



INFRASTRUCTURE, SAFETY,  
AND ENVIRONMENT

*Racial Profiling:  
Not Always Black and White*

Greg Ridgeway

November 11, 2004

# *Racial Profiling Is a Growing Concern*

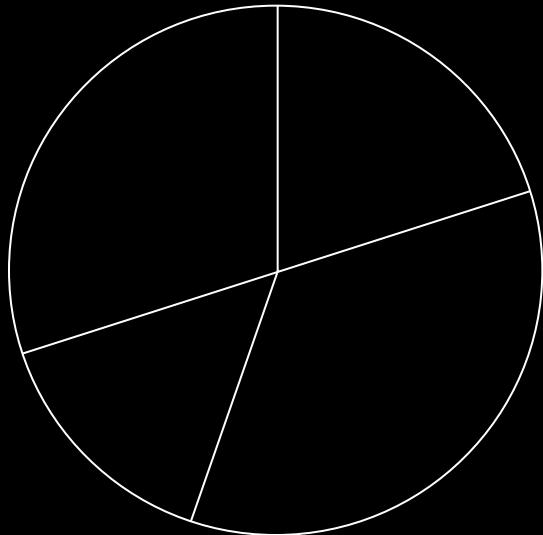
- I-95 “turnpike” studies in the mid-1990s raised public concern about racial profiling
  - Showed concrete evidence of racial profiling policies
- Public concern has led to state and local-level action
  - At least 14 states have passed legislation to deal with it
  - Many localities collect data voluntarily; some are compelled to do so by U.S. Justice Department
  - More than 400 police agencies now compile data on racial distribution of stopped motorists
- Congress is considering End of Racial Profiling Act
  - Mandates data collection to receive Federal funds

# *Unfortunately, the Quality of the Analysis Using Collected Data Is Weak*

- A growing number of studies claim racial profiling based on analysis of data collected
  - **Texas:** Concluded that “75% of agencies stop more black and Latino drivers than white drivers”
  - **Massachusetts:** Flagged 68% of agencies as having racial profiling issues
- And some studies hastily conclude no profiling occurs based on analyzed data
  - **Sacramento:** Found that the percentage of black drivers stopped matched the percentage of blacks among crime suspect descriptions

# *Why Is Testing for Racial Profiling So Hard?*

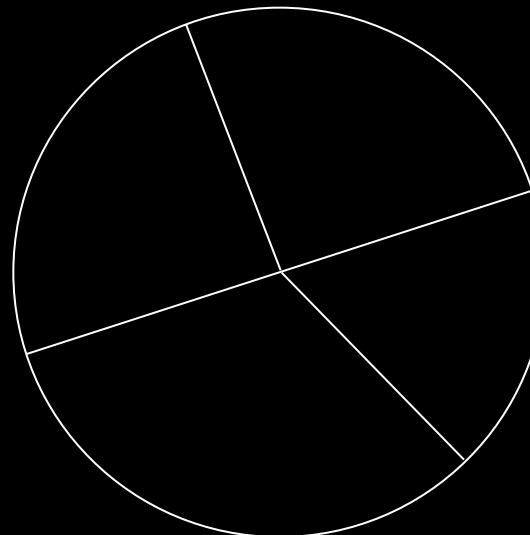
Racial Distribution of  
People Stopped



Difference  
Between

Racial Distribution of People at  
Risk of Being Stopped

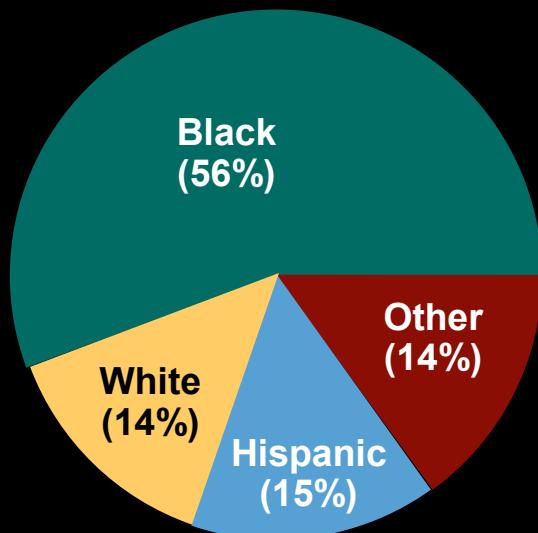
And



= Racial  
Profiling

# *Why Is Testing for Racial Profiling So Hard?*

Racial Distribution of People Stopped



Difference Between

Racial Distribution of People at Risk of Being Stopped

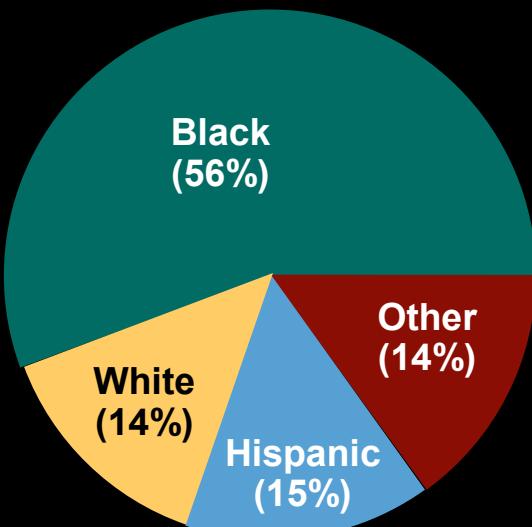
And

?

= Racial Profiling

# *Why Is Testing for Racial Profiling So Hard?*

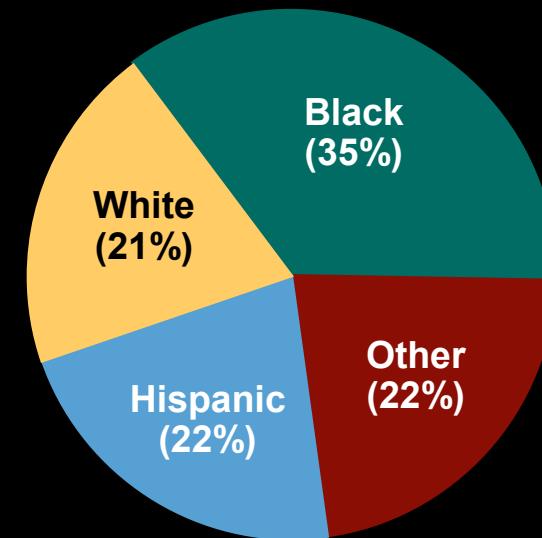
Racial Distribution of People Stopped



Difference Between

Racial Distribution of Residents According to the Census

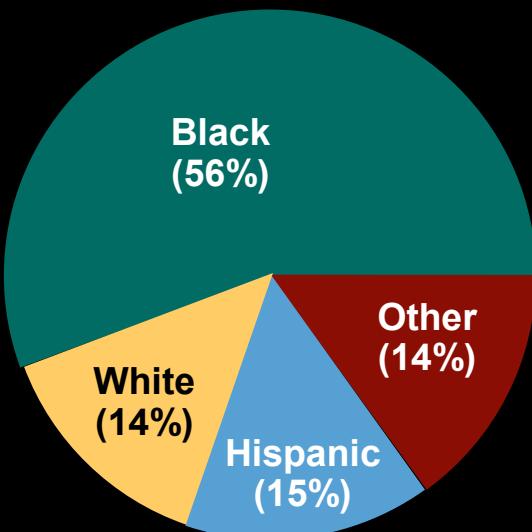
And



= ?

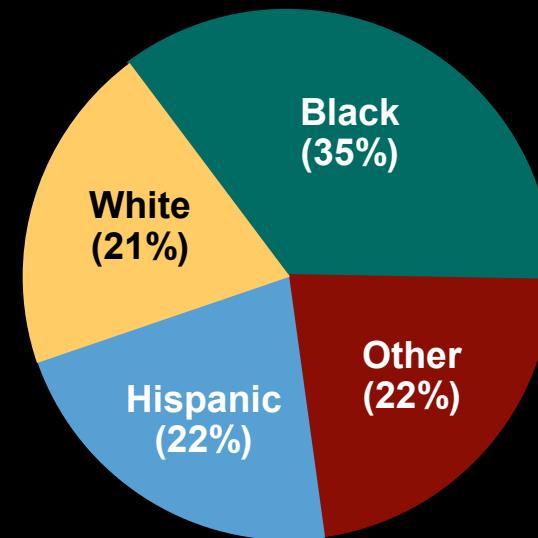
# *Why Is Testing for Racial Profiling So Hard?*

Racial Distribution of People Stopped



Difference Between

Racial Distribution of Residents According to the Census



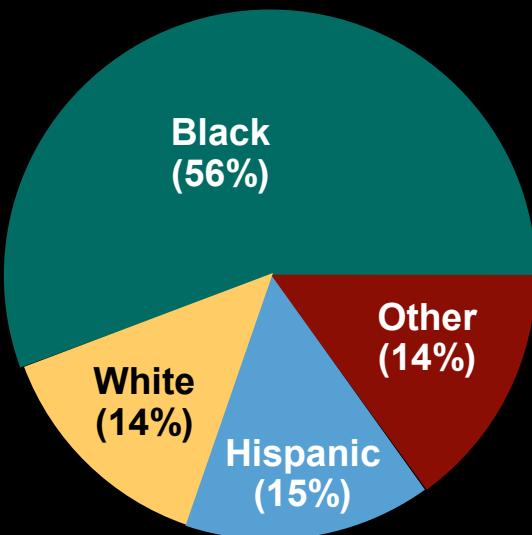
And

= ?

- The difference between the racial distributions may result from:
  - A race bias
  - Driving behavior: car ownership, time on the road, and care
  - Exposure to police

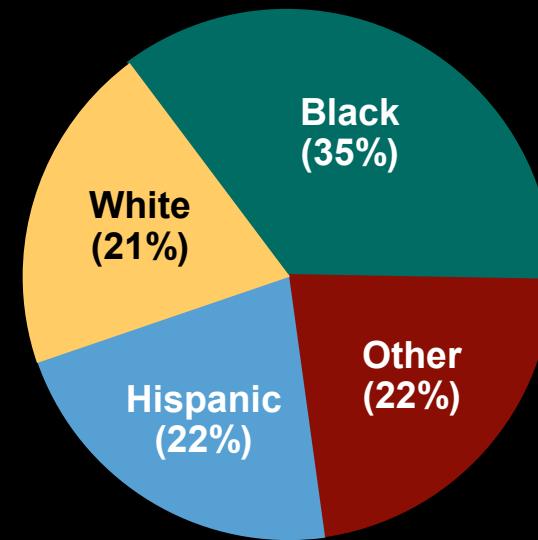
# *Why Is Testing for Racial Profiling So Hard?*

Racial Distribution of People Stopped



Difference Between

Racial Distribution of Residents According to the Census



And

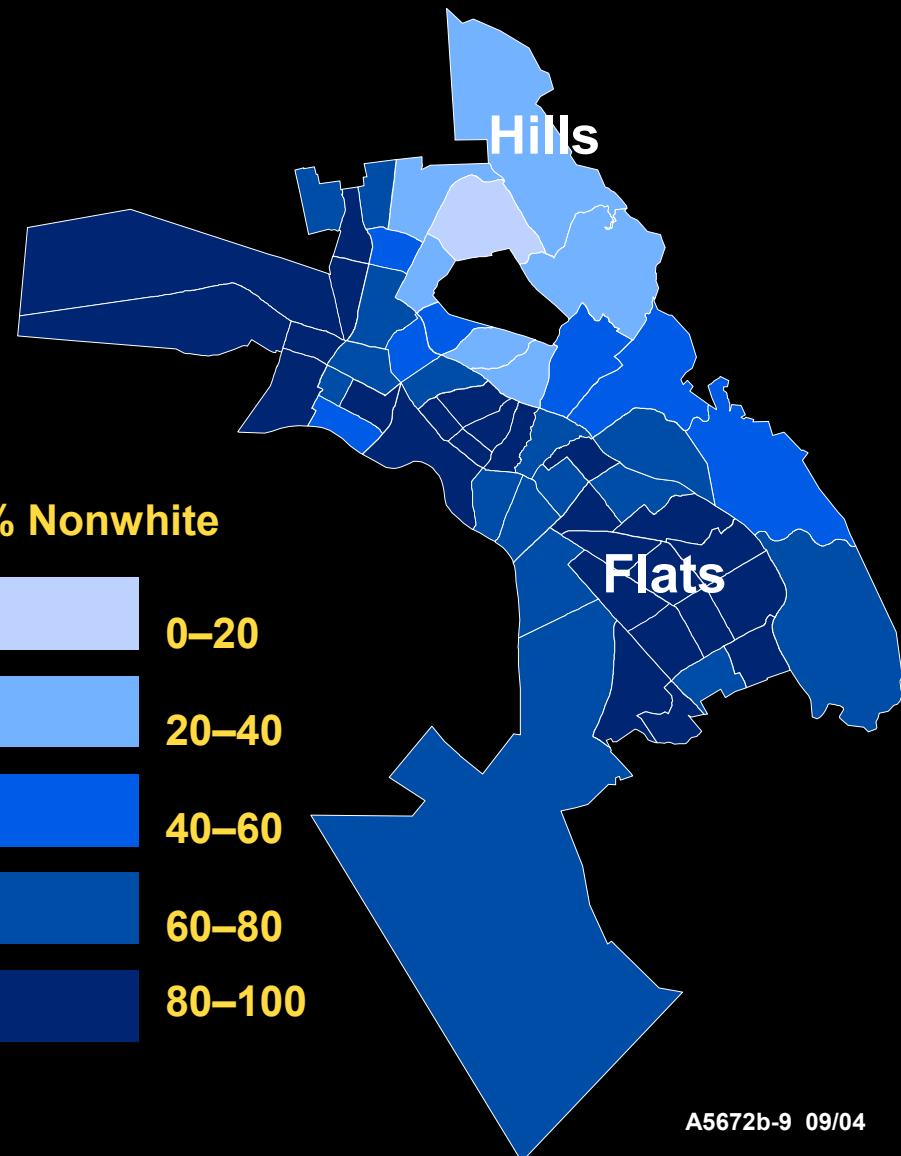
= ?

- The difference between the racial distributions may result from:
  - A race bias
  - Driving behavior: car ownership, time on the road, and care
  - Exposure to police

*Other approaches to dealing with issue are also problematic*

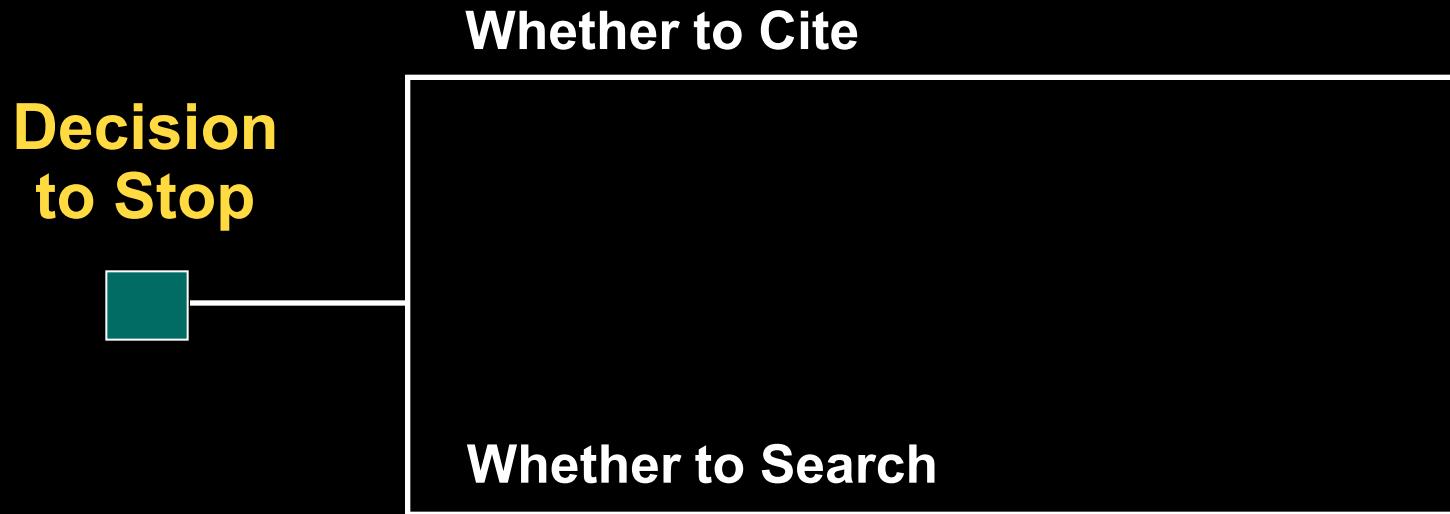
# RAND Focused on Applying New Approaches to Assessing Racial Profiling

- Assess whether there is racial profiling in the decision to stop
  - Using “veil of darkness” approach
- Assess whether there is racial profiling in post-stop activity
  - Using propensity score analysis approach
- Use data from Oakland Police Department
  - 7,607 recorded vehicle stops
  - Between 6/15/03 and 12/30/03



# *Is There Racial Profiling in Oakland?*

## **Post-Stop Activity**



# *Is There Racial Profiling in Oakland?*

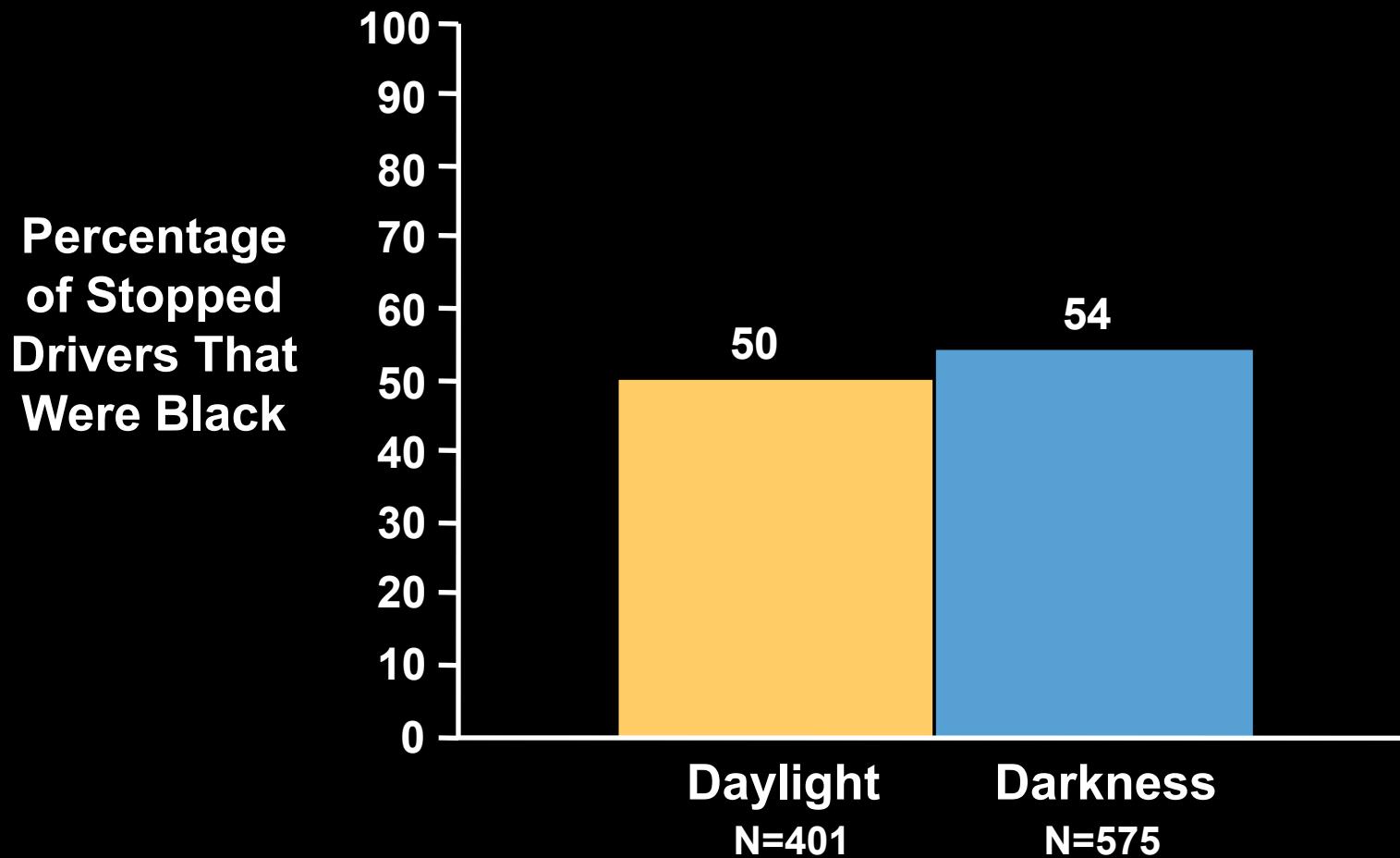
## **Post-Stop Activity**



# ***Veil of Darkness Approach Relies on Natural Lighting Experiment to Assess Racial Profiling***

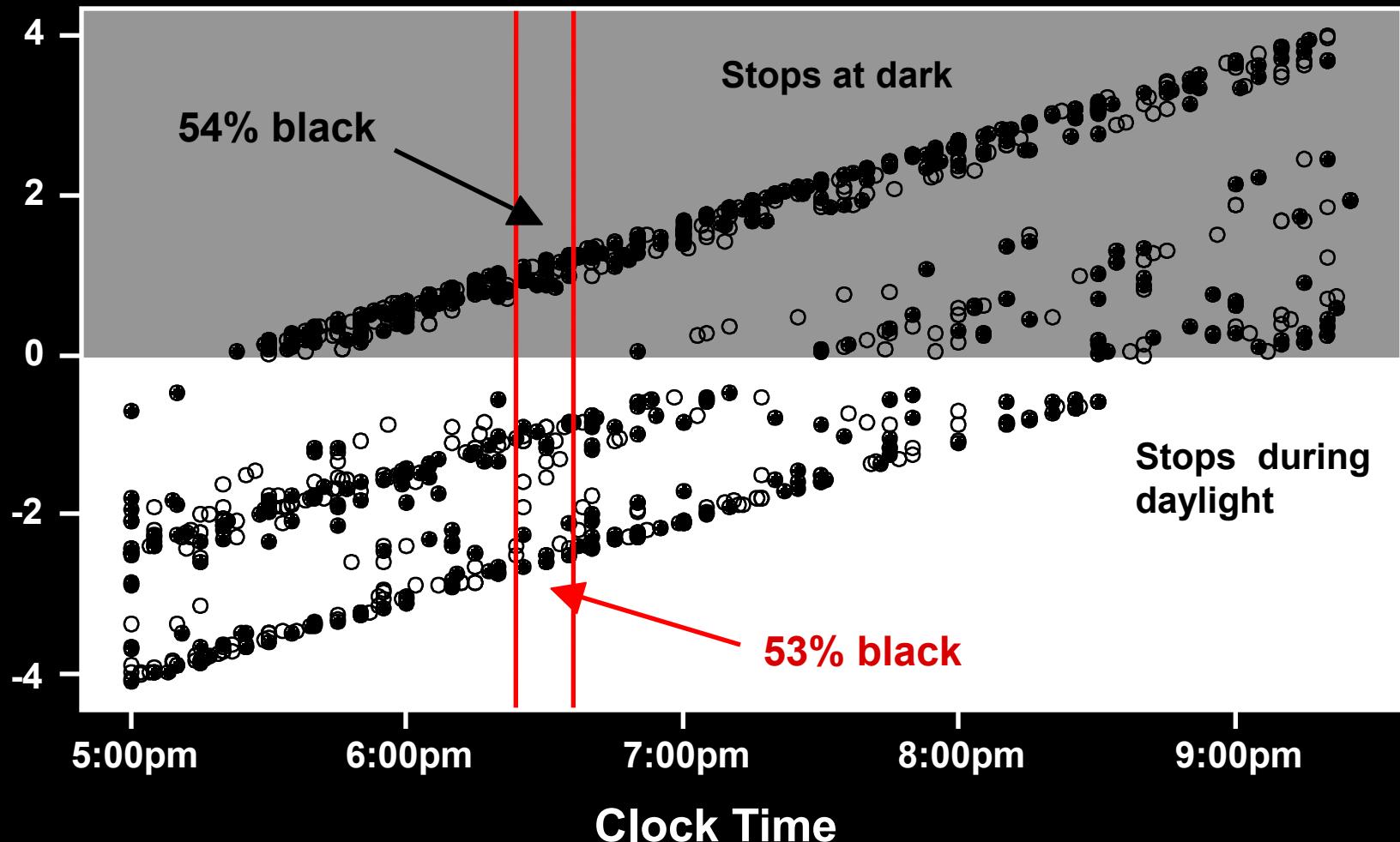
- Does an officer's ability to identify race of driver in advance influence which drivers he stops?
- The ability to identify race in advance of the stop decreases as it becomes dark
- We directly test whether the ability to identify the race affects the race distribution of the stopped drivers

# *Simple Veil of Darkness Test Shows No Evidence of Racial Bias in the Decision to Stop*



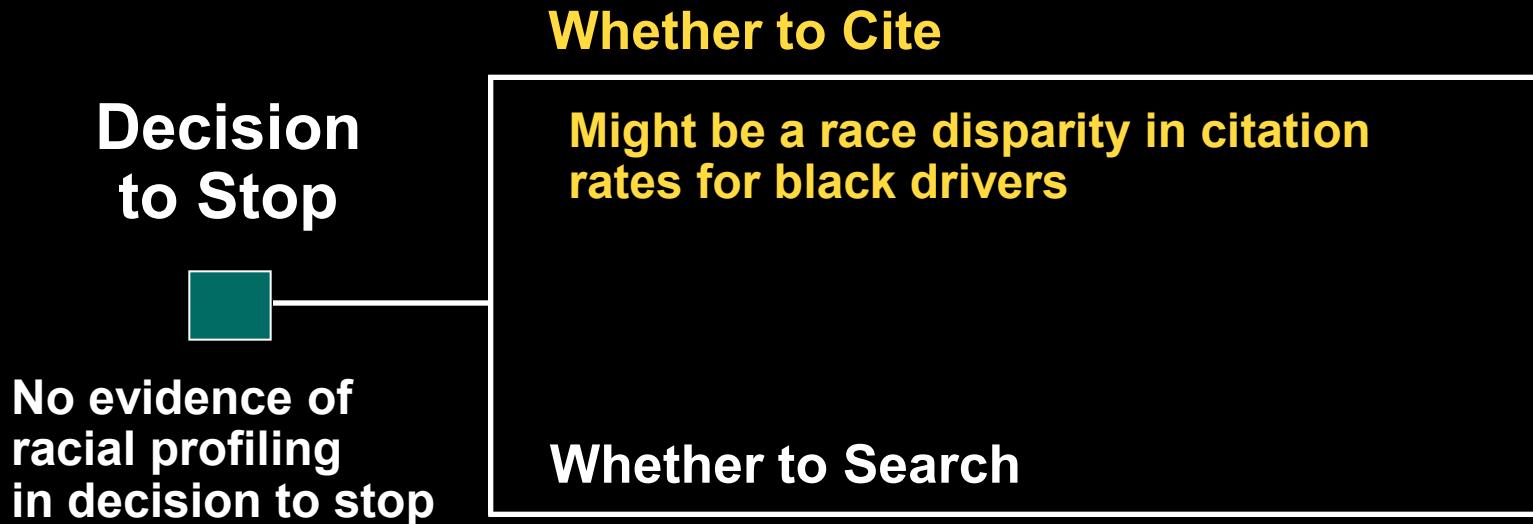
# *Adjusting for “Clock Time” Does Not Change the Finding*

Hours Since Darkness



# *Is There Racial Profiling in Oakland?*

## **Post-Stop Activity**



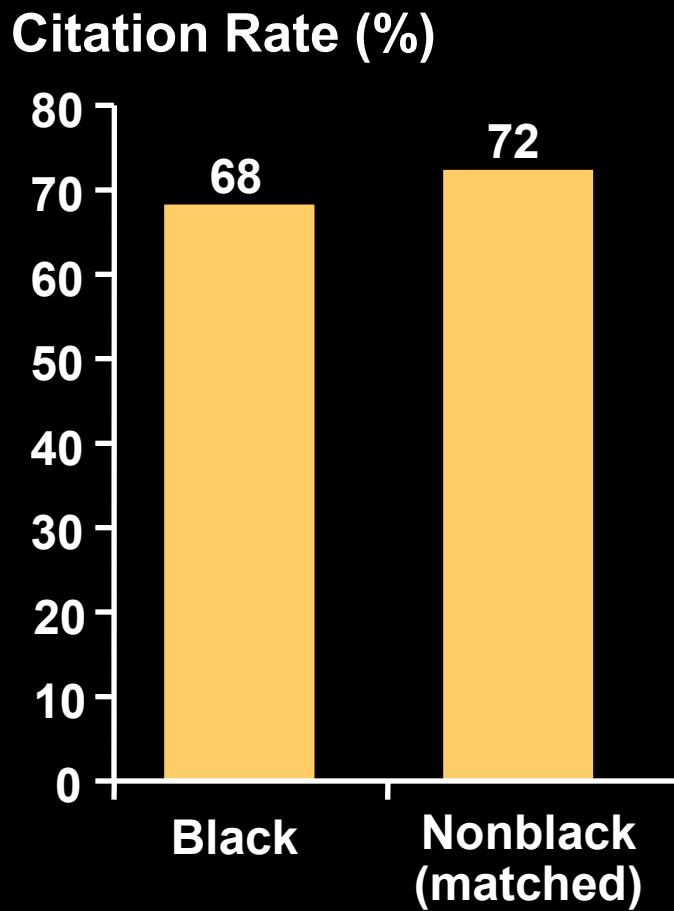
# *Propensity Score Analysis Created Comparison Group in Terms of Stop Features*

Stop Feature	% Black Drivers (N=3,703)	% Nonblack Drivers (unmatched) (N=3,033)
Region East	32%	14%
Time of Day 12AM-4AM	16%	7%
Resident	76%	64%
Age 18-29	47%	38%
Reason Mechanical/ Registration	26%	16%
Male	75%	74%

# *Propensity Score Analysis Created Comparison Group in Terms of Stop Features*

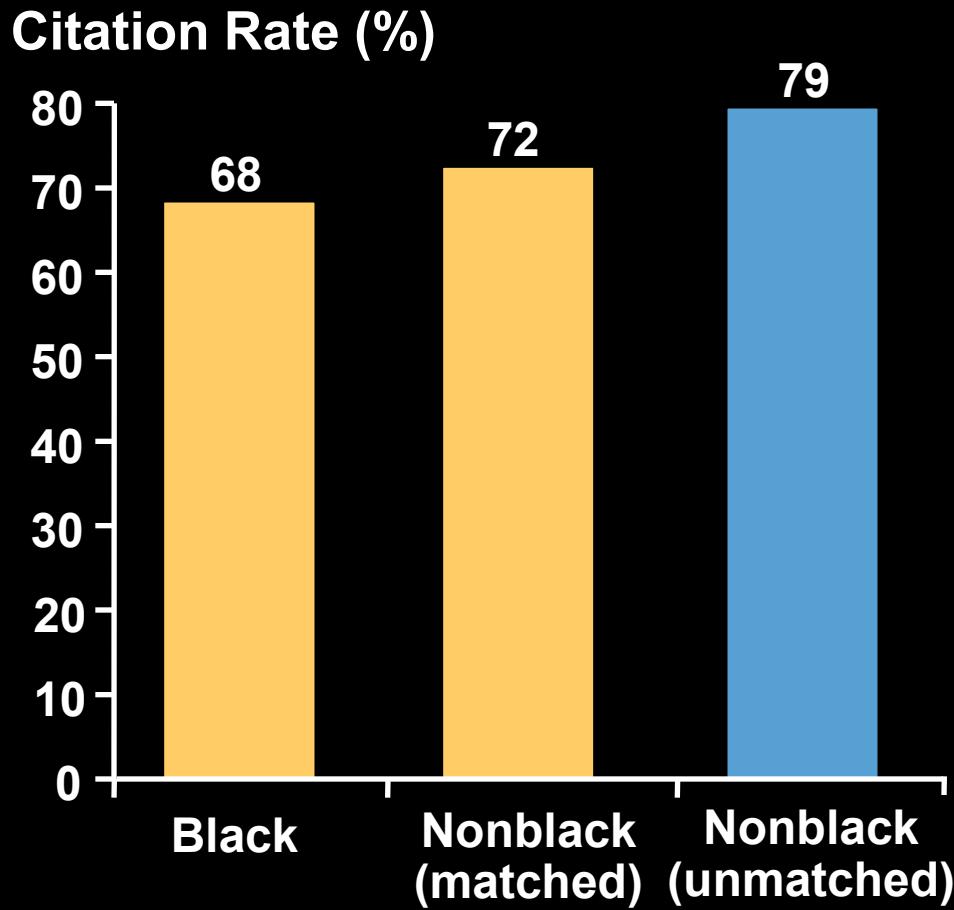
Stop Feature	% Black Drivers (N=3,703)	% Nonblack Drivers (matched) (N=2,809)	% Nonblack Drivers (unmatched) (N=3,033)
Region East	32%	30%	14%
Time of Day 12AM-4AM	16%	13%	7%
Resident	76%	72%	64%
Age 18-29	47%	45%	38%
Reason Mechanical/ Registration	26%	23%	16%
Male	75%	76%	74%

# *Analysis Shows That a Race Disparity in Citation Rates Might Exist*



- Citation rate for black drivers is 4% less than for comparable non-black drivers
- Finding potentially implies that either
  - Police are slightly more hesitant to cite black drivers
  - Some of stops involving black drivers were of a level of severity unlikely to result in citation

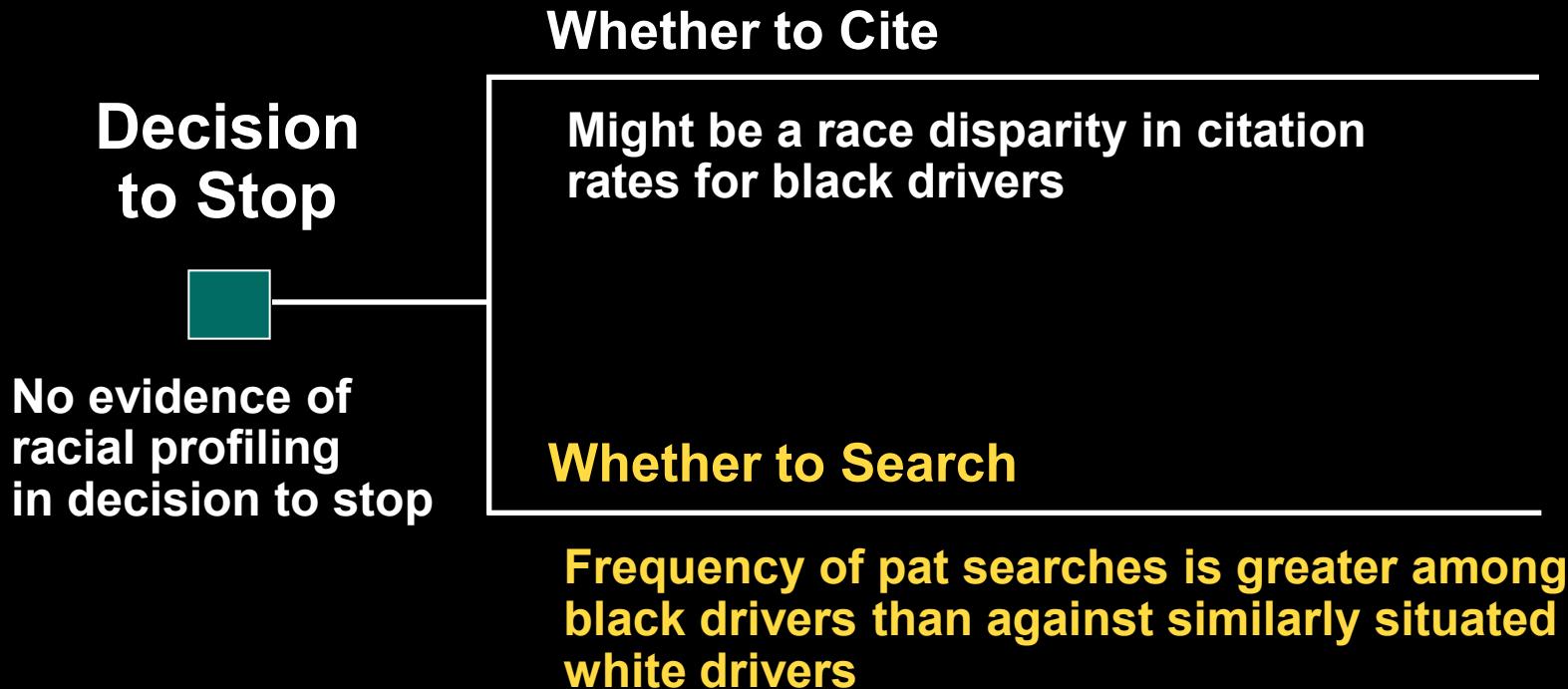
# *But the Analysis Also Shows the Danger of Making Naïve Comparisons*



- When we compare black vs. nonblack (unmatched), difference is 11%
- Had we not adjusted for factors such as time and location of stop, we would have concluded that black drivers are *much* less likely to be cited than nonblack ones

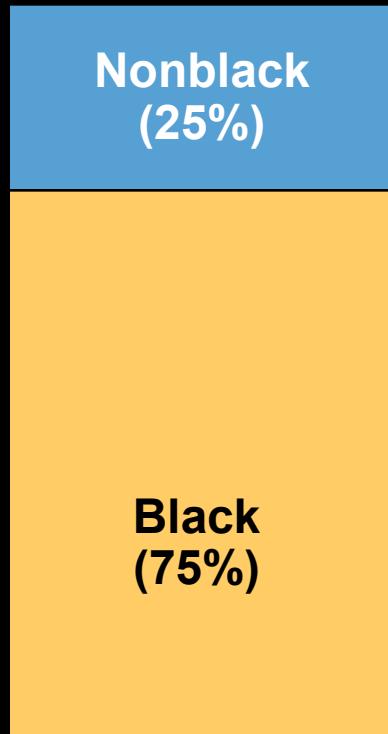
# *Is There Racial Profiling in Oakland?*

## **Post-Stop Activity**



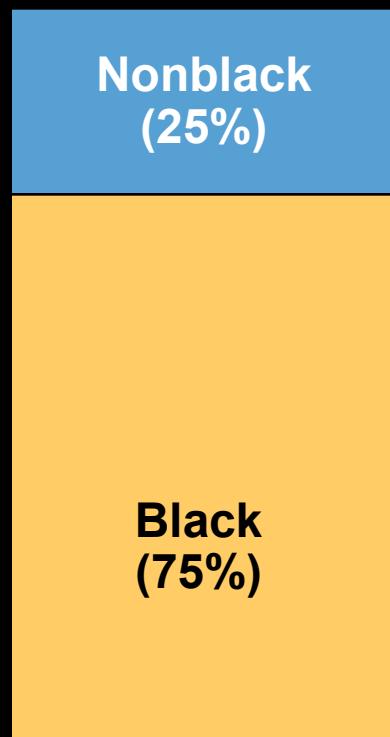
# *Black Drivers Bear the Burden of Searches*

## Searches by Race (%)

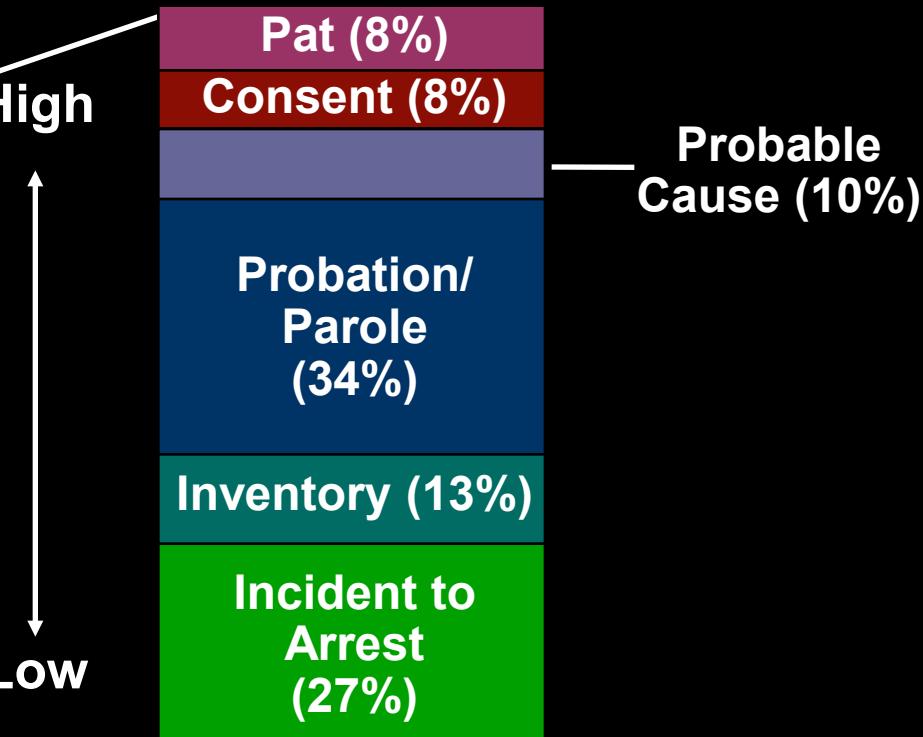


# *Black Drivers Bear the Burden of Searches but Most Searches Are Low-Discretion Ones*

Searches by Race (%)

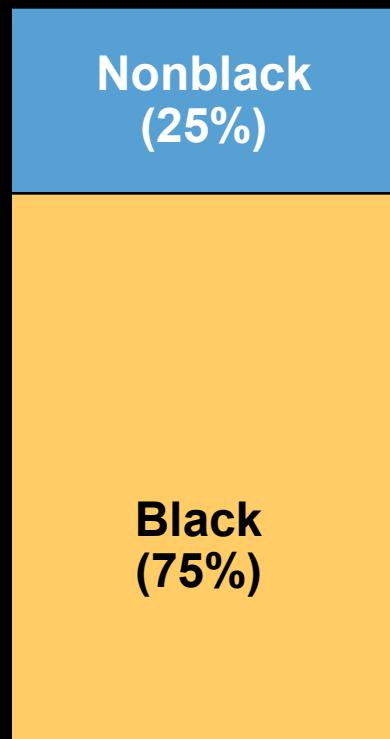


Reasons for Search (%)

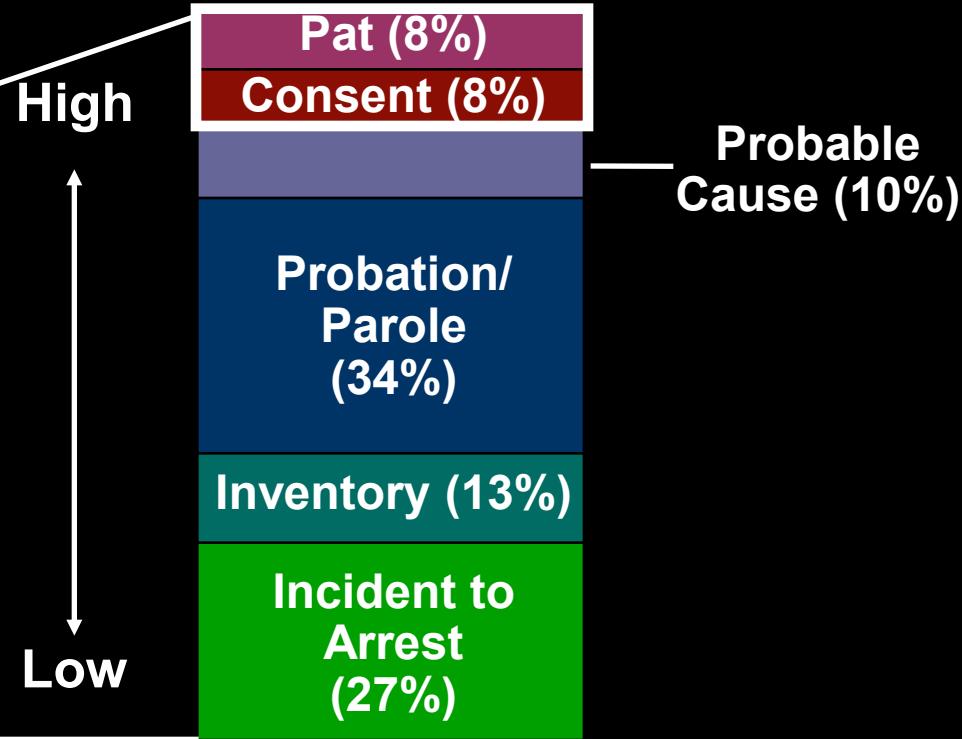


# *Black Drivers Bear the Burden of Searches but Most Searches Are Low-Discretion Ones*

Searches by Race (%)



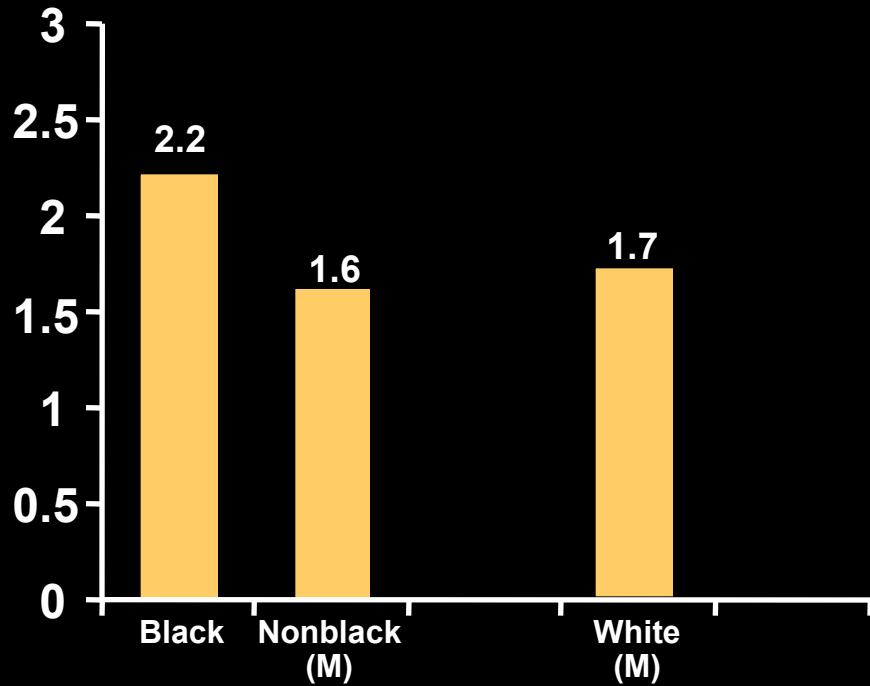
Reasons for Search (%)



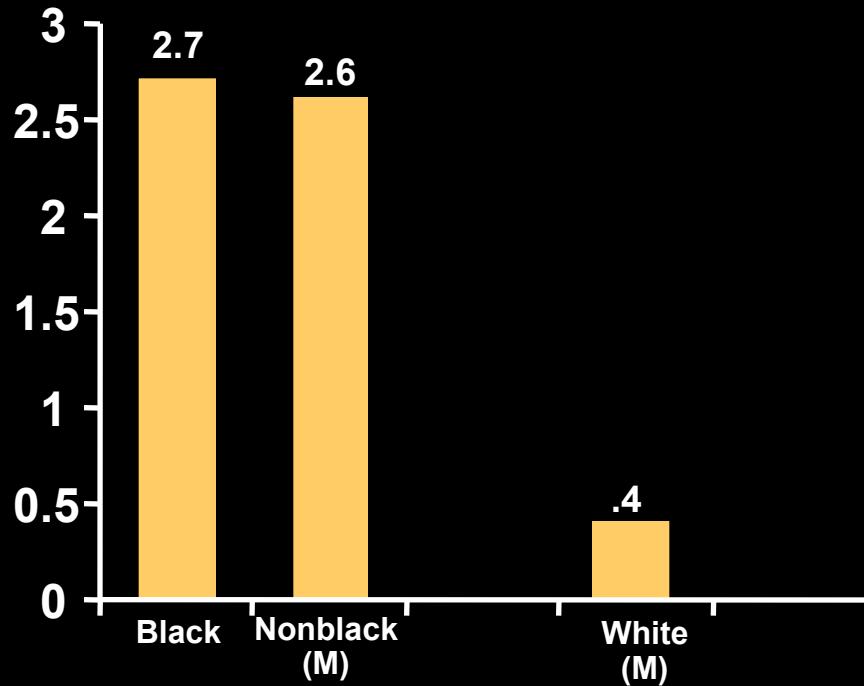
*We focus on pat and consent searches*

# *Consent Searches Have Similar Rates, but Pat Searches More Likely for Blacks Than Whites*

**Consent Searches (%)**

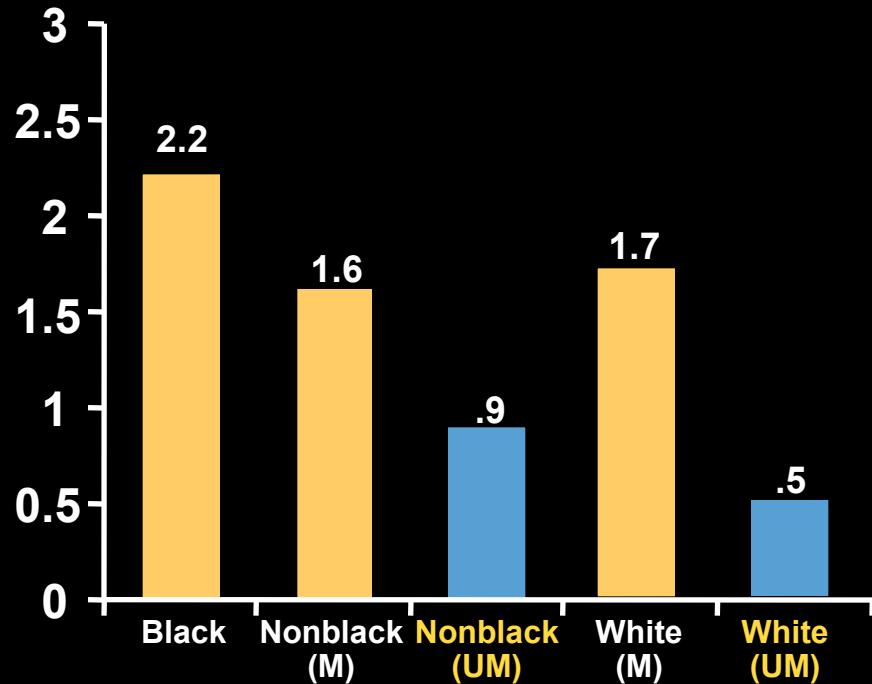


**Pat Searches (%)**

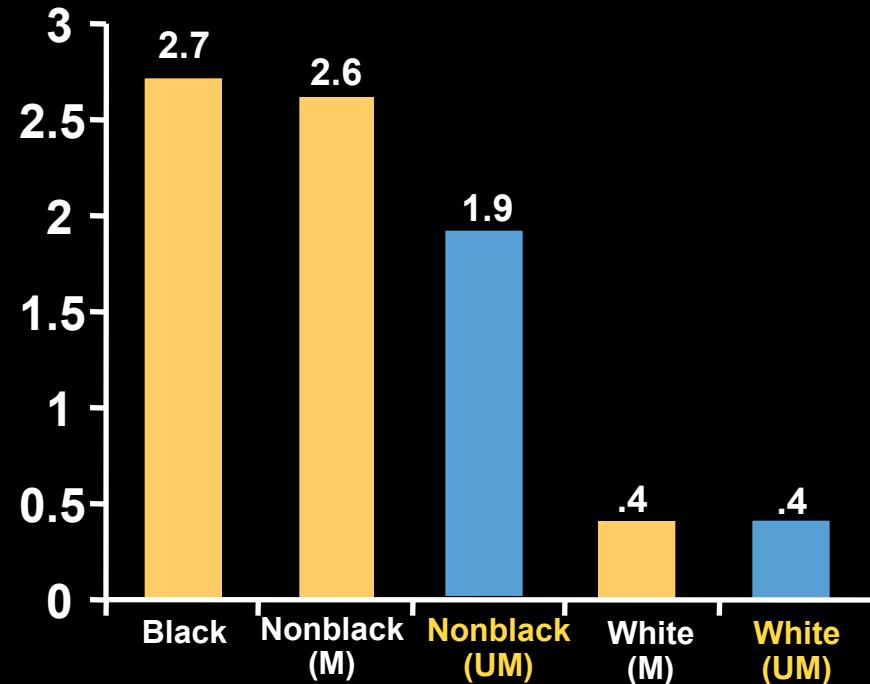


# *Once Again, Naïve Comparisons Can Distort the Findings*

**Consent Searches (%)**

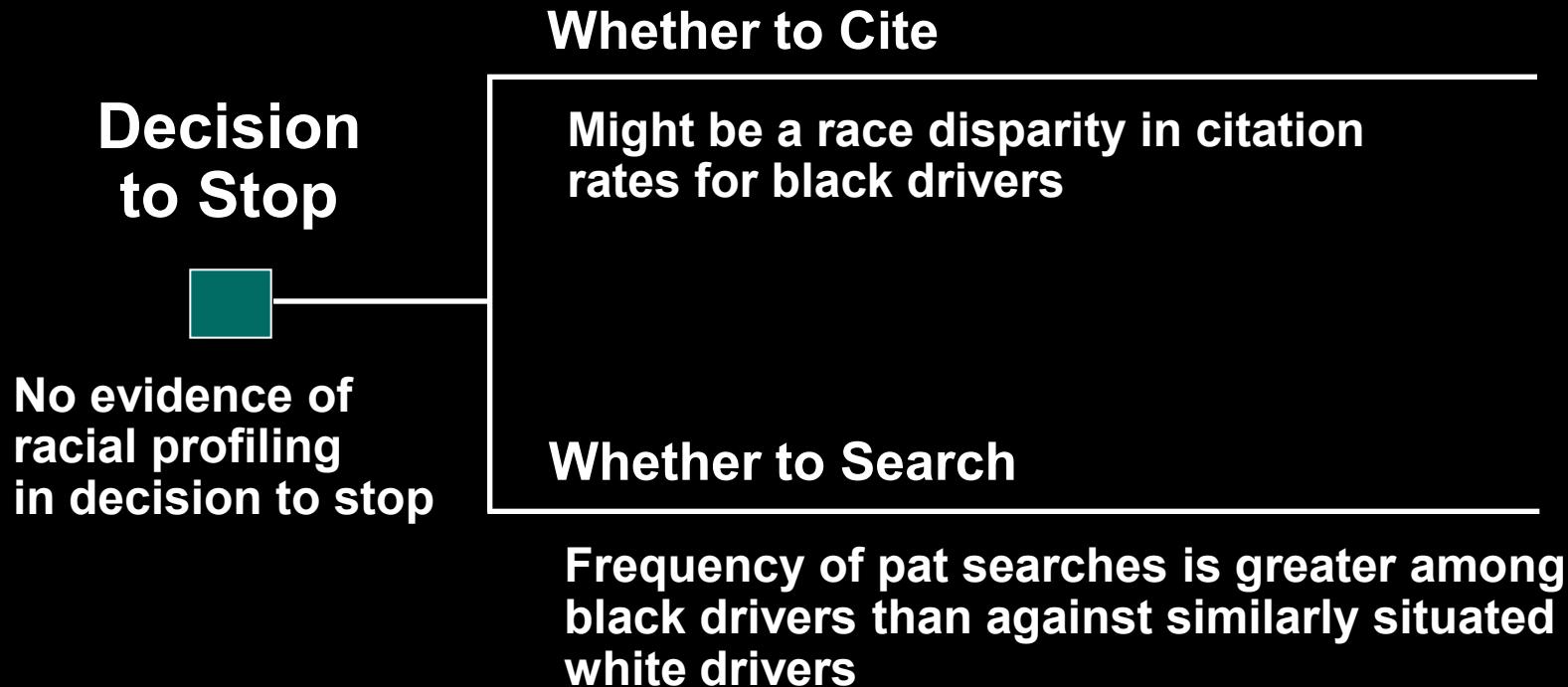


**Pat Searches (%)**



# *Summary: Is There Racial Profiling in Oakland?*

## Post-Stop Activity



## ***Broader Conclusions***

- It is possible to do more credible analyses of racial profiling
  - Objective analyzer using credible approach
- Naïve analysis methods can exaggerate (or even understate) the effect of racial bias
- Importance of credible analyses increases as data collection becomes mandated

## ***Broader Conclusions***

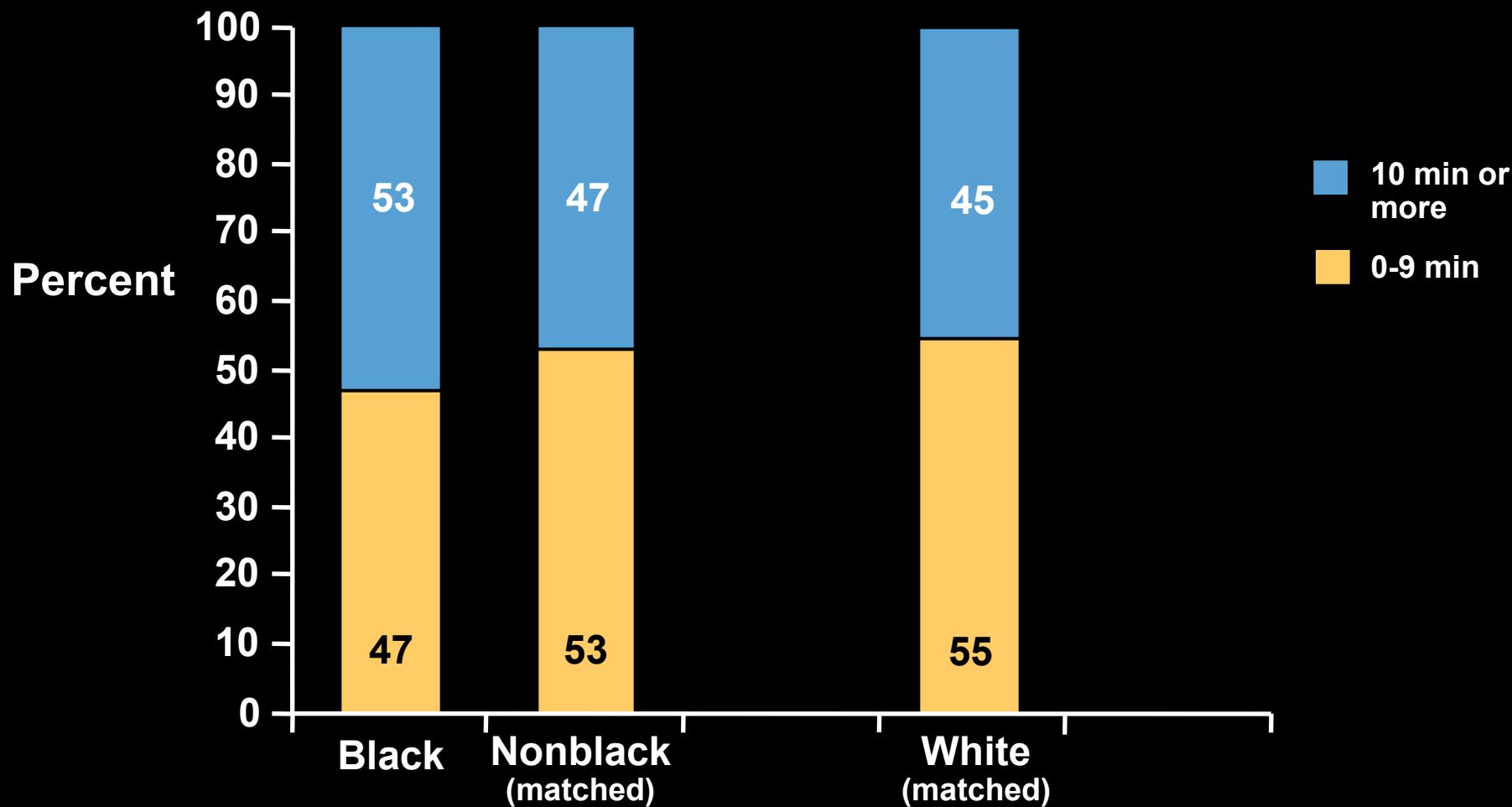
- It is possible to do more credible analyses of racial profiling
  - Objective analyzer using credible approach
- Naïve analysis methods can exaggerate (or even understate) the effect of racial bias
- Importance of credible analyses increases as data collection becomes mandated

*We will be testing approach with data from other cities*

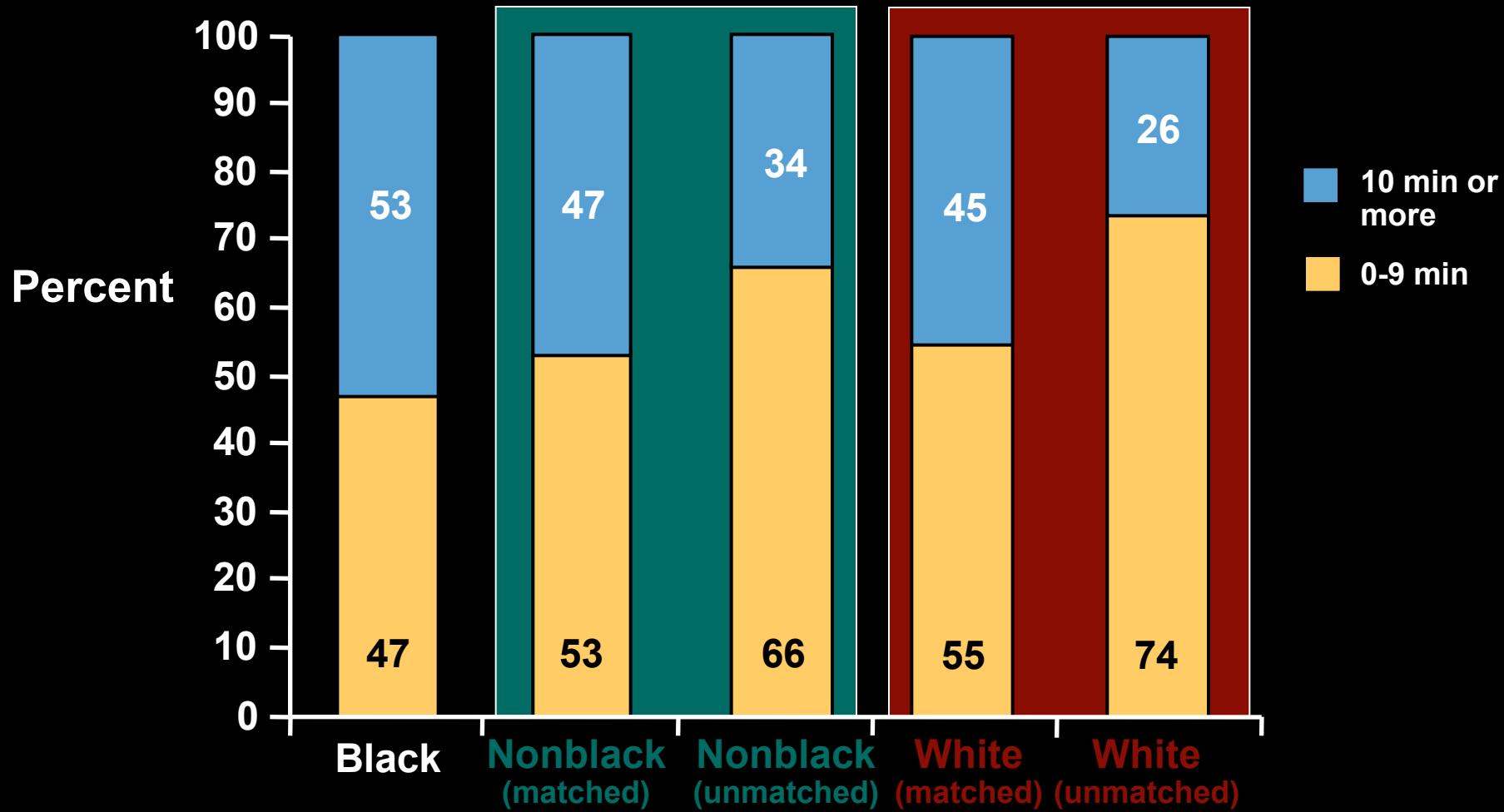


INFRASTRUCTURE, SAFETY,  
AND ENVIRONMENT

# *Black Drivers Seemed More Likely to Have Longer Stops Than Nonblack or White Drivers*



# *Naïve Comparisons Considerably Overstate the Problem*



# *Sensitivity Analysis Tests Show the Findings Are Robust*

Issue	Analysis Result
Could still be racial bias if many fewer black drivers were at risk of being stopped during the day	<ul style="list-style-type: none"><li>• But to change finding, difference in exposure would need to change by 10 percentage points</li><li>• Unlikely given control for clock time</li></ul>
Could still be racial bias if there were seasonal changes in racial distribution over June–December period	<ul style="list-style-type: none"><li>• But repeating analysis using only October and November data does not change the finding</li></ul>
Could still be racial bias because stops are under-reported in the data	<ul style="list-style-type: none"><li>• But approach is robust to some kinds of underreporting, even if reporting rates differ for black/nonblack drivers</li></ul>

# *Approaches to Dealing with “Benchmarking” Problem Are, in Turn, Problematic*

Approach	Problem
Using census data	
Using traffic surveys	
Using only outcomes of the stop	

# *Approaches to Dealing with “Benchmarking” Problem Are, in Turn, Problematic*

Approach	Problem
Using census data	<ul style="list-style-type: none"><li>• Doesn't account for:<ul style="list-style-type: none"><li>– Out-of-jurisdiction drivers</li><li>– Differences in travel patterns or driving behavior</li><li>– Race differences in exposure to police</li></ul></li></ul>
Using traffic surveys	
Using only outcomes of the stop	

# *Approaches to Dealing with “Benchmarking” Problem Are, in Turn, Problematic*

Approach	Problem
Using census data	<ul style="list-style-type: none"><li>• Doesn't account for:<ul style="list-style-type: none"><li>– Out-of-jurisdiction drivers</li><li>– Differences in travel patterns or driving behavior</li><li>– Race differences in exposure to police</li></ul></li></ul>
Using traffic surveys	<ul style="list-style-type: none"><li>• Are expensive</li><li>• Validity may fail in multi-ethnic environments</li><li>• Provide only limited measure of driver care</li></ul>
Using only outcomes of the stop	

# *Approaches to Dealing with “Benchmarking” Problem Are, in Turn, Problematic*

Approach	Problem
Using census data	<ul style="list-style-type: none"><li>• Doesn't account for:<ul style="list-style-type: none"><li>– Out-of-jurisdiction drivers</li><li>– Differences in travel patterns or driving behavior</li><li>– Race differences in exposure to police</li></ul></li></ul>
Using traffic surveys	<ul style="list-style-type: none"><li>• Are expensive</li><li>• Validity may fail in multi-ethnic environments</li><li>• Provide only limited measure of driver care</li></ul>
Using only outcomes of the stop	<ul style="list-style-type: none"><li>• Avoids the challenging problem of detecting bias in the decision to stop</li></ul>



INFRASTRUCTURE, SAFETY,  
AND ENVIRONMENT