# The Battle of Neighborhoods: Ideal location for Indian Fast food Joint

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### 1. Introduction

## 1.1 Background

Opening a successful restaurant is all about location. Location can make or break a restaurant. Although a few universal criteria exist, not every restaurant is suitable for every location. The right location is determined by a combination of restaurant concept and ideal customer. Defining the restaurant type and identifying the target demographics helps in selecting the correct restaurant location which sets the business up for the success. A young restaurateur has chain of fast food joints across India and wishes to start one at New York as it is a 'City of dreams'. Generally, fast food is liked by age group of 15-35 years. It is a spontaneous outings that are often connected to another activity like shopping or an evening out with friends. Lower-income neighborhoods with high-population density and high foot traffic are key considerations for such joints. Data science with its established and effective analysis strategies can help the restaurateur to identify the ideal location for the new venture.

## 1.2 Problem Description

Indian cuisine is elaborate and has varied dishes with Fast food being the most popular one amongst the young generation. More than 50% Indians residing in New York are concentrated at Queens Borough. Also, the Indian restaurants present at Queens mainly cater to fine dining. Hence, venturing out a Fast food joint will surely tap the market early. The restaurateur needs help in identifying the right location at Queens which can be done using the data science approach.

#### 1.3 Problem Statement

To identify the ideal location for opening Fast food joint at Queens Borough using principles and techniques of data science.

## 2. Data Acquisition and Cleaning

#### 2.1 Data Sources

The data of New York is collected from <a href="https://cocl.us/new\_york\_dataset">https://cocl.us/new\_york\_dataset</a>. This dataset consists of 5 Boroughs of New York, their 306 neighborhoods and latitude and longitude of each neighborhood. From this data, geographical coordinates of Queens Borough and its neighborhoods are determined. There are 81 neighborhoods in Queens Borough. The venues in 500 meter radius of each neighborhood of Queens is obtained by querying the FOURSQUARE API. The dataset obtained as output from FOURSQUARE consists of 2083 venues from neighborhood of Queens.

### 2.2 Data Cleaning

The number of venues obtained from 81 neighborhoods of Queens Borough are 2083. The unique categories of venues are obtained using 'groupby' function of Pandas. The number of venues in each neighborhoods is also calculated.

#### 2.3 Feature Selection

As the project aims at finding location for Indian Fast food joint following features are selected.

- 1. No Indian restaurant in the neighborhood as presence of Indian restaurant will result in reduction in customers.
- 2. Presence of beach in the neighborhood as visitor might be interested in quick bite type of food and many youngsters visit the beach often.
- 3. Presence of Bowling Alley in the neighborhood as many youngsters visit
- 4. Presence of Flea market as many Indians and Indian tourists is fond of such a place
- 5. Presence of Metro station as it attracts many visitors and tourists
- 6. Presence of shopping mall
- 7. Presence of multiplex
- 8. Presence of park
- 9. Presence of scenic lookout
- 10. Movie theatre

## 3. Methodology

The data of New York is collected from <a href="https://cocl.us/new\_york\_dataset">https://cocl.us/new\_york\_dataset</a> which consisted data of 5 Boroughs of New York, their 306 neighborhoods and latitude and longitude of each neighborhood. From this data, geographical coordinates of Queens Borough and its neighborhoods are determined. There are 81 neighborhoods in Queens Borough. The venues in 500 meter radius of each neighborhood of Queens is obtained by querying the FOURSQUARE API. The dataset obtained as output from FOURSQUARE consists of 2090 venues from neighborhood of Queens. The data is grouped by neighborhood and total venues in each neighborhood is calculated.

In the next step, the neighborhoods with Indian restaurants are removed from the list to avoid division of customers. The nine venues are considered for further analysis as explained in feature selection. They include 'Beach', 'Bowling Alley', 'Flea Market', 'Metro station', 'Shopping Mall', 'Multiplex, 'Park', 'Scenic Lookout' and 'Movie Theater' and they are denoted as featured venues in this project. The neighborhoods with the maximum number of featured venues and maximum unique featured venues from above list is determined further using k-means clustering method. The objective is to identify those neighborhoods which satisfies two criteria i.e. more number of total featured venues and more number of unique featured venues.

#### 4. Results

The data of New York obtained from the link consisted of Borough, Neighborhood, Latitude and Longitude as shown in Table 4.1. The table shows first five rows while the data consisted 2090 rows indicating 5 boroughs and 306 neighborhoods.

	Borough	Neighborhood	Latitude	Longitude
0	Bronx	Wakefield	40.894705	-73.847201
1	Bronx	Co-op City	40.874294	-73.829939
2	Bronx	Eastchester	40.887556	-73.827806
3	Bronx	Fieldston	40.895437	-73.905643
4	Bronx	Riverdale	40.890834	-73.912585

Table 4.1 New York Data

From the New York data, data of Queens borough is filtered as shown in Table 4.2 which displays first five rows. The data consisted of 81 rows indicating 81 neighborhoods from Queens borough.

	Borough	Neighborhood	Latitude	Longitude
0	Queens	Astoria	40.768509	-73.915654
1	Queens	Woodside	40.746349	-73.901842
2	Queens	Jackson Heights	40.751981	-73.882821
3	Queens	Elmhurst	40.744049	-73.881656
4	Queens	Howard Beach	40.654225	-73.838138

Table 4.2 Queens Borough Neighborhood

Each of 81 neighborhoods are explored by querying Foursquare API and the results are displayed in table 4.3. The table shows first five rows, while the table actually consists of 2083 rows indicating that 2083 venues are resulted from response to query.

	Neighborhood	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
0	Astoria	40.768509	-73.915654	Favela Grill	40.767348	-73.917897	Brazilian Restaurant
1	Astoria	40.768509	-73.915654	Orange Blossom	40.769856	-73.917012	Gourmet Shop
2	Astoria	40.768509	-73.915654	Simply Fit Astoria	40.769114	-73.912403	Gym
3	Astoria	40.768509	-73.915654	CrossFit Queens	40.769404	-73.918977	Gym
4	Astoria	40.768509	-73.915654	Titan Foods Inc.	40.769198	-73.919253	Gourmet Shop

Table 4.3 Venues from each neighborhood of Queens

The venues are grouped by categories using 'groupby' function and the result indicated 272 unique categories of venues. The bar plot of all neighborhoods with unique categories is shown in figure 4.1.

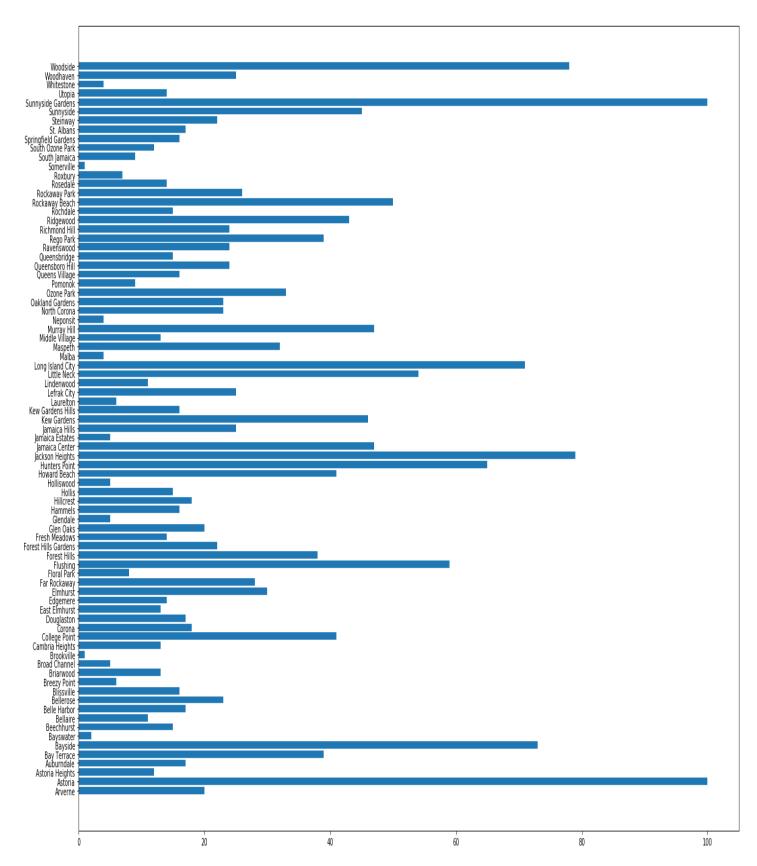


Figure 4.1 Bar plot of Neighborhood and number of venues

The figure indicates that two boroughs namely 'Astoria' and 'Sunnyside Gardens' have maximum number of venues and can be considered as potential locations for Fast food joint. But these two boroughs must satisfy criteria set in section 2.3. To perform that analysis, all boroughs consisting if Indian restaurants are removed from the table. The resulted table consisted of 68 neighborhoods as 13 neighborhoods has Indian restaurants nearby. These 13 neighborhoods also consisted of 'Astoria' and 'Sunnyside Gardens' and hence they are also removed from the list. The resulted list consisted of 68 neighborhoods and 272 unique venues.

Based on feature selection approach, only featured venues such as 'Beach', 'Bowling Alley', 'Flea Market', 'Metro station', 'Shopping Mall', 'Multiplex, 'Park', 'Scenic Lookout' and 'Movie Theater' are retained and others are removed. The list now consisted of 68 neighborhoods and 9 venues. The neighborhoods with at least one featured venue are retained and the ones with zero featured venues are removed from the list. Thus, the list consisted of 36 neighborhoods and 9 venues.

For each of 36 neighborhoods, total number of featured venues and total number of unique featured venues are calculated and presented as shown in table 4.4.

	Neighborhood	Total	Unique_Total
0	Arverne	3	2
2	Astoria Heights	1	1
4	Bay Terrace	2	2
7	Beechhurst	1	1
9	Belle Harbor	3	1
11	Blissville	1	1
12	Breezy Point	3	1
17	College Point	1	1
18	Corona	1	1
21	Edgemere	4	3
23	Far Rockaway	2	2
26	Forest Hills	2	1
27	Forest Hills Gardens	1	1
31	Hammels	5	1
33	Hollis	4	2
36	Hunters Point	5	4
38	Jamaica Center	1	1
43	Laurelton	1	1

44	Lefrak City	1	1
49	Maspeth	1	1
50	Middle Village	1	1
52	Neponsit	4	1
55	Ozone Park	1	1
56	Pomonok	3	3
58	Queensboro HIII	1	1
59	Queensbridge	2	2
65	Rockaway Beach	9	2
66	Rockaway Park	6	2
68	Roxbury	1	1
69	Somerville	1	1
71	South Ozone Park	3	1
72	Springfield Gardens	1	1
73	St. Albans	1	1
75	Sunnyside	1	1
79	Woodhaven	3	2
80	Woodside	1	1

Table 4.4 Shortlisted neighborhoods with total number of venues and total number of unique venues

The scatter plot of total number of unique venues vs total number of venues for each shortlisted neighborhood is shown in figure 4.2. The scatter plot shows only 13 points instead of 36 as there are some repeated coordinates.

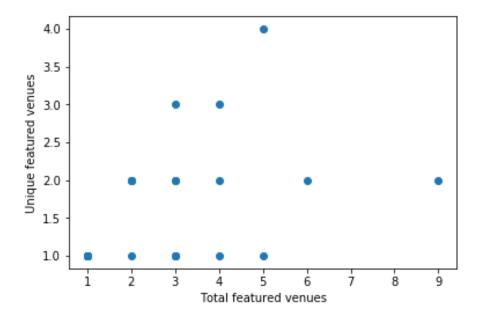


Figure 4.2 Scatter plot of total number of unique venues vs total number of venues for each shortlisted neighborhood

The clustering approach is used to identify the ideal location for Indian fast food joint from the 36 shortlisted neighborhoods. The 36 neighborhoods are divided into four clusters using k-means clustering approach. The four clusters with their mean values are shown in table 4.5. The scatter plot of neighborhoods and centroid of four clusters are shown in figure 4.3.

	Total	Unique_Total
Labels		
0	3.090909	1.545455
1	4.000000	3.333333
2	1.050000	1.000000
3	7.500000	2.000000

Table 4.5 Centroid of clusters

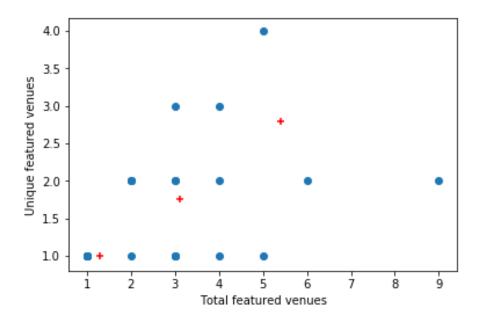


Figure 4.3 Scatter plot of neighborhoods and centroids of cluster The list of neighborhoods sorted by cluster is shown in table 4.6.

	Neighborhood	Total	Unique_Total	Labels
0	Arverne	3	2	0
79	Woodhaven	3	2	0
33	Hollis	4	2	0
31	Hammels	5	1	0
59	Queensbridge	2	2	0
71	South Ozone Park	3	1	0
23	Far Rockaway	2	2	0
9	Belle Harbor	3	1	0
4	Bay Terrace	2	2	0
12	Breezy Point	3	1	0
52	Neponsit	4	1	0
21	Edgemere	4	3	1
36	Hunters Point	5	4	1
56	Pomonok	3	3	1
72	Springfield Gardens	1	1	2
69	Somerville	1	1	2
55	Ozone Park	1	1	2
68	Roxbury	1	1	2

73         St. Albans         1         1           58         Queensboro Hill         1         1           75         Sunnyside         1         1           43         Laurelton         1         1           49         Maspeth         1         1           44         Lefrak City         1         1           38         Jamaica Center         1         1           27         Forest Hills Gardens         1         1           26         Forest Hills         2         1           18         Corona         1         1           17         College Point         1         1           11         Blissville         1         1           1         1         1         1           2         Astoria Heights         1         1           3         Middle Village         1         1					
75 Sunnyside 1 1 43 Laurelton 1 1 49 Maspeth 1 1 44 Lefrak City 1 1 38 Jamaica Center 1 1 27 Forest Hills Gardens 1 1 26 Forest Hills 2 1 18 Corona 1 1 17 College Point 1 1 11 Bilssville 1 1 7 Beechhurst 1 1 2 Astoria Heights 1 1 50 Middle Village 1 1	73	St. Albans	1	1	2
43 Laurelton 1 1 49 Maspeth 1 1 44 Lefrak City 1 1 38 Jamaica Center 1 1 27 Forest Hills Gardens 1 1 26 Forest Hills 2 1 18 Corona 1 1 17 College Point 1 1 11 Billssville 1 1 7 Beechhurst 1 1 2 Astoria Heights 1 1 50 Middle Village 1 1	58	Queensboro HIII	1	1	2
49       Maspeth       1       1         44       Lefrak City       1       1         38       Jamaica Center       1       1         27       Forest Hills Gardens       1       1         26       Forest Hills       2       1         18       Corona       1       1         17       College Point       1       1         11       Blissville       1       1         7       Beechhurst       1       1         2       Astoria Heights       1       1         50       Middle Village       1       1	75	Sunnyside	1	1	2
44       Lefrak City       1       1         38       Jamaica Center       1       1         27       Forest Hills Gardens       1       1         26       Forest Hills       2       1         18       Corona       1       1         17       College Point       1       1         11       Blissville       1       1         7       Beechhurst       1       1         2       Astoria Heights       1       1         50       Middle Village       1       1	43	Laurelton	1	1	2
38       Jamalca Center       1       1         27       Forest Hills Gardens       1       1         26       Forest Hills       2       1         18       Corona       1       1         17       College Point       1       1         11       Bilssville       1       1         7       Beechhurst       1       1         2       Astoria Heights       1       1         50       Middle Village       1       1	49	Maspeth	1	1	2
27       Forest Hills Gardens       1       1         26       Forest Hills       2       1         18       Corona       1       1         17       College Point       1       1         11       Bilssville       1       1         7       Beechhurst       1       1         2       Astoria Heights       1       1         50       Middle Village       1       1	44	Lefrak City	1	1	2
26     Forest Hills     2     1       18     Corona     1     1       17     College Point     1     1       11     Blissville     1     1       7     Beechhurst     1     1       2     Astoria Heights     1     1       50     Middle Village     1     1	38	Jamaica Center	1	1	2
18       Corona       1       1         17       College Point       1       1         11       Blissville       1       1         7       Beechhurst       1       1         2       Astoria Heights       1       1         50       Middle Village       1       1	27	Forest Hills Gardens	1	1	2
17       College Point       1       1         11       Blissville       1       1         7       Beechhurst       1       1         2       Astoria Heights       1       1         50       Middle Village       1       1	26	Forest Hills	2	1	2
11         Bilssville         1         1           7         Beechhurst         1         1           2         Astoria Heights         1         1           50         Middle Village         1         1	18	Corona	1	1	2
7 Beechhurst 1 1 2 Astoria Heights 1 1 50 Middle Village 1 1	17	College Point	1	1	2
2 Astoria Heights 1 1 50 Middle Village 1 1	11	Blissville	1	1	2
50 Middle Village 1 1	7	Beechhurst	1	1	2
	2	Astoria Heights	1	1	2
	50	Middle Village	1	1	2
80 Woodside 1 1	80	Woodside	1	1	2
65 Rockaway Beach 9 2	65	Rockaway Beach	9	2	3
66 Rockaway Park 6 2	66	Rockaway Park	6	2	3

Table 4.6 Shortlisted neighborhoods sorted by cluster

#### 5. Discussion

There are total 81 neighborhoods in Queens, New York. The bar plot of these 81 neighborhoods vs number of venues (figure 4.1) indicated 'Astoria' and 'Sunnyside Gardens' as potential neighborhood for Indian fast food joint as number of venues in those neighborhoods are maximum. But as both these neighborhoods have Indian restaurant, they are removed from the list. 68 neighborhoods are shortlisted which included those neighborhoods which do not have Indian restaurants. Out of these 68 neighborhoods, only 36 neighborhoods are retained as others do not have any featured venue. These 36 shortlisted neighborhoods are clustered using k-means clustering approach to create 4 clusters.

Cluster '2' has mean value of 1.05 for total featured venues and 1 for total number of unique featured venues. As this cluster has small value total featured venues as well as unique featured venues, it is not considered as ideal cluster for Indian fast food joint.

Cluster '0' has mean value of 3.09 for total featured venues and 1.54 for total number of unique featured venues. As this cluster has small value for unique featured venues, it is not considered as ideal cluster for Indian fast food joint.

Cluster '3' has mean value of 7.5 for total featured venues and 2 for total number of unique featured venues. This cluster has very high value for unique featured venues but has less value for unique featured venues. Hence, it is not considered as ideal cluster for Indian fast food joint.

Cluster '1' has mean value of 4 for total featured venues and 3.33 for total number of unique featured venues. As this cluster has high value for total featured venues as well as unique featured venues, it is an ideal cluster for Indian fast food joint.

Cluster '1' includes three neighborhoods namely 'Edgemere', 'Hunters Point' and Pomonok. 'Edgemere' has total 4 featured venues and 3 unique featured venues. 'Hunters Point' has total 5 featured venues and 4 unique featured venues. 'Pomonok' has total 3 featured venues and 3 unique featured venues. Hence, ideal location for Indian fast food joint be 'Hunters Point'.

### 6. Conclusion

Determination of correct location is very important for any new restaurant. The location has major role to play for a successful restaurant. The aim of this project is to find ideal location for Indian fast food joint in Queens, New York. After retrieving the data of neighborhoods from Queens, it is filtered based on absence of Indian restaurant and presence of 'Beach', 'Bowling Alley', 'Flea Market', 'Metro station', 'Shopping Mall', 'Multiplex, 'Park', 'Scenic Lookout' and 'Movie Theater. The shortlisted list is then clustered using k-means clustering approach into 4 clusters. The cluster with more number of total featured venues and total unique featured venues is selected as ideal cluster for the ideal location. This cluster includes 'Edgemere', 'Hunters Point' and Pomonok. The 'Hunters Point' neighborhood is selected as the ideal location for Indian fast food joint based on its score on total featured venues and total unique featured venues.

# 7. Future Scope

The approach of finding the ideal location for Indian fast food joint is based 9 features in this project. More number of features can be included such as 'Hostel', 'College Academic Building', 'Vegetarian/Vegan restaurant' etc.