ANALYSIS OF BUSINESS SITES IN BROOKLYN NEIGHBORHOODS

INTRODUCCION

BACKGROUND AND BUSINESS ANALYSIS

IN THIS CASE STUDY
A CLEARER VISION WILL BE GIVEN TO ENTER A NEW BUSINESS IN THE BROOKLYN DISTRICT.

TO ACHIEVE THE OBJECTIVE WE WILL DO AN ANALYSIS
WHERE ALL THE COMMERCIAL PREMISES OF ALL THE NEIGHBORHOODS OF THE BROOKLYN
DISTRICT WILL BE EXPLORED

WE WILL EXPLORE THEIR GEOGRAPHIC LOCATIONS, THEIR TYPES OF BUSINESSES, THE NAMES OF THE BUSINESSES AND THE NUMBER OF COMMERCIAL PLACES BY CATEGORY.

WE WILL ALSO ANALYZE THE MOST COMMON COMMERCIAL PREMISES, AND THE LESS COMMON ONES.

WITH THIS ANALYSIS
INTERESTED PERSONS OR COMPANIES MAY HAVE A CLEARER VISION TO ENTER A NEW BUSINESS IN THE BROOKLYN DISTRICT.

DATA ACQUISITION AND CLEANING

DATA SOURCE

TO ACHIEVE THE OBJECTIVE OF ANALYZING ALL THE COMMERCIAL PREMISES OF ALL THE NEIGHBORHOODS OF THE

BROOKLYN DISTRICT, WE BEGAN BY DOWNLOADING THE DATA OF THE CITY OF NEW YORK WITH ITS GEOGRAPHICAL

LOCATIONS FROM THE FOLLOWING LINK: <u>DATOS NEW YORK</u>

WITH THE HELP OF THE FOURSQUARE API, WE EXPLORE ALL THE BROOKLYN NEIGHBORHOODS WITH THEIR

COMMERCIAL PLACES AND CATEGORIES

DATA CLEANING

HAVING OBTAINED THE DATA FROM THE INDICATED SOURCES, WE MOVE ON TO THE NEXT PROCESS OF TRANSFORMING THE DATA INTO A PANDAS DATA FRAME TO SEGMENT AND GROUP THE DATA FOR THE NEIGHBORHOODS IN THE BROOKLYN BOROUGH.

AFTER CREATING THE NEW PANAS DATA FRAME WITH THE BROOKLYN DATA, AND OBTAINING THE BROOKLYN LATITUDE AND LONGITUDE VALUES, THEN THE BROOKLYN MAP IS CREATED.

WITH THE HELP OF THE FOURSQUARE API, WE SCANNED ALL THE BROOKLYN NEIGHBORHOODS WITH THEIR BUSINESS LOCATIONS AND CATEGORIES TO GENERATE THE DATA FRAME, AN IMAGE OF WHICH CAN BE SEEN IN THE FOLLOWING FIGURE 1.

IN THAT DATA FRAME, WE HAVE ALL THE NEIGHBORHOODS IN BROOKLYN WITH THE 10 MOST COMMON BUSINESS LOCATIONS FOR EACH NEIGHBORHOOD.

AT THE END OF THE CASE STUDY, WE WILL APPLY MACHINE LEARNING TECHNIQUES TO ANALYZE ALL THE INFORMATION BY CLUSTERS, AND

TO GET RESPONSES TO THE FOLLOWING REQUESTS:

MOST COMMON BUSINESS TYPES

LESS COMMON BUSINESS TYPES

MOST COMMON BUSINESS NAMES

LESS COMMON BUSINESS NAMES

HOW MANY MORE COMMON BUSINESS PREMISES EXIST

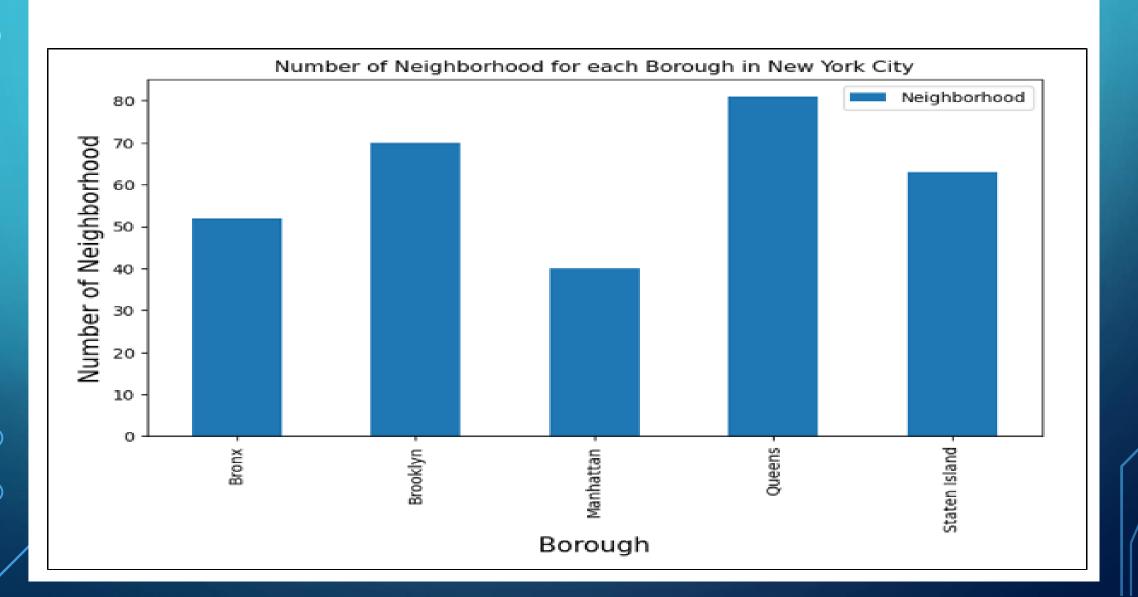
HOW MANY LESS COMMON BUSINESS PREMISES EXIST

NEIGHBORHOODS WITH THE 10 MOST COMMERCIAL PLACES

| | Neighborhood | 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 | 8th Most Common Venue | 9th Most Common Venue | 10th Most Common Venue |
|---|-----------------------|-----------------------------------|-----------------------------|-----------------------------|-----------------------------|-----------------------------|-----------------------------------|-----------------------------|-------------------------------|-----------------------------|------------------------------|
| 0 | Bath Beach | Bubble Tea Shop | Pharmacy | Italian Restaurant | Gas Station | Chinese Restaurant | Donut Shop | Dessert Shop | Fast Food Restaurant | Pizza Place | Cantonese Restaurant |
| 1 | Bay Ridge | Italian Restaurant | Spa | Pizza Place | Bar | American Restaurant | Greek Restaurant | Hookah Bar | Thai Restaurant | Bagel Shop | Pharmacy |
| 2 | Bedford Stuyvesant | Coffee Shop | Café | Pizza Place | Bar | Discount Store | Tiki Bar | Fried Chicken Joint | New American Restaurant | Boutique | Gift Shop |
| 3 | Bensonhurst | Chinese Restaurant | Italian Restaurant | Donut Shop | Sushi Restaurant | Park | Pizza Place | Ice Cream Shop | Smoke Shop | Bar | Noodle House |
| 4 | Bergen Beach | Harbor / Marina | Baseball Field | Hockey Field | Athletics & Sports | Playground | Park | Food | Flower Shop | Food & Drink Shop | Food Court |
| 5 | Boerum Hill | Coffee Shop | Dance Studio | Bar | Furniture / Home Store | Spa | Sandwich Place | Bakery | Arts & Crafts Store | French Restaurant | Yoga Studio |
| 6 | Borough Park | Bank | Pizza Place | Fast Food Restaurant | Café | Pharmacy | Eastern European Restaurant | Hotel | American Restaurant | Grocery Store | Deli / Bodega |
| 7 | Brighton Beach | Eastern European Restaurant | Restaurant | Russian Restaurant | Beach | Sushi Restaurant | Mobile Phone Shop | Pharmacy | Gourmet Shop | Playground | Korean Restaurant |

Exploratory Data Analysis

We pass the data of the neighborhoods of each district to a dataframe, and make a representative graph.



Predictive Modeling

APPLY MACHINE LEARNING - Cluster Neighborhoods

Run K-MEANS to group the 70 neighborhood into 10 groups.

```
# set number of clusters
kclusters = 10
Brooklyn_grouped_clustering = Brooklyn_grouped.drop('Neighborhood', 1)
Brooklyn_grouped_clustering
```

```
# run k-means clustering
kmeans = KMeans(n_clusters=kclusters, random_state=0).fit(Brooklyn_grouped_clustering)
# check cluster labels generated for each row in the dataframe
kmeans.labels_[0:10]
array([7, 7, 7, 7, 6, 7, 1, 7, 7, 7], dtype=int32)
```

We examine the Clusters

Now, we can examine each cluster and determine the categories of discriminating commercial places that distinguish each cluster.

Cluster 1

Clust_Brooklyn2.loc[Clust_Brooklyn2['Cluster Labels'] == 0, Clust_Brooklyn2.columns[[1] + list(range(5, Clust_Brooklyn2.shape[1]))]]

| | Neighborhood | 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 | 8th Most Common Venue | 9th Most Common Venue |
|----|---------------|-----------------------------|-----------------------------|-----------------------------|---------------------------------------|-----------------------------|-----------------------------|-----------------------------|-----------------------------|-----------------------------|
| 26 | East New York | Deli / Bodega | Salon / Barbershop | Fried Chicken Joint | Child Care Service | Plaza | Fast Food Restaurant | Pizza Place | Event Service | Conveniend |
| 43 | Ocean Hill | Deli / Bodega | Bus Stop | Supermarket | Southern / Soul Food Restaurant | Grocery Store | Park | Martial Arts School | Seafood Restaurant | Chinese Restaurant |
| 67 | Highland Park | Deli / Bodega | Moving Target | Grocery Store | Tennis Court | Park | Liquor Store | Spanish Restaurant | Caribbean Restaurant | Pizza Place |

Cluster 9

Clust_Brooklyn2.loc[Clust_Brooklyn2['Cluster Labels'] == 8, Clust_Brooklyn2.columns[[1] + list(range(5, Clust_Brooklyn2.shape[1]))]]

| | Neighborhood | 1st Most Common Venue | Most | 3rd Most Common Venue | | | | 7th Most Common Venue | | | 10th Most Commo Venue |
|----|--------------|-----------------------------|----------------|-----------------------------|------------------------|------------|----------------|-----------------------------|---------|----------|--------------------------------|
| 39 | Sea Gate | Beach | Bus Station | Spa | American Restaurant | Lighthouse | Sports Club | Home Service | Dog Run | Bus Line | Flea Market |

Cluster 10

Clust_Brooklyn2.loc[Clust_Brooklyn2['Cluster Labels'] == 9, Clust_Brooklyn2.columns[[1] + list(range(5, Clust_Brooklyn2.shape[1]))]]

| | Neighborhood | 1st Most Common Venue | 2nd Most Common Venue | | 4th Most Common Venue | | | | | 9th Most Common Venue | |
|----|--------------|-----------------------------|--------------------------------|------------------|-----------------------------|----------------|-----------------------|-----|---------------|-----------------------------|----------|
| 68 | Madison | Bagel Shop | Pilates Studio | Deli / Bodega | Dessert Shop | Candy Store | Italian Restaurant | Spa | Hobby Shop | Pizza Place | Restaura |

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CONCLUSIONS

Upon completion of the exploratory study and cluster analysis of all commercial locations in all neighborhoods in the brooklyn district, we can conclude the following:

In cluster 1 the most common commercial places are warehouses

In group 2, they are pizzerias

In group 3, they are car garage

In group 4, are the Caribbean Restaurants

In cluster 5, they are the pools

In group 6, they are the Grocery Store and Burger

In group 7, they are the Playground, Harbor / Marina, Athletics and Sports, Baseball Field and Hockey Field

In group 8, are the restaurants, Italian restaurants, Chinese, Latin, Russian and American restaurants

In cluster 9, they are the bus stations and Spa

In group 10 are the Bagel Shop