IBM APPLIED DATA SCIENCE CAPSTONE PROJECT ¶

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1. Introduction

1.1 Description of the Problem

The population of London has grown considerably over the last decades. London is very diverse. It represents what is called the reflection of the old British Empire. In London, you can get fresh food supplies from Africa. One begins to wonder how efficient the supply mechanism is.

The real deal is that as much as there are many fine restaurants in London – Asian, Middle Eastern, Latin and American restaurants, you can struggle to find good place to dine in the finest of West African cuisine that has combination of Nigerian, Ghanaian, Cameroonian, Senegalese and more.

Eating in a cosy environment with a blend of multicultural background and finely made West African dishes, on time and on point in a London location accessible to tourists, within central London and not far from the "unofficial" capital african market place - Peckham.

1.2 Discussion of the Background

My client, a successful restaurant chain in Africa is looking to expand operation into Europe through London. They want to create a high-end restaurant that comes with organic mix and healthy. Their target is not only West Africans, but they are pro-organic and healthy eating. To them every meal counts and counts as a royal when you eat.

Since the London demography is so big, my client needs deeper insight from available data in other to decide where to establish the first Europe "palace" restaurant. This company spends a lot on research and provides customers with data insight into the ingredients used at restaurants.

1.3 Target Audience

Considering the diversity of London, there is a high multicultural sense. London is a place where different shades live. As such, in the search for an high-end African-inclined restaurant, there is a high shortage. The target audience is broad, it ranges from Londoners, tourists and those who are passionate about organic food.

2. Data

2.1 Description of Data

This project will rely on public data from Wikipedia and Foursquare.

2.1.1 Dataset 1:

In this project, London will be used as synonymous to the "Greater London Area" in this project. Within the Greater London Area, there are areas that are within the London Area Postcode. The focus of this project will be the nieghbourhoods are that are within the London Post Code area.

The London Area consists of 32 Boroughs and the "City of London". Our data will be from the link - Greater London Area https://en.wikipedia.org/wiki/List_of_areas_of_London (https://en.wikipedia.org/wiki/List_of_areas_of_London) >

The web scrapped of the Wikipedia page for the Greater London Area data is provided below:

```
In [124]: # library for BeautifulSoup
          from bs4 import BeautifulSoup
          # library to handle data in a vectorized manner
          import numpy as np
          # library for data analsysis
          import pandas as pd
          pd.set option('display.max columns', None)
          pd.set_option('display.max_rows', None)
          # library to handle JSON files
          import json
          print('numpy, pandas, ..., imported...')
          !pip -q install geopy
          # conda install -c conda-forge geopy --yes # uncomment this line if you have
          n't completed the Foursquare API lab
          print('geopy installed...')
          # convert an address into Latitude and Longitude values
          from geopy.geocoders import Nominatim
          print('Nominatim imported...')
          # library to handle requests
          import requests
          print('requests imported...')
          # tranform JSON file into a pandas dataframe
          from pandas.io.json import json normalize
          print('json normalize imported...')
          # Matplotlib and associated plotting modules
          import matplotlib.cm as cm
          import matplotlib.colors as colors
          print('matplotlib imported...')
          # import k-means from clustering stage
          from sklearn.cluster import KMeans
          print('Kmeans imported...')
          # install the Geocoder
          !pip -q install geocoder
          import geocoder
          # import time
          import time
          # !conda install -c conda-forge folium=0.5.0 --yes # uncomment this line if yo
          u haven't completed the Foursquare API lab
          !pip -q install folium
          print('folium installed...')
          import folium # map rendering library
          print('folium imported...')
          print('...Done')
```

```
numpy, pandas, ..., imported...
        geopy installed...
        Nominatim imported...
        requests imported...
        json normalize imported...
        matplotlib imported...
        Kmeans imported...
        folium installed...
        folium imported...
        ...Done
In [4]:
        wikipedia link = 'https://en.wikipedia.org/wiki/List of areas of London'
        headers = {'User-Agent': 'Mozilla/5.0 (Windows NT 10.0; Win64; x64; rv:64.0) G
        ecko/20100101 Firefox/64.0'}
        wikipedia_page = requests.get(wikipedia_link, headers = headers)
        wikipedia page
Out[4]: <Response [200]>
In [5]: # Cleans html file
        soup = BeautifulSoup(wikipedia page.content, 'html.parser')
        # This extracts the "tbody" within the table where class is "wikitable sortabl
        table = soup.find('table', {'class':'wikitable sortable'}).tbody
In [6]: # Extracts all "tr" (table rows) within the table above
        rows = table.find all('tr')
In [7]: # Extracts the column headers, removes and replaces possible '\n' with space f
        or the "th" tag
        columns = [i.text.replace('\n', '')
                   for i in rows[0].find_all('th')]
In [8]: # Converts columns to pd dataframe
        df = pd.DataFrame(columns = columns)
        df
Out[8]:
           Location London borough Post town Postcode district Dial code OS grid ref
```

```
In [9]: # Extracts every row with corresponding columns
        # Then appends the values to the create pd dataframe "df"
        # Please note that the first row (row[0]) is skipped because it is already the
        header
        for i in range(1, len(rows)):
            tds = rows[i].find all('td')
            if len(tds) == 7:
                values = [tds[0].text, tds[1].text, tds[2].text.replace('\n', ''.repla
        ce('\xa0','')), tds[3].text, tds[4].text.replace('\n', ''.replace('\xa0','')),
        tds[5].text.replace('\n', ''.replace('\xa0','')), tds[6].text.replace('\n', ''
        .replace('\xa0',''))]
            else:
                values = [td.text.replace('\n', '').replace('\xa0','') for td in tds]
                df = df.append(pd.Series(values, index = columns), ignore index = True
        )
                df
```

In [10]: df.head(5)

Out[10]:

	Location	London borough	Post town	Postcode district	Dial code	OS grid ref
0	Abbey Wood	Bexley, Greenwich [7]	LONDON	SE2	020	TQ465785
1	Acton	Ealing, Hammersmith and Fulham[8]	LONDON	W3, W4	020	TQ205805
2	Addington	Croydon[8]	CROYDON	CR0	020	TQ375645
3	Addiscombe	Croydon[8]	CROYDON	CR0	020	TQ345665
4	Albany Park	Bexley	BEXLEY, SIDCUP	DA5, DA14	020	TQ478728

```
In [12]:
           df.head(5)
Out[12]:
                                                                                       Dial-
                                                                                             OSGridRef
                  Location
                                                Borough
                                                              Post-town
                                                                         Postcode
                                                                                       code
                    Abbey
            0
                                     Bexley, Greenwich [7]
                                                               LONDON
                                                                              SE2
                                                                                              TQ465785
                                                                                        020
                     Wood
                                 Ealing, Hammersmith and
            1
                     Acton
                                                               LONDON
                                                                           W3, W4
                                                                                        020
                                                                                              TQ205805
                                               Fulham[8]
            2
                 Addington
                                              Croydon[8]
                                                              CROYDON
                                                                              CR0
                                                                                        020
                                                                                              TQ375645
                                                              CROYDON
               Addiscombe
                                              Croydon[8]
                                                                              CR0
                                                                                        020
                                                                                              TQ345665
                                                                BEXLEY,
                                                                             DA5,
               Albany Park
                                                  Bexley
                                                                                        020
                                                                                              TQ478728
                                                                SIDCUP
                                                                             DA14
```

Looking the data, under the Borough, there are borough names with []. These are references extracted from the wiki page. So remove these, the following was done:

```
In [13]:
           df['Borough'] = df['Borough'].map(lambda x: x.rstrip(']').rstrip('0123456789')
           .rstrip('['))
In [14]:
           df.shape
Out[14]:
           (533, 6)
In [15]:
           df.head(5)
Out[15]:
                                                                                     Dial-
                                                                                           OSGridRef
                  Location
                                              Borough
                                                                       Postcode
                                                            Post-town
                                                                                     code
                    Abbey
           0
                                                                            SE<sub>2</sub>
                                      Bexley, Greenwich
                                                             LONDON
                                                                                      020
                                                                                            TQ465785
                    Wood
                               Ealing, Hammersmith and
            1
                                                                                            TQ205805
                    Acton
                                                             LONDON
                                                                         W3, W4
                                                                                      020
                                               Fulham
           2
                Addington
                                              Croydon
                                                            CROYDON
                                                                            CR0
                                                                                      020
                                                                                            TQ375645
              Addiscombe
                                              Croydon
                                                            CROYDON
                                                                            CR0
                                                                                      020
                                                                                           TQ345665
           3
                                                              BEXLEY,
                                                                           DA5,
               Albany Park
                                                Bexley
                                                                                      020
                                                                                           TQ478728
                                                              SIDCUP
                                                                           DA14
```

London is big and due to the limitations in the number of calls for the Foursquare API, the following assumptions are made to confine this project to only South East London.

Assumption 1: Where the Postcode are more than one, (for example, in Acton, there are 2 postcodes - W3 and W4), the postcodes are spread to multi-rows and assigned the same values from the other columns

```
In [16]: df0 = df.drop('Postcode', axis=1).join(df['Postcode'].str.split(',', expand=Tr
ue).stack().reset_index(level=1, drop=True).rename('Postcode'))
```

```
In [17]:
           df0.head(5)
Out[17]:
                   Location
                                                  Borough Post-town
                                                                      Dial-code
                                                                                OSGridRef Postcode
               Abbey Wood
                                         Bexley, Greenwich
             0
                                                                           020
                                                                                TQ465785
                                                                                                SE2
                                                            LONDON
             1
                     Acton
                            Ealing, Hammersmith and Fulham
                                                            LONDON
                                                                           020
                                                                                TQ205805
                                                                                                W3
             1
                     Acton
                            Ealing, Hammersmith and Fulham
                                                            LONDON
                                                                           020
                                                                                TQ205805
                                                                                                W4
            10
                     Angel
                                                                           020
                                                  Islington
                                                            LONDON
                                                                                TQ345665
                                                                                               EC1
            10
                                                  Islington
                                                            LONDON
                                                                           020
                                                                                TQ345665
                                                                                                 N1
                      Angel
In [18]:
          df0.shape
Out[18]: (637, 6)
```

As seen above, there are separate rows for Postcodes - W3and W4; same goes for the others too.

Assumption 2: From the data, only the 'Location', 'Borough', 'Postcode', 'Post-town' will be used for this project. So they are extracted into a new data frame.

```
df1 = df0[['Location', 'Borough', 'Postcode', 'Post-town']].reset index(drop=T
In [19]:
          rue)
          df1.head(5)
In [20]:
Out[20]:
                 Location
                                               Borough Postcode Post-town
              Abbey Wood
                                       Bexley, Greenwich
                                                            SE2
                                                                  LONDON
           1
                   Acton
                          Ealing, Hammersmith and Fulham
                                                             W3
                                                                  LONDON
           2
                   Acton
                          Ealing, Hammersmith and Fulham
                                                             W4
                                                                  LONDON
           3
                                               Islington
                                                            EC1
                                                                  LONDON
                   Angel
           4
                   Angel
                                               Islington
                                                             N1
                                                                  LONDON
In [21]:
          df1.shape
Out[21]: (637, 4)
```

Assumption 3: Now, only the Boroughs with London Post-town will be used for our search of location. Therefore, all the non-post-town are dropped.

```
In [22]: df2 = df1
    df21 = df2[df2['Post-town'].str.contains('LONDON')]
```

```
In [23]:
          df21.head(5)
Out[23]:
                  Location
                                                Borough Postcode Post-town
              Abbey Wood
           0
                                        Bexley, Greenwich
                                                                    LONDON
                                                              SE2
           1
                    Acton
                           Ealing, Hammersmith and Fulham
                                                              W3
                                                                    LONDON
           2
                    Acton
                           Ealing, Hammersmith and Fulham
                                                              W4
                                                                    LONDON
           3
                    Angel
                                                Islington
                                                              EC1
                                                                    LONDON
                    Angel
                                                Islington
                                                               N1
                                                                    LONDON
In [24]:
          df21.shape
Out[24]: (381, 4)
```

From assumption 3, there are now 381 instances, which is a drop from 637 because of the drop of non-London post-towns.

```
# Re-assigns the df21 to new dataframe without the Post-town
In [25]:
          df3 = df21[['Location', 'Borough', 'Postcode']].reset index(drop=True)
In [26]:
          df3.head(10)
Out[26]:
                 Location
                                                Borough Postcode
              Abbey Wood
                                       Bexley, Greenwich
                                                             SE2
           1
                           Ealing, Hammersmith and Fulham
                                                              W3
                    Acton
           2
                          Ealing, Hammersmith and Fulham
                                                              W4
                    Acton
                                                             EC1
           3
                    Angel
                                               Islington
                                               Islington
           4
                    Angel
                                                              N1
           5
               Church End
                                                  Brent
                                                            NW10
               Church End
           6
                                                 Barnet
                                                              N3
           7
                 Clapham
                                    Lambeth, Wandsworth
                                                             SW4
           8
               Clerkenwell
                                               Islington
                                                             EC1
           9
                 Colindale
                                                 Barnet
                                                             NW9
In [27]:
          df london = df3
          df london.to csv('LondonLocations.csv', index = False)
```

Assumption 4: Due to its more diverse outlook, proximity to afro-caribbean markets and accessible facilities, only the South East areas of London will be considered for our analysis. The South East areas has postcodes starting with SE.

So, first, we remove the whitesapaces at the start of some of the postcodes and then drop the other non-SE postcodes.

	Location	Borough	Postcode	
0				
	-	•		
		-		
3		-	EC1	
4	Angel	Islington	N1	
df _.			D. M. J.	
_				-
	-	-		
		-		
3		-		
4	Angel	Islington	N1	
	df. df. 1	1 Acton 2 Acton 3 Angel 4 Angel df_london.Post df_london.head Location 0 Abbey Wood 1 Acton 2 Acton	0 Abbey Wood Bexley, Greenwich 1 Acton Ealing, Hammersmith and Fulham 2 Acton Ealing, Hammersmith and Fulham 3 Angel Islington 4 Angel Islington df_london.Postcode = df_london.Postcode. df_london.head(5) Location Borough 0 Abbey Wood Bexley, Greenwich 1 Acton Ealing, Hammersmith and Fulham 2 Acton Ealing, Hammersmith and Fulham	0 Abbey Wood Bexley, Greenwich SE2 1 Acton Ealing, Hammersmith and Fulham W3 2 Acton Ealing, Hammersmith and Fulham W4 3 Angel Islington EC1 4 Angel Islington N1 df_london.Postcode = df_london.Postcode.str.strip df_london.head(5) Location Borough Postcode 0 Abbey Wood Bexley, Greenwich SE2 1 Acton Ealing, Hammersmith and Fulham W3 2 Acton Ealing, Hammersmith and Fulham W4

```
In [32]:
           df se.head(10)
Out[32]:
                    Location
                                       Borough Postcode
            0
                 Abbey Wood Bexley, Greenwich
                                                      SE2
            1
                 Crofton Park
                                      Lewisham
                                                      SE4
            2
                  Crossness
                                         Bexley
                                                      SE2
            3
               Crystal Palace
                                       Bromley
                                                     SE19
               Crystal Palace
                                       Bromley
                                                     SE20
               Crystal Palace
                                       Bromley
                                                     SE26
            6
                 Denmark Hill
                                     Southwark
                                                      SE5
            7
                    Deptford
                                     Lewisham
                                                      SE8
            8
                     Dulwich
                                     Southwark
                                                     SE21
            9
                East Dulwich
                                     Southwark
                                                     SE22
```

Now, our data is ready. df_se is the data we will focus on.

Assumption 5: This assumption will focus on the demography of London where there are predominantly more multicultural groups. According to the proportion of races by London borough as seen in Demography of London, the top 5 Black Africans or Caribbeans are shown below:

```
demograph link = 'https://en.wikipedia.org/wiki/Demography of London'
In [33]:
         headers = {'User-Agent': 'Mozilla/5.0 (Windows NT 10.0; Win64; x64; rv:64.0) G
         ecko/20100101 Firefox/64.0'}
         demograph page = requests.get(demograph_link, headers = headers)
         soup1 = BeautifulSoup(demograph page.content, 'html.parser')
         table1 = soup1.find('table', {'class':'wikitable sortable'}).tbody
         rows1 = table1.find all('tr')
         columns1 = [i.text.replace('\n', '')
                     for i in rows1[0].find all('th')]
In [34]:
         columns1
Out[34]: ['Local authority', 'White', 'Mixed', 'Asian', 'Black', 'Other']
In [35]:
         demo london = pd.DataFrame(columns = columns1)
         demo london.head(5)
In [36]:
Out[36]:
            Local authority White Mixed Asian Black Other
```

```
In [37]: for j in range(1, len(rows1)):
              tds1 = rows1[j].find all('td')
              if len(tds1) == 7:
                  values1 = [tds1[0].text, tds1[1].text, tds1[2].text.replace('\n', ''.r
          eplace('\xa0','')), tds1[3].text, tds1[4].text.replace('\n', ''.replace('\xa0'
          ,'')), tds1[5].text.replace('\n', ''.replace('\xa0',''))]
                  values1 = [td1.text.replace('\n', '').replace('\xa0','') for td1 in td
          s1]
                  demo london = demo london.append(pd.Series(values1, index = columns1),
          ignore index = True)
                  demo london
In [38]:
          demo london['Black'] = demo london['Black'].astype('float')
          demo london sorted = demo london.sort values(by='Black', ascending = False)
In [39]:
In [40]:
          demo london sorted.head(5)
Out[40]:
              Local authority White Mixed Asian Black Other
           22
                  Lewisham
                             53.5
                                     7.4
                                                27.2
                                           9.3
                                                       2.6
          27
                  Southwark
                             54.3
                                     6.2
                                           9.4
                                                26.9
                                                       3.3
          21
                   Lambeth
                             57.1
                                     7.6
                                           6.9
                                                25.9
                                                       2.4
           11
                   Hackney
                             54.7
                                     6.4
                                          10.5
                                                23.1
                                                       5.3
           7
                   Croydon
                             55.1
                                     6.6
                                          16.4
                                                20.2
                                                       1.8
```

Assumption 6: Our next assumption will be based on the top 5 areas will significantly high "Black", "Mixed" and other races. These leaves us with Lewisham, Southwark, Lambeth, Hackney and Croydon.

In [41]: df_se

Out[41]:

	Location	Borough	Postcode
0	Abbey Wood	Bexley, Greenwich	SE2
1	Crofton Park	Lewisham	SE4
2	Crossness	Bexley	SE2
3	Crystal Palace	Bromley	SE19
4	Crystal Palace	Bromley	SE20
5	Crystal Palace	Bromley	SE26
6	Denmark Hill	Southwark	SE5
7	Deptford	Lewisham	SE8
8	Dulwich	Southwark	SE21
9	East Dulwich	Southwark	SE22
10	Elephant and Castle	Southwark	SE1
11	Elephant and Castle	Southwark	SE11
12	Elephant and Castle	Southwark	SE17
13	Eltham	Greenwich	SE9
14	Falconwood	Bexley, Greenwich	SE9
15	Bankside	Southwark	SE1
16	Forest Hill	Lewisham	SE23
17	Gipsy Hill	Lambeth	SE19
18	Gipsy Hill	Lambeth	SE27
19	Greenwich	Greenwich	SE10
20	Grove Park	Lewisham	SE12
21	Herne Hill	Lambeth	SE24
22	Hither Green	Lewisham	SE13
23	Honor Oak	Lewisham	SE23
24	Horn Park	Greenwich, Lewisham	SE12
25	Kennington	Lambeth, Southwark	SE11
26	Kidbrooke	Greenwich	SE3
27	Ladywell	Lewisham	SE4
28	Ladywell	Lewisham	SE13
29	Lambeth	Lambeth	SE1
30	Lee	Lewisham	SE12
31	Lewisham	Lewisham	SE13
32	Beckenham	Bromley	SE20
33	Longlands	Bexley	SE9
34	Maze Hill	Greenwich	SE10

	Location	Borough	Postcode
35	Middle Park	Greenwich	SE9
36	Mottingham	Bromley	SE9
37	New Cross	Lewisham	SE14
38	New Eltham	Greenwich	SE9
39	Newington	Southwark	SE1
40	Newington	Southwark	SE17
41	Nunhead	Southwark	SE15
42	Oval	Lambeth	SE11
43	Bellingham	Lewisham	SE6
44	Peckham	Southwark	SE15
45	Penge	Bromley	SE20
46	Plumstead	Greenwich	SE18
47	Rotherhithe	Southwark	SE16
48	Selhurst	Croydon	SE25
49	Shooter's Hill	Greenwich	SE18
50	Bermondsey	Southwark	SE1
51	South Norwood	Croydon	SE25
52	Southend	Lewisham	SE6
53	St Johns	Lewisham	SE4
54	Bexleyheath (also Bexley New Town)	Bexley	SE2
55	Surrey Quays	Southwark	SE16
56	Sydenham (also Lower Sydenham, Upper Sydenham)	Lewisham, Bromley	SE26
57	Sydenham Hill	Lewisham, Southwark	SE21
58	Sydenham Hill	Lewisham, Southwark	SE26
59	Thamesmead	Bexley, Greenwich	SE28
60	Thamesmead	Bexley, Greenwich	SE2
61	Tulse Hill	Lambeth	SE24
62	Tulse Hill	Lambeth	SE27
63	Upper Norwood	Croydon	SE19
64	Walworth	Southwark	SE17
65	Well Hall	Greenwich	SE9
66	Blackheath	Lewisham	SE3
67	West Heath	Bexley	SE2
68	Blackheath Royal Standard	Greenwich	SE3
69	Blackheath Royal Standard	Greenwich	SE12
70	West Norwood	Lambeth	SE27

		Location	Borough	Postcode
	71	Westcombe Park	Greenwich	SE3
	72	Woolwich	Greenwich	SE18
	73	Brixton	Lambeth	SE5
	74	Brockley	Lewisham	SE4
	75	Camberwell	Southwark	SE5
	76	Catford	Lewisham	SE6
	77	Charlton	Greenwich	SE7
	78	Anerley	Bromley	SE20
	79	Chinbrook	Lewisham	SE12
[42]:		<pre>df_se[df_se['Borough'].isin(['Lewisham', Croydon'])].reset_index(drop=True)</pre>	'Southwark	(', 'Lambeth'

Just to be sure with syntax, Hackney is in North London, so it will not be returned. The resulting dataframe is df_se_top.

```
In [43]: df_se_top.head(5)
Out[43]:
                 Location
                            Borough Postcode
             Crofton Park
                           Lewisham
                                          SE4
              Denmark Hill
                           Southwark
                                          SE<sub>5</sub>
           2
                 Deptford
                                          SE8
                           Lewisham
           3
                  Dulwich Southwark
                                         SE21
           4 East Dulwich Southwark
                                         SE22
In [44]: df_se_top.shape
Out[44]: (46, 3)
In [45]: df_se.shape
Out[45]: (80, 3)
```

So we have our working dataframe to be df_se_top to work with.

2.1.2 Dataset 2:

In obtaining the location data of the locations, the Geocoder package is used with the arcgis_geocoder to obtain the latitude and longitude of the needed locations.

These will help to create a new dataframe that will be used subsequently for the South East London areas.

```
In [46]: # Geocoder starts here
# Defining a function to use --> get_Latlng()'''
def get_latlng(arcgis_geocoder):

    # Initialize the Location (lat. and Long.) to "None"
    lat_lng_coords = None

# While Loop helps to create a continous run until all the Location coordinates are geocoded
    while(lat_lng_coords is None):
        g = geocoder.arcgis('{}, London, United Kingdom'.format(arcgis_geocoder))

        lat_lng_coords = g.latlng
        return lat_lng_coords
# Geocoder ends here
```

Testing the function above for a sample postcode - SE2.

```
In [47]: sample = get_latlng('SE2')
sample
Out[47]: [51.492450000000076, 0.12127000000003818]
```

And reverse geocoding this, using the geocodefarm geocoder, gives the following:

So, we are certain that the geocoder works fine. So we proceed to applying it to our dataframe df_se_top.

```
In [49]: start = time.time()
    postal_codes = df_se_top['Postcode']
    coordinates = [get_latlng(postal_code) for postal_code in postal_codes.tolist
    ()]
    end = time.time()
    print("Time of execution: ", end - start, "seconds")
```

Then we proceed to store the location data - latitude and longitude as follows. The obtained coordinates are then joined to df_se_topto create new data frame.

Time of execution: 28.8045871257782 seconds

```
In [50]: df_se_loc = df_se_top
          # The obtained coordinates (latitude and longitude) are joined with the datafr
          ame as shown
          df se coordinates = pd.DataFrame(coordinates, columns = ['Latitude', 'Longitud')
          e'1)
          df se loc['Latitude'] = df se coordinates['Latitude']
          df se loc['Longitude'] = df se coordinates['Longitude']
In [51]: df_se_loc.head(5)
Out[51]:
                 Location
                           Borough Postcode
                                             Latitude Longitude
             Crofton Park
                         Lewisham
                                        SE4 51.46268
                                                       -0.03558
           1
             Denmark Hill
                         Southwark
                                        SE5 51.47480
                                                       -0.09313
          2
                 Deptford
                                                       -0.02467
                         Lewisham
                                        SE8 51.48114
           3
                         Southwark
                 Dulwich
                                       SE21 51.44100
                                                       -0.08897
           4 East Dulwich Southwark
                                       SE22 51.45256
                                                       -0.07076
In [52]: df se loc.to csv('SELondonLocationsCoordinates.csv', index = False)
In [53]: df_se_loc.shape
Out[53]: (46, 5)
```

2.1.3 Dataset 3:

The Foursquare API will be used to obtain the South East London Area venues for the geographical location data. These will be used to explore the neighbourhoods of London acordingly.

The venues within the neighbourhoods of South East London like the areas's restaurants and proximity to amenities would be correlated. Also, accessibility and ease of supplies would be considered as it relates to venues.

To use the Foursquare API, we define the Foursquare Credentials and Version as shown below:

Please note that due to privacy, the personal Foursquare Credential has been stored in a .json <fsquarecredential.json> and called appropriately as shown below:

```
In [54]: import json
    filename = 'fsquarecredential.json'
    with open(filename) as f:
        data = json.load(f)

In [55]: CLIENT_ID = 'OKY2Z5WIRS5FZGGRTPNKQZ0YFCCUBQ3CQAFT3FL01NAALY25' # your Foursqua
    re ID
    CLIENT_SECRET = 'PACBFXAS2V31I5L3YXASC30JKHWHFWMPC1LNE44B0IBLTSB2' # your Four
    square Secret
    VERSION = '20180605' # Foursquare API version
    LIMIT = 100 # Limit of number of venues returned by Foursquare API
    radius = 800 # define radius
```

3. Methodology

3.1 Data Exploration

3.1.1 Single Neighbourhood

An initial exploration of a single Neighbourhood within the London area was done to examine the Foursquare workability. The Lewisham Borough postcode SE13 and Location - Lewisham is used for this.

```
In [56]: # Resets the current index to a new
se_df = df_se_loc.reset_index().drop('index', axis = 1)
In [57]: se_df.shape
Out[57]: (46, 5)
```

In [58]: se_df

Out[58]:

	Location	Borough	Postcode	Latitude	Longitude
0	Crofton Park	Lewisham	SE4	51.46268	-0.03558
1	Denmark Hill	Southwark	SE5	51.47480	-0.09313
2	Deptford	Lewisham	SE8	51.48114	-0.02467
3	Dulwich	Southwark	SE21	51.44100	-0.08897
4	East Dulwich	Southwark	SE22	51.45256	-0.07076
5	Elephant and Castle	Southwark	SE1	51.49996	-0.09568
6	Elephant and Castle	Southwark	SE11	51.49084	-0.11108
7	Elephant and Castle	Southwark	SE17	51.48764	-0.09542
8	Bankside	Southwark	SE1	51.49996	-0.09568
9	Forest Hill	Lewisham	SE23	51.44122	-0.04764
10	Gipsy Hill	Lambeth	SE19	51.41990	-0.08808
11	Gipsy Hill	Lambeth	SE27	51.43407	-0.10375
12	Grove Park	Lewisham	SE12	51.44759	0.01350
13	Herne Hill	Lambeth	SE24	51.45529	-0.09928
14	Hither Green	Lewisham	SE13	51.46196	-0.00754
15	Honor Oak	Lewisham	SE23	51.44122	-0.04764
16	Ladywell	Lewisham	SE4	51.46268	-0.03558
17	Ladywell	Lewisham	SE13	51.46196	-0.00754
18	Lambeth	Lambeth	SE1	51.49996	-0.09568
19	Lee	Lewisham	SE12	51.44759	0.01350
20	Lewisham	Lewisham	SE13	51.46196	-0.00754
21	New Cross	Lewisham	SE14	51.47489	-0.04038
22	Newington	Southwark	SE1	51.49996	-0.09568
23	Newington	Southwark	SE17	51.48764	-0.09542
24	Nunhead	Southwark	SE15	51.47218	-0.06779
25	Oval	Lambeth	SE11	51.49084	-0.11108
26	Bellingham	Lewisham	SE6	51.43722	-0.01868
27	Peckham	Southwark	SE15	51.47218	-0.06779
28	Rotherhithe	Southwark	SE16	51.49574	-0.05157
29	Selhurst	Croydon	SE25	51.39925	-0.07414
30	Bermondsey	Southwark	SE1	51.49996	-0.09568
31	South Norwood	Croydon	SE25	51.39925	-0.07414
32	Southend	Lewisham	SE6	51.43722	-0.01868
33	St Johns	Lewisham	SE4	51.46268	-0.03558
34	Surrey Quays	Southwark	SE16	51.49574	-0.05157

		Location	Borough	Postcode	Latitude	Longitude
	35	Tulse Hill	Lambeth	SE24	51.45529	-0.09928
	36	Tulse Hill	Lambeth	SE27	51.43407	-0.10375
	37	Upper Norwood	Croydon	SE19	51.41990	-0.08808
	38	Walworth	Southwark	SE17	51.48764	-0.09542
	39	Blackheath	Lewisham	SE3	51.47138	0.02338
	40	West Norwood	Lambeth	SE27	51.43407	-0.10375
	41	Brixton	Lambeth	SE5	51.47480	-0.09313
	42	Brockley	Lewisham	SE4	51.46268	-0.03558
	43	Camberwell	Southwark	SE5	51.47480	-0.09313
	44	Catford	Lewisham	SE6	51.43722	-0.01868
	45	Chinbrook	Lewisham	SE12	51.44759	0.01350
In [59]:	<pre>: se_df.loc[se_df['Location'] == 'Lewisham']</pre>					
Out[59]:						
		Location Boroug	h Postcode	e Latitude	Longitud	9

SE13 51.46196

-0.00754

Now, let's use the Lewisham with the index location 20.

20 Lewisham Lewisham

The latitude and longitude values of Lewisham with postcode SE13, are 51.4619

Let's explore the top 100 venues that are within a 2000 metres radius of Lewisham.

And then, let's create the GET request URL, and then the url is named.

600000003, -0.007539999999949032.

Then, send the GET request and examine the results.

In [63]: results = requests.get(url).json()
results

```
Out[63]: {'meta': {'code': 200, 'requestId': '5e8cbeb2c94979001b95ffec'},
           'response': {'suggestedFilters': {'header': 'Tap to show:',
             'filters': [{'name': 'Open now', 'key': 'openNow'}]},
            'headerLocation': 'Lewisham Central',
            'headerFullLocation': 'Lewisham Central, London',
            'headerLocationGranularity': 'neighborhood',
            'totalResults': 187,
            'suggestedBounds': {'ne': {'lat': 51.47996001800005,
              'lng': 0.021296961190459426},
             'sw': {'lat': 51.44395998200002, 'lng': -0.03637696119035749}},
            'groups': [{'type': 'Recommended Places',
              'name': 'recommended',
              'items': [{'reasons': {'count': 0,
                 'items': [{'summary': 'This spot is popular',
                   'type': 'general',
                   'reasonName': 'globalInteractionReason'}]},
                'venue': {'id': '535823bc498ec8d8da9aad5f',
                 'name': 'Street Feast Model Market',
                 'location': {'address': '196 Lewisham High St',
                  'crossStreet': 'entrance at Molesworth St',
                  'lat': 51.46020945743763,
                  'lng': -0.012199022914877357,
                  'labeledLatLngs': [{'label': 'display',
                    'lat': 51.46020945743763,
                    'lng': -0.012199022914877357}],
                  'distance': 377,
                  'postalCode': 'SE13 6LS',
                  'cc': 'GB',
                  'neighborhood': 'Lewisham Central, London, Greater London',
                  'city': 'Lewisham Central',
                  'state': 'Greater London',
                  'country': 'United Kingdom',
                  'formattedAddress': ['196 Lewisham High St (entrance at Molesworth S
         t)',
                   'Lewisham Central',
                   'Greater London',
                   'SE13 6LS',
                   'United Kingdom']},
                 'categories': [{'id': '53e0feef498e5aac066fd8a9',
                   'name': 'Street Food Gathering',
                   'pluralName': 'Street Food Gatherings',
                   'shortName': 'Street Food Gathering',
                   'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/food/stre
         etfood_',
                    'suffix': '.png'},
                   'primary': True}],
                 'photos': {'count': 0, 'groups': []}},
                'referralId': 'e-0-535823bc498ec8d8da9aad5f-0'},
               {'reasons': {'count': 0,
                 'items': [{'summary': 'This spot is popular',
                   'type': 'general',
                   'reasonName': 'globalInteractionReason'}]},
                'venue': {'id': '4bd2b69377b29c7434478f82',
                 'name': "Maggie's Kitchen",
                 'location': {'address': '320-322 Lewisham Rd.',
                  'lat': 51.46537957272932,
                  'lng': -0.011213018572287086,
```

```
'labeledLatLngs': [{'label': 'display',
          'lat': 51.46537957272932,
          'lng': -0.011213018572287086}],
        'distance': 458,
        'postalCode': 'SE13 7PA',
        'cc': 'GB',
        'city': 'London',
        'state': 'Greater London',
        'country': 'United Kingdom',
        'formattedAddress': ['320-322 Lewisham Rd.',
         'Lewisham',
         'Greater London',
         'SE13 7PA',
         'United Kingdom']},
       'categories': [{'id': '4bf58dd8d48988d16d941735',
         'name': 'Café',
         'pluralName': 'Cafés',
         'shortName': 'Café',
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/food/cafe
          'suffix': '.png'},
         'primary': True}],
       'photos': {'count': 0, 'groups': []}},
      'referralId': 'e-0-4bd2b69377b29c7434478f82-1'},
     {'reasons': {'count': 0,
       'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'globalInteractionReason'}]},
      'venue': {'id': '4b640ce6f964a520ee9c2ae3',
       'name': 'Levante restaurant',
       'location': {'address': '11 Lewis Grove',
        'crossStreet': 'Belmont Hill',
        'lat': 51.46207211451613,
        'lng': -0.009490926926344812,
        'labeledLatLngs': [{'label': 'display',
          'lat': 51.46207211451613,
          'lng': -0.009490926926344812}],
        'distance': 135,
        'postalCode': 'SE13 BG',
        'cc': 'GB',
        'city': 'London',
        'state': 'Greater London',
        'country': 'United Kingdom',
        'formattedAddress': ['11 Lewis Grove (Belmont Hill)',
         'Lewisham',
         'Greater London',
         'SE13 BG',
         'United Kingdom']},
       'categories': [{'id': '4bf58dd8d48988d1c4941735',
         'name': 'Restaurant',
         'pluralName': 'Restaurants',
         'shortName': 'Restaurant',
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories_v2/food/defa
ult_',
          'suffix': '.png'},
         'primary': True}],
       'photos': {'count': 0, 'groups': []}},
```

```
'referralId': 'e-0-4b640ce6f964a520ee9c2ae3-2'},
     {'reasons': {'count': 0,
       'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'globalInteractionReason'}]},
      'venue': {'id': '4d56efce9e508cfa8dee149b',
       'name': 'Levante Pide Restaurant',
       'location': {'address': '187 Lewisham High St',
        'lat': 51.459848264113056,
        'lng': -0.011476481770328631,
        'labeledLatLngs': [{'label': 'display',
          'lat': 51.459848264113056,
          'lng': -0.011476481770328631}],
        'distance': 360,
        'postalCode': 'SE13 6AA',
        'cc': 'GB',
        'neighborhood': 'Lewisham Central',
        'city': 'London',
        'state': 'Greater London',
        'country': 'United Kingdom',
        'formattedAddress': ['187 Lewisham High St',
         'Lewisham',
         'Greater London',
         'SE13 6AA',
         'United Kingdom']},
       'categories': [{'id': '4f04af1f2fb6e1c99f3db0bb',
         'name': 'Turkish Restaurant',
         'pluralName': 'Turkish Restaurants',
         'shortName': 'Turkish',
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/food/turk
ish_',
          'suffix': '.png'},
         'primary': True}],
       'photos': {'count': 0, 'groups': []}},
      'referralId': 'e-0-4d56efce9e508cfa8dee149b-3'},
     {'reasons': {'count': 0,
       'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'globalInteractionReason'}]},
      'venue': {'id': '512c80cbe4b0a7144ed5dc7a',
       'name': 'Corte',
       'location': {'address': '189 Lewisham High St',
        'lat': 51.45977605027753,
        'lng': -0.01155377601146681,
        'labeledLatLngs': [{'label': 'display',
          'lat': 51.45977605027753,
          'lng': -0.01155377601146681}],
        'distance': 369,
        'postalCode': 'SE13 6AA',
        'cc': 'GB',
        'city': 'London',
        'state': 'Greater London',
        'country': 'United Kingdom',
        'formattedAddress': ['189 Lewisham High St',
         'Lewisham',
         'Greater London',
         'SE13 6AA',
```

```
'United Kingdom']},
       'categories': [{'id': '4bf58dd8d48988d1e0931735',
         'name': 'Coffee Shop',
         'pluralName': 'Coffee Shops',
         'shortName': 'Coffee Shop',
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories_v2/food/coff
eeshop_',
          'suffix': '.png'},
         'primary': True}],
       'photos': {'count': 0, 'groups': []}},
      'referralId': 'e-0-512c80cbe4b0a7144ed5dc7a-4'},
     {'reasons': {'count': 0,
       'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'globalInteractionReason'}]},
      'venue': {'id': '4b3e9b40f964a520a99f25e3',
       'name': 'Manor House Gardens',
       'location': {'address': 'Old Rd',
        'crossStreet': 'Aislibie Rd',
        'lat': 51.45668630808165,
        'lng': 0.004684430062631204,
        'labeledLatLngs': [{'label': 'display',
          'lat': 51.45668630808165,
          'lng': 0.004684430062631204}],
        'distance': 1031,
        'postalCode': 'S E12',
        'cc': 'GB',
        'neighborhood': 'Lee Green',
        'city': 'London',
        'state': 'Greater London',
        'country': 'United Kingdom',
        'formattedAddress': ['Old Rd (Aislibie Rd)',
         'Lewisham',
         'Greater London',
         'S E12',
         'United Kingdom']},
       'categories': [{'id': '4bf58dd8d48988d163941735',
         'name': 'Park',
         'pluralName': 'Parks',
         'shortName': 'Park',
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories_v2/parks_out
doors/park',
          'suffix': '.png'},
         'primary': True}],
       'photos': {'count': 0, 'groups': []}},
      'referralId': 'e-0-4b3e9b40f964a520a99f25e3-5'},
     {'reasons': {'count': 0,
       'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'globalInteractionReason'}]},
      'venue': {'id': '4ac518c7f964a52053a520e3',
       'name': 'Dirty South',
       'location': {'address': '162 Lee High Rd',
        'lat': 51.458846296121216,
        'lng': -0.0026656179995295853,
        'labeledLatLngs': [{'label': 'display',
          'lat': 51.458846296121216,
```

```
'lng': -0.0026656179995295853}],
        'distance': 484,
        'postalCode': 'SE13 5PR',
        'cc': 'GB',
        'neighborhood': 'Lewisham',
        'city': 'London',
        'state': 'Greater London',
        'country': 'United Kingdom',
        'formattedAddress': ['162 Lee High Rd',
         'Lewisham',
         'Greater London',
         'SE13 5PR',
         'United Kingdom']},
       'categories': [{'id': '4bf58dd8d48988d11b941735',
         'name': 'Pub',
         'pluralName': 'Pubs',
         'shortName': 'Pub',
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories_v2/nightlif
e/pub_',
          'suffix': '.png'},
         'primary': True}],
       'photos': {'count': 0, 'groups': []}},
      'referralId': 'e-0-4ac518c7f964a52053a520e3-6'},
     {'reasons': {'count': 0,
       'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'globalInteractionReason'}]},
      'venue': {'id': '50c5e8e8e4b049cab1a7a58b',
       'name': 'Côte Brasserie',
       'location': {'address': '15-16 Royal Parade',
        'lat': 51.4673781623608,
        'lng': 0.00717625771325699,
        'labeledLatLngs': [{'label': 'display',
          'lat': 51.4673781623608,
          'lng': 0.00717625771325699}],
        'distance': 1185,
        'postalCode': 'SE3 0TL',
        'cc': 'GB',
        'city': 'Blackheath',
        'state': 'Greater London',
        'country': 'United Kingdom',
        'formattedAddress': ['15-16 Royal Parade',
         'Blackheath',
         'Greater London',
         'SE3 OTL',
         'United Kingdom']},
       'categories': [{'id': '4bf58dd8d48988d10c941735',
         'name': 'French Restaurant',
         'pluralName': 'French Restaurants',
         'shortName': 'French',
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/food/fren
ch_',
          'suffix': '.png'},
         'primary': True}],
       'photos': {'count': 0, 'groups': []}},
      'referralId': 'e-0-50c5e8e8e4b049cab1a7a58b-7'},
     {'reasons': {'count': 0,
```

```
'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'globalInteractionReason'}]},
      'venue': {'id': '4b52d617f964a520fa8827e3',
       'name': "Blackheath Farmers' Market",
       'location': {'address': 'Blackheath Village',
        'lat': 51.46591346191698,
        'lng': 0.007945118368659382,
        'labeledLatLngs': [{'label': 'display',
          'lat': 51.46591346191698,
          'lng': 0.007945118368659382}],
        'distance': 1160,
        'cc': 'GB',
        'city': 'Blackheath',
        'state': 'Greater London',
        'country': 'United Kingdom',
        'formattedAddress': ['Blackheath Village',
         'Blackheath',
         'Greater London',
         'United Kingdom']},
       'categories': [{'id': '4bf58dd8d48988d1fa941735',
         'name': 'Farmers Market',
         'pluralName': 'Farmers Markets',
         'shortName': "Farmer's Market",
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories_v2/shops/foo
d_farmersmarket_',
          'suffix': '.png'},
         'primary': True}],
       'photos': {'count': 0, 'groups': []}},
      'referralId': 'e-0-4b52d617f964a520fa8827e3-8'},
     {'reasons': {'count': 0,
       'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'globalInteractionReason'}]},
      'venue': {'id': '4c66be678e9120a1ecb3d864',
       'name': 'Gennaro Delicatessan',
       'location': {'address': '23 Lewis Grove',
        'lat': 51.4617645065367,
        'lng': -0.009725767238995344,
        'labeledLatLngs': [{'label': 'display',
          'lat': 51.4617645065367,
          'lng': -0.009725767238995344}],
        'distance': 153,
        'postalCode': 'SE13 6BG',
        'cc': 'GB',
        'city': 'London',
        'state': 'Greater London',
        'country': 'United Kingdom',
        'formattedAddress': ['23 Lewis Grove',
         'Lewisham',
         'Greater London',
         'SE13 6BG',
         'United Kingdom']},
       '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-0-4c66be678e9120a1ecb3d864-9'},
     {'reasons': {'count': 0,
       'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'globalInteractionReason'}]},
      'venue': {'id': '4bc5c1334a9aa5939cd8067b',
       'name': 'The Sausage Man',
       'location': {'address': '90-98 Lewisham High St',
        'lat': 51.46250733182629,
        'lng': -0.01024845973388549,
        'labeledLatLngs': [{'label': 'display',
          'lat': 51.46250733182629,
          'lng': -0.01024845973388549}],
        'distance': 197,
        'postalCode': 'SE1 3 6',
        'cc': 'GB',
        'neighborhood': 'Lewisham Central',
        'city': 'London',
        'state': 'Greater London',
        'country': 'United Kingdom',
        'formattedAddress': ['90-98 Lewisham High St',
         'Lewisham',
         'Greater London',
         'SE1 3 6',
         'United Kingdom']},
       'categories': [{'id': '4bf58dd8d48988d1cb941735',
         'name': 'Food Truck',
         'pluralName': 'Food Trucks',
         'shortName': 'Food Truck',
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories_v2/food/stre
etfood_',
          'suffix': '.png'},
         'primary': True}],
       'photos': {'count': 0, 'groups': []}},
      'referralId': 'e-0-4bc5c1334a9aa5939cd8067b-10'},
     {'reasons': {'count': 0,
       'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'globalInteractionReason'}]},
      'venue': {'id': '4afd75a5f964a520f42722e3',
       'name': 'Hilly Fields',
       'location': {'address': 'Adelaide Ave',
        'crossStreet': 'Montague Ave',
        'lat': 51.46001017998527,
        'lng': -0.025599002838134766,
        'labeledLatLngs': [{'label': 'display',
          'lat': 51.46001017998527,
          'lng': -0.025599002838134766}],
        'distance': 1271,
        'postalCode': 'SE13 7JL',
        'cc': 'GB',
        'city': 'London',
```

```
'state': 'Greater London',
        'country': 'United Kingdom',
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        'lng': 0.008438017933726814,
        'labeledLatLngs': [{'label': 'display',
          'lat': 51.467653966565024,
          'lng': 0.008438017933726814}],
        'distance': 1276,
        'postalCode': 'SE3 0TJ',
        'cc': 'GB',
        'neighborhood': 'Blackheath',
        'city': 'Blackheath',
        'state': 'Greater London',
        'country': 'United Kingdom',
        'formattedAddress': ['41 Montpelier Vale',
         'Blackheath',
         'Greater London',
         'SE3 OTJ',
         'United Kingdom']},
       'categories': [{'id': '52e81612bcbc57f1066b79fb',
         'name': 'Himalayan Restaurant',
         'pluralName': 'Himalayan Restaurants',
         'shortName': 'Himalayan',
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/food/defa
ult_',
          'suffix': '.png'},
         'primary': True}],
       'photos': {'count': 0, 'groups': []}},
      'referralId': 'e-0-4e272727d4c007d41a99e3bf-99'}]}]}}
```

From the results, the necessary information needs to be obtained from items key. To do this, the get_category_type function is used from the Foursquare lab.

```
In [64]: # function that extracts the category of the venue
def get_category_type(row):
    try:
        categories_list = row['categories']
    except:
        categories_list = row['venue.categories']

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

The result is then cleaned up from json to a structured pandas dataframe as shown below:

In [66]: nearby_venues

Out[66]:

	name	categories	lat	Ing
0	Street Feast Model Market	Street Food Gathering	51.460209	-0.012199
1	Maggie's Kitchen	Café	51.465380	-0.011213
2	Levante restaurant	Restaurant	51.462072	-0.009491
3	Levante Pide Restaurant	Turkish Restaurant	51.459848	-0.011476
4	Corte	Coffee Shop	51.459776	-0.011554
5	Manor House Gardens	Park	51.456686	0.004684
6	Dirty South	Pub	51.458846	-0.002666
7	Côte Brasserie	French Restaurant	51.467378	0.007176
8	Blackheath Farmers' Market	Farmers Market	51.465913	0.007945
9	Gennaro Delicatessan	Deli / Bodega	51.461765	-0.009726
10	The Sausage Man	Food Truck	51.462507	-0.010248
11	Hilly Fields	Park	51.460010	-0.025599
12	Buenos Aires Cafe	Argentinian Restaurant	51.467260	0.007083
13	Cafe Oscar's	Coffee Shop	51.456432	-0.020194
14	Brockley Market	Farmers Market	51.467980	-0.024795
15	Le Bouchon Wine Bar	Wine Bar	51.467004	0.007067
16	Everest Curry King	Sri Lankan Restaurant	51.466012	-0.019656
17	Spit And Roast	Food Truck	51.466138	-0.019618
18	Pistachios In The Park	Café	51.460144	-0.024263
19	Ladywell Fields	Park	51.453579	-0.020084
20	Ladywell Tavern	Pub	51.456485	-0.021502
21	Blackheath Common	Park	51.472322	0.007381
22	Dark Fluid	Food Truck	51.467981	-0.024662
23	GAIL's Bakery	Bakery	51.465696	0.009166
24	The Brookmill	Pub	51.470849	-0.021869
25	Asda	Supermarket	51.465088	-0.016627
26	Suttons Radio	Pub	51.461011	-0.010554
27	Meze Mangal	Turkish Restaurant	51.469493	-0.027656
28	The Spice Of Life	Indian Restaurant	51.458654	0.002613
29	Golden Chippy	Fish & Chips Shop	51.475992	-0.018595
30	Greenwich Park	Park	51.477521	0.000858
31	The Point Greenwich	Scenic Lookout	51.473202	-0.009293
32	Sparrow	Restaurant	51.463487	-0.011139
33	Peter Harrison Planetarium	Planetarium	51.477115	-0.000754
34	Friendly Place	Speakeasy	51.472374	-0.015076

	name	categories	lat	Ing
35	Greenwich Meridian	Historic Site	51.477915	-0.001529
36	Budget Gym Lewisham	Gym	51.462687	-0.009891
37	The Station Hotel	Gastropub	51.453080	-0.000358
38	Greenwich Park Flower Garden	Garden	51.475983	0.005271
39	The Greenwich Union	Pub	51.476587	-0.009842
40	Brockley's Rock	Fish & Chips Shop	51.459457	-0.033868
41	Full Nelson	Vegetarian / Vegan Restaurant	51.474699	-0.025303
42	Royal Teas	Café	51.476074	-0.009884
43	Old Royal Observatory Garden	Garden	51.477591	-0.001550
44	Royal Observatory	Observatory	51.477322	-0.000869
45	Greenwich Park Rose Garden	Garden	51.473685	-0.001137
46	Quaggy Café	Café	51.471535	-0.014752
47	The Wilderness Deer Park	Zoo Exhibit	51.475637	0.007237
48	Greenwich Picturehouse	Indie Movie Theater	51.479619	-0.009778
49	London Velo	Coffee Shop	51.475413	-0.026005
50	Heap's Sausages	Café	51.479516	-0.007875
51	Enish Restaurant + Grill	African Restaurant	51.459036	-0.012386
52	Something Fishy	Fish & Chips Shop	51.461697	-0.010277
53	Hand Made Food	Café	51.466488	0.008229
54	The Fox and Firkin	Pub	51.456780	-0.014161
55	Princess of Wales	Pub	51.469334	0.010360
56	McDonald's	Fast Food Restaurant	51.460508	-0.011228
57	Zerodegrees	Bar	51.467417	0.008440
58	The Orchard	Gastropub	51.463678	-0.035699
59	Greenwich Theatre	Theater	51.479531	-0.007637
60	Richard the First	Pub	51.476614	-0.009756
61	Oliver's Jazz & Piano Bar	Jazz Club	51.479458	-0.008096
62	The Birds Nest	Pub	51.476203	-0.022738
63	Panda Panda	Sandwich Place	51.474800	-0.025123
64	The Gym Group	Gym	51.466384	-0.016964
65	Le Délice	Bakery	51.456610	-0.019732
66	The Creaky Shed	Grocery Store	51.477436	-0.009823
67	Deptford Cinema	Indie Movie Theater	51.474683	-0.024053
68	Aldi	Supermarket	51.448675	-0.017781
69	You Don't Bring Me Flowers	Flower Shop	51.453017	-0.000687
70	The Dacre Arms	Pub	51.461075	0.003312

	name	categories	lat	Ing
71	The lvy Cafe	Restaurant	51.467600	0.008155
72	TK Maxx	Clothing Store	51.461017	-0.010850
73	The Lord Northbrook	Pub	51.450906	0.012225
74	Flying Tiger	Gift Shop	51.462198	-0.011849
75	Pets at Home	Pet Store	51.472462	-0.016981
76	The Prince of Greenwich	Pub	51.476195	-0.009947
77	PureGym	Gym / Fitness Center	51.476181	-0.018384
78	Cheeseboard	Cheese Shop	51.477360	-0.009728
79	н&м	Clothing Store	51.461367	-0.011812
80	DoubleTree by Hilton	Hotel	51.474425	-0.019505
81	The Hare & Billet	Gastropub	51.468117	0.003667
82	The Gantry	Gastropub	51.463597	-0.036127
83	Brockley Brewery (The Brockley Brewing Company)	Brewery	51.462265	-0.036132
84	Greenwich Picturehouse Bar	Bar	51.479523	-0.009860
85	Rivington Greenwich	Gastropub	51.479318	-0.009925
86	Luciano's	Italian Restaurant	51.450567	0.012553
87	The Talbot	Gastropub	51.467257	-0.023487
88	Greenwich Park Herb Garden	Garden	51.479539	-0.006233
89	Kitcho	Japanese Restaurant	51.475899	-0.018861
90	Guildford Arms	Pub	51.474406	-0.014961
91	Archery Fit	Athletics & Sports	51.476373	-0.019819
92	OneSE8 Gym	Gym / Fitness Center	51.472866	-0.021289
93	Carola	Italian Restaurant	51.456741	0.011377
94	Blackheath Tea Hut	Breakfast Spot	51.471802	-0.000100
95	Montpeliers	Café	51.467508	0.008477
96	Muffin Break	Café	51.461794	-0.012106
97	Staycity Aparthotels Deptford Bridge Station	Hotel	51.474259	-0.023102
98	The Junk Shop	Thrift / Vintage Store	51.477712	-0.012022
99	Everest Inn Gurkha's Restaurant	Himalayan Restaurant	51.467654	0.008438

In [67]: nearby_venues_lewisham_unique = nearby_venues['categories'].value_counts().to_
frame(name='Count')

```
In [68]: nearby_venues_lewisham_unique.head(5)

Out[68]: 

Count
Pub 13
Café 8
Gastropub 6
Park 5
Garden 4
```

Interestingly, even though there are restaurants are the Lewisham area, they are not even in the top 5 venues. It should be noted that since we are limited by data availability, our perspectives will be on what we have.

```
In [69]: print('{} venues were returned by Foursquare.'.format(nearby_venues.shape[0]))

100 venues were returned by Foursquare.
```

So in this case, 100 venues were returned for Lewisham.

3.1.2 Multiple Neighbourhoods

Now let's explore (Multiple) Neighborhoods in the South East London area.

To do this, the function getNearbyVenues is used and it's created to repeat the same process for all neighborhoods.

```
In [70]: def getNearbyVenues(names, latitudes, longitudes, radius=2000):
             venues list=[]
             for name, lat, lng in zip(names, latitudes, longitudes):
                  print(name)
                  # create the API request URL
                  url = 'https://api.foursquare.com/v2/venues/explore?&client id={}&clie
         nt secret={}&v={}&ll={},{}&radius={}&limit={}'.format(
                      CLIENT ID,
                      CLIENT SECRET,
                      VERSION,
                      lat,
                      lng,
                      radius,
                      LIMIT)
                  # make the GET request
                  results = requests.get(url).json()["response"]['groups'][0]['items']
                  # return only relevant information for each nearby venue
                  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 = ['Neighbourhood',
                            'Neighbourhood Latitude',
                            'Neighbourhood Longitude',
                            'Venue',
                            'Venue Latitude',
                            'Venue Longitude',
                            'Venue Category']
             return(nearby_venues)
```

The created function - getNearbyVenues is then used on each neighbourhoods. And creates a new dataframe called london venues.

```
In [71]: se venues = getNearbyVenues(names=se df['Location'],
                                              latitudes=se df['Latitude'],
                                              longitudes=se_df['Longitude']
                                             )
          Crofton Park
          Denmark Hill
         Deptford
         Dulwich
         East Dulwich
         Elephant and Castle
          Elephant and Castle
          Elephant and Castle
          Bankside
         Forest Hill
         Gipsy Hill
         Gipsy Hill
         Grove Park
         Herne Hill
         Hither Green
         Honor Oak
         Ladywell
          Ladywell
         Lambeth
         Lee
         Lewisham
         New Cross
         Newington
         Newington
          Nunhead
         0val
         Bellingham
         Peckham
         Rotherhithe
         Selhurst
         Bermondsey
         South Norwood
         Southend
         St Johns
         Surrey Quays
         Tulse Hill
          Tulse Hill
         Upper Norwood
         Walworth
         Blackheath
         West Norwood
         Brixton
         Brockley
         Camberwell
         Catford
         Chinbrook
In [72]: se_venues.shape
```

Out[72]: (4253, 7)

```
In [73]:
           len(se_venues)
Out[73]: 4253
In [74]:
           se_venues['Neighbourhood'].value_counts()
           se venues.to csv('se venues.csv')
In [75]:
           se_venues.head(5)
Out[75]:
                                               Neighbourhood
                               Neighbourhood
                                                                                 Venue
                                                                                            Venue
                                                                                                       Ve
               Neighbourhood
                                                                      Venue
                                      Latitude
                                                    Longitude
                                                                               Latitude
                                                                                        Longitude
                                                                                                     Categ
            0
                  Crofton Park
                                     51.46268
                                                      -0.03558
                                                                The Orchard
                                                                             51.463678
                                                                                         -0.035699
                                                                                                    Gastro
                                                                                                       Fis
                                                                  Brockley's
            1
                                     51.46268
                                                      -0.03558
                                                                              51.459457
                                                                                                        Cł
                  Crofton Park
                                                                                         -0.033868
                                                                       Rock
                                                                                                        S
                                                                  Browns Of
                                                                                                       Co
            2
                  Crofton Park
                                     51.46268
                                                      -0.03558
                                                                              51.464513
                                                                                         -0.037346
                                                                    Brockley
                                                                                                        S
            3
                  Crofton Park
                                     51.46268
                                                      -0.03558
                                                               Waterintobeer 51.463712
                                                                                         -0.038826
                                                                                                   Beer St
                                                                                                        Inc
                  Crofton Park
                                     51.46268
                                                      -0.03558
                                                                  Saka Maka 51.464826
            4
                                                                                         -0.036437
                                                                                                   Restauı
```

The number of venues returned for each neighbourhoods is then explored as follows:

In [76]: se_venues.groupby('Neighbourhood').count()

Out[76]:

	Neighbourhood Latitude	Neighbourhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
Neighbourhood						
Bankside	100	100	100	100	100	100
Bellingham	72	72	72	72	72	72
Bermondsey	100	100	100	100	100	100
Blackheath	93	93	93	93	93	93
Brixton	100	100	100	100	100	100
Brockley	100	100	100	100	100	100
Camberwell	100	100	100	100	100	100
Catford	72	72	72	72	72	72
Chinbrook	55	55	55	55	55	55
Crofton Park	100	100	100	100	100	100
Denmark Hill	100	100	100	100	100	100
Deptford	100	100	100	100	100	100
Dulwich	100	100	100	100	100	100
East Dulwich	69	69	69	69	69	69
Elephant and Castle	300	300	300	300	300	300
Forest Hill	100	100	100	100	100	100
Gipsy Hill	200	200	200	200	200	200
Grove Park	55	55	55	55	55	55
Herne Hill	100	100	100	100	100	100
Hither Green	100	100	100	100	100	100
Honor Oak	100	100	100	100	100	100
Ladywell	200	200	200	200	200	200
Lambeth	100	100	100	100	100	100
Lee	55	55	55	55	55	55
Lewisham	100	100	100	100	100	100
New Cross	100	100	100	100	100	100
Newington	200	200	200	200	200	200
Nunhead	100	100	100	100	100	100
Oval	100	100	100	100	100	100
Peckham	100	100	100	100	100	100
Rotherhithe	100	100	100	100	100	100
Selhurst	55	55	55	55	55	55
South Norwood	55	55	55	55	55	55

	Neighbourhood Latitude	Neighbourhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
Neighbourhood						
Southend	72	72	72	72	72	72
St Johns	100	100	100	100	100	100
Surrey Quays	100	100	100	100	100	100
Tulse Hill	200	200	200	200	200	200
Upper Norwood	100	100	100	100	100	100
Walworth	100	100	100	100	100	100
West Norwood	100	100	100	100	100	100

The next step is to check how many unique categories can be returned for the venues. See as follows:

```
In [77]: print('There are {} uniques categories.'.format(len(se_venues['Venue Category'
].unique())))
```

There are 198 uniques categories.

```
In [78]: se_venue_unique_count = se_venues['Venue Category'].value_counts().to_frame(na
    me='Count')
```

In [79]: se_venue_unique_count.head(5)

Out[79]:

	Count
Pub	420
Coffee Shop	310
Café	271
Park	208
Grocery Store	164

```
In [80]:
          se venue unique count.describe()
Out[80]:
                       Count
                  198.000000
            count
            mean
                   21.479798
              std
                   47.645978
             min
                    1.000000
             25%
                    4.000000
             50%
                    8.000000
             75%
                   17.750000
             max 420.000000
```

3.2 Clustering

For this section, the neighbourhoods in South East London will be clustered based on the processed data obtained above.

3.2.1 Libraries

To get started, all the necessary libraries have been called in the libraries section above.

3.2.2 Map Visualization

Using the geopy library, the latitude and longitude values of London is obtained.

```
In [81]: address = 'London, United Kingdom'

geolocator = Nominatim(user_agent="ln_explorer")
    location = geolocator.geocode(address)
    latitude = location.latitude
    longitude = location.longitude
    print('The geograpical coordinate of London are {}, {}.'.format(latitude, long itude))
```

The geograpical coordinate of London are 51.5073219, -0.1276474.

The folium library is then used to obtain the coordinates



The South East London neighbourhoods are then superimposed on top as shown below, still using the foliumlibrary. Please note due to the location of the South East Loondon, you might need to zoom to see the superimposed areas

```
In [83]:
         # Adding markers to map
          for lat, lng, borough, loc in zip(se_df['Latitude'],
                                             se df['Longitude'],
                                             se df['Borough'],
                                             se df['Location']):
              label = '{} - {}'.format(loc, borough)
              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).add to(map london)
         display(map london)
```



```
In [84]: type(se_df)
Out[84]: pandas.core.frame.DataFrame
```

3.2.3 Analysing Each Neighborhood

In this section, the objective is to check and explore the venues in each neighbourhood.

One Hot Encoding

```
In [85]: # one hot encoding
se_onehot = pd.get_dummies(se_venues[['Venue Category']], prefix = "", prefix_
sep = "")
```

Then the Neighbourhoodcolumn is added back to the dataframe.

```
In [86]: # add neighborhood column back to dataframe
    se_onehot['Neighbourhood'] = se_venues['Neighbourhood']
```

Some re-arrangement - move the new Neighbourhood column to the first column.

```
In [87]: # move neighborhood column to the first column
    fixed_columns = [se_onehot.columns[-1]] + list(se_onehot.columns[:-1])
    se_onehot = se_onehot[fixed_columns]
```

Therefore, the new one hot encoded dataframe is:

```
In [88]: se_onehot.head(5)
Out[88]:
```

	Neighbourhood	African Restaurant	American Restaurant	Antique Shop	Aquarium	Argentinian Restaurant	Art Gallery	Art Museum	C §
0	Crofton Park	0	0	0	0	0	0	0	
1	Crofton Park	0	0	0	0	0	0	0	
2	Crofton Park	0	0	0	0	0	0	0	
3	Crofton Park	0	0	0	0	0	0	0	
4	Crofton Park	0	0	0	0	0	0	0	

In [89]: se_onehot.loc[se_onehot['African Restaurant'] != 0]

Out[89]:

	Neighbourhood	African Restaurant	American Restaurant	Antique Shop	Aquarium	Argentinian Restaurant	Art Gallery	Art Museum
137	Denmark Hill	1	0	0	0	0	0	0
636	Elephant and Castle	1	0	0	0	0	0	0
714	Elephant and Castle	1	0	0	0	0	0	0
1012	Gipsy Hill	1	0	0	0	0	0	0
1375	Hither Green	1	0	0	0	0	0	0
1675	Ladywell	1	0	0	0	0	0	0
1930	Lewisham	1	0	0	0	0	0	0
2021	New Cross	1	0	0	0	0	0	0
2055	New Cross	1	0	0	0	0	0	0
2224	Newington	1	0	0	0	0	0	0
2311	Nunhead	1	0	0	0	0	0	0
2367	Nunhead	1	0	0	0	0	0	0
2446	Oval	1	0	0	0	0	0	0
2583	Peckham	1	0	0	0	0	0	0
2639	Peckham	1	0	0	0	0	0	0
2758	Selhurst	1	0	0	0	0	0	0
2913	South Norwood	1	0	0	0	0	0	0
3476	Upper Norwood	1	0	0	0	0	0	0
3578	Walworth	1	0	0	0	0	0	0
3863	Brixton	1	0	0	0	0	0	0
4063	Camberwell	1	0	0	0	0	0	0
4								+

In [90]: se_onehot.loc[se_onehot['Neighbourhood'] == 'Lewisham']

Out[90]:

	Neighbourhood	African Restaurant	American Restaurant	Antique Shop	Aquarium	Argentinian Restaurant	Art Gallery	Art Museum
1879	Lewisham	0	0	0	0	0	0	0
1880	Lewisham	0	0	0	0	0	0	0
1881	Lewisham	0	0	0	0	0	0	0
1882	Lewisham	0	0	0	0	0	0	0
1883	Lewisham	0	0	0	0	0	0	0
1884	Lewisham	0	0	0	0	0	0	0
1885	Lewisham	0	0	0	0	0	0	0
1886	Lewisham	0	0	0	0	0	0	0
1887	Lewisham	0	0	0	0	0	0	0
1888	Lewisham	0	0	0	0	0	0	0
1889	Lewisham	0	0	0	0	0	0	0
1890	Lewisham	0	0	0	0	0	0	0
1891	Lewisham	0	0	0	0	1	0	0
1892	Lewisham	0	0	0	0	0	0	0
1893	Lewisham	0	0	0	0	0	0	0
1894	Lewisham	0	0	0	0	0	0	0
1895	Lewisham	0	0	0	0	0	0	0
1896	Lewisham	0	0	0	0	0	0	0
1897	Lewisham	0	0	0	0	0	0	0
1898	Lewisham	0	0	0	0	0	0	0
1899	Lewisham	0	0	0	0	0	0	0
1900	Lewisham	0	0	0	0	0	0	0
1901	Lewisham	0	0	0	0	0	0	0
1902	Lewisham	0	0	0	0	0	0	0
1903	Lewisham	0	0	0	0	0	0	0
1904	Lewisham	0	0	0	0	0	0	0
1905	Lewisham	0	0	0	0	0	0	0
1906	Lewisham	0	0	0	0	0	0	0
1907	Lewisham	0	0	0	0	0	0	0
1908	Lewisham	0	0	0	0	0	0	0
1909	Lewisham	0	0	0	0	0	0	0
1910	Lewisham	0	0	0	0	0	0	0
1911	Lewisham	0	0	0	0	0	0	0
1912	Lewisham	0	0	0	0	0	0	0

	Neighbourhood	African Restaurant	American Restaurant	Antique Shop	Aquarium	Argentinian Restaurant	Art Gallery	Art Museum
1913	Lewisham	0	0	0	0	0	0	0
1914	Lewisham	0	0	0	0	0	0	0
1915	Lewisham	0	0	0	0	0	0	0
1916	Lewisham	0	0	0	0	0	0	0
1917	Lewisham	0	0	0	0	0	0	0
1918	Lewisham	0	0	0	0	0	0	0
1919	Lewisham	0	0	0	0	0	0	0
1920	Lewisham	0	0	0	0	0	0	0
1921	Lewisham	0	0	0	0	0	0	0
1922	Lewisham	0	0	0	0	0	0	0
1923	Lewisham	0	0	0	0	0	0	0
1924	Lewisham	0	0	0	0	0	0	0
1925	Lewisham	0	0	0	0	0	0	0
1926	Lewisham	0	0	0	0	0	0	0
1927	Lewisham	0	0	0	0	0	0	0
1928	Lewisham	0	0	0	0	0	0	0
1929	Lewisham	0	0	0	0	0	0	0
1930	Lewisham	1	0	0	0	0	0	0
1931	Lewisham	0	0	0	0	0	0	0
1932	Lewisham	0	0	0	0	0	0	0
1933	Lewisham	0	0	0	0	0	0	0
1934	Lewisham	0	0	0	0	0	0	0
1935	Lewisham	0	0	0	0	0	0	0
1936	Lewisham	0	0	0	0	0	0	0
1937	Lewisham	0	0	0	0	0	0	0
1938	Lewisham	0	0	0	0	0	0	0
1939	Lewisham	0	0	0	0	0	0	0
1940	Lewisham	0	0	0	0	0	0	0
1941	Lewisham	0	0	0	0	0	0	0
1942	Lewisham	0	0	0	0	0	0	0
1943	Lewisham	0	0	0	0	0	0	0
1944	Lewisham	0	0	0	0	0	0	0
1945	Lewisham	0	0	0	0	0	0	0
1946	Lewisham	0	0	0	0	0	0	0
1947	Lewisham	0	0	0	0	0	0	0

	Neighbourhood	African Restaurant	American Restaurant	Antique Shop	Aquarium	Argentinian Restaurant	Art Gallery	Art Museum
1948	Lewisham	0	0	0	0	0	0	0
1949	Lewisham	0	0	0	0	0	0	0
1950	Lewisham	0	0	0	0	0	0	0
1951	Lewisham	0	0	0	0	0	0	0
1952	Lewisham	0	0	0	0	0	0	0
1953	Lewisham	0	0	0	0	0	0	0
1954	Lewisham	0	0	0	0	0	0	0
1955	Lewisham	0	0	0	0	0	0	0
1956	Lewisham	0	0	0	0	0	0	0
1957	Lewisham	0	0	0	0	0	0	0
1958	Lewisham	0	0	0	0	0	0	0
1959	Lewisham	0	0	0	0	0	0	0
1960	Lewisham	0	0	0	0	0	0	0
1961	Lewisham	0	0	0	0	0	0	0
1962	Lewisham	0	0	0	0	0	0	0
1963	Lewisham	0	0	0	0	0	0	0
1964	Lewisham	0	0	0	0	0	0	0
1965	Lewisham	0	0	0	0	0	0	0
1966	Lewisham	0	0	0	0	0	0	0
1967	Lewisham	0	0	0	0	0	0	0
1968	Lewisham	0	0	0	0	0	0	0
1969	Lewisham	0	0	0	0	0	0	0
1970	Lewisham	0	0	0	0	0	0	0
1971	Lewisham	0	0	0	0	0	0	0
1972	Lewisham	0	0	0	0	0	0	0
1973	Lewisham	0	0	0	0	0	0	0
1974	Lewisham	0	0	0	0	0	0	0
1975	Lewisham	0	0	0	0	0	0	0
1976	Lewisham	0	0	0	0	0	0	0
1977	Lewisham	0	0	0	0	0	0	0
1978	Lewisham	0	0	0	0	0	0	0
4								•

As can be seen from above, Lewisham with its demography has no African restaurants within the top spots.

```
In [91]: se_onehot.to_csv('selondon_onehot.csv', index = False)
```

The new dataframe size is given below

```
In [92]: se_onehot.shape
Out[92]: (4253, 199)
```

Regrouping and Category Statistics

```
se grouped = se onehot.groupby('Neighbourhood').mean().reset index()
           se grouped.head()
Out[93]:
                                 African
                                          American
                                                    Antique
                                                                       Argentinian
                                                                                       Art
                                                                                                Art
              Neighbourhood
                                                             Aquarium
                              Restaurant
                                         Restaurant
                                                       Shop
                                                                        Restaurant
                                                                                  Gallery
                                                                                           Museum
                                                                                                    C
                                                                                                     S
           0
                    Bankside
                                    0.00
                                           0.000000
                                                         0.0
                                                                   0.0
                                                                          0.010000
                                                                                      0.01
                                                                                               0.03
            1
                  Bellingham
                                           0.000000
                                                                   0.0
                                                                          0.000000
                                                                                      0.00
                                                                                               0.00
                                    0.00
                                                         0.0
                 Bermondsey
           2
                                    0.00
                                           0.000000
                                                         0.0
                                                                   0.0
                                                                          0.010000
                                                                                      0.01
                                                                                               0.03
           3
                                                                                               0.00
                  Blackheath
                                    0.00
                                           0.010753
                                                                   0.0
                                                                          0.010753
                                                                                      0.00
                                                         0.0
            4
                      Brixton
                                    0.01
                                           0.000000
                                                         0.0
                                                                   0.0
                                                                          0.000000
                                                                                      0.01
                                                                                               0.00
In [94]:
           print("Before One-hot encoding:", se_df.shape)
           print("After One-hot encoding:", se grouped.shape)
           Before One-hot encoding: (46, 5)
           After One-hot encoding: (40, 199)
In [95]:
           se grouped.to csv('london grouped.csv', index = False)
```

Grouping of each Neighbourhoods with 10 common venues:

```
In [96]: num_top_venues = 10 # Top common venues needed

for hood in se_grouped['Neighbourhood']:
    print("----"+hood+"----")
    temp = se_grouped[se_grouped['Neighbourhood'] == hood].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)
    .head(num_top_venues))
    print('\n')
```

----Bankside----

venue freq Coffee Shop 0.08 1 Hotel 0.06 2 Pub 0.05 3 Italian Restaurant 0.05 4 **Theater** 0.04 5 Cocktail Bar 0.04 6 **Seafood Restaurant** 0.03 7 Tapas Restaurant 0.03 8 Restaurant 0.03 9 Art Museum 0.03

----Bellingham----

venue freq 0 **Grocery Store** 0.14 1 Park 0.08 2 Supermarket 0.07 3 Café 0.06 4 Coffee Shop 0.06 5 Pub 0.06 Italian Restaurant 6 0.04 7 Fast Food Restaurant 0.04 8 Fried Chicken Joint 0.03 9 Gas Station 0.03

----Bermondsey----

venue freq 0 Coffee Shop 0.08 1 Hotel 0.06 2 0.05 Pub 3 Italian Restaurant 0.05 4 Theater 0.04 5 Cocktail Bar 0.04 0.03 6 Seafood Restaurant 7 Tapas Restaurant 0.03 8 0.03 Restaurant 9 Art Museum 0.03

----Blackheath----

venue freq 0 Pub 0.13 1 **Grocery Store** 0.08 2 Coffee Shop 0.06 Park 3 0.05 4 Clothing Store 0.04 5 Bakery 0.03 6 Garden 0.03 7 Café 0.03 8 Italian Restaurant 0.03 9 Supermarket 0.02

```
venue freq
0
                        Café
                              0.09
1
                              0.07
                 Coffee Shop
2
                        Park
                              0.06
3
                         Pub
                              0.05
4
                Cocktail Bar
                              0.04
          Italian Restaurant
5
                              0.04
6
  Middle Eastern Restaurant 0.04
7
           Indian Restaurant
                              0.03
8
               Grocery Store 0.03
9
                         Bar
                              0.03
----Brockley----
                  venue
                         freq
            Coffee Shop
                         0.13
1
                    Pub
                         0.12
2
                   Café
                         0.07
3
                   Park
                        0.06
              Gastropub
                         0.04
5
                    Bar
                         0.04
6
           Cocktail Bar
                         0.03
7
      Indian Restaurant 0.03
8
     Italian Restaurant 0.03
  Gym / Fitness Center 0.02
----Camberwell----
                       venue freq
0
                        Café 0.09
1
                 Coffee Shop
                              0.07
2
                        Park 0.06
3
                         Pub
                              0.05
4
                Cocktail Bar
                              0.04
5
          Italian Restaurant 0.04
6
   Middle Eastern Restaurant
                              0.04
7
           Indian Restaurant 0.03
8
               Grocery Store
                             0.03
9
                         Bar
                              0.03
----Catford----
                  venue
                        freq
          Grocery Store
                         0.14
1
                         0.08
                   Park
2
            Supermarket
                        0.07
3
                   Café
                         0.06
4
            Coffee Shop
                         0.06
5
                    Pub
                         0.06
6
     Italian Restaurant
                         0.04
7
  Fast Food Restaurant
                         0.04
8
    Fried Chicken Joint
                         0.03
```

----Chinbrook----

9

venue freq

Gas Station 0.03

```
0
          Grocery Store 0.15
1
                    Pub
                         0.13
2
                   Park
                         0.09
3
                   Café
                         0.07
4
  Gym / Fitness Center
                         0.05
5
            Coffee Shop
                         0.05
6
      Indian Restaurant
                         0.05
7
     Italian Restaurant 0.05
8
  Fast Food Restaurant
                         0.04
9
            Supermarket
                         0.04
----Crofton Park----
                  venue
                         freq
0
            Coffee Shop
                         0.13
1
                    Pub
                         0.12
2
                   Café
                         0.07
3
                   Park
                         0.06
4
              Gastropub
                         0.04
5
                    Bar
                         0.04
6
           Cocktail Bar
                         0.03
7
      Indian Restaurant
                         0.03
8
     Italian Restaurant
                        0.03
  Gym / Fitness Center
                         0.02
----Denmark Hill----
                       venue freq
0
                        Café
                              0.09
1
                 Coffee Shop
                              0.07
2
                        Park 0.06
3
                         Pub 0.05
4
                Cocktail Bar
                              0.04
5
          Italian Restaurant
                              0.04
6
   Middle Eastern Restaurant
                              0.04
7
           Indian Restaurant
                              0.03
8
               Grocery Store
                              0.03
9
                         Bar
                              0.03
----Deptford----
            venue freq
0
              Pub 0.12
1
      Coffee Shop
                   0.06
2
             Café
                   0.06
3
             Park
                   0.04
4
                   0.04
              Bar
5
           Garden
                   0.03
6
            Trail
                   0.02
7
           Market
                   0.02
8
   Sandwich Place 0.02
9
    Grocery Store
                   0.02
----Dulwich----
                  venue
                        freq
```

Pub 0.14

```
1
                   Café 0.07
2
          Grocery Store
                        0.07
3
                   Park
                        0.06
            Coffee Shop
4
                        0.06
5
                 Bakery
                         0.06
6
            Pizza Place
                         0.03
7
                Brewery
                         0.03
8
   Gym / Fitness Center
                         0.03
9
         Farmers Market 0.03
----East Dulwich----
                      venue freq
0
                        Pub
                             0.12
1
                       Café
                             0.09
2
                Pizza Place
                             0.07
3
                Coffee Shop
                             0.07
4
                       Park
                             0.06
5
         Italian Restaurant
                             0.06
6
                  Gastropub
                             0.04
7
                   Platform
                             0.03
8
                             0.03
                     Forest
9
  Mediterranean Restaurant
                             0.03
----Elephant and Castle----
                venue
                       frea
0
                       0.08
                 Café
1
                  Pub
                       0.07
2
          Coffee Shop
                       0.07
3
                Hotel
                       0.05
4
              Theater
                       0.04
5
   Italian Restaurant
                       0.04
6
                       0.03
                 Park
7
           Restaurant 0.02
8
          Pizza Place 0.02
9
     Tapas Restaurant 0.02
----Forest Hill----
                  venue freq
0
                    Pub 0.15
1
          Grocery Store
                        0.07
2
            Coffee Shop
                         0.07
3
                   Café
                         0.06
4
                   Park
                        0.05
5
   Gym / Fitness Center
                         0.03
6
            Supermarket
                        0.03
7
              Gastropub
                         0.02
8
                 Forest 0.02
9
      Fish & Chips Shop 0.02
----Gipsy Hill----
                venue freq
```

```
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```

Coffee Shop

Pub

0.12

0.08

0

1

```
2
       Grocery Store 0.06
3
                 Park
                      0.06
4
                 Café 0.06
5
              Bakery
                      0.05
6
  Italian Restaurant 0.04
7
       Movie Theater 0.02
8
      Sandwich Place 0.02
9
          Pizza Place 0.02
----Grove Park----
                  venue freq
0
         Grocery Store 0.15
1
                    Pub 0.13
2
                  Park 0.09
3
                  Café
                        0.07
4
  Gym / Fitness Center
                        0.05
5
           Coffee Shop 0.05
6
     Indian Restaurant 0.05
7
    Italian Restaurant 0.05
8
  Fast Food Restaurant 0.04
           Supermarket 0.04
----Herne Hill----
                  venue frea
0
           Coffee Shop 0.10
1
                   Pub 0.06
2
                  Café 0.05
3
                Market 0.04
4
           Cocktail Bar
                       0.04
5
           Pizza Place 0.04
6
                  Park 0.03
7
  Gym / Fitness Center 0.03
8
                Brewery
                        0.03
9
            Restaurant 0.03
----Hither Green----
              venue freq
0
                 Pub 0.13
                Café 0.08
1
2
          Gastropub 0.06
3
                Park 0.05
4
             Garden 0.04
5
  Fish & Chips Shop
                     0.03
6
         Food Truck 0.03
7
        Coffee Shop 0.03
```

----Honor Oak----

8

9

	venue	freq
0	Pub	0.15
1	Grocery Store	0.07
2	Coffee Shop	0.07

Restaurant 0.03

Farmers Market 0.02

```
3
                   Café 0.06
4
                   Park
                         0.05
5
   Gym / Fitness Center
                         0.03
6
            Supermarket
                         0.03
7
              Gastropub
                         0.02
8
                 Forest 0.02
9
      Fish & Chips Shop 0.02
----Ladywell----
                  venue
                         freq
0
                    Pub
                         0.12
1
            Coffee Shop
                         0.08
2
                   Café
                         0.08
3
                   Park
                         0.06
4
              Gastropub
                         0.05
5
                    Bar
                         0.03
6
    Indie Movie Theater
                         0.02
7
   Gym / Fitness Center
                         0.02
8
           Cocktail Bar
                         0.02
9
             Food Truck 0.02
----Lambeth----
                venue freq
0
          Coffee Shop
                       0.08
1
                Hotel
                       0.06
2
                  Pub
                       0.05
3
  Italian Restaurant
                      0.05
4
              Theater
                       0.04
5
         Cocktail Bar
                       0.04
6
  Seafood Restaurant 0.03
7
     Tapas Restaurant
                       0.03
8
           Restaurant 0.03
9
           Art Museum 0.03
----Lee----
                  venue
                         freq
0
          Grocery Store
                         0.15
1
                    Pub
                         0.13
2
                   Park
                        0.09
3
                   Café
                         0.07
4
  Gym / Fitness Center
                         0.05
5
            Coffee Shop
                         0.05
6
      Indian Restaurant
                         0.05
7
     Italian Restaurant
                        0.05
  Fast Food Restaurant
8
                        0.04
9
            Supermarket 0.04
----Lewisham----
               venue freq
0
                 Pub
                      0.13
1
                Café 0.08
2
           Gastropub
                      0.06
```

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Park 0.05

3

```
4 Garden 0.04
5 Fish & Chips Shop 0.03
6 Food Truck 0.03
7 Coffee Shop 0.03
8 Restaurant 0.03
9 Farmers Market 0.02
```

----New Cross----

```
venue frea
                      0.12
                  Pub
1
         Coffee Shop
                      0.08
2
                Café 0.07
3
  Italian Restaurant 0.04
4
                 Bar
                      0.04
5
           Gastropub 0.03
6
             Brewery 0.03
7
   Indian Restaurant 0.03
8
                Park 0.03
9
         Pizza Place 0.02
```

----Newington----

```
venue freq
0
            Coffee Shop 0.08
1
                    Pub
                        0.07
2
                   Café 0.06
3
                Theater
                         0.04
4
     Italian Restaurant 0.04
5
                  Hotel 0.04
6
           Cocktail Bar
                         0.03
7
           Burger Joint 0.02
8
                Brewery 0.02
  Street Food Gathering 0.02
```

----Nunhead----

	venue	freq
0	Pub	0.11
1	Café	0.07
2	Pizza Place	0.05
3	Coffee Shop	0.05
4	Park	0.05
5	Bar	0.04
6	Gastropub	0.03
7	Cocktail Bar	0.03
8	Italian Restaurant	0.03
9	Burger Joint	0.03

----Oval----

	venue	freq
0	Café	0.13
1	Pub	0.08
2	Hotel	0.06
3	Park	0.05
4	Coffee Shop	0.04

```
5 Theater 0.04
6 Bar 0.02
7 Street Food Gathering 0.02
8 Sandwich Place 0.02
9 Garden 0.02
```

----Peckham----

```
venue freq
0
                 Pub 0.11
1
                Café 0.07
2
         Pizza Place 0.05
3
         Coffee Shop 0.05
4
                Park 0.05
5
                 Bar 0.04
6
           Gastropub 0.03
7
        Cocktail Bar 0.03
8
  Italian Restaurant 0.03
        Burger Joint 0.03
```

----Rotherhithe----

	venue	freq
0	Pub	0.10
1	Brewery	0.08
2	Coffee Shop	0.06
3	Park	0.06
4	Bar	0.05
5	Café	0.04
6	Food Truck	0.03
7	Beer Bar	0.03
8	Vietnamese Restaurant	0.03
9	Supermarket	0.02

----Selhurst----

```
venue freq
                   Pub 0.11
                  Park 0.09
1
2
         Grocery Store
                        0.09
3
           Supermarket 0.07
4
              Platform 0.05
5
                  Café 0.05
6
           Coffee Shop 0.05
7
          Tram Station 0.04
8
    African Restaurant 0.02
  Gym / Fitness Center 0.02
```

----South Norwood----

	venue	freq
0	Pub	0.11
1	Park	0.09
2	Grocery Store	0.09
3	Supermarket	0.07
4	Platform	0.05
5	Café	0.05

```
Coffee Shop 0.05
6
7
           Tram Station
                          0.04
8
     African Restaurant
                          0.02
   Gym / Fitness Center
                          0.02
---Southend----
                          frea
                   venue
          Grocery Store
                          0.14
1
                    Park
                          0.08
2
            Supermarket
                          0.07
3
                    Café
                          0.06
4
            Coffee Shop
                          0.06
5
                     Pub
                          0.06
6
     Italian Restaurant
                          0.04
7
   Fast Food Restaurant
                          0.04
    Fried Chicken Joint
8
                         0.03
9
            Gas Station 0.03
----St Johns----
                   venue
                          freq
0
            Coffee Shop
                          0.13
1
                     Pub
                          0.12
2
                    Café
                          0.07
3
                    Park
                          0.06
4
              Gastropub
                          0.04
5
                     Bar
                          0.04
           Cocktail Bar
6
                          0.03
7
      Indian Restaurant
                          0.03
8
     Italian Restaurant
                          0.03
   Gym / Fitness Center
                          0.02
----Surrey Quays----
                    venue freq
0
                      Pub
                           0.10
1
                  Brewery
                           0.08
2
             Coffee Shop
                           0.06
3
                     Park
                           0.06
4
                           0.05
                      Bar
5
                     Café
                          0.04
6
              Food Truck
                           0.03
7
                Beer Bar
                           0.03
8
   Vietnamese Restaurant
                           0.03
9
             Supermarket 0.02
----Tulse Hill----
                   venue
                          freq
0
                          0.10
                     Pub
1
            Coffee Shop
                          0.10
2
                    Café
                          0.06
3
          Grocery Store
                          0.05
```

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Pizza Place 0.04

Bakery

Park

0.04

0.04

4

5

6

```
7
  Gym / Fitness Center 0.03
8
                 Market 0.02
9
                Brewery 0.02
----Upper Norwood----
                venue
                      freq
0
                  Pub
                      0.12
1
                 Park 0.07
2
          Coffee Shop 0.06
3
                 Café
                      0.05
4
  Italian Restaurant 0.05
5
              Bakery
                      0.05
6
       Train Station
                      0.04
7
       Grocery Store 0.03
8
            Gastropub 0.03
9
                 Lake 0.02
----Walworth----
                venue freq
0
                 Café 0.10
1
          Coffee Shop 0.09
2
                  Pub 0.09
3
                 Park 0.04
   Italian Restaurant 0.04
5
         Art Gallery
6
              Theater
                      0.03
7
              Brewery 0.03
8
          Pizza Place 0.03
9
              Gay Bar 0.02
----West Norwood----
                  venue freq
0
                    Pub
                        0.13
1
         Grocery Store 0.10
2
            Coffee Shop
                         0.09
3
                   Café 0.06
4
                 Bakery
                         0.05
5
                   Park 0.04
           Pizza Place 0.03
6
               Pharmacy
7
                         0.03
```

Creating new dataframe:

8

9

Putting the common venues into pandas dataframe, the following return_most_common_venues is used to sort the venues in descending order.

0.03

Gym / Fitness Center

Italian Restaurant 0.02

```
In [97]: 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]
```

Then we create a new panda dataframe with 10 most common venues as shown below:

```
In [98]: | num_top_venues = 10
         indicators = ['st', 'nd', 'rd']
         # create columns according to number of top venues
         columns = ['Neighbourhood']
         for ind in np.arange(num top venues):
              try:
                 columns.append('{}} Most Common Venue'.format(ind+1, indicators[ind
         1))
              except:
                 columns.append('{}th Most Common Venue'.format(ind+1))
         # create a new dataframe
         neighbourhoods venues sorted = pd.DataFrame(columns=columns)
         neighbourhoods venues sorted['Neighbourhood'] = se grouped['Neighbourhood']
         for ind in np.arange(se_grouped.shape[0]):
              neighbourhoods venues sorted.iloc[ind, 1:] = return most common venues(se
         grouped.iloc[ind, :], num top venues)
```

neighbourhoods venues sorted.head() In [99]:

Out[99]:

Neighbourhood	1st Most Common Venue	2nd Most Common Venue	3rd Most Common Venue	4th Most Common Venue	5th Most Common Venue	6th Most Common Venue	7th N Comı Ve
Bankside	Coffee Shop	Hotel	Pub	Italian Restaurant	Theater	Cocktail Bar	Sc Lool
Bellingham	Grocery Store	Park	Supermarket	Café	Pub	Coffee Shop	lta Restau
Bermondsey	Coffee Shop	Hotel	Pub	Italian Restaurant	Theater	Cocktail Bar	Sc Lool
Blackheath	Pub	Grocery Store	Coffee Shop	Park	Clothing Store	Italian Restaurant	(
Brixton	Café	Coffee Shop	Park	Pub	Italian Restaurant	Cocktail Bar	Mi Eas Restau
	Bankside Bellingham Bermondsey Blackheath	Neighbourhood Common Venue Bankside Coffee Shop Bellingham Grocery Store Bermondsey Coffee Shop Blackheath Pub	Neighbourhood Common Venue Bankside Coffee Shop Hotel Bellingham Grocery Store Bermondsey Coffee Shop Hotel Bankside Coffee Shop Grocery Store Brixton Café Coffee Coffee	Neighbourhood 1st Most Common Venue Most Common Venue 3rd Most Common Venue Bankside Coffee Shop Hotel Pub Bellingham Grocery Store Park Supermarket Bermondsey Coffee Shop Hotel Pub Blackheath Pub Grocery Store Coffee Shop Brixton Café Coffee Park	Neighbourhood1st Most Common VenueMost Common Venue3rd Most Common Venue4th Most Common VenueBanksideCoffee ShopHotelPubItalian RestaurantBellinghamGrocery StoreParkSupermarketCaféBermondseyCoffee ShopHotelPubItalian RestaurantBlackheathPubGrocery StoreCoffee ShopParkBrixtonCaféCoffeeParkPub	Neighbourhood1st Most Common VenueMost Common Venue3rd Most Common Venue4th Most Common Venue5th Most Common VenueBanksideCoffee ShopHotelPubItalian RestaurantTheaterBellinghamGrocery StoreParkSupermarketCaféPubBermondseyCoffee ShopHotelPubItalian RestaurantTheaterBlackheathPubGrocery StoreCoffee ShopParkClothing StoreBrixtonCaféCoffeeParkPubItalian	Neighbourhood1st Most Common VenueMost Common Venue3rd Most Common Venue4th Most Common Venue5th Most Common Venue6th Most Common VenueBanksideCoffee ShopHotel ShopPubItalian RestaurantTheaterCocktail BarBellinghamGrocery StorePark SupermarketCaféPubCoffee ShopBermondseyCoffee ShopHotel Pub RestaurantTheater Cocktail BarBlackheathPubGrocery StoreCoffee Shop ParkClothing StoreItalian RestaurantBrixtonCaféCoffee Coffee ParkPubItalian Cocktail

```
In [100]:
          neighbourhoods_venues_sorted.to_csv('neighbourhoods_venues_sorted.csv', index
          = False)
```

```
In [101]: se_grouped_clustering = se_grouped.drop('Neighbourhood', 1)
```

3.2.4 Clustering of Neighbourhoods

Now creating a new dataframe that includes the clusters as well as the top 10 venues for each neighbourhoods

```
In [104]: # add clustering labels
           neighbourhoods_venues_sorted.insert(0, 'Cluster Labels', kmeans.labels_)
In [105]:
           se merged = se df
In [106]:
           se merged.head(3)
Out[106]:
                 Location
                           Borough Postcode
                                             Latitude Longitude
           0 Crofton Park Lewisham
                                        SE4 51.46268
                                                       -0.03558
              Denmark Hill Southwark
                                        SE5 51.47480
                                                       -0.09313
           2
                 Deptford Lewisham
                                        SE8 51.48114
                                                       -0.02467
In [107]: # match/merge SE London data with latitude/longitude for each neighborhood
           se merged latlong = se merged.join(neighbourhoods venues sorted.set index('Nei
           ghbourhood'), on = 'Location')
```

```
In [108]:
            se merged latlong.head(5)
Out[108]:
                                                                                             2nd
                                                                              1st Most
                                                                                                  3rd Most
                                                                      Cluster
                                                                                            Most
                 Location
                            Borough
                                      Postcode
                                                 Latitude Longitude
                                                                              Common
                                                                                                  Common
                                                                                        Common
                                                                      Labels
                                                                                 Venue
                                                                                                     Venue
                                                                                           Venue
                  Crofton
                                                                                Coffee
             0
                                                                           3
                           Lewisham
                                           SE4
                                                51.46268
                                                            -0.03558
                                                                                             Pub
                                                                                                      Café
                    Park
                                                                                 Shop
                                                                                          Coffee
                Denmark
                           Southwark
                                           SE5
                                                51.47480
                                                            -0.09313
                                                                           1
                                                                                  Café
                                                                                                      Park
                      Hill
                                                                                           Shop
                                                                                                    Coffee
                 Deptford
                           Lewisham
                                           SE8
                                                51.48114
                                                            -0.02467
                                                                           3
                                                                                  Pub
                                                                                            Café
                                                                                                      Shop
                                                                                         Grocery
                          Southwark
                                                                                  Pub
             3
                 Dulwich
                                          SE21
                                                51.44100
                                                            -0.08897
                                                                                                      Café
                                                                                           Store
                                                                                                    Coffee
                     East
                           Southwark
                                          SE22 51.45256
                                                            -0.07076
                                                                           1
                                                                                  Pub
                                                                                            Café
                 Dulwich
                                                                                                     Shop
In [109]:
            se clusters = se merged latlong
```

Please note, that the number of clusters was chosen as 5 for initial run.

3.2.5 Optimal Number of Clusters for K-mean

To get the optimal number of clusters to be used for the K-mean, there are a number ways possible for the evaluation. Therefore, in this task, the following are used:

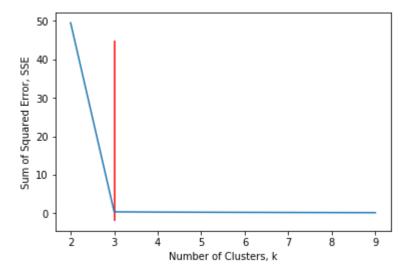
1. Elbow (Criterion) Method 2. Silhouette Coefficient

1. Elbow Method

The elbow method is used to solve the problem of selecting k. Interestingly, the elbow method is not perfect either but it gives significant insight that is perhaps not top optimal but sub-optimal to choosing the optimal number of clusters by fitting the model with a range of values for k.

The approach for this is to run the k-means clustering for a range of value k and for each value of k, the Sum of the Squared Errors (SSE) is calculated., calculate sum of squared errors (SSE). When this is done, a plot of k and the corresponding SSEs are then made. At the elbow (just like arm), that is where the optimal value of k is. And that will be the number of clusters to be used. The whole idea is to have minimum SSE.

```
In [112]:
          %matplotlib inline
           import matplotlib
           import numpy as np
In [113]:
          from sklearn.cluster import KMeans
           import matplotlib.pyplot as plt
           # SSE is initialize with empty values
           # n clusters is the "k"
           sse = \{\}
          for n cluster1 in range(2, 10):
               kmeans1 = KMeans(n_clusters = n_cluster1, max_iter = 500).fit(se_grouped_c
               se_grouped_clustering["clusters"] = kmeans1.labels_
              # The inertia is the sum of distances of samples to their closest cluster
           centre
               sse[n cluster1] = kmeans1.inertia
           plt.figure()
          plt.plot(list(sse.keys()), list(sse.values()))
          plt.xlabel("Number of Clusters, k")
           plt.ylabel("Sum of Squared Error, SSE")
           # vertical line
          plt.vlines(3, ymin = -2, ymax = 45, colors = 'red')
           plt.show()
```



Depending on the number of iteration (in this case, 500 iterations were used), the number of cluster, k is 3.

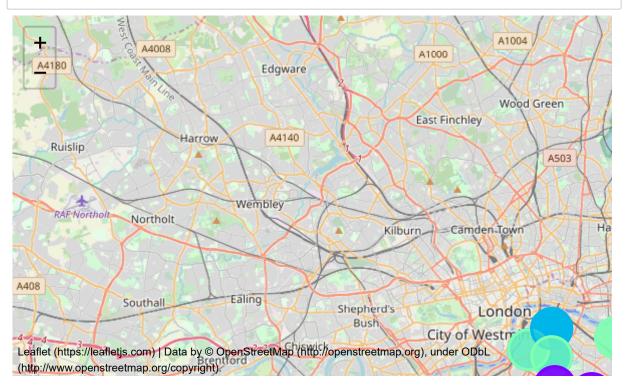
2. Silhouette Coefficient

To find the optimal value of the number of clusters, k, the number of clusters is iterated corresponding Silhouette Coefficientis calculated for each of the k-values used. The highest Silhouette Coefficient gives the best match to its own cluster. Please see below:

```
from sklearn.metrics import silhouette score
from sklearn.cluster import KMeans
for n cluster2 in range(2, 10):
    kmeans2 = KMeans(n clusters = n cluster2, random state = 0).fit(se grouped
clustering)
    label2 = kmeans2.labels
    sil coeff = silhouette score(se grouped clustering, label2, metric = 'eucl
idean')
    print("Where n_clusters = {}, the Silhouette Coefficient is {}".format(n_c
luster2, sil coeff))
Where n_clusters = 2, the Silhouette Coefficient is 0.6228086343684874
Where n clusters = 3, the Silhouette Coefficient is 0.6618454787413641
Where n clusters = 4, the Silhouette Coefficient is 0.6520826202080521
Where n_clusters = 5, the Silhouette Coefficient is 0.6854128867290191
Where n clusters = 6, the Silhouette Coefficient is 0.7271608400634918
Where n clusters = 7, the Silhouette Coefficient is 0.837002499689455
Where n_clusters = 8, the Silhouette Coefficient is 0.8691040323314135
Where n clusters = 9, the Silhouette Coefficient is 0.9324981511688628
```

From the result, the high the n_clusters the better the silhouette coefficient. For this project, a cluster value of 5 will be used.

```
In [116]:
          # create map
           map clusters = folium.Map(location=[latitude, longitude], zoom start=11)
           # 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(se_clusters['Latitude'], se_clusters['Longit
           ude'], se_clusters['Location'], se_clusters['Cluster Labels']):
               label = folium.Popup(str(poi) + ' Cluster ' + str(cluster), parse_html=Tru
           e)
               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 clusters)
           display(map_clusters)
```



Out[117]:

	6th Most Common Venue	5th Most Common Venue	4th Most Common Venue	3rd Most Common Venue	2nd Most Common Venue	1st Most Common Venue	Cluster Labels	Borough	
	Italian Restaurant	Coffee Shop	Café	Park	Pub	Grocery Store	0	Lewisham	12
	Italian Restaurant	Coffee Shop	Café	Park	Pub	Grocery Store	0	Lewisham	19
R	Coffee Shop	Pub	Café	Supermarket	Park	Grocery Store	0	Lewisham	26
	Café	Coffee Shop	Supermarket	Park	Grocery Store	Pub	0	Croydon	29
	Café	Coffee Shop	Supermarket	Park	Grocery Store	Pub	0	Croydon	31
R	Coffee Shop	Pub	Café	Supermarket	Park	Grocery Store	0	Lewisham	32
R	Coffee Shop	Pub	Café	Supermarket	Park	Grocery Store	0	Lewisham	44
	Italian Restaurant	Coffee Shop	Café	Park	Pub	Grocery Store	0	Lewisham	45
•									4

Out[118]:

	Borough	Cluster Labels	1st Most Common Venue	2nd Most Common Venue	3rd Most Common Venue	4th Most Common Venue	5th Most Common Venue	6th Most Common Venue	7th N Comı Ve
1	Southwark	1	Café	Coffee Shop	Park	Pub	Italian Restaurant	Cocktail Bar	Mi Eas Restau
4	Southwark	1	Pub	Café	Coffee Shop	Pizza Place	Park	Italian Restaurant	Gastro
13	Lambeth	1	Coffee Shop	Pub	Café	Cocktail Bar	Market	Pizza Place	Restau
24	Southwark	1	Pub	Café	Coffee Shop	Pizza Place	Park	Bar	lta Restau
27	Southwark	1	Pub	Café	Coffee Shop	Pizza Place	Park	Bar	lta Restau
41	Lambeth	1	Café	Coffee Shop	Park	Pub	Italian Restaurant	Cocktail Bar	Mi Eas Restau
43	Southwark	1	Café	Coffee Shop	Park	Pub	Italian Restaurant	Cocktail Bar	Mi Eas Restau
4									•

Out[119]:

7th Mo Commo Ven	6th Most Common Venue	5th Most Common Venue	4th Most Common Venue	3rd Most Common Venue	2nd Most Common Venue	1st Most Common Venue	Cluster Labels	Borough	
Pa	Italian Restaurant	Theater	Hotel	Coffee Shop	Pub	Café	2	Southwark	5
Pa	Italian Restaurant	Theater	Hotel	Coffee Shop	Pub	Café	2	Southwark	6
Pa	Italian Restaurant	Theater	Hotel	Coffee Shop	Pub	Café	2	Southwark	7
Scen Looko	Cocktail Bar	Theater	Italian Restaurant	Pub	Hotel	Coffee Shop	2	Southwark	8
Scen Looko	Cocktail Bar	Theater	Italian Restaurant	Pub	Hotel	Coffee Shop	2	Lambeth	18
Cockt B	Theater	Hotel	Italian Restaurant	Café	Pub	Coffee Shop	2	Southwark	22
Cockt B	Theater	Hotel	Italian Restaurant	Café	Pub	Coffee Shop	2	Southwark	23
Scen Looko	Cocktail Bar	Theater	Italian Restaurant	Pub	Hotel	Coffee Shop	2	Southwark	30
•									4

Out[120]:

7th M Comn Ve	6th Most Common Venue	5th Most Common Venue	4th Most Common Venue	3rd Most Common Venue	2nd Most Common Venue	1st Most Common Venue	Cluster Labels	Borough	
Cock	Bar	Gastropub	Park	Café	Pub	Coffee Shop	3	Lewisham	0
In Mc Thea	Garden	Park	Bar	Coffee Shop	Café	Pub	3	Lewisham	2
Fis Ch SI	Food Truck	Garden	Park	Gastropub	Café	Pub	3	Lewisham	14
Fo Tr	Bar	Gastropub	Park	Café	Coffee Shop	Pub	3	Lewisham	16
F¢ Tr	Bar	Gastropub	Park	Café	Coffee Shop	Pub	3	Lewisham	17
Fis Ch SI	Food Truck	Garden	Park	Gastropub	Café	Pub	3	Lewisham	20
Gastro	Brewery	Italian Restaurant	Bar	Café	Coffee Shop	Pub	3	Lewisham	21
Gay	Coffee Shop	Theater	Park	Hotel	Pub	Café	3	Lambeth	25
Fo Tr	Café	Bar	Coffee Shop	Park	Brewery	Pub	3	Southwark	28
Cock	Bar	Gastropub	Park	Café	Pub	Coffee Shop	3	Lewisham	33
F¢ Tr	Café	Bar	Coffee Shop	Park	Brewery	Pub	3	Southwark	34
Gall	Pizza Place	Italian Restaurant	Park	Pub	Coffee Shop	Café	3	Southwark	38
Cock	Bar	Gastropub	Park	Café	Pub	Coffee Shop	3	Lewisham	42
•									4

Out[121]:

	Borough	Cluster Labels	1st Most Common Venue	2nd Most Common Venue	3rd Most Common Venue	4th Most Common Venue	5th Most Common Venue	6th Most Common Venue	7th Co ₁
3	Southwark	4	Pub	Grocery Store	Café	Coffee Shop	Bakery	Park	F (
9	Lewisham	4	Pub	Grocery Store	Coffee Shop	Café	Park	Gym / Fitness Center	Supern
10	Lambeth	4	Pub	Coffee Shop	Grocery Store	Café	Park	Bakery	Resta
11	Lambeth	4	Pub	Coffee Shop	Grocery Store	Café	Park	Bakery	Resta
15	Lewisham	4	Pub	Grocery Store	Coffee Shop	Café	Park	Gym / Fitness Center	Supern
35	Lambeth	4	Coffee Shop	Pub	Café	Grocery Store	Pizza Place	Park	E
36	Lambeth	4	Coffee Shop	Pub	Café	Grocery Store	Pizza Place	Park	E
37	Croydon	4	Pub	Park	Coffee Shop	Italian Restaurant	Café	Bakery	Train S
39	Lewisham	4	Pub	Grocery Store	Coffee Shop	Park	Clothing Store	Italian Restaurant	
40	Lambeth	4	Pub	Grocery Store	Coffee Shop	Café	Bakery	Park	F (
4									•

4. Result

The following are the highlights of the 5 clusters above:

- 1. Pubs, Cafe, Coffee Shops are popular in the South East London.
- 2. As for restaurants, the Italian Restaurants are very popular in the South East London area. Especially in Southwark and Lambeth areas.
- 3. With the Lewisham area being the most condensed area of Africans in the South East Area, it is surprising to see how in the top 10 venues, you can barely see restaurants in the top 5 venues.
- 4. Although, the Clusters have variations, a very visible presence is the predominance of pubs.

5. Discussion and Conclusion

It is very important to note that Clusters 2 and 3 are the most viable clusters to create a brand African Restaurant. Their proximity to other amenities and accessibility to station are paramount. These 2 clusters do not have top restaurants that could rival their standards if they are created. And the proximity to resources needed is paramount as Lewisham and Lambeth are not far out from Peckham (under Southwark).

In conclusion, this project would have had better results if there were more data in terms of crime data within the area, traffic access and allowance of more venues exploration with the Foursquare (limited venues for free calls).

Also, getting the ratings and feedbacks of the current restaurants within the clusters would have helped in providing more insight into the best location.

In []:
