Quantifying Gentrification

Amy Boncelet, Matthew Shen, and Thomas Wallace

What is gentrification?

"The succession and replacement of classes", where "the middle class returns to the inner city", attracted by "convenient transportation, bustling commerce, and specific cultural atmosphere."

Glass (Glass R. Aspects of Change London: MacGibbon & Kee, 1964)

Implications of gentrification

- Can push people out of housing market / neighborhood
- Changes character of a neighborhood
- Increase in discriminatory behaviour as new vs existing cultures clash



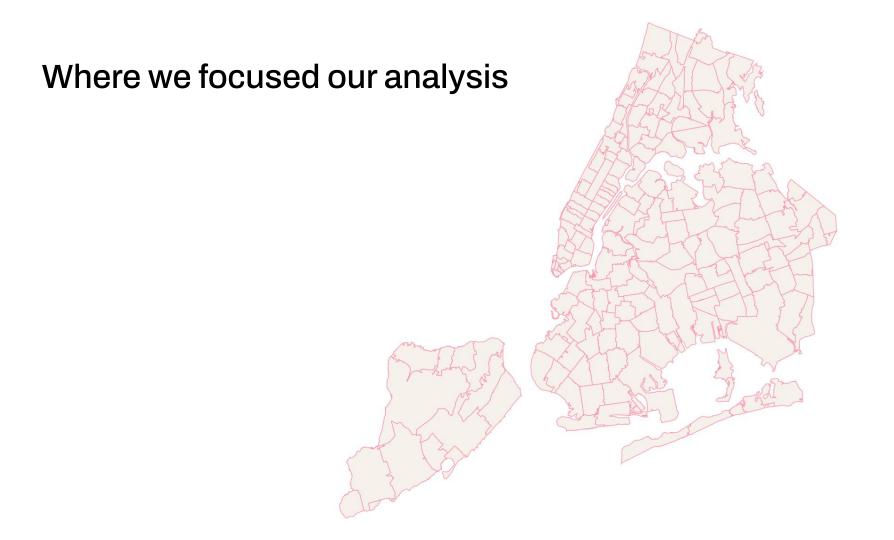
Project Goal

Evaluate New York City
demographic characteristics to
attempt to determine which
neighborhoods have gentrified over
the past decade

Factors we used to define gentrification

- Factors used which tend to increase:
 - % of the population that is white*
 - Median Income
 - Education level (Bachelor's degree or higher)*
 - Median Rent
- Factors used which tend to decrease:
 - Median Age
 - % of population that is foreign born (non-US Citizen)*

Specifically - how these factors change in each zip code relative to that of **the mean** of New York City



Data Sources and Methods

Data from US Census Bureau, between 2011-2019 (pre-covid):

- DP05: ACS DEMOGRAPHIC AND HOUSING ESTIMATES (age, % pop. white)
- S1901: INCOME IN THE PAST 12 MONTHS (median income)
- DP02 SELECTED SOCIAL CHARACTERISTICS IN THE UNITED STATES (% foreign born, education level)
- DP04: SELECTED HOUSING CHARACTERISTICS (median rent)

Coding methods:

Pandas, geopandas, normalization

Methodology

A 6 Step process where we cleaned, normalized, compared and visualized the data.

Step 1: DF Creation

ZIP CODE	Gentrification Factor 1	Gentrification Factor 2	
10028 10029 10032 10067 	108432 98020 104084 76028 	26.2 34.5 23.5 31.3 	

ZIP CODE	Gentrification Factor 1	Gentrification Factor 2	
10028	108432	26.2	
10029	98020	34.5	
10032	104084	23.5	
10067	76028	31.3	

Step 2: Missing Data

ZIPCODE	Median Income	Age	
10028 10029 10032 10067 	NaN 98020 104084 76028 	26.2 34.5 NaN 31.3 	

Step 2: Missing Data

ZIP CODE	Median Income	Age	
10028 10029 10032 10067	NaN 98020 104084 76028	26.2 34.5 NaN 31.3	

Step 2: Missing Data

ZIP CODE	Median Income	Age	
10028 10029 10032 10067	108322 98020 104084 76028	26.2 34.5 32.9 31.3	

Step 3: Difference between 2011 and 2019

2011 2019

ZIPCODE	Median Income	Age		ZIP CODE	Median Income	Age	
10028	108432	26.2		10028	103456	25.2	
10029 10032	98020 104084	34.5 32.9		10029 10032	124032 101244	31.4 23.5	
10032	76028	31.3		10067	79235	33.2	
			VS				
					" /		
•				•	· /	•	

32.9 - 23.5 = 9.4

Step 3: Difference between 2011 and 2019

ZIPCODE	Difference in Median Income	Difference in Age	
10028	2031	1.2	
10029 10032	2341 1872	4.4 9.4	
10067	985	0.2	
•	•	•	

Step 4: Normalize Data

ZIPCODE	Difference in Median Income (norm)	Difference in Age (norm)	
10028 10029 10032 10067	-0.4 0.2 -0.6 0.8	0.7 0.2 0.4 -0.9	

Step 5: Gentrification Metric

ZIPCODE	Difference in Median Income (norm)	Difference in Age (norm)	 Gentrification Metric
10028	-0.4	0.7	 -0.482
10029	0.2	0.2	 0
10032	-0.6	0.4	 0.294
10067	0.8	-0.9	 0.420

Step 6: Compare Zip Codes

NYC MEAN 10029 10032 -0.6 0.4 00 10067 0.8 0.0 0.0 0 0 0 0	-0.482 0 0.294 0.420
	0.120

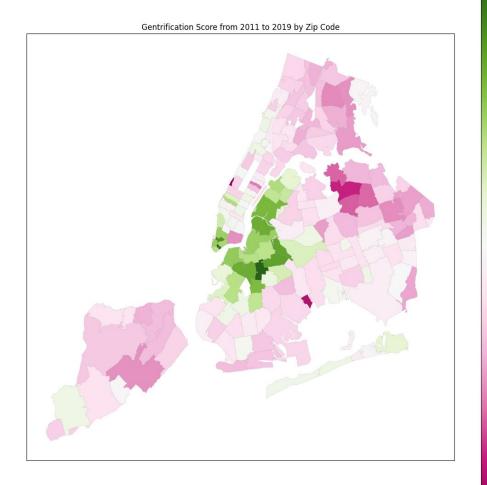
Step 6: Compare Zip Codes

	ZIP CODE	Difference in Median Income (norm)	Difference in Age (norm)	 Gentrification Metric
NYC MEAN ———	10028 → 10029 10032 10067	-0.4 0.2 -0.6 0.8	0.7 0.2 0.4 -0.9	 -0.482 0 0.294 0.420
Lower than Mean = Less Gentrified	 		 	
Higher than Mean = More Gentrified				

Analysis Results

Most Gentrified Zip Codes Least Gentrified Zip Codes

Zip Code	${\tt gentrification_metric}$	Zip Code	$gentrification_metric$
11216	9.514672	10002	-4.279068
10005	9.319955	11364	-4.334380
10007	7.550416	10469	-4.426066
11221	6.962212	10075	-4.876715
11237	6.824271	11358	-5.271829
11217	6.525964	11356	-5.323211
11238	6.513036	11355	-5.504511
11222	6.477974	11354	-6.682538
11101	6.033060	11239	-7.402178
11225	5.830092	10069	-8.647834



- 7.5

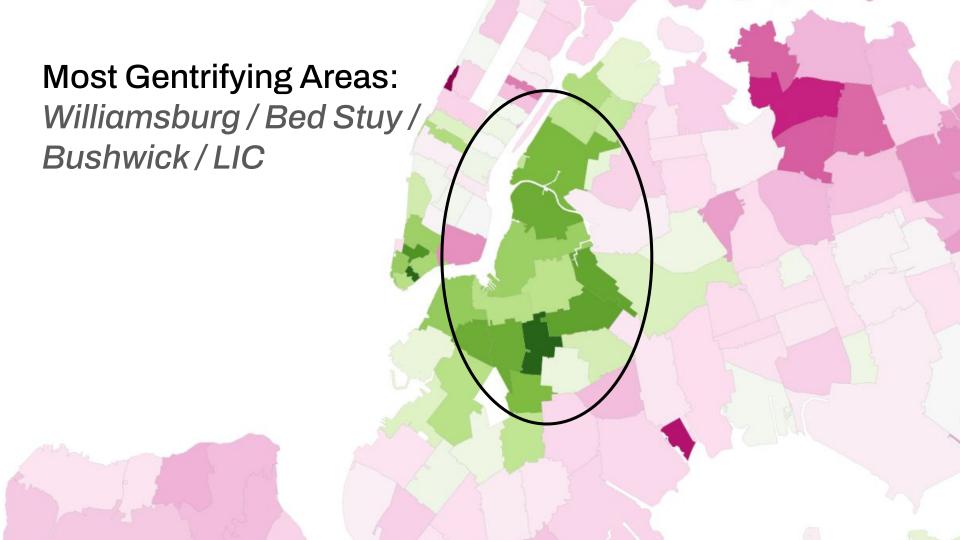
- 5.0

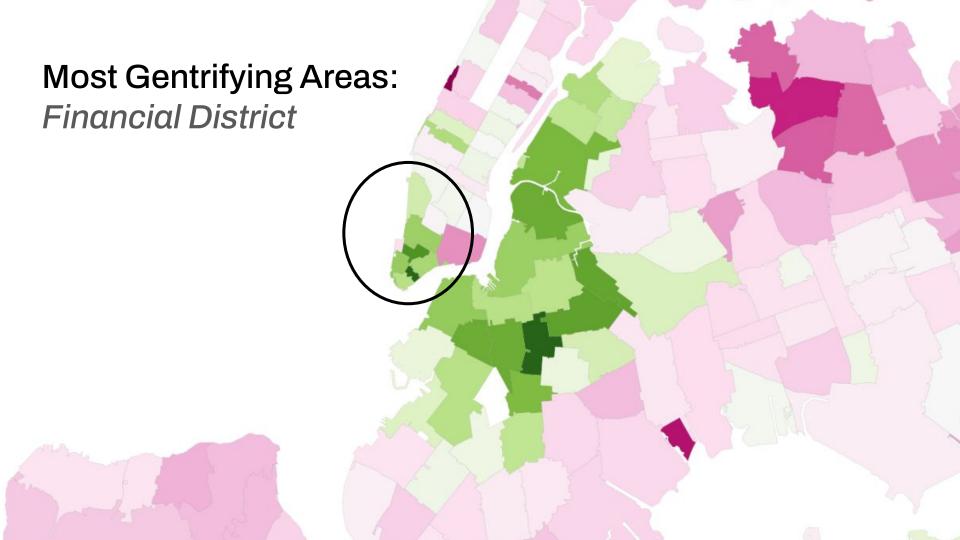
- 2.5

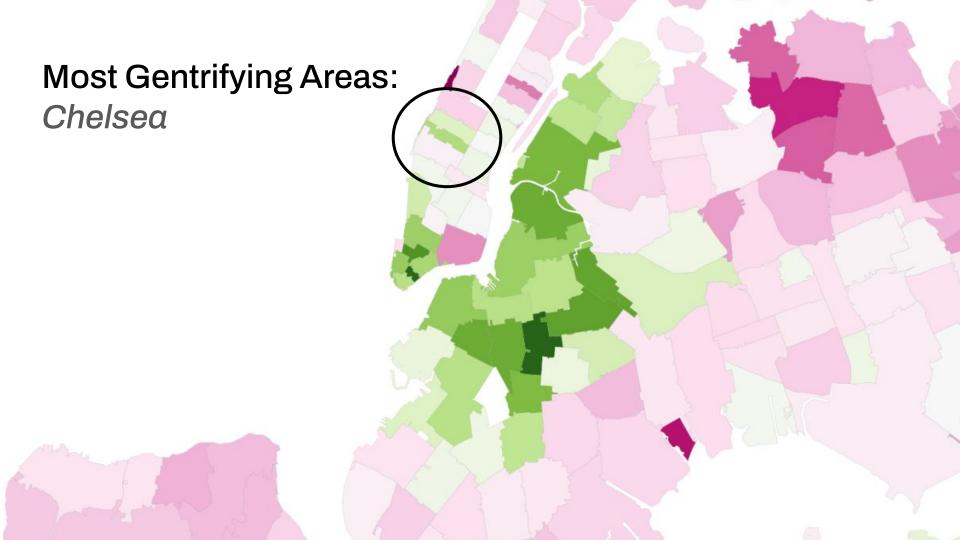
- 0.0

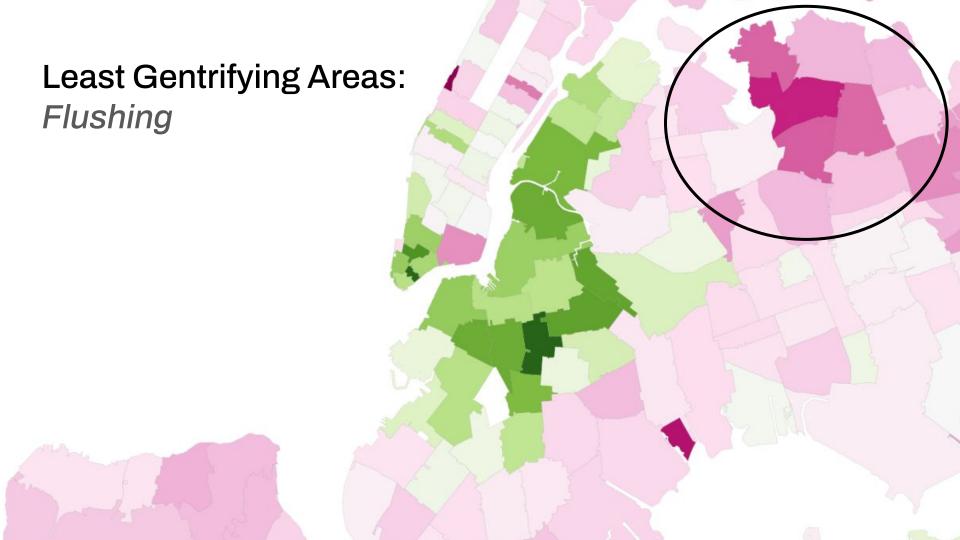
- -2.5

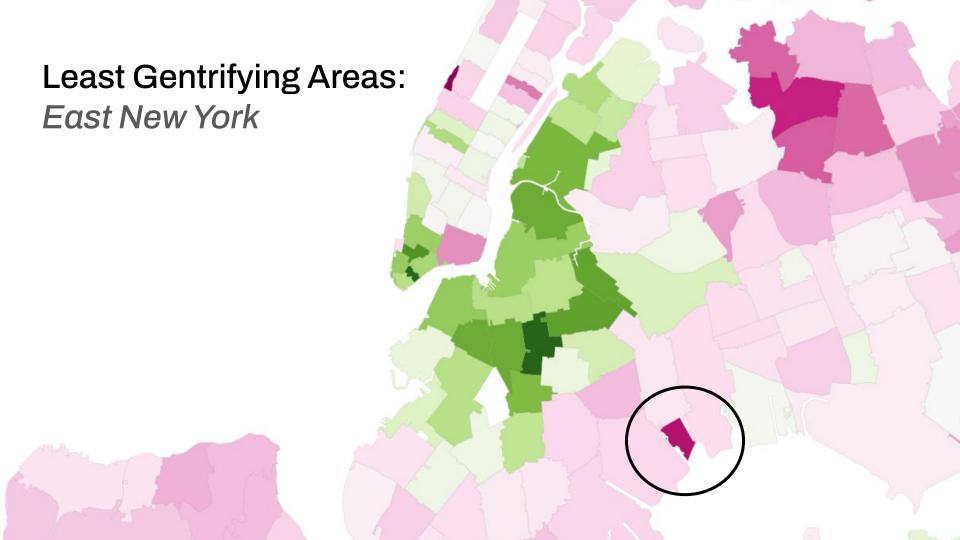
- -5.0



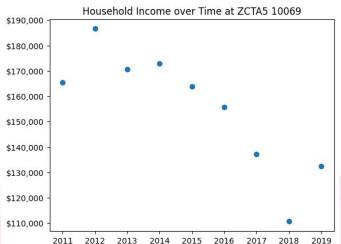


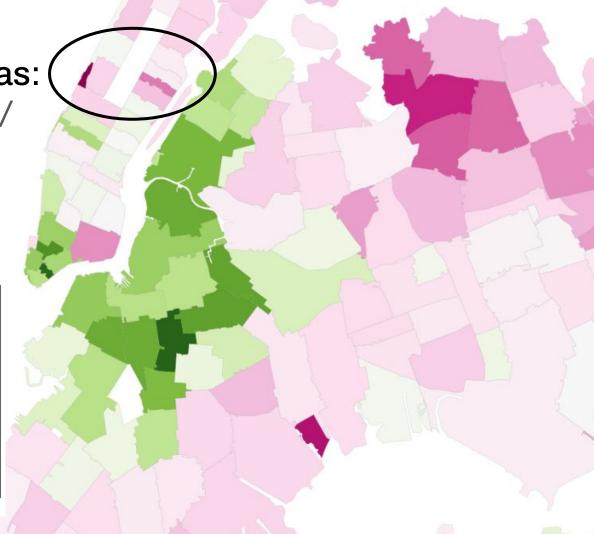






Least Gentrifying Areas: Riverside Park South / Yorkville





Thank You. Questions?