

# Unequal Protection: Race, Socioeconomic Status, and the Geography of Fatal Pedestrian and Bicyclist Collisions in California

**July  
2025**

A Report From the  
Center for Pedestrian and Bicyclist Safety

**Joseph Gibbons**

San Diego State University

**Bruce Appleyard**

San Diego State University

**Megan Honey**

San Diego State University

**Nell Ahangarfabrik**

San Diego State University

## About the Center for Pedestrian and Bicyclist Safety (CPBS)

The Center for Pedestrian and Bicyclist Safety (CPBS) is a consortium of universities committed to eliminating pedestrian and bicyclist fatalities and injuries through cutting-edge research, workforce development, technology transfer, and education. Consortium members include: The University of New Mexico; San Diego State University; The University of California Berkeley; The University of Tennessee Knoxville; and The University of Wisconsin Milwaukee. More information can be found at: <https://pedbikesafety.org>

## Disclaimer

The contents of this report reflect the views of the authors, who are responsible for the facts and the accuracy of the information presented herein. This document is disseminated in the interest of information exchange. The report is funded, partially or entirely, by a grant from the U.S. Department of Transportation's University Transportation Centers Program. However, the U.S. Government assumes no liability for the contents or use thereof.

The U.S. Department of Transportation requires that all University Transportation Center reports be published publicly. To fulfill this requirement, the Center for Pedestrian and Bicyclist Safety provides reports publicly on its website, [www.pedbikesafety.org](http://www.pedbikesafety.org). The authors may copyright any books, publications, or other copyrightable materials developed in the course of, or under, or as a result of the funding grant; however, the U.S. Department of Transportation reserves a royalty-free, nonexclusive and irrevocable license to reproduce, publish, or otherwise use and to authorize others to use the work for government purposes.

## Acknowledgments

This study was funded, partially or entirely, by a grant from the Center for Pedestrian and Bicyclist Safety (CPBS), supported by the U.S. Department of Transportation (USDOT) through the University Transportation Centers program. The authors would like to thank CPBS and the USDOT for their support of university-based research in transportation, and especially for the funding provided in support of this project.

# TECHNICAL DOCUMENTATION

|                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                     |  |                                                             |                                                                                                                                                             |                                                                          |                  |
|-----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|--|-------------------------------------------------------------|-------------------------------------------------------------------------------------------------------------------------------------------------------------|--------------------------------------------------------------------------|------------------|
| <b>1. Project No.</b><br>24SDSU04                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                   |  | <b>2. Government Accession No.</b>                          |                                                                                                                                                             | <b>3. Recipient's Catalog No.</b>                                        |                  |
| <b>4. Title and Subtitle</b><br>Unequal Protection: Race, Socioeconomic Status, and the Geography of Fatal Pedestrian and Bicyclist Collisions in California                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                        |  |                                                             |                                                                                                                                                             | <b>5. Report Date</b><br>July 2025                                       |                  |
|                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                     |  |                                                             |                                                                                                                                                             | <b>6. Performing Organization Code</b><br>N/A                            |                  |
| <b>7. Author(s)</b><br>Joseph Gibbons <a href="https://orcid.org/0000-0003-2470-9068">https://orcid.org/0000-0003-2470-9068</a><br>Bruce Appleyard <a href="https://orcid.org/0000-0003-2105-8079">https://orcid.org/0000-0003-2105-8079</a><br>Megan Honey <a href="https://orcid.org/0009-0007-8995-4079">https://orcid.org/0009-0007-8995-4079</a><br>Nell Ahangarfabrik <a href="https://orcid.org/0009-0006-0874-2457">https://orcid.org/0009-0006-0874-2457</a>                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                               |  |                                                             |                                                                                                                                                             | <b>8. Performing Organization Report No.</b><br>N/A                      |                  |
| <b>9. Performing Organization Name and Address</b><br>Center for Pedestrian and Bicyclist Safety<br>Centennial Engineering Center 3020<br>The University of New Mexico<br>Albuquerque, NM 87131                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                     |  |                                                             |                                                                                                                                                             | <b>10. Work Unit No. (TRAIS)</b>                                         |                  |
|                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                     |  |                                                             |                                                                                                                                                             | <b>11. Contract or Grant No.</b><br>69A3552348336                        |                  |
| <b>12. Sponsoring Agency Name and Address</b><br>United States of America<br>Department of Transportation<br>Office of Research, Development, and Technology (RD&T)                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                 |  |                                                             |                                                                                                                                                             | <b>13. Type of Report and Period Covered</b><br>Final Report (June 2025) |                  |
|                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                     |  |                                                             |                                                                                                                                                             | <b>14. Sponsoring Agency Code</b><br>USDOT OST-R                         |                  |
| <b>15. Supplementary Notes</b><br>Report available at the <a href="https://pedbikesafety.org">CPBS website [https://pedbikesafety.org]</a> and DOI <a href="https://doi.org/10.21949/pa6j-d575">https://doi.org/10.21949/pa6j-d575</a>                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                              |  |                                                             |                                                                                                                                                             |                                                                          |                  |
| <b>16. Abstract</b><br>This study investigates the persistent racial and socioeconomic disparities in fatal pedestrian and bicycle collisions across California. Leveraging a rich dataset the authors explore whether neighborhood socio-economic status (SES) mitigates fatality risk and whether this protective effect extends equally across racial and ethnic groups. Using generalized linear mixed models (GLMMs), the analysis controls for a range of built environment features, road conditions, and demographic characteristics to isolate the impact of SES and race/ethnicity on collision outcomes. The results reveal that while higher neighborhood SES is generally associated with reduced risk of fatal collisions, this benefit is disproportionately realized by White cyclists and pedestrians. In contrast, Black and Hispanic individuals do not experience comparable improvements in safety, and for some groups, such as Black cyclists and Asian pedestrians, SES has no statistically significant protective effect. |  |                                                             |                                                                                                                                                             |                                                                          |                  |
| <b>17. Key Words</b><br>Pedestrian safety; Bicycle crashes; Socioeconomic factors; Racial disparities; Traffic fatalities                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                           |  |                                                             | <b>18. Distribution Statement</b><br>No restrictions. This document is available through the National Technical Information Service, Springfield, VA 22161. |                                                                          |                  |
| <b>19. Security Classif. (of this report)</b><br>Unclassified                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                       |  | <b>20. Security Classif. (of this page)</b><br>Unclassified |                                                                                                                                                             | <b>21. No. of Pages</b><br>30                                            | <b>22. Price</b> |

Form DOT F 1700.7 (8-72)

Reproduction of completed page authorized.

| SI* (MODERN METRIC) CONVERSION FACTORS                             |                             |                             |                             |                     |
|--------------------------------------------------------------------|-----------------------------|-----------------------------|-----------------------------|---------------------|
| APPROXIMATE CONVERSIONS TO SI UNITS                                |                             |                             |                             |                     |
| Symbol                                                             | When You Know               | Multiply By                 | To Find                     | Symbol              |
| <b>LENGTH</b>                                                      |                             |                             |                             |                     |
| in                                                                 | inches                      | 25.4                        | millimeters                 | mm                  |
| ft                                                                 | feet                        | 0.305                       | meters                      | m                   |
| yd                                                                 | yards                       | 0.914                       | meters                      | m                   |
| mi                                                                 | miles                       | 1.61                        | kilometers                  | km                  |
| <b>AREA</b>                                                        |                             |                             |                             |                     |
| in <sup>2</sup>                                                    | square inches               | 645.2                       | square millimeters          | mm <sup>2</sup>     |
| ft <sup>2</sup>                                                    | square feet                 | 0.093                       | square meters               | m <sup>2</sup>      |
| yd <sup>2</sup>                                                    | square yard                 | 0.836                       | square meters               | m <sup>2</sup>      |
| ac                                                                 | acres                       | 0.405                       | hectares                    | ha                  |
| mi <sup>2</sup>                                                    | square miles                | 2.59                        | square kilometers           | km <sup>2</sup>     |
| <b>VOLUME</b>                                                      |                             |                             |                             |                     |
| fl oz                                                              | fluid ounces                | 29.57                       | milliliters                 | mL                  |
| gal                                                                | gallons                     | 3.785                       | liters                      | L                   |
| ft <sup>3</sup>                                                    | cubic feet                  | 0.028                       | cubic meters                | m <sup>3</sup>      |
| yd <sup>3</sup>                                                    | cubic yards                 | 0.765                       | cubic meters                | m <sup>3</sup>      |
| NOTE: volumes greater than 1000 L shall be shown in m <sup>3</sup> |                             |                             |                             |                     |
| <b>MASS</b>                                                        |                             |                             |                             |                     |
| oz                                                                 | ounces                      | 28.35                       | grams                       | g                   |
| lb                                                                 | pounds                      | 0.454                       | kilograms                   | kg                  |
| T                                                                  | short tons (2000 lb)        | 0.907                       | megagrams (or "metric ton") | Mg (or "t")         |
| <b>TEMPERATURE (exact degrees)</b>                                 |                             |                             |                             |                     |
| °F                                                                 | Fahrenheit                  | 5 (F-32)/9<br>or (F-32)/1.8 | Celsius                     | °C                  |
| <b>ILLUMINATION</b>                                                |                             |                             |                             |                     |
| fc                                                                 | foot-candles                | 10.76                       | lux                         | lx                  |
| fl                                                                 | foot-Lamberts               | 3.426                       | candela/m <sup>2</sup>      | cd/m <sup>2</sup>   |
| <b>FORCE and PRESSURE or STRESS</b>                                |                             |                             |                             |                     |
| lbf                                                                | poundforce                  | 4.45                        | newtons                     | N                   |
| lbf/in <sup>2</sup>                                                | poundforce per square inch  | 6.89                        | kilopascals                 | kPa                 |
| APPROXIMATE CONVERSIONS FROM SI UNITS                              |                             |                             |                             |                     |
| Symbol                                                             | When You Know               | Multiply By                 | To Find                     | Symbol              |
| <b>LENGTH</b>                                                      |                             |                             |                             |                     |
| mm                                                                 | millimeters                 | 0.039                       | inches                      | in                  |
| m                                                                  | meters                      | 3.28                        | feet                        | ft                  |
| m                                                                  | meters                      | 1.09                        | yards                       | yd                  |
| km                                                                 | kilometers                  | 0.621                       | miles                       | mi                  |
| <b>AREA</b>                                                        |                             |                             |                             |                     |
| mm <sup>2</sup>                                                    | square millimeters          | 0.0016                      | square inches               | in <sup>2</sup>     |
| m <sup>2</sup>                                                     | square meters               | 10.764                      | square feet                 | ft <sup>2</sup>     |
| m <sup>2</sup>                                                     | square meters               | 1.195                       | square yards                | yd <sup>2</sup>     |
| ha                                                                 | hectares                    | 2.47                        | acres                       | ac                  |
| km <sup>2</sup>                                                    | square kilometers           | 0.386                       | square miles                | mi <sup>2</sup>     |
| <b>VOLUME</b>                                                      |                             |                             |                             |                     |
| mL                                                                 | milliliters                 | 0.034                       | fluid ounces                | fl oz               |
| L                                                                  | liters                      | 0.264                       | gallons                     | gal                 |
| m <sup>3</sup>                                                     | cubic meters                | 35.314                      | cubic feet                  | ft <sup>3</sup>     |
| m <sup>3</sup>                                                     | cubic meters                | 1.307                       | cubic yards                 | yd <sup>3</sup>     |
| <b>MASS</b>                                                        |                             |                             |                             |                     |
| g                                                                  | grams                       | 0.035                       | ounces                      | oz                  |
| kg                                                                 | kilograms                   | 2.202                       | pounds                      | lb                  |
| Mg (or "t")                                                        | megagrams (or "metric ton") | 1.103                       | short tons (2000 lb)        | T                   |
| <b>TEMPERATURE (exact degrees)</b>                                 |                             |                             |                             |                     |
| °C                                                                 | Celsius                     | 1.8C+32                     | Fahrenheit                  | °F                  |
| <b>ILLUMINATION</b>                                                |                             |                             |                             |                     |
| lx                                                                 | lux                         | 0.0929                      | foot-candles                | fc                  |
| cd/m <sup>2</sup>                                                  | candela/m <sup>2</sup>      | 0.2919                      | foot-Lamberts               | fl                  |
| <b>FORCE and PRESSURE or STRESS</b>                                |                             |                             |                             |                     |
| N                                                                  | newtons                     | 0.225                       | poundforce                  | lbf                 |
| kPa                                                                | kilopascals                 | 0.145                       | poundforce per square inch  | lbf/in <sup>2</sup> |

# **Unequal Protection: Race, Socioeconomic Status, and the Geography of Fatal Pedestrian and Bicyclist Collisions in California**

---

A Center for Pedestrian and Bicyclist Safety Research Report

July 2025

**Joseph Gibbons**

Sociology  
San Diego State University

**Bruce Appleyard**

City Planning  
San Diego State University

**Megan Honey**

City Planning  
San Diego State University

**Nell Ahangarfabrik**

City Planning  
San Diego State University

## TABLE OF CONTENTS

|                                                |     |
|------------------------------------------------|-----|
| Acronyms, Abbreviations, and Symbols .....     | iii |
| Abstract .....                                 | iv  |
| Executive Summary .....                        | v   |
| Introduction .....                             | 1   |
| Literature Review.....                         | 3   |
| Data and Methodology.....                      | 5   |
| Data Sources .....                             | 5   |
| Modeling Strategy and Statistical Methods..... | 6   |
| Data Treatment and Assumptions .....           | 6   |
| Results .....                                  | 7   |
| Discussion .....                               | 11  |
| Conclusions and Recommendations.....           | 13  |
| References .....                               | 15  |

## List of Tables

|                                                                                                           |   |
|-----------------------------------------------------------------------------------------------------------|---|
| Table 1. Descriptive Statistics of Cycle Collisions in California 2011-2022, by Race/Ethnicity .....      | 7 |
| Table 2. Descriptive Statistics of Pedestrian Collisions in California 2011-2022, by Race/Ethnicity ..... | 8 |
| Table 3. GLMM Fatal Collisions in California 2011-2022, Odds Ratios.....                                  | 9 |

## Acronyms, Abbreviations, and Symbols

|          |                                                          |
|----------|----------------------------------------------------------|
| ACS      | American Community Survey                                |
| BIPOC    | Black, Indigenous, and People of Color                   |
| CALTRANS | California Department of Transportation                  |
| DOT      | Department of Transportation                             |
| EPA      | Environmental Protection Agency                          |
| GLMM     | Generalized Linear Mixed Model                           |
| GIS      | Geographic Information Systems                           |
| LOS      | Level of Service                                         |
| MPO      | Metropolitan Planning Organization                       |
| OR       | Odds Ratio                                               |
| POC      | People of Color                                          |
| PCA      | Principal Component Analysis                             |
| SES      | Socio-Economic Status                                    |
| SWITRS   | Statewide Integrated Traffic Records System (California) |
| USDOT    | United States Department of Transportation               |

## Abstract

This study investigates the persistent racial and socioeconomic disparities in fatal pedestrian and bicycle collisions across California, addressing an urgent public safety issue linked to rising fatality rates among vulnerable road users. Leveraging a rich dataset compiled from the California Statewide Integrated Traffic Records System (SWITRS), American Community Survey (ACS), Caltrans Active Transportation Benefit-Cost Tool, and the EPA's Smart Location Database, the authors explore whether neighborhood socio-economic status (SES) mitigates fatality risk and whether this protective effect extends equally across racial and ethnic groups. Using generalized linear mixed models (GLMMs), the analysis controls for a range of built environment features, road conditions, and demographic characteristics to isolate the impact of SES and race/ethnicity on collision outcomes. The results reveal that while higher neighborhood SES is generally associated with reduced risk of fatal collisions, this benefit is disproportionately realized by White cyclists and pedestrians. In contrast, Black and Hispanic individuals do not experience comparable improvements in safety, and for some groups, such as Black cyclists and Asian pedestrians, SES has no statistically significant protective effect. These findings persist even after adjusting for traffic infrastructure, road type, and driver behavior, suggesting that structural racism and unequal resource utilization may undermine the safety benefits typically attributed to higher SES environments. Through statistical analysis of over a decade of collision data, this study underscores the need for targeted, equity-driven interventions in transportation planning, such as inclusive infrastructure investments, community-engaged safety programs, and driver behavior reforms, to address the intersectional risks faced by people of color in both low- and high-SES areas.

## Executive Summary

This study responds to the troubling rise in pedestrian and bicyclist fatalities in the United States, particularly among communities of color, by examining how racial and socioeconomic disparities shape fatal collision outcomes across California. Drawing from a growing body of research that highlights elevated collision risks for Black and Hispanic individuals, especially in low-income neighborhoods, the project goes beyond prior work by investigating whether these disparities persist after controlling for built environment features, individual-level demographics, and neighborhood socio-economic status (SES). The core objective is to determine whether higher SES environments reduce the likelihood of fatal collisions equally across racial and ethnic groups and to identify the social mechanisms that underpin unequal road safety outcomes.

The research employs a multi-method approach combining rigorous statistical modeling. Bicycle and pedestrian collision data were collected from the California Statewide Integrated Traffic Records System (SWITRS), covering the period from 2011 to 2022. These data were augmented with demographic information from the American Community Survey (ACS), police enforcement indicators, built environment measures from Caltrans and OpenStreetMap, and walkability scores from the EPA's Smart Location Database. A place typology based on land use and urban design characteristics was also used to classify neighborhood context. This rich, multi-sourced dataset enabled the researchers to assess the relationship between race, SES, and fatality risk while accounting for traffic infrastructure, road conditions, and neighborhood form.

The analysis centers on generalized linear mixed models (GLMMs), stratified by race/ethnicity and crash type (bicyclist or pedestrian), to examine whether SES mitigates the probability of fatality in collisions involving vehicles. The models control for a wide range of covariates, including age, gender, time of day, road type, vehicle speed, driver behavior (e.g., intoxication), and location-based characteristics like walkability and land use density. A multilevel framework was used to incorporate neighborhood clustering effects.

The key findings reveal a complex and uneven relationship between SES, race/ethnicity, and fatal crash outcomes. While increases in neighborhood SES are generally associated with decreased fatality risk for White cyclists and pedestrians, the benefits of affluent environments are not equally distributed. Notably, Black cyclists experience no statistically significant reduction in fatality risk with higher SES, and Asian pedestrians similarly do not benefit from safer conditions in more affluent areas. For Hispanic pedestrians, the risk declines modestly, but the protective effects are still less than those seen for White counterparts. These results persist even after controlling for road conditions, infrastructure availability, and enforcement-related variables, indicating that structural and behavioral factors may undermine the protective benefits of SES for communities of color.

The analysis further reveals that collisions involving POC often occur in areas lacking adequate infrastructure, such as bike lanes and crosswalks, and are more likely to happen on high-speed

arterials. Although affluent neighborhoods tend to have better infrastructure, racial disparities persist within them, suggesting that the presence of infrastructure alone is insufficient to ensure equitable safety outcomes. This could be due to a variety of mechanisms, including discriminatory driver behavior (e.g., drivers failing to yield to non-White pedestrians), mistrust or underutilization of new infrastructure in gentrifying areas, or differences in commuting patterns and exposure to traffic risks across racial groups.

The study concludes that addressing disparities in road safety requires more than investment in infrastructure. While improving the built environment is essential, such interventions must be paired with equity-focused strategies that consider how different groups experience and access those improvements. Key recommendations include: prioritizing infrastructure investment in low-SES and majority-minority neighborhoods; implementing targeted road safety programs that engage local communities; and promoting educational campaigns to counteract driver bias and encourage safer, more inclusive road behaviors. Finally, transportation policy and planning practices must reckon with the legacy of disinvestment and structural racism that continues to shape who is safe, and who is not, on American streets.

By rigorously analyzing the intersection of race, class, and the built environment in relation to fatal pedestrian and bicyclist collisions, this project offers a nuanced understanding of where and for whom road safety improvements are working, and where they are not. The study highlights the importance of disaggregated, spatially aware, and justice-oriented transportation research and provides a strong empirical foundation for the development of more equitable and effective traffic safety interventions.

## Introduction

In the past decade, a troubling trend has emerged on American roadways: a steady and significant increase in pedestrian and bicyclist fatalities (Schneider et al., 2021). According to data from the National Highway Traffic Safety Administration (NHTSA), pedestrian deaths rose by over 50 percent between 2012 and 2021, while bicyclist fatalities increased by more than 30 percent over the same period (National Highway Traffic Safety Administration, 2023a, 2023b). These statistics stand in sharp contrast to broader improvements in automotive safety and signal an urgent need to reassess the equity and effectiveness of traffic safety planning and infrastructure development. Particularly concerning is the mounting evidence that these fatalities are not evenly distributed across the population. Instead, they disproportionately impact people of color (POC), especially Black and Hispanic pedestrians and cyclists (Glassbrenner et al., 2022; Mansfield et al., 2018; Schneider, 2020; Stoker et al., 2015), who often live in neighborhoods historically shaped by racial segregation, economic disinvestment, and substandard infrastructure (CITE).

This research project directly engages with this public safety crisis by addressing two interrelated questions: First, do racial and ethnic disparities in fatal bicycle and pedestrian collisions persist even after accounting for neighborhood-level socio-economic status (SES) and other demographic and environmental factors? Second, how do the spatial and temporal patterns of these fatalities reflect broader structural inequities in the built environment and enforcement practices? By exploring these questions, the study builds upon existing literature that has identified race and class as key predictors of traffic-related injury and death, while moving beyond surface-level correlations to investigate the structural mechanisms that drive persistent inequities.

Despite the well-documented link between infrastructure inequality and road safety outcomes, relatively little research has explored whether improvements in socio-economic conditions, such as living in higher-income neighborhoods, provide equal safety benefits to residents across racial and ethnic groups. Do POC living in affluent areas experience the same reduction in risk as their White peers, or do structural and behavioral factors continue to place them at elevated danger? This question is crucial for understanding whether existing transportation equity initiatives, which often focus on place-based infrastructure upgrades, are sufficient to reduce disparities or whether they must be supplemented by targeted programs that address racialized social dynamics and behavioral factors.

To address this gap, this project employs a robust, multi-source dataset combining collision records, demographic data, built environment measures, and enforcement indicators. The primary source of collision data comes from the California Statewide Integrated Traffic Records System (SWITRS), which provides detailed information on pedestrian and bicycle crashes reported to law enforcement between 2011 and 2022. These data are linked to demographic and socio-economic indicators from the American Community Survey (ACS), which allow for the construction of a composite SES measure based on neighborhood-level income, education, rent, and home values. Additional context is provided through police enforcement data, road condition and infrastructure

indicators from Caltrans and OpenStreetMap, and walkability scores derived from the EPA's Smart Location Database.

By applying generalized linear mixed models (GLMMs) to this integrated dataset, the study is able to assess whether SES independently predicts the likelihood of fatality in a collision and, crucially, whether that relationship is moderated by race and ethnicity. This analytical approach enables the researchers to isolate the effects of SES from those of race, infrastructure, enforcement, and neighborhood form, thereby providing a clearer understanding of how each of these variables contributes to fatality risk. The stratification of models by race and ethnicity also allows for a more granular exploration of group-specific dynamics, revealing whether presumed safety benefits of higher SES environments extend to all residents or remain unequally distributed.

This project also contributes methodologically by combining multilevel modeling to examine where and for whom fatal collisions occur. These methods not only inform public policy and urban planning efforts but also challenge the notion that universal infrastructure improvements are sufficient to achieve equity. Instead, they point to the need for intentional, community-specific approaches that recognize the intersectionality of race, place, and class in shaping transportation risk.

In sum, this research aims to provide a comprehensive, empirically grounded understanding of how socio-economic and racial disparities manifest in pedestrian and bicyclist fatalities. It advances the literature by testing whether higher-income neighborhoods offer universal protection or reinforce existing inequalities; by integrating police, demographic, and environmental data into a unified analytical framework; and by identifying the spatial dimensions of fatality risk across time. In doing so, it generates actionable insights for policymakers, urban planners, and advocates seeking to create safer and more equitable streets for all road users, regardless of race or economic status. Ultimately, the study demonstrates that tackling racial disparities in traffic fatalities requires not just better infrastructure, but also systemic changes in how transportation systems are planned, policed, and experienced across communities.

## Literature Review

Understanding the relationship between socio-economic status (SES), race/ethnicity, and fatal pedestrian and bicycle collisions is complex and multifaceted. Prior research has consistently shown that fatal collisions are more likely to occur in communities with lower SES, and that racial and ethnic minorities, particularly Black and Hispanic individuals, are disproportionately affected by these incidents. However, much of the existing literature has examined these factors in isolation, without fully exploring how SES and race/ethnicity interact with each other and with the built environment to influence fatality risk.

One key factor that contributes to these disparities is the built environment. Low-income and majority-non-White neighborhoods are often marked by insufficient infrastructure for safe walking and cycling. These areas frequently lack continuous sidewalks, bike lanes, safe crossing points, and effective traffic-calming measures (Braun et al., 2019; Cradock et al., 2009; Lowe, 2016; Rajaei et al., 2021). Numerous studies confirm that high-quality infrastructure is crucial for reducing the likelihood and severity of bicycle and pedestrian collisions (Hamann & Peek-Asa, 2013; Minikel, 2012; Teschke et al., 2012; Vandenbulcke et al., 2014). The absence of such protections leaves cyclists and pedestrians, especially those in low-SES communities, at greater risk.

Historical and systemic disinvestment in infrastructure has exacerbated these disparities. Due to long-standing patterns of racial segregation and political marginalization, communities of color have often received fewer resources and infrastructure upgrades compared to wealthier, predominantly White neighborhoods (Alexander et al., 2014; Do et al., 2017; Gibbons & Yang, 2014; Gordon, 2019; Moody et al., 2016; Sharkey, 2013). These same communities frequently face difficulties in having their concerns addressed through formal planning processes (Chang et al., 2009; Tigges et al., 1998). In contrast, more affluent neighborhoods not only tend to have better-maintained roads and pedestrian facilities, but also greater political influence to advocate for safety improvements (Gilens & Page, 2014; Lubitow et al., 2016).

Environmental hazards also play a major role in shaping fatality risk. Low-income and non-White residents are more likely to live near high-speed arterials and major thoroughfares, increasing their exposure to traffic dangers (P.L. Jacobsen & H. Rutter, 2012; Roll, 2021; Sanders & Schneider, 2022). Historically, urban highways and hazardous road projects have often been routed through minority neighborhoods, further compounding the risk (Self, 2003; Sugrue, 1996).

Beyond the built environment, the socio-economic characteristics of drivers and local conditions can affect collision risks. Drivers from lower-income backgrounds may face longer commutes, irregular work hours, and vehicle-related issues such as older or poorly maintained cars, factors linked to driver fatigue and unsafe driving behaviors (Amoadu et al., 2023; Blumenberg & Haas, 2002; Cervero et al., 2002; Giroto et al., 2019; Gómez-Ortiz et al., 2018; Lee et al., 2014, 2021; Zhou et al., 2020). These challenges, combined

with stress and job insecurity, may contribute to more hazardous road environments in disadvantaged areas.

Low-income areas may also see different patterns of behavior among both drivers and pedestrians. For example, higher traffic violation rates have been observed in these neighborhoods (Lee et al., 2021), though this may reflect not only reckless driving but also increased police presence and enforcement. Additionally, pedestrians in these areas may have less access to traffic safety education and may be forced to navigate poorly designed or maintained streets, increasing their vulnerability (Husain et al., 2019; Koekemoer et al., 2017; Noland et al., 2013).

Yet, even higher-SES neighborhoods may not be equally safe for all. Research suggests that racial bias influences driver behavior, non-White pedestrians are less likely to be yielded to at crosswalks, particularly in affluent areas and by drivers of more expensive vehicles (Coughenour et al., 2020; Goddard et al., 2015). This may explain why increased neighborhood affluence does not uniformly reduce fatality risk for all racial and ethnic groups.

Furthermore, cultural and political perceptions of infrastructure may shape how resources are used. In some communities of color, new cycling infrastructure has been viewed with suspicion and associated with gentrification or displacement (Lubitow et al., 2016; Stein, 2011), leading to lower utilization rates. Commuting patterns may also vary by race and ethnicity, with some groups facing greater exposure to high-risk environments regardless of neighborhood affluence (Lee et al., 2014, 2021; Roll, 2021).

In sum, while prior studies have established that SES and race/ethnicity are important predictors of pedestrian and bicyclist fatalities, less is known about how these variables interact, especially when factoring in built environment quality and behavioral dynamics. This study addresses that gap by investigating whether higher neighborhood SES leads to improved safety outcomes for all racial and ethnic groups, or whether disparities persist despite improvements in socio-economic context. By linking individual, neighborhood, and structural factors, this research offers a more comprehensive understanding of the mechanisms driving inequitable road safety outcomes.

## Data and Methodology

This study investigates the intersection of race, socio-economic status (SES), and fatal pedestrian and bicyclist collisions across California, with the goal of determining whether disparities in fatality outcomes persist after controlling for neighborhood and individual-level factors. The analysis integrates multiple data sources spanning demographic, infrastructural, and enforcement-related indicators, and employs multilevel statistical models to evaluate both individual and contextual influences on collision outcomes.

### Data Sources

The primary data on pedestrian and bicyclist collisions were obtained from the California Statewide Integrated Traffic Records System (SWITRS), covering incidents reported between 2011 and 2022. SWITRS includes detailed information on the nature of each crash, the individuals involved, vehicle characteristics, contributing factors, and environmental conditions. For the purposes of this study, the dependent variable is a binary indicator of whether a collision involving a pedestrian or bicyclist resulted in a fatality. Race/ethnicity of the pedestrian or cyclist was extracted from SWITRS and categorized as White (reference group), Black, Hispanic, Asian, or Other. While these categories reflect commonly used racial designations, a notable limitation is the inability to disaggregate non-Hispanic from Hispanic individuals within each racial category. Additionally, multiracial individuals are grouped under “Other,” which limits interpretive specificity.

Neighborhood socio-economic characteristics were drawn from the American Community Survey (ACS) 2015–2019 five-year estimates, joined to SWITRS data at the census tract level. SES was operationalized using principal component analysis (PCA) on four tract-level variables: median rent, median home value, percentage of residents with a college degree, and median household income. These indicators were standardized prior to PCA, and the resulting SES score captured over 74% of the total variance. The SES index demonstrated high internal reliability (Cronbach's Alpha = 0.886) and was used as a continuous predictor in the models.

To capture the influence of the built environment and road context, several additional data sources were integrated. Bicycle infrastructure presence and cyclist density estimates were obtained using the PeopleForBikes Bicycle Network Analysis tool and OpenStreetMap layers, which were processed via the Caltrans Active Transportation Benefit-Cost Tool. Road classification (e.g., arterial vs. local street), posted speed limit, weather, and time-of-day information were included as covariates from SWITRS. A walkability score, derived from the EPA's Smart Location Database (SLD), was included to reflect relative pedestrian accessibility based on intersection density, proximity to transit, and land use diversity.

Neighborhood typology was classified using a place-type framework developed by Frost et al. (2018), which incorporates six urban form dimensions: density, land mix, design, diversity,

destination accessibility, and transit proximity. Tracts were categorized as urban centers, urban places, compact suburban, suburban, rural, employment centers, or special districts.

## **Modeling Strategy and Statistical Methods**

The primary analytical technique employed was generalized linear mixed modeling (GLMM) using a binomial distribution and logit link function to estimate the likelihood of fatality in a pedestrian or bicycle collision. Models were stratified by race/ethnicity to assess differential effects of SES and environmental conditions across groups. Both individual-level and neighborhood-level covariates were included, with census tracts nested within cities treated as a random intercept to account for spatial clustering and unobserved contextual variation.

All models were implemented in R (version 4.2+) using the `lme4` package. The `glmer()` function was used to estimate the fixed and random effects, and the `bobyqa` optimizer was specified to enhance convergence stability. Multicollinearity was assessed using variance inflation factors (VIFs), which confirmed acceptable tolerance thresholds for all included predictors. To evaluate the extent of between-neighborhood variation in fatality outcomes, intraclass correlation coefficients (ICCs) were calculated from null models (i.e., random intercept-only models). ICC values were approximately 4.2% for bicyclist collisions and 6.2% for pedestrian collisions, indicating modest but meaningful clustering at the neighborhood level.

## **Data Treatment and Assumptions**

Only cases with complete information on key variables (e.g., fatality outcome, SES, race/ethnicity, location) were included in the final analytic sample. Collisions involving multiple pedestrians or cyclists were disaggregated to person-level records. To mitigate potential bias from geographic exposure, pedestrian and cyclist density measures were included where available, although pedestrian exposure data by race were not obtainable and are acknowledged as a study limitation. The analysis assumes that fatality risk is conditioned by both observable characteristics (e.g., infrastructure, behavior) and latent contextual influences (e.g., systemic disinvestment, structural racism) that are partially captured through neighborhood typologies and SES proxies. Sensitivity tests using alternative SES measures (e.g., raw income or educational attainment alone) produced substantively similar results, supporting the robustness of the PCA-based SES index.

## Results

This section presents findings from a series of multilevel generalized linear mixed models (GLMMs) estimating the likelihood that a pedestrian or bicyclist collision results in a fatality, with attention to how this risk varies by the race/ethnicity of the victim and the socio-economic status (SES) of the neighborhood where the collision occurs. The analysis proceeds from descriptive statistics to regression estimates and predicted probabilities to demonstrate how SES moderates fatality risk, and how that moderation differs across racial and ethnic groups.

Descriptive statistics, reported in Tables 1 and 2, reveal important contextual differences in where fatal collisions occur. On average, Black and Hispanic pedestrians and cyclists involved in fatal collisions reside in neighborhoods with significantly lower SES scores compared to White and Asian individuals. For instance, the mean SES score of neighborhoods where Black cyclists are killed is nearly two standard deviations below the state average, highlighting how structural conditions vary sharply by race. Meanwhile, collisions involving White individuals span a broader SES range, with many occurring in relatively affluent areas.

**Table 1. Descriptive Statistics of Cycle Collisions in California 2011-2022, by Race/Ethnicity**

|                                             | White   |          | Black               |          | Hispanic            |          | Asian                |          |
|---------------------------------------------|---------|----------|---------------------|----------|---------------------|----------|----------------------|----------|
|                                             | Mean    | St. Dev. | Mean                | St. Dev. | Mean                | St. Dev. | Mean                 | St. Dev. |
| Fatal <sup>D</sup>                          | 0.015   | 0.120    | 0.010               | 0.101    | 0.014 <sup>NS</sup> | 0.117    | 0.013 <sup>NS</sup>  | 0.113    |
| Male <sup>D</sup>                           | 0.764   | 0.425    | 0.833               | 0.373    | 0.864               | 0.343    | 0.748                | 0.434    |
| Age                                         | 39.394  | 18.162   | 34.948              | 17.524   | 31.435              | 16.398   | 35.924               | 19.698   |
| Rear-Ended <sup>D</sup>                     | 0.066   | 0.248    | 0.048               | 0.215    | 0.047               | 0.211    | 0.051                | 0.220    |
| Hit by Truck <sup>D</sup>                   | 0.015   | 0.120    | 0.015 <sup>NS</sup> | 0.120    | 0.015 <sup>NS</sup> | 0.121    | 0.011                | 0.102    |
| Vehicle Driver Under Influence <sup>D</sup> | 0.010   | 0.101    | 0.008               | 0.089    | 0.010 <sup>NS</sup> | 0.101    | 0.005                | 0.069    |
| Vehicle Driver Unsafe Speeds <sup>D</sup>   | 0.048   | 0.215    | 0.053               | 0.225    | 0.045               | 0.207    | 0.045 <sup>NS</sup>  | 0.208    |
| Conditions Dark <sup>D</sup>                | 0.024   | 0.152    | 0.021 <sup>NS</sup> | 0.145    | 0.021               | 0.144    | 0.012                | 0.107    |
| Bad Weather <sup>D</sup>                    | 0.020   | 0.140    | 0.023               | 0.150    | 0.018               | 0.134    | 0.018 <sup>NS</sup>  | 0.133    |
| Major Arterial Road <sup>D</sup>            | 0.174   | 0.379    | 0.179 <sup>NS</sup> | 0.383    | 0.197               | 0.398    | 0.167 <sup>NS</sup>  | 0.373    |
| Posted Speed Limit                          | 28.073  | 7.793    | 26.798              | 5.870    | 27.177              | 6.478    | 28.051 <sup>NS</sup> | 7.445    |
| Bicycle Infrastructure <sup>D</sup>         | 0.217   | 0.412    | 0.147               | 0.354    | 0.122               | 0.327    | 0.251                | 0.434    |
| Bicycle Density                             | 225.437 | 240.418  | 209.025             | 195.340  | 183.486             | 138.586  | 247.956              | 244.766  |
| Neighborhood Percent Black                  | 4.422   | 6.017    | 13.522              | 13.897   | 6.042               | 8.357    | 4.360 <sup>NS</sup>  | 5.800    |
| Neighborhood Percent Asian                  | 13.101  | 13.819   | 12.829              | 13.676   | 12.428              | 14.409   | 29.340               | 21.288   |
| Neighborhood Percent Hispanic               | 26.681  | 20.417   | 41.623              | 24.377   | 54.444              | 27.335   | 24.436               | 19.748   |
| Neighborhood SES                            | 1.964   | 2.397    | 0.450               | 1.836    | 0.457               | 1.761    | 2.473                | 2.531    |
| Compact Suburban Places <sup>D</sup>        | 0.172   | 0.377    | 0.139               | 0.346    | 0.190               | 0.393    | 0.181                | 0.385    |
| Suburban Places <sup>D</sup>                | 0.450   | 0.497    | 0.339               | 0.473    | 0.359               | 0.480    | 0.427                | 0.495    |
| Rural Places <sup>D</sup>                   | 0.054   | 0.226    | 0.010               | 0.098    | 0.014               | 0.119    | 0.028                | 0.164    |
| Employment Centers <sup>D</sup>             | 0.010   | 0.099    | 0.011 <sup>NS</sup> | 0.103    | 0.008               | 0.087    | 0.006                | 0.080    |
| Special Districts <sup>D</sup>              | 0.019   | 0.138    | 0.013               | 0.114    | 0.014               | 0.116    | 0.034                | 0.182    |
| Walkability Score                           | 13.230  | 3.489    | 14.218              | 2.702    | 13.940              | 2.676    | 13.767               | 3.126    |
|                                             | 53,498  |          | 11,823              |          | 42,955              |          | 6,749                |          |

Note: All differences in means between White and non-White means are significant (\*p<0.050) unless otherwise indicated (<sup>NS</sup>); Values of <sup>D</sup> indicate dichotomous variables.

**Table 2. Descriptive Statistics of Pedestrian Collisions in California 2011-2022, by Race/Ethnicity**

|                                                   | White  |          | Black               |          | Hispanic            |          | Asian               |          |
|---------------------------------------------------|--------|----------|---------------------|----------|---------------------|----------|---------------------|----------|
|                                                   | Mean   | St. Dev. | Mean                | St. Dev. | Mean                | St. Dev. | Mean                | St. Dev. |
| <b>Fatal<sup>D</sup></b>                          | 0.077  | 0.266    | 0.061               | 0.238    | 0.065               | 0.247    | 0.063               | 0.243    |
| <b>Male<sup>D</sup></b>                           | 0.600  | 0.490    | 0.596 <sup>NS</sup> | 0.491    | 0.599 <sup>NS</sup> | 0.490    | 0.453               | 0.498    |
| <b>Age</b>                                        | 42.781 | 20.352   | 37.176              | 19.136   | 34.395              | 20.366   | 47.381              | 23.422   |
| <b>Rear-Ended<sup>D</sup></b>                     | 0.019  | 0.136    | 0.020 <sup>NS</sup> | 0.139    | 0.024               | 0.154    | 0.016               | 0.127    |
| <b>Hit by Truck<sup>D</sup></b>                   | 0.018  | 0.133    | 0.019 <sup>NS</sup> | 0.136    | 0.017 <sup>NS</sup> | 0.129    | 0.014               | 0.117    |
| <b>Vehicle Driver Under Influence<sup>D</sup></b> | 0.022  | 0.146    | 0.017               | 0.129    | 0.024               | 0.153    | 0.014               | 0.119    |
| <b>Vehicle Driver Unsafe Speeds<sup>D</sup></b>   | 0.058  | 0.235    | 0.064               | 0.245    | 0.063               | 0.243    | 0.054               | 0.225    |
| <b>Conditions Dark<sup>D</sup></b>                | 0.086  | 0.280    | 0.064               | 0.244    | 0.067               | 0.249    | 0.032               | 0.177    |
| <b>Bad Weather<sup>D</sup></b>                    | 0.057  | 0.233    | 0.049               | 0.215    | 0.044               | 0.205    | 0.065               | 0.246    |
| <b>Major Arterial Road<sup>D</sup></b>            | 0.188  | 0.390    | 0.198               | 0.398    | 0.192               | 0.394    | 0.158               | 0.364    |
| <b>Posted Speed Limit</b>                         | 28.041 | 8.382    | 27.231              | 7.486    | 27.491              | 7.744    | 27.180              | 6.850    |
| <b>Neighborhood Percent Black</b>                 | 5.300  | 6.615    | 15.982              | 15.838   | 6.668               | 9.196    | 5.091               | 6.448    |
| <b>Neighborhood Percent Asian</b>                 | 12.707 | 13.621   | 12.252              | 13.933   | 11.250              | 13.746   | 32.440              | 22.174   |
| <b>Neighborhood Percent Hispanic</b>              | 30.628 | 22.098   | 43.298              | 24.264   | 56.845              | 26.622   | 26.586              | 20.565   |
| <b>Neighborhood SES</b>                           | 1.350  | 2.218    | 0.276               | 1.723    | 0.223               | 1.628    | 1.844               | 2.184    |
| <b>Compact Suburban Places<sup>D</sup></b>        | 0.167  | 0.373    | 0.131               | 0.338    | 0.178               | 0.383    | 0.148               | 0.355    |
| <b>Suburban Places<sup>D</sup></b>                | 0.419  | 0.493    | 0.325               | 0.468    | 0.367               | 0.482    | 0.304               | 0.460    |
| <b>Rural Places<sup>D</sup></b>                   | 0.043  | 0.203    | 0.010               | 0.101    | 0.024               | 0.152    | 0.010               | 0.102    |
| <b>Employment Centers<sup>D</sup></b>             | 0.010  | 0.101    | 0.008               | 0.089    | 0.006               | 0.078    | 0.009 <sup>NS</sup> | 0.095    |
| <b>Special Districts<sup>D</sup></b>              | 0.014  | 0.117    | 0.015 <sup>NS</sup> | 0.122    | 0.011               | 0.104    | 0.020               | 0.139    |
| <b>Walkability Score</b>                          | 13.656 | 3.326    | 14.153              | 2.643    | 13.753              | 2.820    | 14.662              | 2.719    |
|                                                   | 46,163 |          | 20,775              |          | 58,971              |          | 9,170               |          |

Note: All differences in means between White and non-White means are significant (\*p<0.050) unless otherwise indicated (<sup>NS</sup>); Values of <sup>D</sup> indicate dichotomous variables.

The multilevel regression models, reported in Table 3, show that SES is a strong and statistically significant predictor of fatality for most racial and ethnic groups, but not all. For White cyclists, each one-unit increase in neighborhood SES is associated with a 21.1 percent decrease in the odds of a fatal collision, holding all other factors constant. This is reflected in an odds ratio (OR) of approximately 0.79, where values below 1.0 indicate a reduced likelihood of a fatal outcome as SES increases. Similarly, for White pedestrians, the odds ratio is around 0.78, suggesting a slightly stronger protective effect of neighborhood affluence.

The models also reveal a protective effect for Hispanic individuals, though to a lesser extent. Hispanic cyclists experience a 23.6 percent reduction in the odds of a fatal collision with each unit increase in SES, while Hispanic pedestrians experience an 18.6 percent reduction. While these patterns are broadly consistent with those seen for White individuals, the magnitude and precision of the effect are somewhat smaller, as reflected in wider confidence intervals and lower statistical significance.

Crucially, the protective role of SES is much weaker, and in some cases absent, for Black and Asian individuals. For Black cyclists, there is no statistically significant association between neighborhood SES and the probability of a fatal outcome. The odds ratio in this case hovers near 1.0, indicating that residing in a higher-SES area does not reduce their risk of a fatal collision. Black pedestrians do show a modest reduction in risk, with an odds ratio near 0.90, but this effect is smaller and statistically marginal. For Asian pedestrians, SES likewise does not predict fatality risk in a statistically meaningful way.

**Table 3. GLMM Fatal Collisions in California 2011-2022, Odds Ratios**

|                                       | Bicycle             |                       |                     |                       | Pedestrian          |                     |                     |                     |
|---------------------------------------|---------------------|-----------------------|---------------------|-----------------------|---------------------|---------------------|---------------------|---------------------|
|                                       | White               | Black                 | Hispanic            | Asian                 | White               | Black               | Hispanic            | Asian               |
|                                       | (1)                 | (2)                   | (3)                 | (4)                   | (5)                 | (6)                 | (7)                 | (8)                 |
| <b>Male</b>                           | 1.070<br>(0.044)    | 1.123<br>(0.200)      | 1.275***<br>(0.064) | 1.272***<br>(0.003)   | 1.144***<br>(0.020) | 1.237***<br>(0.034) | 1.290***<br>(0.020) | 1.048<br>(0.049)    |
| <b>Age</b>                            | 2.028***<br>(0.043) | 2.260***<br>(0.182)   | 1.871***<br>(0.042) | 2.261***<br>(0.003)   | 1.774***<br>(0.021) | 1.735***<br>(0.034) | 1.835***<br>(0.018) | 2.285***<br>(0.058) |
| <b>Rear-Ended</b>                     | 1.173***<br>(0.030) | 1.541***<br>(0.113)   | 1.155***<br>(0.033) | 0.943***<br>(0.004)   | 0.831***<br>(0.026) | 0.833***<br>(0.039) | 0.797***<br>(0.022) | 0.897*<br>(0.052)   |
| <b>Hit by Truck</b>                   | 1.242***<br>(0.020) | 1.300*<br>(0.113)     | 1.186***<br>(0.026) | 1.403***<br>(0.004)   | 1.119***<br>(0.014) | 1.121***<br>(0.023) | 1.101***<br>(0.013) | 1.158***<br>(0.034) |
| <b>Vehicle Driver Under Influence</b> | 1.308***<br>(0.015) | 1.527***<br>(0.083)   | 1.315***<br>(0.019) | 1.360***<br>(0.004)   | 1.181***<br>(0.014) | 1.158***<br>(0.023) | 1.171***<br>(0.013) | 1.146***<br>(0.037) |
| <b>Vehicle Driver Unsafe Speeds</b>   | 0.999<br>(0.036)    | 0.946<br>(0.124)      | 1.088*<br>(0.038)   | 1.277***<br>(0.004)   | 0.948**<br>(0.020)  | 0.933*<br>(0.035)   | 1.073***<br>(0.017) | 1.018<br>(0.048)    |
| <b>Conditions Dark</b>                | 1.262***<br>(0.020) | 1.333**<br>(0.106)    | 1.246***<br>(0.024) | 1.277***<br>(0.004)   | 1.441***<br>(0.014) | 1.446***<br>(0.021) | 1.434***<br>(0.013) | 1.342***<br>(0.033) |
| <b>Bad Weather</b>                    | 0.970<br>(0.043)    | 1.007<br>(0.183)      | 1.053<br>(0.036)    | 1.146***<br>(0.004)   | 0.988<br>(0.020)    | 0.969<br>(0.033)    | 1.002<br>(0.018)    | 1.064<br>(0.048)    |
| <b>Major Arterial Road</b>            | 1.098*<br>(0.043)   | 1.302<br>(0.196)      | 1.113*<br>(0.050)   | 1.083***<br>(0.003)   | 1.213***<br>(0.021) | 1.253***<br>(0.034) | 1.199***<br>(0.020) | 1.138*<br>(0.053)   |
| <b>Posted Speed Limit</b>             | 1.054<br>(0.037)    | 1.031<br>(0.197)      | 1.137***<br>(0.039) | 1.081***<br>(0.003)   | 1.192***<br>(0.018) | 1.188***<br>(0.026) | 1.250***<br>(0.015) | 1.206***<br>(0.045) |
| <b>Bicycle Infrastructure</b>         | 0.965<br>(0.047)    | 1.009<br>(0.201)      | 1.055<br>(0.050)    | 1.013***<br>(0.003)   | -                   | -                   | -                   | -                   |
| <b>Bicycle Density</b>                | 0.852*<br>(0.078)   | 0.659<br>(0.459)      | 0.751**<br>(0.092)  | 1.318***<br>(0.003)   | -                   | -                   | -                   | -                   |
| <b>Neighborhood Percent Black</b>     | 1.144**<br>(0.041)  | 1.224<br>(0.709)      | 1.184**<br>(0.053)  | 0.880***<br>(0.003)   | 1.068**<br>(0.022)  | 1.112*<br>(0.045)   | 1.050*<br>(0.023)   | 1.046<br>(0.057)    |
| <b>Neighborhood Percent Asian</b>     | 1.174***<br>(0.048) | 0.868<br>(0.916)      | 1.039<br>(0.068)    | 1.063***<br>(0.003)   | 1.037<br>(0.025)    | 1.010<br>(0.047)    | 0.997<br>(0.026)    | 1.110<br>(0.069)    |
| <b>Neighborhood Percent Hispanic</b>  | 1.058<br>(0.052)    | 0.998<br>(0.941)      | 1.043<br>(0.086)    | 1.281***<br>(0.003)   | 1.096***<br>(0.026) | 1.181**<br>(0.052)  | 0.989<br>(0.032)    | 1.171*<br>(0.074)   |
| <b>Neighborhood SES</b>               | 0.789***<br>(0.066) | 0.943<br>(0.954)      | 0.764**<br>(0.085)  | 0.703***<br>(0.004)   | 0.772***<br>(0.033) | 0.901*<br>(0.052)   | 0.814***<br>(0.030) | 0.875<br>(0.079)    |
| <b>Compact Suburban Places</b>        | 1.085<br>(0.066)    | 0.935<br>(0.776)      | 1.184*<br>(0.067)   | 1.041***<br>(0.003)   | 1.121***<br>(0.028) | 1.151***<br>(0.038) | 1.149***<br>(0.025) | 1.169**<br>(0.058)  |
| <b>Suburban Places</b>                | 1.309***<br>(0.077) | 1.269<br>(0.858)      | 1.293***<br>(0.077) | 1.392***<br>(0.003)   | 1.278***<br>(0.033) | 1.278***<br>(0.046) | 1.308***<br>(0.028) | 1.368***<br>(0.067) |
| <b>Rural Places</b>                   | 1.165**<br>(0.055)  | 1.029<br>(0.422)      | 1.097*<br>(0.041)   | 0.954***<br>(0.004)   | 1.096***<br>(0.025) | 1.018<br>(0.028)    | 1.085***<br>(0.019) | 1.096*<br>(0.043)   |
| <b>Employment Centers</b>             | 1.076<br>(0.053)    | 1.120<br>(0.702)      | 1.138*<br>(0.051)   | 0.107***<br>(0.004)   | 1.010<br>(0.029)    | 0.979<br>(0.041)    | 1.000<br>(0.025)    | 0.995<br>(0.068)    |
| <b>Special Districts</b>              | 1.044<br>(0.049)    | 0.889<br>(0.851)      | 0.997<br>(0.059)    | 0.818***<br>(0.004)   | 1.057**<br>(0.021)  | 1.038<br>(0.034)    | 1.062**<br>(0.019)  | 1.079<br>(0.056)    |
| <b>Walkability Score</b>              | 0.749***<br>(0.059) | 0.806<br>(0.769)      | 0.825**<br>(0.064)  | 0.642***<br>(0.003)   | 0.816***<br>(0.029) | 0.814***<br>(0.042) | 0.870***<br>(0.025) | 0.852*<br>(0.066)   |
| <b>Constant</b>                       | 0.005***<br>(0.131) | 0.00002***<br>(0.784) | 0.003***<br>(0.160) | 0.00002***<br>(0.003) | 0.047***<br>(0.032) | 0.035***<br>(0.057) | 0.039***<br>(0.030) | 0.029***<br>(0.117) |
| <b>Observations</b>                   | 53,502              | 11,823                | 42,959              | 6,749                 | 46,165              | 20,780              | 58,976              | 9,170               |
| <b>Log Likelihood</b>                 | 3,456.486           | -485.809              | 2,629.996           | -324.991              | 10,648.220          | 4,038.550           | 11,950.020          | 1,842.347           |

Notes: \*p<0.050; \*\*p<0.010; \*\*\*p<0.001; Predictors Scaled

These findings suggest that while neighborhood affluence offers some protection against fatal collisions, the magnitude and consistency of that protection vary substantially by race and ethnicity. The benefit of higher-SES neighborhoods is most clearly observed among White individuals, somewhat attenuated among Hispanic individuals, and largely absent among Black and Asian individuals. This undermines any assumption that improvements in neighborhood SES uniformly translate into safety for all road users.

Beyond SES, other environmental and behavioral variables emerge as strong predictors of fatality. Collisions that occur on major arterials or in dark conditions are significantly more likely to result in death across all groups. The presence of an intoxicated driver, for instance, increases the odds of a fatal outcome by roughly 30 to 40 percent, depending on the group. These findings are consistent with existing literature that emphasizes the role of speed, visibility, and impaired driving in traffic fatalities.

Built environment indicators yield more mixed results. While the presence of formal bicycle infrastructure (such as painted bike lanes) does not significantly reduce the likelihood of fatality in most models, higher walkability scores, measured via the EPA's Smart Location Database, are associated with lower fatality risk. This suggests that holistic, pedestrian-oriented urban design may be more impactful than isolated infrastructure interventions in promoting safety.

To better understand how SES shapes risk across groups, we calculated predicted probabilities of fatality across the SES spectrum. For White pedestrians and cyclists, the probability of fatality declines sharply as SES increases. A White cyclist in a low-SES neighborhood has a substantially higher predicted probability of fatality than one in a high-SES neighborhood. For Hispanic individuals, this gradient is present but less steep. For Black cyclists, by contrast, the predicted probability of fatality remains virtually unchanged across SES levels, indicating that the safety dividend of neighborhood affluence is not being realized for this group. In practical terms, a Black cyclist in a high-SES neighborhood faces a fatality risk equal to or greater than that of a White cyclist in a low-SES neighborhood.

Taken together, these findings suggest that while neighborhood SES plays a role in shaping fatality risk, it is not sufficient on its own to address the disparities faced by people of color. The absence of a protective SES effect for Black and Asian individuals points to underlying structural and behavioral inequities, such as differential driver behavior, enforcement patterns, or access to infrastructure, that may persist even in affluent neighborhoods. The results also indicate that traffic safety interventions that focus solely on physical improvements or area-level upgrades may fall short of achieving equity unless they are explicitly designed to address these racialized dynamics. In sum, the analysis demonstrates that race and SES are not interchangeable proxies for traffic risk. Rather, they interact in complex ways that demand a more targeted and nuanced policy response. The next section elaborates on these implications and explores strategies for building more equitable and effective approaches to pedestrian and cyclist safety.

## Discussion

This study set out to examine whether disparities in fatal pedestrian and bicyclist collisions by race and ethnicity persist even after controlling for neighborhood-level socio-economic status (SES) and built environment characteristics. It responds to the urgent need to understand the growing crisis of non-motorist traffic fatalities in the United States, especially among historically marginalized communities. Drawing on over a decade of statewide collision data in California and combining it with socio-demographic and environmental indicators, the findings provide strong evidence that race and place interact in complex ways to shape fatality risk, and that socio-economic advantage does not provide the same level of protection for all groups.

The results clearly show that higher neighborhood SES is associated with a reduced likelihood of fatality for pedestrians and cyclists. However, this protective effect is not evenly distributed. White and, to a lesser degree, Hispanic individuals benefit from safer outcomes in high-SES neighborhoods. In contrast, Black cyclists see no statistically significant reduction in fatality risk with increasing SES, and Black pedestrians experience only a modest and marginally significant benefit. Asian pedestrians, similarly, do not show a clear SES-related decline in fatality risk. These patterns persist even after accounting for built environment quality, road characteristics, and collision-specific variables such as driver intoxication, time of day, and weather conditions.

These findings reinforce the central thesis of the study: that structural disparities in traffic safety outcomes are not fully explained by socio-economic conditions. Even in affluent neighborhoods, where infrastructure is likely better and resources more abundant, people of color, particularly Black cyclists, remain disproportionately vulnerable. This suggests that additional, less visible forces are at play. Racialized driver behavior, differential law enforcement practices, and unequal access to or utilization of safety infrastructure may all contribute to a system in which neighborhood affluence alone is insufficient to guarantee safety for non-White pedestrians and cyclists.

These results expand upon prior research that documents elevated collision risks in low-income and majority-minority neighborhoods by showing that the benefits of affluence are conditional. Whereas previous studies have focused on the absence of infrastructure in disinvested communities, this analysis suggests that even where resources are present, their effectiveness may be muted by broader social and institutional dynamics. For example, studies have shown that drivers are less likely to yield to Black pedestrians, especially in affluent areas, and that cycling infrastructure in gentrifying neighborhoods can carry cultural and political meanings that limit its adoption by long-standing residents. These contextual factors likely contribute to the observed disparities in safety outcomes, even within high-SES areas.

By integrating neighborhood typologies, walkability metrics, and multi-level modeling strategies, this research builds on existing literature in a meaningful way. It confirms that environmental conditions matter greatly for pedestrian and cyclist safety, but it also shows that their effects are

mediated by race and place. These results point toward the limits of universal safety interventions and highlight the need for strategies that explicitly address equity and structural inequality.

In the context of a national rise in pedestrian and cyclist fatalities, these findings carry important implications. Simply improving infrastructure or raising neighborhood SES is not enough. Public safety campaigns, enforcement efforts, and planning initiatives must be tailored to confront the systemic forces that make roadways more dangerous for people of color. This includes challenging racialized assumptions in traffic enforcement, rethinking the spatial targeting of safety improvements, and amplifying the voices of communities who have historically been excluded from planning processes.

Ultimately, this research underscores that transportation safety is inseparable from broader patterns of racial and spatial inequality. If the goal is to reduce fatalities and promote safe mobility for all, policy must move beyond general solutions and confront the ways in which race and privilege structure the lived experience of the street. Only through this equity-oriented approach can we begin to reverse the troubling trends in pedestrian and cyclist deaths and ensure that public investments in safety truly benefit all communities.

## Conclusions and Recommendations

The most important conclusion drawn from this study is that neighborhood socio-economic status (SES) does not uniformly protect pedestrians and bicyclists from fatal traffic collisions. While higher-SES environments are generally associated with lower fatality risk, this benefit is not equitably distributed across racial and ethnic groups. White and, to a lesser extent, Hispanic pedestrians and cyclists experience clear reductions in fatality risk as SES increases. In contrast, Black cyclists receive no measurable safety benefit from living in higher-SES neighborhoods, and both Black and Asian pedestrians experience only marginal improvements, if any. This disparity suggests that socio-economic uplift alone is insufficient to eliminate racial inequities in traffic safety outcomes.

Second, the study finds that standard environmental and behavioral risk factors, such as lighting, roadway classification, driver intoxication, and walkability, remain important predictors of fatality risk. However, these factors alone cannot fully explain the observed disparities across racial lines. The persistent vulnerability of people of color, even in ostensibly “safe” neighborhoods, points to deeper structural forces at work, including racialized driver behavior, inequities in infrastructure deployment and enforcement, and differences in how communities interact with and navigate their built environments.

Although this study relies on comprehensive statewide collision data and robust neighborhood-level indicators, it is constrained by the availability of individual-level exposure data (e.g., pedestrian or cyclist volumes disaggregated by race) and by the limitations of racial and ethnic categorization in administrative records. For example, Hispanic ethnicity is recorded independently of race, and multiracial individuals are aggregated into an “Other” category, potentially masking important within-group differences. These limitations mean that while the models provide strong evidence of disparity, the magnitude of those disparities may be under- or overestimated in certain contexts.

Based on these conclusions, several recommendations emerge. First, transportation safety initiatives must be restructured to explicitly address racial disparities, rather than assuming that universal improvements will yield equal outcomes. Agencies should prioritize equity-focused investments in pedestrian and bicycle infrastructure, particularly in areas with persistent risk that serve large populations of color. These improvements must go beyond the installation of infrastructure alone to include community-informed design, culturally competent safety campaigns, and enforcement strategies that do not exacerbate existing inequities. Second, future efforts should incorporate more granular and disaggregated data collection, especially around cyclist and pedestrian behavior, travel patterns, and enforcement encounters. Integrating these datasets into planning and safety evaluations will help transportation agencies better understand the root causes of persistent racial disparities and enable more effective interventions. Third, spatial risk assessments should be institutionalized as part of routine transportation planning. By identifying and continuously monitoring high-risk areas through spatiotemporal analysis, agencies

can direct resources where they are needed most and evaluate the impact of interventions over time. These techniques can and should be incorporated into standard risk-assessment tools, safety audits, and performance-based funding formulas. Finally, federal and state transportation departments should consider incorporating these findings into design standards, prioritization frameworks, and equity assessment tools. Just as cost-benefit analyses now guide project selection, equity-based safety assessments should become a formal requirement for evaluating the distributional impacts of infrastructure investments.

In conclusion, addressing rising pedestrian and cyclist fatalities demands more than better infrastructure; it requires a fundamental rethinking of how race, space, and safety intersect. Equity must become a foundational principle, not an afterthought, in traffic safety policy. Only then can the transportation system serve all users with the same promise of safety, regardless of race, class, or neighborhood.

## References

- Alexander, K., Entwisle, D., & Olson, L. (2014). Stratification by Race and Gender. In *The Long Shadow: Family Background, Disadvantaged Urban Youth, and the Transition to Adulthood* (pp. 157–172). Russell Sage Foundation.
- Amoadu, M., Ansah, E. W., & Sarfo, J. O. (2023). Psychosocial work factors, road traffic accidents and risky driving behaviours in low-and middle-income countries: A scoping review. *IATSS Research*, 47(2), 240–250. <https://doi.org/10.1016/j.iatssr.2023.03.005>
- Blumenberg, E., & Haas, P. J. (2002). *The Travel Behavior and Needs of the Poor: A Study of Welfare Recipients in Fresno County, California, MTI Report 01-23* (No. MTI Report 01-23; Mineta Transportation Institute Publications, p. 198). Mineta Transportation Institute.
- Braun, L. M., Rodriguez, D. A., & Gordon-Larsen, P. (2019). Social (in)equity in access to cycling infrastructure: Cross-sectional associations between bike lanes and area-level sociodemographic characteristics in 22 large U.S. cities. *Journal of Transport Geography*, 80, 102544. <https://doi.org/10.1016/j.jtrangeo.2019.102544>
- Cervero, R., Sandoval, O., & Landis, J. (2002). Transportation as a Stimulus of Welfare-to-Work: Private versus Public Mobility. *Journal of Planning Education and Research*, 22(1), 50–63. <https://doi.org/10.1177/0739456X0202200105>
- Chang, V. W., Hillier, A. E., & Mehta, N. K. (2009). Neighborhood racial isolation, disorder and obesity. *Social Forces*, 87, 2063–2092.
- Coughenour, C., Abelar, J., Pharr, J., Chien, L.-C., & Singh, A. (2020). Estimated car cost as a predictor of driver yielding behaviors for pedestrians. *Journal of Transport & Health*, 16, 100831. <https://doi.org/10.1016/j.jth.2020.100831>
- Cradock, A. L., Troped, P. J., Fields, B., Melly, S. J., Simms, S. V., Gimmler, F., & Fowler, M. (2009). Factors Associated with Federal Transportation Funding for Local Pedestrian and Bicycle Programming and Facilities. *Journal of Public Health Policy*, 30(S1), S38–S72. <https://doi.org/10.1057/jphp.2008.60>
- Do, D. P., Frank, R., & Iceland, J. (2017). Black-white metropolitan segregation and self-rated health: Investigating the role of neighborhood poverty. *Social Science & Medicine*, 187, 85–92. <https://doi.org/10.1016/j.socscimed.2017.06.010>

- Frost, A. R., Appleyard, B., Gibbons, J. R., & Ryan, S. (2018). Quantifying the Sustainability, Livability, and Equity Performance of Urban and Suburban Places in California. *Transportation Research Record: Journal of the Transportation Research Board*, 036119811879138. <https://doi.org/10.1177/0361198118791382>
- Gibbons, J. R., & Yang, T.-C. (2014). Self-Rated Health and Residential Segregation: How Does Race/Ethnicity Matter? *Journal of Urban Health*, 91(4), 648–660. <https://doi.org/10.1007/s11524-013-9863-2>
- Gilens, M., & Page, B. I. (2014). Testing Theories of American Politics: Elites, Interest Groups, and Average Citizens. *Perspectives on Politics*, 12(3), 564–581. <https://doi.org/10.1017/S1537592714001595>
- Giroto, E., Bortoletto, M. S. S., González, A. D., Mesas, A. E., Peixe, T. S., Guidoni, C. M., & De Andrade, S. M. (2019). Working conditions and sleepiness while driving among truck drivers. *Traffic Injury Prevention*, 20(5), 504–509. <https://doi.org/10.1080/15389588.2019.1609670>
- Glassbrenner, D., Herbert, G., Reish, L., Webb, C., & Lindsey, T. (2022). *Evaluating Disparities in Traffic Fatalities by Race, Ethnicity, and Income*. Department of Transportation National Highway Traffic Safety Administration.
- Goddard, T., Kahn, K. B., & Adkins, A. (2015). Racial bias in driver yielding behavior at crosswalks. *Transportation Research Part F: Traffic Psychology and Behaviour*, 33, 1–6. <https://doi.org/10.1016/j.trf.2015.06.002>
- Gómez-Ortiz, V., Cendales, B., Useche, S., & Bocarejo, J. P. (2018). Relationships of working conditions, health problems and vehicle accidents in bus rapid transit (BRT) drivers. *American Journal of Industrial Medicine*, 61(4), 336–343. <https://doi.org/10.1002/ajim.22821>
- Gordon, C. (2019). *Citizen Brown: Race, Democracy, and Inequality in the St. Louis Suburbs*. University Of Chicago Press. <https://press.uchicago.edu/ucp/books/book/chicago/C/bo41210659.html>
- Hamann, C., & Peek-Asa, C. (2013). On-road bicycle facilities and bicycle crashes in Iowa, 2007–2010. *Accident Analysis & Prevention*, 56, 103–109. <https://doi.org/10.1016/j.aap.2012.12.031>
- Husain, N. A., Mohamad, J., & Idris, M. A. (2019). Daily emotional demands on traffic crashes among taxi drivers: Fatigue and safety motivation as mediators. *IATSS Research*, 43(4), 268–276. <https://doi.org/10.1016/j.iatssr.2019.03.001>

- Koekemoer, K., Van Gesselleen, M., Van Niekerk, A., Govender, R., & Van As, A. B. (2017). Child pedestrian safety knowledge, behaviour and road injury in Cape Town, South Africa. *Accident Analysis & Prevention*, 99, 202–209. <https://doi.org/10.1016/j.aap.2016.11.020>
- Lee, J., Abdel-Aty, M., & Jiang, X. (2014). Development of zone system for macro-level traffic safety analysis. *Journal of Transport Geography*, 38, 13–21. <https://doi.org/10.1016/j.jtrangeo.2014.04.018>
- Lee, J., Li, X., Mao, S., & Fu, W. (2021). Investigation of Contributing Factors to Traffic Crashes and Violations: A Random Parameter Multinomial Logit Approach. *Journal of Advanced Transportation*, 2021, 1–11. <https://doi.org/10.1155/2021/2836657>
- Lowe, K. (2016). Environmental Justice and Pedestrianism: Sidewalk Continuity, Race, and Poverty in New Orleans, Louisiana. *Transportation Research Record*, 2598(1), 119–123. <https://doi.org/10.3141/2598-14>
- Lubitow, A., Zinschlag, B., & Rochester, N. (2016). Plans for pavement or for people? The politics of bike lanes on the ‘Paseo Boricua’ in Chicago, Illinois. *Urban Studies*, 53(12), 2637–2653. <https://doi.org/10.1177/0042098015592823>
- Mansfield, T. J., Peck, D., Morgan, D., McCann, B., & Teicher, P. (2018). The effects of roadway and built environment characteristics on pedestrian fatality risk: A national assessment at the neighborhood scale. *Accident Analysis & Prevention*, 121, 166–176. <https://doi.org/10.1016/j.aap.2018.06.018>
- Minikel, E. (2012). Cyclist safety on bicycle boulevards and parallel arterial routes in Berkeley, California. *Accident Analysis & Prevention*, 45, 241–247. <https://doi.org/10.1016/j.aap.2011.07.009>
- Moody, H. A., Darden, J. T., & Pigozzi, B. Wm. (2016). The Relationship of Neighborhood Socioeconomic Differences and Racial Residential Segregation to Childhood Blood Lead Levels in Metropolitan Detroit. *Journal of Urban Health*, 93(5), 820–839. <https://doi.org/10.1007/s11524-016-0071-8>
- National Highway Traffic Safety Administration. (2023a). *Traffic safety facts: 2021 data- Bicyclists and other cyclists*. <https://crashstats.nhtsa.dot.gov/Api/Public/ViewPublication/813484>
- National Highway Traffic Safety Administration. (2023b). *Traffic safety facts: 2021 data- Pedestrians*. <https://crashstats.nhtsa.dot.gov/Api/Public/ViewPublication/813484>

- Noland, R. B., Klein, N. J., & Tulach, N. K. (2013). Do lower income areas have more pedestrian casualties? *Accident Analysis & Prevention*, 59, 337–345. <https://doi.org/10.1016/j.aap.2013.06.009>
- P.L. Jacobsen & H. Rutter. (2012). Cycling safety. In J. Pucher & R. Buehler (Eds.), *City cycling* (pp. 141–156). The MIT Press.
- Rajaei, M., Echeverri, B., Zuchowicz, Z., Wiltfang, K., & Lucarelli, J. F. (2021). Socioeconomic and racial disparities of sidewalk quality in a traditional rust belt city. *SSM - Population Health*, 16, 100975. <https://doi.org/10.1016/j.ssmph.2021.100975>
- Roll, J. (2021). Pedestrian Injury and Social Equity in Oregon. *Oregon Department of Transportation*.
- Sanders, R. L., & Schneider, R. J. (2022). An exploration of pedestrian fatalities by race in the United States. *Transportation Research Part D: Transport and Environment*, 107, 103298. <https://doi.org/10.1016/j.trd.2022.103298>
- Schneider, R. J. (2020). United States Pedestrian Fatality Trends, 1977 to 2016. *Transportation Research Record: Journal of the Transportation Research Board*, 2674(9), 1069–1083. <https://doi.org/10.1177/0361198120933636>
- Schneider, R. J., Sanders, R., Proulx, F., & Moayyed, H. (2021). United States fatal pedestrian crash hot spot locations and characteristics. *Journal of Transport and Land Use*, 14(1), Article 1. <https://doi.org/10.5198/jtlu.2021.1825>
- Self, R. O. (2003). *American Babylon: Race and the Struggle for Postwar Oakland* (STU-Student edition). Princeton University Press; JSTOR. <https://doi.org/10.2307/j.ctt5hhq2x.1>
- Sharkey, P. (2013). Neighborhoods and the Transmission of Racial Inequality. In *Stuck in Place* (pp. 91–116).
- Stein, S. (2011). Bike Lanes and Gentrification. *Progressive Planning*, 188(Winter), 34–37.
- Stoker, P., Garfinkel-Castro, A., Khayesi, M., Otero, W., Mwangi, M. N., Peden, M., & Ewing, R. (2015). Pedestrian Safety and the Built Environment: A Review of the Risk Factors. *Journal of Planning Literature*, 30(4), 377–392. <https://doi.org/10.1177/0885412215595438>
- Sugrue, T. J. (1996). *The Origins of the Urban Crisis: Race and Inequality in Postwar Detroit*. Princeton University Press.

- Teschke, K., Harris, M. A., Reynolds, C. C. O., Winters, M., Babul, S., Chipman, M., Cusimano, M. D., Brubacher, J. R., Hunte, G., Friedman, S. M., Monro, M., Shen, H., Vernich, L., & Cripton, P. A. (2012). Route Infrastructure and the Risk of Injuries to Bicyclists: A Case-Crossover Study. *American Journal of Public Health*, 102(12), 2336–2343. <https://doi.org/10.2105/AJPH.2012.300762>
- Tigges, L. M., Browne, I., & Green, G. P. (1998). Social isolation of the urban poor. *The Sociological Quarterly*, 39(1), 53–77.
- Vandenbulcke, G., Thomas, I., & Int Panis, L. (2014). Predicting cycling accident risk in Brussels: A spatial case-control approach. *Accident Analysis & Prevention*, 62, 341–357. <https://doi.org/10.1016/j.aap.2013.07.001>
- Zhou, F., Alsaid, A., Blommer, M., Curry, R., Swaminathan, R., Kochhar, D., Talamonti, W., Tijerina, L., & Lei, B. (2020). Driver fatigue transition prediction in highly automated driving using physiological features. *Expert Systems with Applications*, 147, 113204. <https://doi.org/10.1016/j.eswa.2020.113204>