BATTLE2

May 29, 2019

Description

As we plan to open a San Francisco restaurant and assume we will rent a place. I couldn't get information about renting all neighborhoods in this dataset.

We only need to analyze the current rent range for this project.

```
In [1]: import pandas as pd
     import numpy as np
     url='https://raw.githubusercontent.com/skybullet1987/BATTLE1/master/dataset.csv'
     readfile = pd.read csv(url)
     readfile.head()
Out[1]:
         NeighborhoodName
                                   City State
                                                 CountyName 2019-1 2019-2 \
     0 Mission District San Francisco
                                        CA San Francisco
                                                            3300
                                                                    3250
              Downtown San Francisco
                                         CA San Francisco
     1
                                                             2900
                                                                    3010
        Pacific Heights San Francisco
                                        CA San Francisco
                                                            3600
                                                                   3620
     3
              Nob Hill San Francisco
                                       CA San Francisco
                                                           2902
                                                                  2803
        South of Market San Francisco
                                                                     3810
                                         CA San Francisco
                                                             3620
        2019-3 2019-04 2019-05 2019-06
     0
         3295
                 3500
                         3495
                                 3450
     1
         3100
                 3050
                         3105
                                 3150
         3610
                         3723
                                 3751
                 3705
     3
         2850
                 2841
                         2863
                                 2796
         3830
                 3796
                         3754
                                 3750
```

I only planned to test the data I had collected.

To find out which neighborhood is good to open a new restaurant, I will use a formula. Before I came up with a formula, I was wondering what all of the attributes / factors we can consider because it is really unfair to compare data from restaurant 10 years old with restaurant 1 year old.

Like for example, the 10-year-old restaurant's checkin count will be more compared to a 1-year-old or 6-month-old restaurant. And I also found, after analyzing data, that the number of checkins in many restaurants is zero. I thought it would be really helpful to figure out the number of crowds visiting a specific neighborhood, but I avoided it because of data discrepancy.

Then I concluded that there would definitely be ratings for every restaurant. Even if 100 customers have visited a restaurant that is 1 year old, the rating will be 5 stars, and the same applies to a restaurant that is 10 years old.

Below is the formula for the solution. finalScore = (rentScore)0.5+(ratingScore)0.5

Closer the finalScore to 1, better neighborhood choice for the customer to decide. I rented more weights than ratings. Let's see the significance of is RentScore and RatingScore.

RentScore can be calculated by (maxrentneighborhood)/(maxrentneighborhood-minrentneighborhood). RentScore value can be obtained from the above rental dataset for each neighborhood.

RatingScore can be calculated by (maxred-restored)/(maxred-minred). Using foursquare location, ratingScore can be obtained. The steps to obtain ratingScore are below.

To analyze and obtain more information about other restaurants, we need the neighborhood coordinates. By passing the NeighborhoodName value through geocoding, you can obtain coordinates or latitude & longitude. Let's import the package and find second neighborhood coordinates from the rental dataset above.

```
Collecting package metadata: done
Solving environment:
The environment is inconsistent, please check the package plan carefully
The following packages are causing the inconsistency:
 - defaults/linux-64::anaconda==5.3.1=py37 0
 - defaults/linux-64::astropy==3.0.4=py37h14c3975 0
 - defaults/linux-64::bkcharts==0.2=py37 0
 - defaults/linux-64::blaze==0.11.3=pv37 0
 - defaults/linux-64::bokeh==0.13.0=py37 0
 - defaults/linux-64::bottleneck==1.2.1=py37h035aef0 1
 - defaults/linux-64::dask=0.19.1=py37 0
 - defaults/linux-64::datashape==0.5.4=py37 1
 - defaults/linux-64::mkl-service==1.1.2=py37h90e4bf4 5
 - defaults/linux-64::numba==0.39.0=pv37h04863e7 0
 - defaults/linux-64::numexpr==2.6.8=py37hd89afb7 0
 - defaults/linux-64::odo==0.5.1=pv37 0
 - defaults/linux-64::pytables==3.4.4=py37ha205bf6 0
 - defaults/linux-64::pytest-arraydiff==0.2=py37h39e3cac 0
 - defaults/linux-64::pytest-astropy==0.4.0=py37 0
 - defaults/linux-64::pytest-doctestplus==0.1.3=py37 0
 - defaults/linux-64::pywavelets==1.0.0=py37hdd07704 0
 - defaults/linux-64::scikit-image==0.14.0=py37hf484d3e 1
done
## Package Plan ##
 environment location: /home/jupyterlab/conda
 added / updated specs:
  - geopy
```

In [2]: !conda install -c conda-forge geopy --yes from geopy.geocoders import Nominatim

The following packages will be downloaded:

The following NEW packages will be INSTALLED:

```
geographiclib conda-forge/noarch::geographiclib-1.49-py 0
```

The following packages will be UPDATED:

```
geopy conda-forge/linux-64::geopy-1.11.0-py --> conda-forge/noarch::geopy-1.20.0-py 0
```

```
Downloading and Extracting Packages
```

Preparing transaction: done Verifying transaction: done Executing transaction: done

```
In [4]: address = 'Downtown, San Francisco, CA'
geolocator = Nominatim()
location = geolocator.geocode(address)
latitude = location.latitude
longitude = location.longitude
print('Latitude and longitude of '+address+' are {}, {}.'.format(latitude, longitude))
```

/home/jupyterlab/conda/lib/python3.6/site-packages/ipykernel_launcher.py:2: DeprecationWarning: Using Nomi

Latitude and longitude of Downtown, San Francisco, CA are 37.7875138, -122.407159.

address = 'Downtown, San Francisco, CA' geolocator = Nominatim() location = geolocator.geocode(address) latitude = location.latitude longitude = location.longitude print('Latitude and longitude of '+address+' are $\{\}$, $\{\}$.'.format(latitude, longitude))

Now once we got the neighborhood's latitude and longitude, let's use Foursquare Location to get the Mission District Neighborhood's all restaurant details. The restaurant details can be retrieved using search endpoint.

We only need Russian restaurant data for our project, and in search endpoint there is an attribute called category I d, i.e. foursquare has a defined categoryid for each category (like Russian or Ukranian or georgian restaurant) that will help us get the desired data.

```
In [5]: CLIENT_ID = 'IZYIHS5CH11SQSDVLQ0SPHMZOJUAGKZWBSEDNLJP4CCEKH4W' # your Foursqu
                    CLIENT \quad SECRET = \ '0NI2OCB1CRFX02GUZ3ZLQEQJ3MSBMNN2NPVHM2T2ZFKAZG0L' \ \# \ your \ For example 1 and 1 and 1 and 2 an
                    VERSION = '20180604'
                    LIMIT = 30
                    print('Your credentails:')
                   print('CLIENT_ID: ' + CLIENT_ID)
                    print('CLIENT SECRET:' + CLIENT SECRET)
Your credentails:
CLIENT ID: IZYIHS5CH11SQSDVLQ0SPHMZOJUAGKZWBSEDNLJP4CCEKH4W
CLIENT SECRET:0NI2OCB1CRFX02GUZ3ZLQEQJ3MSBMNN2NPVHM2T2ZFKAZG0L
In [6]: categoryId= '5293a7563cf9994f4e043a44' #categoryID for Russiann restaurant.
                    radius=1000
                                                                                                                                           # radius in meters
In [28]: url = \text{'https://api.foursquare.com/v2/venues/explore?\&client id={}\&client secret={}\&v={}\&ll={},{}\&ll={},{}\&ll={},{}\&ll={},{}\&ll={},{}\&ll={},{}\&ll={},{}\&ll={}\&ll={},{}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&ll={}\&l
                                                      CLIENT ID,
                                                      CLIENT SECRET,
                                                      VERSION,
                                                      latitude,
                                                      longitude,
                                                      radius,
                                                      LIMIT,
                                                      categoryId)
In [29]: #Send the GET request and examine the results
                       import requests
                       results = requests.get(url).json()
                       results
Out[29]: {'meta': {'code': 200, 'requestId': '5cedfe904c1f6753b3705a3f'},
                         'response': {'suggestedFilters': {'header': 'Tap to show:',
                             'filters': [{'name': 'Open now', 'key': 'openNow'}]},
                            'headerLocation': 'Downtown San Francisco-Union Square',
                            'headerFullLocation': 'Downtown San Francisco-Union Square, San Francisco',
                            'headerLocationGranularity': 'neighborhood',
                            'query': 'russian',
                            'totalResults': 8,
                            'suggestedBounds': {'ne': {'lat': 37.79651380900001,
                                 'lng': -122.39579200648618},
                               'sw': {'lat': 37.77851379099999, 'lng': -122.41852599351381}},
                             'groups': [{'type': 'Recommended Places',
                                 'name': 'recommended',
                                 'items': [{'reasons': {'count': 0,
                                         'items': [{'summary': 'This spot is popular',
                                               'type': 'general',
```

```
'reasonName': 'globalInteractionReason'}]},
'venue': {'id': '58cc4d2fe0adac17bbf4838e',
 'name': 'Pushkin',
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  'lat': 37.79094301071348,
  'lng': -122.40387738626474,
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   'lng': -122.40387738626474}],
  'distance': 478,
  'postalCode': '94104',
  'cc': 'US',
  'city': 'San Francisco',
  'state': 'CA',
  'country': 'United States',
  'formattedAddress': ['380 Bush St (at Kearny St)',
   'San Francisco, CA 94104',
   'United States']},
 'categories': [{'id': '5293a7563cf9994f4e043a44',
   'name': 'Russian Restaurant',
   'pluralName': 'Russian Restaurants',
   'shortName': 'Russian',
   'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/food/russian ',
   'suffix': '.png'},
   'primary': True}],
 'photos': {'count': 0, 'groups': []}},
'referralId': 'e-0-58cc4d2fe0adac17bbf4838e-0'},
{'reasons': {'count': 0,
 'items': [{'summary': 'This spot is popular',
   'type': 'general',
   'reasonName': 'globalInteractionReason'}]},
'venue': {'id': '45e86d76f964a5206a431fe3',
 'name': 'Samovar Tea Lounge',
 'location': {'address': '730 Howard St',
  'crossStreet': 'btwn 3rd & 4th St',
  'lat': 37.784252511908036,
  'lng': -122.40217926245396,
  'labeledLatLngs': [{'label': 'display',
   'lat': 37.784252511908036,
   'lng': -122.40217926245396}],
  'distance': 568,
  'postalCode': '94103',
  'cc': 'US',
  'neighborhood': 'SoMa',
  'city': 'San Francisco',
  'state': 'CA',
  'country': 'United States',
```

```
'formattedAddress': ['730 Howard St (btwn 3rd & 4th St)',
  'San Francisco, CA 94103',
  'United States']},
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   'name': 'Tea Room',
  'pluralName': 'Tea Rooms',
  'shortName': 'Tea Room',
  'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/food/tearoom',
   'suffix': '.png'},
   'primary': True}],
 'photos': {'count': 0, 'groups': []}},
'referralId': 'e-0-45e86d76f964a5206a431fe3-1'},
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 'items': [{'summary': 'This spot is popular',
  'type': 'general',
  'reasonName': 'globalInteractionReason'}]},
'venue': {'id': '408aff80f964a520c1f21ee3',
 'name': 'Tunnel Top',
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  'lng': -122.4072361885583,
  'labeledLatLngs': [{'label': 'display',
   'lat': 37.790278000572236,
   'lng': -122.4072361885583}],
  'distance': 307,
  'postalCode': '94108',
  'cc': 'US',
  'city': 'San Francisco',
  'state': 'CA',
  'country': 'United States',
  'formattedAddress': ['601 Bush St (at Stockton St)',
  'San Francisco, CA 94108',
  'United States']},
 'categories': [{'id': '4bf58dd8d48988d116941735',
   'name': 'Bar'.
  'pluralName': 'Bars',
   'shortName': 'Bar',
   'icon': {'prefix': 'https://ss3.4sqi.net/img/categories_v2/nightlife/pub_',
   'suffix': '.png'},
  'primary': True}],
 'photos': {'count': 0, 'groups': []},
 'venuePage': {'id': '117394452'}},
'referralId': 'e-0-408aff80f964a520c1f21ee3-2'},
{'reasons': {'count': 0,
 'items': [{'summary': 'This spot is popular',
   'type': 'general',
  'reasonName': 'globalInteractionReason'}]},
```

```
'venue': {'id': '52faed3c11d2a28ddfef150f',
 'name': 'Hopwater Distribution',
 'location': {'address': '850 Bush St',
  'lat': 37.789927637673124,
  'lng': -122.41131669050196,
  'labeledLatLngs': [{'label': 'display',
   'lat': 37.789927637673124,
   'lng': -122.41131669050196}],
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  'postalCode': '94108',
  'cc': 'US',
  'city': 'San Francisco',
  'state': 'CA',
  'country': 'United States',
  'formattedAddress': ['850 Bush St',
  'San Francisco, CA 94108',
  'United States']},
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   'name': 'Beer Bar',
   'pluralName': 'Beer Bars',
  'shortName': 'Beer Bar',
  'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/nightlife/pub',
   'suffix': '.png'},
   'primary': True}],
 'photos': {'count': 0, 'groups': []}},
'referralId': 'e-0-52faed3c11d2a28ddfef150f-3'},
{'reasons': {'count': 0,
 'items': [{'summary': 'This spot is popular',
  'type': 'general',
  'reasonName': 'globalInteractionReason'}]},
'venue': {'id': '4686529ff964a5203b481fe3',
 'name': 'Sutter Station',
 'location': {'address': '554 Market St',
  'crossStreet': 'btw 2nd St & Sutter St',
  'lat': 37.7899599,
  'lng': -122.4009151,
  'labeledLatLngs': [{'label': 'display',
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   'lng': -122.4009151}],
  'distance': 613,
  'postalCode': '94104',
  'cc': 'US',
  'city': 'San Francisco',
  'state': 'CA',
  'country': 'United States',
  'formattedAddress': ['554 Market St (btw 2nd St & Sutter St)',
  'San Francisco, CA 94104',
  'United States']},
```

```
'categories': [{'id': '4bf58dd8d48988d118941735',
   'name': 'Dive Bar',
   'pluralName': 'Dive Bars',
   'shortName': 'Dive Bar',
   'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/nightlife/divebar ',
   'suffix': '.png'},
   'primary': True}],
 'photos': {'count': 0, 'groups': []}},
'referralId': 'e-0-4686529ff964a5203b481fe3-4'},
{'reasons': {'count': 0,
 'items': [{'summary': 'This spot is popular',
   'type': 'general',
   'reasonName': 'globalInteractionReason'}]},
'venue': {'id': '42a63500f964a52003251fe3',
 'name': "Kate O'Brien's",
 'location': {'address': '579 Howard St',
  'crossStreet': 'at 2nd St',
  'lat': 37.78718769656639,
  'lng': -122.39770422475951,
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   'lng': -122.39770422475951}],
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  'postalCode': '94105',
  'cc': 'US',
  'city': 'San Francisco',
  'state': 'CA',
  'country': 'United States',
  'formattedAddress': ['579 Howard St (at 2nd St)',
   'San Francisco, CA 94105',
   'United States']},
 'categories': [{'id': '4bf58dd8d48988d11b941735',
   'name': 'Pub',
   'pluralName': 'Pubs',
   'shortName': 'Pub',
   'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/nightlife/pub',
   'suffix': '.png'},
   'primary': True}],
 'photos': {'count': 0, 'groups': []},
 'venuePage': {'id': '89995629'}},
'referralId': 'e-0-42a63500f964a52003251fe3-5'},
{'reasons': {'count': 0,
 'items': [{'summary': 'This spot is popular',
   'type': 'general',
   'reasonName': 'globalInteractionReason'}]},
'venue': {'id': '49cfa966f964a520b45a1fe3',
 'name': 'Urban Tavern',
 'location': {'address': '333 Ofarrell St',
```

```
'crossStreet': 'at Mason St',
  'lat': 37.786023679115644,
  'lng': -122.41041107730479,
  'labeledLatLngs': [{'label': 'display',
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   'lng': -122.41041107730479}],
  'distance': 330,
  'postalCode': '94102',
  'cc': 'US',
  'city': 'San Francisco',
  'state': 'CA',
  'country': 'United States',
  'formattedAddress': ['333 Ofarrell St (at Mason St)',
   'San Francisco, CA 94102',
   'United States']},
 'categories': [{'id': '4bf58dd8d48988d14e941735',
   'name': 'American Restaurant',
   'pluralName': 'American Restaurants',
   'shortName': 'American',
   'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/food/default ',
   'suffix': '.png'},
   'primary': True}],
 'photos': {'count': 0, 'groups': []},
 'venuePage': {'id': '37630450'}},
'referralId': 'e-0-49cfa966f964a520b45a1fe3-6'},
{'reasons': {'count': 0,
 'items': [{'summary': 'This spot is popular',
   'type': 'general',
   'reasonName': 'globalInteractionReason'}]},
'venue': {'id': '4afb14b4f964a520f51a22e3',
 'name': "David's Delicatessen & Restaurant",
 'location': {'address': '480 Geary St',
  'lat': 37.787025847529975,
  'lng': -122.41104057713176,
  'labeledLatLngs': [{'label': 'display',
   'lat': 37.787025847529975,
   'lng': -122.41104057713176}],
  'distance': 345,
  'postalCode': '94102',
  'cc': 'US',
  'city': 'San Francisco',
  'state': 'CA',
  'country': 'United States',
  'formattedAddress': ['480 Geary St',
   'San Francisco, CA 94102',
   'United States'],
 'categories': [{'id': '4bf58dd8d48988d146941735',
   'name': 'Deli / Bodega',
```

```
'pluralName': 'Delis / Bodegas',
   'shortName': 'Deli / Bodega',
   'icon': {'prefix': 'https://ss3.4sqi.net/img/categories_v2/food/deli_',
    'suffix': '.png'},
   'primary': True}],
   'photos': {'count': 0, 'groups': []}},
'referralId': 'e-0-4afb14b4f964a520f51a22e3-7'}]}}}
```

Now we got all the details of the restaurants in Downtown that is in the neighborhood's 1000-meter radius in json format. Let's check in json's response how many restaurants are there.

```
In [30]: Restaurants= len(results['response'])
print ('There are', Restaurants, 'restaurants.')
```

There are 8 restaurants.

Let's also get one venue id from json response and use VenueID end point of foursquare to get venue details

```
In [31]: url2 = 'https://api.foursquare.com/v2/venues/58cc4d2fe0adac17bbf4838e?&client id={}&client secret=
          CLIENT ID,
          CLIENT SECRET,
          VERSION,
          latitude,
          longitude
       results2 = requests.get(url2).json()
       results2
Out[31]: {'meta': {'code': 200, 'requestId': '5cedff1b6a607149395b04bf'},
        'response': {'venue': {'id': '58cc4d2fe0adac17bbf4838e',
         'name': 'Pushkin',
         'contact': {'phone': '4159013434',
          'formattedPhone': '(415) 901-3434',
          'instagram': 'pushkinsf',
          'facebook': '392957711051136',
          'facebookUsername': 'pushkinsf',
          'facebookName': 'Pushkin'},
         'location': {'address': '380 Bush St',
          'crossStreet': 'at Kearny St',
          'lat': 37.79094301071348,
          'lng': -122.40387738626474,
          'labeledLatLngs': [{'label': 'display',
           'lat': 37.79094301071348,
           'lng': -122.40387738626474}],
          'distance': 478,
          'postalCode': '94104',
          'cc': 'US',
```

```
'city': 'San Francisco',
'state': 'CA',
'country': 'United States',
'formattedAddress': ['380 Bush St (at Kearny St)',
 'San Francisco, CA 94104',
 'United States']},
'canonicalUrl': 'https://foursquare.com/v/pushkin/58cc4d2fe0adac17bbf4838e',
'categories': [{'id': '5293a7563cf9994f4e043a44',
 'name': 'Russian Restaurant',
 'pluralName': 'Russian Restaurants',
 'shortName': 'Russian',
 'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/food/russian ',
  'suffix': '.png'},
 'primary': True}],
'verified': False,
'stats': {'tipCount': 14},
'url': 'https://www.pushkinsf.com',
'likes': {'count': 87,
'groups': [{'type': 'others', 'count': 87, 'items': []}],
'summary': '87 Likes'},
'dislike': False,
'ok': False,
'rating': 9.5,
'ratingColor': '00B551',
'ratingSignals': 97,
'allowMenuUrlEdit': True,
'beenHere': {'count': 0,
'unconfirmedCount': 0,
'marked': False,
'lastCheckinExpiredAt': 0},
'specials': {'count': 0, 'items': []},
'photos': {'count': 26,
'groups': [{'type': 'checkin',
  'name': "Friends' check-in photos",
  'count': 0,
  'items': []},
 {'type': 'venue',
  'name': 'Venue photos',
  'count': 26,
  'items': [{'id': '5c5de72f82a750002c7bb289',
   'createdAt': 1549657903,
   'source': {'name': 'Swarm for iOS', 'url': 'https://www.swarmapp.com'},
   'prefix': 'https://fastly.4sqi.net/img/general/',
   'suffix': '/633660 IjKhUMgaGXIzoq3PFQ56vQoNjGjHMued19t7QngamvY.jpg',
   'width': 1440,
   'height': 1920,
   'user': {'id': '633660',
    'firstName': 'Ruslan',
```

```
'lastName': 'Abdikeev',
    'gender': 'male',
    'photo': {'prefix': 'https://fastly.4sqi.net/img/user/',
     'suffix': '/MNUPLN34FGIDKQSU.jpg'}},
   'visibility': 'public'},
   {'id': '5c51320a3149b9002c3d31d7',
   'createdAt': 1548825098,
   'source': {'name': 'Foursquare for iOS',
    'url': 'https://foursquare.com/download/#/iphone'},
   'prefix': 'https://fastly.4sqi.net/img/general/',
   'suffix': '/7440763 um-z3ZpRod-YrcywicbgrW7ug8MGfAsphNrIjaKyCCA.jpg',
   'width': 1440,
   'height': 1920,
   'user': {'id': '7440763',
    'firstName': 'Andrew',
    'lastName': 'De la rosa',
    'gender': 'male',
    'photo': {'prefix': 'https://fastly.4sqi.net/img/user/',
     'suffix': '/T1QU44YUEWGMWDZH.jpg'}},
   'visibility': 'public'}]}],
'summary': '0 photos'},
'reasons': {'count': 1,
'items': [{'summary': 'Lots of people like this place',
  'type': 'general',
  'reasonName': 'rawLikesReason'}]},
'hereNow': {'count': 0, 'summary': 'Nobody here', 'groups': []},
'createdAt': 1489784111,
'tips': {'count': 14,
'groups': [{'type': 'others',
  'name': 'All tips',
  'count': 14,
  'items': [{'id': '5aac0e889b04733381f1dbb8',
   'createdAt': 1521225352,
   'text': 'The best (and probably only) pelmeni east of Golden Gate Park.',
   'type': 'user',
   'canonicalUrl': 'https://foursquare.com/item/5aac0e889b04733381f1dbb8',
   'lang': 'en',
   'likes': {'count': 1,
    'groups': [{'type': 'others', 'count': 1, 'items': []}],
    'summary': '1 like'},
   'logView': True,
   'agreeCount': 1,
   'disagreeCount': 0,
   'todo': {'count': 0},
   'user': {'id': '87053870',
    'firstName': 'Chuck',
    'lastName': 'Roslof',
    'gender': 'male',
```

```
'photo': {'prefix': 'https://fastly.4sqi.net/img/user/',
     'suffix': '/87053870-4JFTGCXXPGLHYCLE.jpg'}},
   'authorInteractionType': 'liked'},
   {'id': '5be5e15ccb3fd2002cd4e01c',
   'createdAt': 1541792092,
   'text': 'Borsch and dumplings are amazing',
   'type': 'user',
   'canonicalUrl': 'https://foursquare.com/item/5be5e15ccb3fd2002cd4e01c',
   'lang': 'en',
   'likes': {'count': 0, 'groups': []},
   'logView': True,
   'agreeCount': 0,
   'disagreeCount': 0,
   'todo': {'count': 0},
   'user': {'id': '386367715',
    'firstName': 'Nikolay',
    'lastName': 'Krapivnyy',
    'gender': 'male',
    'photo': {'prefix': 'https://fastly.4sqi.net/img/user/',
     'suffix': '/blank boy.png',
     'default': True}},
   'authorInteractionType': 'liked'}]}],
'shortUrl': 'http://4sq.com/2mBdBgE',
'timeZone': 'America/Los Angeles',
'listed': {'count': 142,
'groups': [{'type': 'others',
  'name': 'Lists from other people',
  'count': 142,
  'items': [{'id': '4fa0673be4b0dae72d8aaef4',
   'name': 'San Francisco - To Visit',
   'description': '',
   'type': 'others',
   'user': {'id': '1436512',
    'firstName': 'Mairbek',
    'lastName': 'Khadikov',
    'gender': 'male',
    'photo': {'prefix': 'https://fastly.4sqi.net/img/user/',
     'suffix': '/EAOSQHZZHBCNUWEW.jpg'}},
   'editable': False,
   'public': True,
   'collaborative': False,
   'url': '/mairbek/list/san-francisco--to-visit',
   'canonicalUrl': 'https://foursquare.com/mairbek/list/san-francisco--to-visit',
   'createdAt': 1335912251,
   'updatedAt': 1529879686,
   'photo': {'id': '50367fbde4b0aae9b35da38f',
    'createdAt': 1345748925,
    'prefix': 'https://fastly.4sqi.net/img/general/',
```

```
'suffix': '/sVYp9x svDZucDQRmeWs4C5L5f7mzLWFlu4IxC Gj2Q.jpg',
 'width': 540,
 'height': 720,
 'user': {'id': '1508229',
  'firstName': 'Gayatri',
  'lastName': 'Nair',
  'gender': 'female',
  'photo': {'prefix': 'https://fastly.4sqi.net/img/user/',
  'suffix': '/PX1VO2Q05Z0XW01K.jpg'}},
 'visibility': 'public'},
'followers': {'count': 6},
'listItems': {'count': 65,
 'items': [{'id': 'v58cc4d2fe0adac17bbf4838e',
  'createdAt': 1529879686}|}},
{'id': '528fdc34498e45b5c4cdfb87',
'name': 'San Francisco',
'description': '',
'type': 'others',
'user': {'id': '1047239',
 'firstName': 'Anne',
 'lastName': 'L',
 'gender': 'female',
 'photo': {'prefix': 'https://fastly.4sqi.net/img/user/',
 'suffix': '/1NOXVCM2PPDHTLGW.jpg'}},
'editable': False,
'public': True,
'collaborative': False,
'url': '/user/1047239/list/san-francisco',
'canonicalUrl': 'https://foursquare.com/user/1047239/list/san-francisco',
'createdAt': 1385159732,
'updatedAt': 1548877936,
'photo': {'id': '50aff561e4b0a0a301f26dbd',
 'createdAt': 1353708897,
 'prefix': 'https://fastly.4sqi.net/img/general/',
 'suffix': '/1004384 f5T2MXBPVo6PgvBMvnHnVE6-jMaKk2LCQ7 BXTBCEYs.jpg',
 'width': 720,
 'height': 540,
 'user': {'id': '1004384',
 'firstName': 'Jung-Ah',
 'lastName': 'Yum',
  'gender': 'female',
  'photo': {'prefix': 'https://fastly.4sqi.net/img/user/',
  'suffix': '/CZ0CCJBPEIQRRUO5.jpg'}},
 'visibility': 'public'},
'followers': {'count': 8},
'listItems': {'count': 249,
 'items': [{'id': 'v58cc4d2fe0adac17bbf4838e',
   'createdAt': 1505855058}]}},
```

```
{'id': '544977ab498edc36f699aad4',
'name': 'SF Cheap Eats Continued',
'description': 'Cheap food of all kinds all around the city\n\n WinstonWanders.com',
'type': 'others',
'user': {'id': '4083549',
 'firstName': 'Mike',
 'lastName': 'Winston',
 'gender': 'male',
 'photo': {'prefix': 'https://fastly.4sqi.net/img/user/',
 'suffix': '/4083549-14ZMSGT0BA3WO1OP.jpg'}},
'editable': False,
'public': True,
'collaborative': False,
'url': '/winstonwanders/list/sf-cheap-eats-continued',
'canonicalUrl': 'https://foursquare.com/winstonwanders/list/sf-cheap-eats-continued',
'createdAt': 1414100907,
'updatedAt': 1557422002,
'photo': {'id': '54c9152f11d26fca70975a3e',
 'createdAt': 1422464303,
 'prefix': 'https://fastly.4sqi.net/img/general/',
 'suffix': '/4083549 Xn8byNRmEKqSfRfKbPDzNx4YSdrH2kuUflhtZpaowbY.jpg',
 'width': 1200,
 'height': 1200,
 'user': {'id': '4083549',
  'firstName': 'Mike',
  'lastName': 'Winston',
  'gender': 'male',
  'photo': {'prefix': 'https://fastly.4sqi.net/img/user/',
   'suffix': '/4083549-14ZMSGT0BA3WO1OP.jpg'}},
 'visibility': 'public'},
'followers': {'count': 3},
'listItems': {'count': 266,
 'items': [{'id': 't58dc48d5d6fe9045099e8aeb',
   'createdAt': 1490831586,
   'photo': {'id': '58dc48d7f3433526eb12dfb9',
   'createdAt': 1490831575,
   'prefix': 'https://fastly.4sqi.net/img/general/',
   'suffix': '/4083549 w02nQsrzFK0FHM7TvSqqxM0-xehqLkzIlfnIoZ WwCE.jpg',
    'width': 1200,
   'height': 1200,
    'user': {'id': '4083549',
    'firstName': 'Mike',
    'lastName': 'Winston',
    'gender': 'male',
    'photo': {'prefix': 'https://fastly.4sqi.net/img/user/',
     'suffix': '/4083549-14ZMSGT0BA3WO1OP.jpg'}},
    'visibility': 'public'}}]}},
{'id': '5142a688e4b080a102b9f788',
```

```
'name': 'New places!',
   'description': '',
   'type': 'others',
   'user': {'id': '262716',
    'firstName': 'Rachel',
    'lastName': 'Levy',
    'gender': 'female',
    'photo': {'prefix': 'https://fastly.4sqi.net/img/user/',
     'suffix': '/262716-ZHUCDUND5WHSNKNE.jpg'}},
   'editable': False,
   'public': True,
   'collaborative': False,
   'url': '/user/262716/list/new-places',
   'canonicalUrl': 'https://foursquare.com/user/262716/list/new-places',
   'createdAt': 1363322504,
   'updatedAt': 1558484305,
   'photo': {'id': '531de8aa11d2584c986e0bb7',
    'createdAt': 1394469034,
    'prefix': 'https://fastly.4sqi.net/img/general/',
    'suffix': '/3343327 R9M7-oq5H3x7Sp2LzX4FppUoH8X QcBOuJxkEOyGs-Y.png',
    'width': 806,
    'height': 536,
    'user': {'id': '3343327',
     'firstName': 'Eater',
     'gender': 'none',
     'photo': {'prefix': 'https://fastly.4sqi.net/img/user/',
      'suffix': '/3343327-YQ1D52V3KK2RQLBU.png'},
     'type': 'page'},
    'visibility': 'public'},
   'followers': {'count': 7},
   'listItems': {'count': 191,
    'items': [{'id': 'v58cc4d2fe0adac17bbf4838e',
      'createdAt': 1505781893}]}}]}]}],
'hours': {'status': 'Closed until 11:00 AM tomorrow',
'richStatus': {'entities': [], 'text': 'Closed until 11:00 AM tomorrow'},
'isOpen': False,
'isLocalHoliday': False,
'dayData': [],
'timeframes': [{'days': 'MonFri',
  'includesToday': True,
  'open': [{'renderedTime': '11:00 AM2:00 PM'}],
  'segments': []}]},
'popular': {'isOpen': False,
'isLocalHoliday': False,
'timeframes': [{'days': 'Today',
  'includesToday': True,
  'open': [{'renderedTime': '8:00 AM9:00 AM'},
  {'renderedTime': '11:00 AM2:00 PM'}],
```

```
'segments': []},
 {\text{''days': 'Wed'}}
  'open': [{'renderedTime': '11:00 AM2:00 PM'}],
  'segments': []},
 {'days': 'Thu',
  'open': [{'renderedTime': '8:00 AM9:00 AM'},
  {'renderedTime': '11:00 AM3:00 PM'}],
  'segments': []},
 {'days': 'Fri',
  'open': [{'renderedTime': '8:00 AM9:00 AM'},
  {'renderedTime': '11:00 AM2:00 PM'}],
  'segments': []},
 {'days': 'SatSun', 'open': [{'renderedTime': 'None'}], 'segments': []},
 {\text{''days': 'Mon'}}
  'open': [{'renderedTime': '8:00 AM9:00 AM'},
  {'renderedTime': '11:00 AM2:00 PM'}],
  'segments': []}]},
'pageUpdates': {'count': 0, 'items': []},
'inbox': {'count': 0, 'items': []},
'parent': {'id': '50218be1e4b013ec08cd2d4c',
'name': 'International Food Court',
'location': {'address': '320 Bush St',
 'crossStreet': 'at Kearny St',
 'lat': 37.790902,
 'lng': -122.403755,
 'labeledLatLngs': [{'label': 'display',
  'lat': 37.790902,
  'lng': -122.403755}],
 'distance': 481,
 'postalCode': '94104',
 'cc': 'US',
 'city': 'San Francisco',
 'state': 'CA',
 'country': 'United States',
 'formattedAddress': ['320 Bush St (at Kearny St)',
  'San Francisco, CA 94104',
  'United States'],
'categories': [{'id': '4bf58dd8d48988d120951735',
  'name': 'Food Court',
  'pluralName': 'Food Courts',
  'shortName': 'Food Court',
  'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/shops/food foodcourt ',
  'suffix': '.png'},
  'primary': True}]},
'hierarchy': [{'name': 'International Food Court',
 'lang': 'en',
 'id': '50218be1e4b013ec08cd2d4c',
 'canonicalUrl': 'https://foursquare.com/v/international-food-court/50218be1e4b013ec08cd2d4c'},
```

```
'attributes': {'groups': [{'type': 'reservations',
           'name': 'Reservations',
           'count': 3,
           'items': [{'displayName': 'Reservations', 'displayValue': 'No'}]},
           {'type': 'payments',
           'name': 'Credit Cards',
           'summary': 'Credit Cards',
           'count': 7,
           'items': [{'displayName': 'Credit Cards', 'displayValue': 'Yes'}]},
           {'type': 'serves',
           'name': 'Menus',
           'summary': 'Lunch',
           'count': 8,
           'items': [{'displayName': 'Lunch', 'displayValue': 'Lunch'}]},
           {'type': 'diningOptions',
           'name': 'Dining Options',
           'summary': 'Delivery',
           'count': 5,
           'items': [{'displayName': 'Delivery', 'displayValue': 'Delivery'}]}]},
         'bestPhoto': {'id': '5c5de72f82a750002c7bb289',
          'createdAt': 1549657903,
          'source': {'name': 'Swarm for iOS', 'url': 'https://www.swarmapp.com'},
          'prefix': 'https://fastly.4sqi.net/img/general/',
          'suffix': '/633660 IjKhUMgaGXIzoq3PFQ56vQoNjGjHMued19t7QngamvY.jpg',
          'width': 1440,
          'height': 1920,
          'visibility': 'public'},
         'colors': {'highlightColor': {'photoId': '5c5de72f82a750002c7bb289',
           'value': -14671840},
          'highlightTextColor': {'photoId': '5c5de72f82a750002c7bb289', 'value': -1},
          'algoVersion': 3}}}
In [32]: restaurantrating= results2['response']['venue']['rating']
       restaurantrating
```

Out[32]: 9.5

Like this, we can get the rating value from json for each neighborhood and calculate the final score.

• Please note that I showed an example in this data section for only one neighborhood. For all neighborhoods, I will use the loop to execute the formula and final results. I will do all the calculation part for all neighborhoods in the reporting methodology section.