

CAPSTONE PROJECT - THE BATTLE OF THE NEIGHBORHOODS

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INTRODUCTION: BUSINESS PROBLEM

In this project we will try to suggest an optimal location for buying an appartment. Specifically, this report will be targeted to stakeholders interested in byuying an **real** state in **Dhaka Division**, Bangladesh.

Since there are lots of areas in Dhaka we will try to detect **locations that are** included only in Dhaka district. We are also particularly interested in areas with restaurants and malls in vicinity. We would also prefer locations as close to public transportation as possible, assuming that first two conditions are met.

We will use our data science powers to generate a few most promissing neighborhoods based on this criteria. Advantages of each area will then be clearly expressed so that best possible final location can be chosen by stakeholders.

DATA

Based on definition of our problem, factors that will influence our decision are:

- 1. numbers of existing venues in the neighborhood (any type of venues)
- 2. number of and distance to public transport in the neighborhood, if any
- 3. distance of neighborhood from restaurants and shopping malls

We decided to use the Sub-Office of postal service, to define our neighborhoods.

Following data sources will be needed to extract/generate the required information:

- 1. The neighborhood location will be determined by using **Geopy**
- 2. number of venues and their type and location in every neighborhood will be obtained using Foursquare API

NEIGHBORHOOD CANDIDATES

Let's create latitude & longitude coordinates for centroids of our candidate neighborhoods. First we need to scrape the Dhaka district's neighbourhood locations and data from this <u>link</u> and then find the latitude & longitude of the neighborhoods, using specific, well known address and geopy.

DATA PROCESSING

The dataset contains 1 District, 48 Thana, 48 Sub office (neighbor), 809 unique venues and 35 unique venue categories. We extracted the venue and venue categories by using the Foursquare API.

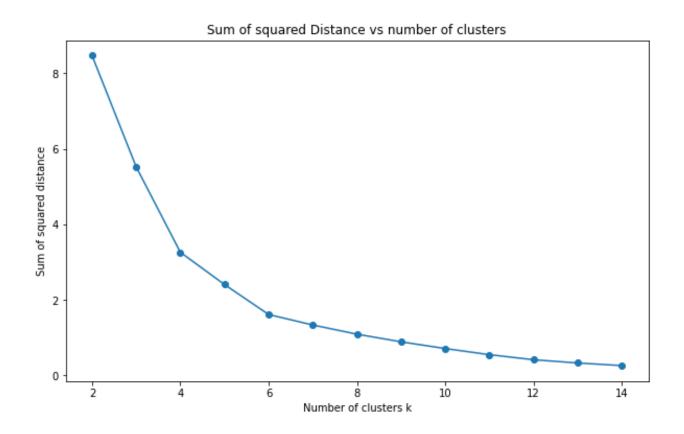
| | Neighborhood | ATM | American Restaurant | | Arts & Crafts Store | Arts & Entertainment | Asian Restaurant | BBQ Joint | Bakery | Bar | Beer Garden | Big Box Store | Bike Shop | Bistro | Boat or Ferry | Burger Joint |
|---|----------------------------|-----|------------------------|---|---------------------------|-------------------------|---------------------|--------------|--------|-----|----------------|---------------------|--------------|--------|---------------------|-----------------|
| 0 | Dhaka Cantonment TSO | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 1 | Dhaka Cantonment TSO | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 2 | Dhaka Cantonment TSO | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 3 | Dhaka Cantonment TSO | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 4 | Dhaka Cantonment TSO | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |

DATA PROCESSING CONT.

The Data frame consists of categorical values which we have to convert into numerical values for analyzing it. We used a one-hot encoding to convert the data set from the categorical variable.

| | Neighborhood | ATM | American Restaurant | Art Gallery | Arts & Crafts Store | Arts & Entertainment | Asian Restaurant | BBQ Joint | Bakery | Bar | Beer Garden | Big Box Store | Bike Shop | Bistro | Boat or Ferry | Burger Joint |
|---|----------------------------|-----|------------------------|----------------|---------------------------|-------------------------|---------------------|--------------|--------|-----|----------------|---------------------|--------------|--------|---------------------|-----------------|
| 0 | Dhaka Cantonment TSO | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 1 | Dhaka Cantonment TSO | 0 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 2 | Dhaka Cantonment TSO | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 3 | Dhaka Cantonment TSO | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 4 | Dhaka Cantonment TSO | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |

K MEAN CLUSTERING



We used K mean algorithm for this purpose. And we evaluated the number of K by reducing the SSE

- We used 'k-means++' as initializer.
- 2. n_init was set to 1000.
- 3. The max_iter: was set to 1000.

From the graph we can see that if we take 7 clusters then the SSE will be low enough.

MAPPING THE DATA

After clustering the dataset we plotted the location into folium map with different colors to visualize.



RESULT ANALYSIS: CLUSTER O

Cluster 0 is in Thana Keraniganj with Ati, Keraniganj, Dhaka Jute mills, and kalatia locations which have common attributes within but they have distinct differences with other clusters. The most common restaurant categories for this cluster are American and Turkish restaurants. They also have a cricket ground Department store farmers market within 1.5 KM range.

| | Thana | Neighborhood | Post Code | Cluster Labels | 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 | Latitude | Longitude |
|---|---------------|---------------------|--------------|-------------------|-----------------------------|-----------------------------|--------------------------------|--------------------------------|--------------------------------|-----------------------------|--------------------------------|--------------------------------|-----------------------------|---------------------------------|----------|-----------|
| | 19 Keraniganj | Kalatia | 1313 | 0 | American Restaurant | Turkish Restaurant | Fried Chicken Joint | Cricket Ground | Dentist's Office | Department Store | Dessert Shop | Donut Shop | Electronics Store | Farmers Market | 23.6982 | 90.3505 |
| | 1 Keraniganj | Ati | 1312 | 0 | American Restaurant | Turkish Restaurant | Fried Chicken Joint | Cricket Ground | Dentist's Office | Department Store | Dessert Shop | Donut Shop | Electronics Store | Farmers Market | 23.6982 | 90.3505 |
| : | 21 Keraniganj | Keraniganj | 1310 | 0 | American Restaurant | Turkish Restaurant | Fried Chicken Joint | Cricket Ground | Dentist's Office | Department Store | Dessert Shop | Donut Shop | Electronics Store | Farmers Market | 23.6982 | 90.3505 |
| | 8 Keraniganj | Dhaka Jute Mills | 1311 | 0 | American Restaurant | Turkish Restaurant | Fried Chicken Joint | Cricket Ground | Dentist's Office | Department Store | Dessert Shop | Donut Shop | Electronics Store | Farmers Market | 23.6982 | 90.3505 |

Cluster 1 consists of 11 Thanas. They are Gulshan, Mohammadpur, Khilkhet, Uttara, Khilgaon, Ramna, Tejgaon, Dhaka Sadar Dhanmondi, shabujbag, and Mirpur. we have analyzed 14 neighborhoods in this area. they are Khilkhet-TSO, Khilgaon-TSO, Uttara Model Town-TSO, Jigatala TSO, Gulshan Model Town, Sangsad Bhaban TSO, Mirpur TSO, Mohammadpur Housing, Shantinagr TSO, Dhaka Cantonment TSO, Basabo TSO, Tejgaon TSO, Banani TSO, and Badda. The most common item in these areas is Café, Fast Food Restaurant, Shopping Mall, and Hotel.

| | Thana | Neighborhood | Post Code | Cluster Labels | 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 | Most Common Venue | Latitude |
|----|-----------|-------------------------|--------------|-------------------|-----------------------------|-----------------------------|-----------------------------|-----------------------------|-----------------------------|-----------------------------|-----------------------------|-----------------------------|-----------------------------|-------------------------------|----------|
| 23 | Khilkhet | KhilkhetTSO | 1229 | 1 | Shopping Mall | Lounge | Coffee Shop | Hookah Bar | Indian Restaurant | Tea Room | Clothing Store | Gymnastics Gym | Light Rail Station | Bar | 23.8307 |
| 22 | Khilgaon | KhilgaonTSO | 1219 | 1 | Fast Food Restaurant | Shopping Mall | Café | Indian Restaurant | Plaza | Market | Coffee Shop | Light Rail Station | Lake | Comfort Food Restaurant | 23.7497 |
| 37 | Uttara | Uttara Model TownTSO | 1230 | 1 | Mexican Restaurant | Café | Department Store | Pizza Place | Restaurant | Ice Cream Shop | Asian Restaurant | BBQ Joint | Bakery | Market | 23.8755 |
| 16 | Dhanmondi | Jigatala TSO | 1209 | 1 | Café | Fast Food Restaurant | Restaurant | Shopping Mall | Bakery | Ice Cream Shop | Coffee Shop | Art Gallery | Asian Restaurant | Bus Station | 23.7471 |
| 14 | Gulshan | Gulshan Model Town | 1212 | 1 | Café | Hotel | Coffee Shop | Korean Restaurant | Asian Restaurant | Fast Food Restaurant | Italian Restaurant | Indian Restaurant | Nightclub | Ice Cream Shop | 23.79 |

In this study, Cluster 2 consists of one thana, Jaypara, with three neighborhood Joypara, Palamgani, and Narisha. The most common items in this location are Big Box store, Turkish Restaurant, and Fried Chicken Joint.

| | Thana | Neighborhood | Post Code | Cluster Labels | 1st Most Common Venue | 2nd Most Common Venue | 3rd Most Common Venue | 4th Most Common Venue | 5th Most Common Venue | 6th Most Common Venue | /th Most Common Venue | Most Common Venue | 9th Most Common Venue | 10th Most Common Venue | Latitude | Longitude |
|----|---------|--------------|--------------|-------------------|--------------------------------|-----------------------------|--------------------------------|--------------------------------|-----------------------------|-----------------------------|--------------------------------|-------------------------|-----------------------------|---------------------------------|----------|-----------|
| 17 | Joypara | Joypara | 1331 | 2 | Big Box Store | Turkish Restaurant | Fried Chicken Joint | Cricket Ground | Dentist's Office | Department Store | Dessert Shop | Donut Shop | Electronics Store | Farmers Market | 23.6076 | 90.125 |
| 27 | Joypara | Palamganj | 1331 | 2 | Big Box Store | Turkish Restaurant | Fried Chicken Joint | Cricket Ground | Dentist's Office | Department Store | Dessert Shop | Donut Shop | Electronics Store | Farmers Market | 23.6076 | 90.125 |
| 26 | Joypara | Narisha | 1332 | 2 | Big Box Store | Turkish Restaurant | Fried Chicken Joint | Cricket Ground | Dentist's Office | Department Store | Dessert Shop | Donut Shop | Electronics Store | Farmers Market | 23.6076 | 90.125 |

In this study, Cluster 3 consists of one thana, Savar, with ten neighborhoods Amin Bazar, Dairy Farm, Saver P.A.T.C, Rajphulbaria, EPZ, Kashem Cotton Mills, Jahangirnagar University, Savar Cantonment, Savar, and Shimulia. The most common items in this location are Shopping mall, Bus station, and market

| | Thana | Neighborhood | Post Code | Cluster Labels | 1st Most Common Venue | Most Common Venue | Most Common Venue | 4th Most Common Venue | Most Common Venue | Most Common Venue | 7th Most Common Venue | 8th Most Common Venue | 9th Most Common Venue | Most Common Venue | Latitude | Longitude |
|----|-------|----------------------|--------------|-------------------|-----------------------------|-------------------------|-------------------------|-----------------------------|-------------------------|-------------------------|-----------------------------|-----------------------------|-----------------------------|-------------------------|----------|-----------|
| 33 | Savar | Saver P.A.T.C | 1343 | 3 | Shopping Mall | Bus Station | Market | Turkish Restaurant | Food | Cricket Ground | Dentist's Office | Department Store | Dessert Shop | Donut Shop | 23.8477 | 90.2587 |
| 29 | Savar | Rajphulbaria | 1347 | 3 | Shopping Mall | Bus Station | Market | Turkish Restaurant | Food | Cricket Ground | Dentist's Office | Department Store | Dessert Shop | Donut Shop | 23.8477 | 90.2587 |
| 35 | Savar | Shimulia | 1345 | 3 | Shopping Mall | Bus Station | Market | Turkish Restaurant | Food | Cricket Ground | Dentist's Office | Department Store | Dessert Shop | Donut Shop | 23.8477 | 90.2587 |
| 32 | Savar | Savar Canttonment | 1344 | 3 | Shopping Mall | Bus Station | Market | Turkish Restaurant | Food | Cricket Ground | Dentist's Office | Department Store | Dessert Shop | Donut Shop | 23.8477 | 90.2587 |
| 31 | Savar | Savar | 1340 | 3 | Shopping Mall | Bus Station | Market | Turkish Restaurant | Food | Cricket Ground | Dentist's Office | Department Store | Dessert Shop | Donut Shop | 23.8477 | 90.2587 |

The Dhamrai thana's Kalampur is a cluster of its own, we can say this is an anomaly. the most common item of kalampur is market, Turkish Restaurant, and fried chicken joint.

| Thana | Neighborhood | Post Code | Cluster Labels | 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 | Latitude | Longitude |
|------------|--------------|--------------|-------------------|--------------------------------|-----------------------------|--------------------------------|--------------------------------|--------------------------------|-----------------------------|--------------------------------|--------------------------------|-----------------------------|---------------------------------|----------|-----------|
| 18 Dhamrai | Kalampur | 1351 | 4 | Market | Turkish Restaurant | Fried Chicken Joint | Cricket Ground | Dentist's Office | Department Store | Dessert Shop | Donut Shop | Electronics Store | Farmers Market | 23.9202 | 90.2109 |

Cluster 5 is a little different it has some of the historical sites. We call this cluster old Dhaka. It consists of Lalbag, Sutrapur, Motijheel and Jatrabari thana. The neighborhoods analyzed are Posta, Gandaria, Dilkusha, Dhania, and Bangabhaban. The most common items in this cluster are train stations, restaurants, and historic sites.

| | Thana | Neighborhood | Post Code | Cluster Labels | 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 |
|----|-----------|----------------|--------------|-------------------|-----------------------------|-----------------------------|-----------------------------|-----------------------------|-----------------------------|-----------------------------|-----------------------------|-----------------------------|-----------------------------|---------------------------------|
| 28 | Lalbag | Posta TSO | 1211 | 5 | Historic Site | Pizza Place | Restaurant | Asian Restaurant | Turkish Restaurant | Fast Food Restaurant | Cricket Ground | Dentist's Office | Department Store | Dessert Shop |
| 13 | Sutrapur | Gandaria TSO | 1204 | 5 | Train Station | Fast Food Restaurant | Restaurant | Outlet Store | Boat or Ferry | Cricket Ground | Dentist's Office | Department Store | Dessert Shop | Donut Shop |
| 11 | Motijheel | DilkushaTSO | 1223 | 5 | Restaurant | Hotel | Plaza | Soccer Field | Train Station | Fried Chicken Joint | Cosmetics Shop | Clothing Store | Bus Station | Indian Restaurant |
| 10 | Jatrabari | Dhania TSO | 1236 | 5 | Train Station | Intersection | Bus Station | Playground | Food | Cricket Ground | Dentist's Office | Department Store | Dessert Shop | Donut Shop |
| 4 | Motijheel | BangabhabanTSO | 1222 | 5 | Restaurant | Hotel | Plaza | Soccer Field | Train Station | Fried Chicken Joint | Cosmetics Shop | Clothing Store | Bus Station | Indian Restaurant |

Cluster 6 has two neighborhoods and they are both from sutrapur thana, they are Dhaka Sadar and wari. the most common item in this cluster in a food restaurant.

| | Thana | Neighborhood | Post Code | Cluster Labels | 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 |
|----|----------|-------------------|--------------|-------------------|-------------------------------|-----------------------------|-----------------------------|--------------------------------|--------------------------------|-----------------------------|--------------------------------|--------------------------------|-----------------------------|---------------------------------|
| 9 | Sutrapur | Dhaka Sadar HO | 1100 | 6 | Comfort Food Restaurant | Asian Restaurant | Turkish Restaurant | Fried Chicken Joint | Dentist's Office | Department Store | Dessert Shop | Donut Shop | Electronics Store | Farmers Market |
| 38 | Sutrapur | Wari TSO | 1203 | 6 | Comfort Food Restaurant | Asian Restaurant | Turkish Restaurant | Fried Chicken Joint | Dentist's Office | Department Store | Dessert Shop | Donut Shop | Electronics Store | Farmers Market |

CONCLUSION

The purpose of this project was to do everything a data scientist does every day in his life. The project gives enough opportunity to learn and exercise exciting new things. Though this project is not impactful enough, it is a start. I want to thank IBM and Coursera to bring such a good course for learning data science. Florent GERALD