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# BEST NEIGHBOURHOOD IN KARACHI FOR PURCHASING NEW HOMES

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## ABSTRACT:

Buying new house in Karachi is a difficult task, this project will help in finding a neighborhood which will be better for buying a house and moving in considering the desired requirements of people. We will utilize and manipulate the data to find the best locations based on venues, area size and number of bedrooms.

## INTRODUCTION

People in this fast paced and competitive world have to move and change homes. Changing homes within a big city takes a lot of effort and time and becomes a huge task which has severe consequences on their life. This project will compare different neighborhoods and will help people in their decision of which neighborhood is better.

## BUSINESS PROBLEM

In a big and expanding city with a population of approximately 2 crore new residencies are situated far from the center of the city. Shifting home/neighborhood in a large city is quite a challenging task and requires a wise decision. Many factors are to be taken in consideration when one shifts home.

The problem people shifting home are the availability of following in the new area:

- Restaurants
- Shopping centers
- Grocery Stores
- Parks
- Cinemas
- Transport buses

Everyone has their own favorite restaurant, coffee shop, the biggest problem comes in shopping centers as big shopping complexes are few in city, all of this results in people traveling larger distances when facilities are not available in their new area.

This assignment will help the people in making this decision and provide a comparison which locality is better in regards to facilities. We will cluster different localities and identify the facilities within their radius and formulate the results. With the help of this project people can choose houses based on which neighborhood has better facilities.

## DATA ACQUISITION AND WRANGLING

### DATA SOURCE

For this project we will use online data the source is from kaggle originally from zameen.com

CSV file with url:" <https://opendata.com.pk/dataset/9e959916-1cfc-4e28-85c8-f10ff63e5df2/resource/8c882a14-ee3f-4534-a15f-5fec2319d5e5/download/zameen-updated.csv> "

The data set lists all the advertisements for houses, flats, farm houses etc in the city of Karachi along with their coordinates longitude, latitude, price size etc from different localities of the city

## DATA CLEANING

The CSV dataset contains many homes from a locality, with different area size and number of rooms and prices, as shown below:

|   | property_id | location_id | page_url  | property_type | price    | location    | city      | province_name     | latitude  | longitude |
|---|-------------|-------------|---|---------------|----------|-------------|-----------|-------------------|-----------|-----------|
| 0 | 237062      | 3325        | <a href="https://www.zameen.com/Property/g_10_g_10_2_gr...">https://www.zameen.com/Property/g_10_g_10_2_gr...</a> | Flat          | 10000000 | G-10        | Islamabad | Islamabad Capital | 33.679890 | 73.012640 |
| 1 | 346905      | 3236        | <a href="https://www.zameen.com/Property/e_11_2_service...">https://www.zameen.com/Property/e_11_2_service...</a> | Flat          | 6900000  | E-11        | Islamabad | Islamabad Capital | 33.700993 | 72.971492 |
| 2 | 386513      | 764         | <a href="https://www.zameen.com/Property/islamabad_g_15...">https://www.zameen.com/Property/islamabad_g_15...</a> | House         | 16500000 | G-15        | Islamabad | Islamabad Capital | 33.631486 | 72.926559 |
| 3 | 656161      | 340         | <a href="https://www.zameen.com/Property/islamabad_bani...">https://www.zameen.com/Property/islamabad_bani...</a> | House         | 43500000 | Bani Gala   | Islamabad | Islamabad Capital | 33.707573 | 73.151199 |
| 4 | 841645      | 3226        | <a href="https://www.zameen.com/Property/dha_valley_dha...">https://www.zameen.com/Property/dha_valley_dha...</a> | House         | 7000000  | DHA Defence | Islamabad | Islamabad Capital | 33.492591 | 73.301339 |

The dataset is modified so it contains data for Karachi:

|     | property_id | location_id | page_url  | property_type | price     | location          | city    | province_name | latitude  | longitude |
|-----|-------------|-------------|---|---------------|-----------|-------------------|---------|---------------|-----------|-----------|
| 156 | 86575       | 6649        | <a href="https://www.zameen.com/Property/faisal_cantonm...">https://www.zameen.com/Property/faisal_cantonm...</a> | House         | 450000000 | Cantt             | Karachi | Sindh         | 24.889395 | 67.0986   |
| 157 | 342005      | 232         | <a href="https://www.zameen.com/Property/karachi_gulist...">https://www.zameen.com/Property/karachi_gulist...</a> | House         | 35000000  | Gulistan-e-Jauhar | Karachi | Sindh         | 24.914988 | 67.1387   |
| 158 | 466607      | 1484        | <a href="https://www.zameen.com/Property/d_h_a_dha_phas...">https://www.zameen.com/Property/d_h_a_dha_phas...</a> | Flat          | 21000000  | DHA Defence       | Karachi | Sindh         | 24.814367 | 67.0720   |
| 159 | 678919      | 9594        | <a href="https://www.zameen.com/Property/malir_malir_ka...">https://www.zameen.com/Property/malir_malir_ka...</a> | House         | 6500000   | Malir             | Karachi | Sindh         | 24.882302 | 67.1846   |
| 160 | 813506      | 6732        | <a href="https://www.zameen.com/Property/surjani_town_s...">https://www.zameen.com/Property/surjani_town_s...</a> | House         | 13000000  | Gadap Town        | Karachi | Sindh         | 25.018156 | 67.0668   |

A new dataframe is made by copying the important parameters required for our analysis which is:

|     | property_type | price     | location          | city    | latitude  | longitude | Area Size | bedrooms |
|-----|---------------|-----------|-------------------|---------|-----------|-----------|-----------|----------|
| 156 | House         | 450000000 | Cantt             | Karachi | 24.889395 | 67.098627 | 4.0       | 6        |
| 157 | House         | 35000000  | Gulistan-e-Jauhar | Karachi | 24.914988 | 67.138702 | 16.0      | 6        |
| 158 | Flat          | 21000000  | DHA Defence       | Karachi | 24.814367 | 67.072083 | 8.9       | 3        |
| 159 | House         | 6500000   | Malir             | Karachi | 24.882302 | 67.184677 | 3.2       | 2        |
| 160 | House         | 13000000  | Gadap Town        | Karachi | 25.018156 | 67.066864 | 9.6       | 4        |

In order to make data better and find the mean coordinates of a location, the data was grouped on basis of 'location' and aggregation of mean latitudes and longitude area, mean min max, prices and rooms , house value count was added it looked like below:

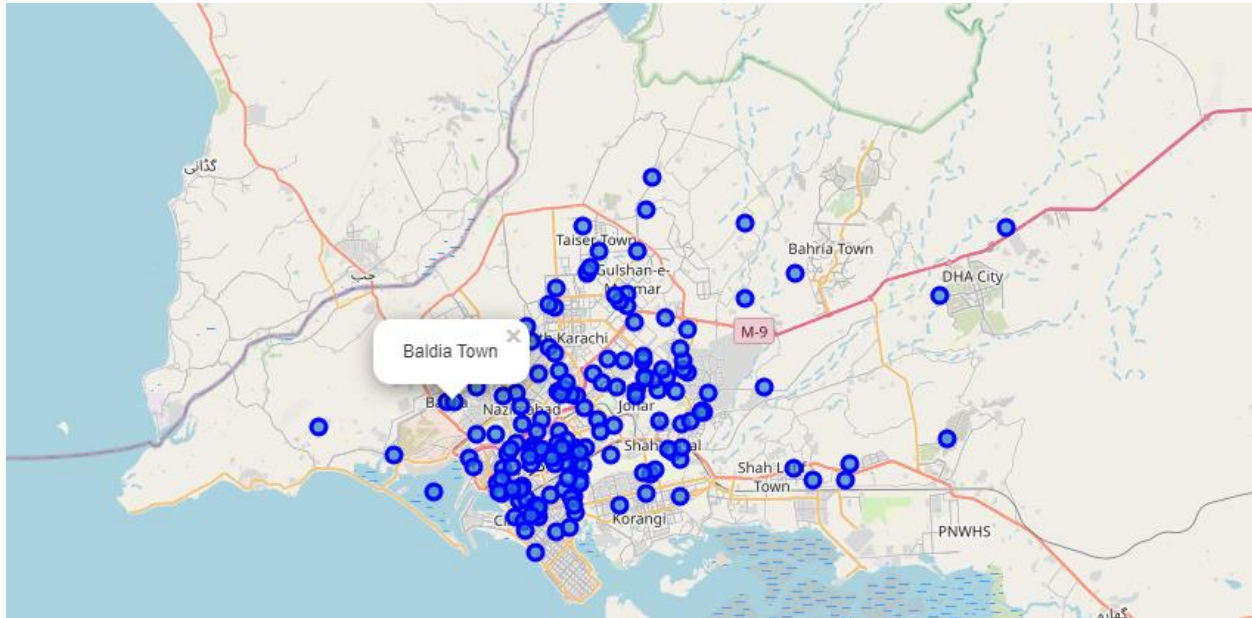
|   | property_type | location            | city    | mean_latitude | mean_longitude | price_mean   | price_min  | price_max   | area_mean | are_min | area_max | bedroom_mean | b |
|---|---------------|---------------------|---------|---------------|----------------|--------------|------------|-------------|-----------|---------|----------|--------------|---|
| 0 | Farm House    | Bahria Town Karachi | Karachi | 24.991752     | 67.255541      | 6.273810e+07 | 25000000.0 | 140000000.0 | 9.409524  | 6.0     | 19.4     | 0.523810     |   |
| 1 | Farm House    | Bin Qasim Town      | Karachi | 24.865622     | 67.284917      | 3.003625e+07 | 20000.0    | 120000000.0 | 17.000000 | 12.0    | 20.0     | 3.500000     |   |
| 2 | Farm House    | DHA City Karachi    | Karachi | 25.015873     | 67.418095      | 3.457357e+07 | 15000.0    | 70000000.0  | 4.142857  | 2.0     | 7.0      | 2.714286     |   |
| 3 | Farm House    | DHA Defence         | Karachi | 24.819653     | 67.077749      | 2.500000e+04 | 25000.0    | 25000.0     | 7.000000  | 7.0     | 7.0      | 2.000000     |   |
| 4 | Farm House    | Damba               | Karachi | 24.972520     | 67.259372      | 3.650000e+04 | 28000.0    | 45000.0     | 8.000000  | 8.0     | 8.0      | 0.000000     |   |

Further dataframe is modified so it contains data only for houses:

|   | index | property_type | location                                   | city    | mean_latitude | mean_longitude | price_mean   | price_min  | price_max   | area_mean | are_min | area_max | bedroom |
|---|-------|---------------|--|---------|---------------|----------------|--------------|------------|-------------|-----------|---------|----------|---------|
| 0 | 185   | House         | APP Employees Co-operative Housing Society | Karachi | 24.928572     | 67.157725      | 3.900000e+07 | 39000000.0 | 39000000.0  | 16.00     | 16.0    | 16.0     | 8.0     |
| 1 | 186   | House         | ASF Housing Scheme                         | Karachi | 24.937917     | 67.153713      | 7.000000e+06 | 7000000.0  | 7000000.0   | 4.80      | 4.8     | 4.8      | 4.0     |
| 2 | 187   | House         | Abdullah Ahmed Road                        | Karachi | 24.891224     | 66.988458      | 6.645000e+07 | 2900000.0  | 130000000.0 | 3.00      | 1.0     | 5.0      | 2.5     |
| 3 | 188   | House         | Abdullah Haroon Road                       | Karachi | 24.847829     | 67.031185      | 1.088000e+07 | 400000.0   | 30000000.0  | 8.36      | 1.0     | 16.0     | 4.2     |
| 4 | 189   | House         | Abid Town                                  | Karachi | 24.924261     | 67.082496      | 1.493257e+07 | 28000.0    | 28000000.0  | 4.80      | 1.8     | 9.6      | 4.7     |

## DATA UTILIZATION:

Using the longitude and latitude we plot a map of locations in Karachi as shown:



Using the data of mean latitude and longitude from the above data frame we find the venues in the radius using **Foursquare API** the results are stored as JSON file then the data is formulated into a dataframe, the dataset contains venue names, categories, latitude and longitude the table is shown below:

|   | Neighborhood                               | Neighborhood Latitude | Neighborhood Longitude | Venue                          | Venue Latitude | Venue Longitude | Venue Category       |
|---|--|-----------------------|------------------------|--------------------------------|----------------|-----------------|----------------------|
| 0 | APP Employees Co-operative Housing Society | 24.928572             | 67.157725              | Saien's Chai                   | 24.927310      | 67.160069       | Coffee Shop          |
| 1 | ASF Housing Scheme                         | 24.937917             | 67.153713              | Bin Hashim                     | 24.938233      | 67.151470       | Department Store     |
| 2 | ASF Housing Scheme                         | 24.937917             | 67.153713              | Muslim Pharmacy & Super Market | 24.938128      | 67.151982       | Shopping Mall        |
| 3 | ASF Housing Scheme                         | 24.937917             | 67.153713              | Food Time                      | 24.940111      | 67.151352       | Fast Food Restaurant |
| 4 | ASF Housing Scheme                         | 24.937917             | 67.153713              | Sindh Green Restaurant         | 24.939285      | 67.157438       | BBQ Joint            |
| 5 | Abdullah Ahmed Road                        | 24.891224             | 66.988458              | Shell                          | 24.893470      | 66.989346       | Gas Station          |
| 6 | Abdullah Haroon Road                       | 24.847829             | 67.031185              | Frere Hall                     | 24.846787      | 67.032243       | Historic Site        |
| 7 | Abdullah Haroon Road                       | 24.847829             | 67.031185              | Karachi Club                   | 24.844083      | 67.029199       | Social Club          |
| 8 | Abdullah Haroon Road                       | 24.847829             | 67.031185              | Sind Club Bistro               | 24.849628      | 67.031978       | Bistro               |

The dataframe is grouped on basis of location and aggregated on venue categories value count, this forms table below:

| Neighborhood                               | Venue Category       | Venue Category<br>value_counts |
|--|----------------------|--------------------------------|
|  |                      |                                |
| APP Employees Co-operative Housing Society | Coffee Shop          | 1                              |
| ASF Housing Scheme                         | BBQ Joint            | 1                              |
|  | Department Store     | 1                              |
|  | Fast Food Restaurant | 1                              |
|  | Shopping Mall        | 1                              |
|  | Gas Station          | 1                              |
| Abdullah Ahmed Road                        | Gas Station          | 1                              |
| Abdullah Haroon Road                       | Café                 | 2                              |
|  | Social Club          | 2                              |
|  | Asian Restaurant     | 1                              |
|  | Bistro               | 1                              |
|  | Fast Food Restaurant | 1                              |
|  | Historic Site        | 1                              |
|  | Hotel                | 1                              |
|  | Restaurant           | 1                              |

The above data set shows venues for each location

The data set is unstacked to find the venues in area, the column of total number of venues is added in dataset

| Venue Category                            | Venue Category<br>value_counts |                   |                    |                     |                  |                    |               |           |        |     |       |        |           |          |     | B<br>A |
|---|--------------------------------|-------------------|--------------------|---------------------|------------------|--------------------|---------------|-----------|--------|-----|-------|--------|-----------|----------|-----|--------|
|   | Accessories Store              | Afghan Restaurant | African Restaurant | American Restaurant | Asian Restaurant | Athletics & Sports | Auto Workshop | BBQ Joint | Bakery | Bar | Beach | Bistro | Bookstore | Boutique |     |        |
| Neighborhood                              |                                |                   |                    |                     |                  |                    |               |           |        |     |       |        |           |          |     |        |
| Shahrah-e-Pakistan                        | NaN                            | NaN               | NaN                | NaN                 | NaN              | NaN                | NaN           | NaN       | 3.0    | NaN | NaN   | NaN    | NaN       | NaN      | NaN |        |
| Siraj-ud-Daula Road                       | NaN                            | NaN               | NaN                | 1.0                 | NaN              | NaN                | NaN           | 2.0       | NaN    | NaN | NaN   | NaN    | NaN       | NaN      | NaN |        |
| Suparco Road                              | NaN                            | NaN               | NaN                | NaN                 | NaN              | NaN                | NaN           | 1.0       | NaN    | NaN | NaN   | NaN    | NaN       | NaN      | NaN |        |
| Super Highway                             | NaN                            | 2.0               | NaN                | NaN                 | NaN              | NaN                | NaN           | NaN       | NaN    | NaN | NaN   | NaN    | NaN       | NaN      | NaN |        |
| Surti Muslim Co-Operative Housing Society | NaN                            | NaN               | NaN                | NaN                 | NaN              | NaN                | NaN           | NaN       | NaN    | NaN | NaN   | NaN    | NaN       | NaN      | NaN |        |
| Tariq Road                                | NaN                            | NaN               | NaN                | NaN                 | NaN              | NaN                | NaN           | 2.0       | NaN    | NaN | NaN   | NaN    | NaN       | NaN      | NaN |        |
| Teacher Society                           | NaN                            | NaN               | NaN                | NaN                 | NaN              | NaN                | NaN           | NaN       | NaN    | NaN | NaN   | NaN    | NaN       | NaN      | NaN |        |
| Tipu Sultan Road                          | NaN                            | NaN               | NaN                | NaN                 | NaN              | NaN                | NaN           | NaN       | 1.0    | NaN | NaN   | NaN    | NaN       | NaN      | NaN |        |

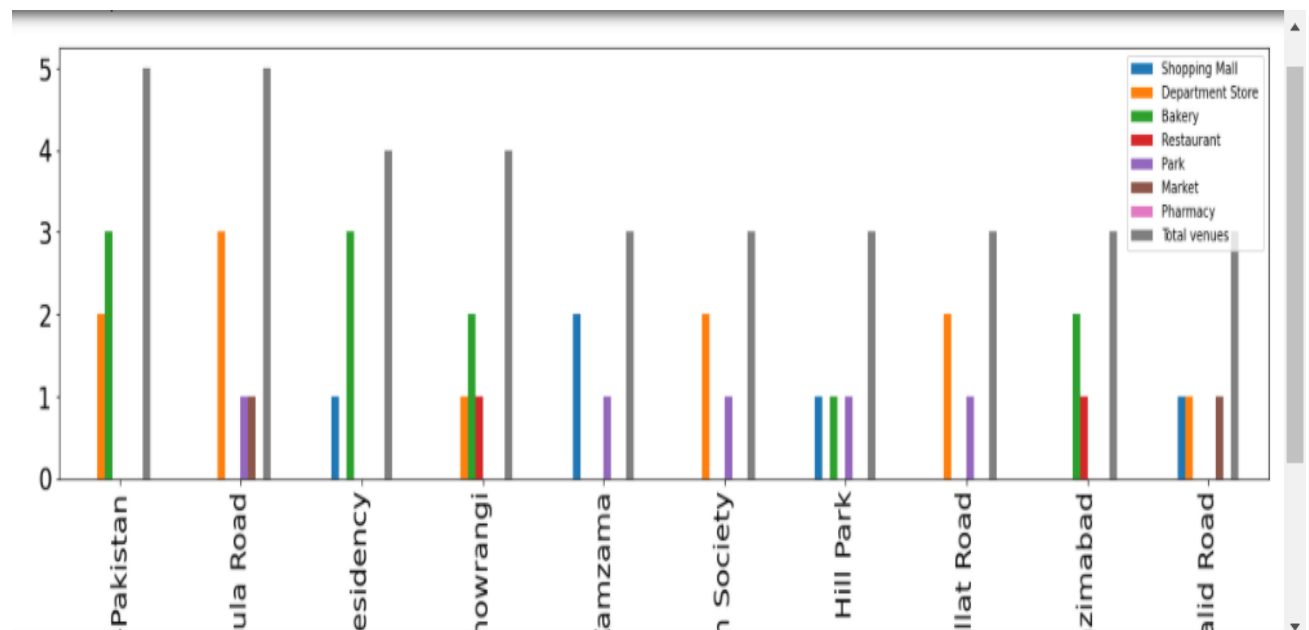


The venues categories which are useful for analysis is formed into a new dataframe. Further we sort locations which have highest number of venues as show below:

|   | location            | Shopping Mall | Department Store | Bakery | Restaurant | Park | Market | Pharmacy | Total venues |
|---|---------------------|---------------|------------------|--------|------------|------|--------|----------|--------------|
| 0 | Shahrah-e-Pakistan  | NaN           | 2.0              | 3.0    | NaN        | NaN  | NaN    | NaN      | 5.0          |
| 1 | Siraj-ud-Daula Road | NaN           | 3.0              | NaN    | NaN        | 1.0  | 1.0    | NaN      | 5.0          |
| 2 | Blue Bell Residency | 1.0           | NaN              | 3.0    | NaN        | NaN  | NaN    | NaN      | 4.0          |
| 3 | Maskan Chowrangi    | NaN           | 1.0              | 2.0    | 1.0        | NaN  | NaN    | NaN      | 4.0          |
| 4 | Zamzama             | 2.0           | NaN              | NaN    | NaN        | 1.0  | NaN    | NaN      | 3.0          |
| 5 | Others              | 1.0           | NaN              | NaN    | 1.0        | NaN  | 1.0    | NaN      | 3.0          |
| 6 | Darul Aman Society  | NaN           | 2.0              | NaN    | NaN        | 1.0  | NaN    | NaN      | 3.0          |
| 7 | Hill Park           | 1.0           | NaN              | 1.0    | NaN        | 1.0  | NaN    | NaN      | 3.0          |
| 8 | Shaheed Millat Road | NaN           | 2.0              | NaN    | NaN        | 1.0  | NaN    | NaN      | 3.0          |
| 9 | North Nazimabad     | NaN           | NaN              | 2.0    | 1.0        | NaN  | NaN    | NaN      | 3.0          |

## EXPLORATORY DATA ANALYSIS:

A bar plot of top 10 locations with most venues is plotted:



Lastly the two datasets are joined to compare locality venue counts with different parameters of the older dataframe.

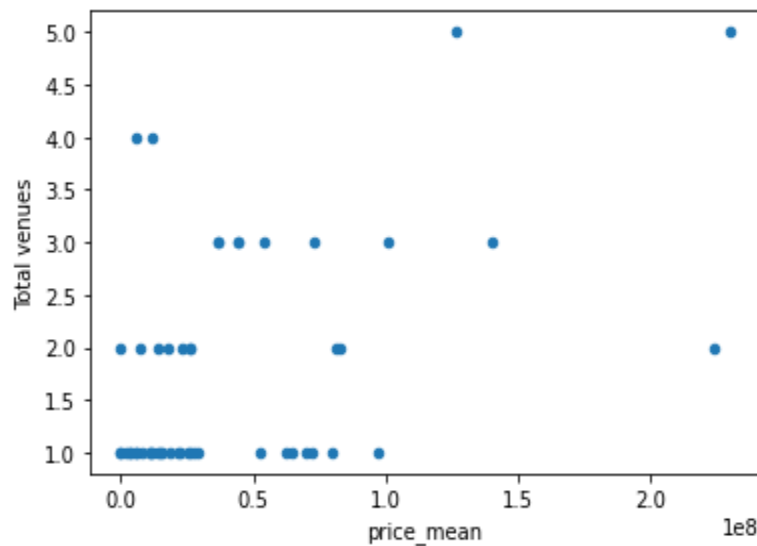
|          | location            | Shopping Mall | Department Store | Bakery | Restaurant | Park | Market | Pharmacy | Total venues | property_type | city    | mean_latitude | mean_longitude | price_mean |
|----------|---------------------|---------------|------------------|--------|------------|------|--------|----------|--------------|---------------|---------|---------------|----------------|------------|
| 0        | Shahrah-e-Pakistan  | NaN           | 2.0              | 3.0    | NaN        | NaN  | NaN    | NaN      | 5.0          | House         | Karachi | 24.934436     | 67.072266      | 1.265000   |
| 1        | Siraj-ud-Daula Road | NaN           | 3.0              | NaN    | NaN        | 1.0  | 1.0    | NaN      | 5.0          | House         | Karachi | 24.879682     | 67.068985      | 2.300000   |
| 2        | Blue Bell Residency | 1.0           | NaN              | 3.0    | NaN        | NaN  | NaN    | NaN      | 4.0          | House         | Karachi | 24.837117     | 67.035573      | 6.000000   |
| 3        | Maskan Chowrangi    | NaN           | 1.0              | 2.0    | 1.0        | NaN  | NaN    | NaN      | 4.0          | House         | Karachi | 24.934847     | 67.105248      | 1.160000   |
| 4        | Zamzama             | 2.0           | NaN              | NaN    | NaN        | 1.0  | NaN    | NaN      | 3.0          | House         | Karachi | 24.822799     | 67.040011      | 1.005878   |
| 6        | Darul Aman Society  | NaN           | 2.0              | NaN    | NaN        | 1.0  | NaN    | NaN      | 3.0          | House         | Karachi | 24.875484     | 67.068230      | 1.400000   |
| 7        | Hill Park           | 1.0           | NaN              | 1.0    | NaN        | 1.0  | NaN    | NaN      | 3.0          | House         | Karachi | 24.868021     | 67.071147      | 3.638095   |
| Shahheed |                     |               |                  |        |            |      |        |          |              |               |         |               |                |            |

## CORRELATION OF PARAMETERS

### Hypothesis 1

Null Hypothesis  $H_0$ : price\_mean is not correlated with Total\_venues

Alternative Hypothesis  $H_1$ : price\_mean is correlated with Total\_venues



## Hypothesis 1

Null Hypothesis  $H_0$ : price\_mean is not correlated with Total\_venues

Alternative Hypothesis  $H_1$ : price\_mean is correlated with Total\_venues

```
In [46]: import scipy.stats
```

```
In [47]: scipy.stats.pearsonr(df_combined['price_mean'], df_combined['Total_venues'])
```

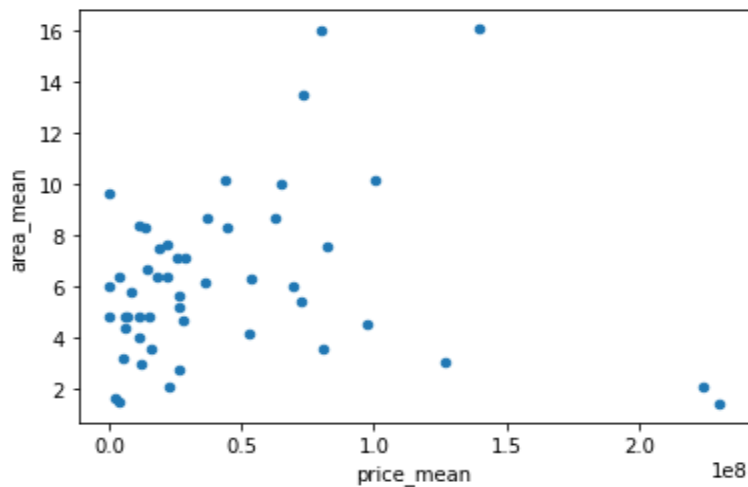
```
Out[47]: (0.3845605883805333, 0.004880352224622747)
```

Conclusion: Since the p-value  $< 0.05$ , we reject the Null hypothesis and conclude that there exists a relationship between price\_mean and Total\_venues

## Hypothesis 2

Null Hypothesis  $H_0$ : price\_mean is not correlated with area\_mean

Alternative Hypothesis  $H_1$ : price\_mean is correlated with area\_mean



```
In [49]: scipy.stats.pearsonr(df_combined['price_mean'], df_combined['area_mean'])
```

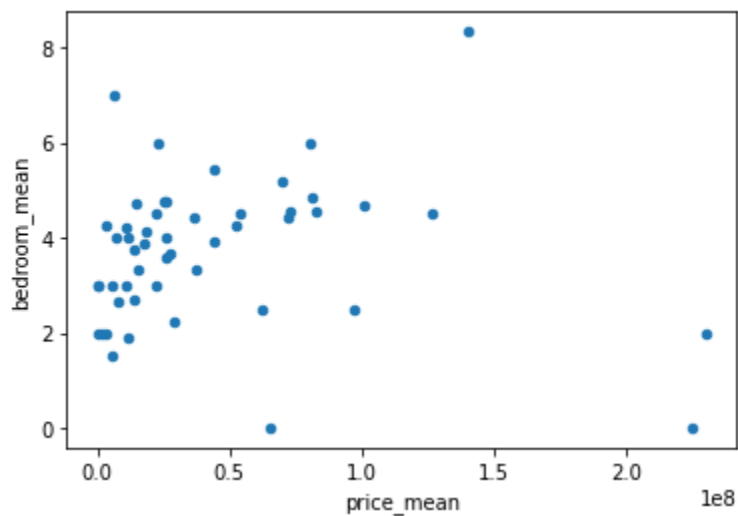
```
Out[49]: (0.05193646097101594, 0.7146173762718203)
```

Conclusion: Since the p-value  $> 0.05$ , we accept the Null hypothesis and conclude that there exists no relationship between price\_mean and area\_mean

### Hypothesis 3

Null Hypothesis  $H_0$ : price\_mean is not correlated bedroom\_mean

Alternative Hypothesis  $H_1$ : price\_mean is correlated with bedroom\_mean



```
In [51]: scipy.stats.pearsonr(df_combined['price_mean'], df_combined['bedroom_mean'])
```

```
Out[51]: (-0.033782528434371864, 0.812070976289614)
```

Conclusion: Since the p-value > 0.05, we accept the Null hypothesis and conclude that there exists no relationship between price\_mean and bedroom\_mean

Next we separately find the top 20 loctions on the basis of:

1. Area
2. Number of venues
3. Number of bedrooms

1. The combined table is sorted in descending order on basis of area\_mean and stored as a new dataframe

|    | location              | Shopping Mall | Department Store | Bakery | Restaurant | Park | Market | Pharmacy | Total venues | property_type | city    | mean_latitude | mean_longitude | price_m   |
|----|-----------------------|---------------|------------------|--------|------------|------|--------|----------|--------------|---------------|---------|---------------|----------------|-----------|
| 6  | Darul Aman Society    | NaN           | 2.0              | NaN    | NaN        | 1.0  | NaN    | NaN      | 3.0          | House         | Karachi | 24.875484     | 67.068230      | 1.400000e |
| 30 | Allama Iqbal Town     | NaN           | NaN              | NaN    | NaN        | NaN  | 1.0    | NaN      | 1.0          | House         | Karachi | 24.926879     | 67.026472      | 8.000000e |
| 12 | Naval Housing Scheme  | NaN           | NaN              | NaN    | 1.0        | NaN  | 2.0    | 1.0      | 3.0          | House         | Karachi | 24.840295     | 67.057387      | 7.293821e |
| 4  | Zamzama               | 2.0           | NaN              | NaN    | NaN        | 1.0  | NaN    | NaN      | 3.0          | House         | Karachi | 24.822799     | 67.040011      | 1.005878e |
| 10 | Khalid Bin Walid Road | 1.0           | 1.0              | NaN    | NaN        | NaN  | 1.0    | NaN      | 3.0          | House         | Karachi | 24.874922     | 67.057322      | 4.392111e |

2. The combined table is sorted in descending order on basis of total venues and stored as a new dataframe

|   | location            | Shopping Mall | Department Store | Bakery | Restaurant | Park | Market | Pharmacy | Total venues | property_type | city    | mean_latitude | mean_longitude | price_m    |
|---|---------------------|---------------|------------------|--------|------------|------|--------|----------|--------------|---------------|---------|---------------|----------------|------------|
| 0 | Shahrah-e-Pakistan  | NaN           | 2.0              | 3.0    | NaN        | NaN  | NaN    | NaN      | 5.0          | House         | Karachi | 24.934436     | 67.072266      | 1.265000e+ |
| 1 | Siraj-ud-Daula Road | NaN           | 3.0              | NaN    | NaN        | 1.0  | 1.0    | NaN      | 5.0          | House         | Karachi | 24.879682     | 67.068985      | 2.300000e+ |
| 2 | Blue Bell Residency | 1.0           | NaN              | 3.0    | NaN        | NaN  | NaN    | NaN      | 4.0          | House         | Karachi | 24.837117     | 67.035573      | 6.000000e+ |
| 3 | Maskan Chowrangi    | NaN           | 1.0              | 2.0    | 1.0        | NaN  | NaN    | NaN      | 4.0          | House         | Karachi | 24.934847     | 67.105248      | 1.160000e+ |
| 4 | Zamzama             | 2.0           | NaN              | NaN    | NaN        | 1.0  | NaN    | NaN      | 3.0          | House         | Karachi | 24.822799     | 67.040011      | 1.005878e+ |

3. The combined table is sorted in descending order on basis of bedroom\_mean available and stored as a new dataframe

|    | location              | Shopping Mall | Department Store | Bakery | Restaurant | Park | Market | Pharmacy | Total venues | property_type | city    | mean_latitude | mean_longitude | price_m   |
|----|-----------------------|---------------|------------------|--------|------------|------|--------|----------|--------------|---------------|---------|---------------|----------------|-----------|
| 6  | Darul Aman Society    | NaN           | 2.0              | NaN    | NaN        | 1.0  | NaN    | NaN      | 3.0          | House         | Karachi | 24.875484     | 67.068230      | 1.400000e |
| 2  | Blue Bell Residency   | 1.0           | NaN              | 3.0    | NaN        | NaN  | NaN    | NaN      | 4.0          | House         | Karachi | 24.837117     | 67.035573      | 6.000000e |
| 30 | Allama Iqbal Town     | NaN           | NaN              | NaN    | NaN        | NaN  | 1.0    | NaN      | 1.0          | House         | Karachi | 24.926879     | 67.026472      | 8.000000e |
| 15 | Old Clifton           | 2.0           | NaN              | NaN    | NaN        | NaN  | NaN    | NaN      | 2.0          | House         | Karachi | 24.817883     | 67.032915      | 2.294000e |
| 10 | Khalid Bin Walid Road | 1.0           | 1.0              | NaN    | NaN        | NaN  | 1.0    | NaN      | 3.0          | House         | Karachi | 24.874922     | 67.057322      | 4.392111e |

Now We analyzed the newly formed 3 datasets sorted on basis of venue counts, area\_mean, bedroom\_mean respectively. To find the locations which are common in all 3

The three dataset shows different top 20 locations from each analysis, we compare the common localities from top 20 on all 3 sorted dataset to find the locations:

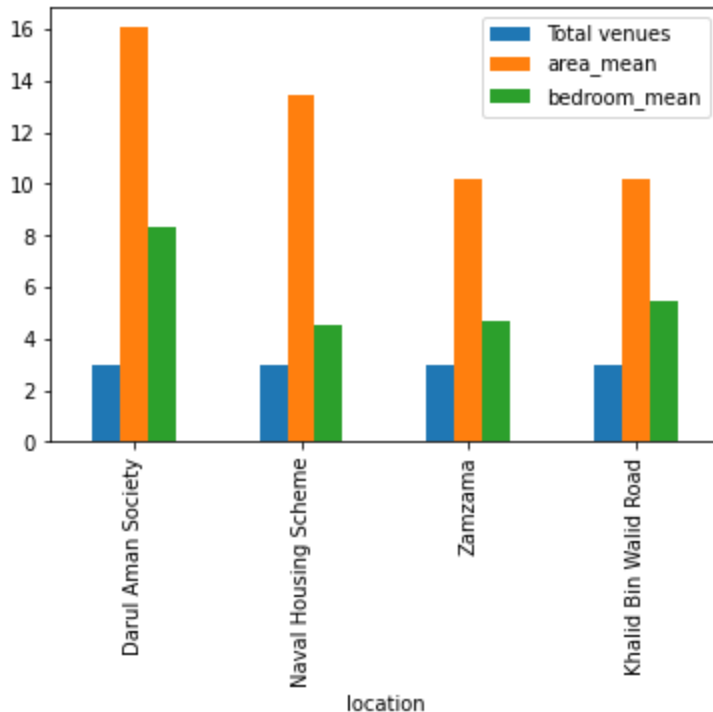
|   | location              |
|---|-----------------------|
| 0 | Darul Aman Society    |
| 1 | Naval Housing Scheme  |
| 2 | Zamzama               |
| 3 | Khalid Bin Walid Road |

The above locations have mores venues and bedrooms and larger houses.

Now for these localities we join with older data set to know other parameters

|   | location              | Shopping Mall | Department Store | Bakery | Restaurant | Park | Market | Pharmacy | Total venues | property_type | city    | mean_latitude | mean_longitude | price_me   |
|---|-----------------------|---------------|------------------|--------|------------|------|--------|----------|--------------|---------------|---------|---------------|----------------|------------|
| 0 | Darul Aman Society    | NaN           | 2.0              | NaN    | NaN        | 1.0  | NaN    | NaN      | 3.0          | House         | Karachi | 24.875484     | 67.068230      | 1.400000e+ |
| 1 | Naval Housing Scheme  | NaN           | NaN              | NaN    | 1.0        | NaN  | 2.0    | 1.0      | 3.0          | House         | Karachi | 24.840295     | 67.057387      | 7.293821e+ |
| 2 | Zamzama               | 2.0           | NaN              | NaN    | NaN        | 1.0  | NaN    | NaN      | 3.0          | House         | Karachi | 24.822799     | 67.040011      | 1.005878e+ |
| 3 | Khalid Bin Walid Road | 1.0           | 1.0              | NaN    | NaN        | NaN  | 1.0    | NaN      | 3.0          | House         | Karachi | 24.874922     | 67.057322      | 4.392111e+ |

Making a bar graph to compare the 4 locations



## RESULTS:

We formulated our result focusing on number of venues, area and number of bedrooms, in this way we found 4 locations based on our data and analysis which are best for buying new homes.

| location |                       |
|----------|-----------------------|
| 0        | Darul Aman Society    |
| 1        | Naval Housing Scheme  |
| 2        | Zamzama               |
| 3        | Khalid Bin Walid Road |

A common trend in scatter plots showed that:

1. The price of house is not affected much by the number of venues that are present near
2. The prices somewhat increases as the area of house increase
3. Also the increase number of bedrooms tends to increase the price

Hence we considered a person will be at more convenience and comfort having more venues, larger houses with more bedrooms.

For those people who focus mainly on the venues around a house, and in particular what kind of venues are present around, we clustered the location of Karachi and found the top most common venues of a location, this will also help in people making a decision to choose a neighborhood

## DISCUSSION:

In our analysis we have not focused our study to find the cheapest house we have preferred facilities over money.

Analysis can further be done based on the personal priorities

Analysis is done on basis of data available and venues that are showing in Foursquare API, many venues and location may not be shown in analysis, further data would help enhancing our analysis.

## CONCLUSION

Using our dataset and after data cleaning and manipulation we found that the locations which have larger houses and more bedrooms and greater venues around them are the best location for buying new home

After all the analysis we found the neighborhoods as shown above, which have best facilities like venues larger houses with more bedrooms are the locations where one should tend to buy a house provided money is not a restraint.

Using our analysis and list of top 10 most common venues of every location a person can buy bigger homes with best features and venues available to him.