## ai-project

## April 11, 2022

```
[]: #STEP 1- Scraping WikiPedia and Creating Data Frame
     # install and import libraries
     #neighbourhood maps from open.toronto.ca
     # Install a pip package in the current Jupyter kernel
     import sys
     !{sys.executable} -m pip install bs4
     !{sys.executable} -m pip install pandas
     !{sys.executable} -m pip install requests
     !\{sys.executable\} \ \hbox{-m pip install folium}
     !{sys.executable} -m pip install numpy
     !{sys.executable} -m pip install lxml
     !{sys.executable} -m pip install html5lib
     !{sys.executable} -m pip install geopy
     !{sys.executable} -m pip install sklearn
     !{sys.executable} -m pip install Matplotlib
     !{sys.executable} -m pip install pgeocode
     import pgeocode
     #library to handle JSON files
     import json
     # Convert an address into latitude and longitude values
     from geopy.geocoders import Nominatim
     # Matplotlib and associated plotting modules
     import matplotlib.cm as cm
     import matplotlib.colors as colors
     # Import k-means from clustering stage
     from sklearn.cluster import KMeans
     import folium # map rendering library
```

```
from bs4 import BeautifulSoup
 import requests
 import pandas as pd
 import numpy as np
 import folium
 print('Libraries installed & imported.')
  # Get the dataset metadata by passing package_id to the package_search endpoint
  # For example, to retrieve the metadata for this dataset:
 url = "https://ckan0.cf.opendata.inter.prod-toronto.ca/api/3/action/
     →package_show"
 params = { "id": "4def3f65-2a65-4a4f-83c4-b2a4aed72d46"}
 package = requests.get(url, params = params).json()
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(1.16.0)
Libraries installed & imported.
```

```
[]: # Getting the data, preprocessing, and cleaning the data
     url = 'https://en.wikipedia.org/wiki/List_of_postal_codes_of_Canada:_M'
     source = requests.get(url)
     postal_code url = requests.get('https://en.wikipedia.org/wiki/
      ⇔List_of_postal_codes_of_Canada:_M').text
     soup = BeautifulSoup(source.text, 'html')
     #using soup object, iterate the wikitable to get the data from the HTML page_
     →and store it into a list
     data = []
     columns = []
     table = soup.find("tbody")
     #function for finding italics
     def has_italics_not_assigned(tag):
         return tag.has_attr('i') and not tag.has_attr('a')
     def extract_postal(pcode):
         return pcode[0:3]
     def extract_borough(borough):
         borough = borough[3:len(borough)]
         borough = borough.rpartition("(")[0]
         return borough
     def extract_neighbourhood(nbhood):
         nbhood = nbhood.rpartition("(")[2]
         nbhood = nbhood.rpartition(")")[0]
         return nbhood
     postals = []
     boroughs = []
     neighbourhoods = []
     for index, tr in enumerate(table.find_all('tr')):
         section = []
         for td in tr.find_all(['th','td']):
                 td_string = td.text.strip()
                 borough = td_string[3:len(td_string)]
                 if (borough != "Not assigned"):
                     section.append(extract_postal(td_string) + " " + borough)
                     postals.append(extract_postal(td_string))
                     boroughs.append(extract_borough(td_string))
```

```
neighbourhoods.append(extract_neighbourhood(td_string))
            else:
                section.append("")
    #First row of data is the header
    """if (index == 0):
        columns = ['M1_', 'M2_', 'M3_', 'M4_', 'M5_', 'M6_', 'M7_', 'M8_', _

    'M9_ ']

    else:
        data.append(section)"""
#convert list into Pandas DataFrame
"""Toronto_cleaned_df = pd.DataFrame(data = data, columns = columns)
Toronto_df"""
data = {"Postal Code": postals, "Borough": boroughs, "Neighbourhood": u
 →neighbourhoods}
Toronto_cleaned_df = pd.DataFrame(data)
Toronto_cleaned_df
    Postal Code
                                                             Borough \
            M3A
                                                          North York
1
            M4A
                                                          North York
2
            M5A
                                                    Downtown Toronto
                                                          North York
3
            M6A
4
            M7A
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. .
            X8M
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                                                           Etobicoke
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                                                         Downtown Toronto
     100
                 M7Y
                      East TorontoBusiness reply mail Processing Cen...
                 Y8M
     101
                                                                Etobicoke
     102
                 M87.
                                                                Etobicoke
                                               Neighbourhood
     0
                                                    Parkwoods
     1
                                            Victoria Village
                                  Regent Park / Harbourfront
     3
                          Lawrence Manor / Lawrence Heights
     4
                               Ontario Provincial Government
            The Kingsway / Montgomery Road / Old Mill North
     98
     99
                                        Church and Wellesley
     100
                                              Enclave of M4L
         Old Mill South / King's Mill Park / Sunnylea /...
     101
          Mimico NW / The Queensway West / South of Bloo...
```

[103 rows x 3 columns]

```
[]: # STEP 2: Getting the coordinates of each neighbourhood
     # getting the coordinates in a new data frame
     pcode = Toronto_cleaned_df['Postal Code'].tolist()
     nomi = pgeocode.Nominatim('ca')
     New_df = nomi.query_postal_code(pcode)
     New df
     # adding coordinate from New_df to the Toronto_cleaned_df
     Toronto_cleaned_df['Latitude'] = New_df['latitude']
     Toronto_cleaned_df['Longitude'] = New_df['longitude']
     #Correcting the coordinates for rows 76.
     Toronto_cleaned_df.loc[76,['Latitude', 'Longitude']] = 43.6364,-79.6157
     Toronto_cleaned_df
[]:
         Postal Code
                                                                 Borough \
                 M3A
                                                              North York
     0
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     98
                 X8M
                                                               Etobicoke
                                                        Downtown Toronto
     99
                 M4Y
     100
                 M7Y
                      East TorontoBusiness reply mail Processing Cen...
     101
                 M8Y
                                                               Etobicoke
     102
                 M8Z
                                                               Etobicoke
                                               Neighbourhood Latitude Longitude
```

```
0
                                              Parkwoods
                                                         43.7545
                                                                    -79.3300
1
                                      Victoria Village 43.7276
                                                                    -79.3148
2
                            Regent Park / Harbourfront
                                                          43.6555
                                                                    -79.3626
3
                     Lawrence Manor / Lawrence Heights
                                                          43.7223
                                                                    -79.4504
                         Ontario Provincial Government
4
                                                          43.6641
                                                                    -79.3889
. .
       The Kingsway / Montgomery Road / Old Mill North
                                                                    -79.5076
98
                                                          43.6518
99
                                  Church and Wellesley
                                                          43.6656
                                                                    -79.3830
100
                                                                    -79.2505
                                        Enclave of M4L
                                                          43.7804
    Old Mill South / King's Mill Park / Sunnylea /...
101
                                                        43.6325
                                                                  -79.4939
    Mimico NW / The Queensway West / South of Bloo...
                                                        43.6256
                                                                  -79.5231
```

[103 rows x 5 columns]

```
[]: #Step 3 - Clustering Neighboorhood
    # Get coordinates of Toronto
    address = 'Toronto, ON, CA'
    geolocator = Nominatim(user_agent="TR_explorer")
    location = geolocator.geocode(address)
    latitude = location.latitude
    longitude = location.longitude
    print('The geograpical coordinates of Toronto are {}, {}.'.format(latitude, __
     →longitude))
    #making a list of boroughs in Toronto to be used in visualization
    boroughs = list(set(Toronto_cleaned_df['Borough']))
    # create map of Toronto using latitude and longitude values
    map_toronto = folium.Map(location=[latitude, longitude], zoom_start=11)
    colors= ['#0000FF','#FF4040', '#66CD00', '#00CDCD', '#CAFF70', '#9932CC', __
     ⇔'#006400', '#00FF00' , '#AFEEEE' , '#4169E1' ]
    # add markers to map
    for lat, lng, borough, neighbourhood in zip(Toronto_cleaned_df['Latitude'], __
      →Toronto_cleaned_df['Longitude'], Toronto_cleaned_df['Borough'], ___
     →Toronto_cleaned_df['Neighbourhood']):
        label = '{}, {}'.format(neighbourhood, borough)
        label = folium.Popup(label, parse_html=True)
        for i in range(0, len(boroughs)) :
            if boroughs[i] == borough :
                c = colors[i]
        folium.CircleMarker(
            [lat, lng],
            radius=5,
            popup=label,
            color= c,
            fill=True,
            fill_color= c,
            fill opacity=0.7,
            parse_html=False).add_to(map_toronto)
    map_toronto
```

The geograpical coordinates of Toronto are 43.6534817, -79.3839347.

[]: <folium.folium.Map at 0x1fbcf26b310>

```
[]: #North York Clustering
     nyork_data = Toronto_cleaned_df[Toronto_cleaned_df['Borough'] == 'North York'].
      →reset_index(drop=True)
     nyork data.head()
     # Getting coordinates of North York
     address = 'North York, ON, CA'
     geolocator = Nominatim(user_agent="nyork_explorer")
     location = geolocator.geocode(address)
     latitude = location.latitude
     longitude = location.longitude
     print('The geograpical coordinate of North York are {}, {}.'.format(latitude, __
      →longitude))
     # create map of North York using latitude and longitude values
     map_nyork = folium.Map(location=[latitude, longitude], zoom_start=12)
     # add markers to map
     for lat, lng, label in zip(nyork_data['Latitude'], nyork_data['Longitude'], u
      →nyork_data['Neighbourhood']):
         label = folium.Popup(label, parse_html=True)
         folium.CircleMarker(
             [lat, lng],
             radius=5,
             popup=label,
             color='blue',
             fill=True,
             fill_color='blue',
             fill_opacity=0.7,
             parse_html=False).add_to(map_nyork)
     map_nyork
```

The geograpical coordinate of North York are 43.7543263, -79.44911696639593.

[]: <folium.folium.Map at 0x1fbceb4f490>

```
[]: #Create function for FSQ API calls
APIKEY = 'fsq3Sl1rMVbkkKn6h2OfOj//V/kM4JJOxpn5Y/SMMgsvoRQ='

def getNearbyVenues(names, latitudes, longitudes, radius, limit):
    headers = {
        'Accept': 'application/json',
        'Authorization': 'APIKEY'
    }
```

```
URL = 'https://api.foursquare.com/v3/places/search?ll={}&radius={}&limit={}'
    venues list = []
    for name, lat, lng in zip(names, latitudes, longitudes):
        print(name)
        url = URL.format(str(lat) + '%2C' + str(lng), radius, limit)
        print(url)
        #response = requests.get(url, headers=headers)
        response = requests.request("GET", url, headers=headers)
        #data = requests.get(url, headers=headers).json()
        data = json.loads(response.text)
        # do stuff here to process venues_list
        for record in data['results']:
            venues_list.append({
                 'Neighborhood': name,
                 'Neighborhood Latitude': lat,
                 'Neighborhood Longitude': lng,
                 'Venue': record['name'],
                 'Venue Latitude': record['geocodes']['main']['latitude'],
                 'Venue Longitude': record['geocodes']['main']['longitude'],
                 'Venue Category': record['categories'][0]['name'],
            })
    # do stuff here to create your dataframe
    nearby_venues = pd.DataFrame(venues_list)
    return(nearby venues)
print(data)
#qetNearbyVenues(nyork_data['Neighbourhood'], nyork_data['Latitude'],__
  →nyork_data['Longitude'], 500, 50)
#getNearbyVenues(Toronto_cleaned_df['Neighbourhood'], ___
  →Toronto_cleaned_df['Latitude'], Toronto_cleaned_df['Longitude'], 500, 50)
{'Postal Code': ['M3A', 'M4A', 'M5A', 'M6A', 'M7A', 'M9A', 'M1B', 'M3B', 'M4B',
'M5B', 'M6B', 'M9B', 'M1C', 'M3C', 'M4C', 'M5C', 'M6C', 'M9C', 'M1E', 'M4E',
'M5E', 'M6E', 'M1G', 'M4G', 'M5G', 'M6G', 'M1H', 'M2H', 'M3H', 'M4H', 'M5H',
'M6H', 'M1J', 'M2J', 'M3J', 'M4J', 'M5J', 'M6J', 'M1K', 'M2K', 'M3K', 'M4K',
'M5K', 'M6K', 'M1L', 'M2L', 'M3L', 'M4L', 'M5L', 'M6L', 'M9L', 'M1M', 'M2M',
'M3M', 'M4M', 'M5M', 'M6M', 'M9M', 'M1N', 'M2N', 'M3N', 'M4N', 'M5N', 'M6N',
'M9N', 'M1P', 'M2P', 'M4P', 'M5P', 'M6P', 'M9P', 'M1R', 'M2R', 'M4R', 'M5R',
'M6R', 'M7R', 'M9R', 'M1S', 'M4S', 'M5S', 'M6S', 'M1T', 'M4T', 'M5T', 'M1V',
'M4V', 'M5V', 'M8V', 'M9V', 'M1W', 'M4W', 'M5W', 'M8W', 'M9W', 'M1X', 'M4X',
'M5X', 'M8X', 'M4Y', 'M7Y', 'M8Y', 'M8Z'], 'Borough': ['North York', 'North
York', 'Downtown Toronto', 'North York', "Queen's Park", 'Etobicoke',
'Scarborough', 'North York', 'East York', 'Downtown Toronto', 'North York',
```

'Etobicoke', 'Scarborough', 'North York(Don Mills)South', 'East York', 'Downtown Toronto', 'York', 'Etobicoke', 'Scarborough', 'East Toronto', 'Downtown Toronto', 'York', 'Scarborough', 'East York', 'Downtown Toronto', 'Downtown Toronto', 'Scarborough', 'North York', 'North York', 'East York', 'Downtown Toronto', 'West Toronto', 'Scarborough', 'North York', 'North York', 'East YorkEast Toronto', 'Downtown Toronto', 'West Toronto', 'Scarborough', 'North York', 'North York(Downsview)East ', 'East Toronto', 'Downtown Toronto', 'West Toronto', 'Scarborough', 'North York', 'North York', 'East Toronto', 'Downtown Toronto', 'North York', 'North York', 'Scarborough', 'North York', 'North York', 'East Toronto', 'North York', 'York', 'North York', 'Scarborough', 'North York', 'North York', 'Central Toronto', 'Central Toronto', 'York', 'York', 'Scarborough', 'North York', 'Central Toronto', 'Central Toronto', 'West Toronto', 'Etobicoke', 'Scarborough', 'North York', 'Central Toronto', 'Central Toronto', 'West Toronto', 'MississaugaCanada Post Gateway Processing Centre', 'Etobicoke', 'Scarborough', 'Central Toronto', 'Downtown Toronto', 'West Toronto', 'Scarborough', 'Central Toronto', 'Downtown Toronto', 'Scarborough', 'Central Toronto', 'Downtown Toronto', 'Etobicoke', 'Etobicoke', 'Scarborough', 'Downtown Toronto', 'Downtown TorontoStn A PO Boxes25 The Esplanade', 'Etobicoke', 'EtobicokeNorthwest', 'Scarborough', 'Downtown Toronto', 'Downtown Toronto', 'Etobicoke', 'Downtown Toronto', 'East TorontoBusiness reply mail Processing Centre969 Eastern', 'Etobicoke', 'Etobicoke'], 'Neighbourhood': ['Parkwoods', 'Victoria Village', 'Regent Park / Harbourfront', 'Lawrence Manor / Lawrence Heights', 'Ontario Provincial Government', 'Islington Avenue', 'Malvern / Rouge', 'Don Mills', 'Parkview Hill / Woodbine Gardens', 'Garden District, Ryerson', 'Glencairn', 'West Deane Park / Princess Gardens / Martin Grove / Islington / Cloverdale', 'Rouge Hill / Port Union / Highland Creek', 'Flemingdon Park', 'Woodbine Heights', 'St. James Town', 'Humewood-Cedarvale', 'Eringate / Bloordale Gardens / Old Burnhamthorpe / Markland Wood', 'Guildwood / Morningside / West Hill', 'The Beaches', 'Berczy Park', 'Caledonia-Fairbanks', 'Woburn', 'Leaside', 'Central Bay Street', 'Christie', 'Cedarbrae', 'Hillcrest Village', 'Bathurst Manor / Wilson Heights / Downsview North', 'Thorncliffe Park', 'Richmond / Adelaide / King', 'Dufferin / Dovercourt Village', 'Scarborough Village', 'Fairview / Henry Farm / Oriole', 'Northwood Park / York University', 'The Danforth East', 'Harbourfront East / Union Station / Toronto Islands', 'Little Portugal / Trinity', 'Kennedy Park / Ionview / East Birchmount Park', 'Bayview Village', 'CFB Toronto', 'The Danforth West / Riverdale', 'Toronto Dominion Centre / Design Exchange', 'Brockton / Parkdale Village / Exhibition Place', 'Golden Mile / Clairlea / Oakridge', 'York Mills / Silver Hills', 'Downsview', 'India Bazaar / The Beaches West', 'Commerce Court / Victoria Hotel', 'North Park / Maple Leaf Park / Upwood Park', 'Humber Summit', 'Cliffside / Cliffcrest / Scarborough Village West', 'Willowdale / Newtonbrook', 'Downsview', 'Studio District', 'Bedford Park / Lawrence Manor East', 'Del Ray / Mount Dennis / Keelsdale and Silverthorn', 'Humberlea / Emery', 'Birch Cliff / Cliffside West', 'Willowdale', 'Downsview', 'Lawrence Park', 'Roselawn', 'Runnymede / The Junction North', 'Weston', 'Dorset Park / Wexford Heights / Scarborough Town Centre', 'York Mills West', 'Davisville North', 'Forest Hill North & West', 'High Park / The Junction South', 'Westmount', 'Wexford / Maryvale', 'Willowdale', 'North Toronto West', 'The Annex / North Midtown /

Yorkville', 'Parkdale / Roncesvalles', 'Enclave of L4W', 'Kingsview Village / St. Phillips / Martin Grove Gardens / Richview Gardens', 'Agincourt', 'Davisville', 'University of Toronto / Harbord', 'Runnymede / Swansea', "Clarks Corners / Tam O'Shanter / Sullivan", 'Moore Park / Summerhill East', 'Kensington Market / Chinatown / Grange Park', "Milliken / Agincourt North / Steeles East / L'Amoreaux East", 'Summerhill West / Rathnelly / South Hill / Forest Hill SE / Deer Park', 'CN Tower / King and Spadina / Railway Lands / Harbourfront West / Bathurst Quay / South Niagara / Island airport', 'New Toronto / Mimico South / Humber Bay Shores', 'South Steeles / Silverstone / Humbergate / Jamestown / Mount Olive / Beaumond Heights / Thistletown / Albion Gardens', "Steeles West / L'Amoreaux West", 'Rosedale', 'Enclave of M5E', 'Alderwood / Long Branch', 'Clairville / Humberwood / Woodbine Downs / West Humber / Kipling Heights / Rexdale / Elms / Tandridge / Old Rexdale', 'Upper Rouge', 'St. James Town / Cabbagetown', 'First Canadian Place / Underground city', 'The Kingsway / Montgomery Road / Old Mill North', 'Church and Wellesley', 'Enclave of M4L', "Old Mill South / King's Mill Park / Sunnylea / Humber Bay / Mimico NE / The Queensway East / Royal York South East / Kingsway Park South East", 'Mimico NW / The Queensway West / South of Bloor / Kingsway Park South West / Royal York South West']}