

Analysis of Gun Violence in 2019

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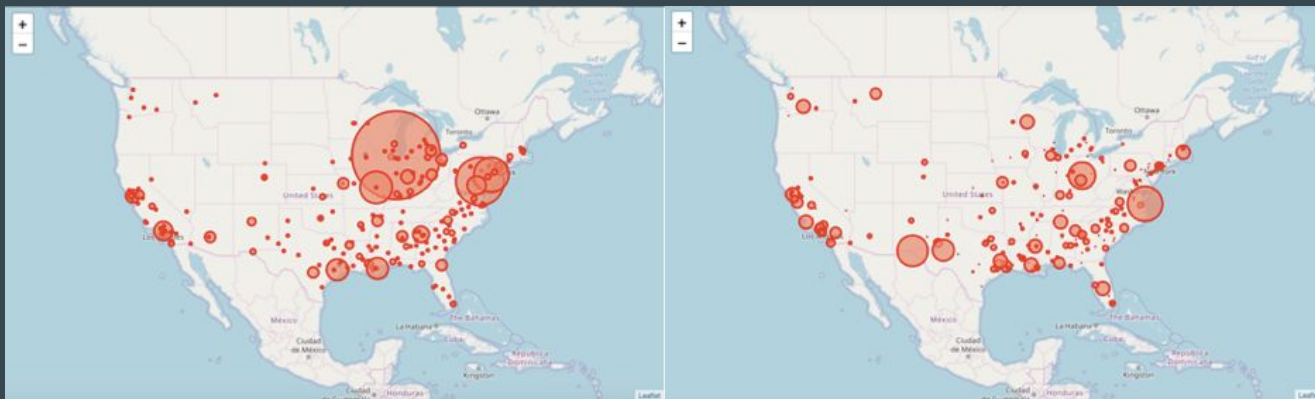
Lulu Ricketts -- March 2020

Overview

- Goal: to determine which locations are more at risk for violence and shootings
- Steps
 - 1. Understand data
 - 2. Cluster
 - via Per Capita Incomes
 - via location's venues

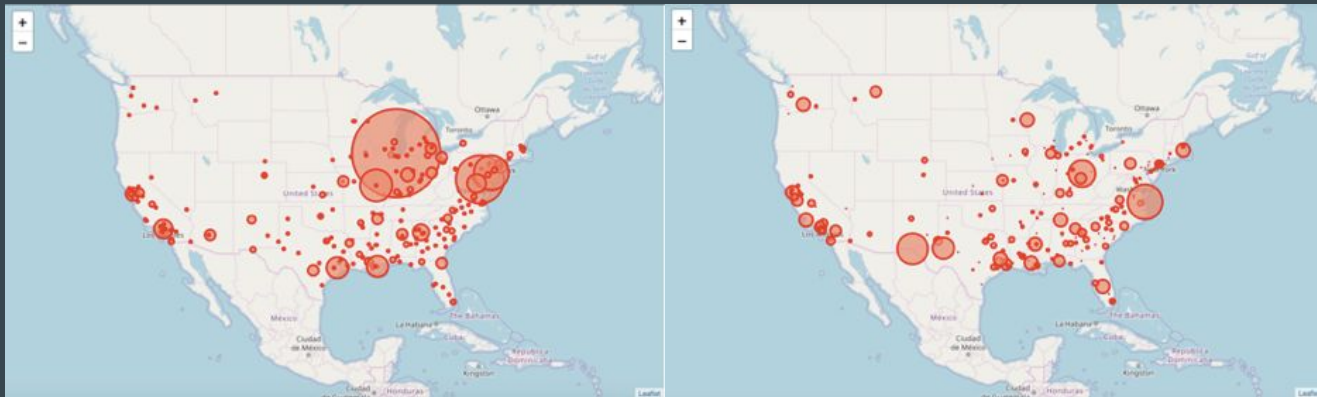
Understanding the Data

- The first step was to map the initial distributions in two ways:
 - 1: by the number of incidences for each location in 2019
 - 2: by the average number of people killed per incidence



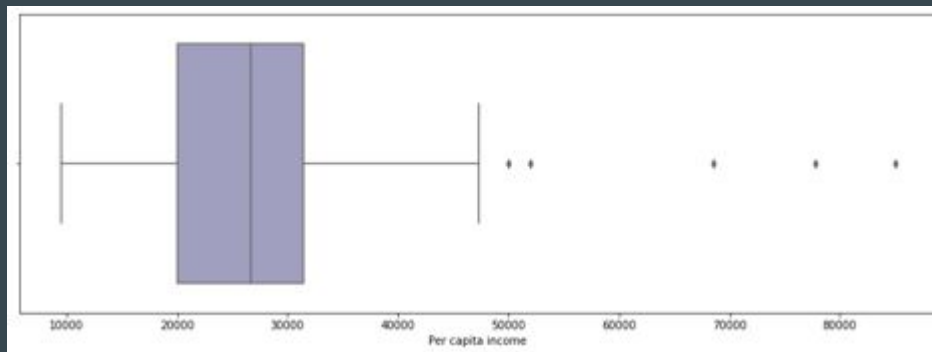
Understanding the Data

- Initial thoughts:
 - Number of incidences does not predict the violence of each incidence
 - “At risk” can mean either at risk of shootings or at risk of higher violence

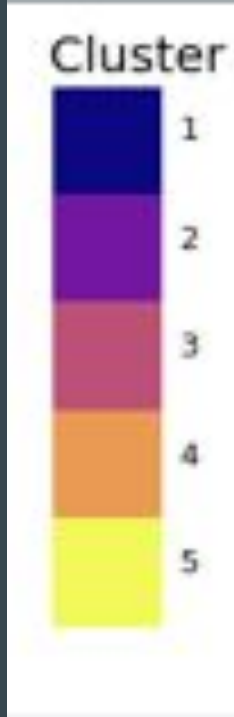


Cluster via Per Capita Incomes

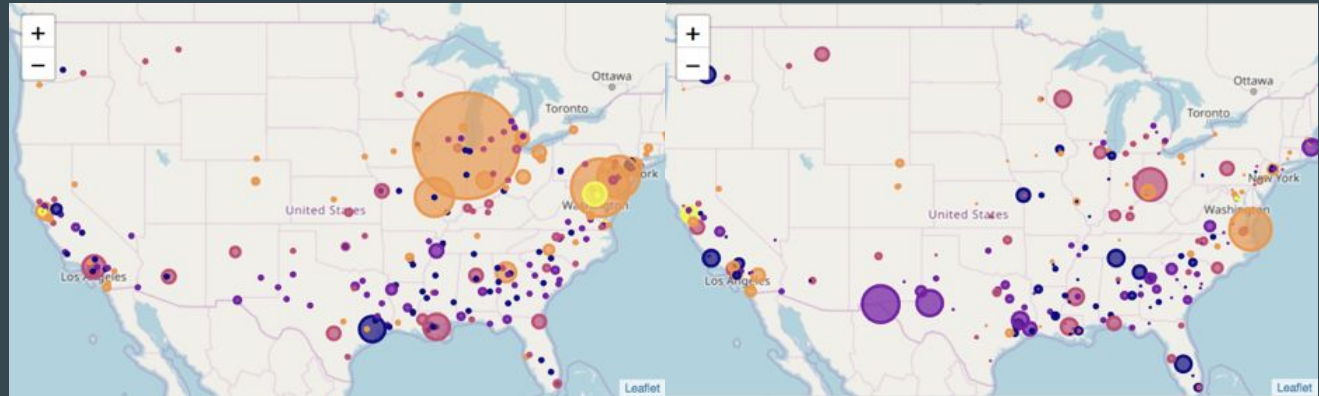
- 5 clusters created by quartiles of a boxplot
 - Cluster 1: first quartile, lower class
 - Cluster 2: second quartile, lower/mid class
 - Cluster 3: third quartile, middle class
 - Cluster 4: fourth quartile, upper middle class
 - Cluster 5: outlier, upper class



Cluster via Per Capita Incomes



- Higher income locations have more incidences
- Lower/mid income locations have more violence (people killed) per incidence



Cluster via Location's Venues

- Motivation: the venues in a location may give a description of that cluster and how it relates to per capita incomes
 - Could answer WHY some places are more at risk
- Strategy:
 - Use Foursquare Places API to get top 20 venues per location
 - One hot encode each unique venue
 - Use k-means clustering to form clusters

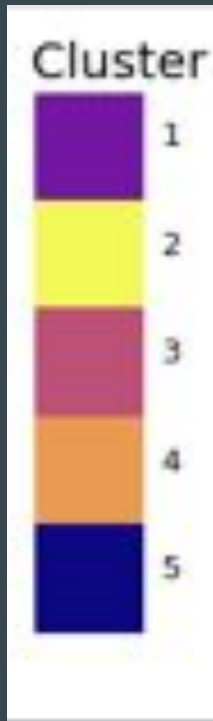
Cluster via Location's Venues

| | Address | Accessories Store | Adult Boutique | African Restaurant | Airport | American Restaurant | Antique Shop | Aquarium | Arcade | Arepa Restaurant | ... |
|---|---------------------------|-------------------|----------------|--------------------|---------|---------------------|--------------|----------|--------|------------------|-----|
| 0 | Abbeville, South Carolina | 0.0 | 0.0 | 0.0 | 0.0 | 0.00 | 0.0 | 0.00 | 0.0 | 0.0 | ... |
| 1 | Abington, Massachusetts | 0.0 | 0.0 | 0.0 | 0.0 | 0.10 | 0.0 | 0.00 | 0.0 | 0.0 | ... |
| 2 | Akron, Ohio | 0.0 | 0.0 | 0.0 | 0.0 | 0.05 | 0.0 | 0.00 | 0.0 | 0.0 | ... |
| 3 | Albany, Georgia | 0.0 | 0.0 | 0.0 | 0.0 | 0.10 | 0.0 | 0.05 | 0.0 | 0.0 | ... |
| 4 | Albuquerque, New Mexico | 0.0 | 0.0 | 0.0 | 0.0 | 0.05 | 0.0 | 0.00 | 0.0 | 0.0 | ... |

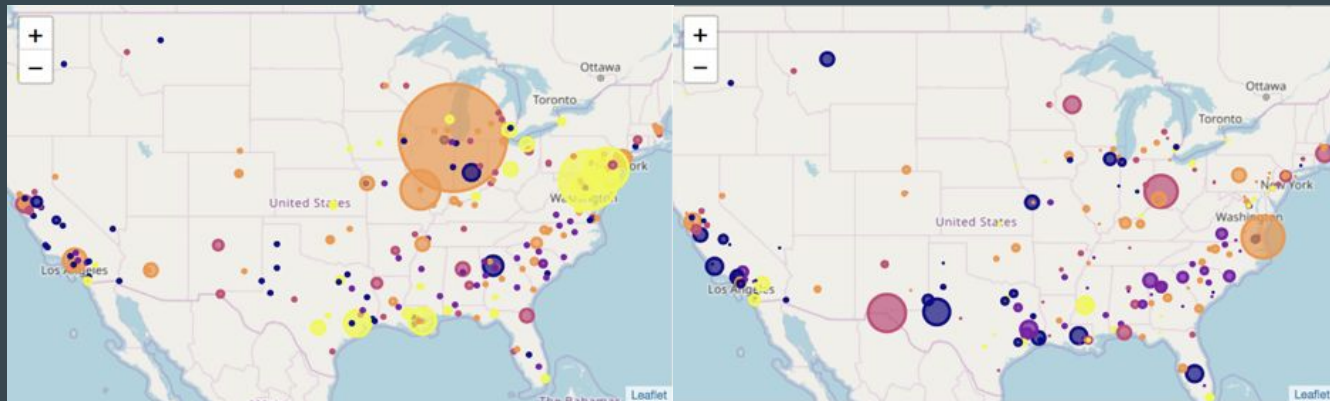


| | Address | 1st Most Common Venue | 2nd Most Common Venue | 3rd Most Common Venue | 4th Most Common Venue | 5th Most Common Venue | 6th Most Common Venue | 7th Most Common Venue |
|---|---------------------------|-----------------------|-----------------------|-----------------------|-----------------------|-----------------------|-----------------------|-----------------------|
| 0 | Abbeville, South Carolina | Gas Station | Discount Store | Fast Food Restaurant | Grocery Store | Mexican Restaurant | Fried Chicken Joint | Gym |
| 1 | Abington, Massachusetts | Coffee Shop | Liquor Store | Ice Cream Shop | Bar | American Restaurant | Pizza Place | Fast Food Restaurant |
| 2 | Akron, Ohio | Music Venue | Italian Restaurant | Performing Arts Venue | Deli / Bodega | Art Museum | Speakeasy | Food & Drink Shop |
| 3 | Albany, Georgia | American Restaurant | Donut Shop | BBQ Joint | Hotel | University | Plaza | Playground |
| 4 | Albuquerque, New Mexico | Bar | Café | Hotel | Design Studio | Plaza | Diner | Pizza Place |

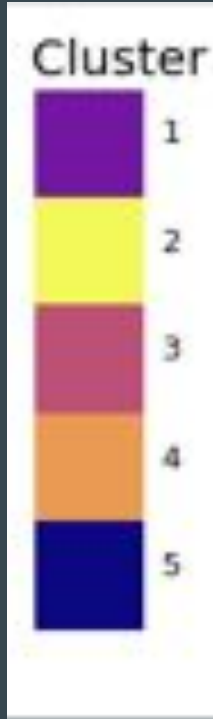
Cluster via Location's Venues



- Very similar to per capita income clusters
- BUT what do these clusters mean?



Cluster via Location's Venues



- Analyzed the top 3 venues per cluster, and these labels arose:

Cluster 1: Low income, smaller town

Cluster 2: Tourist City

Cluster 3: Nightlife City

Cluster 4: Middle class, large town

Cluster 5: City with high diversity

Relation Between Clusters

- Clusters align by color:
 - Align pretty intuitively with about what we would expect for each income class

| <u>Per capita Income</u> | | | <u>Location Venues</u> |
|--------------------------|-------|-------|--------------------------|
| Low Class | _____ | _____ | Highly Diverse |
| Low/Mid Class | _____ | _____ | Low income, smaller town |
| Middle Class | _____ | _____ | Nightlife City |
| Upper Middle Class | _____ | _____ | Middle class, large town |
| Upper Class | _____ | _____ | Tourist City |

Relation Between Clusters - Key Takeaways

- Higher per capita income correlates with:
 - More incidences per year
 - Less violence per incidence
 - More “At Risk” for shootings
- Lower per capita income correlates with:
 - Less incidences per year
 - More violence per incidence
 - More “At Risk” for fatalities
- These could possibly be due to population size as well

Future Direction

- Analyze correlations with population size
- More reliable dataset for per capita incomes
 - Maybe use median incomes
- Account for income discrepancies and fluctuations within large cities
 - Eg. Chicago has very rich and very poor areas