# The Battle of Neighborhoods

# **Introduction Section:**

#### 1.1 Scenario and Problem to be resolved

I'm a beginerin data science. The challenge to resolve is being able to find a rental apartment unit in Manhattan NY that offers similar characteristics and benefits to my current situation. Therefore, in order to set a basis for comparison, I want to find a renta unit subject to the following conditions:

Apartment with min 2 bedrooms with monthly rent not to exceed US\$7000/month
Unit located within walking distance (<=1.0 mile, 1.6 km) from a subway metro station in Manhattan
Area with ammenities and venues similar to the ones described for current location ( See item 2.1)
2. Data Section:

Description of the data and its sources that will be used to solve the problem

2.1 Data of Current Situation

I Currently reside in the neighborhood of 'Mccallum Street' in Downtonw Singapore. I use Foursquare to identify the venues around the area of residence which are then shown in the Singapore map shown in methodology and execution in section 3.0 . It serves as a reference for comparison with the desired future location in Manhattan NY

## 2.2 Data Required to resolve the problem

In order to make a good choice of a similar apartment in Manhattan NY, the following data is required: List/Information on neighborhoods form Manhattan with their Geodata (latitud and longitud. List/Information about the subway metro stations in Manhattan with geodata. Listed apartments for rent in Manhattan area with descriptions (how many beds, price, location, address) Venues and ammenities in the Manhattan neighborhoods (e.g. top 10) 2.3 sources and manipulation The list of Manhattan neighborhoods is worked out during LAb exercise during the course. A csv file was created which will be read in order to create a dataframe and its mapping. The csv file 'mh\_neigh\_data.csv' has the following below data structure. The file will be directly read to the Jupiter Notebook for convenience and space savings. The clustering of neighborhoods and mapping will be shown however. An algorythm was used to determine the geodata from Nominatim . The actual algorythm coding may be shown in 'markdown' mode becasues it takes time to run.

mh\_neigh\_data.tail():

```
Borough Neighborhood Latitude Longitude

35 Manhattan Turtle Bay 40.752042 -73.967708

36 Manhattan Tudor City 40.746917 -73.971219

37 Manhattan Stuyvesant Town 40.731000 -73.974052

38 Manhattan Flatiron 40.739673 -73.990947
```

A list of Manhattan subway metro stops was complied in Numbers (Apple excel) and it was complemeted with wikipedia data (https://en.wikipedia.org/wiki/List\_of\_New\_York\_City\_Subway\_stations\_in\_Manhattan) and information from NY Transit authority and Google maps

(https://www.google.com/maps/search/manhattan+subway+metro+stations/@40.7837297,-74.1033043,11z/data=!3m1!4b1) for a final consolidated list of subway stops names and their address. The geolocation was obtained via an algorythm using Nominatim. Details will be shown in the execution of methodolody in section 3.0. The subway csv file is ''MH\_subway.csv'' and the data structure is: mhsub.tail(): sub station sub address lat long

- 17 190 Street Subway Station Bennett Ave, New York, NY 10040, USA 40.858113 -73.932983
- 18 59 St-Lexington Av Station E 60th St, New York, NY 10065, USA 40.762259 -73.966271
- 19 57 Street Station New York, NY 10019, United States 40.764250 -73.954525
- 20 14 Street / 8 Av New York, NY 10014, United States 40.730862 -73.987156
- 21 MTA New York City 525 11th Ave, New York, NY 10018, USA 40.759809 -73.999282 A list of places for rent was collected by web-browsing real estate companies in Manhattan: http://www.rentmanhattan.com/index.cfm?page=search&state=results https://www.nestpick.com/search?city=new-

york&page=1&order=relevance&district=manhattan&gclid=CjwKCAiAjNjgBRAgEiwAGLlf2hkP3A-cPxjZYkURqQEswQK2jKQEpv\_MvKcrIhRWRzNkc\_r-fGi0lxoCA7cQAvD\_BwE&type=apartment&display=list https://www.realtor.com/apartments/Manhattan\_NY A csv file was compiled with the rental place that indicated: areas of Manhattan, address, number of beds, area and monthly rental price. The csv file "nnnn.csv" had the following below structure. An algorythm was used to create all the geodata using Nominatim, as shown in section 3.0. The actual algorythm coding may be shown in 'markdown' mode becasues it takes time to run. With the use of geolocator = Nominatim(), it was possible to determine the latitude and longiude for the subway metro locations as well as for the geodata for each rental place listed. The loop algorythms used are shown in the execution of data in section 3.0 "Great\_circle" function from geolocator was used to calculate distances between two points, as in the case to calculate average rent price for units around each subway station and at 1.6 km radius. Foursquare is used to find the avenues at Manhattan neighborhoods in general and a cluster is created to later be able to search for the venues depending of the location shown.

### 3. Methodology section:

This section represents the main component of the report where the data is gathered, prepared for analysis. The tools described are used here and the Notebook cells indicates the execution of steps.

#### The analysis and the stragegy:

The strategy is based on mapping the above described data in section 2.0, in order to facilitate the choice of at least two candidate places for rent. The choice is made based on the demands imposed: location near a

subway, rental price and similar venues to Singapore. This visual approach and maps with popups labels allow quick identification of location, price and feature, thus making the selection very easy.

The procesing of these DATA and its mapping will allow to answer the key questions to make a decision:

what is the cost of available rental places that meet the demands?
what is the cost of rent around a mile radius from each subway metro station?
what is the area of Manhattan with best rental pricing that meets criteria established?
What is the distance from work place ( Park Ave and 53 rd St) and the tentative future rental home?
What are the venues of the two best places to live? How the prices compare?
How venues distribute among Manhattan neighborhoods and around metro stations?
Are there tradeoffs between size and price and location?
Any other interesting statistical data findings of the real estate and overall data.

In [2]:

import numpy as np # library to handle data in a vectorized manner
import time
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
import requests # library to handle requests

 $\textbf{from} \ pandas. io. json \ \textbf{import} \ json\_normalize \ \# \ tranform \ JSON \ file \ into \ a \ pandas \ data frame$ 

# 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

# uncomment this line if you haven't completed the Foursquare API lab

import folium # map rendering library
import folium # map rendering library
from folium import plugins

# Matplotlib and associated plotting modules

import matplotlib.cm as cm
import matplotlib.colors as colors
import seaborn as sns

# import k-means from clustering stage

from sklearn.cluster import KMeans

print('Libraries imported.')
Libraries imported.

METHODOLOY EXECUTION - Mapping Data

Singapore Map - Current residence and venues in neighborhood

address = 'Mccallum Street, Singapore'
geolocator = Nominatim()

In [3]:

```
location = geolocator.geocode(address)
latitude = location.latitude
longitude = location.longitude
print('The geograpical coordinate of Singapore home are {}, {}.'.format(latitude, longitude))
/opt/anaconda3/lib/python3.7/site-packages/ipykernel launcher.py:2: Deprecati
onWarning: Using Nominatim with the default "geopy/1.21.0" `user agent` is st
rongly discouraged, as it violates Nominatim's ToS https://operations.osmfoun
dation.org/policies/nominatim/ and may possibly cause 403 and 429 HTTP errors
. Please specify a custom `user agent` with `Nominatim(user agent="my-applica
tion")` or by overriding the default `user agent`: `geopy.geocoders.options.d
efault user agent = "my-application" `. In geopy 2.0 this will become an excep
tion.
The geograpical coordinate of Singapore home are 1.2784801, 103.8493717.
                                                                                  In [4]:
neighborhood_latitude=1.2792655
neighborhood_longitude=103.8480938
                                                                                 In [16]:
# @hidden_cell
CLIENT_ID = 'A1KXZ0XYG5LPBAZ3VJQXRWI10LXMDXVK4RM3UVCVK11WPECH' # your Foursquare ID
CLIENT_SECRET = '2YMA31L53U5O3GWLXHW5BRGPF1QLTSBT5MIDDUP|GBKNM0IK' # your Foursquare Se
cret
VERSION = '20200222' # Foursquare API version
#print('Your credentails:')
#print('CLIENT_ID: ' + CLIENT_ID)
#print('CLIENT_SECRET:' + CLIENT_SECRET)
                                                                                 In [17]:
LIMIT = 100 # limit of number of venues returned by Foursquare API
radius = 500 # define radius
# create URL
url = 'https://api.foursquare.com/v2/venues/explore?&client_id={}&client_secret={}&v={}&ll={},{}&radius={
}&limit={}'.format(
 CLIENT_ID,
 CLIENT_SECRET,
 VERSION,
 neighborhood_latitude,
 neighborhood_longitude,
 radius,
 LIMIT)
url # display URL
                                                                                 Out[17]:
```

'https://api.foursquare.com/v2/venues/explore?&client id=A1KXZ0XYG5LPBAZ3VJQX RWI10LXMDXVK4RM3UVCVK11WPECH&client secret=2YMA31L53U503GWLXHW5BRGPF1QLTSBT5M IDDUPJGBKNM0IK&v=20200222&11=1.2792655,103.8480938&radius=500&limit=100' In [18]: # results display is hidden for report simplification results = requests.get(url).json() results Out[18]: {'meta': {'code': 200, 'requestId': '5e50a40747b43d00239e6f42'}, 'response': {'suggestedFilters': {'header': 'Tap to show:', 'filters': [{'name': 'Open now', 'key': 'openNow'}]}, 'headerLocation': 'Financial District', 'headerFullLocation': 'Financial District, Singapore', 'headerLocationGranularity': 'neighborhood', 'totalResults': 177, 'suggestedBounds': {'ne': {'lat': 1.2837655045000045, 'lng': 103.85258652226942}, 'sw': {'lat': 1.2747654954999954, 'lng': 103.84360107773058}}, 'groups': [{'type': 'Recommended Places', 'name': 'recommended', 'items': [{'reasons': {'count': 0, 'items': [{'summary': 'This spot is popular', 'type': 'general', 'reasonName': 'globalInteractionReason'}]}, 'venue': {'id': '51b49e49abd88dd0b4e7330f', 'name': 'Napoleon Food & Wine Bar', 'location': {'address': '206 Telok Ayer Street', 'lat': 1.2799249387439204, 'lng': 103.84733300574288, 'labeledLatLngs': [{'label': 'display', 'lat': 1.2799249387439204, 'lng': 103.84733300574288}], 'distance': 112, 'postalCode': '068641', 'cc': 'SG', 'neighborhood': 'Tanjong Pagar', 'city': 'Singapore', 'country': 'Singapore', 'formattedAddress': ['206 Telok Ayer Street', '068641', 'Singapore']}

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namese ',
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         'primary': True}],
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       'location': {'address': '51 Telok Ayer St #01-02',
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        'lng': 103.84906805089604,
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         'pluralName': 'Vietnamese Restaurants',
         'shortName': 'Vietnamese',
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namese ',
```

```
'suffix': '.png'},
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       'location': {'address': '7 Wallich Street, #01-04 Tanjong Pagar Centre
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         'Singapore']},
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         'shortName': 'Japanese',
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nese ',
          'suffix': '.png'},
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       'location': {'address': '#01-06 Guoco Tower',
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```

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nese ',
          'suffix': '.png'},
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```

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doors/plaza ',
          'suffix': '.png'},
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n ',
```

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rtainment/artgallery ',
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```
'lng': 103.84806217253097}],
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martialarts ',
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        'cc': 'SG',
        'city': 'Singapore',
        'country': 'Singapore',
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)',
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         'Singapore']},
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         'pluralName': 'Thai Restaurants',
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_',
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eeshop ',
          'suffix': '.png'},
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       'location': {'address': '#01-64 Cross Street Exchange',
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        'lat': 1.2829006497635824,
```

```
'lng': 103.84811639785767,
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an ',
          'suffix': '.png'},
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       'location': {'address': '#B2-16 Guoco Tower',
        'crossStreet': '7 Wallich Street',
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         '078884',
```

```
'Singapore']},
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d_',
            'suffix': '.png'},
           'primary': True}],
        'photos': {'count': 0, 'groups': []}},
       'referralId': 'e-0-58255545b244c8385714dd29-99'}]}}}
                                                                                      In [19]:
def get_category_type(row):
   categories_list = row['categories']
 except:
   categories_list = row['venue.categories']
 if len(categories_list) == 0:
   return None
 else:
   return categories_list[0]['name']
                                                                                      In [20]:
venues = results['response']['groups'][0]['items']
SGnearby_venues = json_normalize(venues) # flatten JSON
# filter columns
filtered_columns = ['venue.name', 'venue.categories', 'venue.location.lat', 'venue.location.lng']
SGnearby_venues = SGnearby_venues.loc[:, filtered_columns]
# filter the category for each row
SGnearby_venues['venue.categories'] = SGnearby_venues.apply(get_category_type, axis=1)
# clean columns
SGnearby_venues.columns = [col.split(".")[-1] for col in SGnearby_venues.columns]
SGnearby_venues.shape
                                                                                      Out[20]:
(100, 4)
                                                                                      In [21]:
# Venues near current Singapore residence place
SGnearby_venues.head(10)
                                                                                      Out[21]:
```

	name	categories	lat	lng	
0	Napoleon Food & Wine Bar	Wine Bar	1.279925	103.847333	
1	Native	Cocktail Bar	1.280135	103.846844	
2	Pepper Bowl	Asian Restaurant	1.279371	103.846710	
3	Park Bench Deli	Deli / Bodega	1.279872	103.847287	
4	Muchachos	Burrito Place	1.279072	103.847026	
5	Mellower Coffee	Café	1.277814	103.848188	
6	Freehouse	Beer Garden	1.281254	103.848513	
7	Sofitel So Singapore	Hotel	1.280017	103.849813	
8	PS.Cafe	Café	1.280468	103.846264	
9	Anglo Indian Cafe & Bar	Indian Restaurant	1.279084	103.850127	
	60:		N 11		In
_	of Singapore residence plaise " <ipython-input< th=""><th></th><th>_</th><th></th><th>erence</th></ipython-input<>		_		erence
					Neighborhood - for re
nce	^				
Syn	taxError: invalid s	syntax			
					In
	ude=1.2792655 itude=103.8480938				
_	nude=103.8480938 eate map of Singapore plac	e using latitude a	nd longitud	le values	
_	_sg = folium.Map(location	=[latitude, longitu	ide], zoom_	start=18)	
	<i>ld markers to map</i> at. lng. label <b>in</b> zip(SGnear	hv venues[ˈlatˈ] S	Gnearhy v	enues[' <mark>]no</mark> ']	SGnearby_venues['name']):
101	as, mg, laber m zip(bullear	by_venues[ rat ], s	Janear Dy_v	chacs[ mg],	ranear by_venues[ hanne ]].

label = folium.Popup(label, parse\_html=True)

folium. Regular Polygon Marker (

```
[lat, lng],
number_of_sides=30,
radius=7,
popup=label,
color='blue',
fill_color='#0f0f0f',
fill_opacity=0.6,
).add_to(map_sg)
map_sg
```

Out[23]: In [24]:

#### MANHATTAN NEIGHBORHOODS - DATA AND MAPPING

Cluster neighborhood data was produced **with** Foursquare during course lab work. A csv file was produced c ontaining the neighborhoods around the 40 Boroughs. Now, the csv file **is** just read **for** convenience **and** cons olidation of report

```
File "<ipython-input-24-622129cdbed0>", line 1
MANHATTAN NEIGHBORHOODS - DATA AND MAPPING
^
```

SyntaxError: invalid syntax

In [39]:

manhattan\_data = pd.read\_csv('/Users/jnagarajan/Documents/mh\_neigh\_data.csv')
manhattan\_data.head()

Out[39]:

	Bor oug h	Neigh borho od	Lati tude	Lon gitu de	Cl ust er La bel	1st Mos t Co mm on Ven ue	2nd Mo st Co mm on Ven ue	3rd Mos t Co mm on Ven ue	4th Mos t Com mon Ven ue	5th Most Com mon Ven ue	6th Mos t Com mon Ven ue	7th Mos t Co mm on Ven ue	8th Mos t Co mm on Ven ue	9th Mos t Co mm on Ven ue	10th Mos t Co mm on Ven ue
0	Man hatta n	Marbl e Hill	40.8 765 51	73.9 1066 0	2	Coff ee Sho p	Dis cou nt Stor e	Yog a Stud io	Stea khou se	Supp leme nt Shop	Tenn is Stadi um	Sho e Stor e	Gy m	Ban k	Seaf ood Rest aura nt
1	Man hatta n	Chinat own	40.7 156 18	73.9 9427 9	2	Chin ese Rest aura nt	Coc ktail Bar	Dim Sum Rest aura nt	Ame rican Rest aura nt	Viet name se Rest aura nt	Salo n / Barb ersh op	Noo dle Hou se	Bak ery	Bub ble Tea Sho p	Ice Crea m Sho p

	Bor oug h	Neigh borho od	Lati tude	Lon gitu de	Cl ust er La bel s	1st Mos t Co mm on Ven ue	2nd Mo st Co mm on Ven ue	3rd Mos t Co mm on Ven ue	4th Mos t Com mon Ven ue	5th Most Com mon Ven ue	6th Mos t Com mon Ven ue	7th Mos t Co mm on Ven ue	8th Mos t Co mm on Ven ue	9th Mos t Co mm on Ven ue	10th Mos t Co mm on Ven ue
2	Man hatta n	Washi ngton Height s	40.8 519 03	73.9 3690 0	4	Café	Bak ery	Mob ile Pho ne Sho p	Pizz a Plac e	Sand wich Place	Park	Gy m	Lati n Ame rica n Rest aura nt	Tap as Rest aura nt	Mex ican Rest aura nt
3	Man hatta n	Inwoo d	40.8 676 84	73.9 2121 0	3	Mex ican Rest aura nt	Lou nge	Pizz a Plac e	Café	Wine Bar	Bake ry	Ame rica n Rest aura nt	Park	Froz en Yog urt Sho p	Spa nish Rest aura nt
4	Man hatta n	Hamilt on Height s	40.8 236 04	73.9 4968 8	0	Mex ican Rest aura nt	Cof fee Sho p	Café	Deli / Bode ga	Pizza Place	Liqu or Store	Indi an Rest aura nt	Sush i Rest aura nt	San dwic h Plac e	Yog a Stud io

In [40]:

manhattan\_data.tail()

Out[40]:

	Bor oug h	Neigh borho od	Lati tude	Lon gitu de	Cl ust er La bel s	1st Mos t Co mm on Ven ue	2nd Mos t Co mm on Ven ue	3rd Mos t Com mon Ven ue	4th Mos t Co mm on Ven ue	5th Mos t Co mm on Ven ue	6th Mos t Co mm on Ven ue	7th Mo st Co mm on Ven ue	8th Mos t Co mm on Ven ue	9th Mos t Co mm on Ven ue	10th Mos t Com mon Ven ue
3 5	Man hatta n	Turtle Bay	40.7 520 42	73.9 6770 8	3	Itali an Rest aura nt	Coff ee Sho p	Stea khou se	Win e Bar	Sush i Rest aura nt	Hote 1	Noo dle Hou se	Indi an Rest aura nt	Japa nese Rest aura nt	Fren ch Rest aura nt

	Bor oug h	Neigh borho od	Lati tude	Lon gitu de	Cl ust er La bel	1st Mos t Co mm on Ven ue	2nd Mos t Co mm on Ven ue	3rd Mos t Com mon Ven ue	4th Mos t Co mm on Ven ue	5th Mos t Co mm on Ven ue	6th Mos t Co mm on Ven ue	7th Mo st Co mm on Ven ue	8th Mos t Co mm on Ven ue	9th Mos t Co mm on Ven ue	10th Mos t Com mon Ven ue
3 6	Man hatta n	Tudor City	40.7 469 17	73.9 7121 9	3	Café	Park	Pizz a Plac e	Mex ican Rest aura nt	Gree k Rest aura nt	Sush i Rest aura nt	Hot el	Deli / Bod ega	Dine r	Dog Run
3 7	Man hatta n	Stuyve sant Town	40.7 310 00	73.9 7405 2	4	Bar	Park	Boat or Ferr y	Bas ketb all Cou rt	Coff ee Sho p	Base ball Fiel d	Gas Stat ion	Beer Gar den	Har bor / Mari na	Play grou nd
3 8	Man hatta n	Flatiro n	40.7 396 73	73.9 9094 7	3	Itali an Rest aura nt	Ame rica n Rest aura nt	Gym	Gy m/ Fitn ess Cent er	Yog a Stud io	Veg etari an / Veg an Rest aura nt	Bak ery	Clot hing Stor e	Cos meti cs Sho p	Cycl e Studi o
3 9	Man hatta n	Hudso n Yards	40.7 566 58	74.0 0011 1	2	Coff ee Sho p	Itali an Rest aura nt	Hote 1	The ater	Ame rica n Rest aura nt	Café	Gy m / Fitn ess Cen ter	Thai Rest aura nt	Rest aura nt	Gym

Manhattan Borough neighborhoods - data with top 10 clustered venue

In [42]:

manhattan\_merged = pd.read\_csv('/Users/jnagarajan/Documents/manhattan\_merged.csv') manhattan\_merged.head()

Out[42]:

	Bor oug h	Neigh borho od	Lati tude	Lon gitu de	Cl ust er La bel s	1st Mos t Co mm on Ven ue	2nd Mo st Co mm on Ven ue	3rd Mos t Co mm on Ven ue	4th Mos t Com mon Ven ue	5th Most Com mon Ven ue	6th Mos t Com mon Ven ue	7th Mos t Co mm on Ven ue	8th Mos t Co mm on Ven ue	9th Mos t Co mm on Ven ue	10th Mos t Co mm on Ven ue
0	Man hatta n	Marbl e Hill	40.8 765 51	73.9 1066 0	2	Coff ee Sho p	Dis cou nt Stor e	Yog a Stud io	Stea khou se	Supp leme nt Shop	Tenn is Stadi um	Sho e Stor e	Gy m	Ban k	Seaf ood Rest aura nt
1	Man hatta n	Chinat own	40.7 156 18	73.9 9427 9	2	Chin ese Rest aura nt	Coc ktail Bar	Dim Sum Rest aura nt	Ame rican Rest aura nt	Viet name se Rest aura nt	Salo n / Barb ersh op	Noo dle Hou se	Bak ery	Bub ble Tea Sho	Ice Crea m Sho p
2	Man hatta n	Washi ngton Height s	40.8 519 03	73.9 3690 0	4	Café	Bak ery	Mob ile Pho ne Sho p	Pizz a Plac e	Sand wich Place	Park	Gy m	Lati n Ame rica n Rest aura nt	Tap as Rest aura nt	Mex ican Rest aura nt
3	Man hatta n	Inwoo d	40.8 676 84	73.9 2121 0	3	Mex ican Rest aura nt	Lou nge	Pizz a Plac e	Café	Wine Bar	Bake ry	Ame rica n Rest aura nt	Park	Froz en Yog urt Sho p	Spa nish Rest aura nt
4	Man hatta n	Hamilt on Height s	40.8 236 04	73.9 4968 8	0	Mex ican Rest aura nt	Cof fee Sho p	Café	Deli / Bode ga	Pizza Place	Liqu or Store	Indi an Rest aura nt	Sush i Rest aura nt	San dwic h Plac e	Yog a Stud io

Map of Manhattan neighborhoods with top 10 clustered venues

In [43]:

# create map of Manhattan using latitude and longitude values from Nominatim

latitude= 40.7308619 longitude= -73.9871558

kclusters=5

```
map_clusters = folium.Map(location=[latitude, longitude], zoom_start=13)
# set color scheme for the clusters
x = np.arange(kclusters)
ys = [i+x+(i*x)**2 \text{ for } i \text{ in } range(kclusters)]
colors_array = cm.rainbow(np.linspace(0, 1, len(ys)))
rainbow = [colors.rgb2hex(i) for i in colors_array]
# add markers to the map
markers_colors = []
for lat, lon, poi, cluster in zip(manhattan_merged['Latitude'], manhattan_merged['Longitude'], manhattan_me
rged['Neighborhood'], manhattan_merged['Cluster Labels']):
 label = folium.Popup(str(poi) + 'Cluster' + str(cluster), parse_html=True)
 folium.CircleMarker(
    [lat, lon],
    radius=20,
   popup=label,
   color=rainbow[cluster-1],
    fill=True,
   fill_color=rainbow[cluster-1],
    fill_opacity=1).add_to(map_clusters)
# add markers for rental places to map
for lat, lng, label in zip(manhattan_data['Latitude'], manhattan_data['Longitude'], manhattan_data['Neighbor
hood']):
 label = folium.Popup(label, parse_html=True)
 folium.CircleMarker(
    [lat, lng],
   radius=5,
   popup=label,
   color='blue',
   fill=True.
   fill_color='#3186cc',
    fill_opacity=1,
    parse_html=False).add_to(map_clusters)
map_clusters
                                                                                                  Out[43]:
```

Examine a paticular Cluster - print venues After examining several cluster data, I concluded that cluster # 2 resembles closer the Singapore place, therefore providing guidance as to where to look for the future apartment. Assign a value to 'kk' to explore a given cluster

# $\#\#\ kk\ is\ the\ cluster\ number\ to\ explore$

kk = 2

manhattan\_merged.loc[manhattan\_merged['Cluster Labels'] == kk, manhattan\_merged.columns[[1] + list(ran ge(5, manhattan\_merged.shape[1]))]]

Out[44]:

	Neighbor hood	1st Most Comm on Venue	2nd Most Comm on Venue	3rd Most Comm on Venue	4th Most Comm on Venue	5th Most Comm on Venue	6th Most Comm on Venue	7th Most Comm on Venue	8th Most Common Venue	9th Most Comm on Venue	10th Most Comm on Venue
0	Marble Hill	Coffee Shop	Discou nt Store	Yoga Studio	Steakh ouse	Supple ment Shop	Tennis Stadiu m	Shoe Store	Gym	Bank	Seafoo d Restau rant
1	Chinatow n	Chines e Restau rant	Cockta il Bar	Dim Sum Restau rant	Americ an Restaur ant	Vietna mese Restaur ant	Salon / Barbers hop	Noodl e House	Bakery	Bubble Tea Shop	Ice Cream Shop
6	Central Harlem	Africa n Restau rant	Seafoo d Restau rant	French Restau rant	Americ an Restaur ant	Cosmet ics Shop	Chines e Restaur ant	Event Space	Liquor Store	Beer Bar	Gym / Fitness Center
9	Yorkville	Coffee Shop	Gym	Bar	Italian Restaur ant	Sushi Restaur ant	Pizza Place	Mexic an Restau rant	Deli / Bodega	Japane se Restau rant	Pub
1 4	Clinton	Theate r	Italian Restau rant	Coffee Shop	Americ an Restaur ant	Gym / Fitness Center	Hotel	Wine Shop	Spa	Gym	Indie Theate r
2 3	Soho	Clothi ng Store	Boutiq ue	Wome n's Store	Shoe Store	Men's Store	Furnitu re / Home Store	Italian Restau rant	Mediterra nean Restaura nt	Art Galler y	Design Studio
2 6	Morningsi de Heights	Coffee Shop	Ameri can Restau rant	Park	Bookst ore	Pizza Place	Sandwi ch Place	Burger Joint	Café	Deli / Bodeg a	Tennis Court

	Neighbor hood	1st Most Comm on Venue	2nd Most Comm on Venue	3rd Most Comm on Venue	4th Most Comm on Venue	5th Most Comm on Venue	6th Most Comm on Venue	7th Most Comm on Venue	8th Most Common Venue	9th Most Comm on Venue	10th Most Comm on Venue
3 4	Sutton Place	Gym / Fitness Center	Italian Restau rant	Furnit ure / Home Store	Indian Restaur ant	Dessert Shop	Americ an Restaur ant	Bakery	Juice Bar	Boutiq ue	Sushi Restau rant
3 9	Hudson Yards	Coffee Shop	Italian Restau rant	Hotel	Theater	Americ an Restaur ant	Café	Gym / Fitness Center	Thai Restaura nt	Restau rant	Gym

In [46]:

 $\label{lem:mh_rent} $$mh\_rent=pd.read\_csv('/Users/jnagarajan/Documents/MH\_flats\_price.csv')$$mh\_rent.head()$ 

Out[46]:

	Address	Area	Price_per_ft2	Rooms	Area- ft2	Rent_Price	Lat	Long	Unnamed: 8
0	West 105th Street	Upper West Side	2.94	5	3400	10000	NaN	NaN	NaN
1	East 97th Street	Upper East Side	3.57	3	2100	7500	NaN	NaN	NaN
2	West 105th Street	Upper West Side	1.89	4	2800	5300	NaN	NaN	NaN
3	CARMINE ST.	West Village	3.03	2	1650	5000	NaN	NaN	NaN
4	171 W 23RD ST.	Chelsea	3.45	2	1450	5000	NaN	NaN	NaN

In [47]:

mh\_rent.tail()

Out[47]:

	Address	Area	Price_per_ft2	Rooms	Area- ft2	Rent_Price	Lat	Long	Unnamed: 8
139	200 East 72nd Street	Rental in Lenox Hill	5.15	3	1700	8750	NaN	NaN	NaN
140	50 Murray Street	No fee rental in Tribeca	7.11	2	1223	8700	NaN	NaN	NaN
141	300 East 56th Street	No fee rental in Midtown East	3.87	3	2100	8118	NaN	NaN	NaN
142	1930 Broadway	No fee rental in Central Park West	5.06	2	1600	8095	NaN	NaN	NaN
143	33 West 9th Street	Rental in Greenwich Village	6.67	2	1500	10000	NaN	NaN	NaN

for n in range(len(mh\_rent)): address= mh\_rent['Address'][n] address=(mh\_rent['Address'][n]+ ' , '+' Manhattan NY ') geolocator = Nominatim() location = geolocator.geocode(address) latitude = location.latitude longitude = location.longitude mh\_rent['Lat'][n]=latitude mh\_rent['Long'][n]=longitude

mh\_rent.to\_csv('MH\_rent\_latlong.csv',index=False)

In [52]:

In [51]:

 $\label{lem:mh_rent} $$mh_rent=pd.read_csv('/Users/jnagarajan/Documents/MH_rent_latlong.csv')$$ $$mh_rent.head()$ 

Out[52]:

	Address	Area	Price_per_ft2	Rooms	Area- ft2	Rent_Price	Lat	Long
0	West 105th Street	Upper West Side	2.94	5	3400	10000	40.799771	73.966213
1	East 97th Street	Upper East Side	3.57	3	2100	7500	40.788585	73.955277
2	West 105th Street	Upper West Side	1.89	4	2800	5300	40.799771	73.966213

	Address	Area	Price_per_ft2	Rooms	Area- ft2	Rent_Price	Lat	Long
3	CARMINE ST.	West Village	3.03	2	1650	5000	40.730523	74.001873
4	171 W 23RD ST.	Chelsea	3.45	2	1450	5000	40.744118	73.995299

Manhattan apartment rent price statistics

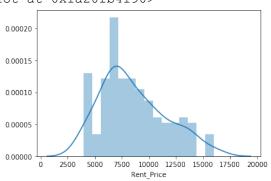
In [54]:

# import seaborn as sns

sns.distplot(mh\_rent['Rent\_Price'],bins=15)

Out[54]:

<matplotlib.axes.\_subplots.AxesSubplot at 0x1a20fb4190>



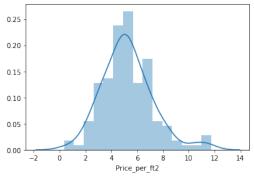
In [55]:

#### import seaborn as sns

sns.distplot(mh\_rent['Price\_per\_ft2'],bins=15)

Out[55]:

<matplotlib.axes.\_subplots.AxesSubplot at 0x1a23c4ae90>

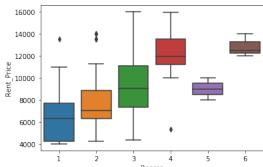


In [56]:

sns.boxplot(x='Rooms', y= 'Rent\_Price', data=mh\_rent)

Out[56]:

<matplotlib.axes.\_subplots.AxesSubplot at 0x1a24677610>



Map of Manhattan apartments for rent The popups will indicate the address and the monthly price for rent thus making it convenient to select the target appartment with the price condition estipulated (max US7000)

In [57]:

 ${\it\# create\ map\ of\ Manhattan\ using\ latitude\ and\ longitude\ values\ from\ Nominatim}$ 

latitude= 40.7308619 longitude= -73.9871558

map\_manhattan\_rent = folium.Map(location=[latitude, longitude], zoom\_start=12.5)

# # add markers to map

for lat, lng, label in zip(mh\_rent['Lat'], mh\_rent['Long'],'\$' + mh\_rent['Rent\_Price'].astype(str)+', '+ mh\_rent[
'Address']):

label = folium.Popup(label, parse\_html=True)
folium.CircleMarker(
 [lat, lng],
 radius=6,
 popup=label,
 color='blue',
 fill=True,
 fill\_color='#3186cc',
 fill\_opacity=0.7,

parse\_html=False).add\_to(map\_manhattan\_rent)

map\_manhattan\_rent

Out[57]:

Map of Manhattan showing the places for rent and the cluster of venues Now, one can point to a rental place for price and address location information while knowing the cluster venues around it. This is an insightful way to explore rental possibilities

In [58]:

# create map of Manhattan using latitude and longitude values from Nominatim

latitude= 40.7308619 longitude= -73.9871558

#### # create map with clusters

kclusters=5

```
map_clusters2 = folium.Map(location=[latitude, longitude], zoom_start=13)
# set color scheme for the clusters
x = np.arange(kclusters)
ys = [i+x+(i*x)**2 \text{ for } i \text{ in } range(kclusters)]
colors_array = cm.rainbow(np.linspace(0, 1, len(ys)))
rainbow = [colors.rgb2hex(i) for i in colors_array]
# add markers to the map
markers_colors = []
for lat, lon, poi, cluster in zip(manhattan_merged['Latitude'], manhattan_merged['Longitude'], manhattan_me
rged['Neighborhood'], manhattan_merged['Cluster Labels']):
 label = folium.Popup(str(poi) + 'Cluster' + str(cluster), parse_html=True)
 folium.CircleMarker(
   [lat, lon],
   radius=20,
   popup=label,
   color=rainbow[cluster-1],
   fill=True.
   fill_color=rainbow[cluster-1],
   fill_opacity=0.7).add_to(map_clusters2)
# add markers to map for rental places
for lat, lng, label in zip(mh_rent['Lat'], mh_rent['Long'],'$' + mh_rent['Rent_Price'].astype(str)+ mh_rent['Add
ress']):
 label = folium.Popup(label, parse_html=True)
 folium.CircleMarker(
   [lat, lng],
   radius=6,
   popup=label,
   color='blue',
   fill=True,
   fill color='#3186cc',
   fill_opacity=0.7,
   parse_html=False).add_to(map_clusters2)
  # Adds tool to the top right
from folium.plugins import MeasureControl
map_manhattan_rent.add_child(MeasureControl())
# FMeasurement ruler icon to establish distnces on map
from folium.plugins import FloatImage
url = ('https://media.licdn.com/mpr/mpr/shrinknp_100_100/AAEAAQAAAAAAAAJGE30TA4YTdlLT
kzZjUtNDFjYy1iZThlLWQ50TNkYzlhNzM40Q.jpg')
```

#### map\_clusters2

Out[58]:

Now one can explore a particular rental place and its venues in detail In the map above, examination of appartments with rental place below 7000/month is straightforwad while knowing the venues around it. We could find an appartment with at the right price and in a location with desirable venues. The next step is to see if it is located near a subway metro station, in next cells work

In [59]:

# ## kk is the cluster number to explore

#### kk = 3

manhattan\_merged.loc[manhattan\_merged['Cluster Labels'] == kk, manhattan\_merged.columns[[1] + list(ran ge(5, manhattan\_merged.shape[1]))]]

Out[59]:

	Neighbor hood	1st Most Comm on Venue	2nd Most Comm on Venue	3rd Most Comm on Venue	4th Most Comm on Venue	5th Most Comm on Venue	6th Most Comm on Venue	7th Most Comm on Venue	8th Most Comm on Venue	9th Most Comm on Venue	10th Most Comm on Venue
3	Inwood	Mexica n Restau rant	Loung e	Pizza Place	Café	Wine Bar	Bakery	Americ an Restau rant	Park	Frozen Yogurt Shop	Spanis h Restaur ant
5	Manhattan ville	Deli / Bodeg a	Italian Restau rant	Seafoo d Restaur ant	Mexica n Restaur ant	Sushi Restaur ant	Beer Garden	Coffee Shop	Falafel Restau rant	Bike Trail	Other Nightlif e
1 0	Lenox Hill	Sushi Restau rant	Italian Restau rant	Coffee Shop	Gym / Fitness Center	Pizza Place	Burger Joint	Deli / Bodeg a	Gym	Sportin g Goods Shop	Thai Restaur ant
1 2	Upper West Side	Italian Restau rant	Bar	Bakery	Vegeta rian / Vegan Restaur ant	Indian Restaur ant	Coffee Shop	Cosme tics Shop	Wine Bar	Mexica n Restau rant	Sushi Restaur ant
1 6	Murray Hill	Sandwi ch Place	Hotel	Japanes e Restaur ant	Gym / Fitness Center	Coffee Shop	Salon / Barbers hop	Burger Joint	French Restau rant	Bar	Italian Restaur ant

	Neighbor hood	1st Most Comm on Venue	2nd Most Comm on Venue	3rd Most Comm on Venue	4th Most Comm on Venue	5th Most Comm on Venue	6th Most Comm on Venue	7th Most Comm on Venue	8th Most Comm on Venue	9th Most Comm on Venue	10th Most Comm on Venue
1 7	Chelsea	Coffee Shop	Italian Restau rant	Ice Cream Shop	Bakery	Nightel ub	Theater	Art Gallery	Seafoo d Restau rant	Americ an Restau rant	Hotel
1 8	Greenwic h Village	Italian Restau rant	Sushi Restau rant	French Restaur ant	Clothin g Store	Chines e Restaur ant	Café	Indian Restau rant	Bakery	Seafoo d Restau rant	Electro nics Store
2 7	Gramercy	Italian Restau rant	Restau rant	Thrift / Vintage Store	Cockta il Bar	Bagel Shop	Coffee Shop	Pizza Place	Mexica n Restau rant	Grocer y Store	Wine Shop
2 9	Financial District	Coffee Shop	Hotel	Gym	Wine Shop	Steakh ouse	Bar	Italian Restau rant	Pizza Place	Park	Gym / Fitness Center
3	Noho	Italian Restau rant	French Restau rant	Cocktai 1 Bar	Gift Shop	Bookst ore	Grocer y Store	Mexica n Restau rant	Hotel	Sushi Restau rant	Coffee Shop
3 2	Civic Center	Gym / Fitness Center	Bakery	Italian Restaur ant	Cockta il Bar	French Restaur ant	Sandwi ch Place	Coffee Shop	Gym	Yoga Studio	Park
3 5	Turtle Bay	Italian Restau rant	Coffee Shop	Steakh ouse	Wine Bar	Sushi Restaur ant	Hotel	Noodle House	Indian Restau rant	Japane se Restau rant	French Restaur ant
3 6	Tudor City	Café	Park	Pizza Place	Mexica n Restaur ant	Greek Restaur ant	Sushi Restaur ant	Hotel	Deli / Bodeg a	Diner	Dog Run
3 8	Flatiron	Italian Restau rant	Americ an Restau rant	Gym	Gym / Fitness Center	Yoga Studio	Vegetar ian / Vegan	Bakery	Clothin g Store	Cosme tics Shop	Cycle Studio

# A csv file summarized the subway station and the addresses for next step to determine geodata  mh=pd.read_csv('/Users/jnagarajan/Documents/NYC_subway_list.csv')  mh.head()  sub_station		Neighbor hood	1st Most Comm on Venue	2nd Most Comm on Venue	3rd Most Comm on Venue	4th Most Comm on Venue	5th Most Comm on Venue	6th Most Comm on Venue Restaur ant	7th Most Comm on Venue	8th Most Comm on Venue	9th Most Comm on Venue	10th Most Comm on Venue
0 Dyckman Street Subway Station 170 Nagle Ave, New York, NY 10034, USA  1 57 Street Subway Station New York, NY 10106, USA  2 Broad St New York, NY 10005, USA  3 175 Street Station 807 W 177th St, New York, NY 10033, USA  4 5 Av and 53 St New York, NY 10022, USA  In [61]:  sLength = len(mh['sub_station']) lat = pd.Series(np.random.randn(sLength)) long=pd.Series(np.random.randn(sLength)) mh = mh.assign(lat=lat.values) mh = mh.assign(long=long.values) for n in range(len(mh)): address= mh['sub_address'][n] geolocator = Nominatim() location = geolocator.geocode(address) latitude = location.latitude longitude = location.longitude mh['lat'][n]=latitude mh['long'][n]=longitude  #print(n,latitude,longitude) time.sleep(2) print('Geodata completed')	mh=	pd.read_csv					_	-	to detern	nine geodo		t[60]:
1 57 Street Subway Station New York, NY 10106, USA  2 Broad St New York, NY 10005, USA  3 175 Street Station 807 W 177th St, New York, NY 10033, USA  4 5 Av and 53 St New York, NY 10022, USA  In [61]:  sLength = len(mh['sub_station']) lat = pd.Series(np.random.randn(sLength)) long=pd.Series(np.random.randn(sLength)) mh = mh.assign(lat=lat.values) mh = mh.assign(long=long.values) for n in range(len(mh)): address= mh['sub_address'][n] geolocator = Nominatim() location = geolocator.geocode(address) latitude = location.latitude longitude = location.longitude mh['lat'][n]=latitude mh['long'][n]=longitude  #print(n,latitude,longitude) time.sleep(2) print('Geodata completed')			sub	_station			S	sub_addres	s			
4 5 Av and 53 St New York, NY 10022, USA  In [61]: sLength = len(mh['sub_station']) lat = pd.Series(np.random.randn(sLength)) long=pd.Series(np.random.randn(sLength)) mh = mh.assign(lat=lat.values) mh = mh.assign(long=long.values) for n in range(len(mh)): address= mh['sub_address'][n] geolocator = Nominatim() location = geolocator.geocode(address) latitude = location.latitude longitude = location.longitude mh['lat'][n]=latitude mh['long'][n]=longitude  #print(n,latitude,longitude) time.sleep(2) print('Geodata completed')	1		reet Subwa	y Station	170 Nagle	New	York, NY	10106, US <i>i</i>	A			
sLength = len(mh['sub_station']) lat = pd.Series(np.random.randn(sLength)) long=pd.Series(np.random.randn(sLength)) mh = mh.assign(lat=lat.values) mh = mh.assign(long=long.values) for n in range(len(mh)): address= mh['sub_address'][n] geolocator = Nominatim() location = geolocator.geocode(address) latitude = location.latitude longitude = location.longitude mh['lat'][n]=latitude mh['long'][n]=longitude  #print(n,latitude,longitude) time.sleep(2) print('Geodata completed')	3		175 Stree	et Station	807 W 17	7th St, New	York, NY	10033, USA	A			
sLength = len(mh['sub_station']) lat = pd.Series(np.random.randn(sLength)) long=pd.Series(np.random.randn(sLength)) mh = mh.assign(lat=lat.values) mh = mh.assign(long=long.values) for n in range(len(mh)): address= mh['sub_address'][n] geolocator = Nominatim() location = geolocator.geocode(address) latitude = location.latitude longitude = location.longitude mh['lat'][n]=latitude mh['long'][n]=longitude  #print(n,latitude,longitude) time.sleep(2) print('Geodata completed')	4		5 Av 8	and 53 St		New	York, NY	10022, USA	Λ			
In [ ]:	lat = long mh = mh = for r geo mh[	pd.Series(n =pd.Series(n = mh.assign(n = mh.assign(n n in range(lolocator.geo 'lat'][n]=lati	np.randon np.randon (lat=lat.va (long=lon en(mh)): ocode(ad tude mh	n.randn(s m.randn(s alues) g.values) address= ldress) la ['long'][n] de) time.	sLength)) = mh['sul titude =    =longitu	ocation.				v	cation =	[61]:
mh.to_csv('/Users/jnagarajan/Documents/MH_subway.csv',index=False) mh.shape	mh.t	co_csv(' <mark>/Use</mark>	rs/jnagaı	rajan/Doc	uments/I	MH_subwa	ay.csv',ind	ex <b>=False</b> ]	) mh.shaj	pe	I	in [ ]:

 $mh = pd.read\_csv('/Users/jnagarajan/Documents/MH\_subway.csv')$ 

In [63]:

print(mh.shape)

O 1	$\Gamma \cap \Gamma$
Out	しりろし

	sub_station	sub_address	lat	long
0	Dyckman Street Subway Station	170 Nagle Ave, New York, NY 10034, USA	40.861857	-73.924509
1	57 Street Subway Station	New York, NY 10106, USA	40.764250	-73.954525
2	Broad St	New York, NY 10005, USA	40.730862	-73.987156
3	175 Street Station	807 W 177th St, New York, NY 10033, USA	40.847991	-73.939785
4	5 Av and 53 St	New York, NY 10022, USA	40.764250	-73.954525
				Ιı

# removing duplicate rows and creating new set mhsub1

Out[64]:

(22, 4)
In [65]:

mhsub1.tail()

	sub_station	sub_address	lat	long
17	190 Street Subway Station	Bennett Ave, New York, NY 10040, USA	40.858113	-73.932983
18	59 St-Lexington Av Station	E 60th St, New York, NY 10065, USA	40.762259	-73.966271
19	57 Street Station	New York, NY 10019, United States	40.764250	-73.954525
20	14 Street / 8 Av	New York, NY 10014, United States	40.730862	-73.987156
21	MTA New York City	525 11th Ave, New York, NY 10018, USA	40.759809	-73.999282

In [66]:

Out[65]:

# map subway stations

# create map of Manhattan using latitude and longitude values obtain previoulsy via Moninatim geolocator

```
latitude=40.7308619
longitude=-73.9871558

map_mhsub1 = folium.Map(location=[latitude, longitude], zoom_start=12)

# add markers of subway locations to map
for lat, lng, label in zip(mhsub1['lat'], mhsub1['long'], mhsub1['sub_station'].astype(str)):
    label = folium.Popup(label, parse_html=True)
    folium.RegularPolygonMarker(
        [lat, lng],
        number_of_sides=6,
        radius=6,
        popup=label,
        color='red',
        fill_color='red',
```

Out[66]:

Map of Manhattan showing places for rent and the subway locations nearby Now, we can visualize the desirable rental places and their nearest subway station. Popups display rental address and monthly rental price and the subway station name. Notice that the icon in the top-right corner is a "ruler" that allows to measure the distance from a rental place to an specific subway station

In [68]:

mh\_rent.head()

map\_mhsub1

fill\_opacity=2.5,
).add\_to(map\_mhsub1)

Out[68]:

	Address	Area	Price_per_ft2	Rooms	Area- ft2	Rent_Price	Lat	Long
0	West 105th Street	Upper West Side	2.94	5	3400	10000	40.799771	73.966213
1	East 97th Street	Upper East Side	3.57	3	2100	7500	40.788585	73.955277
2	West 105th Street	Upper West Side	1.89	4	2800	5300	40.799771	73.966213
3	CARMINE ST.	West Village	3.03	2	1650	5000	40.730523	74.001873
4	171 W 23RD ST.	Chelsea	3.45	2	1450	5000	40.744118	73.995299

```
In [69]:
```

```
# create map of Manhattan using latitude and longitude values from Nominatim
latitude= 40.7308619
longitude= -73.9871558
map_manhattan_rent = folium.Map(location=[latitude, longitude], zoom_start=13.3)
# add markers to map
for lat, lng, label in zip(mh_rent['Lat'], mh_rent['Long'],'$' + mh_rent['Rent_Price'].astype(str)+ mh_rent['Add
ress']):
 label = folium.Popup(label, parse_html=True)
 folium.CircleMarker(
   [lat, lng],
   radius=6,
   popup=label,
   color='blue',
   fill=True,
   fill_color='#3186cc',
   fill_opacity=0.7,
   parse_html=False).add_to(map_manhattan_rent)
  # add markers of subway locations to map
for lat, lng, label in zip(mhsub1['lat'], mhsub1['long'], mhsub1['sub_station'].astype(str)):
 label = folium.Popup(label, parse_html=True)
 folium.RegularPolygonMarker(
   [lat, lng],
   number_of_sides=6,
   radius=6,
   popup=label,
   color='red',
   fill_color='red',
   fill_opacity=2.5,
 ).add_to(map_manhattan_rent)
  # Adds tool to the top right
from folium.plugins import MeasureControl
map_manhattan_rent.add_child(MeasureControl())
# Measurement ruler icon tool to measure distances in map
from folium.plugins import FloatImage
url = ('https://media.licdn.com/mpr/mpr/shrinknp_100_100/AAEAAQAAAAAAAAJGE30TA4YTdlLT
kzZjUtNDFjYy1iZThlLWQ50TNkYzlhNzM40Q.jpg')
FloatImage(url, bottom=5, left=85).add_to(map_manhattan_rent)
```

```
map_manhattan_rent
                                                                                                 Out[69]:
4.0 Results
                                                                                                 In [71]:
# create map of Manhattan using latitude and longitude values from Nominatim
latitude= 40.7308619
longitude= -73.9871558
map_mh_one = folium.Map(location=[latitude, longitude], zoom_start=13.3)
# add markers to map
for lat, lng, label in zip(mh_rent['Lat'], mh_rent['Long'],'$' + mh_rent['Rent_Price'].astype(str)+','+mh_rent['
Address']):
 label = folium.Popup(label, parse_html=True)
 folium.CircleMarker(
    [lat, lng],
   radius=6,
   popup=label,
   color='blue',
   fill=True,
   fill_color='#3186cc',
   fill_opacity=0.7,
   parse_html=False).add_to(map_mh_one)
  # add markers of subway locations to map
for lat, lng, label in zip(mhsub1['lat'], mhsub1['long'], mhsub1['sub_station'].astype(str)):
 label = folium.Popup(label, parse_html=True)
 folium.RegularPolygonMarker(
    [lat, lng],
   number_of_sides=6,
   radius=6,
   popup=label,
   color='red',
   fill_color='red',
    fill_opacity=2.5,
 ).add_to(map_mh_one)
# set color scheme for the clusters
kclusters=5
x = np.arange(kclusters)
ys = [i+x+(i*x)**2 \text{ for } i \text{ in } range(kclusters)]
colors_array = cm.rainbow(np.linspace(0, 1, len(ys)))
rainbow = [colors.rgb2hex(i) for i in colors_array]
```

```
# add markers to the map
markers_colors = []
for lat. lon. poi. cluster in
```

**for** lat, lon, poi, cluster **in** zip(manhattan\_merged['Latitude'], manhattan\_merged['Longitude'], manhattan\_merged['Neighborhood'], manhattan\_merged['Cluster Labels']):

```
label = folium.Popup(str(poi) + 'Cluster' + str(cluster), parse_html=True)
folium.CircleMarker(
    [lat, lon],
    radius=15,
    popup=label,
    color=rainbow[cluster-1],
    fill=True,
    fill_color=rainbow[cluster-1],
    fill_opacity=0.7).add_to(map_mh_one)
```

### # Adds tool to the top right

from folium.plugins import MeasureControl
map\_mh\_one.add\_child(MeasureControl())

#### # Measurement ruler icon tool to measure distances in map

**from** folium.plugins **import** FloatImage

url = ('https://media.licdn.com/mpr/mpr/shrinknp\_100\_100/AAEAAQAAAAAAAAJGE30TA4YTdlLT
kzZjUtNDFjYy1iZThlLWQ50TNkYzlhNzM40Q.jpg')

FloatImage(url, bottom=5, left=85).add\_to(map\_mh\_one)

map\_mh\_one

Problem Resolution - Select the apartment for rent Venues for Apartment 1 - Cluster 2

In [72]:

Out[71]:

#### ## kk is the cluster number to explore

kk = 2

manhattan\_merged.loc[manhattan\_merged['Cluster Labels'] == kk, manhattan\_merged.columns[[1] + list(ran ge(5, manhattan\_merged.shape[1]))]]

Out[72]:

	Neighbor hood	1st Most Comm on Venue	2nd Most Comm on Venue	3rd Most Comm on Venue	4th Most Comm on Venue	5th Most Comm on Venue	6th Most Comm on Venue	7th Most Comm on Venue	8th Most Common Venue	9th Most Comm on Venue	10th Most Comm on Venue
0	Marble Hill	Coffee Shop	Discou nt Store	Yoga Studio	Steakh ouse	Supple ment Shop	Tennis Stadiu m	Shoe Store	Gym	Bank	Seafoo d Restau rant

	Neighbor hood	1st Most Comm on Venue	2nd Most Comm on Venue	3rd Most Comm on Venue	4th Most Comm on Venue	5th Most Comm on Venue	6th Most Comm on Venue	7th Most Comm on Venue	8th Most Common Venue	9th Most Comm on Venue	10th Most Comm on Venue
1	Chinatow n	Chines e Restau rant	Cockta il Bar	Dim Sum Restau rant	Americ an Restaur ant	Vietna mese Restaur ant	Salon / Barbers hop	Noodl e House	Bakery	Bubble Tea Shop	Ice Cream Shop
6	Central Harlem	Africa n Restau rant	Seafoo d Restau rant	French Restau rant	Americ an Restaur ant	Cosmet ics Shop	Chines e Restaur ant	Event Space	Liquor Store	Beer Bar	Gym / Fitness Center
9	Yorkville	Coffee Shop	Gym	Bar	Italian Restaur ant	Sushi Restaur ant	Pizza Place	Mexic an Restau rant	Deli / Bodega	Japane se Restau rant	Pub
1 4	Clinton	Theate r	Italian Restau rant	Coffee Shop	Americ an Restaur ant	Gym / Fitness Center	Hotel	Wine Shop	Spa	Gym	Indie Theate r
2 3	Soho	Clothi ng Store	Boutiq ue	Wome n's Store	Shoe Store	Men's Store	Furnitu re / Home Store	Italian Restau rant	Mediterra nean Restaura nt	Art Galler y	Design Studio
2 6	Morningsi de Heights	Coffee Shop	Ameri can Restau rant	Park	Bookst ore	Pizza Place	Sandwi ch Place	Burger Joint	Café	Deli / Bodeg a	Tennis Court
3 4	Sutton Place	Gym / Fitness Center	Italian Restau rant	Furnit ure / Home Store	Indian Restaur ant	Dessert Shop	Americ an Restaur ant	Bakery	Juice Bar	Boutiq ue	Sushi Restau rant
3 9	Hudson Yards	Coffee Shop	Italian Restau rant	Hotel	Theater	Americ an Restaur ant	Café	Gym / Fitness Center	Thai Restaura nt	Restau rant	Gym

manhattan\_merged.loc[manhattan\_merged['Cluster Labels'] == kk, manhattan\_merged.columns[[1] + list(ran ge(5, manhattan\_merged.shape[1]))]]

Out[73]:

	Neighbor hood	1st Most Comm on Venue	2nd Most Comm on Venue	3rd Most Comm on Venue	4th Most Comm on Venue	5th Most Comm on Venue	6th Most Comm on Venue	7th Most Comm on Venue	8th Most Comm on Venue	9th Most Comm on Venue	10th Most Comm on Venue
3	Inwood	Mexica n Restau rant	Loung e	Pizza Place	Café	Wine Bar	Bakery	Americ an Restau rant	Park	Frozen Yogurt Shop	Spanis h Restaur
5	Manhattan ville	Deli / Bodeg a	Italian Restau rant	Seafoo d Restaur ant	Mexica n Restaur ant	Sushi Restaur ant	Beer Garden	Coffee Shop	Falafel Restau rant	Bike Trail	Other Nightlif e
1 0	Lenox Hill	Sushi Restau rant	Italian Restau rant	Coffee Shop	Gym / Fitness Center	Pizza Place	Burger Joint	Deli / Bodeg a	Gym	Sportin g Goods Shop	Thai Restaur ant
1 2	Upper West Side	Italian Restau rant	Bar	Bakery	Vegeta rian / Vegan Restaur ant	Indian Restaur ant	Coffee Shop	Cosme tics Shop	Wine Bar	Mexica n Restau rant	Sushi Restaur ant
1 6	Murray Hill	Sandwi ch Place	Hotel	Japanes e Restaur ant	Gym / Fitness Center	Coffee Shop	Salon / Barbers hop	Burger Joint	French Restau rant	Bar	Italian Restaur ant
1 7	Chelsea	Coffee Shop	Italian Restau rant	Ice Cream Shop	Bakery	Nightcl ub	Theater	Art Gallery	Seafoo d Restau rant	Americ an Restau rant	Hotel
1 8	Greenwic h Village	Italian Restau rant	Sushi Restau rant	French Restaur ant	Clothin g Store	Chines e Restaur ant	Café	Indian Restau rant	Bakery	Seafoo d Restau rant	Electro nics Store
2 7	Gramercy	Italian Restau rant	Restau rant	Thrift / Vintage Store	Cockta il Bar	Bagel Shop	Coffee Shop	Pizza Place	Mexica n	Grocer y Store	Wine Shop

	Neighbor hood	1st Most Comm on Venue	2nd Most Comm on Venue	3rd Most Comm on Venue	4th Most Comm on Venue	5th Most Comm on Venue	6th Most Comm on Venue	7th Most Comm on Venue	8th Most Comm on Venue	9th Most Comm on Venue	10th Most Comm on Venue
									rant		
2 9	Financial District	Coffee Shop	Hotel	Gym	Wine Shop	Steakh ouse	Bar	Italian Restau rant	Pizza Place	Park	Gym / Fitness Center
3	Noho	Italian Restau rant	French Restau rant	Cocktai 1 Bar	Gift Shop	Bookst ore	Grocer y Store	Mexica n Restau rant	Hotel	Sushi Restau rant	Coffee Shop
3 2	Civic Center	Gym / Fitness Center	Bakery	Italian Restaur ant	Cockta il Bar	French Restaur ant	Sandwi ch Place	Coffee Shop	Gym	Yoga Studio	Park
3 5	Turtle Bay	Italian Restau rant	Coffee Shop	Steakh ouse	Wine Bar	Sushi Restaur ant	Hotel	Noodle House	Indian Restau rant	Japane se Restau rant	French Restaur ant
3 6	Tudor City	Café	Park	Pizza Place	Mexica n Restaur ant	Greek Restaur ant	Sushi Restaur ant	Hotel	Deli / Bodeg a	Diner	Dog Run
3 8	Flatiron	Italian Restau rant	Americ an Restau rant	Gym	Gym / Fitness Center	Yoga Studio	Vegetar ian / Vegan Restaur ant	Bakery	Clothin g Store	Cosme tics Shop	Cycle Studio

5.0 DISCUSSION In general, I am positively impressed with the overall organization, content and lab works presented during the Coursera IBM Certification Course I feel this Capstone project presented me a great opportunity to practice and apply the Data Science tools and methodologies learned. I have created a good project that I can present as an example to show my potential. I feel I have acquired a good starting point to become a professional Data Scientist and I will continue exploring to creating examples of practical cases

6.0 CONCLUSIONS I feel rewarded with the efforts, time and money spent. I believe this course with all the topics covered is well worthy of appreciation. This project has shown me a practical application to resolve a real situation that has impacting personal and financial impact using Data Science tools. The mapping with Folium is a very powerful technique to consolidate information and make the analysis and decision thoroughly and with confidence. I would recommend for use in

similar situations. One must keep abreast of new tools for DS that continue to appear for application in several business fields