

A decorative graphic on the left side of the slide consisting of white lines and circles on a dark blue background, resembling a circuit board or data flow diagram.

DATA SCIENCE CAPSTONE

**RESEARCHING CRIME RATES AND COFFEE SHOPS IN ORANGE COUNTY,
CALIFORNIA, UNITED STATES OF AMERICA**

KELLY ANDERSON – APRIL 2019

DESCRIPTION OF THE PROJECT:

Research to see if there is a correlation between the number of Starbucks and sushi restaurants and crime rates for cities in Orange County, California.

My questions that I would like to research, and answer are:

- Does the number of Starbucks and/or Sushi restaurants (per capita), have any correlation to crime rates?
- Of the surrounding cities in Orange County, which are similar to the city that I live in as far as sushi restaurants, Starbucks, and crime rates per capita

DATA COLLECTION AND METHODOLOGY

- Crime Rate and Population Data:
- https://en.wikipedia.org/wiki/Orange_County,_California

Cities by population and crime rates [\[edit \]](#)

| Cities by population and crime rates [hide] | | | | | |
|---|----------------------------|--------------------------------|--------------------------------------|---------------------------------|---------------------------------------|
| City | Population ^[91] | Violent crimes ^[91] | Violent crime rate per 1,000 persons | Property crimes ^[91] | Property crime rate per 1,000 persons |
| Aliso Viejo | 48,999 | 43 | 0.88 | 415 | 8.47 |
| Anaheim | 344,526 | 1,279 | 3.71 | 10,070 | 29.23 |
| Brea | 40,253 | 74 | 1.84 | 1,292 | 32.10 |
| Buena Park | 82,505 | 206 | 2.50 | 2,066 | 25.04 |
| Costa Mesa | 112,635 | 254 | 2.26 | 4,079 | 36.21 |
| Cypress | 48,976 | 56 | 1.14 | 1,018 | 20.79 |
| Dana Point | 34,172 | 65 | 1.90 | 604 | 17.68 |
| Fountain Valley | 56,674 | 106 | 1.87 | 1,469 | 25.92 |

- Reference: United States Department of Justice, Federal Bureau of Investigation. [Crime in the United States, 2012, Table 8 \(California\)](#). Retrieved November 14, 2013.

DATA COLLECTION AND METHODOLOGY

Restaurant and Venue Data:

- Foursquare API to loop through cities to aggregate and consolidate by city

```
[269]: dfc.head()
```

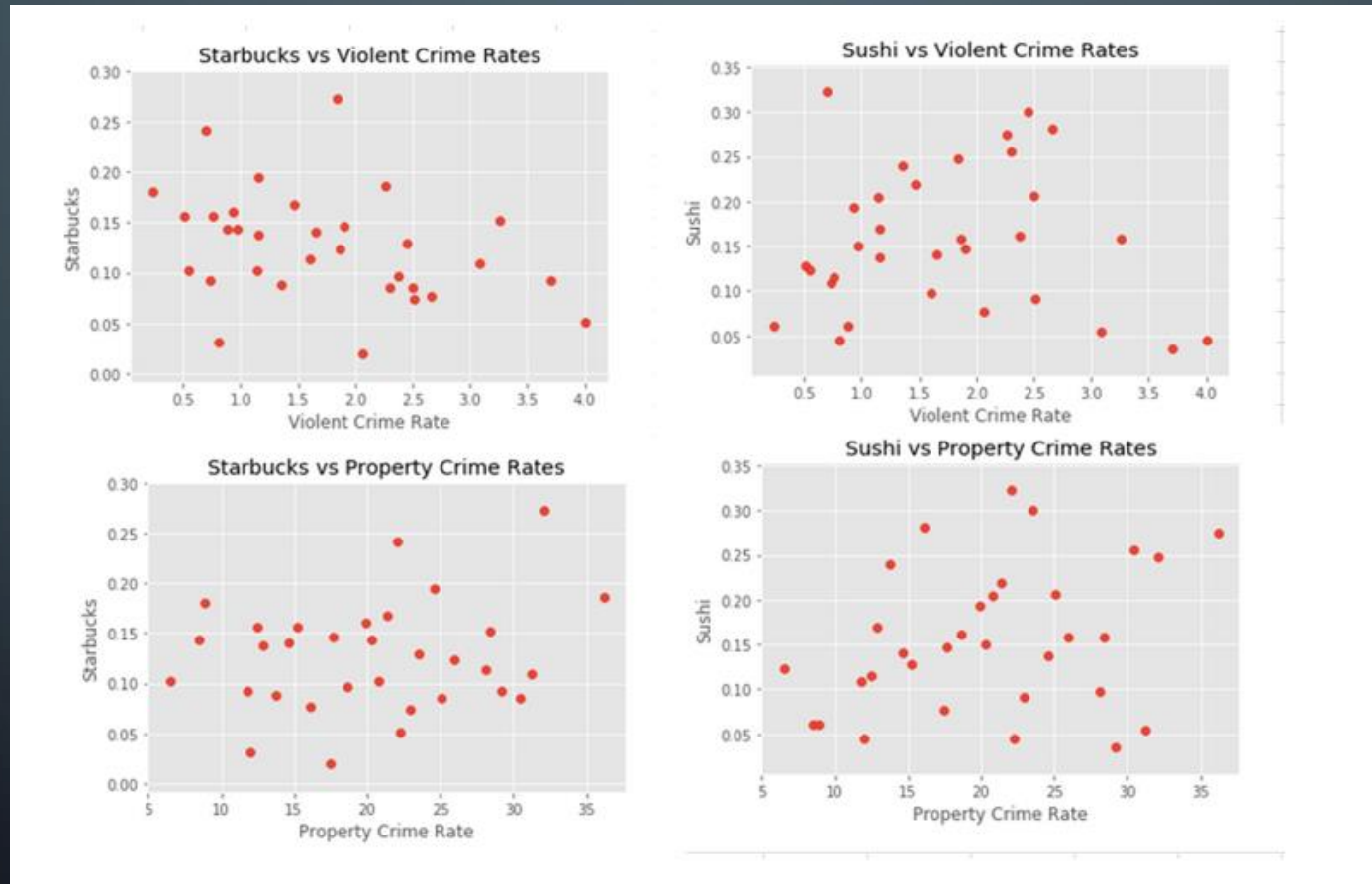
```
[269]:
```

| | id | location.address | location.city | name |
|---|--------------------------|------------------------|---------------|-----------|
| 0 | 4b4e6d97f964a5206bed26e3 | 27020 Alicia Pkwy | Laguna Niguel | Starbucks |
| 1 | 4ac8ea1cf964a52045bd20e3 | 23411 Aliso Viejo Pkwy | Aliso Viejo | Starbucks |
| 2 | 4bca132a511f9521d5f5aec7 | 27072 La Paz Rd | Aliso Viejo | Starbucks |
| 3 | 4b3bc69df964a520e97a25e3 | 28391 Marguerite Pkwy | Mission Viejo | Starbucks |
| 4 | 4baa360af964a5209e533ae3 | 25630 Alicia Pkwy | Laguna Hills | Starbucks |

```
[150]: dfc.to_csv('Starbucks_out.csv')
```



EXPLORATORY DATA ANALYSIS

- Scatterplot graphs of dependent and independent variables:





METHODOLOGY

- Simple Linear Regression Analysis
 - Multiple Linear Regression Analysis
 - K-means Clustering
- 



RESULTS

- No clear correlation between dependent and independent variables
- Sushi per capita vs Property Crime Rates

Mean absolute error: 6.46

Residual sum of squares (MSE): 68.77

R2-score: -8.45

- Starbucks per capita vs Property Crime Rates

Mean absolute error: 5.48

Residual sum of squares (MSE): 46.52

R2-score: -42.16

MULTIPLE LINEAR REGRESSION

- Using both values compared against the Property Crime rates we come up with the following values for the model:
- Residual sum of squares: 70.04
- Variance score: -0.97

CLUSTERING USING K-MEANS

- Four Clusters of cities for common features (Venues, Crime, and Population)

| | Population | Violent_crime_rate | Property_crime_rate | Starbucks_PC | Sushi_PC |
|--------|------------|--------------------|---------------------|--------------|----------|
| Labels | | | | | |
| 0 | 62238.0 | 1.391667 | 26.043333 | 0.204258 | 0.232801 |
| 1 | 212854.5 | 3.031667 | 27.035000 | 0.098625 | 0.080372 |
| 2 | 79833.7 | 0.826000 | 12.322000 | 0.128471 | 0.110207 |
| 3 | 48913.7 | 2.062000 | 20.938000 | 0.095249 | 0.203220 |

CLUSTER PROFILES

- Group 0- Medium Population, Medium crime, and lots of Starbucks and Sushi
- Group 1 - High population, highest crime, Lowest Starbucks and Sushi
- Group 2 - Medium population, lowest crime, medium Starbucks and Sushi
- Group 3 - Lowest population, Medium crime, Low Starbucks and high Sushi

SIMILAR CITIES TO LAGUNA BEACH, CA (HOME)

| | City | Population | Violent_crime_rate | Property_crime_rate | Starbucks_PC | Sushi_PC | Labels |
|----|-----------------|------------|--------------------|---------------------|--------------|----------|--------|
| 3 | Buena Park | 82505 | 2.50 | 25.04 | 0.084843 | 0.206048 | 3 |
| 5 | Cypress | 48976 | 1.14 | 20.79 | 0.102091 | 0.204182 | 3 |
| 6 | Dana Point | 34172 | 1.90 | 17.68 | 0.146319 | 0.146319 | 3 |
| 7 | Fountain Valley | 56674 | 1.87 | 25.92 | 0.123513 | 0.158803 | 3 |
| 12 | La Habra | 61731 | 2.38 | 18.63 | 0.097196 | 0.161993 | 3 |
| 13 | Laguna Beach | 23283 | 2.45 | 23.54 | 0.128849 | 0.300649 | 3 |
| 17 | Lake Forest | 79166 | 1.35 | 13.74 | 0.088422 | 0.240002 | 3 |
| 18 | Los Alamitos | 11728 | 2.30 | 30.44 | 0.085266 | 0.255798 | 3 |
| 22 | Placentia | 51778 | 2.07 | 17.50 | 0.019313 | 0.077253 | 3 |
| 28 | Stanton | 39124 | 2.66 | 16.10 | 0.076679 | 0.281157 | 3 |

OBSERVATIONS AND RECOMMENDATIONS

- No Clear Correlation
- More detailed data required for:
 - Larger sample size
 - Less variance for larger cities

CONCLUSION

- Even though some cities have a lot of Starbucks and Sushi restaurants, there is no indication that they have less crime.
- The clusters of cities are helpful for finding other places that fans of these venues, and low crime would like.
- Thanks! Kelly