

Segmenting and Clustering Neighbourhoods in Toronto

- Part 3

In [1]:

```
pip install geopy
```

```
Requirement already satisfied: geopy in ./anaconda3/lib/python3.8/site-packages (2.1.0)
```

```
Requirement already satisfied: geographiclib<2,>=1.49 in ./anaconda3/lib/python3.8/site-packages (from geopy) (1.50)
```

```
Note: you may need to restart the kernel to use updated packages.
```

In [2]:

```
pip install folium
```

```
Requirement already satisfied: folium in ./anaconda3/lib/python3.8/site-packages (0.12.0)
```

```
Requirement already satisfied: jinja2>=2.9 in ./anaconda3/lib/python3.8/site-packages (from folium) (2.11.2)
```

```
Requirement already satisfied: branca>=0.3.0 in ./anaconda3/lib/python3.8/site-packages (from folium) (0.4.2)
```

```
Requirement already satisfied: requests in ./anaconda3/lib/python3.8/site-packages (from folium) (2.24.0)
```

```
Requirement already satisfied: numpy in ./anaconda3/lib/python3.8/site-packages (from folium) (1.18.5)
```

```
Requirement already satisfied: MarkupSafe>=0.23 in ./anaconda3/lib/python3.8/site-packages (from jinja2>=2.9->folium) (1.1.1)
```

```
Requirement already satisfied: certifi>=2017.4.17 in ./anaconda3/lib/python3.8/site-packages (from requests->folium) (2020.6.20)
```

```
Requirement already satisfied: idna<3,>=2.5 in ./anaconda3/lib/python3.8/site-packages (from requests->folium) (2.10)
```

```
Requirement already satisfied: urllib3!=1.25.0,!1.25.1,<1.26,>=1.21.1 in ./anaconda3/lib/python3.8/site-packages (from requests->folium) (1.25.9)
```

```
Requirement already satisfied: chardet<4,>=3.0.2 in ./anaconda3/lib/python3.8/site-packages (from requests->folium) (3.0.4)
```

```
Note: you may need to restart the kernel to use updated packages.
```

In [3]:

```
import folium
```

```
import requests
```

```
import json
```

```
import matplotlib.cm as cm
```

```
import matplotlib.colors as colors
```

```
import pandas as pd
```

```
from pandas.io.json import json_normalize
```

```
from sklearn.cluster import KMeans
```

```
from geopy.geocoders import Nominatim

pd.set_option('display.max_columns', None)
pd.set_option('display.max_rows', None)

print("Imported!")

Imported!
```

In [4]:

```
df = pd.read_csv('toronto_part2.csv')
print(df.shape)
df.head()

(180, 5)
```

Out[4]:

	P o s t a l c o d e	B o r o u g h	N e i g h b o r h o o d	L a t i t u d e	L o n g i t u d e
0	M 1 A \n	N o t a s s i g n e d \n	N o t a s s i g n e d \n	4 3 . 6 4 8 6 9	- 7 9 . 3 8 5 4 4

	P o s t a l c o d e	B o r o u g h	N e i g h b o r h o o d	L a t i t u d e	L o n g i t u d e
1	M 1 B \ n	S c a r b o r o u g h \ n	M a l v e r n , R o u g e	4 3 . 8 1 1 3 9	- 7 9 . 1 9 6 6 2
2	M 1 C \ n	S c a r b o r o u g h \ n	R o u g e H i l l , P o r t U n	4 3 . 7 8 5 7 4	- 7 9 . 1 5 8 7 5

	P o s t a l c o d e	B o r o u g h	N e i g h b o r h o o d	L a t i t u d e	L o n g i t u d e
			i o n , H i g h l a n d C r e e k		
3	M 1 E \ n	S c a r b o r o u g h	G u i l d w o o d , M o	4 3 . 7 6 5 7 5	- 7 9 . 1 7 4 7 0

	P o s t a l c o d e	B o r o u g h	N e i g h b o r h o o d	L a t i t u d e	L o n g i t u d e
		\ n	r n i n g s i d e , W e s t H i l l		
4	M 1 G \ n	S c a r b o r o u g h	W o b u r n	4 3 . 7 6 8 1 2	- 7 9 . 2 1 7 6 1

	P o s t a l c o d e	B o r o u g h	N e i g h b o r h o o d	L a t i t u d e	L o n g i t u d e
		\n			

In [10]:

```
address = 'Toronto, Ontario Canada'
geolocator = Nominatim(user_agent="http")
location = geolocator.geocode(address)
latitude = location.latitude
longitude = location.longitude
print('The geograpical coordinate of Toronto Canada are {}, {}'.format(latitude, longitude))
```

The geograpical coordinate of Toronto Canada are 43.6534817, -79.3839347.

In [11]:

```
map_toronto = folium.Map(location=[latitude, longitude], zoom_start=11)
for lat, lng, borough, neighborhood in zip(df['Latitude'], df['Longitude'], df['Borough'], df['Neighborhood']):
    label = '{} {}'.format(neighborhood, borough)
    label = folium.Popup(label, parse_html=True)
    folium.CircleMarker(
        [lat, lng],
        radius=4,
        popup=label,
        color='blue',
        fill=True,
        fill_color='#87cefa',
        fill_opacity=0.5,
        parse_html=False).add_to(map_toronto)
map_toronto
```

Out[11]:

Make this Notebook Trusted to load map: File -> Trust Notebook

```
In [12]:
toronto_data = df[df['Borough'].str.contains("Toronto")].reset_index(drop=True)
print(toronto_data.shape)
toronto_data.head()

(39, 5)
```

Out[12]:

	P o s t a l c o d e	B o r o u g h	N e i g h b o r h o o d	L a t i t u d e	L o n g i t u d e
0	M 4 E \n	E a s t T o r o n t o \n	T h e B e a c h e s	4 3 . 6 7 7 0 9	- 7 9 . 2 9 5 4 7
1	M 4 K \n	E a s t T o r o	T h e D a n f o	4 3 . 6 8 3	- 7 9 . 3 5 5

	P o s t a l c o d e	B o r o u g h	N e i g h b o r h o o d	L a t i t u d e	L o n g i t u d e
		n t o \ n	r t h W e s t , R i v e r d a l e	7 5	1 2
2	M 4 L \ n	E a s t T o r o n t o	I n d i a B a z a a r ,	4 3 . 6 6 7 9 7	- 7 9 . 3 1 4 6 7

	P o s t a l c o d e	B o r o u g h	N e i g h b o r h o o d	L a t i t u d e	L o n g i t u d e
		\n	T h e B e a c h e s W e s t		
3	M 4 M \n	E a s t T o r o n t o \n	S t u d i o D i s t r i c t	4 3 . 6 6 2 1 3	- 7 9 . 3 3 4 9 7

	P o s t a l c o d e	B o r o u g h	N e i g h b o r h o o d	L a t i t u d e	L o n g i t u d e
4	M 4 N \n	C e n t r a l T o r o n t o \n	L a w r e n c e P a r k	4 3 . 7 2 8 4 3	- 7 9 . 3 8 7 1 3

In [13]:

```
map_toronto = folium.Map(location=[latitude, longitude], zoom_start=11)

for lat, lng, label in zip(toronto_data['Latitude'],
                           toronto_data['Longitude'],
                           toronto_data['Neighborhood']):
    label = folium.Popup(label, parse_html=True)
    folium.CircleMarker([lat, lng], radius=5, popup=label, color='blue', fill
                        =True, fill_color='#3186cc', fill_opacity=0.7, parse_html=False).add_to(map_to
                        ronto)
map_toronto
```

Out[13]:

Make this Notebook Trusted to load map: File -> Trust Notebook

In [14]:

```

# Foursquare API
CLIENT_ID = 'DPBY4JUY3DU20ALPSUV4ONY2K1GOJJKJ1NIHBB32XEMOVYY' # Put Your Client Id
CLIENT_SECRET = '1MV443TYEP4HUO0WDUW5NQ5W10L2Y4G05NWG11WIR3NUGC5B' # Put Your Client Secret
VERSION = '20180604'
LIMIT = 30
print('Your credentials:')
print('CLIENT_ID: Hidden')
print('CLIENT_SECRET: Hidden')
Your credentials:
CLIENT_ID: Hidden
CLIENT_SECRET: Hidden
1. Exploring Neighbourhood in Toronto

```

In [15]:

```

def getNearbyVenues(names, latitudes, longitudes, radius=500):

    venues_list=[]
    for name, lat, lng in zip(names, latitudes, longitudes):
        print(name)

        url = 'https://api.foursquare.com/v2/venues/explore?&client_id={}&client_secret={}&v={}&ll={},{}&radius={}&limit={}'.format(
            CLIENT_ID, CLIENT_SECRET, VERSION, lat, lng, radius, LIMIT)

        results = requests.get(url).json()["response"]['groups'][0]['items']

        venues_list.append([( name, lat, lng, v['venue']['name'], v['venue']['location']['lat'],
            v['venue']['location']['lng'], v['venue']['categories'][0]['name']) for v in results])

    nearby_venues = pd.DataFrame([item for venue_list in venues_list for item in venue_list])
    nearby_venues.columns = ['Neighborhood', 'Neighborhood Latitude', 'Neighborhood Longitude', 'Venue', 'Venue Latitude', 'Venue Longitude', 'Venue Category']

    return(nearby_venues)

```

In [16]:

```

df = toronto_data
toronto_venues = getNearbyVenues(names=df['Neighborhood'], latitudes=df['Latitude'], longitudes=df['Longitude'])

The Beaches

```

The Danforth West, Riverdale
India Bazaar, The Beaches West
Studio District
Lawrence Park
Davisville North
North Toronto West, Lawrence Park
Davisville
Moore Park, Summerhill East
Summerhill West, Rathnelly, South Hill, Forest Hill SE, Deer Park
Rosedale
St. James Town, Cabbagetown
Church and Wellesley
Regent Park, Harbourfront
Garden District, Ryerson
St. James Town
Berczy Park
Central Bay Street
Richmond, Adelaide, King
Harbourfront East, Union Station, Toronto Islands
Toronto Dominion Centre, Design Exchange
Commerce Court, Victoria Hotel
Roselawn
Forest Hill North & West, Forest Hill Road Park
The Annex, North Midtown, Yorkville
University of Toronto, Harbord
Kensington Market, Chinatown, Grange Park
CN Tower, King and Spadina, Railway Lands, Harbourfront West, Bathurst Quay,
South Niagara, Island airport
Stn A PO Boxes
First Canadian Place, Underground city
Christie
Dufferin, Dovercourt Village
Little Portugal, Trinity
Brockton, Parkdale Village, Exhibition Place
High Park, The Junction South
Parkdale, Roncesvalles
Runnymede, Swansea
Queen's Park, Ontario Provincial Government
Business reply mail Processing Centre, South Central Letter Processing Plant
Toronto

In [17]:

```
print(toronto_venues.shape)
toronto_venues.head()

(805, 7)
```

Out[17]:

	N e i g h b o r h o o d	N e i g h b o r h o o d L a t i t u d e	N e i g h b o r h o o d L o n g i t u d e	V e n u e	V e n u e L a t i t u d e	V e n u e L o n g i t u d e	V e n u e C a t e g o r y
	T h e B e a c h e s	4 3 . 6 7 7 0 9	- 7 9 . 2 9 5 4 7	C l e n N a n o r R a v i n e	4 3 . 6 7 6 8 2 1	- 7 9 . 2 9 3 9 4 2	T r a i l
	T h e B	4 3 . 6	- 7 9 .	T h e E	4 3 . 6	- 7 9 .	H e a l

	N e i g h b o r h o o d	N e i g h b o r h o o d L a t i t u d e	N e i g h b o r h o o d L o n g i t u d e	V e n u e	V e n u e L a t i t u d e	V e n u e L o n g i t u d e	V e n u e C a t e g o r y
	e a c h e s	7 7 0 9	2 9 5 4 7	i g C a r r o t N a t u r a l F o o d M a r k	7 8 8 7 9	2 9 7 7 3 4	t h F o o d S t o r e

	N e i g h b o r h o o d	N e i g h b o r h o o d L a t i t u d e	N e i g h b o r h o o d L o n g i t u d e	V e n u e	V e n u e L a t i t u d e	V e n u e L o n g i t u d e	V e n u e C a t e g o r y
				e t			
	T h e B e a c h e s	4 3 · 6 7 7 0 9	- 7 9 · 2 9 5 4 7	C r o v e r P u b l i c a n d C r u b	4 3 · 6 7 9 1 8 1	- 7 9 · 2 9 7 2 1 5	P u b

	N e i g h b o r h o o d	N e i g h b o r h o o d L a t i t u d e	N e i g h b o r h o o d L o n g i t u d e	V e n u e	V e n u e L a t i t u d e	V e n u e L o n g i t u d e	V e n u e C a t e g o r y
	T h e B e a c h e s	4 3 · 6 7 7 0 9	- 7 9 · 2 9 5 4 7	S e a s p r a y R e s t a u r a n t	4 3 · 6 7 8 8 8 8	- 7 9 · 2 9 8 1 6 7	A s i a n R e s t a u r a n t
	T h	4 3	- 7	U p	4 3	- 7	N e

	N e i g h b o r h o o d	N e i g h b o r h o o d L a t i t u d e	N e i g h b o r h o o d L o n g i t u d e	V e n u e	V e n u e L a t i t u d e	V e n u e L o n g i t u d e	V e n u e C a t e g o r y
	e B e a c h e s	. 6 7 7 0 9	9 .2 9 5 4 7	p e r B e a c h e s	. 6 8 0 5 6 3	9 .2 9 2 8 6 9	i g h b o r h o o d

```

Dufferin, Dovercourt Village
Little Portugal, Trinity
Brockton, Parkdale Village, Exhibition Place
High Park, The Junction South
Parkdale, Roncesvalles
Runnymede, Swansea
Queen's Park, Ontario Provincial Government
Business reply mail Processing Centre, South Central Letter Processing Plant
Toronto

In [17]:

print(toronto_venues.shape)

```

```
toronto_venues.head()  
(805, 7)
```

Out[17]:

	Neighborhood	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
	The Beaches	43.67709	-79.29547	Glenn Manor Ravine	43.676821	-79.29542	Trail

	N e i g h b o r h o o d	N e i g h b o r h o o d L a t i t u d e	N e i g h b o r h o o d L o n g i t u d e	V e n u e	V e n u e L a t i t u d e	V e n u e L o n g i t u d e	V e n u e C a t e g o r y
	T h e B e a c h e s	4 3 · 6 7 7 0 9	- 7 9 · 2 9 5 4 7	T h e B i g C a r r o t N a t u r a l F o o	4 3 · 6 7 8 8 7 9	T h e B i g C a r r o t N a t u r a l F o o	H e a l t h F o o d S t o r e

	N e i g h b o r h o o d	N e i g h b o r h o o d L a t i t u d e	N e i g h b o r h o o d L o n g i t u d e	V e n u e	V e n u e L a t i t u d e	V e n u e L o n g i t u d e	V e n u e C a t e g o r y
				r u b			
	T h e B e a c h e s	4 3 . 6 7 7 0 9	- 7 9 . 2 9 5 4 7	S e a s p r a y R e s t a u r a	4 3 . 6 7 8 8 8 8	T h e B e a c h e s	A s i a n R e s t a u r a n t

		Neighborhood	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
ark, The Junction South								
Ind	19	19	19	19	19	19	19	19

[illegible]

		Neighborhood	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
	n, Grange Park							
	Lawrence Park	2	2	2	2	2	2	2

	Neighborhood	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
rk							
Little Portugal, Trini	30	30	30	30	30	30	30

	N e i g h b o r h o o d	N e i g h b o r h o o d L a t i t u d e	N e i g h b o r h o o d L o n g i t u d e	V e n u e	V e n u e L a t i t u d e	V e n u e L o n g i t u d e	V e n u e C a t e g o r y
t y							
M o o r e P a r k , S u m m e r h i l l E	4	4	4	4	4	4	4

		Neighborhood	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
ast								
North Toronto West, Law	4	4	4	4	4	4	4	4

[illegible]

	Neighborhood	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
Variables							
Queen's Park, Ontario	17	17	17	17	17	17	17

[illegible]

Neighborhood		Venue	Venue Category
Regent Park, Harbourfront	21	21	21

	Neighborhood	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
Rosedale	4	4	4	4	4		4
Roselawn	1	1	1	1	1		1
Runn	30	30	30	30	30		30

Neighborhood		Latitude	Longitude	Venue	Latitude	Longitude	Venue Category
Ymmede, Swansea							
St. James To	30	30	30	30	30	30	30

	Neighborhood	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
wn							
St. James Town, Cabbaget	30	30	30	30	30	30	30

		N e i g h b o r h o o d L a t i t u d e	N e i g h b o r h o o d L o n g i t u d e	V e n u e	V e n u e L a t i t u d e	V e n u e L o n g i t u d e	V e n u e C a t e g o r y
	o w n						
	S t n A P O B o x e s	3 0	3 0	3 0	3 0	3 0	3 0
	S t u d i o D	3 0	3 0	3 0	3 0	3 0	3 0

		Neighborhood	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
	istrict							
Summerhill West, R		6	6	6	6	6	6	6

V e n u e C a t e g o r y		V e n u e L a t i t u d e	V e n u e L o n g i t u d e	N e i g h b o r h o o d L a t i t u d e	N e i g h b o r h o o d L o n g i t u d e	N e i g h b o r h o o d	a t h n e l l y , S o u t h H i l l , F o r e s t H
---------------------------	--	---------------------------	-----------------------------	---	---	-------------------------	---

		Neighborhood	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
	Illinois, Deer Park							
	The Annex,	22	22	22	22	22	22	22

[illegible]

	Neighborhood	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
The Beaches	5	5	5	5	5		5
The Dandorf W	8	8	8	8	8		8

		Neighborhood	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
est, Riverdale								
TorontoDom	30	30	30	30	30	30	30	30

[illegible]

[illegible]

[illegible]

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In [21]:

```
toronto_onehot.shape
```

Out[21]:

```
(805, 177)
```

In [22]:

```
toronto_grouped = toronto_onehot.groupby('Neighborhood').mean().reset_index()  
toronto_grouped
```

Out[22]:

[illegible]

[illegible]

[illegible]

[illegible]

[illegible]

[illegible]

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0000.0000000.0000000.0000000.0000000.0000000.2000000.0000000.0000000.0000000.0000000.
0000000.0000000.0000000.0000000.0000000.0000000.0000000.0000000.0000000.0000000.00000
00.0000000.0000000.0000000.0000000.000.00.0000000.0000000.00.2000000.0000000.0000000.0
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0000010Dufferin, Dovercourt
Village0.0000000.0000000.0000000.0000000.0666670.0000000.0000000.0000000.0000000.000000.00000
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0000016India Bazaar, The Beaches

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00017Kensington Market, Chinatown, Grange

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00018Lawrence

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In [23]:

```
toronto_grouped.shape
```

Out[23]:

```
(39, 177)
```

In [24]:

```
num_top_venues = 5
for neigh in toronto_grouped['Neighborhood']:
    print("----"+neigh+"----")
    temp = toronto_grouped[toronto_grouped['Neighborhood'] == neigh].T.reset_
index()
    temp.columns = ['venue', 'freq']
    temp = temp.iloc[1:]
    temp['freq'] = temp['freq'].astype(float)
    temp = temp.round({'freq': 2})
    print(temp.sort_values('freq', ascending=False).reset_index(drop=True).he
ad(num_top_venues))
    print('\n')
```

```
----Berczy Park----
```

	venue	freq
0	Seafood Restaurant	0.07
1	Cheese Shop	0.07
2	Cocktail Bar	0.07
3	Coffee Shop	0.07
4	Farmers Market	0.07

```
----Brockton, Parkdale Village, Exhibition Place----
```

	venue	freq
0	Restaurant	0.07
1	Italian Restaurant	0.07
2	Gift Shop	0.07
3	Furniture / Home Store	0.07
4	Coffee Shop	0.07

```
----Business reply mail Processing Centre, South Central Letter Processing
Plant Toronto----
```

	venue	freq
0	Café	0.10
1	Restaurant	0.07
2	Hotel	0.07
3	Theater	0.07
4	Concert Hall	0.07

----CN Tower, King and Spadina, Railway Lands, Harbourfront West, Bathurst Quay, South Niagara, Island airport----

	venue	freq
0	Italian Restaurant	0.10
1	Park	0.07
2	Gym / Fitness Center	0.07
3	Restaurant	0.07
4	Seafood Restaurant	0.03

----Central Bay Street----

	venue	freq
0	Coffee Shop	0.13
1	Plaza	0.07
2	Sandwich Place	0.03
3	Middle Eastern Restaurant	0.03
4	Modern European Restaurant	0.03

----Christie----

	venue	freq
0	Café	0.27
1	Grocery Store	0.18
2	Playground	0.09
3	Athletics & Sports	0.09
4	Candy Store	0.09

----Church and Wellesley----

	venue	freq
0	Coffee Shop	0.10
1	Men's Store	0.07
2	Gay Bar	0.07
3	Salon / Barbershop	0.03
4	Beer Bar	0.03

----Commerce Court, Victoria Hotel----

	venue	freq
0	Café	0.13
1	Restaurant	0.10
2	Gastropub	0.07
3	Coffee Shop	0.07
4	Hotel	0.07

----Davisville----

	venue	freq
0	Dessert Shop	0.12
1	Pizza Place	0.08
2	Coffee Shop	0.08
3	Italian Restaurant	0.08
4	Café	0.08

----Berczy Park----

	venue	freq
0	Seafood Restaurant	0.07

1	Cheese Shop	0.07
2	Cocktail Bar	0.07
3	Coffee Shop	0.07
4	Farmers Market	0.07

----Brockton, Parkdale Village, Exhibition Place----

	venue	freq
0	Restaurant	0.07
1	Italian Restaurant	0.07
2	Gift Shop	0.07
3	Furniture / Home Store	0.07
4	Coffee Shop	0.07

----Business reply mail Processing Centre, South Central Letter Processing Plant Toronto----

	venue	freq
0	Café	0.10
1	Restaurant	0.07
2	Hotel	0.07
3	Theater	0.07
4	Concert Hall	0.07

----CN Tower, King and Spadina, Railway Lands, Harbourfront West, Bathurst Quay, South Niagara, Island airport----

	venue	freq
0	Italian Restaurant	0.10
1	Park	0.07
2	Gym / Fitness Center	0.07
3	Restaurant	0.07
4	Seafood Restaurant	0.03

----Central Bay Street----

	venue	freq
0	Coffee Shop	0.13
1	Plaza	0.07
2	Sandwich Place	0.03
3	Middle Eastern Restaurant	0.03
4	Modern European Restaurant	0.03

----Christie----

	venue	freq
0	Café	0.27
1	Grocery Store	0.18
2	Playground	0.09
3	Athletics & Sports	0.09
4	Candy Store	0.09

----Church and Wellesley----

	venue	freq
0	Coffee Shop	0.10
1	Men's Store	0.07
2	Gay Bar	0.07
3	Salon / Barbershop	0.03
4	Beer Bar	0.03

----Commerce Court, Victoria Hotel----

	venue	freq
0	Café	0.13
1	Restaurant	0.10
2	Gastropub	0.07
3	Coffee Shop	0.07
4	Hotel	0.07

----Davisville----

	venue	freq
0	Dessert Shop	0.12
1	Pizza Place	0.08
2	Coffee Shop	0.08
3	Italian Restaurant	0.08
4	Café	0.08

----Davisville North----

	venue	freq
0	Breakfast Spot	0.2
1	Park	0.2
2	Hotel	0.2
3	Department Store	0.2
4	Food & Drink Shop	0.2

----Dufferin, Dovercourt Village----

	venue	freq
0	Furniture / Home Store	0.13
1	Park	0.13
2	Pharmacy	0.07
3	Middle Eastern Restaurant	0.07
4	Bar	0.07

----First Canadian Place, Underground city----

	venue	freq
0	Café	0.20
1	Restaurant	0.13
2	Coffee Shop	0.07
3	Seafood Restaurant	0.07
4	Gluten-free Restaurant	0.03

----Forest Hill North & West, Forest Hill Road Park----

	venue	freq
0	Park	1.0
1	Yoga Studio	0.0
2	Modern European Restaurant	0.0
3	Market	0.0
4	Martial Arts School	0.0

----Garden District, Ryerson----

	venue	freq
0	Café	0.10
1	Ramen Restaurant	0.07
2	Coffee Shop	0.07
3	Theater	0.07
4	Hotel	0.03

----Harbourfront East, Union Station, Toronto Islands----

	venue	freq
0	Hotel	0.10
1	Coffee Shop	0.10
2	Park	0.07
3	Aquarium	0.07
4	Plaza	0.07

----High Park, The Junction South----

	venue	freq
0	Convenience Store	0.25
1	Park	0.25
2	Sandwich Place	0.25
3	Residential Building (Apartment / Condo)	0.25
4	Organic Grocery	0.00

----India Bazaar, The Beaches West----

	venue	freq
0	Fast Food Restaurant	0.11
1	Pub	0.05
2	Burrito Place	0.05
3	Sandwich Place	0.05
4	Park	0.05

----Kensington Market, Chinatown, Grange Park----

	venue	freq
0	Café	0.10
1	Mexican Restaurant	0.07
2	Vietnamese Restaurant	0.07
3	Coffee Shop	0.07
4	Caribbean Restaurant	0.07

----Lawrence Park----

	venue	freq
0	Bus Line	0.5
1	Swim School	0.5
2	Yoga Studio	0.0

3	Modern European Restaurant	0.0
4	Martial Arts School	0.0

----Little Portugal, Trinity----

	venue	freq
0	Bar	0.10
1	Cocktail Bar	0.07
2	Vietnamese Restaurant	0.07
3	Asian Restaurant	0.07
4	Yoga Studio	0.03

----Moore Park, Summerhill East----

	venue	freq
0	Gym	0.25
1	Park	0.25
2	Trail	0.25
3	Tennis Court	0.25
4	Modern European Restaurant	0.00

----North Toronto West, Lawrence Park----

	venue	freq
0	Italian Restaurant	0.25
1	Gym Pool	0.25
2	Playground	0.25
3	Park	0.25
4	Yoga Studio	0.00

----Parkdale, Roncesvalles----

	venue	freq
0	Coffee Shop	0.10
1	Breakfast Spot	0.07
2	Bookstore	0.07
3	Eastern European Restaurant	0.07
4	American Restaurant	0.07

----Queen's Park, Ontario Provincial Government----

	venue	freq
0	Coffee Shop	0.24
1	Sandwich Place	0.12
2	Gastropub	0.06
3	Theater	0.06
4	Café	0.06

----Regent Park, Harbourfront----

	venue	freq
0	Coffee Shop	0.24
1	Breakfast Spot	0.10
2	Yoga Studio	0.05
3	Theater	0.05
4	Thai Restaurant	0.05

----Richmond, Adelaide, King----

	venue	freq
0	Café	0.13
1	Coffee Shop	0.10
2	Gym	0.07
3	American Restaurant	0.07
4	Restaurant	0.07

----Rosedale----

	venue	freq
0	Park	0.50
1	Playground	0.25
2	Bike Trail	0.25
3	Yoga Studio	0.00
4	Modern European Restaurant	0.00

----Roselawn----

	venue	freq
0	Home Service	1.0
1	Yoga Studio	0.0
2	Monument / Landmark	0.0
3	Martial Arts School	0.0
4	Massage Studio	0.0

----Runnymede, Swansea----

	venue	freq
0	Coffee Shop	0.13
1	Café	0.10
2	Bakery	0.10
3	Bank	0.07
4	Thai Restaurant	0.03

----St. James Town----

	venue	freq
0	Gastropub	0.10
1	Café	0.10
2	Cosmetics Shop	0.07
3	Coffee Shop	0.07
4	Theater	0.07

----St. James Town, Cabbagetown----

	venue	freq
0	Café	0.07
1	Park	0.07
2	Restaurant	0.07
3	Coffee Shop	0.07
4	Italian Restaurant	0.07

----Stn A PO Boxes----

	venue	freq
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0	Café	0.10
1	Restaurant	0.07
2	Hotel	0.07
3	Theater	0.07
4	Concert Hall	0.07

----Studio District----

	venue	freq
0	Italian Restaurant	0.10
1	Brewery	0.10
2	Coffee Shop	0.07
3	Arts & Crafts Store	0.07
4	Diner	0.07

----Summerhill West, Rathnelly, South Hill, Forest Hill SE, Deer Park----

	venue	freq
0	Light Rail Station	0.33
1	Coffee Shop	0.33
2	Liquor Store	0.17
3	Supermarket	0.17
4	Monument / Landmark	0.00

----The Annex, North Midtown, Yorkville----

	venue	freq
0	Sandwich Place	0.14
1	Café	0.09
2	History Museum	0.05
3	Pub	0.05
4	Burger Joint	0.05

----The Beaches----

	venue	freq
0	Health Food Store	0.2
1	Asian Restaurant	0.2
2	Trail	0.2
3	Pub	0.2
4	Yoga Studio	0.0

----The Danforth West, Riverdale----

	venue	freq
0	Grocery Store	0.12
1	Park	0.12
2	Bus Line	0.12
3	Business Service	0.12
4	Ice Cream Shop	0.12

----Toronto Dominion Centre, Design Exchange----

	venue	freq
0	Café	0.17

1	Coffee Shop	0.17
2	Restaurant	0.07
3	Japanese Restaurant	0.07
4	Art Gallery	0.03

----University of Toronto, Harbord----

	venue	freq
0	Bakery	0.10
1	Café	0.10
2	Restaurant	0.07
3	Japanese Restaurant	0.07
4	Bookstore	0.07

In [25]:

```
def return_most_common_venues(row, num_top_venues):
    row_categories = row.iloc[1:]
    row_categories_sorted = row_categories.sort_values(ascending=False)
    return row_categories_sorted.index.values[0:num_top_venues]
```

In [26]:

```
import numpy as np
num_top_venues = 10
indicators = ['st', 'nd', 'rd']

columns = ['Neighborhood']
for ind in np.arange(num_top_venues):
    try:
        columns.append('{}{} Most Common Venue'.format(ind+1, indicators[ind])
    )
    except:
        columns.append('{}th Most Common Venue'.format(ind+1))

neighborhoods_venues_sorted = pd.DataFrame(columns=columns)
neighborhoods_venues_sorted['Neighborhood'] = toronto_grouped['Neighborhood']

for ind in np.arange(toronto_grouped.shape[0]):
    neighborhoods_venues_sorted.iloc[ind, 1:] = return_most_common_venues(toronto_grouped.iloc[ind, :], num_top_venues)
```

neighborhoods_venues_sorted.shape

Out[26]:

(39, 11)

3. Clustering Neighborhoods

In [27]:

```
from sklearn.cluster import KMeans
import sklearn.cluster.k_means_
km = KMeans(n_clusters=3, init='k-means++', max_iter=100, n_init=1,
            verbose=True)
/home/untold/anaconda3/lib/python3.8/site-packages/sklearn/utils/deprecation.py:143: FutureWarning: The sklearn.cluster.k_means_ module is deprecated in
version 0.22 and will be removed in version 0.24. The corresponding classes /
functions should instead be imported from sklearn.cluster. Anything that cann
ot be imported from sklearn.cluster is now part of the private API.
    warnings.warn(message, FutureWarning)
```

In [28]:

```
kclusters = 10
toronto_grouped_clustering = toronto_grouped.drop('Neighborhood', 1)
kmeans = KMeans(n_clusters=kclusters, random_state=1).fit(toronto_grouped_clu
stering)
print(kmeans.labels_[0:10])
print(len(kmeans.labels_))

[0 0 3 0 0 3 0 3 0 0]
39
```

In [29]:

```
df.head()
```

Out[29]:

	P o s t a l c o d e	B o r o u g h	N e i g h b o r h o o d	L a t i t u d e	L o n g i t u d e
0	M 4 E	E a s t	T h e B	4 3 .6	- 7 9 .

	P o s t a l c o d e	B o r o u g h	N e i g h b o r h o o d	L a t i t u d e	L o n g i t u d e
	\n	T o r o n t o \n	e a c h e s	7 7 0 9	2 9 5 4 7
1	M 4 K \n	E a s t T o r o n t o \n	T h e D a n f o r t h W e s t , R i v e	4 3 · 6 8 3 7 5	- 7 9 · 3 5 5 1 2

	P o s t a l c o d e	B o r o u g h	N e i g h b o r h o o d	L a t i t u d e	L o n g i t u d e
			r d a l e		
2	M 4 L \ n	E a s t T o r o n t o \ n	I n d i a B a z a a r , T h e B e a c h e s W e	4 3 . 6 6 7 9 7	- 7 9 . 3 1 4 6 7

	P o s t a l c o d e	B o r o u g h	N e i g h b o r h o o d	L a t i t u d e	L o n g i t u d e
			s t		
3	M 4 M \ n	E a s t T o r o n t o \ n	S t u d i o D i s t r i c t	4 3 . 6 6 2 1 3	- 7 9 . 3 3 4 9 7
4	M 4 N \ n	C e n t r a l T o r o	L a w r e n c e P a	4 3 . 7 2 8 4 3	- 7 9 . 3 8 7 1 3

	P o s t a l c o d e	B o r o u g h	N e i g h b o r h o o d	L a t i t u d e	L o n g i t u d e
		n t o \ n	r k		

In [30]:

```
neighborhoods_venues_sorted.insert(0, 'Cluster Labels', kmeans.labels_)
toronto_merged = df
toronto_merged = toronto_merged.join(neighborhoods_venues_sorted.set_index('N
eighborhood'), on='Neighborhood')

toronto_merged.head() # check the last columns!
```

Out[30]:

[illegible]

[illegible]

[illegible]

[illegible]

[illegible]

In [31]:

```
map_clusters = folium.Map(location=[latitude, longitude], zoom_start=11)

x = np.arange(kclusters)
ys = [i+x+(i*x)**2 for i in range(kclusters)]
colors_array = cm.rainbow(np.linspace(0, 1, len(ys)))
rainbow = [colors.rgb2hex(i) for i in colors_array]

markers_colors = []
for lat, lon, poi, cluster in zip(toronto_merged['Latitude'], toronto_merged[
'Longitude'], toronto_merged['Neighborhood'], kmeans.labels_):
    label = folium.Popup(str(poi) + ' Cluster ' + str(cluster), parse_html=True)
    folium.CircleMarker([lat, lon], radius=5, popup=label, color=rainbow[cluster-1], fill=True, fill_color=rainbow[cluster-1], fill_opacity=0.7).add_to(map_clusters)
map_clusters
```

Make this Notebook Trusted to load map: File -> Trust Notebook

Out[31]: