



# Crime and Demographics in the Mile High City

By Naureen Bharwani, Sean Mulligan, Cody Thornton





## Questions Sought to Answer

1

Does violent crime cluster in particular areas of Denver?

2

If so, do areas with higher concentrations of violent crime suffer from poorer health outcomes?

3

Do these areas have higher rates of poverty and lower levels of education?

4

Do these areas have larger minority populations as suggested by our literature survey?

# Tools



**GitHub**





# Data Preparation

- **Collection:** identifying relevant datasets with emphasis on ability to join on common attribute, Neighborhood
- **Preprocessing:** attribute reduction, clarification, and standardization; NaN values identified and eliminated





# Data Preparation

- **General Exploration:** what crimes are most common? what do Denver's demographics look like? what are violent crimes?
- **Neighborhood-Level Exploration:** which crimes occur where? are there significant demographic differences between neighborhoods?



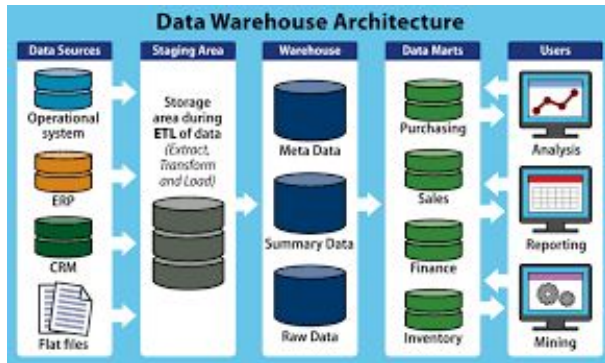


# Data Preparation

- **Integration:** consolidation and summarization of attributes; creation of 'violent crimes' dataset



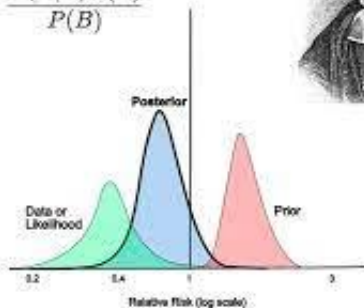




## Data Warehouse

- Consolidate data of interest under unified schema
- Multi-dimensional: counts, percentages, rankings

$$P(A|B) = \frac{P(B|A)P(A)}{P(B)}$$

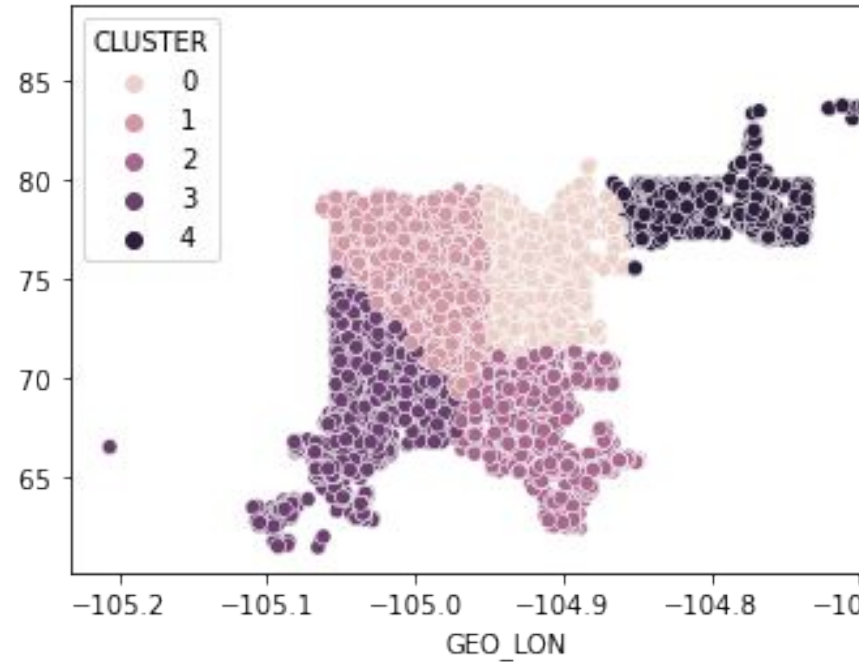


## Bayesian

- Preparation
- Binary Model
- Categorical Classifier

# K-Means

We treated violent crime data objects as two-dimensional Euclidean points based on their latitude and longitude. K-Means clustering yielded violent crime centroids in Denver.





We mapped these centroids along with the top five crime hot spots identified by the Denver Police Department and found significant overlap.





## Knowledge Gained

Compared to the state of Colorado,  
neighborhoods containing violent crime  
centroids have diminished health outcomes:

~21k

Violent Crimes

-2.8yr

Life Expectancy

+7.1%

Obesity Rate



## Knowledge Gained

...they also have higher rates of poverty on average and lower levels of education. They are also more racially diverse.

**+7%**

Poverty Rate

**-15.2%**

Higher Education

**+44.4%**

Racially Diverse



# Caveats:

**Neighborhoods defy easy classification.  
Correlation does not equal causation.**





## Further Applications and Additional Research



01

**Policing and  
violent crime  
prevention**

**Targeting  
Resources to  
Communities**



02



03

**Additional  
Research**



# Thank you!

**-Naureen, Sean, & Cody**

