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# Exploring Boston Real Estate Prices

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# Boston Overview

- 10th largest metropollitan area in the U.S.
- 4.8 million population
- Aprox. 90 square miles
- Major economic sectors: education, technology, biotech

# Housing Overview

- Median home value of \$630,000
  - Aprox. 148% appreciation since 2000
  - Many looking to buy real estate, either for purposes of home or investment earnings
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# Data Acquisition and Cleaning

## Zillow Home Value Index

- Aggregated dataset of houses segmented by zip code

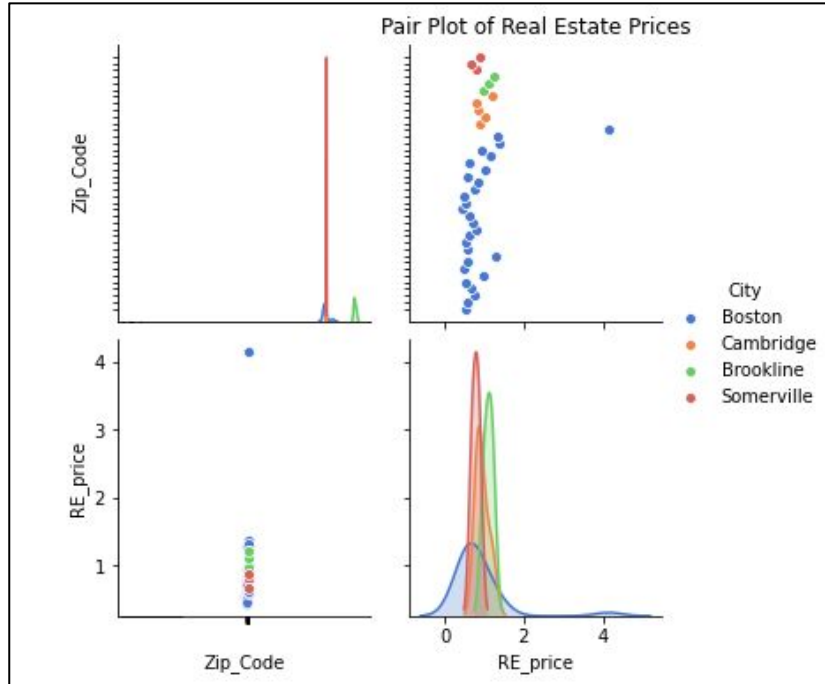
## Foursquare Venues API

- Used to gather venue data for individual zip codes

## Google Geocode API

- Generated latitude and longitude coordinates of zip code
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# Data Acquisition and Cleaning

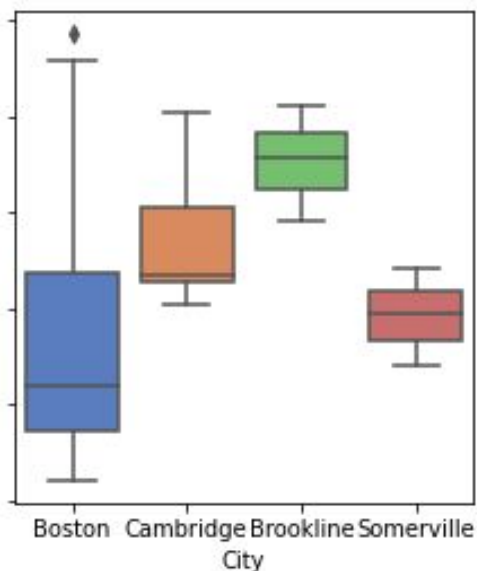
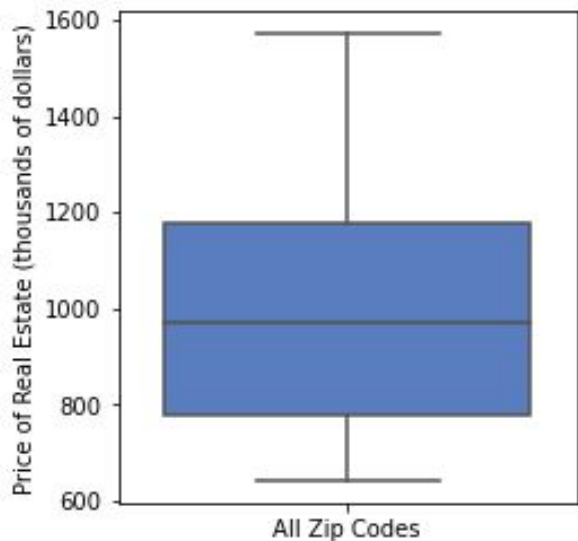


## Variables

- One clear outlier was identified (zip code 02199)
- Leaves with 38 individual zip codes

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# Feature Selection

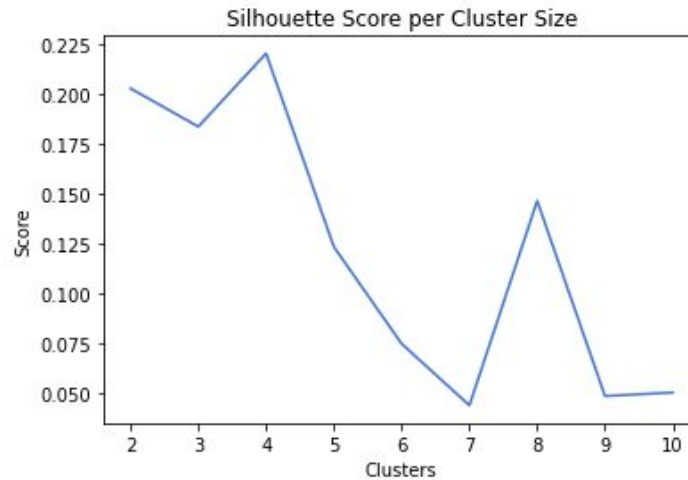
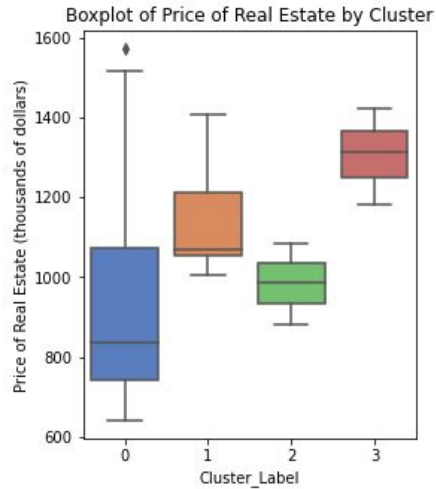


## City

- Included in the features due to apparent correlation
- Somerville was least correlated

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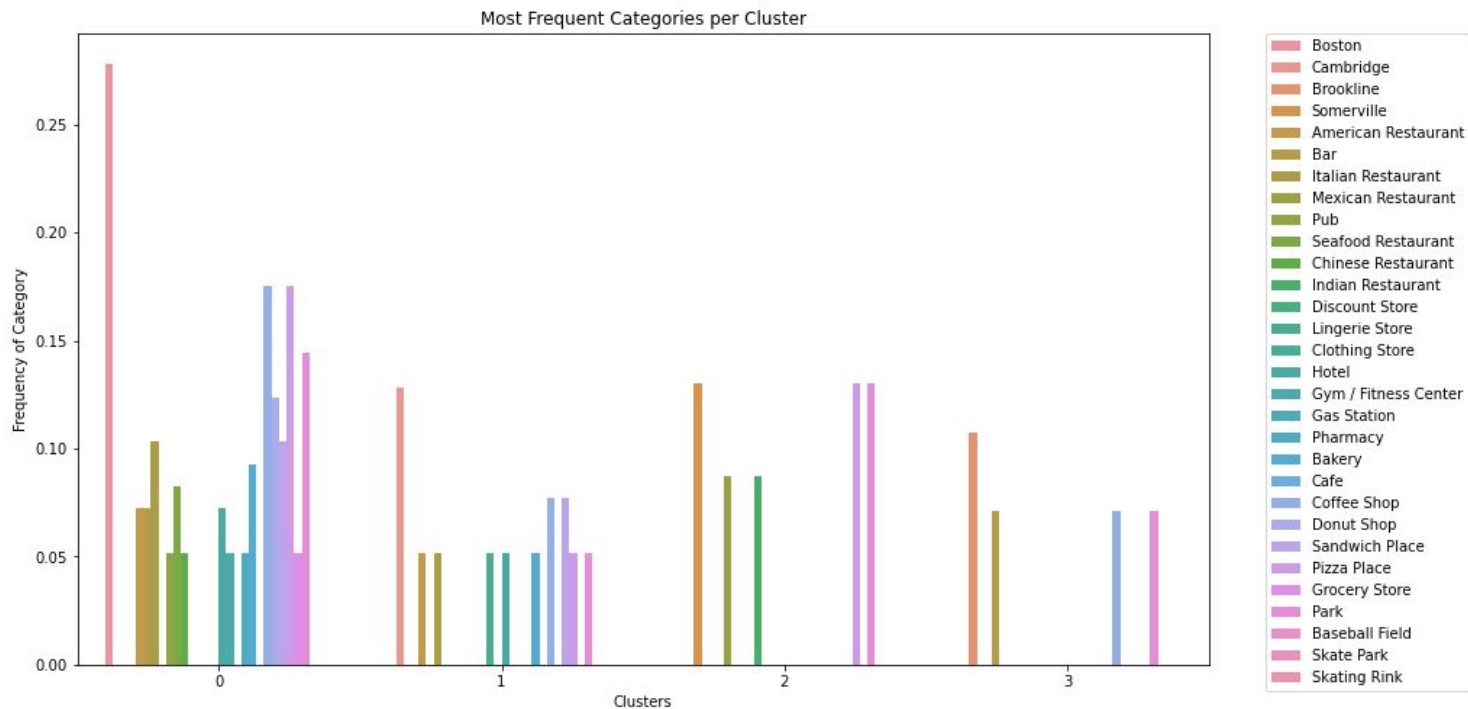
# K-Means Clustering



## Number of Clusters

- According to silhouette score, four clusters was selected
  - Possible correlation was seen in cluster divisions
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# K-Means Clustering





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# K-Means Clustering

## Cluster 1

- High frequency, Boston, QSRs, retail, public service

## Cluster 2

- Medium frequency, Cambridge, QSRs, retail

## Cluster 3

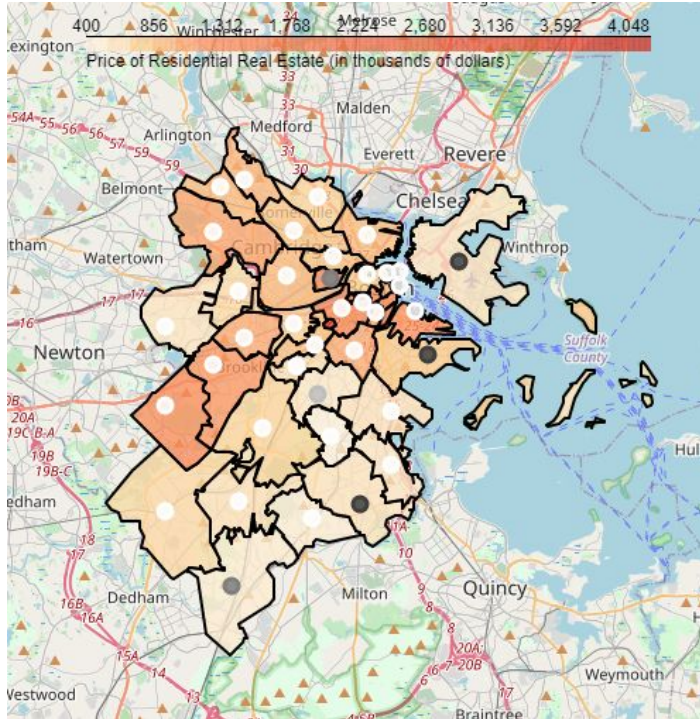
- Low frequency, Somerville, QSRs, retail

## Cluster 4

- Very low frequency, Brookline
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# K-Means Clustering



## Price of Real Estate vs Clusters

- Possible relationship between cluster label and real estate price observed
  - Primarily one cluster (white dots)
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# Statistical Testing and Modeling

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# Linear Regression

- Tested using five-fold cross validation with two feature sets: full dataset and highly correlated eight feature set
- Full Feature Mean Score: 0.09
- Selected Mean Score: 0.242
- No statistical significance

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# Random Forest Regression

- Tested using five-fold cross validation with two feature sets: full dataset and highly correlated eight feature set
  - Full Feature Mean Score: -0.42
  - Selected Mean Score: -0.06
  - No statistical significance
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# K-Means Clusters

- Tested using one-way ANOVA test with p-value  $\leq 0.05$
- F Statistic: 2.584
- P-Value: .069
- No statistical significance

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# Conclusion and Future Direction

## Modeling

- Attempts were unsuccessful due to small size of dataset. Not enough to successfully complete cross validation.

## Possible Improvements

- Need more exact information, such as pinpointed real estate prices
  - Comparison to larger sets of real estate price data, such as in other comparable cities
  - Better venue data - Foursquare can't provide all venues within a set geographic boundary
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