# Environmental inequality in the neighborhood networks of urban mobility in U.S. cities

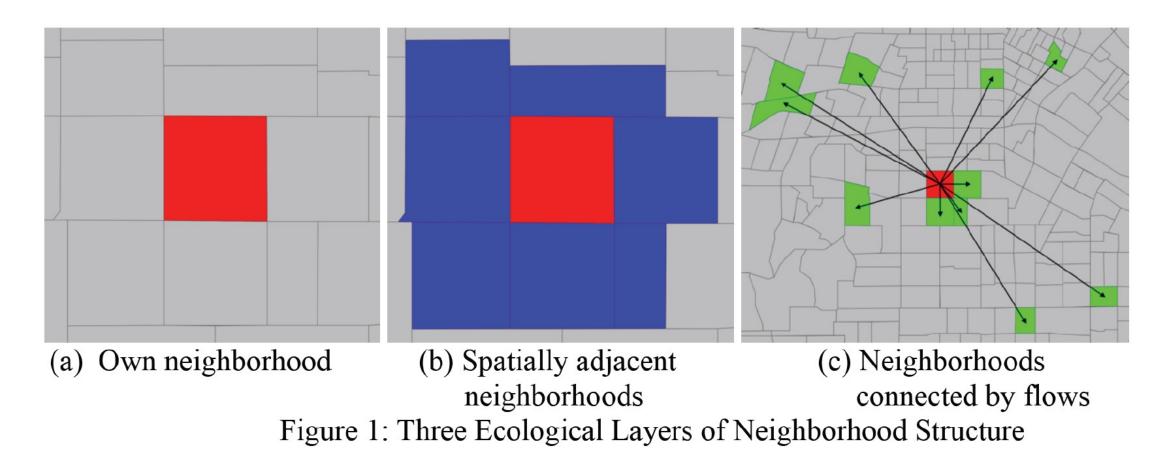
Los Angeles

Sacramento

### Noli Brazil University of California, Davis 2022 Population Association of America Annual Meeting

- Neighborhoods impact individual health and well-being
- Low-income and minority neighborhoods more disadvantaged
  - -Helps explain racial and social inequalities
- Neighborhood disadvantage is spatially clustered – Extra-local setting

- Neighborhoods impact individual health and well-being
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- Neighborhood disadvantage is spatially clustered —Extra-local setting
- Neighborhoods that residents visit during the day



- Activity Spaces
  - Obligations, tasks, and social engagements may draw people out of, and potentially far from, their residential context (Browning and Soller, 2014; Cagney et al., 2020)
- Social network
  - Diffusion occurring through social ties, which may occur between actors spatially distant from one another (Graif et al., 2014)
- Urban mobility
  - Urban mobility connects communities both near and far (Wang et al., 2018; Candipan et al., 2021)

# Research Question

What are the levels of exposure to air pollution levels for residents residing in Black, White, Hispanic, Asian, Poor and Non-poor neighborhoods?

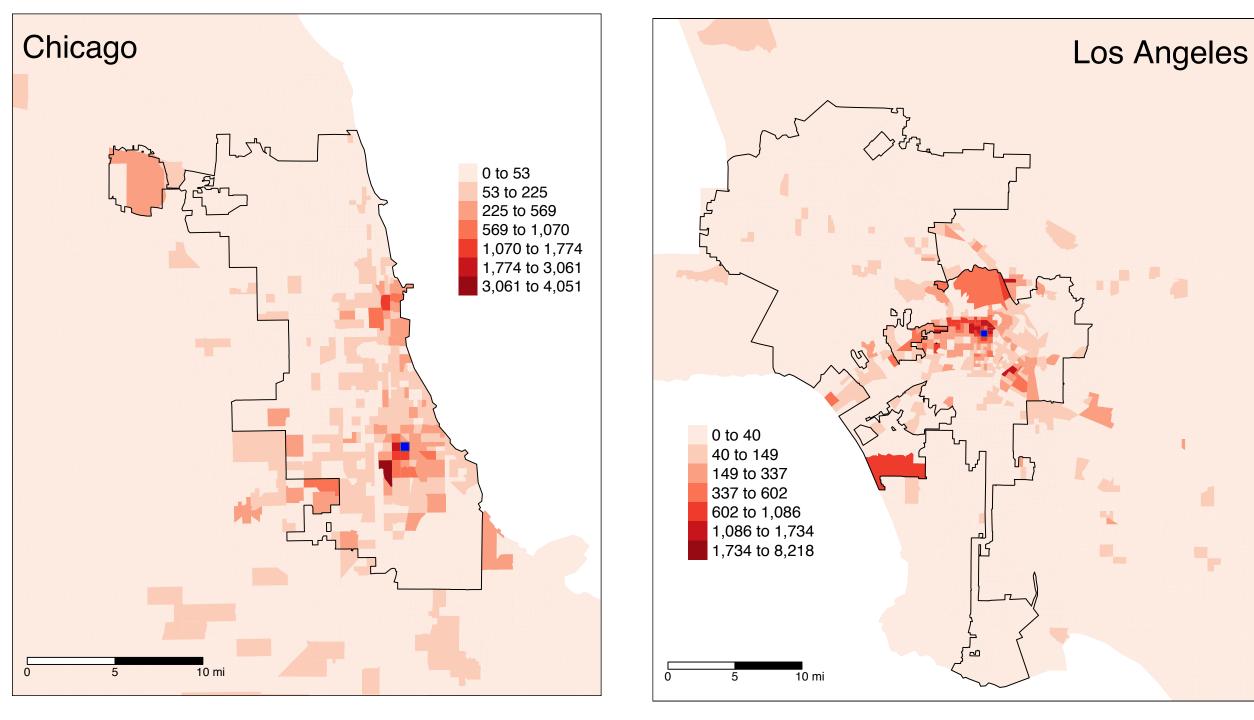
- Residential neighborhood
- Adjacent neighborhoods
- Neighborhoods they travel to for work, school, errands and leisure

# Research Design

- Anonymized cell phone location data for more than 40 million cell phones (Safegraph)
- Daily number of pings in a destination neighborhood and the home neighborhood location of the pings
  - Destination: Points of interests
  - Home: Cell phone detected most at night (18:00-7:00) over a sixweek period

# Research Design

- November 2018 to November 2019
- 88 of the most populous U.S. cities
- Travel patterns of residents from block groups in sample cities to block groups
  - Within city boundaries
  - Across all neighborhoods within the metropolitan area
- Aggregated up to tract level

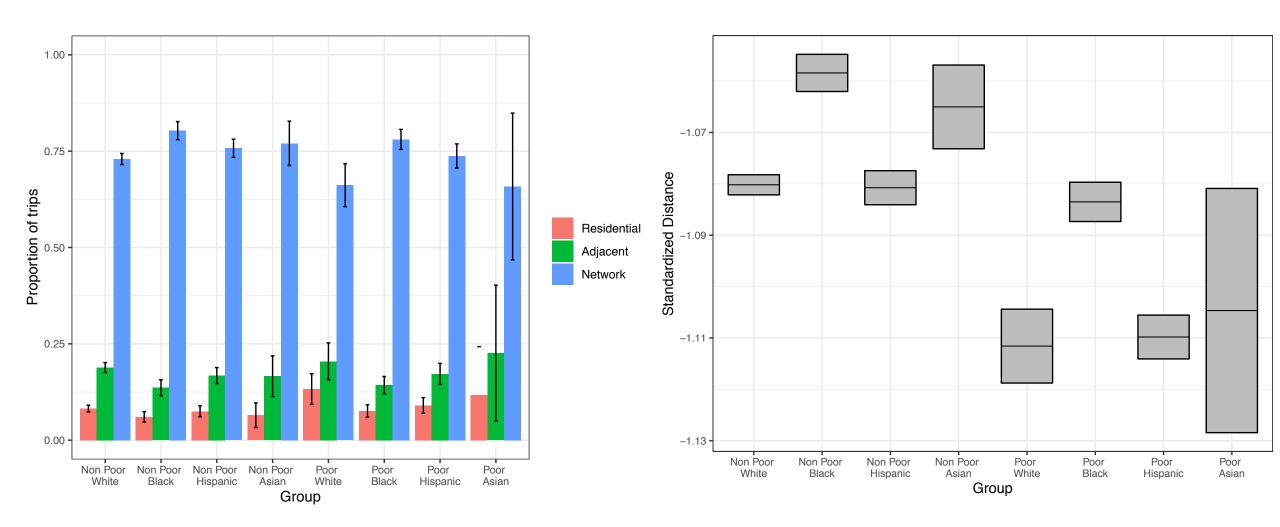


# Research Design

- Travel patterns of residents from White, Black, Hispanic, Asian, non-poor and poor neighborhoods
  - Race/ethnicity > 50%
  - Households living under the poverty level > 30%
  - Tested higher thresholds (60% and 40%)
  - 2014-2018 American Community Survey

#### Proportion of trips

#### Average distance travelled



### Levels of exposure to $PM_{2.5}$

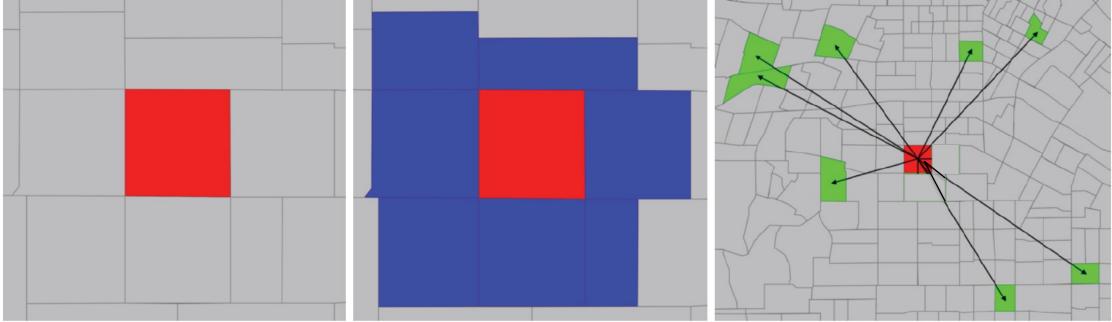
• Environmental Protection Agency's EJScreen

$$\begin{split} Y_{ik} &= \beta_0 + \beta_1 White_{ik} + \beta_2 Black_{ik} + \beta_3 Asian_{ik} + \beta_4 Hisp_{ik} + \\ \beta_5 Poor_{ik} + \beta_6 Pop_{ik} + \alpha_k + \varepsilon_{ik} \end{split}$$

 $Y_{ik}$  is the  $PM_{2.5}$  at the

- I. Residential
- 2. Adjacent
- 3. Network

#### Network (non-residential and non-adjacent)

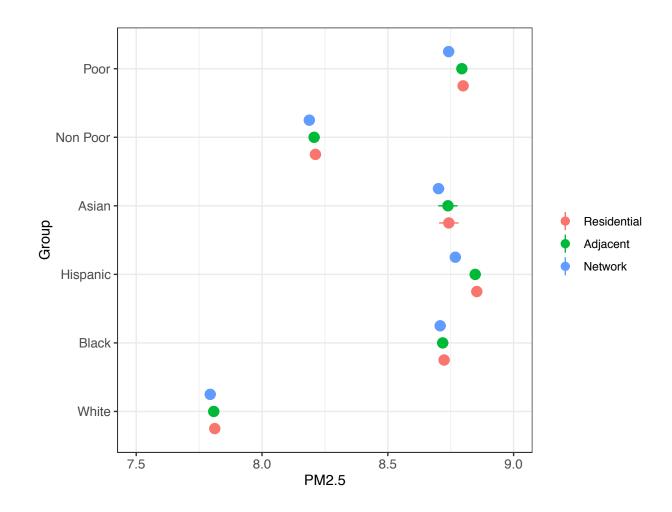


Adjacent

Residential

Higher levels of  $PM_{2.5}$  levels in non-white and poor

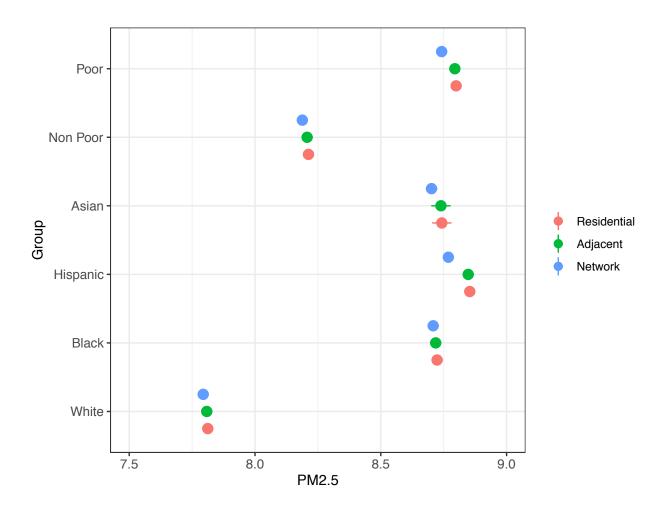
- Residential
- Adjacent



Higher levels of  $PM_{2.5}$  levels in non-white and poor

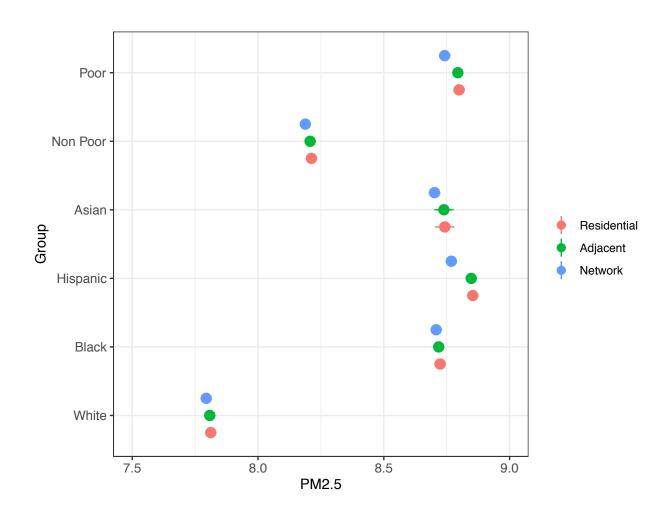
- Residential
- Adjacent
- Network

Hispanic neighborhoods exhibit the greatest burden



Network neighborhood inequality in comparison to residential and adjacent is

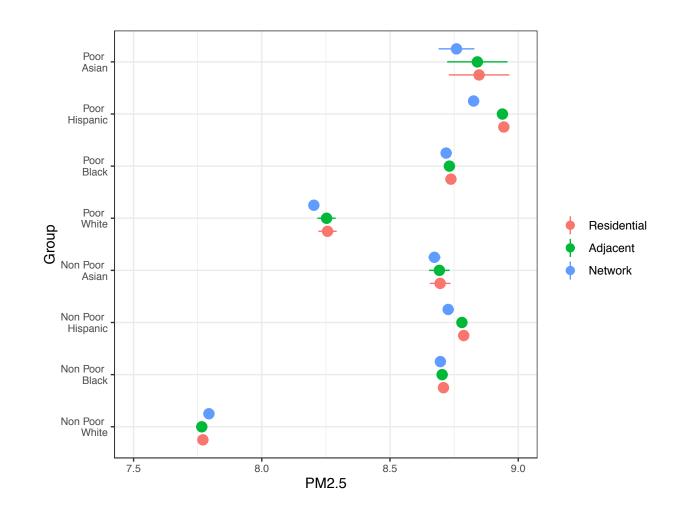
- Lower
  - White/Hispanic
  - Non-poor/Poor
- Higher
  - White/Black
  - White/Asian



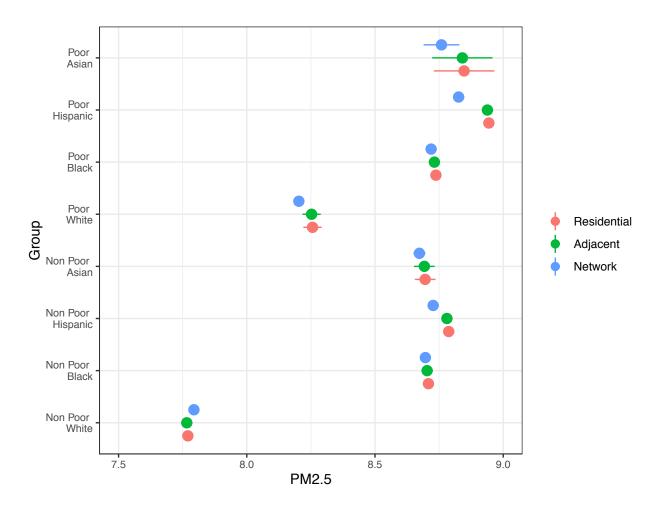
### Non-poor vs poor

- Lower  $PM_{2.5}$ 
  - All scales
  - All race/ethnicity

Greater socioeconomic advantage for White neighborhoods



- Black and Asian
  - Similar  $PM_{2.5}$  across all scales for poor and non-poor
- Hispanic
  - Lower at the network for poor and non-poor
  - Greater decrease for poor
- White
  - Lower at the network for poor
  - Higher at the network for nonpoor



### Caveats

- Census tracts may be too large in some cases
- Data at the neighborhood level not individual level
- Trips to points of interest
- Differences may be partly due to own and travels with cell phone
- Time spent at location and activity
- Visits of unique devices in a day

# Conclusion

- Underestimate neighborhood inequalities by ignoring where residents travel to throughout the day
- Policies consider the network of neighborhoods that residents visit
  - e.g. Target interventions in the most polluted and visited neighborhoods

# Thank You!

Questions?

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