## Relocation Recommendation in Singapore

## Business problem

- This project will be useful for agencies and their customers or also direct individuals who are in search of a right accommodation for themselves.
- ▶ In the project, the city of Singapore is considered which is undoubtedly the most attracted for people across the world.
- Singapore is segmented into different neighborhoods using the geographical coordinates of different buildings and the geographical coordinates of top 100 venues around a particular building.
- Finally, the neighborhoods are grouped into clusters.

## Data

- The main datasets used are 'Singapore\_geo.csv' and 'sg\_random\_samles\_clean' which provide information about all the postal codes.
- ▶ The latitude, longitude, postcode and building are extracted from the datasets.
- ▶ The dataset is cleaned by removing all the null values.
- Further, Foursquare API is used to extend the dataset and select random buildings for analysis.

## Output screens

```
In [95]: M venues_map = folium.Map(location=[neighborhood_latitude, neighborhood_longitude], zoom_start=15)
               # add a red circle marker to represent the BEDOKVILLE
               folium.CircleMarker(
                   [neighborhood_latitude, neighborhood_longitude],
                    radius=10,
                  color='red',
popup='BEDOKVILLE',
fill = True,
                   fill_color = 'red',
fill_opacity = 0.6
               ).add_to(venues_map)
               # add all venues as blue circle markers
              for lat, lng, label in zip(nearby_venues.lat, nearby_venues.lng, nearby_venues.categories):
    folium.CircleMarker(
                        [lat, lng],
                        radius=5,
color='blue',
                        popup=label,
                        fill = True,
                        fill_color='blue',
                        fill_opacity=0.6
                    ).add_to(venues_map)
               display(venues_map)
```

```
4
                           5
                                 18925
                                                   DBS Marina Bay MRT Station 1.276427 103.854598
            #Randomly select only 500 neighborhoods
 In [99]:
               neighborhoods_subset = neighborhoods.sample(500
               neighborhoods_subset.head()
     Out[99]:
                       Unnamed: 0 Postcode
                                                   Neighborhood Latitude
                                                                        Longitude
                 34839
                            52820
                                     419910
                                                FRANKEL ESTATE 1.319396 103.914566
                127685
                           194594
                                     588905
                                                  MAYFAIR PARK 1.340750 103.779755
                 98572
                           156599
                                     465607 TANAH MERAH GREEN 1.329652 103.943983
                 39790
                            65432
                                     458411
                                                  OPERA ESTATE 1.319086 103.926208
                                                   CASA NALLUR 1.311367 103.932649
                 95575
                           152847
                                     456648
In [100]: N neighborhoods_subset=neighborhoods_subset.loc[:, ~neighborhoods_subset.columns.str.contains('^Unnamed')]
               print(neighborhoods subset.shape)
               neighborhoods subset.head()
               (500, 4)
    Out[100]:
                                        Neighborhood Latitude Longitude
                        Postcode
                 34839
                         419910
                                     FRANKEL ESTATE 1.319396 103.914566
                127685
                         588905
                                       MAYFAIR PARK 1.340750 103.779755
                 98572
                         465607 TANAH MERAH GREEN 1.329652 103.943983
                 39790
                         458411
                                       OPERA ESTATE 1.319086 103.926208
                 95575
                         456648
                                        CASA NALLUR 1.311367 103.932649
```

```
In [109]: M def subset_data_frame(input_df1):
                  Nghbr = []
                  Lat = []
                  Long =[]
                  for name in input df1.Neighborhood :
                      Nghbr.append(name)
                      coordinates = neighborhoods_subset[neighborhoods_subset["Neighborhood"]==name][["Latitude","Longitude"]]
                      Lat.append(coordinates.iloc[0,0])
                      Long.append(coordinates.iloc[0,1])
                  df_temp_coord = pd.DataFrame({"Neighborhood":Nghbr,"Latitude":Lat,"Longitude":Long})
                  df_temp_coord=df_temp_coord[["Neighborhood","Latitude","Longitude"]]
                  return df_temp_coord
In [110]: M df part1 = subset data frame(df tmp)
In [111]: M df_part2 = subset_data_frame(df_tmp_2)
              df part2.head()
   Out[111]:
                                                 Neighborhood Latitude
                                                                      Longitude
              0 24-HOUR WALK-IN CLINIC (MOUNT ALVERNIA HOSPITAL) 1.341499 103.837774
                                          ADELPHI PARK ESTATE 1.355015 103.828192
                                             AFFLUENCE COURT 1.350150 103.883062
               3
                                                     ALEGRIA 1.324303 103.841018
                                            ALIWAL PARK HOTEL 1.303419 103.860235
In [112]: M df_part1=df_part1.append(df_part2)
              df part1.shape
   Out[112]: (345, 3)
```