Urban Segregation and Pollution in Charlotte, NC

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Background

Though the Civil Rights Act of 1964 marked the end of segregation in the United States, the legacy of its policies and practices lingers in the present day through residential segregation.

The employment of urban segregation causes disproportionate accessibility to resources and exposure to potential pollutants and health risks.

The evolving state of the earth has turned the spotlight towards environmental risks deriving from structural discrimination.

Research Question & Hypothesis

How does race, class, and other socioeconomic indicators affect the rates of exposure to various forms of air pollution?

Hypothesis: Areas considered more socially vulnerable will be exposed to higher levels of air pollution.

Data Sources

US Census ACS 5-Year Estimates for Demographic Data

Mecklenburg Open Mapping and OpenStreetData for Local Location Data

NASA Socioeconomic Data and Applications Center (SEDAC) for Environmental Data

Variables

Demographic	Geographic	Environmental		
Minority status	Landfills	NO2 Concentration		
Below 150% poverty level	Waste Facilities	O3 Concentration		
Population 25+ with no high school diploma	Industrial Plants	s PM2.5 Concentration		
Population 16+ that are unemployed				
Civilian noninstitutionalized with no health insurance				
Over 65 years old				
Under 17 years old				
Civilian noninstitutionalized with a disability				
Speak English less than "very well"				
Workers 16+ no vehicle available				
Renter-occupied housing				
No internet access				
With cash public assistance or food stamps/SNAP				

Methodology

Extracted specified variables from the US Census using tidycensus library on the census tract level

Represented each variable as a percentage of the total population or total housing units

Retrieved point and polygon location data for geographic variables

Calculated the minimum distances from each tract

Scaled data before using K-Means to form seven geodemographic clusters

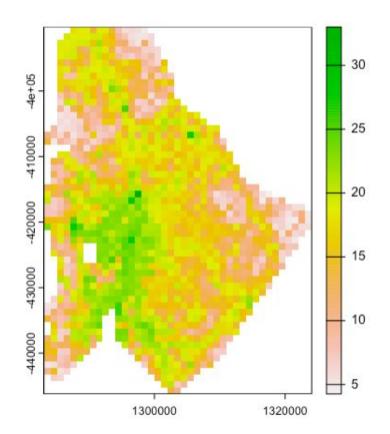
Calculated global mean difference for each cluster center and created radial plots and a heat map to explore cluster identity

Derived raster maps for pollution measurements and used terra::extract to match average with tracts

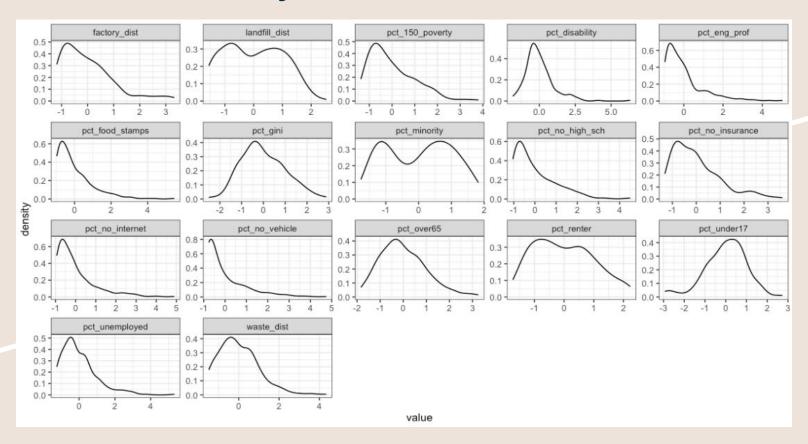
Constructed density maps of pollution by cluster

Raster Map

Annual NO2 Concentration in a 1-km grid (2016)



Variable Density Plots



Cluster Map

Seven Clusters:

One - 46 tracts

Two - 56 tracts

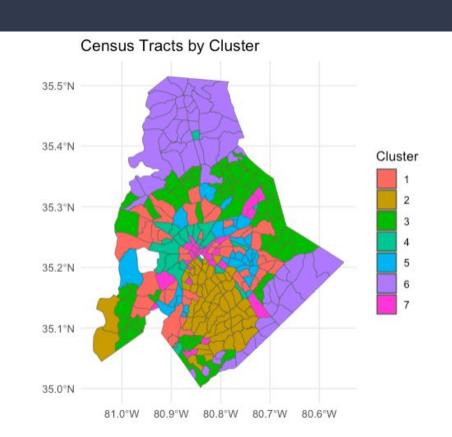
Three - 66 tracts

Four - 23 tracts

Five - 28 tracts

Six - 54 tracts

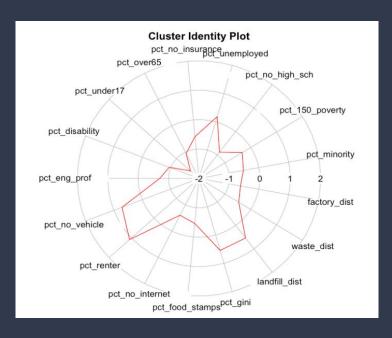
Seven - 29 tracts



Cluster Heat Map

	waste_dist	-0.23	-0.12	0.66	-0.38	0.24	0.29	-0.46	
F	pct_unemployed	0.47	-0.5	-0.28	0.38	0.16	-0.41	0.18	
	pct_under17 —	0.18	0.08	0.34	0.06	0.81	0.15	-1.62	
	pct_renter	-0.17	-0.68	-0.46	0.6	0.69	-1.07	1.09	-
	pct_over65	-0.01	0.65	-0.45	0.61	-0.6	0.85	-1.05	
	pct_no_vehicle	-0.38	-0.6	-0.56	0.72	0.7	-0.59	0.71	
	pct_no_internet	0.08	-0.79	-0.77	2.13	0.61	-0.67	-0.6	value
o po	pct_no_internet ct_no_insurance ct_no_high_sch pct_minority	0.36	-0.96	-0.37	0.41	1.94	-0.81	-0.57	2
niabl	oct_no_high_sch	0.39	-0.88	-0.46	0.97	1.57	-0.71	-0.88	1
٧8	pct_minority	0.55	-1.26	0.4	0.99	0.88	-1.04	-0.52	0
	pct_gini	-0.17	0.62	-0.95	0.74	-0.51	-0.27	0.54	-1
р	oct_food_stamps	0.29	-0.92	-0.59	1.91	0.63	-0.86	-0.46	
	pct_eng_prof	0.24	-0.67	-0.17	-0.23	2.18	-0.64	-0.71	-3
	pct_disability	0.31	-0.44	-0.54	1.81	-0.3	0.11	-0.95	
рс	pct_150_poverty	0.37	-0.98	-0.6	1.18	1.25	-0.9	-0.33	
	landfill_dist -	-0.23	0.94	-0.68	0.01	-0.03	-0.55	0.54	
	factory_dist -	-0.36	-0.13	0.25	-0.43	-0.41	1.71	-0.61	
		1	2	3	4 cluster	5	6	7	

Cluster Identity



One - Above average unemployment, minority status, but higher vehicle ownership

Two - Very low social vulnerability, higher income inequality, higher retired population

Three - Low income inequality, closer to landfills, farthest from waste facilities

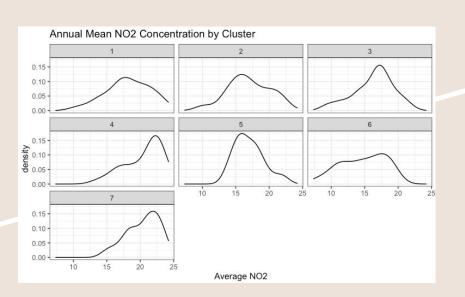
Four - High social vulnerability, less internet access, more food stamps, more disability statuses

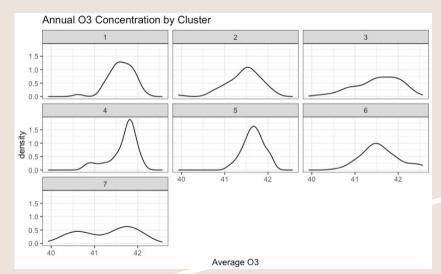
Five - High social vulnerability, less English proficiency, less high school graduates, no insurance

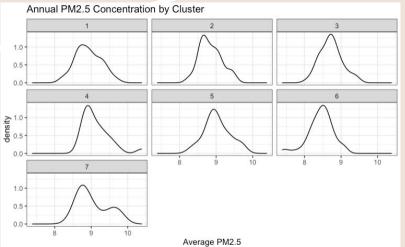
Six - High retired population, less renters and minorities, low poverty

Seven - Most renters with no vehicle, very low child and retired population, low disability statuses

Pollution Distribution Plots







Conclusions

Four (most socially vulnerable) shows more frequently occurring values on the higher end of the NO2 and O3 spectrum and seven shows on the NO2 spectrum.

PM2.5 is consistent throughout all clusters.

There is not enough evidence to state that socioeconomic status is highly correlated with pollution exposure. Though the overall pollution measures are within industry standards, as the climate continues to change, those most vulnerable will face the burden first.

Further steps could be exploring more sources of pollution, collecting health data to assess risk, and using more clusters.