```
In [1]: import numpy as np # library to handle data in a vectorized manner
              import pandas as pd # Library for data analsysis
pd.set_option('display.max_columns', None)
pd.set_option('display.max_rows', None)
               import json # library to handle JSON files
               #!pip install geopy
               #!conda install -c conda-forge geopy --yes # uncomment this line if you haven't completed the Foursquare API lab from geopy.geocoders import Nominatim # convert an address into latitude and longitude values
              import requests # library to handle requests
from pandas import json_normalize # tranform JSON file into a pandas dataframe
               # 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
               #!pip install folium
              #!conda install -c conda-forge folium=0.4.0 --yes # uncomment this line if you haven't completed the Foursquare API lab import folium # map rendering library
              print('Libraries imported.')
In [2]: #!pip install wget
              wget.download('https://cocl.us/new_york_dataset', 'newyork_data.json')
print('Data downloaded!')
In [3]: with open('newyork_data.json') as json_data:
    newyork_data = json.load(json_data)
In [4]: neighborhoods_data = newyork_data['features']
neighborhoods_data[0]
neighborhoods_data[0]

Out[4]: {'type': 'Feature',
    'id': 'nyu_2451_34572.1',
    'geometry': {'type': 'Point',
        'coordinates': [-73.84720052054902, 40.89470517661]},
    'geometry_name': 'geom',
    'properties': {'name': 'Wakefield',
        'stacked': 1,
        'annoline1': 'Wakefield',
        'annoline2': None,
        'annoline3': None,
        'annoangle': 0.0,
        'borough': 'Bronx',
        'bbox': [-73.84720052054902,
        40.89470517661,
        -73.84720052054902,
                    -73.84720052054902.
                   40.89470517661]}}
In [5]: # define the dataframe coLumns
column_names = ['Borough', 'Neighborhood', 'Latitude', 'Longitude']
              # instantiate the dataframe
neighborhoods = pd.DataFrame(columns=column_names)
neighborhoods
Out[5]: Borough Neighborhood Latitude Longitude
In [6]: for data in neighborhoods_data:
    borough = neighborhood_name = data['properties']['borough']
    neighborhood_name = data['properties']['name']
                    neighborhood_latlon = data['geometry']['coordinates']
neighborhood_lat = neighborhood_latlon[1]
neighborhood_lon = neighborhood_latlon[0]
                    neighborhoods.head()
Out[6]:
                  Borough Neighborhood Latitude Longitude
               0 Bronx
                                                       40.894705 -73.847201
                                 Wakefield
                  Bronx
                                  Co-op City
                                                       40.874294 -73.829939
               2 Bronx
                                 Eastchester
                                                        40.887556
                                                                        -73.827806
               3 Bronx
                                                        40.895437 -73.905643
               4 Bronx
                                 Riverdale
                                                       40.890834 -73.912585
```

```
The dataframe has 5 boroughs and 306 neighborhoods.
   In [8]: address = 'New York City, NY'
                        geolocator = Nominatim(user_agent="ny_explorer")
location = geolocator.geocode(address)
latitude = location.latitude
longitude = location.longitude
                        print('The geograpical coordinate of New York City are {}, {}.'.format(latitude, longitude))
                        The geograpical coordinate of New York City are 40.7127281, -74.0060152.
   In [9]: # create map of New York using Latitude and Longitude values
map_newyork = folium.Map(location=[latitude, longitude], zoom_start=10)
                        # add markers to map
for lat, lng, borough, neighborhood in zip(neighborhoods['Latitude'], neighborhoods['Longitude'], neighborhoods['Borough'], neighborhoods
['Neighborhood']):
label = '(}, {}'.format(neighborhood, borough)
label = folium.Popup(label, parse_html=True)
folium.CircleMarker(
    [lat, lng],
                                              radius=5,
                                             radius=5,
popup=label,
color='blue',
fill=True,
fill_color='#3186cc',
fill_opacity=0.7,
parse_html=False).add_to(map_newyork)
                        map newvork
  Out[9]: Make this Notebook Trusted to load map: File -> Trust Notebook
In [10]: CLIENT_ID = 'UJDGZH02010QRTD3YAFNK0QJJZNLVYATZYZTN1LDQGNVYXYU' # your Foursquare ID CLIENT_SECRET = 'HVMENYFLNTLBSL4LZ30JQXYVQMGA0TEW30SNTMUKW4SEFJBR' # your Foursquare Secret VERSION = '20180605' # Foursquare API version
                        print('Your credentails:')
print('CLIENT_ID: ' + CLIENT_ID)
print('CLIENT_SECRET:' + CLIENT_SECRET)
                        Your credentails:
CLIENT ID: UJDGZH02010QRTD3YAFNK0QJJZNLVYATZY2TN1LDQGNVYXYU
                        CLIENT SECRET: HVWENYFLNTLB5L4LZ30JQXYVQMGA0TEW30SNTWUKW4SEFJBR
 In [11]: neighborhood_latitude = neighborhoods.loc[0, 'Latitude'] # neighborhood latitude value neighborhood_longitude = neighborhoods.loc[0, 'Longitude'] # neighborhood longitude value
                          neighborhood_name = neighborhoods.loc[0, 'Neighborhood'] # neighborhood name
                          print('Latitude \ and \ longitude \ values \ of \ \{\} \ are \ \{\}, \ '.format(neighborhood\_name, are \ format(neighborhood\_name, are \ format(neighborhood\_nam
                                                                                                                                                                                           neighborhood latitude,
                                                                                                                                                                                          neighborhood_longitude))
                         Latitude and longitude values of Wakefield are 40.89470517661, -73.84720052054902.
 In [12]: LIMIT = 100
                         VERSION,
neighborhood_latitude,
neighborhood_longitude,
                                    radius,
                                  LIMIT)
                         ur1
Out[12]: 'https://api.foursquare.com/v2/venues/explore?&client_id=UJDGZH02O10QRTD3YAFNK0QJJZNLVYATZY2TN1LDQGNVYXYU&client_secret=HVWENYFLNTLB5L4LZ 30JQXYVQMGA0TEW3OSNTWUKW4SEFJBR&v=20180605&ll=40.89470517661,-73.84720052054902&radius=500&limit=100'
```

In [13]: results = requests.get(url).json()

```
In [14]:
# function that extracts the category of the venue
def get_category_type(row):
    try:
        categories_list = row['categories']
    except:
        categories_list = row['venue.categories']

if len(categories_list) == 0:
    return None
else:
    return categories_list[0]['name']
```

Out[15]:

	name	categories	lat	Ing
0	Lollipops Gelato	Dessert Shop	40.894123	-73.845892
1	Walgreens	Pharmacy	40.896528	-73.844700
2	Carvel Ice Cream	Ice Cream Shop	40.890487	-73.848568
3	Rite Aid	Pharmacy	40.896649	-73.844846
4	Dunkin'	Donut Shop	40.890459	-73.849089

In [16]: print('{} venues were returned by Foursquare.'.format(nearby\_venues.shape[0]))

11 venues were returned by Foursquare.

Waketield
Co-op City
Eastchester
Fieldston
Riverdale
Kingsbridge
Marble Hill
Woodlawn
Norwood
Williamsbridge
Baychester
Pelham Parkway
City Island
Bedford Park
University Heights
Morris Heights
Morris Heights
Fordham
East Tremont
West Farms
High Bridge
Melrose
Mott Haven
Port Morris
Longwood
Hunts Point
Morrisania
Soundview
Clason Point
Throgs Neck
Country Club
Parkchester

In [19]: print(newyork\_venues.shape)
newyork\_venues.head()

(10120, 7)

Out[19]:

	N	leighborhood	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
(	v	Vakefield	40.894705	-73.847201	Lollipops Gelato	40.894123	-73.845892	Dessert Shop
-	1 W	Vakefield	40.894705	-73.847201	Walgreens	40.896528	-73.844700	Pharmacy
:	2 W	Vakefield	40.894705	-73.847201	Carvel Ice Cream	40.890487	-73.848568	Ice Cream Shop
;	3 W	Vakefield	40.894705	-73.847201	Rite Aid	40.896649	-73.844846	Pharmacy
4	4 W	Vakefield	40.894705	-73.847201	Dunkin'	40.890459	-73.849089	Donut Shop

In [20]: #choose only rows which refer to coffee shops, and therefore, only neighborhoods which have at least one coffee shop filtered\_category = newyork\_venues[newyork\_venues['Venue Category'] == 'Coffee Shop'] filtered\_category

Out[20]:

	Neighborhood	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
71	Kingsbridge	40.881687	-73.902818	Mon Amour Coffee & Wine	40.885009	-73.900332	Coffee Shop
132	Marble Hill	40.876551	-73.910660	Starbucks	40.877531	-73.905582	Coffee Shop
137	Marble Hill	40.876551	-73.910660	Starbucks	40.873755	-73.908613	Coffee Shop
179	Norwood	40.877224	-73.879391	Nicky's Coffee Shop	40.874933	-73.879404	Coffee Shop
242	Pelham Parkway	40.857413	-73.854756	Liberty Donut & Coffee Shop	40.855339	-73.855333	Coffee Shop
317	Bedford Park	40.870185	-73.885512	National Coffee Shop	40.872841	-73.889053	Coffee Shop
473	West Farms	40.839475	-73.877745	Prospect Coffee Shop	40.837577	-73.880839	Coffee Shop
550	Mott Haven	40.806239	-73.916100	Brook Lunch	40.807472	-73.919510	Coffee Shop
649	Throgs Neck	40.815109	-73.816350	The Miles Coffee Bar	40.819462	-73.817352	Coffee Shop
726	Van Nest	40.843608	-73.866299	Conti's Pastry Shoppe	40.845906	-73.862836	Coffee Shop
758	Morris Park	40.847549	-73.850402	La Casa Del Caffe	40.848675	-73.854973	Coffee Shop
828	Belmont	40.857277	-73.888452	Starbucks	40.860636	-73.890270	Coffee Shop
836	Belmont	40.857277	-73.888452	Starbucks	40.861106	-73.886148	Coffee Shop
882	North Riverdale	40.908543	-73.904531	Noni's Coffee Shop	40.907355	-73.904161	Coffee Shop
957	Edgewater Park	40.821986	-73.813885	The Miles Coffee Bar	40.819462	-73.817352	Coffee Shop
976	Edgewater Park	40.821986	-73.813885	Bridges	40.818697	-73.817371	Coffee Shop
1076	Bay Ridge	40.625801	-74.030621	Caffe Café	40.624946	-74.030404	Coffee Shop
1935	Greennoint	AN 73N2N1	_73 95/19/1	Homecomina	AN 729696	_73 957525	Coffee Shon

In [21]: #make sure no two rows are duplicates
filtered\_category = filtered\_category.drop\_duplicates()
filtered\_category

Out[21]:

	Neighborhood	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
71	Kingsbridge	40.881687	-73.902818	Mon Amour Coffee & Wine	40.885009	-73.900332	Coffee Shop
132	Marble Hill	40.876551	-73.910660	Starbucks	40.877531	-73.905582	Coffee Shop
137	Marble Hill	40.876551	-73.910660	Starbucks	40.873755	-73.908613	Coffee Shop
179	Norwood	40.877224	-73.879391	Nicky's Coffee Shop	40.874933	-73.879404	Coffee Shop
242	Pelham Parkway	40.857413	-73.854756	Liberty Donut & Coffee Shop	40.855339	-73.855333	Coffee Shop
317	Bedford Park	40.870185	-73.885512	National Coffee Shop	40.872841	-73.889053	Coffee Shop
473	West Farms	40.839475	-73.877745	Prospect Coffee Shop	40.837577	-73.880839	Coffee Shop
550	Mott Haven	40.806239	-73.916100	Brook Lunch	40.807472	-73.919510	Coffee Shop
649	Throgs Neck	40.815109	-73.816350	The Miles Coffee Bar	40.819462	-73.817352	Coffee Shop
726	Van Nest	40.843608	-73.866299	Conti's Pastry Shoppe	40.845906	-73.862836	Coffee Shop
758	Morris Park	40.847549	-73.850402	La Casa Del Caffe	40.848675	-73.854973	Coffee Shop
828	Belmont	40.857277	-73.888452	Starbucks	40.860636	-73.890270	Coffee Shop
836	Belmont	40.857277	-73.888452	Starbucks	40.861106	-73.886148	Coffee Shop
882	North Riverdale	40.908543	-73.904531	Noni's Coffee Shop	40.907355	-73.904161	Coffee Shop
957	Edgewater Park	40.821986	-73.813885	The Miles Coffee Bar	40.819462	-73.817352	Coffee Shop
976	Edgewater Park	40.821986	-73.813885	Bridges	40.818697	-73.817371	Coffee Shop
1076	Bay Ridge	40.625801	-74.030621	Caffe Café	40.624946	-74.030404	Coffee Shop
1935	Greennoint	AN 730201	_73 95/12/1	Homecomina	AU 458888	_73 957525	Coffee Shon

In [22]: #venue name, Latitude and Longitude and category are not relevant
coffee\_shop = filtered\_category[['Neighborhood', 'Neighborhood Latitude', 'Neighborhood Longitude']].copy()
coffee\_shop

Out[22]:

	Neighborhood	Neighborhood Latitude	Neighborhood Longitude
71	Kingsbridge	40.881687	-73.902818
132	Marble Hill	40.876551	-73.910660
137	Marble Hill	40.876551	-73.910660
179	Norwood	40.877224	-73.879391
242	Pelham Parkway	40.857413	-73.854756
317	Bedford Park	40.870185	-73.885512
473	West Farms	40.839475	-73.877745
550	Mott Haven	40.806239	-73.916100
649	Throgs Neck	40.815109	-73.816350
726	Van Nest	40.843608	-73.866299
758	Morris Park	40.847549	-73.850402
828	Belmont	40.857277	-73.888452
836	Belmont	40.857277	-73.888452
882	North Riverdale	40.908543	-73.904531
957	Edgewater Park	40.821986	-73.813885
976	Edgewater Park	40.821986	-73.813885
1076	Bay Ridne	40 625801	-74 030621

In [23]: #add a column which counts the number of times a neighbourhood appears in the dataframe, i.e. the number of coffee shops there are in the neighbourhood coffee\_shop['count'] = coffee\_shop.groupby('Neighborhood')['Neighborhood'].transform('count') coffee\_shop = coffee\_shop.rename(columns={'count': 'Number of Coffee Shops'}) coffee\_shop = coffee\_shop.rename(columns={'Neighborhood Latitude': 'Latitude')} coffee\_shop = coffee\_shop.rename(columns={'Neighborhood Longitude': 'Longitude'}) coffee\_shop

Out[23]:

	Neighborhood	Latitude	Longitude	Number of Coffee Shops
71	Kingsbridge	40.881687	-73.902818	1
132	Marble Hill	40.876551	-73.910660	2
137	Marble Hill	40.876551	-73.910660	2
179	Norwood	40.877224	-73.879391	1
242	Pelham Parkway	40.857413	-73.854756	1
317	Bedford Park	40.870185	-73.885512	1
473	West Farms	40.839475	-73.877745	1
550	Mott Haven	40.806239	-73.916100	1
649	Throgs Neck	40.815109	-73.816350	1
726	Van Nest	40.843608	-73.866299	1
758	Morris Park	40.847549	-73.850402	1
828	Belmont	40.857277	-73.888452	2
836	Belmont	40.857277	-73.888452	2
882	North Riverdale	40.908543	-73.904531	1
957	Ednowator Dark	40 82108E	72 212225	2

```
In [24]: #final dataframe showing number of coffee shops in every neighbourhood in New York coffee_shop = coffee_shop.drop_duplicates() coffee_shop
Out[24]:
                                     Latitude Longitude Number of Coffee Shops
                  Neighborhood
           71
                  Kingsbridge
                                     40.881687 -73.902818
                                     40.876551 -73.910660
           132
                 Marble Hill
           179
                                      40.877224 -73.879391
                  Norwood
           242
                  Pelham Parkway
                                     40.857413 -73.854756
           317
                  Bedford Park
                                      40.870185 -73.885512
           473
                  West Farms
                                      40.839475 -73.877745
           550
                                      40.806239 -73.916100
                  Mott Haven
           649
                                      40.815109 -73.816350
                  Throgs Neck
           726
                  Van Nest
                                      40.843608 -73.866299
           758
                  Morris Park
                                      40.847549 -73.850402
           828
                  Belmont
                                      40.857277 -73.888452
           882
                  North Riverdale
                                      40.908543 -73.904531
                                      40.821986 -73.813885
           957
                  Edgewater Park
           1076 Bay Ridge
                                      40.625801 -74.030621
           1235 Greenpoint
                                      40.730201 -73.954241
```

```
In [25]: #number of neighborhoods (out of 306) in New York which contain at least one coffee shop - this is the number of markers which will be shown on the map coffee_shop.shape
```

Out[25]: (122, 4)

```
In [26]: lat = coffee_shop['Latitude']
    lng = coffee_shop['Longitude']
    neighborhood = coffee_shop['Neighborhood']
    number = coffee_shop['Number of Coffee Shops']
```

```
In [27]: #create map which shows number of coffee shops in neighborhoods
    coffee_shop_map = folium.Map(location=[latitude, longitude], zoom_start=10)

# add markers to map
for lat, lng, neighborhood, number in zip(coffee_shop['Latitude'], coffee_shop['Longitude'], coffee_shop['Neighborhood'], coffee_shop['Nu mber of Coffee_shops']):
    label = '{}, {}'.format(neighborhood, number)
    label = folium.Popup(label, parse_html=True)
    folium.CircleMarker(
        [lat, lng],
        radius=5,
        popup=label,
        color='blue',
        fill=Irue,
        fill_color='#3186cc',
        fill_opacity=0.7,
        parse_html=False).add_to(coffee_shop_map)
```

Out[27]: Make this Notebook Trusted to load map: File -> Trust Notebook

```
In [28]: #first group will be neighborhoods containing 3 or less coffee shops
group_a = coffee_shop[coffee_shop['Number of Coffee Shops'] <= 3]

lat_a = group_a['Latitude']
lng_a = group_a['Longitude']
neighborhood_a = group_a['Neighborhood']
number_a = group_a['Number of Coffee Shops']
group_a</pre>
```

Out[28]:

Neighborhood	Latitude	Longitude	Number of Coffee Shops
Kingsbridge	40.881687	-73.902818	1
Marble Hill	40.876551	-73.910660	2
Norwood	40.877224	-73.879391	1
Pelham Parkway	40.857413	-73.854756	1
Bedford Park	40.870185	-73.885512	1
West Farms	40.839475	-73.877745	1
Mott Haven	40.806239	-73.916100	1
Throgs Neck	40.815109	-73.816350	1
Van Nest	40.843608	-73.866299	1
Morris Park	40.847549	-73.850402	1
Belmont	40.857277	-73.888452	2
North Riverdale	40.908543	-73.904531	1
Edgewater Park	40.821986	-73.813885	2
	Kingsbridge Marble Hill Norwood Pelham Parkway Bedford Park West Farms Mott Haven Throgs Neck Van Nest Morris Park Belmont North Riverdale	Kingsbridge 40.881687 Marble Hill 40.876551 Norwood 40.877224 Pelham Parkway 40.857413 Bedford Park 40.870185 West Farms 40.839475 Mott Haven 40.806239 Throgs Neck 40.815109 Van Nest 40.843608 Morris Park 40.857277 North Riverdale 40.908543	Kingsbridge         40.881687         -73.902818           Marble Hill         40.876551         -73.910660           Norwood         40.877224         -73.879391           Pelham Parkway         40.857413         -73.854756           Bedford Park         40.870185         -73.885512           West Farms         40.839475         -73.877745           Mott Haven         40.806239         -73.916100           Throgs Neck         40.815109         -73.816350           Van Nest         40.843608         -73.866299           Morris Park         40.857277         -73.888452           North Riverdale         40.908543         -73.904531

```
In [29]: #second group will be neighborhoods containing between 4 and 6 coffee shops
group_b = coffee_shop[(Coffee_shop['Number of Coffee Shops'] >= 4) & (coffee_shop['Number of Coffee Shops'] <= 6)]</pre>
                  lat_b = group_b['Latitude']
lng_b = group_b['tongitude']
neighborhood_b = group_b['Neighborhood']
number_b = group_b['Number of Coffee Shops']
                  group_b
Out[29]:
```

:		Neighborhood	Latitude	Longitude	Number of Coffee Shops
	1235	Greenpoint	40.730201	-73.954241	6
	1712	Bushwick	40.698116	-73.925258	5
	1931	Cobble Hill	40.687920	-73.998561	4
	2283	Park Slope	40.672321	-73.977050	5
	2654	Downtown	40.690844	-73.983463	5
	2748	Boerum Hill	40.685683	-73.983748	5
	3054	East Williamsburg	40.708492	-73.938858	4
	3659	Hamilton Heights	40.823604	-73.949688	4
	3719	Manhattanville	40.816934	-73.957385	4
	3839	Upper East Side	40.775639	-73.960508	6
	3934	Yorkville	40.775930	-73.947118	5
	4361	Clinton	40.759101	-73.996119	4
	5082	Little Italy	40.719324	-73.997305	4
	5454	Gramercy	40.737210	-73.981376	4
	5568	Battery Park City	40.711932	-74.016869	4

```
In [30]: #third group will be neighborhoods containing 7 or more coffee shops
group_c = coffee_shop[coffee_shop['Number of Coffee Shops'] >= 7]
                    lat_c = group_c['Latitude']
lng_c = group_c['Longitude']
neighborhood_c = group_c['Neighborhood']
number_c = group_c['Number of Coffee Shops']
                    group_c
```

Out[30]:

:		Neighborhood	Latitude	Longitude	Number of Coffee Shops
	1997	Carroll Gardens	40.680540	-73.994654	7
	3127	North Side	40.714823	-73.958809	9
	3225	South Side	40.710861	-73.958001	7
	4072	Lenox Hill	40.768113	-73.958860	7
	4460	Midtown	40.754691	-73.981669	8
	4542	Murray Hill	40.748303	-73.978332	7
	4647	Chelsea	40.744035	-74.003116	9
	5207	Soho	40.722184	-74.000657	7
	5614	Financial District	40.707107	-74.010665	8
	6234	Long Island City	40.750217	-73.939202	8
	7236	Murray Hill	40.764126	-73.812763	7
	8314	Carnegie Hill	40.782683	-73.953256	7

```
In [31]: #check all 122 neighborhoods from complete dataframe have been included group_a.shape
```

Out[31]: (90, 4)