



# Spatial Analysis on Environmental Justice in Los Angeles County

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**SOUTHERN CALIFORNIA  
ASSOCIATION OF GOVERNMENTS**

# Why Environmental Justice (EJ)

- Integrate the principles of Environmental Justice into SCAG's transportation plan



- Low-income and minority communities should have ample opportunity to participate in transportation decisions
- They should receive an equitable distribution of benefits and not a disproportionate share of burdens

# Legal Background of EJ



## – Title VI

- Avoid, minimize, or mitigate adverse effects, on sensitive population
- Ensure the participation by all in the transportation decision-making process

## – SB 535 (Greenhouse Gas-Reduction Investments to Benefit Disadvantaged Communities)

- Requires Cal/EPA to identify disadvantaged communities
- Requires that at least 10 percent of the available moneys must be directly allocated in disadvantaged communities



# Research Goals

- Identification of areas with Environmental Justice (EJ) concerns in Los Angeles county
  - Focusing on air quality
  - Unit of Analysis = Census Tract
- Analysis on transportation and land use contributing factors to the EJ areas



# Identification of EJ Areas

- Quantifying and aggregating 4 aspects of EJ by Census Tract

	Variables	Source of Data
<b>Air quality</b>	Particulate Matter 2.5 (PM 2.5) Diesel Particulate Matter (DPM) Ozone, CO <sub>1</sub> , CO <sub>2</sub> , Nitrogen	CalEnviroScreen (PM 2.5, DPM, & Ozone) SCAG (PM 2.5, CO <sub>1</sub> , CO <sub>2</sub> , & Nitrogen)
<b>Sensitive population</b>	Minority Population, Persons below Poverty Senior Population, Child Population, Renters Educational Attainment Unemployed Population Population without an Automobile	U.S. Census (2013 ACS 5-yr. Est.)
<b>Public health</b>	Low Birth Weight Asthma-related Emergency Visits Women, Infant, and Children (WIC) Vendors	CalEnviroScreen 2.0 California Department of Public Health (CDPH)
<b>Environmental nuisance</b>	Solid Waste Facilities, Superfund Sites Clean-Up Sites	

# Air Quality Variables and Score

PM 2.5  
(EnviroScreen)



Diesel PM



Ozone



PM 2.5 (SCAG)



CO<sub>1</sub>



CO<sub>2</sub>



Nitrogen



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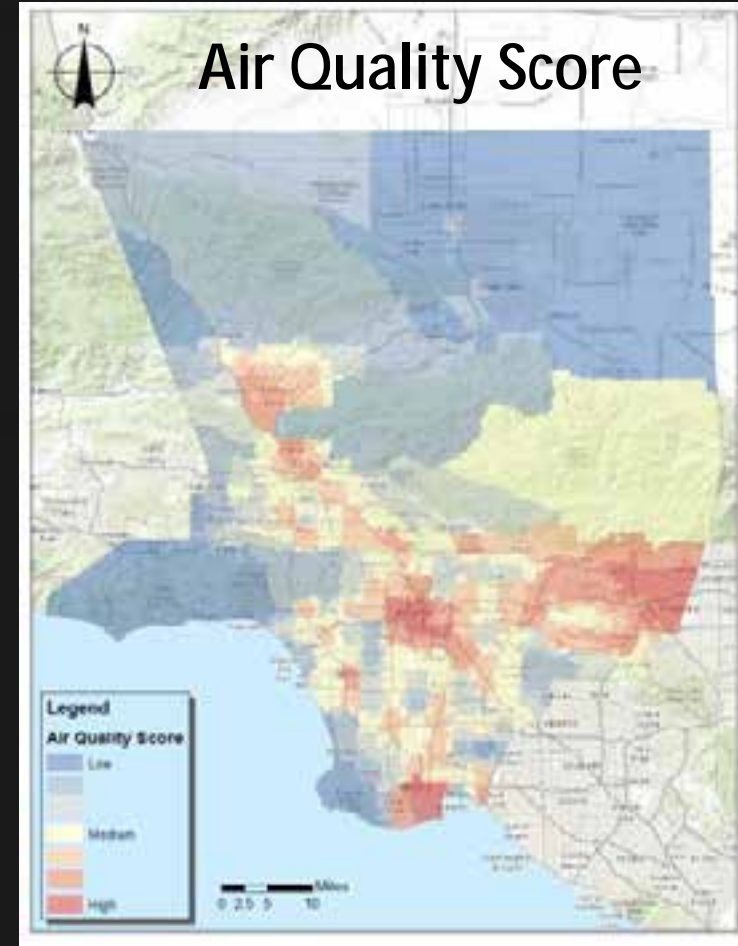
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# Sensitive Population Variables and Score

Minority

Poverty

Senior

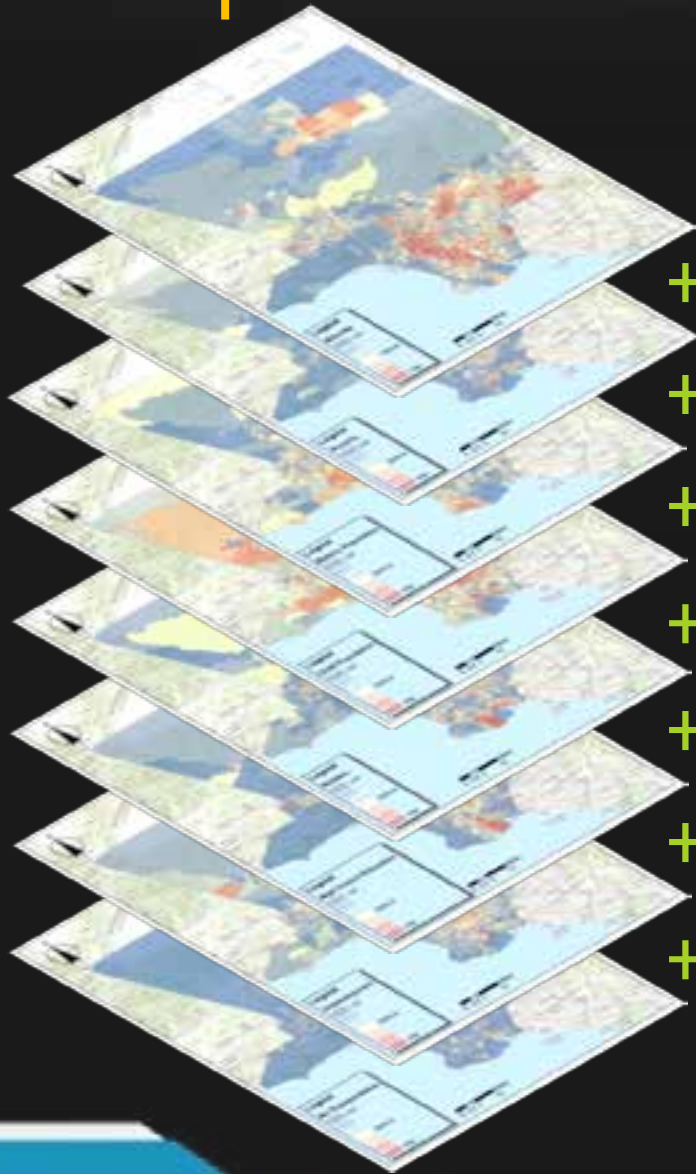
Child

Renters

Education

Unemployment

No Automobile



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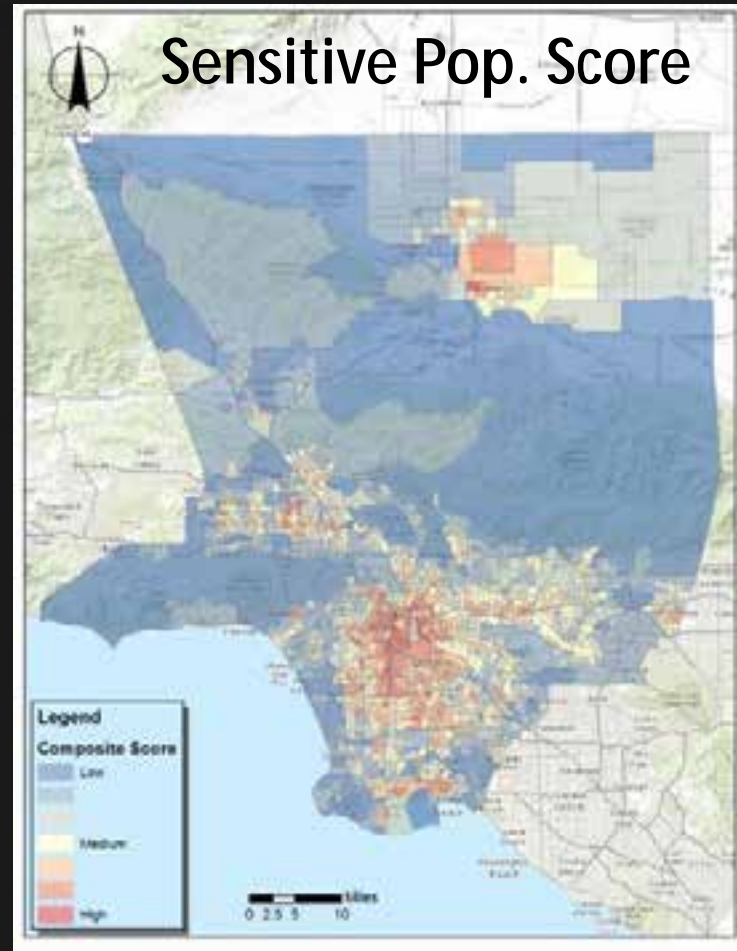
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# PH & EN Variables and Score

WIC Vendors

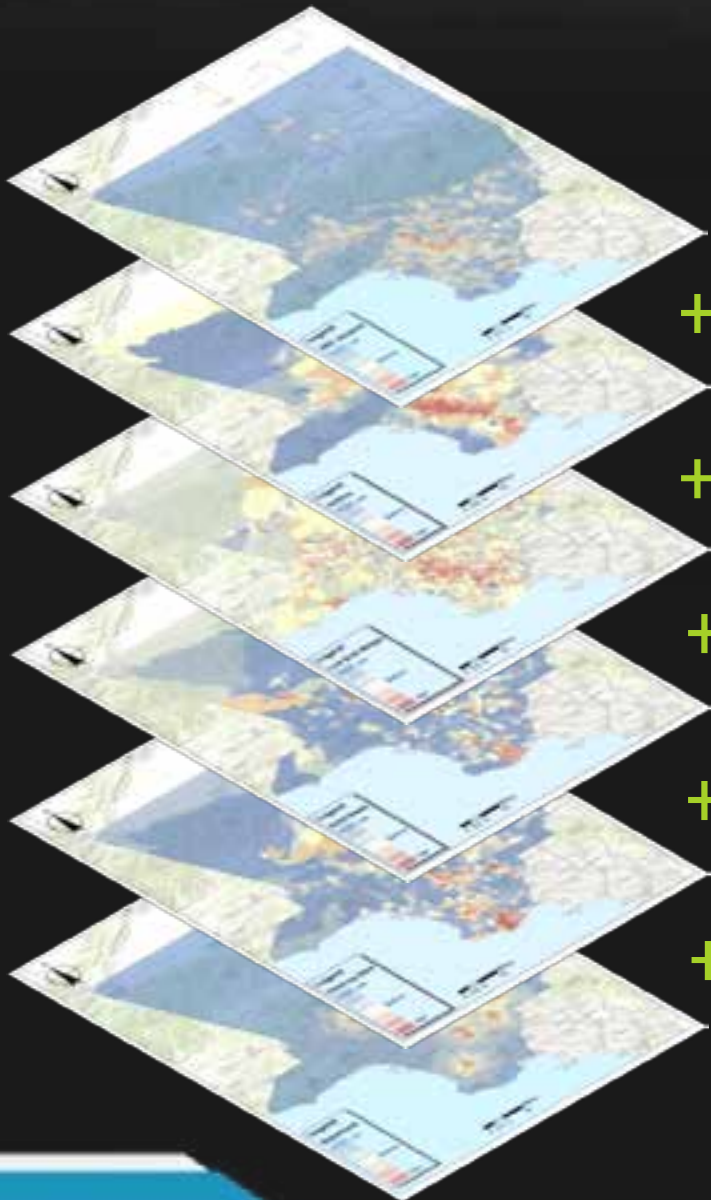
Asthma

Low Birth  
Weight

Solid Waste

Clean-up

Superfund



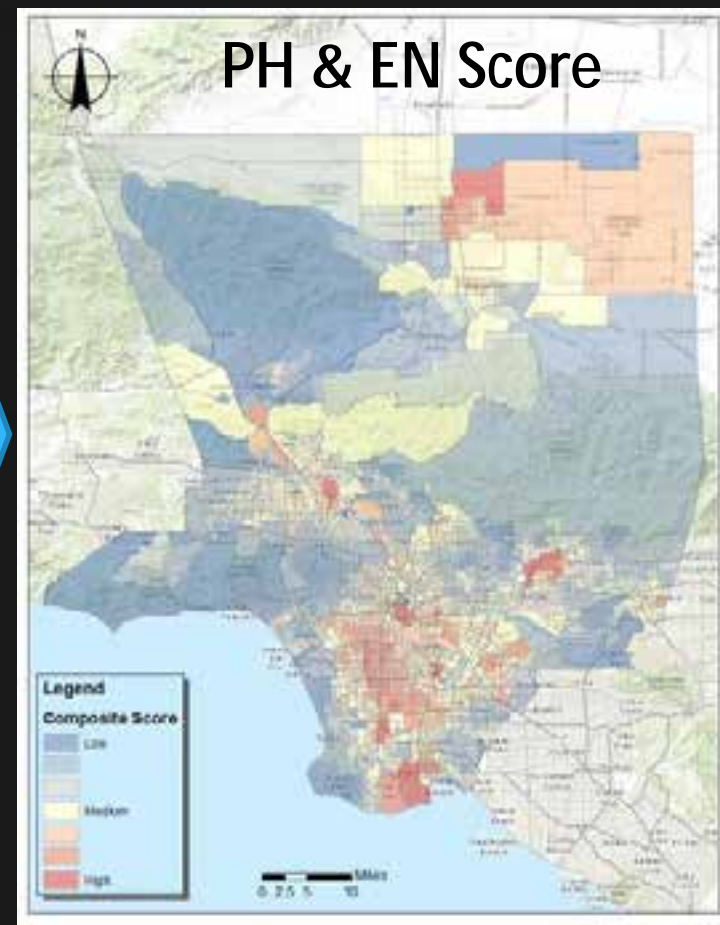
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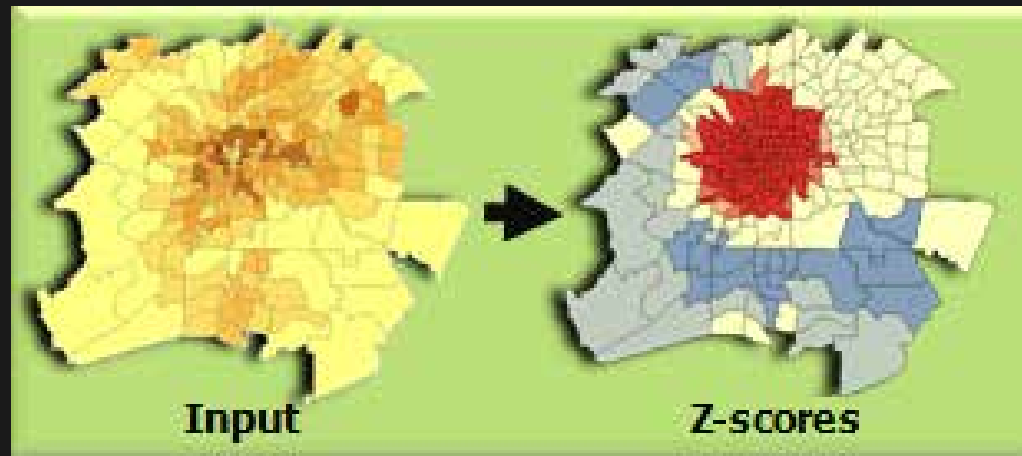
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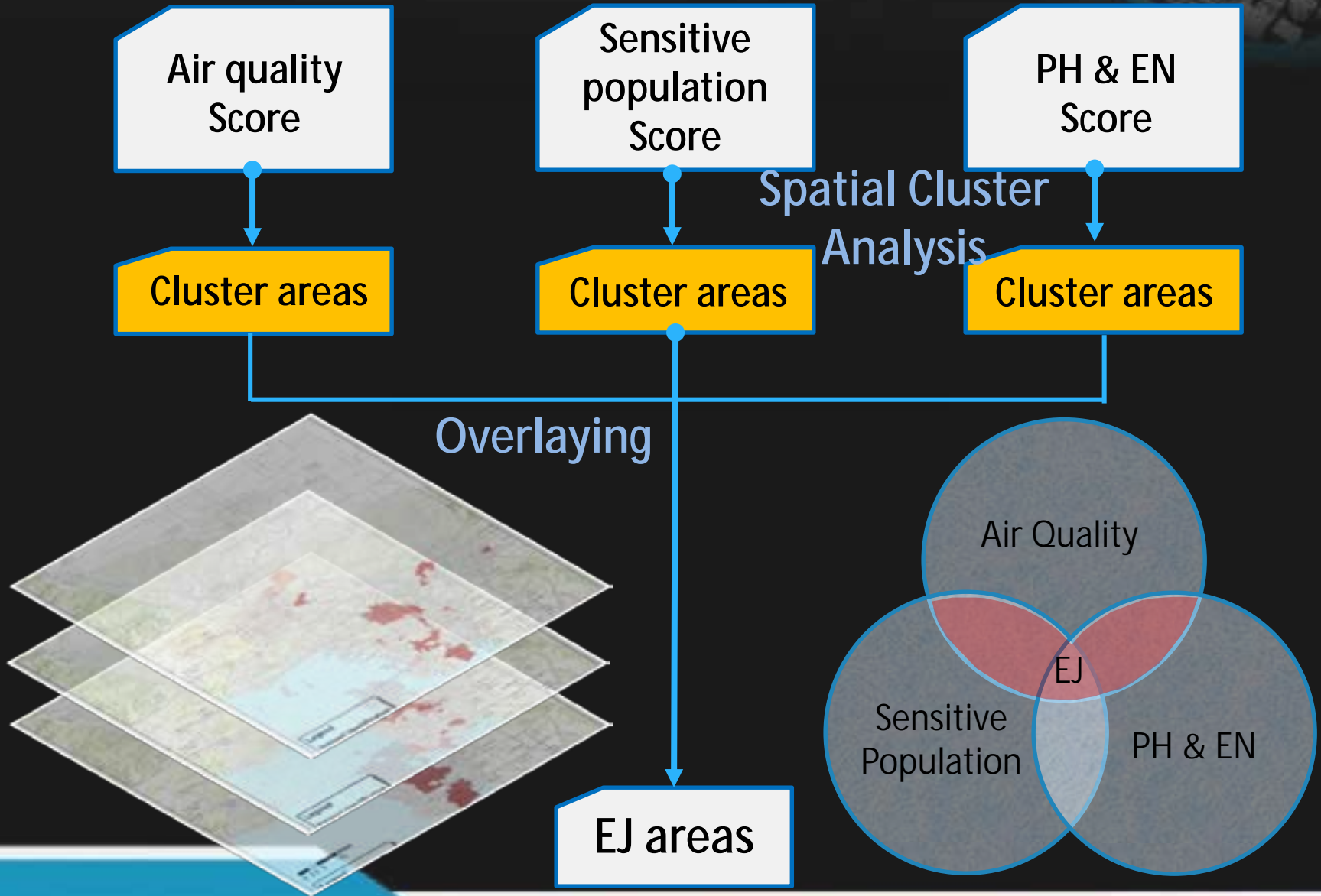


# Identification of EJ Areas

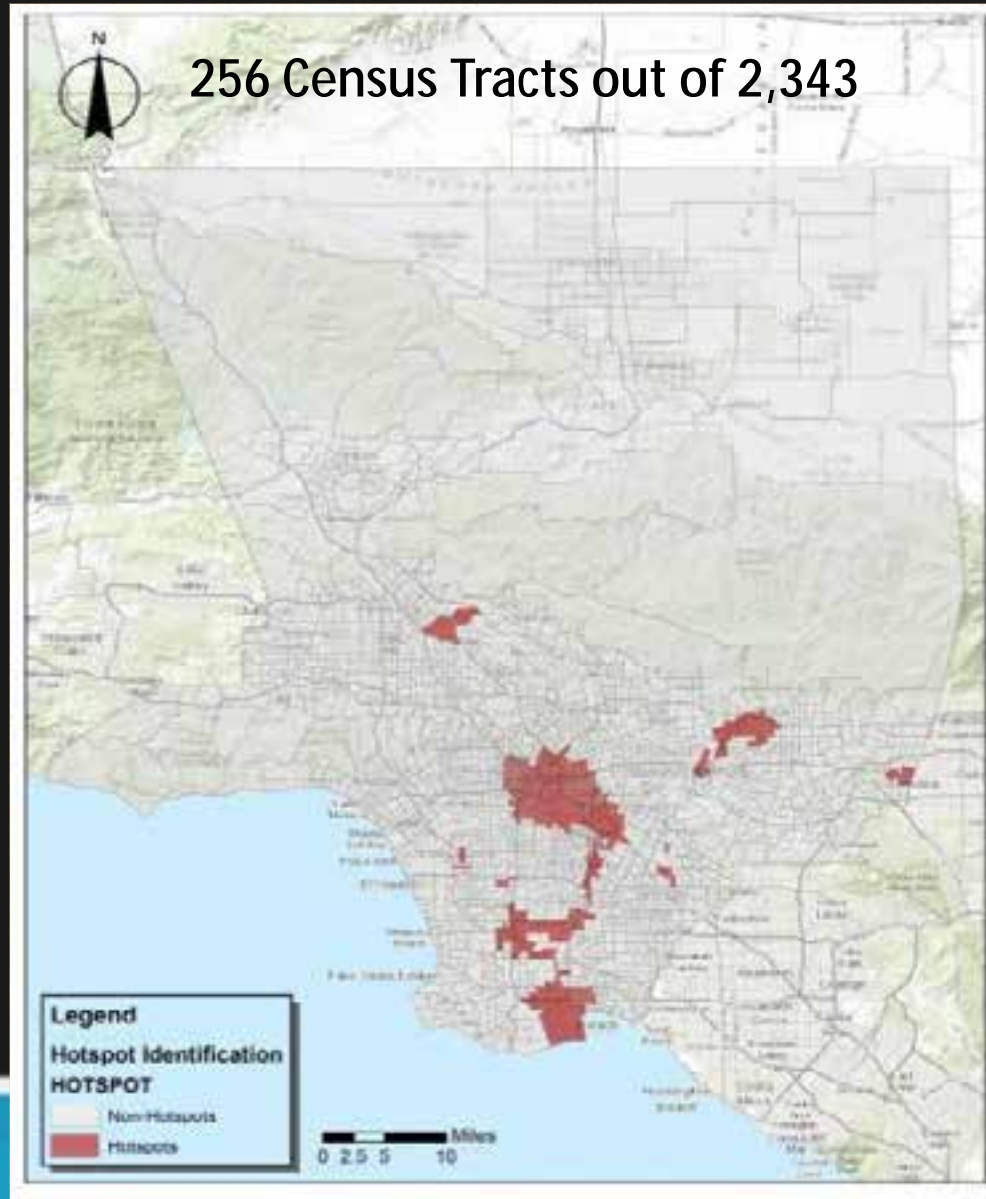
- Identifying the areas with the concentration of high score by conducting spatial cluster analysis (Getis-Ord  $G_i^*$ )



# Identification of EJ Areas



# Map of EJ Areas





# Analysis of Contributing Factors



- Analysis of factors that potentially associate with EJ areas in these physical aspects
  - Transportation
  - Land Use
- Quantifying a variety of variables by Census Tract using GIS analysis
- Identifying the potential contributing factors by conducting statistical analysis
  - T-Test
  - Logistic Regression

# Analysis of Transportation Factors



- Variables analyzed

- Highway/Roadway

- Roadway lane mile
    - Highway land mile
    - Automobile speed

- Public Transit

- TOD stations (Y/N)
    - Transit stations (Y/N)
    - Bus stop density

- Data sources

- SCAG

- NTAD

- LA Metro

- Active Transportation

- Bicycle facility density
    - Bicycle collision density
    - Intersection density

- Railroad

- Freight rail distance

# Highway/Roadway Factors



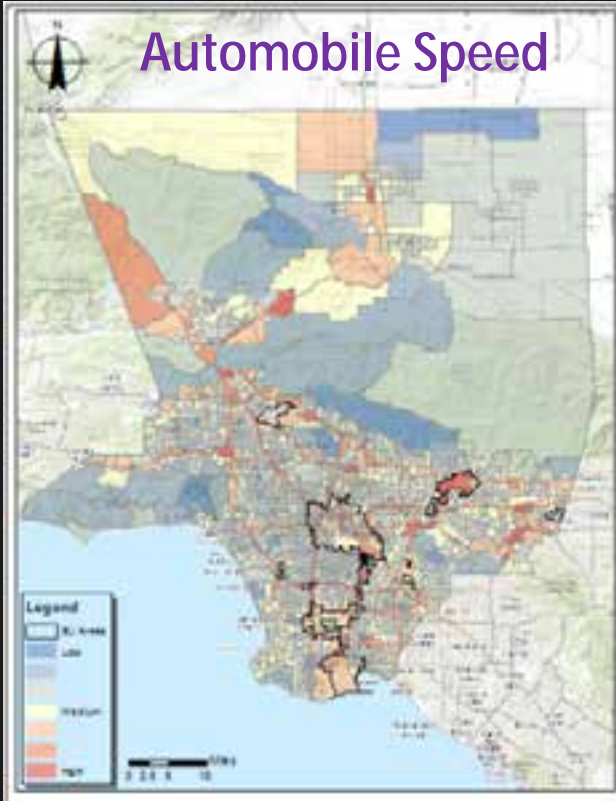
Highway Lane Miles

Linear Density Analysis



Roadway Lane Miles

Linear Density Analysis

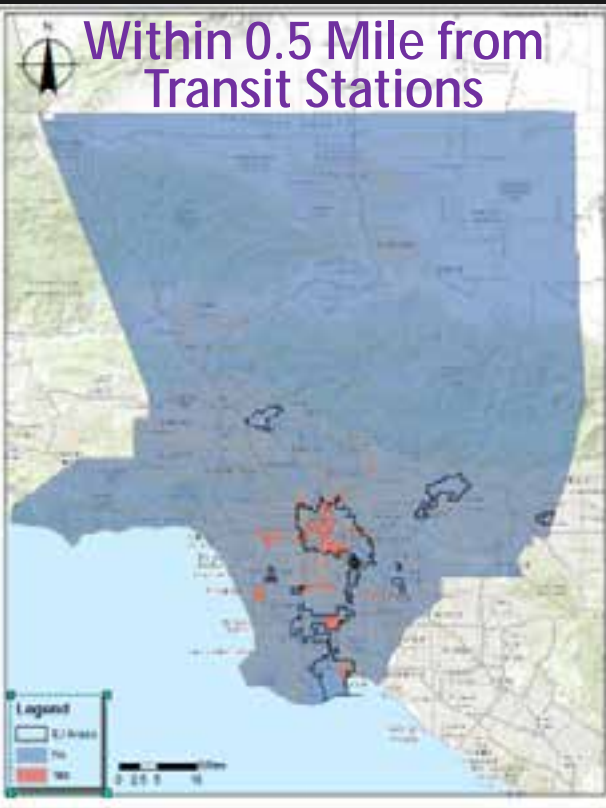


Automobile Speed

Linear Density Analysis



# Public Transit Factors



Buffer Analysis



Buffer Analysis



Point Density Analysis

# Active Transportation Factors

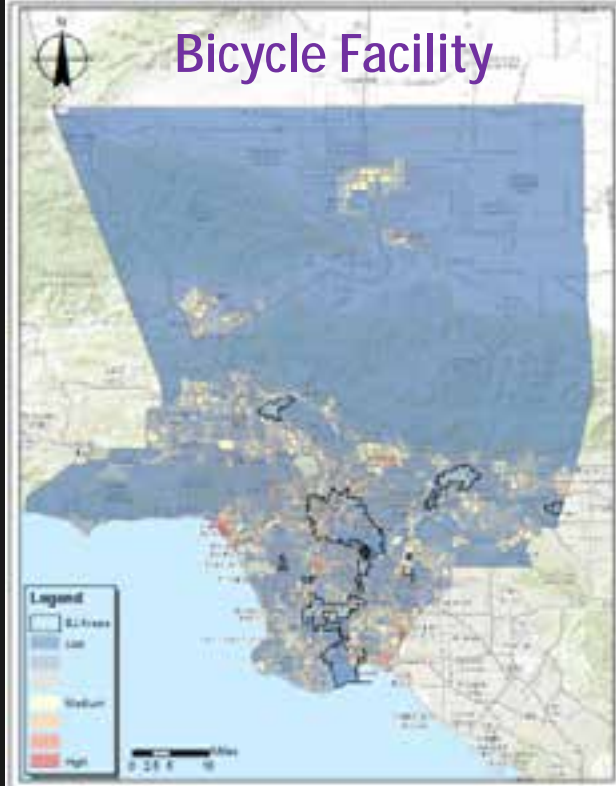


Intersection



Point Density Analysis

Bicycle Facility



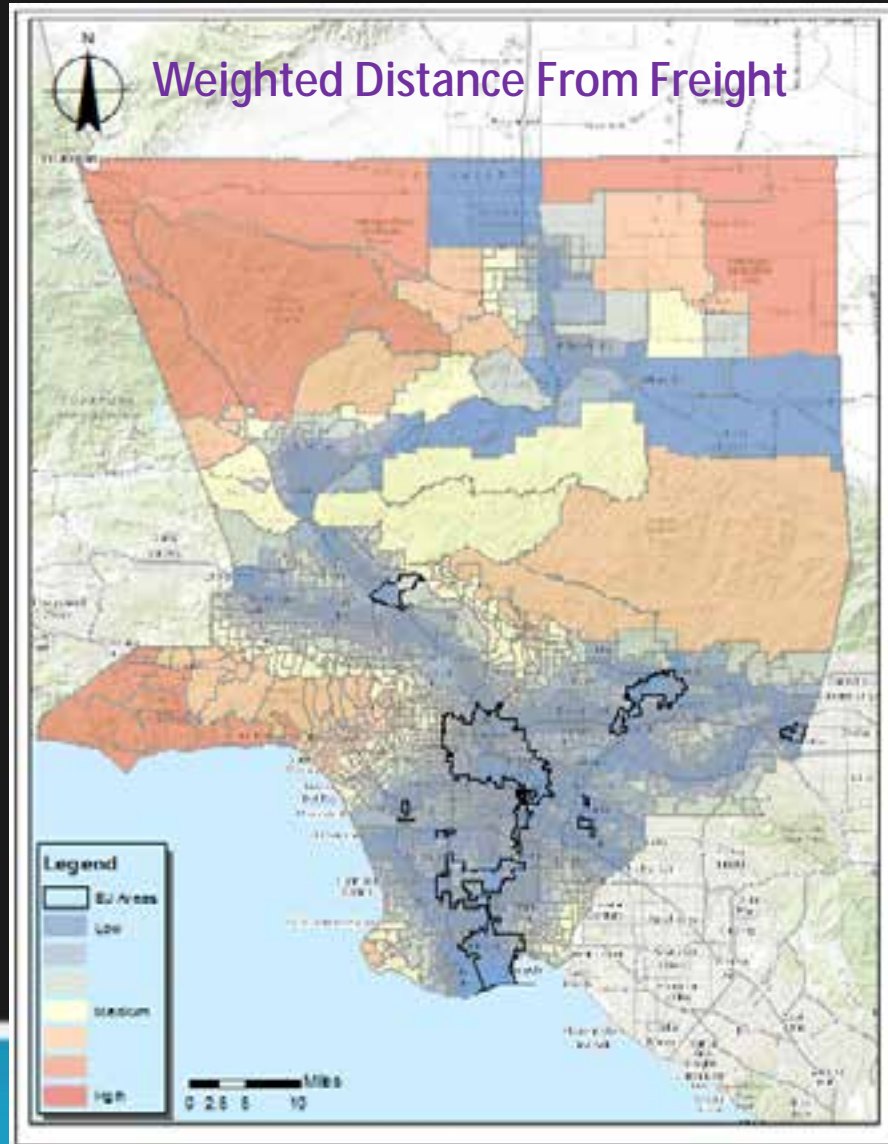
Linear Density Analysis

Bicycle Collision



Point Density Analysis

# Railway Factor



Weighted Distance  
Analysis



# T-Test and Logistic Regression Output

Methods	T-Test			Logit		
Variables	EJ Areas (Mean)	Non EJ Areas (Mean)	T-Stat.	Coef.	S.E.	Exp(B)
Intercept	-	-	-	-5.840	1.257	0.003
TOD (Y=1, N =0)	-	-	-	0.369	0.403	1.446
Transit (Y=1, N =0)	-	-	-	***-1.054	0.180	0.348
Freight Rail	6584.473	11652.534	***-11.268	***-0.001	0.000	1.000
Bus Stop	812.763	246.736	***9.031	***0.002	0.000	1.002
Bike Route	1.620	1.390	1.621	-0.056	0.045	0.946
Bike Crash	0.218	0.081	***1.969	***3.908	0.718	49.822
Highway	0.021	0.010	***1.968	-5.129	6.451	0.006
Roadway	0.086	0.079	***1.967	-2.657	3.800	0.070
Speed Limit	36.489	33.681	***1.968	***0.096	0.032	1.100
Intersection	1.59	1.081	***1.968	-	-	-
					Cox & Snell R <sup>2</sup>	0.398

The variable, Intersection, was excluded from the logit regression due to its' multicollinearity

\*, \*\*, \*\*\* Correlations are significant at the 0.10, 0.05, and 0.01 levels, respectively (2-tailed)

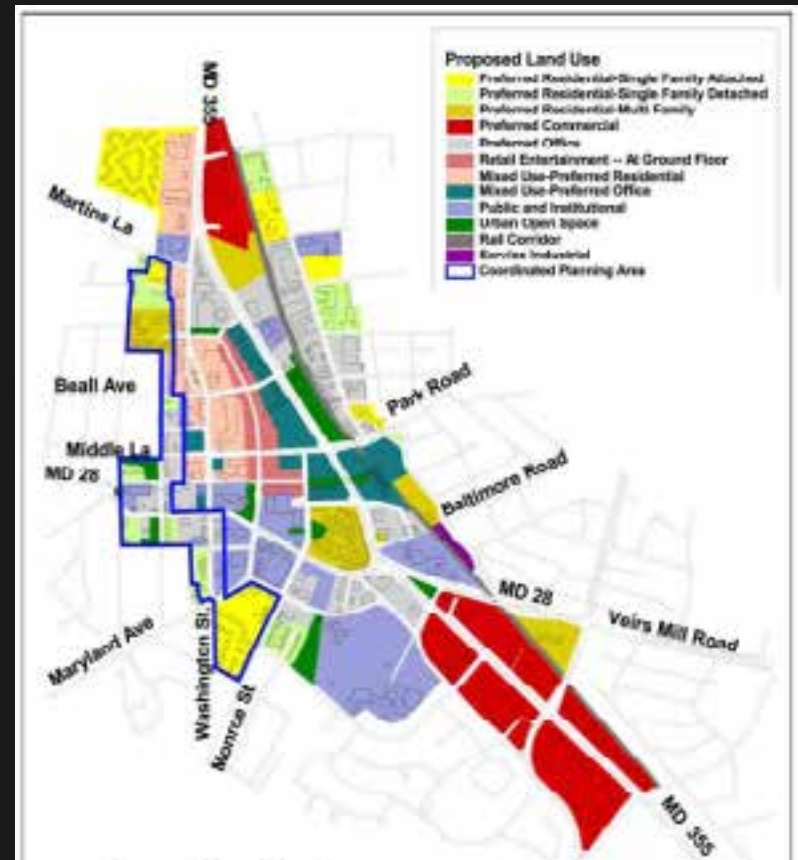


# Summary of Findings

- Logistic regression shows notable differences between bus stops and distance to freight rail.
- TOD's have no relationship with EJ areas.
- Surprisingly, there is no correlation of the EJ areas with highway and roadway features

# Analysis of Land Use Factors

- Variables analyzed
  - Residential
    - Multi-family residential
    - Single family pervious surface
  - Non-residential
    - Industrial
    - Retail
    - Office
    - Open space
- Data sources
  - SCAG
  - LA County GIS Portal

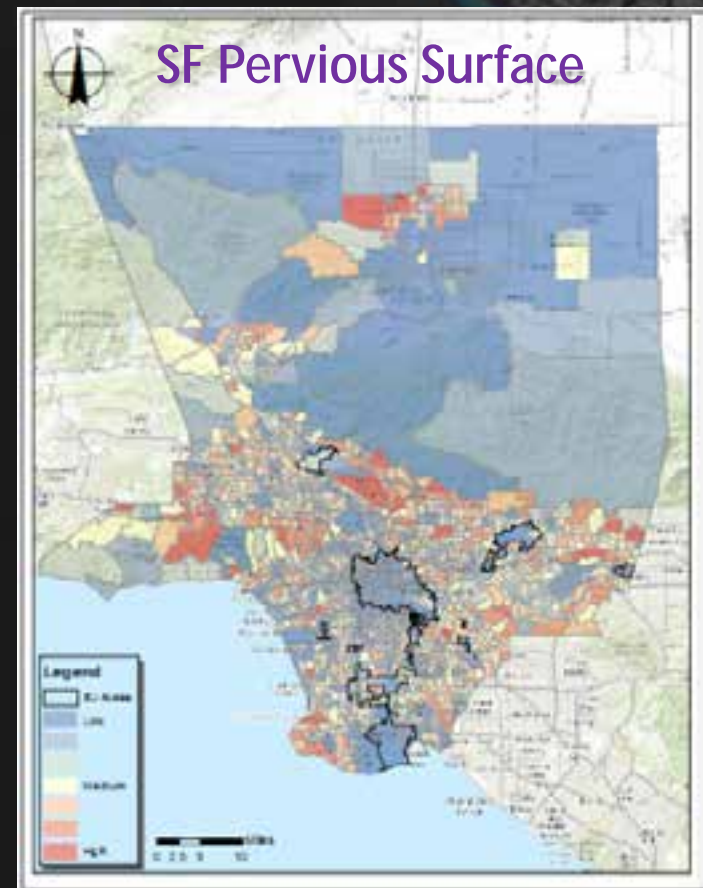




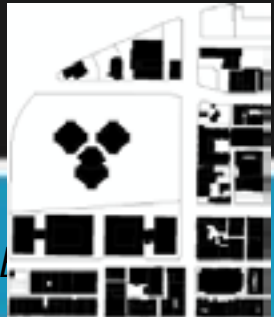
# Residential Factors



Building Density Analysis



Property Area – Building Footprint

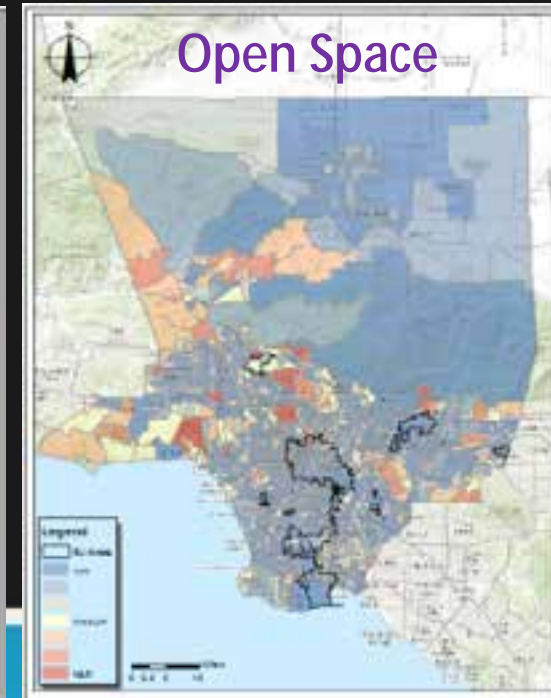
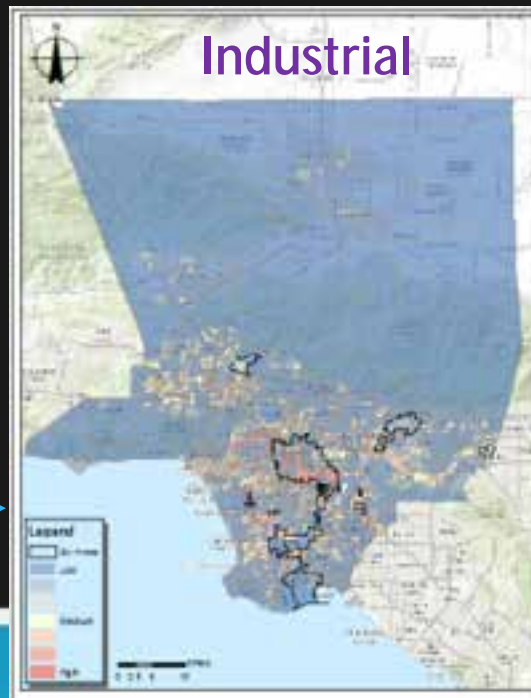


# Non-Residential Factors

Building Density Analysis →



Property Density Analysis →



# T-test and Logistic Regression Outputs

Method	T-test			Logit		
Variables	EJ Areas (Mean)	Non EJ Areas (Mean)	T-Stat.	Coef.	S.E.	Exp(B)
Intercept				-0.819	0.121	0.441
Industrial	0.114	0.101	1.436	** -1.090	0.545	0.336
Multi-Family	1.587	1.362	0.392	** -0.722	0.328	0.486
Office	0.196	0.054	*** 2.781	0.297	0.185	1.340
Open Space	0.034	0.054	*** -2.747	-0.798	0.654	0.450
Pervious Surface	12.037	63.699	*** -27.178	*** -0.040	0.003	0.961
Retail	0.107	0.042	*** 5.428	*** 1.763	0.491	5.828
				Cox & Snell R <sup>2</sup>		0.138



# Summary of Findings



- The relationship between EJ factors and Land-use analysis is not as transparent as anticipated.
  - Industrial land-use is not found to be significant.
  - Pervious surface and retail show consistent results among statistical models.

# Conclusion & Discussion



- The contribution of the **transportation factors** to the EJ areas is identified, while that of the **land use** remains unanswered.
- **Public transit, particularly bus**, serves the EJ areas appropriately, but it may cause **public health and safety concerns**.
- The unclear relationship between land use and EJ may be caused by **the spatial segregation between residential land use and non-residential land use**.
- Future studies should properly address issues with **the unit of analysis** (Census Tract)