```
In [1]:
            # Put these at the top of every notebook, to get automatic reloading and inl
            from IPython.core.display import display, HTML
          3
             import pandas as pd
             import warnings
          5
             warnings.filterwarnings('ignore')
          7
            %reload ext autoreload
            %autoreload 1
          9
            %matplotlib inline
         10
         11
             pd.set option('display.max rows', 500)
             pd.set_option('display.max_columns', 500)
         13
             pd.set option('display.width', 1000)
         14
         display(HTML("<style>.container { width:90% !important; }</style>"))
In [2]:
             import os
          1
          2
             import seaborn as sns
            import pandas as pd
             import math
          5
            from Utils.UtilsGeoViz import *
          7
            from Utils.UtilsViz import *
          8 from Utils.DataUtils import *
In [6]:
            US_{coord} = [37.0902, -102]
            NY_COORD = [40.7128, -74.0060]
          3 # data path = os.path.join(os.getcwd(), "Data")
          4 ny datapath = "C:\\Users\\sriharis\\OneDrive\\UChicago\\DataMining\\project\
          5 | # ny datapath = "C:\\Users\\SSrih\\OneDrive\\UChicago\\DataMining\\project\\
In [7]:
             listings = pd.read csv(os.path.join(ny datapath, "listings.csv"))
In [8]:
             listings['price'] = listings['price'].str.strip('').str.strip('$').str.repla
```

Listings per neighbourhood

3/15/2019 EDA - Geospatial

```
listings loc data = listings[["latitude", "longitude", "id"]]
In [96]:
              listings_loc_group = listings_loc_data.groupby(by=["latitude", "longitude"],
           2
           3
                                                          sort=False).count()
           4
              lats=list(listings_loc_group["latitude"].values)
           5
              lons=list(listings_loc_group["longitude"].values)
              mag=list(listings loc group["id"].values)
In [97]:
              neighbourhoods geojson path = os.path.join(ny datapath, "neighbourhoods.geoj
           2
           3
              th scale = get th scale(data=nbhood listings data, col="id", n steps=6) # ,
           4
              m1 = folium.Map(location=NY COORD, tiles='OpenStreetMap', zoom start=12)
           5
           6
              # Add a choropleth map
           7
              m1 = add choroplethmap(m1=m1, data=nbhood listings data,
                                     json path=neighbourhoods geojson path,
           8
           9
                                     json key='feature.properties.neighbourhood',
          10
                                     threshold scale=th scale,
          11
                                     name="Neighbourhoods with listings")
          12
              # m1 = addMarkerClusters(m1, listings_loc_data["latitude"].values, listings_
          13
              # open map in browser(m1, os.path.join(ny datapath, "geo listings.html"))
```

Most expensive neighbourhoods

Let's make a price per listing for each neighbourhood

```
In [98]:
                   nbhood_price_data = listings[["price", "neighbourhood"]].groupby(by="neighbourhood"]].groupby(by="neighbourhood"]
                   nbhood price data.head()
Out[98]:
                 neighbourhood
                                   price
             0
                         Allerton
                                    70.0
                    Alphabet City
             1
                                   140.0
             2
                        Annadale
                                    87.5
              3
                        Arrochar
                                    79.0
                          Astoria
                                    84.0
```

```
In [99]:
              neighbourhoods_geojson_path = os.path.join(ny_datapath, "neighbourhoods.geoj
           2
              th_scale = get_th_scale(data=nbhood_price_data, col="price", n_steps=6) # ,
           3
           4
              m1 = folium.Map(location=NY_COORD, tiles='OpenStreetMap', zoom_start=12)
           5
           6
              # Add a choropleth map
           7
              m1 = add_choroplethmap(m1=m1, data=nbhood_price_data,
                                     json_path=neighbourhoods_geojson_path,
           8
           9
                                     json key='feature.properties.neighbourhood',
          10
                                     threshold_scale=th_scale,
          11
                                     name="Neighbourhoods Median Price",
          12
                                     color='Greens')
          13
              # https://stackoverflow.com/questions/44771779/adding-label-text-box-style-t
          14
          15
          16
              # open_map_in_browser(m1, os.path.join(ny_datapath, "geo_price.html"))
```

Neighbourhood groups

In [9]:	1	lis	tings.head()							
Out[9]:		id	listing_url	scrape_id	last_scraped	name	summary			
	0	2454	https://www.airbnb.com/rooms/2454	20190201155637	2019-02-01	superCondo	Great light, exposed brick and 10 feet high ce			
	1	2539	https://www.airbnb.com/rooms/2539	20190201155637	2019-02-02	Clean & quiet apt home by the park	Renovated apt home in elevator building.			
	2	2595	https://www.airbnb.com/rooms/2595	20190201155637	2019-02-02	Skylit Midtown Castle	Find your romantic getaway to this beautiful, 			
	3	3330	https://www.airbnb.com/rooms/3330	20190201155637	2019-02-02	++ Brooklyn Penthouse Guestroom ++	This is a spacious, clean, furnished master be			
	4	3647	https://www.airbnb.com/rooms/3647	20190201155637	2019-02-02	THE VILLAGE OF HARLEMNEW YORK!	NaN			
4										
In [10]:	1	<pre>1 listings["neighbourhood_group_cleansed"].unique()</pre>								
Out[10]:	arr	<pre>array(['Manhattan', 'Brooklyn', 'Queens', 'Staten Island', 'Bronx'],</pre>								
In [11]:		<pre>subset = listings[["id", "neighbourhood_cleansed", "neighbourhood_group_clea subset.head()</pre>								
Out[11]:	id neighbourhood_cleansed neighbourhood_group_cleansed price host_is_superhost									
	0	2454	Midtown	Ma	anhattan 137.0)	f			
	1	2539	Kensington		Brooklyn 149.0		f			
	2	2595	Midtown		anhattan 225.0		f			
		3330	Williamsburg		Brooklyn 70.0		f			
	4	3647	Harlem	Ma	anhattan 150.0)	f			

Number of listings

```
In [12]:
              nbhood grp grp = subset[["id", "neighbourhood group cleansed"]].groupby(by=[
           2
              nbhood grp grp
Out[12]:
             neighbourhood_group_cleansed
                                           id
          0
                                  Bronx
                                          977
          1
                                Brooklyn
                                        20500
          2
                               Manhattan
                                        22839
                                 Queens
                                         5565
                             Staten Island
                                          347
          4
In [13]:
           1
              def get lcount(n):
           2
                  nbhgrp = subset[subset["neighbourhood_cleansed"]==n]["neighbourhood_grou
           3
                  return nbhood_grp_grp[nbhood_grp_grp["neighbourhood_group_cleansed"]==nb
           4
           5
              subset1 = {"neighbourhood":[],
                          "count":[]
           6
           7
                         }
           8
              for n in subset["neighbourhood_cleansed"].unique():
           9
                  subset1["neighbourhood"].append(n)
          10
                  subset1["count"].append(get lcount(n))
          11
              nbhood_listings_count = pd.DataFrame(subset1)
          12
              nbhood listings count = nbhood listings count[["neighbourhood", "count"]]
          13
              # nbhood listings count
          14
In [14]:
           1
              neighbourhoods geojson path = os.path.join(ny datapath, "neighbourhoods.geoj
           2
              # th scale = get th scale(data=nbhood listings count, col="count", n steps=6
           3
              th scale = np.sort(nbhood listings count["count"].unique())
           4
           5
              th_scale = np.append(th_scale, th_scale[-1]+1)
           6
              m1 = folium.Map(location=NY_COORD, tiles='OpenStreetMap', zoom_start=12)
           7
              # m1 = folium.Map(location=NY COORD, tiles='Mapbox Bright', zoom start=12)
           8
           9
              # # Add a choropleth map
          10
              m1 = add_choroplethmap(m1=m1, data=nbhood_listings_count,
          11
          12
                                      json_path=neighbourhoods_geojson_path,
          13
                                      json key='feature.properties.neighbourhood',
                                      threshold scale=th scale,
          14
          15
                                      name="Neighbourhoods with listings",
                                     color="Reds")
          16
          17
          18
              open_map_in_browser(m1, os.path.join(ny_datapath, "geo_listings_grp.html"))
```

Median price

```
In [15]:
              nbhood grp grp = subset[["price", "neighbourhood group cleansed"]].groupby(b
              nbhood grp grp
Out[15]:
             neighbourhood_group_cleansed
                                             price
          0
                                  Bronx
                                         86.308086
          1
                                Brooklyn
                                        121.573756
          2
                               Manhattan
                                        192.853102
                                 Queens
                                         96.848518
                             Staten Island
                                       110.766571
          4
In [16]:
           1
              def get lcount(n):
           2
                  nbhgrp = subset[subset["neighbourhood_cleansed"]==n]["neighbourhood_grou
           3
                  return nbhood_grp_grp[nbhood_grp_grp["neighbourhood_group_cleansed"]==nb
           4
           5
              subset1 = {"neighbourhood":[],
           6
                          "price":[]
           7
                         }
              for n in subset["neighbourhood_cleansed"].unique():
           8
           9
                  subset1["neighbourhood"].append(n)
                   subset1["price"].append(get lcount(n))
          10
          11
          12
              nbhood_listings_price = pd.DataFrame(subset1)
          13
              nbhood listings price = nbhood listings price[["neighbourhood", "price"]]
          14
              # nbhood listings price
In [17]:
              neighbourhoods geojson path = os.path.join(ny datapath, "neighbourhoods.geoj
           1
           2
           3
              # th scale = get th scale(data=nbhood listings count, col="count", n steps=6
              th scale = np.sort(nbhood listings price["price"].unique())
           4
           5
              th_scale = np.append(th_scale, th_scale[-1]+1)
           6
           7
              m1 = folium.Map(location=NY COORD, tiles='OpenStreetMap', zoom start=12)
              # Add a choropleth map
           9
              m1 = add_choroplethmap(m1=m1, data=nbhood_listings_price,
                                      json path=neighbourhoods geojson path,
          10
                                      json key='feature.properties.neighbourhood',
          11
          12
                                      threshold_scale=th_scale,
          13
                                      name="Neighbourhoods with listings",
          14
                                      color="Greens")
          15
              # m1
              # m1 = addMarkerClusters(m1, listings loc data["latitude"].values, listings
          16
          17
              open_map_in_browser(m1, os.path.join(ny_datapath, "geo_listings_price.html")
```

Super hosts

```
In [18]:
              nbhood grp shost =\
                  subset[["host_is_superhost", "neighbourhood_group_cleansed"]]
           2
           3
              # nbhood grp shost.dropna(inplace=True)
           4
              nbhood grp shost =nbhood grp shost.groupby(by=["neighbourhood group cleansed
           5
           6
              nbhood_grp_shost.reset_index(drop=False, inplace=True)
              nbhood grp shost.columns = nbhood grp shost.columns.droplevel(0)
           7
              nbhood grp shost.columns = ["neighbourhood group cleansed", "num listings",
              # nbhood_grp_shost["shost_ratio"] = nbhood_grp_shost["shost_sum"] / nbhood_g
           9
              # nbhood_grp_shost["shost_ratio"] = 100 * nbhood_grp_shost["shost_sum"] / nb
          10
              nbhood_grp_shost["shost_ratio"] = 100 * nbhood_grp_shost["shost_sum"] / nbho
          11
              nbhood_grp_shost
          12
          13
```

Out[18]:

	neighbourhood_group_cleansed	num_listings	shost_sum	shost_ratio
0	Bronx	977	241.0	2.772665
1	Brooklyn	20496	3760.0	43.258168
2	Manhattan	22836	3500.0	40.266912
3	Queens	5564	1103.0	12.689830
4	Staten Island	347	88.0	1.012425

```
In [19]:
           1
              def get sum(n):
           2
                  nbhgrp = subset[subset["neighbourhood_cleansed"]==n]["neighbourhood_grou
           3
                  return nbhood grp shost[nbhood grp shost["neighbourhood group cleansed"]
           4
           5
              def get_ratio(n):
                  nbhgrp = subset[subset["neighbourhood_cleansed"]==n]["neighbourhood_grou"]
           6
           7
                  return nbhood grp shost[nbhood grp shost["neighbourhood group cleansed"]
           8
           9
              subset1 = {"neighbourhood":[],
          10
                          "shost ratio":[],
                          "shost sum":[]
          11
                         }
          12
              for n in subset["neighbourhood cleansed"].unique():
          13
          14
                  subset1["neighbourhood"].append(n)
          15
                  subset1["shost_ratio"].append(get_ratio(n))
          16
                  subset1["shost_sum"].append(get_sum(n))
          17
              nbhood shost = pd.DataFrame(subset1)
          18
              nbhood_shost = nbhood_shost[["neighbourhood", "shost_ratio"]]
          19
          20
              # nbhood shost
```

```
In [22]:
           1
              neighbourhoods geojson path = os.path.join(ny datapath, "neighbourhoods.geoj
           2
           3
              # th scale = get th scale(data=nbhood listings count, col="count", n steps=6
              th scale = np.sort(nbhood shost["shost ratio"].unique())
           4
              th_scale = np.append(th_scale, th_scale[-1]+0.01)
           5
           6
           7
              m1 = folium.Map(location=NY COORD, tiles='OpenStreetMap', zoom start=12)
              # Add a choropleth map
           8
              m1 = add choroplethmap(m1=m1, data=nbhood shost,
           9
                                     json_path=neighbourhoods_geojson_path,
          10
          11
                                     json key='feature.properties.neighbourhood',
          12
                                     threshold scale=th scale,
          13
                                     name="Neighbourhoods with super host (ratio)",
                                     color="Blues")
          14
          15
              # m1
          16
              # m1 = addMarkerClusters(m1, listings_loc_data["latitude"].values, listings_
              open map in browser(m1, os.path.join(ny datapath, "geo superhost ratio.html"
          17
```