sample included Arizona, California, Florida, Kentucky, Maryland, Massachusetts, New Jersey, New York, North Carolina, and Rhode Island from 2006-2015. These years represent the longest consecutive series of SEDD-providing states with complete race/ethnicity data.

Study Measures

The aggregate county-year prevalence of psychiatric ED visits among Black Americans is the outcome variable. I classified an ED visit as psychiatric if any visit-level diagnosis (from diagnostic codes 1 to 25) corresponded with a psychiatric ICD-10 code according to Clinical

Classification Software categories developed by the AHRQ.²⁰³ I aggregated a total of 8,740,370 psychiatric ED visits among Black Americans by county-year and converted these counts to population prevalence estimates (per 100,000 population) using race-specific county-level population denominators from the US Census Bureau's Population Estimates database.²⁰⁴ Although these outcome data provide the opportunity for monthly resolution, in order to link estimates to the exposure of interest, I aggregated psychiatric ED visits annually. Additionally, I aggregated the outcome at the county level due to the fact that policies, health services, and funding that may influence processes of EDs often operate at the county-level. ED data at the county level also allowed for geographic linkage to the exposure of interest.

For the exposure, I retrieved data on annual prison and jail incarceration (per 100,000) among Black and white populations from the Vera Institute of Justice "In Our Own Backyard" (IOB) Incarceration Trends dataset. 205 IOB provides county-level data on incarcerated populations by race/ethnicity in prisons and jails.²⁰⁵ Incarceration within counties, rather than states, may hold particular relevance to policies deployed by judges, prosecutors, and police at the county level.²⁰⁵ Vera Institute of Justice validated estimates by comparing state-level findings to the Bureau of Justice Services National Prisoner Statistics Program. 206 Previous epidemiologic literature has also utilized this dataset to examine health outcomes as a function of incarceration. 182,199,200 Using race-specific county-year population denominators from the US Census Bureau's Population Estimates database, I converted prison and jail population counts to population prevalence estimates (per 100,000 population) for Black Americans and whites. 204 I then averaged prison and jail population prevalence estimates (per 100,000 population) to calculate incarceration prevalence estimates (per 100,000 population). I used the ratio of non-Hispanic Black to non-Hispanic white incarceration as a proxy for structural racism in the justice system. The ratio reflects the multiplicative difference in incarceration between Black and white populations, which ranges from five to more than seven times greater for Black populations

within a county-year. Additionally, previous comprehensive measures of structural racism have utilized the ratio of incarceration between Black and white populations to examine health disparities and the justice system. ^{207,208} However, because previous work has also utilized the difference in incarceration between the race/ethnicities as a measure of structural racism, I used a difference measure as a sensitivity check for my analyses. ¹⁸² Both constructs have limitations as counties with incarceration rates at the extremes (i.e., high or low) may have similar measures of structural racism in incarceration. The fixed effects analyses should nevertheless capture the changes in the ratios and differences over time (rather than measure their absolute values).

Violent crime or increased arrests within counties may influence both the exposure and outcome. Previous work finds that individuals living in areas with higher crime rates have a greater likelihood of depression and anxiety disorders compared to individuals living in lower crime areas.²⁰⁹ Arrests for violent crimes within counties may also lead to incarceration below or above expected levels. Following arrest, the government charges and then convicts individuals of crimes at either the state- and/or federal level.²¹⁰ Charge-level data remain limited among state offenses; however, in 2006 the Bureau of Justice Statistics reported that state governments sentenced 73% of convicted felons to prison or jail.²¹¹ In the same year, only 57% of misdemeanors went on to sentenced incarceration.²¹¹ Among federal offenses, approximately 44% of arrests received charges in 2019. 210 In my linked dataset, I find a modest, inverse correlation between arrests for violent crimes and incarceration, which parallels figures reported by the Bureau of Justice Statistics. 210,211 As such, I utilized data on arrests for violent crimes from the Uniform Crime Reporting (UCR) database as a control variable. 212-214 The Federal Bureau of Investigation (FBI) provides UCR data with information on arrests for violent crime from 18,000 participating city, county, university, tribal, and federal law enforcement agencies.²¹⁵ As a publicly available dataset, UCR remains one of the most extensively used

crime repositories in the US.²¹⁵ I converted annual arrest counts to population prevalence estimates (per 1,000 population) and utilized this estimate as a covariate. I also controlled for county-level factors that may confound the relation between incarceration or psychiatric ED visits over the study period. These covariates included county-level factors such as number of hospitals reporting visits (i.e., closure or opening of EDs) and other socioeconomic determinants of mental health and crime, including percent unemployed and percent below the federal poverty line.^{216–218}

Analysis

I linked county aggregates of psychiatric ED visits and incarceration with other county-level covariates using Federal Information Processing Standards (FIPS) codes. ¹⁰⁹ This linkage yielded a total analytic sample of 404 counties, from ten states, between 2006-2015 (i.e., 4,040 county-years). Psychiatric ED visits showed a right-skewed distribution, in that more than half of the county-years (2,095) exhibited psychiatric ED visits (per 100,000 population) between one and 5,000 (Figure 4.1). I, therefore, log-transformed the outcome to approximate a normal distribution and minimize the influence of outliers (Figure 4.2). ²¹⁹ I tested whether psychiatric ED visits (per 100,000 population) increase following greater incarceration (per 100,000 population) among Black Americans using Ordinary Least Squares (OLS) linear regression analysis. Additionally, I examined whether the ratio of Black to white incarceration (an estimate of structural racism) corresponds with greater psychiatric ED visits.

I used county-year arrests (per 1,000 population), number of hospitals reporting visits, percent unemployed, and percent below the federal poverty line as control variables. I also incorporated year indicators to reduce confounding from annual factors (i.e., policies associated with drug reform or the Affordable Care Act) that may precede changes in incarceration or psychiatric emergency care during the study period.

I begin with the following model using OLS regression analysis with a fixed effects specification:

 $Y_{c,y} = \beta_0 + \beta_1 X_{c,y} + \beta_2' H_{c,y} + \beta_3' A_{c,y} + \beta_4' U_{c,y} + \beta_5' P_{c,y} + \beta_6' County_c + \beta_7' Year_k + \varepsilon_{c,m}$ where:

 $Y_{c,m}$ is the population prevalence of psychiatric ED visits (per 100,000 population) among Black Americans in county c during year y.

 $X_{c,y}$ is the exposure X incarceration (per 100,000 population), for the concurrent year y, in county c. β_1 is the key coefficient of interest in the analysis.

 $H_{c,y}$ is the number of Emergency Departments (or reporting hospitals) within a county c, during year y, that report data on psychiatric ED visits. Inclusion of this control variable accounts for changes over time in ED visits following closure or opening of EDs.

 $A_{c,y}$ is the population prevalence of arrests for violent crimes (per 1,000 population) in county c, during year y. Inclusion of this control variable accounts for changes in arrests in a county-year.

 $U_{c,y}$ is the proportion of unemployed individuals in county c, during year y. Inclusion of this control variable accounts for the socioeconomic determinants of mental health and criminal justice involvement.

 $P_{c,y}$ is the proportion of individuals below the federal poverty line in county c, during year y. Inclusion of this control variable accounts for the socioeconomic determinants of mental health and criminal justice involvement.

 $County_c$ is the vector of indicator variables for individual counties (county fixed effects). $Year_k$ is the vector of year indicators that control for year-specific changes in ED visit rates (e.g., policy changes such as the Affordable Care Act) across all counties. $\varepsilon_{c,y}$ is the heteroscedasticity-robust standard error term to account for correlated residual

errors.

A fixed effects model specification controls for time-invariant county-level characteristics that may influence the exposure or the outcome such as access to healthcare.²²⁰ The panel structure of the data may lead to more strongly correlated prevalence estimates within counties than across counties.²²¹ As such, this specification forced within-county measurement by removing mean values for each county and examining year-to-year changes.^{152,153}

I also conducted three sensitivity tests. First, I re-estimated the models and adjusted for outliers below the 5th or 95th percentile in the outcome. This adjustment determines whether extreme values in psychiatric ED visits drove any discovered association with incarceration (per 100,000 population) among Black Americans. Second, I assessed the sensitivity of results to log-transformation of the dependent variable. Third, I examined psychiatric ED visits among Black Americans as a function of an additional measure of structural racism: the difference in incarceration (per 100,000 population) between Black and white individuals within a county. Multiple measurements of structural racism, as used by previous scholars, may illuminate differences in the theoretical understanding of this growing literature. 182,222,223

As falsification checks, I conducted the following two tests: 1) whether incarceration among whites corresponds with changes in psychiatric ED visits among whites; and 2) whether the ratio of Black: white incarceration coincides with changes in psychiatric ED visits among whites. Given that incarceration in the US concentrates in low-income Black communities, I may not find any relation between incarceration and psychiatric ED visits among whites. However, the erosion of social capital and breakdown of family networks may also exist in white communities, leading to increases in psychiatric ED visits. I conducted all analyses using Stata SE 16.0. The University of California, Irvine, Institutional Review Board approved this study (#20195613).

Results

The study sample shows an average of 10,350.92 psychiatric ED visits per 100,000 population per county-year among Black Americans (Table 4.1). Incarceration among Black Americans averages 24.33 per 100,000 population per county-year (Table 4.1). As seen in Table 4.1, the ratio of Black to white incarcerated populations has a mean value of 6.16 over the study period. Figure 4.3 plots psychiatric ED visits (per 100,000 population) among Black Americans in the test counties over time. Consistent with previous literature, psychiatric ED visits show a secular increase from 2006-2015. 107,154 Figure 4.4 plots incarceration (per 100,000 population) among Black Americans over the study period. Figure 4.5 shows the ratio of Black to white incarceration by county-year. The decrease in incarceration among Black Americans coheres with current population-level trends in the US. However, Black Americans still remain overrepresented in the US carceral system.

Table 4.2 shows results from linear fixed effects regression analysis examining log-transformed psychiatric ED visits (per 100,000 population) as a function of incarceration (per 100,000 population) among Black Americans. One additional incarceration (per 100,000 population) corresponds with a 1.4% increase in psychiatric ED visits (per 100,000 population) among Black Americans in that county-year (coef=0.014, SE=0.005, p<0.001) (Table 2). Table 4.3 reports the relation between the ratio of Black to white incarceration (i.e., a gauge of structural racism in incarceration) and psychiatric ED visits (per 100,000 population) among Black Americans. Structural racism in incarceration coincides with a 2.2% increase in psychiatric ED visits (coef=0.022, SE=0.011, p<0.05) (Table 4.3).

I assessed three sensitivity tests: 1) outlier adjustment (Table 4.4); 2) sensitivity of results to log-transformation of the dependent variable (Table 4.5); and 3) utilizing the difference of prison

incarceration between Black and white populations (by county year) as a measure of structural racism (Table 4.6). Inference from the sensitivity analyses for outlier adjustment and the difference in prison incarceration between Black and white populations remain robust to the original findings. I find no relation between incarceration and psychiatric ED visits among Black Americans (per 100,000 population) prior to log transformation, showing that the results appear sensitive to the functional form (i.e., log transformation) of the exposure variable. Skewed values below the 5th percentile drive the null result prior to log transformation. Counties from all ten states in the analyses comprise outliers in the non-log transformed outcome variable, with approximately the same number of rural and urban counties.²²⁵ Lastly, I find no relation between incarceration among whites and psychiatric ED visits among whites (Table 4.7). The ratio of Black to white incarceration also does not correspond with psychiatric ED visits among whites (Table 4.8).

Discussion

Black Americans comprise 40% of the incarcerated population but only 13% of the US population.³⁸ The breakdown of networks and community from overrepresentation in the carceral system may incite greater psychiatric morbidity in the broader Black population. Fixed effects methods indicate a modest, positive relation at the county-year level between incarceration and psychiatric ED visits among Black Americans. I also find that annual deviations in the intensity of incarceration among Black Americans relative to white individuals (measure of structural racism) correspond positively with psychiatric help-seeking among Black Americans.

My findings may cohere with the theoretical underpinnings of incarceration's influence on the broader population not necessarily connected directly to the incarcerated person. Incarceration

removes individuals from family and social networks, eliminating financial or supportive contributions to households, as well as participation in communities. ^{69,73,175,183,226} As evidenced by previous literature, social ties, both strong and weak, have substantial benefits for mental health. 189-191 Theorists and empirical scholars have also compared the influence of the carceral system in the US to acts of forced migration.²²⁷ This body of work indicates that social destabilization, resulting in the removal of specific groups, has preceded changes to gender ratios in certain regions as well as the breakdown of social cohesion.²²⁷ Such disruption may change social norms established within communities that help prevent disease. 227 Loss of groups of individuals from mass incarceration, specifically Black men with lower educational backgrounds, results in the forfeiture of monetary and familial support for numerous networks.⁶⁹ Disruption of such networks, through elimination of male role models, partners, and children, further exacerbates distress in already disadvantaged communities. 99,186,228 Although my study does not directly assess whether social capital and family networks mediate or moderate the relation between incarceration and acute mental health, further work would benefit from such an understanding. Well-established stigmatizing attitudes towards routine mental health treatment and untreated mental illness may also result in use of the ED for psychiatric care in the Black community.99

I find that structural racism in incarceration may have a modestly greater influence on psychiatric help-seeking than the prevalence of incarceration among Black Americans (1.4% vs. 2.2% increase). This finding highlights the prominence of differential access to opportunities among Black Americans and whites due to legislation and actions by the criminal justice system, such as disparities in drug arrests or crack cocaine sentencing. ^{2,177,178} In turn, these actions reinforce racial/ethnic biases that contribute to adverse health in Black populations. ^{2,207} These findings offer credence to the often invisible systemic factors that contribute toward racial biases in the criminal justice system and the "indirect effects" on those not directly involved in

the system. I also find no relation between structural racism in incarceration and psychiatric ED visits among whites. This coheres with the broader literature that suggests that indicators for structural racism either do not correspond with or have salutary benefits to health outcomes among white Americans.²⁰⁷ Lastly, my analyses consistently report a decrease in psychiatric ED visits as a function of greater arrests for violent crime. This finding coheres with previous studies conducted on the concept of 'transinstitutionalization' of mental illness from psychiatric hospitals to the justice system. Reductions in public psychiatric hospitals and beds following deinstitutionalization in the US have led to increases in arrests and incarceration, even after accounting for unemployment and poverty.^{229,230} Further work would benefit from better understanding the pathways by which inpatient stays and ED visits for psychiatric conditions may function in relation to incarceration.

Strengths of the analysis include the use of comprehensive, state-wide datasets for psychiatric, depression, and anxiety ED visits. I also utilized clinically diagnosed ICD-10 codes for psychiatric ED visits. The fixed effects specification accounted for time-invariant characteristics at the county-level. Year indicators also controlled for exogenous shocks that may have altered psychiatric ED utilization or incarceration, such as the Affordable Care Act or drug reform policies. I also accounted for potential confounders, such as heightened arrests for violent crimes and fluctuations in county-level socioeconomic factors that may correspond with the exposure or the outcome. My findings contribute to the growing literature on structural racism and health, operationalized as the ratio of incarceration among Black and white individuals within a county-year. Extending previous work on neighborhood incarceration and mental health, my findings also suggest that the long-arm of incarceration influences psychiatric help-seeking within counties by race/ethnicity.

This study has limitations. My findings do not comprise the prevalence of psychiatric conditions in the population, as not all individuals seek psychiatric care in the ED. Therefore, the results may represent the lower bound of psychiatric conditions in the population. Additionally, data limitations prevent examination of the exposure and the outcome in all US counties. However, my study sample includes states from each of the four regions in the US and comprises 20% of the country's population.²³¹ The results also appear sensitive to log-transformation of the dependent variable, psychiatric ED visits. Outlier counties below the 5th percentile prior to log-transformation of the outcome drive these null results. Log-transformation, however, more closely approximates the assumption for linear regression in that residuals follow a normal distribution, while also preventing outliers from driving the relation between the exposure and the outcome.²²⁰ Further investigation of differences in outlier counties and states may provide greater insight into shared characteristics driving these results.

Additionally, the IOB dataset (created from the National Corrections Reporting Program) provides incarceration data on the county in which courts impose a sentence, which may differ from the county of residence. This may impede use of theories on the breakdown of family networks and social capital as incarcerated populations within counties may consist of individuals who reside in other counties within the same state. The Federal Bureau of Prisons considers several factors when determining an inmate's designation following conviction: level of security, programming needs (i.e., substance use treatment), bed availability, as well as primary residence. Specifically, the Federal Bureau of Prisons prioritizes placement in institutions that remain reasonably close to anticipated home release locations, subject to other factors. Jails and prisons may also function differently, in this regard, in that cities, local districts, and counties operate jails, whereas states and federal governments manage prisons. Measurement of within-county changes over time in this study, however, may control for time-invariant characteristics such as types of facilities located within counties and their subsequent

programming and security for inmates. This may not account for confounding due to the introduction of new prisons within localities; however, sources report that states have slowed building new prisons since the industry expanded significantly between 1990-2005 (prior to the study period of 2006-2015). One study finds that approximately 35% of individuals live within 100 miles of their designated prison; however, limited research exists on whether patterns differ for jails given their localized jurisdiction. Use of both prison and jail incarceration in this study, however, may provide the most inclusive evaluation of within-county changes. Availability of more fine-grained data with information on county of residence would allow for a more rigorous analysis of the pathways by which incarceration weakens family networks and social capital.

Suicides have increased substantially in the past two decades, becoming the second leading cause of death among Black youth aged 13 to 19 years. Suicide rates among certain Black age groups have surpassed those of whites. Previous work reports that familial incarceration precedes greater adverse mental health among children. One study finds that racial bias in parental imprisonment corresponds with increased mental health disparities in adolescents. Given the significant racial disparity in parental incarceration, with one in ten Black youth having an imprisoned parent, an evaluation of incarceration and suicide among Black youth may uncover underlying ecological risk factors contributing to the current rise and disparity in suicides.

Since 2010, California, New York, and other states have implemented policies reclassifying drug possession from felonies to misdemeanors.²³⁷ Felony convictions for drug possession impose burdens on communities of color, in particular.¹⁷⁸ Black Americans remain three- to four times more likely to get arrested for illegal drugs, as opposed to whites, after controlling for criminal disposition.¹⁷⁸ California's Proposition 47 (The Safe Neighborhoods and Schools Act in 2014)

reclassified low-level drug and property crimes from felonies to misdemeanors and reinvested funds into community mental health and substance use programs, substantially influencing populations of color.²³⁸ Scholars find that Proposition 47 has not only preceded a decrease in prison populations, but also shown a decline in racial/ethnic disparities in drug arrests.^{238,239} Further research would benefit from evaluating whether drug reform policy and the subsequent reduction in incarceration may have salutary benefits to broader community mental health among racial/ethnic minorities.

Racial disparities in incarceration capture one facet of criminal justice within the broader racial discrimination system. Theorists posit that residential location, education, health, housing, credit markets, labor, as well as justice subsystems comprise a reciprocating, integrated system. Although evaluating structural racism in incarceration allows for directed policy change, such as state-level drug reform, populations released from prison or jail may continue to face barriers within housing and labor markets. These barriers may subsequently lead populations back to the justice system, also known as the "revolving door of the justice system." The reinforcing nature of these subsystems has prompted researchers to create multidimensional measures for structural racism, incorporating racial disparities within each facet. Pindings report that comprehensive measures correspond with adverse health outcomes in the Black community. Research on psychiatric help-seeking as a function of inclusive structural racism measures may also provide the context necessary to better understand racialized inequality in health.

Figure 4.1 Frequency distribution of psychiatric ED visits among Black Americans (per 100,000 population) across 404 counties (10 states: AZ, CA, FL, KY, MA, MD, NJ, NY, RI, NC), over 10 years, 2006-2015.

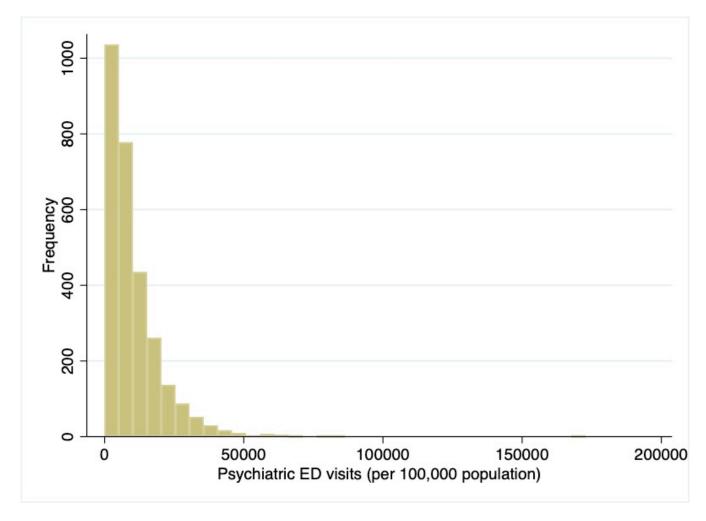


Figure 4.2 Frequency distribution of psychiatric ED visits among Black Americans following log-transformation (per 100,000 population) across 404 counties (10 states: AZ, CA, FL, KY, MA, MD, NJ, NY, RI, NC), over 10 years, 2006-2015.

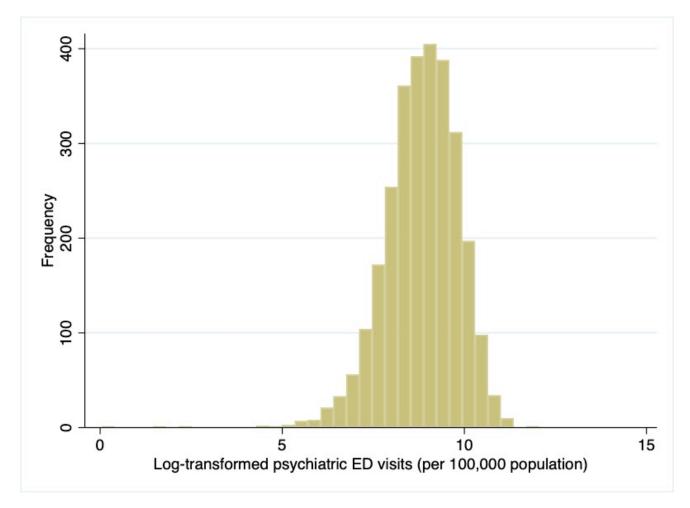


Table 4.1. County-level emergency department, incarceration, and socioeconomic characteristics of 404 counties from ten US states^a, 2006-2015.

Variable	Mean (SD)
Psychiatric ED visits among Black Americans (per 100,000 population)	10,350.92 (10,074.39)
Incarceration among Black Americans (per 100,000 population)	18.99 (11.56)
Black:white incarceration ratio	6.16 (3.96)
Arrests (per 1,000 population)	6.25 (9.57)
Percent unemployed (%)	7.85 (3.01)
Percent below the federal poverty line (%)	15.99 (6.16)
Number of hospitals	123.90 (969.44)

^aCounties from the following states: Arizona, California, Florida, Kentucky, Massachusetts, Maryland, New Jersey, New York, Rhode Island, and North Carolina

Figure 4.3. Psychiatric ED visits per 100,000 population among Black Americans from 404 counties in ten US states, 2006-2015.

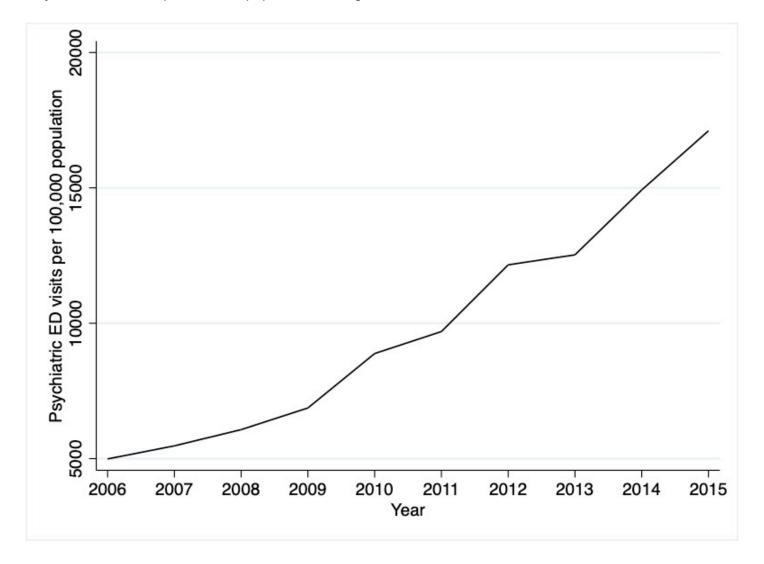


Figure 4.4. Incarceration per 100,000 population among Black Americans in 404 counties from ten US states, 2006-2015.

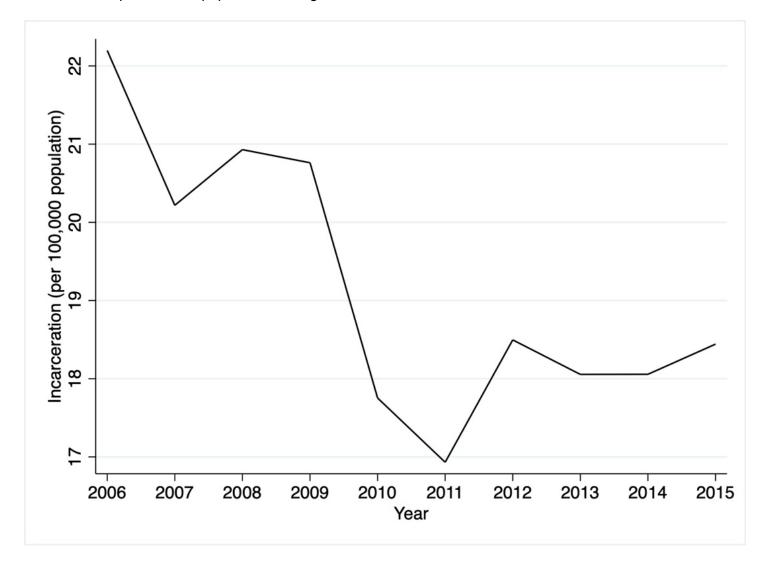


Figure 4.5. The ratio of incarceration of Black Americans to white individuals in 404 counties from ten US states, 2006-2015.

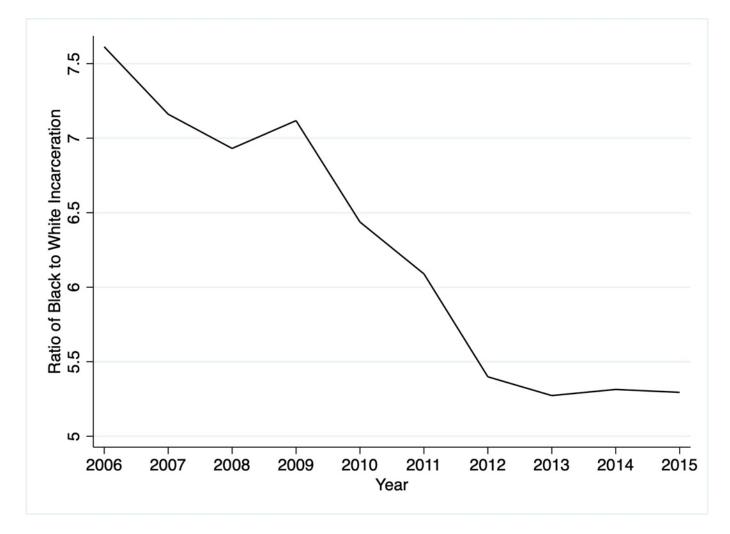


Table 4.2. Ordinary Least Squares fixed effects regression results predicting log transformed psychiatric ED visits (per 100k population) among Black Americans as a function of incarceration among Black Americans (per 100k population) in 404 counties from ten US states, 2006-2015.

Covariate		Psychiatric ED visits	
		Coefficient	Standard Error ^a
Incarceration among Black Americans (per 100,000 population)		0.014***	0.005
Arrests (per 1,000 population)		-0.003***	0.001
Percent unemployed (%)		0.005	0.015
Percent below the federal poverty line (%)		0.003	0.008
Number of hospitals		2.657E-4	2.035E-4
Year (reference: 2006)			
	2007	-0.016	0.043
	2008	0.139**	0.057
	2009	0.342****	0.092
	2010	0.467****	0.103
	2011	0.598****	0.099
	2012	0.741****	0.092
	2013	0.824****	0.082
	2014	0.999****	0.074
	2015	1.141****	0.075
N			2,360

^{*}p<0.1; **p<0.05, ***p<0.01 ****p<0.001 aRobust standard errors

Table 4.3. Ordinary Least Squares fixed effects regression results predicting log transformed psychiatric ED visits (per 100k population) among Black Americans as a function of the ratio of incarceration of Black Americans to whites in 404 counties from ten US states, 2006-2015.

Covariate	Psychiatric ED visits	
	Coefficient	Standard Error ^a
Ratio of incarceration of Black Americans to whites	0.022**	0.011
Arrests (per 1,000 population)	-0.003***	0.001
Percent unemployed (%)	0.004	0.015
Percent below the federal poverty line (%)	0.001	0.008
Number of hospitals	2.687E-4	2.085E-5
Year (reference: 2006)		
2007	-0.016	0.043
2008	0.146**	0.056
2009	0.347****	0.091
2010	0.470****	0.101
2011	0.594****	0.097
2012	0.740****	0.090
2013	0.822****	0.081
2014	0.998****	0.073
2015	1.142****	0.074
N	2	2,356

^{*}p<0.1; **p<0.05, ***p<0.01 ****p<0.001 aRobust standard errors

Table 4.4. Outlier-adjusted linear fixed effects regression results predicting log transformed psychiatric ED visits (per 100k population) among Black Americans as a function of incarceration among Black Americans (per 100k population) in 404 counties from ten US states, 2006-2015.

Covariate		Psychiatric ED visits	
		Coefficient	Standard Error ^a
Incarceration among Black Americans (per 100,000 population)		0.009**	0.004
Arrests (per 1,000 population)		-0.003***	9.554E-4
Percent unemployed (%)		-0.003	0.014
Percent below the federal poverty line (%)		-3.952E-4	0.008
Number of hospitals		1.662E-4	1.386E-4
Year (reference: 2006)			
	2007	0.013	0.027
	2008	0.180****	0.041
	2009	0.360****	0.082
	2010	0.467***	0.089
	2011	0.586****	0.085
	2012	0.689****	0.079
	2013	0.759****	0.070
	2014	0.917***	0.061
	2015	1.054****	0.066
N		2	,108

^{*}p<0.1; **p<0.05, ***p<0.01 ****p<0.001

^aRobust standard errors

Table 4.5. Ordinary Least Squares fixed effects regression results predicting psychiatric ED visits (per 100k population) <u>without log transformation</u> among Black Americans as a function of incarceration among Black Americans (per 100k population) in 404 counties from ten US states, 2006-2015.

Covariate		Psychiatric ED visits	
		Coefficient	Standard Error ^a
Incarceration among Black Americans (per 100,000 population)		6.507	60.50
Arrests (per 1,000 population)		-35.631****	8.373
Percent unemployed (%)		-61.097	161.713
Percent below the federal poverty line (%)		9.408	72.128
Number of hospitals		1.223	1.091
Year (reference: 2006)			
	2007	-606.796**	307.284
	2008	828.193**	350.075
	2009	2474.000**	893.849
	2010	2922.206**	982.485
	2011	4073.241****	930.771
	2012	5551.775****	858.937
	2013	6349.788****	764.806
	2014	8459.444***	648.733
	2015	9635.266****	771.269
N		2	,108

^{*}p<0.1; **p<0.05, ***p<0.01 ****p<0.001

^aRobust standard errors

Table 4.6. Ordinary Least Squares fixed effects regression results predicting log transformed psychiatric ED visits (per 100k population) among Black Americans as a function of the-difference in incarceration between Black Americans and whites in 404 counties from ten US states, 2006-2015.

Covariate	Psychiatric ED visits	
	Coefficient	Standard Error ^a
Difference in incarceration between Black Americans and whites (population per 100,000)	0.015***	0.005
Arrests (per 1,000 population)	-0.003***	0.001
Percent unemployed (%)	0.005	0.015
Percent below the federal poverty line (%)	0.003	0.008
Number of hospitals	2.659E-4	2.033E-4
Year (reference: 2006)		
2007	-0.016	0.0427
2008	0.141**	0.057
2009	0.345****	0.092
2010	0.473****	0.103
2011	0.605****	0.099
2012	0.753****	0.092
2013	0.834***	0.082
2014	1.011****	0.074
2015	1.152****	0.076
N	2	2,357

^{*}p<0.1; **p<0.05, ***p<0.01 ****p<0.001 aRobust standard errors

Table 4.7. Ordinary Least Squares fixed effects regression results predicting log transformed psychiatric ED visits (per 100k population) <u>among whites</u> as a function of incarceration among whites (per 100k population) in 404 counties from ten US states, 2006-2015.

Covariate	Psychiatric ED visits	
	Coefficient	Standard Error ^a
Incarceration among whites (population per 100,000)	-0.020	0.024
Arrests (per 1,000 population)	-0.001	0.001
Percent unemployed (%)	0.001	0.015
Percent below the federal poverty line (%)	0.002	0.010
Number of hospitals	4.082E-4	2.515E-4
Year (reference: 2006)		
2007	-0.022	0.054
2008	0.193****	0.054
2009	0.341***	0.095
2010	0.436****	0.107
2011	0.552****	0.103
2012	0.665****	0.094
2013	0.718****	0.087
2014	0.885****	0.072
2015	0.965****	0.078
N	2	2,519

^{*}p<0.1; **p<0.05, ***p<0.01 ****p<0.001
aRobust standard errors

Table 4.8. Ordinary Least Squares fixed effects regression results predicting log transformed psychiatric ED visits (per 100,000 population) <u>among whites as a function of the ratio of incarceration among Black Americans to whites in 404 counties from ten US states, 2006-2015.</u>

Covariate		Psychiatric ED visits	
		Coefficient	Standard Error ^a
Ratio of incarceration of Black Americans to whites		0.010	0.014
Arrests (per 1,000 population)		-0.002**	8.819E-4
Percent unemployed (%)		-0.004	0.015
Percent below the federal poverty line (%)		0.006	0.010
Number of hospitals		3.788E-4	2.399E-4
Year (reference: 2006)			
200	7	0.010	0.051
200	8	0.197***	0.055
200	9	0.359****	0.093
201	0	0.457***	0.105
201	1	0.572****	0.102
201	2	0.672****	0.097
201	3	0.714****	0.091
201	4	0.870****	0.079
201	5	0.971****	0.080
N		2	,369

^{*}p<0.1; **p<0.05, ***p<0.01 ****p<0.001

^aRobust standard errors

CHAPTER 5: CONCLUSION

Summary of Main Findings

Black Americans have a higher likelihood of police stops, police killings, and incarceration as opposed to non-Hispanic whites after accounting for differences in criminality. Such racial disparities may represent indicators of structural racism in the criminal justice system. Social, economic, and legal pathways have perpetuated such disparities, normalizing their occurrence over time. Inequities in the criminal justice system may have broader mental health implications for minoritized communities at large. Previous work finds greater mental health symptoms following direct exposure to police and incarceration. Ecological work also reports an increase in depression and anxiety symptoms among Black populations — not directly tied to the event — following increases in police stops, police killings of unarmed Black Americans, and incarceration. My research extends previous literature and evaluates whether these indicators of structural racism in the criminal justice system precede increases in psychiatric emergencies among Black Americans.

In Chapter 2, I examine the NYC SQF policy and assess whether police stops, stops including frisking, and stops including use of force vary positively with psychiatric emergencies among Black Americans. I evaluate theories on hypervigilance from policing while also addressing confounding due to trends, seasonality, and memory by utilizing ARIMA methods. I find that police stops correspond with a 0.02 increase in psychiatric ED visits among Black Americans. Stops including frisking coincide with a 0.05 increase in psychiatric ED visits and stops including use of force show a 0.11 increase in psychiatric ED visits among Black Americans. In Chapter 3, I evaluate whether police killings of unarmed Black Americans precede increases in psychiatric emergencies in the Black population by way of vicarious racism and linked fate.

This study measures within-county changes over time and accounts for time-invariant characteristics that may influence the exposure or the outcome. I report that police killings of unarmed Black Americans correspond with an 11% increase in ED visits related to depression (per 100,000 population) among Black Americans in the concurrent month and three months following the exposure. In Chapter 4, I assess whether year-to-year changes in incarceration vary positively with year-to-year changes in psychiatric emergencies among Black Americans through the breakdown of familial networks and social capital. I find that a one-unit increase in incarceration (per 100,000 population) corresponds with a 1.4% increase in psychiatric ED visits (per 100,000 population) among Black Americans. Structural racism in incarceration (i.e., one unit increase in ratio Black and white incarceration) also varies positively with a 2.2% increase in psychiatric ED visits (per 100,000 population).

My three analytical studies add to the current research in several ways. First, I extend the previous literature and find increases in a more acute form of mental health among Black populations, psychiatric emergencies, as a function of police stops, police killings of unarmed Black Americans, and incarceration. Greater psychiatric help-seeking at emergency departments suggests the need for greater access and availability of more routine mental health care options, such as care at Community Health Centers. More comprehensive insurance coverage and increases in the number of providers that can deliver psychiatric care may also buffer the influence. Unlike previous work, this research also investigates criminal justice and mental health relationships by race/ethnicity. Given the disproportionate rates of police stops, police killings, and incarceration among Black populations, evaluation of mental health outcomes by race/ethnicity reveals pathways to health equity through public policy or behavioral interventions. This research also evaluates psychiatric emergencies among Black Americans as a function of indicators of structural racism in the criminal justice system through methodology that reduces confounding from time trends, seasonality, and time-invariant characteristics by

measuring within-county changes over time. Lastly, my work enhances the current theoretical and empirical use of structural racism indicators by utilizing criminal justice measures that not only show substantial racial disparities, but also specify the additive and multiplicative differences between non-Hispanic Black and non-Hispanic white populations.

Black communities experience greater psychiatric help-seeking following increases in police stops, police killings of unarmed Black Americans, and incarceration. Reduction in the racial disparity in policing and incarceration may reduce the acute, adverse mental health experienced by Black populations. Findings also demonstrate that racial inequities in one social system, criminal justice, correspond with inequities in another social system, healthcare. Intersystem influences further exemplify the reach of racism at the institutional level. Policies enforcing changes in policing behavior or sentencing reforms, as well as greater access and availability of psychiatric care, may provide the pathways necessary to better achieve health equity.

Strengths and Limitations

Strengths of this work include use of exposures that span the continuum of the criminal justice system – from police stops to incarceration – to comprehensively capture the racial bias present in policing. Police encounters begin with a stop that may result in a police killing or the eventual incarceration of individuals. The racial bias in policing, however, remains persistent in police traffic stops, juvenile arrests, drug arrests, jail time after arraignment, prison sentences, probation revocation, as well as disenfranchisement. These features may also contribute to the overall psychiatric morbidity of Black Americans in the broader population, which these studies may not have captured.

Previous work in this area utilizes self-reported mental health symptomology, as opposed to the objectively-defined clinical diagnoses for psychiatric conditions that my research utilizes. Selfreport for mental health measures may suffer from error due to cognitive processes, social desirability, and survey conditions. Additionally, much work in the area of criminal justice and mental health remains at the individual level, examining the direct exposure to police or incarceration and its influence on the mental health of those same individuals. Individual-level studies do not rule out the possibility of reverse causality as behaviorally disordered individuals may elicit attention from the police resulting in a greater number of police stops, police killings, or incarceration. Population-level research, however, reduces the possibility of reverse causation and evaluates the role of policing and incarceration as ambient exposures, given that population-level changes in mental health likely do not cause greater policing. Additionally, my use of monthly lags in Chapters 2 and 3 assesses changes in psychiatric help-seeking among Black Americans following police encounters. This establishes temporal order between the exposure and the outcome. I did not use lags in Chapter 4 because my study utilized annual, county-level incarceration prevalence estimates. I would not expect annual changes in incarceration to coincide with fluctuations in psychiatric ED visits among Black Americans in the following years.

Psychiatric emergencies may constitute urgent and non-urgent visits. Individuals may utilize the ED for non-urgent care if they do not have access to routine or outpatient mental health care. A shortage of psychiatric service delivery or a lack of insurance coverage may result in individuals using the ED for psychiatric care. Although the data I utilized for these studies did not provide information on urgency, future research would benefit from understanding changes in both types of psychiatric emergencies. Increases in non-urgent psychiatric emergencies may indicate the need for greater access and availability of psychiatric care due to criminal justice exposures for targeted locations. Additionally, previous psychiatric diagnoses may result in differential help-

seeking behavior at the population level; however, the ED data I have utilized does not provide information on psychiatric history. Psychiatric histories would elucidate whether criminal justice exposures preceded an increase in psychiatric help-seeking for newly developed psychiatric conditions, as opposed to maintenance of existing or underlying conditions. Clinical datasets that provide patient histories may allow for such examination; however, they may not provide the census of ED visits.

Lastly, my studies do not evaluate psychiatric help-seeking as a function of police stops, police killings of unarmed Black Americans, and incarceration by gender or age. Although I did not have specific hypotheses regarding gender or age, I encourage future work to examine these characteristics. Given that younger, Black men experience policing and incarceration more often than other genders or age groups, this subgroup may specifically experience greater psychiatric morbidity due to theoretical pathways such as hypervigilance or vicarious racism.

Health and Policy Implications

Long-term health implications of racial bias in the justice system may raise theoretical concepts such as 'weathering' in which consistent stress from discrimination and poverty contribute to worse health outcomes among minoritized communities. ²⁴¹ Increased mortality may also result from such chronic stress as life expectancy has seen a greater decline among Black and Hispanic populations as opposed to white populations in recent years – albeit the COVID-19 pandemic significantly contributed to this decline. ²⁴¹ Additionally, Black youth populations have also seen substantial increases in suicide mortality. ¹³¹ Consistent maltreatment from the justice system may drive greater maladaptive coping mechanisms, such as substance use, rumination, and self-injury, without the proper community initiatives or health education. ²⁴² Adaptive coping strategies, such as emotion regulation, stress reduction activities, and cognitive behavioral

changes, would require either greater consistent access to care or community health programs targeted towards such strategies.²⁴²

In 2014, President Barack Obama established the President's Task Force on 21st-Century Policing to identify ways in which policing can reduce crime while also building public trust. The task force issued recommendations under building trust and legitimacy, policy and oversight, technology and social media, community policing and crime reduction, officer training and education, and officer safety and wellness. The task force also urged the President to create a national task force supporting community-based initiatives addressing poverty, education, health, and safety.

Following the police killing of George Floyd and the global attention given to racial inequities at the institutional level, the US Congress introduced the George Floyd Justice in Police Act of 2021.²⁴³ The bill aims to address policing accountability by banning chokeholds and no-knock warrants, lowering the criminal intent standard for law enforcement misconduct, requiring officers to obtain uniform training on racial profiling and implicit bias, as well as mandating data collection with a national registry of misconduct as well as stops and use of force.²⁴³ Although the bill passed in the House of Representatives in March of 2021, the Senate has still not reached an agreement on the Act in 2023.²⁴³ However, bills passed at the state and local levels, including those in California, New Orleans, and Chicago, have required law enforcement agencies to collect data on police stops. ^{121,122,244} As demonstrated by New York City's Stop, Question, and Frisk Policy, evidence of racial/ethnic disparities in police stops, may provide the impetus necessary for policy change and salutary health. ¹³⁵

REFERENCES

- 1. R. Williams D, Williams-Morris R. Racism and Mental Health: The African American experience. *Ethnicity & Health*. 2000;5(3-4):243-268. doi:10.1080/713667453
- 2. Jones CP. Levels of racism: a theoretic framework and a gardener's tale. *Am J Public Health*. 2000;90(8):1212-1215.
- 3. Delgado R, Stefancic J. *Critical Race Theory: An Introduction*. New York University Press; 2001.
- 4. Ford CL, Airhihenbuwa CO. Critical Race Theory, Race Equity, and Public Health: Toward Antiracism Praxis. *Am J Public Health*. 2010;100(Suppl 1):S30-S35. doi:10.2105/AJPH.2009.171058
- 5. Bonilla-Silva E. More than Prejudice: Restatement, Reflections, and New Directions in Critical Race Theory. *Sociology of Race and Ethnicity*. Published online 2015:15.
- 6. Moore SE, Robinson MA, Clayton DM, et al. A Critical Race Perspective of Police Shooting of Unarmed Black Males in the United States: Implications for Social Work. *Urban Social Work*. 2018;2(1):33-47. doi:10.1891/2474-8684.2.1.33
- 7. Bois WEBD. The Souls of Black Folk. Blue Heron Press; 1904.
- Ducey K, Feagin JR. Systemic Racism. In: Korgen KO, ed. *The Cambridge Handbook of Sociology*. 1st ed. Cambridge University Press; 2017:12-20. doi:10.1017/9781316418369.003
- 9. Bonilla-Silva E. The Structure of Racism in Color-Blind, "Post-Racial" America. *American Behavioral Scientist*. 2015;59(11):1358-1376. doi:10.1177/0002764215586826
- 10. Reskin B. The Race Discrimination System. *Annual Review of Sociology*. 2012;38(1):17-35. doi:10.1146/annurev-soc-071811-145508
- Racial Attitudes in America Howard Schuman, Charlotte Steeh, Lawrence D. Bobo, Maria Krysan. Accessed January 6, 2021. https://www.hup.harvard.edu/catalog.php?isbn=9780674745698
- 12. Davis JA, Smith TW. *General Social Surveys*, 1972-1985: Cumulative Codebook: Codebook for the Machine-Readable Data File General Social Surveys, 1972-1985. National Opinion Research Center, University of Chicago, as part of the National Data Program for the Social Sciences; 1985.
- 13. Williams DR. African American Mental Health: Persistent Questions and Paradoxical Findings. In: African American Research Perspectives. 2(1): 8-16. An Occasional Report of the Program for Research on Black Americans, Institute for Social Research, University of Michigan, Ann Arbor.; 1995.
- 14. Whoriskey P. The bogus U.S. census numbers showing slavery's 'wonderful influence' on the enslaved. *Washington Post*. https://www.washingtonpost.com/history/2020/10/17/1840-census-slavery-insanity/. Accessed January 6, 2021.

- 15. Regier DA, Myers JK, Kramer M, et al. The NIMH Epidemiologic Catchment Area Program: Historical Context, Major Objectives, and Study Population Characteristics. *Archives of General Psychiatry*. 1984;41(10):934-941. doi:10.1001/archpsyc.1984.01790210016003
- 16. Kessler RC, Berglund P, Demler O, et al. The Epidemiology of Major Depressive Disorder: Results From the National Comorbidity Survey Replication (NCS-R). *JAMA*. 2003;289(23):3095. doi:10.1001/jama.289.23.3095
- 17. Erving CL, Thomas CS, Frazier C. Is the Black-White Mental Health Paradox Consistent Across Gender and Psychiatric Disorders? *Am J Epidemiol*. 2019;188(2):314-322. doi:10.1093/aje/kwy224
- 18. Thomas Tobin CS, Erving CL, Hargrove TW, Satcher LA. Is the Black-White mental health paradox consistent across age, gender, and psychiatric disorders? *Aging Ment Health*. 2022;26(1):196-204. doi:10.1080/13607863.2020.1855627
- 19. The Black–White Paradox in Health: Flourishing in the Face of Social Inequality and Discrimination Keyes 2009 Journal of Personality Wiley Online Library. Accessed March 16, 2021. https://onlinelibrary.wiley.com/doi/epdf/10.1111/j.1467-6494.2009.00597.x
- Williams D, González H, Neighbors H, et al. Prevalence and Distribution of Major Depressive Disorder in African Americans, Caribbean Blacks, and Non-Hispanic Whites: Results From the National Survey of American Life. Archives of general psychiatry. 2007;64:305-315. doi:10.1001/archpsyc.64.3.305
- 21. Neighbors HW, Trierweiler SJ, Ford BC, Muroff JR. Racial Differences in DSM Diagnosis Using a Semi-Structured Instrument: The Importance of Clinical Judgment in the Diagnosis of African Americans. *Journal of Health and Social Behavior*. 2003;44(3):237-256. doi:10.2307/1519777
- 22. Jackson JS, Knight KM, Rafferty JA. Race and Unhealthy Behaviors: Chronic Stress, the HPA Axis, and Physical and Mental Health Disparities Over the Life Course. *Am J Public Health*. 2010;100(5):933-939. doi:10.2105/AJPH.2008.143446
- 23. Pamplin JR, Kezios KL, Hayes-Larson E, et al. Explaining the Black-white depression paradox: Interrogating the Environmental Affordances Model. *Social Science & Medicine*. 2021;277:113869. doi:10.1016/j.socscimed.2021.113869
- 24. Williams DR, Neighbors HW, Jackson JS. Racial/Ethnic Discrimination and Health: Findings From Community Studies. *Am J Public Health*. 2003;93(2):200-208. doi:10.2105/AJPH.93.2.200
- 25. Paradies Y, Ben J, Denson N, et al. Racism as a Determinant of Health: A Systematic Review and Meta-Analysis. Hills RK, ed. *PLoS ONE*. 2015;10(9):e0138511. doi:10.1371/journal.pone.0138511
- 26. Paradies Y. A systematic review of empirical research on self-reported racism and health. *International Journal of Epidemiology*. 2006;35(4):888-901. doi:10.1093/ije/dyl056
- 27. Chae DH, Powell WA, Nuru-Jeter AM, et al. The Role of Racial Identity and Implicit Racial Bias in Self-Reported Racial Discrimination: Implications for Depression Among African

- American Men. *Journal of Black Psychology*. 2017;43(8):789-812. doi:10.1177/0095798417690055
- 28. Taylor J, Jackson BB. Evaluation of a Holistic Model of Mental Health Symptoms in African American Women. *Journal of Black Psychology*. 1991;18(1):19-45. doi:10.1177/00957984910181003
- 29. David EJR, Schroeder TM, Fernandez J. Internalized Racism: A Systematic Review of the Psychological Literature on Racism's Most Insidious Consequence. *Journal of Social Issues*. 2019;75(4):1057-1086. doi:10.1111/josi.12350
- 30. Kessler RC, Mickelson KD, Williams DR. The prevalence, distribution, and mental health correlates of perceived discrimination in the United States. *Journal of health and social behavior*. 1999;40(3):208-230. doi:10.2307/2676349
- 31. Roemer JE. Theories of Distributive Justice. Harvard University Press; 1996.
- 32. Williams DR, Yu Y, Jackson JS, Anderson NB. Racial Differences in Physical and Mental Health: Socio-economic Status, Stress and Discrimination. *J Health Psychol*. 1997;2(3):335-351. doi:10.1177/135910539700200305
- 33. Ethnic and Racial Minorities & Socioeconomic Status. Accessed March 17, 2021. https://www.apa.org/pi/ses/resources/publications/minorities
- 34. Robert SA. SOCIOECONOMIC POSITION AND HEALTH: The Independent Contribution of Community Socioeconomic Context. *Annual Review of Sociology*. 1999;25(1):489-516. doi:10.1146/annurev.soc.25.1.489
- 35. Qin P, Agerbo E, Mortensen PB. Suicide Risk in Relation to Socioeconomic, Demographic, Psychiatric, and Familial Factors: A National Register–Based Study of All Suicides in Denmark, 1981–1997. *American Journal of Psychiatry*. 2003;160(4):765-772. doi:10.1176/appi.ajp.160.4.765
- 36. Li Z, Page A, Martin G, Taylor R. Attributable risk of psychiatric and socio-economic factors for suicide from individual-level, population-based studies: A systematic review. *Social Science & Medicine*. 2011;72(4):608-616. doi:10.1016/j.socscimed.2010.11.008
- 37. Criminal Justice Facts. The Sentencing Project. Accessed November 15, 2020. https://www.sentencingproject.org/criminal-justice-facts/
- 38. Initiative PP, Wagner WS and P. Mass Incarceration: The Whole Pie 2020. Accessed January 16, 2021. https://www.prisonpolicy.org/reports/pie2020.html
- 39. Baćak V, Nowotny KM. Race and the Association Between Police Stops and Depression Among Young Adults: A Research Note. *Race and Justice*. 2020;10(3):363-375. doi:10.1177/2153368718799813
- 40. Turney K, Wildeman C, Schnittker J. As Fathers and Felons: Explaining the Effects of Current and Recent Incarceration on Major Depression. *J Health Soc Behav*. 2012;53(4):465-481. doi:10.1177/0022146512462400

- 41. Turney K. Depressive Symptoms among Adolescents Exposed to Personal and Vicarious Police Contact. *Society and Mental Health*. Published online July 3, 2020:2156869320923095. doi:10.1177/2156869320923095
- 42. Schnittker J, Massoglia M, Uggen C. Out and Down: Incarceration and Psychiatric Disorders. *J Health Soc Behav*. 2012;53(4):448-464. doi:10.1177/0022146512453928
- 43. Lee RD, Fang X, Luo F. The Impact of Parental Incarceration on the Physical and Mental Health of Young Adults. *Pediatrics*. 2013;131(4):e1188-e1195. doi:10.1542/peds.2012-0627
- 44. Wildeman C, Goldman AW, Turney K. Parental Incarceration and Child Health in the United States. *Epidemiologic Reviews*. 2018;40(1):146-156. doi:10.1093/epirev/mxx013
- 45. Wakefield S, Wildeman C. Mass imprisonment and racial disparities in childhood behavioral problems. *Criminology & Public Policy*. 2011;10(3):791-792. doi:https://doi.org/10.1111/j.1745-9133.2011.00741.x
- 46. Patterson EJ, Talbert RD, Brown TN. Familial Incarceration, Social Role Combinations, and Mental Health Among African American Women. *Journal of Marriage and Family*. 2021;83(1):86-101. doi:https://doi.org/10.1111/jomf.12699
- 47. Bingenheimer JB. Firearm Violence Exposure and Serious Violent Behavior. *Science*. 2005;308(5726):1323-1326. doi:10.1126/science.1110096
- 48. Jackson DB, Fahmy C, Vaughn MG, Testa A. Police Stops Among At-Risk Youth: Repercussions for Mental Health. *Journal of Adolescent Health*. 2019;65(5):627-632. doi:10.1016/j.jadohealth.2019.05.027
- 49. Porter LC, DeMarco LM. Beyond the dichotomy: Incarceration dosage and mental health*. *Criminology*. 2019;57(1):136-156. doi:10.1111/1745-9125.12199
- 50. Turney K. Stress Proliferation across Generations? Examining the Relationship between Parental Incarceration and Childhood Health. *J Health Soc Behav*. 2014;55(3):302-319. doi:10.1177/0022146514544173
- 51. Benjamin-Chung J, Arnold BF, Berger D, et al. Spillover effects in epidemiology: parameters, study designs and methodological considerations. *International Journal of Epidemiology*. 2018;47(1):332-347. doi:10.1093/ije/dyx201
- 52. Sewell AA, Jefferson KA, Lee H. Living under surveillance: Gender, psychological distress, and stop-question-and-frisk policing in New York City. *Social Science & Medicine*. 2016;159:1-13. doi:10.1016/j.socscimed.2016.04.024
- 53. Brunson RK, Miller J. Gender, Race, and Urban Policing: The Experience of African American Youths. *Gender & Society*. 2006;20(4):531-552. doi:10.1177/0891243206287727
- 54. Brunson RK, Weitzer R. Police Relations with Black and White Youths in Different Urban Neighborhoods. *Urban Affairs Review*. 2009;44(6):858-885. doi:10.1177/1078087408326973

- 55. La Vigne N, Lachman P, Matthews A, Neusteter SR. Key Issues in the Police Use of Pedestrian Stops and Searches: (527872013-001). Published online 2012. doi:10.1037/e527872013-001
- 56. Geller A, Fagan J, Tyler T, Link BG. Aggressive Policing and the Mental Health of Young Urban Men. *Am J Public Health*. 2014;104(12):2321-2327. doi:10.2105/AJPH.2014.302046
- 57. Smith, Voisin DR, Yang JP, Tung EL. Keeping Your Guard Up: Hypervigilance Among Urban Residents Affected By Community And Police Violence. *Health Affairs*. 2019;38(10):1662-1669. doi:10.1377/hlthaff.2019.00560
- 58. Cooper H, Moore L, Gruskin S, Krieger N. Characterizing Perceived Police Violence: Implications for Public Health. *Am J Public Health*. 2004;94(7):1109-1118. doi:10.2105/AJPH.94.7.1109
- 59. Stop-and-Frisk Data. New York Civil Liberties Union. Published January 2, 2012. Accessed January 26, 2021. https://www.nyclu.org/en/stop-and-frisk-data
- 60. Craig P, Katikireddi SV, Leyland A, Popham F. Natural Experiments: An Overview of Methods, Approaches, and Contributions to Public Health Intervention Research. *Annual Review of Public Health*. 2017;38(1):39-56. doi:10.1146/annurev-publhealth-031816-044327
- 61. Fatal Force: Police shootings database. Washington Post. Published 2020. Accessed July 4, 2020. https://www.washingtonpost.com/graphics/investigations/police-shootings-database/
- 62. S. Sinyangwe. Mapping Police Violence. Mapping Police Violence. Published 2020. Accessed June 30, 2020. https://mappingpoliceviolence.org/
- 63. Bor J, Venkataramani AS, Williams DR, Tsai AC. Police killings and their spillover effects on the mental health of black Americans: a population-based, quasi-experimental study. *Lancet*. 2018;392(10144).
- 64. Truong KA, Museus SD, McGuire KM. Vicarious racism: a qualitative analysis of experiences with secondhand racism in graduate education. *International Journal of Qualitative Studies in Education*. 2016;29(2):224-247. doi:10.1080/09518398.2015.1023234
- 65. Mason TB, Maduro RS, Derlega VJ, Hacker DS, Winstead BA, Haywood JE. Individual differences in the impact of vicarious racism: African American students react to the George Zimmerman trial. *Cultural Diversity and Ethnic Minority Psychology*. 2017;23(2):174-184. doi:10.1037/cdp0000099
- 66. Dominguez TP. Race, racism, and racial disparities in adverse birth outcomes. *Clin Obstet Gynecol*. 2008;51(2):360-370.
- 67. Bor J, Venkataramani AS, Williams DR, Tsai AC. Police killings and their spillover effects on the mental health of black Americans: a population-based, quasi-experimental study. *The Lancet*. 2018;392(10144):302-310. doi:10.1016/S0140-6736(18)31130-9

- 68. Curtis DS, Washburn T, Lee H, et al. Highly public anti-Black violence is associated with poor mental health days for Black Americans. *PNAS*. 2021;118(17). doi:10.1073/pnas.2019624118
- 69. Western B, Wildeman C. The Black Family and Mass Incarceration. *The ANNALS of the American Academy of Political and Social Science*. 2009;621(1):221-242. doi:10.1177/0002716208324850
- 70. Hatzenbuehler ML, Keyes K, Hamilton A, Uddin M, Galea S. The Collateral Damage of Mass Incarceration: Risk of Psychiatric Morbidity Among Nonincarcerated Residents of High-Incarceration Neighborhoods. *American Journal of Public Health*. 2015;105(1):6.
- 71. Rose D, Clear T. Incarceration, Reentry and Social Capital. Published online 2002:19.
- 72. Roberts DE. The Social and Moral Cost of Mass Incarceration in African American Communities. :36.
- 73. Todd R. Clear. The Effects of High Imprisonment Rates on Communities. *Crime and Justice*. 2008;37(1):97-132.
- 74. OECD Glossary of Statistical Terms Social capital Definition. Accessed March 21, 2021. https://stats.oecd.org/glossary/detail.asp?ID=3560
- 75. Lynch JP, Sabol WJ. Assessing the Effects of Mass Incarceration on Informal Social Control in Communities. *Criminology & Public Policy*. Published online 2004:27.
- 76. Moore MD. Social disorganisation theory and suicide. *International Social Science Journal*. Published online April 25, 2019. doi:10.1111/issj.12202
- 77. Durkheim É. Le suicide: étude de sociologie. Alcan; 1897.
- 78. Women at the Wall. Accessed March 21, 2021. https://www.sunypress.edu/p-915-women-at-the-wall.aspx
- 79. Fishman LT. Women at the Wall: A Study of Prisoners' Wives Doing the Time on the Outside. State University of New York Press; 1990.
- 80. Lynch JP, Sabol WJ, Planty M, Shelly M. Crime, Coercion and Community: The Effects of Arrest and Incarceration Policies on Informal Social Control in Neighborhoods, Executive Summary. Published online 2002.
- 81. Bandura A. Self-Efficacy in Changing Societies. Cambridge University Press; 1997.
- 82. Report: NYPD Stop-and-Frisk Activity. New York Civil Liberties Union. Published May 8, 2012. Accessed April 27, 2021. https://www.nyclu.org/en/publications/report-nypd-stop-and-frisk-activity-2011-2012
- 83. Gelman A, Fagan J, Kiss A. An Analysis of the New York City Police Department's "Stop-and-Frisk" Policy in the Context of Claims of Racial Bias. *Journal of the American Statistical Association*. 2007;102(479):813-823. doi:10.1198/016214506000001040

- 84. Ridgeway G. Analysis of Racial Disparities in the New York Police Department's Stop, Question, and Frisk Practices. RAND Corporation; 2007.
- 85. Levchak PJ. Stop-and-frisk in New York City: Estimating racial disparities in post-stop outcomes. *Journal of Criminal Justice*. 2021;73:101784. doi:10.1016/j.jcrimjus.2021.101784
- 86. Sewell AA, Jefferson KA. Collateral Damage: The Health Effects of Invasive Police Encounters in New York City. *COLLATERAL DAMAGE*.:26.
- 87. Broken Windows The Atlantic. Published 1982. Accessed April 16, 2021. https://www.theatlantic.com/magazine/archive/1982/03/broken-windows/304465/
- 88. O'Brien DT, Farrell C, Welsh BC. Broken (windows) theory: A meta-analysis of the evidence for the pathways from neighborhood disorder to resident health outcomes and behaviors. *Social Science & Medicine*. 2019;228:272-292. doi:10.1016/j.socscimed.2018.11.015
- 89. O'Brien DT, Farrell C, Welsh BC. Looking Through Broken Windows: The Impact of Neighborhood Disorder on Aggression and Fear of Crime Is an Artifact of Research Design. *Annual Review of Criminology*. 2019;2(1):53-71. doi:10.1146/annurev-criminol-011518-024638
- 90. Brunson RK, Miller J. Young Black Men and Urban Policing in the United States. *The British Journal of Criminology*. 2006;46(4):613-640. doi:10.1093/bjc/azi093
- 91. Brandl SG, Frank J, Worden RE, Bynum TS. Global and specific attitudes toward the police: Disentangling the relationship. *Justice Quarterly*. 1994;11(1):119-134. doi:10.1080/07418829400092161
- 92. E. Lipscomb A, Emeka M, Bracy I, et al. Black Male Hunting! A Phenomenological Study Exploring the Secondary Impact of Police Induced Trauma on the Black Man's Psyche in the United States. *JSSW*. 2019;7(1). doi:10.15640/jssw.v7n1a2
- 93. Alang S, McAlpine D, McClain M. Police Encounters as Stressors: Associations with Depression and Anxiety across Race. *Socius*. 2021;7:2378023121998128. doi:10.1177/2378023121998128
- 94. Webb L, Jackson DB, Jindal M, Alang S, Mendelson T, Clary LK. Anticipation of racially motivated police brutality and youth mental health. *Journal of Criminal Justice*. Published online July 14, 2022:101967. doi:10.1016/j.jcrimjus.2022.101967
- 95. Jackson DB, Del Toro J, Semenza DC, Testa A, Vaughn MG. Unpacking Racial/Ethnic Disparities in Emotional Distress Among Adolescents During Witnessed Police Stops. *Journal of Adolescent Health*. Published online April 2021:S1054139X21001063. doi:10.1016/j.jadohealth.2021.02.021
- 96. Jahn JL, Agenor M, Chen JT, Krieger N. Frequent police stops, parental incarceration and mental health: results among US non-Hispanic Black and White adolescent girls and boys. *J Epidemiol Community Health*. Published online December 23, 2020:jech-2020-214578. doi:10.1136/jech-2020-214578

- 97. Kerrison EM, Sewell AA. Negative illness feedbacks: High-frisk policing reduces civilian reliance on ED services. *Health Services Research*. 2020;55(S2):787-796. doi:10.1111/1475-6773.13554
- 98. Brayne S. Surveillance and System Avoidance: Criminal Justice Contact and Institutional Attachment. *Am Sociol Rev.* 2014;79(3):367-391. doi:10.1177/0003122414530398
- 99. Snowden LR, Catalano R, Shumway M. Disproportionate Use of Psychiatric Emergency Services by African Americans. *Psychiatric Services*. 2009;60(12):1664-1671.
- 100. Floyd, et al. v. City of New York, et al. Center for Constitutional Rights. Accessed July 16, 2022. https://ccrjustice.org/node/1765
- 101. Franzini L, Ribble JC, Keddie AM. Understanding the Hispanic paradox. *Ethn Dis*. 2001;11(3):496-518.
- 102. Neighbors HW, Jackson JS, Campbell L, Williams D. The influence of racial factors on psychiatric diagnosis: A review and suggestions for research. *Community Ment Health J*. 1989;25(4):301-311. doi:10.1007/BF00755677
- 103. Garretson DJ. Psychological misdiagnosis of African Americans. *Journal of Multicultural Counseling and Development*. 1993;21:119-126. doi:10.1002/j.2161-1912.1993.tb00590.x
- 104. Barnes DM, Bates LM. Do racial patterns in psychological distress shed light on the Black– White depression paradox? A systematic review. Soc Psychiatry Psychiatr Epidemiol. 2017;52(8):913-928. doi:10.1007/s00127-017-1394-9
- 105. HCUP SEDD. Published 2019. Accessed July 24, 2020. https://www.hcup-us.ahrq.gov/db/state/sedddist/SEDD Introduction.jsp
- 106. Singh P, Chakravarthy B, Yoon J, Snowden L, Bruckner TA. Psychiatric-related Revisits to the Emergency Department Following Rapid Expansion of Community Mental Health Services. *Acad Emerg Med*. Published online June 4, 2019. doi:10.1111/acem.13812
- 107. Bruckner TA, Singh P, Chakravarthy B, Snowden L, Yoon J. Psychiatric Emergency Department Visits After Regional Expansion of Community Health Centers. *Psychiatr Serv.* 2019;70(10):901-906. doi:10.1176/appi.ps.201800553
- 108. Bruckner TA, Singh P, Yoon J, Chakravarthy B, Snowden LR. African American/white disparities in psychiatric emergencies among youth following rapid expansion of Federally Qualified Health Centers. *Health Services Research*. 2020;55(1):26-34. doi:10.1111/1475-6773.13237
- 109. County FIPS Codes | NRCS. Accessed July 20, 2021. https://www.nrcs.usda.gov/wps/portal/nrcs/detail/national/home/?cid=nrcs143_013697
- 110. Find Your Precinct and Sector NYPD. Accessed October 10, 2022. https://www1.nyc.gov/site/nypd/bureaus/patrol/find-your-precinct.page
- 111. Publications, Reports NYPD. Accessed December 15, 2020. https://www1.nyc.gov/site/nypd/stats/reports-analysis/stopfrisk.page

- 112. Das A, Singh P, Kulkarni AK, Bruckner TA. Emergency Department visits for depression following police killings of unarmed African Americans. *Social Science & Medicine*. 2021;269:113561. doi:10.1016/j.socscimed.2020.113561
- 113. McCleary R, Hay R. *Applied Time Series Analysis for the Social Sciences*. Sage Publications; 1980.
- 114. Catalano R, Serxner S. Time series designs of potential interest to epidemiologists. *Am J Epidemiol*. 1987;126(4):724-731.
- 115. Liu LM. Scientific Computing Associates Corp. Published online 2009.
- 116. Box G, Jenkins G, Reinsel G. *Time Series Analysis: Forecasting and Control.* 3rd ed. Prentice Hall; 1994.
- 117. Trends in the Utilization of Emergency Department Services, 2009-2018. ASPE. Accessed October 28, 2022. https://aspe.hhs.gov/reports/trends-utilization-emergency-department-services-2009-2018
- 118. Fragile Families and Child Wellbeing Study. Accessed November 29, 2022. https://fragilefamilies.princeton.edu/
- 119. Monk EP. Linked fate and mental health among African Americans. *Social Science & Medicine*. 2020;266:113340. doi:10.1016/j.socscimed.2020.113340
- 120. Harrell SP. A multidimensional conceptualization of racism-related stress: Implications for the well-being of people of color. *American Journal of Orthopsychiatry*. 2000;70(1):42-57. doi:10.1037/h0087722
- 121. Owens E, Rosenquist J. Racial and Identity Profiling act (RIPA) in the Los Angeles Police Department. Published online 2020. Accessed July 16, 2022. https://escholarship.org/uc/item/4mn75943
- 122. Theall KP, Francois S, Bell CN, Anderson A, Chae D, LaVeist TA. Neighborhood Police Encounters, Health, And Violence In A Southern City: Study examines neighborhood police encounters, health, and violence in New Orleans, Louisiana. *Health Affairs*. 2022;41(2):228-236. doi:10.1377/hlthaff.2021.01428
- 123. Farrell C. Policing Gender, Race, and Place: A Multi-Level Assessment of Stop and Frisks. *Race and Justice*. Published online February 16, 2022:21533687221078970. doi:10.1177/21533687221078970
- 124. Crenshaw K. On Intersectionality: Essential Writings. *Faculty Books*. Published online March 1, 2017. https://scholarship.law.columbia.edu/books/255
- 125. Mesic A, Franklin L, Cansever A, et al. The Relationship Between Structural Racism and Black-White Disparities in Fatal Police Shootings at the State Level. *Journal of the National Medical Association*. 2018;110(2):106-116. doi:10.1016/j.jnma.2017.12.002

- 126. Ross CT. A Multi-Level Bayesian Analysis of Racial Bias in Police Shootings at the County-Level in the United States, 2011–2014. Hills PJ, ed. *PLoS ONE*. 2015;10(11):e0141854. doi:10.1371/journal.pone.0141854
- 127. Black Lives Matter. Black Lives Matter. Published 2022. Accessed November 14, 2022. https://blacklivesmatter.com/about/
- 128. Ni MY, Kim Y, McDowell I, et al. Mental health during and after protests, riots and revolutions: A systematic review. *Aust N Z J Psychiatry*. 2020;54(3):232-243. doi:10.1177/0004867419899165
- 129. Price JH, Khubchandani J. The Changing Characteristics of African-American Adolescent Suicides, 2001–2017. *J Community Health*. 2019;44(4):756-763. doi:10.1007/s10900-019-00678-x
- 130. Taskforce on Black Youth Suicide and Mental Health | U.S. Representative Bonnie Watson Coleman. U.S. Congresswoman Bonnie Watson Coleman. Accessed May 7, 2021. https://watsoncoleman.house.gov/suicidetaskforce/
- 131. Ring the Alarm: the Crisis of Black Youth Suicide in America | Suicide Prevention Resource Center. Accessed September 23, 2021. https://www.sprc.org/news/ring-alarm-crisis-black-youth-suicide-america
- 132. Gili M, Castellví P, Vives M, et al. Mental disorders as risk factors for suicidal behavior in young people: A meta-analysis and systematic review of longitudinal studies. *Journal of Affective Disorders*. 2019;245:152-162. doi:10.1016/j.jad.2018.10.115
- 133. Duron JF, Williams-Butler A, Mattson P, Boxer P. Trauma Exposure and Mental Health Needs Among Adolescents Involved With the Juvenile Justice System. *J Interpers Violence*. Published online May 26, 2021:08862605211016358. doi:10.1177/08862605211016358
- 134. Shufelt JL, Cocozza JJ. Youth with Mental Health Disorders in the Juvenile Justice System: Results from a Multi-State Prevalence Study. National Center for Mental Health and Juvenile Justice; 2006.
- 135. MacDonald J, Braga AA. Did Post-Floyd et al. Reforms Reduce Racial Disparities in NYPD Stop, Question, and Frisk Practices? An Exploratory Analysis Using External and Internal Benchmarks. *Justice Quarterly*. 2019;36(5):954-983. doi:10.1080/07418825.2018.1427278
- 136. Barlow N. Does Stop and Frisk deter crime? Evidence from the Aftermath of Floyd v. City of New York. :19.
- 137. Ford CL, Airhihenbuwa CO. Commentary: Just What is Critical Race Theory and What's it Doing in a Progressive Field like Public Health? *Ethn Dis.* 2018;28(Suppl 1):223-230. doi:10.18865/ed.28.S1.223
- 138. Romero M, Chin J. Critical Race Theory. In: Korgen KO, ed. *The Cambridge Handbook of Sociology: Specialty and Interdisciplinary Studies*. Vol 2. Cambridge University Press; 2017:30-38. doi:10.1017/9781316418369.005

- 139. Clark R, Anderson NB, Clark VR, Williams DR. Racism as a Stressor for African Americans. *American Psychologist*. Published online 1999:12.
- 140. Gee GC, Ford CL. Structural Racism and Health Inequities: Old Issues, New Directions. *Du Bois Rev.* 2011;8(1):115-132. doi:10.1017/S1742058X11000130
- 141. DeVylder JE, Jun HJ, Fedina L, et al. Association of Exposure to Police Violence With Prevalence of Mental Health Symptoms Among Urban Residents in the United States. *JAMA Netw Open.* 2018;1(7). doi:10.1001/jamanetworkopen.2018.4945
- 142. Bruckner TA, Singh P, Yoon J, Chakravarthy B, Snowden LR. African American/white disparities in psychiatric emergencies among youth following rapid expansion of Federally Qualified Health Centers. *Health Serv Res.* 2020;55(1):26-34. doi:10.1111/1475-6773.13237
- 143. CCS for ICD-10-PCS. Published 2019. Accessed November 23, 2020. https://www.hcup-us.ahrq.gov/toolssoftware/ccs10/ccs10.jsp
- 144. US Census Bureau. Intercensal estimates of the resident population by five-year age groups, sex, race, and Hispanic origin for counties: April 1, 2000 to July 1, 2010.
- 145. Stockdale SE, Wells KB, Tang L, Belin TR, Zhang L, Sherbourne CD. The importance of social context: Neighborhood stressors, stress-buffering mechanisms, and alcohol, drug, and mental health disorders. *Social science & medicine*. 2007;65(9):1867-1881.
- 146. Maltz MD, Targonski J. A note on the use of county-level UCR data. *Journal of Quantitative Criminology*. 2002;18(3):297-318.
- 147. Jackson PG. Sources of data. In: *Measurement Issues in Criminology*. Springer; 1990:21-50.
- 148. Gove WR, Hughes M, Geerken M. Are uniform crime reports a valid indicator of the index crimes? An affirmative answer with minor qualifications. *Criminology*. 1985;23(3):451-502.
- 149. Federal Bureau of Investigation. Uniform Crime Reporting Program Data: Arrests by Age, Sex, and Race, United States, 2013. *Inter-university Consortium for Political and Social Research [distributor.* Published online October 7, 2015. doi:10.3886/ICPSR36115.v1
- 150. Halpern SD, Mechem CC. Declining rate of substance abuse throughout the month. *Am J Med.* 2001;110(5):347-351.
- 151. Halpern S, Doraiswamy P, Tupler L, Holland J, Ford S, Ellinwood E. Emergency department patterns in psychiatric visits during the holiday season. *Annals of emergency medicine*. 1994;24:939-943. doi:10.1016/S0196-0644(94)70210-1
- 152. White Marni, Kasl Stanislav V, Zahner GEP, Will JC. Perceived Crime in the Neighborhood and Mental Health of Women and Children. *Environment and Behavior*. 1987;19(5):588-613. doi:10.1177/0013916587195003
- 153. Dustmann C, Fasani F. The Effect of Local Area Crime on Mental Health. *The Economic Journal*. 2016;126(593):978-1017. doi:10.1111/ecoj.12205

- 154. Kalb LG, Stapp EK, Ballard ED, Holingue C, Keefer A, Riley A. Trends in Psychiatric Emergency Department Visits Among Youth and Young Adults in the US. *Pediatrics*. 2019;143(4). doi:10.1542/peds.2018-2192
- 155. HCUP-US AHRQ. Published 2020. Accessed July 2, 2020. https://www.hcup-us.ahrq.gov/
- 156. Carter RT. Racism and Psychological and Emotional Injury: Recognizing and Assessing Race-Based Traumatic Stress. *The Counseling Psychologist*. 2007;35(1):13-105. doi:10.1177/0011000006292033
- 157. Comas-Díaz L, Hall GN, Neville HA. Racial trauma: Theory, research, and healing: Introduction to the special issue. *American Psychologist*. 2019;74(1):1. doi:10.1037/amp0000442
- 158. National Institutes of Health. NIMH Post-Traumatic Stress Disorder. NIMH Post-Traumatic Stress Disorder. Published 2020. Accessed July 2, 2020. https://www.nimh.nih.gov/health/publications/post-traumatic-stress-disorder-ptsd/index.shtml#pub3
- 159. Carragher N, Krueger R, Eaton N, Slade T. Disorders without borders: Current and future directions in the meta-structure of mental disorders. *Social Psychiatry and Psychiatric Epidemiology*. 2015;50. doi:10.1007/s00127-014-1004-z
- 160. Catalano RA, Kessell E, Christy A, Monahan J. Involuntary Psychiatric Examinations for Danger to Others in Florida After the Attacks of September 11, 2001. PS. 2005;56(7):858-862. doi:10.1176/appi.ps.56.7.858
- 161. Taylor KY. From #BlackLivesMatter to Black Liberation. Haymarket Books; 2016.
- 162. President's Task Force on 21st Century Policing Moving from Recommendations to Action. Published online 2015:38.
- 163. Campaign Zero. Published 2020. Accessed November 23, 2020. https://www.joincampaignzero.org/
- 164. Owens E, Weisburd D, Amendola KL, Alpert GP. Can You Build a Better Cop?: Experimental Evidence on Supervision, Training, and Policing in the Community. *Criminology & Public Policy*. 2018;17(1):41-87. doi:10.1111/1745-9133.12337
- 165. Harden K. Exposure to Police Brutality Allows for Transparency and Accountability of Law Enforcement. *J Marshall J Info Tech & Privacy L*. 2016;33(2):75-100.
- 166. Hirschberger G. Collective Trauma and the Social Construction of Meaning. *Front Psychol.* 2018;9. doi:10.3389/fpsyg.2018.01441
- 167. Holman EA, Gar DR. Media's role in broadcasting acute stress following the Boston Marathon bombings. *COGNITIVE SCIENCES*. Published online 2014:6.
- 168. McGuire TG, Miranda J. New evidence regarding racial and ethnic disparities in mental health: policy implications. *Health Aff (Millwood)*. 2008;27(2):393-403.

- 169. Snowden LR. African American service use for mental health problems. *Journal of Community Psychology*. 1999;27(3):303-313. doi:10.1002/(SICI)1520-6629(199905)27:3<303::AID-JCOP5>3.0.CO;2-9
- 170. Chen FM. Patients' Beliefs About Racism, Preferences for Physician Race, and Satisfaction With Care. *The Annals of Family Medicine*. 2005;3(2):138-143. doi:10.1370/afm.282
- 171. Bussing R, Gary FA. Eliminating Mental Health Disparities by 2020: Everyone's Actions Matter. *Journal of the American Academy of Child & Adolescent Psychiatry*. 2012;51(7):663-666. doi:10.1016/j.jaac.2012.04.005
- 172. Nock MK, Kessler RC. Prevalence of and risk factors for suicide attempts versus suicide gestures: analysis of the National Comorbidity Survey. *J Abnorm Psychol*. 2006;115(3):616-623. doi:10.1037/0021-843X.115.3.616
- 173. People in Jail and Prison in 2020. Vera Institute of Justice. Accessed April 19, 2022. https://www.vera.org/publications/people-in-jail-and-prison-in-2020
- 174. Provine DM. Race and Inequality in the War on Drugs. *Annual Review of Law and Social Science*. 2011;7(1):41-60. doi:10.1146/annurev-lawsocsci-102510-105445
- 175. Pettit B, Western B. Mass Imprisonment and the Life Course: Race and Class Inequality in U.S. Incarceration. *Am Sociol Rev.* 2004;69(2):151-169. doi:10.1177/000312240406900201
- 176. Pettit B, Gutierrez C. Mass Incarceration and Racial Inequality. *The American Journal of Economics and Sociology*. 2018;77(3-4):1153-1182. doi:10.1111/ajes.12241
- 177. Cracks in the System: 20 Years of the Unjust Federal Crack Cocaine Law. American Civil Liberties Union. Accessed May 17, 2022. https://www.aclu.org/other/cracks-system-20-years-unjust-federal-crack-cocaine-law
- 178. Mitchell O, Caudy MS. Examining Racial Disparities in Drug Arrests. *Justice Quarterly*. 2015;32(2):288-313. doi:10.1080/07418825.2012.761721
- 179. Garland D. Mass Imprisonment: Social Causes and Consequences. SAGE; 2001.
- 180. Alexander M. *The New Jim Crow: Mass Incarceration in the Age of Colorblindness.* The New Press; 2012.
- 181. Bailey ZD, Krieger N, Agénor M, Graves J, Linos N, Bassett MT. Structural racism and health inequities in the USA: evidence and interventions. *The Lancet*. 2017;389(10077):1453-1463. doi:10.1016/S0140-6736(17)30569-X
- 182. Jahn JL, Chen JT, Agénor M, Krieger N. County-level jail incarceration and preterm birth among non-Hispanic Black and white U.S. women, 1999–2015. *Social Science & Medicine*. 2020;250:112856. doi:10.1016/j.socscimed.2020.112856
- 183. Wildeman C, Western B. Incarceration in Fragile Families. *The Future of Children*. 2010;20(2):157-177.

- 184. Braman D. Doing Time on the Outside: Incarceration and Family Life in Urban America. In: ; 2004. doi:10.3998/MPUB.17629
- 185. Exploring the effects of incarceration on communities ProQuest. Accessed April 18, 2022. https://www.proquest.com/openview/d693c09b81e9c53e305661a188dc75fc/1?pq-origsite=gscholar&cbl=18750&diss=y
- 186. Lee H, Wildeman C. Assessing mass incarceration's effects on families. *Science*. 2021;374(6565):277-281. doi:10.1126/science.abj7777
- 187. Bryan B. Paternal Incarceration and Adolescent Social Network Disadvantage. *Demography*. 2017;54(4):1477-1501. doi:10.1007/s13524-017-0589-8
- 188. Cochran JC, Siennick SE, Mears DP. Social Exclusion and Parental Incarceration Impacts on Adolescents' Networks and School Engagement. *Journal of Marriage and Family*. 2018;80(2):478-498. doi:10.1111/jomf.12464
- 189. Kawachi I, Berkman LF. Social ties and mental health. *J Urban Health*. 2001;78(3):458-467. doi:10.1093/jurban/78.3.458
- 190. Barnett PA, Gotlib IH. Psychosocial Functioning and Depression: Distinguishing Among Antecedents, Concomitants, and Consequences. :30.
- 191. Berkman L, Glass T. Social Integration, Social Networks, Social Support, and Health. *Social Epidemiology*. 2000;1.
- 192. Lin N, Ye X, Ensel WM. Social Support and Depressed Mood: A Structural Analysis. *Journal of Health and Social Behavior*. 1999;40(4):344-359. doi:10.2307/2676330
- 193. Wildeman C, Goldman AW, Turney K. Parental Incarceration and Child Health in the United States. *Epidemiologic Reviews*. 2018;40(1):146-156. doi:10.1093/epirev/mxx013
- 194. Patterson EJ, Talbert RD, Brown TN. Familial Incarceration, Social Role Combinations, and Mental Health Among African American Women. *J Marriage Fam.* Published online July 15, 2020:jomf.12699. doi:10.1111/jomf.12699
- 195. Geller A, Cooper CE, Garfinkel I, Schwartz-Soicher O, Mincy RB. Beyond Absenteeism: Father Incarceration and Child Development. *Demography*. 2012;49(1):49-76. doi:10.1007/s13524-011-0081-9
- 196. Geller A, Garfinkel I, Cooper CE, Mincy RB. Parental Incarceration and Child Wellbeing: Implications for Urban Families. *Soc Sci Q.* 2009;90(5):1186-1202. doi:10.1111/j.1540-6237.2009.00653.x
- 197. Bruns A, Lee H. Partner Incarceration and Women's Substance Use. *Journal of Marriage and Family*. 2020;82(4):1178-1196. doi:10.1111/jomf.12659
- 198. Schnittker J, Uggen C, Shannon SKS, McElrath SM. The Institutional Effects of Incarceration: Spillovers From Criminal Justice to Health Care. *The Milbank Quarterly*. 2015;93(3):516-560. doi:10.1111/1468-0009.12136

- 199. Nowotny KM, Omori M, McKenna M, Kleinman J. Incarceration Rates and Incidence of Sexually Transmitted Infections in US Counties, 2011–2016. *Am J Public Health*. 2020;110(S1):S130-S136. doi:10.2105/AJPH.2019.305425
- 200. Kajeepeta S, Mauro PM, Keyes KM, El-Sayed AM, Rutherford CG, Prins SJ. Association between county jail incarceration and cause-specific county mortality in the USA, 1987–2017: a retrospective, longitudinal study. *The Lancet Public Health*. 2021;6(4):e240-e248. doi:10.1016/S2468-2667(20)30283-8
- 201. Nosrati E, Kang-Brown J, Ash M, McKee M, Marmot M, King LP. Incarceration and mortality in the United States. *SSM Population Health*. 2021;15:100827. doi:10.1016/j.ssmph.2021.100827
- 202. Lee H, Wildeman C, Wang EA, Matusko N, Jackson JS. A Heavy Burden: The Cardiovascular Health Consequences of Having a Family Member Incarcerated. *Am J Public Health*. 2014;104(3):421-427. doi:10.2105/AJPH.2013.301504
- 203. Clinical Classifications Software Refined (CCSR) for ICD-10-CM Diagnoses. Accessed December 2, 2020. https://www.hcup-us.ahrq.gov/toolssoftware/ccsr/dxccsr.jsp
- 204. US Census Bureau. Annual County resident population estimates by age, sex, race, and Hispanic origin: April 1, 2010 to July 1, 2017.
- 205. In Our Own Backyard. Vera Institute of Justice. Accessed April 22, 2022. https://www.vera.org/publications/in-our-own-backyard-confronting-growth-and-disparities-in-american-jails
- 206. Hinds O. Reconstructing How Counties Contribute to State Prisons. :16.
- 207. Brown T, Patricia Homan PD. Structural Racism and Health Stratification in the U.S.: Connecting Theory to Measurement. Published online March 20, 2022. doi:10.31235/osf.io/3eacp
- 208. Chantarat T, Van Riper DC, Hardeman RR. Multidimensional structural racism predicts birth outcomes for Black and White Minnesotans. *Health Services Research*. 2022;57(3):448-457. doi:10.1111/1475-6773.13976
- 209. Stockdale SE, Wells KB, Tang L, Belin TR, Zhang L, Sherbourne CD. The importance of social context: Neighborhood stressors, stress-buffering mechanisms, and alcohol, drug, and mental health disorders. *Soc Sci Med.* 2007;65(9).
- 210. Motivans M. Federal Justice Statistics, 2019. Published online 2021. doi:10.1037/e542272008-001
- 211. Felony Defendants in Large Urban Counties, 2006. Bureau of Justice Statistics. Accessed December 21, 2022. https://bjs.ojp.gov/library/publications/felony-defendants-large-urban-counties-2006
- 212. Maltz MD, Targonski J. A note on the use of county-level UCR data. *J Quant Criminol*. 2002;18(3).

- 213. Gove WR, Hughes M, Geerken M. Are uniform crime reports a valid indicator of the index crimes? An affirmative answer with minor qualifications. *Criminology*. 1985;23(3).
- 214. Jackson PG. Sources of data. In: Measurement Issues in Criminology. Springer; 1990.
- 215. Uniform Crime Reporting (UCR) Program. Federal Bureau of Investigation. Accessed April 27, 2022. https://www.fbi.gov/services/cjis/ucr
- 216. Goldman-Mellor S, Saxton K, Catalano R. Economic contraction and mental health: A review of the evidence, 1990-2009. *International Journal of Mental Health*. 2010;39:6-31.
- 217. Lund C, Brooke-Sumner C, Baingana F, et al. Social determinants of mental disorders and the Sustainable Development Goals: a systematic review of reviews. *The Lancet Psychiatry*. 2018;5(4):357-369. doi:10.1016/S2215-0366(18)30060-9
- 218. Buonanno P. The Socioeconomic Determinants of Crime. A Review of the Literature.
- 219. FENG C, WANG H, LU N, et al. Log-transformation and its implications for data analysis. *Shanghai Arch Psychiatry*. 2014;26(2):105-109. doi:10.3969/j.issn.1002-0829.2014.02.009
- 220. Wooldridge JM. Introductory Econometrics: A Modern Approach. Published online 2012:910.
- 221. Bell A, Fairbrother M, Jones K. Fixed and random effects models: making an informed choice. *Qual Quant*. 2019;53(2):1051-1074. doi:10.1007/s11135-018-0802-x
- 222. Adkins-Jackson PB, Chantarat T, Bailey ZD, Ponce NA. Measuring Structural Racism: A Guide for Epidemiologists and Other Health Researchers. *American Journal of Epidemiology*. 2022;191(4):539-547. doi:10.1093/aje/kwab239
- 223. Jahn JL. Invited Commentary: Comparing Approaches to Measuring Structural Racism. *American Journal of Epidemiology*. 2022;191(4):548-551. doi:10.1093/aje/kwab261
- 224. Gramlich J. America's incarceration rate falls to lowest level since 1995. Pew Research Center. Accessed May 12, 2022. https://www.pewresearch.org/fact-tank/2021/08/16/americas-incarceration-rate-lowest-since-1995/
- 225. USDA ERS Rural-Urban Continuum Codes. Accessed January 24, 2023. https://www.ers.usda.gov/data-products/rural-urban-continuum-codes.aspx
- 226. Lynch JP, Sabol WJ. Assessing the Effects of Mass Incarceration on Informal Social Control in Communities. *Criminology & Public Policy*. 2004;3(2):267-294. doi:10.1111/j.1745-9133.2004.tb00042.x
- 227. Thomas JC, Torrone E. Incarceration as Forced Migration: Effects on Selected Community Health Outcomes. *Am J Public Health*. 2006;96(10):1762-1765. doi:10.2105/AJPH.2005.081760
- 228. Badger E, Miller CC, Pearce A, Quealy K. Extensive Data Shows Punishing Reach of Racism for Black Boys. *The New York Times*. https://www.nytimes.com/interactive/2018/03/19/upshot/race-class-white-and-black-

- men.html, https://www.nytimes.com/interactive/2018/03/19/upshot/race-class-white-and-black-men.html. Published March 19, 2018. Accessed December 24, 2022.
- 229. Primeau A, Bowers TG, Harrison MA, XuXu. Deinstitutionalization of the Mentally III: Evidence for Transinstitutionalization from Psychiatric Hospitals to Penal Institutions. *Comprehensive Psychology*. 2013;2:16.02.13.CP.2.2. doi:10.2466/16.02.13.CP.2.2
- 230. Yoon J. The Effects of Reductions in Public Psychiatric Hospital Beds on Crime, Arrests, and Jail Detentions of Severely Mentally III Persons. 2007.
- 231. Total Number of Residents. KFF. Published October 23, 2020. Accessed June 6, 2022. https://www.kff.org/other/state-indicator/total-residents/
- 232. BOP: Designations. Accessed June 6, 2022. https://www.bop.gov/inmates/custody_and_care/designations.jsp
- 233. Kirchhoff SM. Economic Impacts of Prison Growth.
- 234. Initiative PP. New and Expanded Federal and State Prisons | Prison-based gerrymandering after the 2010 Census. Accessed December 24, 2022. https://www.prisonersofthecensus.org/50states/newprisons.html
- 235. Initiative PP. Separation by Bars and Miles: Visitation in state prisons. Accessed June 10, 2022. https://www.prisonpolicy.org/reports/prisonvisits.html
- 236. How does our discriminatory criminal justice system affect children?: Black children are six times as likely as white children to have a parent who's been incarcerated. Economic Policy Institute. Accessed June 6, 2022. https://www.epi.org/publication/how-does-our-discriminatory-criminal-justice-system-affect-children-black-children-are-six-times-as-likely-as-white-children-to-have-a-parent-whos-been-incarcerated/
- 237. Reclassified: State Drug Law Reforms to Reduce Felony Convictions and Increase Second Chances. :23.
- 238. Bird M, Tafoya S, Grattet R, Nguyen V. How Has Proposition 47 Affected California's Jail Population? Published online 2016:20.
- 239. Mooney AC, Giannella E, Glymour MM, et al. Racial/Ethnic Disparities in Arrests for Drug Possession After California Proposition 47, 2011–2016. *Am J Public Health*. 2018;108(8):987-993. doi:10.2105/AJPH.2018.304445
- 240. Hardeman RR, Homan PA, Chantarat T, Davis BA, Brown TH. Improving The Measurement Of Structural Racism To Achieve Antiracist Health Policy. *Health Affairs*. 2022;41(2):179-186. doi:10.1377/hlthaff.2021.01489
- 241. Davies D. How poverty and racism "weather" the body, accelerating aging and disease. *NPR*. https://www.npr.org/sections/health-shots/2023/03/28/1166404485/weathering-arline-geronimus-poverty-racism-stress-health. Published March 28, 2023. Accessed July 17, 2023.

- 242. Lazarus RS, Folkman S. Transactional theory and research on emotions and coping. *European Journal of Personality*. 1987;1(3):141-169. doi:https://doi.org/10.1002/per.2410010304
- 243. Rep. Bass K [D C 37. H.R.1280 117th Congress (2021-2022): George Floyd Justice in Policing Act of 2021. Published March 9, 2021. Accessed July 21, 2023. http://www.congress.gov/bill/117th-congress/house-bill/1280
- 244. Illinois General Assembly Bill Status for SB1304. Accessed July 22, 2023. https://www.ilga.gov/legislation/BillStatus.asp?DocNum=1304&GAID=13&DocTypeID=SB &SessionID=88&GA=99
- 245. Healthcare Cost and Utilization Project (HCUP). Clinical Classifications Software Refined (CCSR) for ICD-10-CM Diagnoses. Agency for Healthcare Research and Quality, Rockville, MD. Published 2020. https://www.hcup-us.ahrq.gov/toolssoftware/ccsr/ccs_refined.jsp

APPENDICES

Table A.1. List of ICD 10 codes used for identifying ED visits diagnosed with depression ²⁴⁵

ICD 10 code	Description
F0630	Mood disorder due to known physiological condition, unspecified
F0631	Mood disorder due to known physiological condition with depressive features
	Mood disorder due to known physiological condition with major depressive-like
F0632	episode
F0633	Mood disorder due to known physiological condition with manic features
F0634	Mood disorder due to known physiological condition with mixed features
F3010	Manic episode without psychotic symptoms, unspecified
F3011	Manic episode without psychotic symptoms, mild
F3012	Manic episode without psychotic symptoms, moderate
F3013	Manic episode, severe, without psychotic symptoms
F302	Manic episode, severe with psychotic symptoms
F303	Manic episode in partial remission
F304	Manic episode in full remission
F308	Other manic episodes
F309	Manic episode, unspecified
F310	Bipolar disorder, current episode hypomanic
F3110	Bipolar disorder, current episode manic without psychotic features, unspecified
F3111	Bipolar disorder, current episode manic without psychotic features, mild
F3112	Bipolar disorder, current episode manic without psychotic features, moderate
F3113	Bipolar disorder, current episode manic without psychotic features, severe
F312	Bipolar disorder, current episode manic severe with psychotic features
	Bipolar disorder, current episode depressed, mild or moderate severity,
F3130	unspecified
F3131	Bipolar disorder, current episode depressed, mild
F3132	Bipolar disorder, current episode depressed, moderate
F314	Bipolar disorder, current episode depressed, severe, without psychotic features
F315	Bipolar disorder, current episode depressed, severe, with psychotic features
F3160	Bipolar disorder, current episode mixed, unspecified
F3161	Bipolar disorder, current episode mixed, mild
F3162	Bipolar disorder, current episode mixed, moderate
F3163	Bipolar disorder, current episode mixed, severe, without psychotic features
F3164	Bipolar disorder, current episode mixed, severe, with psychotic features
F3170	Bipolar disorder, currently in remission, most recent episode unspecified
F3171	Bipolar disorder, in partial remission, most recent episode hypomanic
F3172	Bipolar disorder, in full remission, most recent episode hypomanic
F3173	Bipolar disorder, in partial remission, most recent episode manic
F3174	Bipolar disorder, in full remission, most recent episode manic
F3175	Bipolar disorder, in partial remission, most recent episode depressed
F3176	Bipolar disorder, in full remission, most recent episode depressed
F3177	Bipolar disorder, in partial remission, most recent episode mixed
F3178	Bipolar disorder, in full remission, most recent episode mixed

F3181	Bipolar II disorder
F3189	Other bipolar disorder
F319	Bipolar disorder, unspecified
F320	Major depressive disorder, single episode, mild
F321	Major depressive disorder, single episode, moderate
F322	Major depressive disorder, single episode, severe without psychotic features
F323	Major depressive disorder, single episode, severe with psychotic features
F324	Major depressive disorder, single episode, in partial remission
F325	Major depressive disorder, single episode, in full remission
F328	Other depressive episodes
F3281	Premenstrual dysphoric disorder
F3289	Other specified depressive episodes
F329	Major depressive disorder, single episode, unspecified
F330	Major depressive disorder, recurrent, mild
F331	Major depressive disorder, recurrent, moderate
F332	Major depressive disorder, recurrent severe without psychotic features
F333	Major depressive disorder, recurrent, severe with psychotic symptoms
F3340	Major depressive disorder, recurrent, in remission, unspecified
F3341	Major depressive disorder, recurrent, in partial remission
F3342	Major depressive disorder, recurrent, in full remission
F338	Other recurrent depressive disorders
F339	Major depressive disorder, recurrent, unspecified
F340	Cyclothymic disorder
F341	Dysthymic disorder
F348	Other persistent mood [affective] disorders
F3481	Disruptive mood dysregulation disorder
F3489	Other specified persistent mood disorders
F349	Persistent mood [affective] disorder, unspecified
F39	Unspecified mood [affective] disorder
R4586	Emotional lability

Table A.2. Count (N) and percentage (%) of county-months reporting police killing of unarmed Black Americans in metropolitan and non-metropolitan counties in 5 US states (AZ, KY, NC, NY, NY), 2013-2015.

County type	N	%
Metropolitan counties	26	96.30
Non-metropolitan counties	1	3.70