IBM Applied Data Science -The Battle of Neighbhorhoods

Opening a New Authentic Indian Restaurant in London City

This final project explores the best locations for Indian restaurants throughout the London City.Londonk City is the biggest city in the United Kingdom with a long history of international immigration. They came from many parts of the world.. With its diverse culture, comes diverse food items. There are many restaurants in London City, each belonging to different categories like Chinese, Indian, French, etc.

Firstly we will import all the required libraries for the analysis

```
In [1]: import pandas as pd
import numpy as np
#!conda install -c conda-forge geopy --yes # uncomment this line if you
haven't completed the Foursquare API lab
from geopy.geocoders import Nominatim # convert an address into latitud
e and longitude values
#!pip install geocoder
import geocoder # to get coordinates
import requests # library to handle requests
from pandas.io.json import json_normalize # tranform JSON file into a p
andas dataframe

# Matplotlib and associated plotting modules
import matplotlib.cm as cm
import matplotlib.colors as colors
```

```
# import k-means from clustering stage
from sklearn.cluster import KMeans

#!conda install -c conda-forge folium=0.5.0 --yes # uncomment this line
if you haven't completed the Foursquare API lab
import folium # map rendering library

print('Libraries imported.')
```

Libraries imported.

1. Data Preparation

In [3]: #Organising the data into 3 cloumns

Lets build a dataframe of neighborhoods in London by web scraping the data from Wikipedia page. I have used Beautiful Soup package for web scrapping the data

```
In [2]: # import the library we use to open URLs
import urllib.request
# import the BeautifulSoup library so we can parse HTML and XML documen
ts
from bs4 import BeautifulSoup

url = 'https://en.wikipedia.org/wiki/List_of_areas_of_London'
page = urllib.request.urlopen(url)

# parse the HTML from our URL into the BeautifulSoup parse tree format
soup = BeautifulSoup(page, "lxml")
right_table=soup.find('table', class_='wikitable')
#right_table
```

A=[] B=[] C=[] D=[]

```
for tag in right_table(['span', 'sup']):
            tag.decompose()
        for data in right table.findAll('tr'):
            ref data= data.findAll('a')
            for cd in ref data:
               # print(cd.text)
                A.append(cd.text)
           # row data=row.findall('a')
            #print(row data)
        for tag in right_table(['a']):
            tag.decompose()
        for tr in right table.findAll('tr')[1:]:
            td = tr.find all('td')
            row = [i.text for i in td]
            B.append(row[1])
            C.append(row[2])
            D.append(row[3])
In [4]: #Assiging the headers and applying pandas to create dataframe
        df=pd.DataFrame(A,columns=['Neighborhood'])
        df['London Borough']=B
        df['Post town']=C
        df['Postcode district']=D
        df[df.columns] = df.apply(lambda x: x.str.strip()) #Stripping extra sp
        ace from the columns
        df.head()
```

Out[4]:

Neighborhood		London Borough	Post town	Postcode district	
0	Abbey Wood	Bexley, Greenwich	LONDON	SE2	
1	Acton	Ealing, Hammersmith and Fulham	LONDON	W3, W4	
2	Addington	Croydon	CROYDON	CR0	
3	Addiscombe	Crovdon	CROYDON	CRO	



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We have to get the geographical coordinates of the neighborhoods. I have used a csv file which contains the London Boroughs and geographical coordinates which was available on the dataset link of London. I have merged the data to get them all together.

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```
In [5]: df_geodata = pd.read_csv('London_Borughs.csv')
    df_geodata.rename(columns={'Borough':'London_Borough'},inplace=True)
    london_df = pd.merge(df, df_geodata, on='London_Borough', how='inner')
    london_df.head()
```

Out[5]:

	Neighborhood	London Borough	Post town	Postcode district	Latitude	Longitude
0	Addington	Croydon	CROYDON	CR0	51.3714	0.0977
1	Addiscombe	Croydon	CROYDON	CR0	51.3714	0.0977
2	Coombe	Croydon	CROYDON	CR0	51.3714	0.0977
3	Coulsdon	Croydon	COULSDON	CR5	51.3714	0.0977
4	Croydon	Croydon	CROYDON	CR0	51.3714	0.0977

Let's get the geographical coordinates of London.

```
In [6]: address='Croydon, LN'
    geolocator = Nominatim(user_agent="ln_explorer")
    location = geolocator.geocode(address)
    latitude=location.latitude
    longitude=location.longitude
    print(address)

print('The geograpical coordinate of London City are {}, {}.'.format(latitude, longitude))
```

Croydon, LN

/ WWW.

.

The geograpical coordinate of London City are 51.3713049, -0.101957.

Creating the map, Let's visualize London neighborhoods in it.

```
In [7]: # create map of London using latitude and longitude values
        map london = folium.Map(location=[latitude, longitude], zoom start=10)
        # add markers to map
        for lat, lng, borough, neigh in zip(london df['Latitude'], london df['L
        ongitude'], london df['London Borough'], london df['Neighborhood']):
            label = '{}, {}'.format(neigh, 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,
                parse html=False).add to(map london)
        map_london
```

Out[7]:

Next, we are going to start utilizing the Foursquare API to explore the neighborhoods and segment them.

Define Foursquare credentials and version

```
In [8]: CLIENT_ID = 'OAXOSYW1GBKW3UABYT4J0Z0WJNDHW24B2JKLP31034D0PZAH' # your F
oursquare ID
CLIENT_SECRET = 'TN0DARG02KSPHIIDLYXSRE2MZHA2NPFFERLKYC4L5L4EWVHH' # yo
ur Foursquare Secret
VERSION = '20180605' # Foursquare API version

print('Your credentails:')
print('CLIENT_ID: ' + CLIENT_ID)
print('CLIENT_SECRET:' + CLIENT_SECRET)
```

Your credentails: CLIENT_ID: 0AX0SYW1GBKW3UABYT4J0Z0WJNDHW24B2JKLP31034D0PZAH CLIENT SECRET:TN0DARG02KSPHIIDLYXSRE2MZHA2NPFFERLKYC4L5L4EWVHH

Let's explore the first neighborhood in our dataframe.

Get the neighborhood's name.

```
In [9]: london_df.loc[0, 'Neighborhood']
Out[9]: 'Addington'
```

Get the neighborhood's latitude and longitude values.

Latitude and longitude values of Addington are 51.3714, 0.0977.

Now, let's get the top 100 venues that are in Addington within a radius of 1000 meters.

First, let's create the GET request URL. Name your URL url.

```
In [11]: LIMIT=100
    radius = 1000 # define radius
    url = 'https://api.foursquare.com/v2/venues/explore?&client_id={}&clien
    t_secret={}&v={}&ll={},{}&radius={}&limit={}'.format(
        CLIENT_ID,
        CLIENT_SECRET,
        VERSION,
        neighborhood_latitude,
        neighborhood_longitude,
        radius,
        LIMIT)
    url

Out[11]: 'https://api.foursquare.com/v2/venues/explore?&client id=0AXOSYW1GBKW3U
```

ABYT4J0Z0WJNDHW24B2JKLP31034D0PZAH&client_secret=TN0DARG02KSPHIIDLYXSRE 2MZHA2NPFFERLKYC4L5L4EWVHH&v=20180605&ll=51.3714,0.0977&radius=1000&lim it=100'

Send the GET request and examine the results

```
In [12]: results = requests.get(url).json()
         results
Out[12]: {'meta': {'code': 200, 'requestId': '5ee0e26b8e93482181dfd927'},
          'response': {'suggestedFilters': {'header': 'Tap to show:',
            'filters': [{'name': 'Open now', 'key': 'openNow'}]},
           'headerLocation': 'Orpington',
           'headerFullLocation': 'Orpington, London',
           'headerLocationGranularity': 'neighborhood',
            'totalResults': 32,
           'suggestedBounds': {'ne': {'lat': 51.38040000900001,
             'lng': 0.11208994399129145},
            'sw': {'lat': 51.3623999099999, 'lng': 0.08331005600870854}},
            'groups': [{'type': 'Recommended Places',
              'name': 'recommended',
              'items': [{'reasons': {'count': 0,
                 'items': [{'summary': 'This spot is popular',
                   'type': 'general',
                   'reasonName': 'globalInteractionReason'}|},
               'venue': {'id': '4d0638d19d33a143df24c578',
                 'name': 'Primo Cafe'.
                'location': {'address': 'High Street',
                 'crossStreet': 'Knoll Rise',
                  'lat': 51.37410479121223.
                 'lng': 0.09783041601631369,
                 'labeledLatLngs': [{'label': 'display',
                    'lat': 51.37410479121223.
                   'lng': 0.09783041601631369}],
                  'distance': 301,
                  'postalCode': 'BR 6 9',
                 'cc': 'GB',
                  'city': 'Orpington',
```

```
'state': 'Greater London',
        'country': 'United Kingdom',
        'formattedAddress': ['High Street (Knoll Rise)',
         'Orpington',
         'Greater London',
         'BR 6 9',
         'United Kingdom']},
       'categories': [{'id': '4bf58dd8d48988d1e0931735',
         'name': 'Coffee Shop',
         'pluralName': 'Coffee Shops',
         'shortName': 'Coffee Shop',
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/foo
d/coffeeshop ',
          'suffix': '.png'},
         'primary': True}],
       'photos': {'count': 0, 'groups': []}},
      'referralId': 'e-0-4d0638d19d33a143df24c578-0'},
     {'reasons': {'count': 0,
       'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'globalInteractionReason'}]},
      'venue': {'id': '4c421a83e26920a11d8b5fe7',
       'name': "Xi'an".
       'location': {'address': '324 High St',
        'lat': 51.37389975375316,
        'lng': 0.09800124258616544,
        'labeledLatLngs': [{'label': 'display',
          'lat': 51.37389975375316,
          'lng': 0.09800124258616544}],
        'distance': 279.
        'postalCode': 'BR6 0NG',
        'cc': 'GB',
        'city': 'Orpington',
        'state': 'Greater London',
        'country': 'United Kingdom',
        'formattedAddress': ['324 High St',
         'Orpington',
         'Greater London',
         'BR6 ONG',
```

```
'United Kingdom'l,
       'categories': [{'id': '4bf58dd8d48988d145941735',
         'name': 'Chinese Restaurant',
         'pluralName': 'Chinese Restaurants',
         'shortName': 'Chinese',
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/foo
d/asian ',
          'suffix': '.pna'}.
         'primary': True}],
       'photos': {'count': 0, 'groups': []}},
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     {'reasons': {'count': 0,
       'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'globalInteractionReason'}]},
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       'name': 'PureGym',
       'location': {'address': 'Crown House',
        'crossStreet': 'High St',
        'lat': 51.37684960209922,
        'lng': 0.10166055826233265,
        'labeledLatLngs': [{'label': 'display',
          'lat': 51.37684960209922.
          'lng': 0.10166055826233265}],
        'distance': 666,
        'postalCode': 'BR6 0TW',
        'cc': 'GB',
        'city': 'Orpington',
        'state': 'Greater London',
        'country': 'United Kingdom',
        'formattedAddress': ['Crown House (High St)',
         'Orpington',
         'Greater London'.
         'BR6 0TW',
         'United Kingdom']},
       'categories': [{'id': '4bf58dd8d48988d175941735',
         'name': 'Gym / Fitness Center',
         'pluralName': 'Gyms or Fitness Centers',
         'shortName': 'Gym / Fitness',
```

```
'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/bui
lding/gym_',
          'suffix': '.png'},
         'primary': True}],
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     {'reasons': {'count': 0,
       'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'qlobalInteractionReason'}]},
      'venue': {'id': '50796745e4b0ce42c63bd0be'.
       'name': 'Osteria Da Fabrizio',
       'location': {'lat': 51.375789237102744,
        'lng': 0.0991958332769815.
        'labeledLatLngs': [{'label': 'display',
          'lat': 51.375789237102744.
          'lng': 0.0991958332769815}],
        'distance': 499,
        'cc': 'GB',
        'country': 'United Kingdom',
        'formattedAddress': ['United Kingdom']},
       'categories': [{'id': '4bf58dd8d48988d110941735',
         'name': 'Italian Restaurant',
         'pluralName': 'Italian Restaurants',
         'shortName': 'Italian',
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/foo
d/italian ',
          'suffix': '.png'},
         'primary': True}],
       'photos': {'count': 0, 'groups': []}},
      'referralId': 'e-0-50796745e4b0ce42c63bd0be-3'},
     {'reasons': {'count': 0,
       'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'globalInteractionReason'}]},
      'venue': {'id': '55ce16bb498e503baeacebc8',
       'name': 'Pato Lounge',
       'location': {'address': '202-206 High St',
        'lat': 51.3770085608021,
```

```
'lng': 0.0999937959360211,
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          'lat': 51.3770085608021,
          'lng': 0.0999937959360211}],
        'distance': 644,
        'postalCode': 'BR6 0JN',
        'cc': 'GB',
        'citv': 'Orpinaton'.
        'state': 'Greater London',
        'country': 'United Kingdom',
        'formattedAddress': ['202-206 High St',
         'Orpington',
         'Greater London'.
         'BR6 0JN',
         'United Kingdom']},
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         'name': 'Restaurant',
         'pluralName': 'Restaurants',
         'shortName': 'Restaurant',
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/foo
d/default ',
          'suffix': '.png'},
         'primary': True}],
       'photos': {'count': 0, 'groups': []}},
      'referralId': 'e-0-55ce16bb498e503baeacebc8-4'},
     {'reasons': {'count': 0,
       'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'globalInteractionReason'}]},
      'venue': {'id': '4bd6fe8b6f649521d7b071ec',
       'name': 'Costa Coffee',
       'location': {'address': 'High St',
        'lat': 51.37516814408364,
        'lng': 0.10703730104149171,
        'labeledLatLngs': [{'label': 'display',
          'lat': 51.37516814408364,
          'lng': 0.10703730104149171}],
        'distance': 772,
        'cc': 'GB',
```

```
'city': 'Orpington',
        'state': 'Greater London',
        'country': 'United Kingdom',
        'formattedAddress': ['High St',
         'Orpington',
         'Greater London',
         'United Kingdom']},
       'categories': [{'id': '4bf58dd8d48988d1e0931735',
         'name': 'Coffee Shop',
         'pluralName': 'Coffee Shops',
         'shortName': 'Coffee Shop',
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/foo
d/coffeeshop ',
          'suffix': '.png'},
         'primary': True}],
       'photos': {'count': 0, 'groups': []}},
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     {'reasons': {'count': 0,
       'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'globalInteractionReason'}]},
      'venue': {'id': '4e21d81e88774a43b76e342b',
       'name': 'Hisar Meze',
       'location': {'address': '105 Orpington By-Pass',
        'lat': 51.37882639169992,
        'lng': 0.10195383362835417,
        'labeledLatLngs': [{'label': 'display',
          'lat': 51.37882639169992,
          'lng': 0.10195383362835417}],
        'distance': 877.
        'postalCode': 'BR6 0LG',
        'cc': 'GB'.
        'city': 'Bromley',
        'state': 'Greater London',
        'country': 'United Kingdom',
        'formattedAddress': ['105 Orpington By-Pass',
         'Bromley',
         'Greater London',
         'BR6 0LG',
```

```
'United Kingdom'l},
       'categories': [{'id': '4d4b7105d754a06374d81259',
         'name': 'Food',
         'pluralName': 'Food',
         'shortName': 'Food',
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/foo
d/default ',
          'suffix': '.png'},
         'primary': True}],
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       'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'qlobalInteractionReason'}]},
      'venue': {'id': '5695cc3e498e5867681d9b6f',
       'name': 'Odeon',
       'location': {'address': 'The Walnuts Shopping Centre, Orpingto
n',
        'crossStreet': 'High St',
        'lat': 51.3766391,
        'lng': 0.101231,
        'labeledLatLngs': [{'label': 'display',
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          'lng': 0.101231}],
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        'postalCode': 'BR6 0TW',
        'cc': 'GB',
        'city': 'Greater London',
        'state': 'Greater London',
        'country': 'United Kingdom',
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igh St)',
         'Greater London',
         'BR6 0TW',
         'United Kingdom'l},
       'categories': [{'id': '4bf58dd8d48988d17f941735',
         'name': 'Movie Theater',
         'pluralName': 'Movie Theaters',
```

```
'shortName': 'Movie Theater',
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/art
s entertainment/movietheater ',
          'suffix': '.png'},
         'primary': True}],
       'photos': {'count': 0, 'groups': []}},
      'referralId': 'e-0-5695cc3e498e5867681d9b6f-7'},
     {'reasons': {'count': 0.
       'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'globalInteractionReason'}|},
      'venue': {'id': '4cc2d0f89141370469dfb655',
       'name': 'Pizza Express',
       'location': {'address': '97 High Street',
        'lat': 51.37917952948439,
        'lng': 0.1025958748340372,
        'labeledLatLngs': [{'label': 'display',
          'lat': 51.37917952948439,
          'lng': 0.1025958748340372}],
        'distance': 930,
        'postalCode': 'BR6 OLF',
        'cc': 'GB',
        'city': 'Kent',
        'state': 'Kent',
        'country': 'United Kingdom',
        'formattedAddress': ['97 High Street',
         'Kent',
         'BR6 0LF',
         'United Kingdom']},
       'categories': [{'id': '4bf58dd8d48988d1ca941735',
         'name': 'Pizza Place',
         'pluralName': 'Pizza Places',
         'shortName': 'Pizza'.
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/foo
d/pizza_'
          'suffix': '.png'},
         'primary': True}],
       'photos': {'count': 0, 'groups': []}},
      'referralId': 'e-0-4cc2d0f89141370469dfb655-8'},
```

```
{'reasons': {'count': 0,
       'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'globalInteractionReason'}]},
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       'name': 'Greggs',
       'location': {'address': '145 High St',
        'crossStreet': 'The Walnuts Shopping Centre',
        'lat': 51.377834633856324,
        'lng': 0.10088324546813965,
        'labeledLatLngs': [{'label': 'display',
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          'lng': 0.10088324546813965}],
        'distance': 749.
        'postalCode': 'BR6 OLS',
        'cc': 'GB',
        'city': 'Orpington',
        'state': 'Greater London',
        'country': 'United Kingdom',
        'formattedAddress': ['145 High St (The Walnuts Shopping Centr
e)',
         'Orpington',
         'Greater London',
         'BR6 OLS',
         'United Kingdom']},
       'categories': [{'id': '4bf58dd8d48988d16a941735',
         'name': 'Bakery',
         'pluralName': 'Bakeries',
         'shortName': 'Bakery',
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/foo
d/bakery_',
          'suffix': '.png'},
         'primary': True}],
       'photos': {'count': 0, 'groups': []}},
      'referralId': 'e-0-4e3d336f62e19d61096aa684-9'},
     {'reasons': {'count': 0,
       'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'globalInteractionReason'}]},
```

```
'venue': {'id': '5d72e64d6c160b00084fe41b',
       'name': "Nando's",
       'location': {'address': 'High St',
        'lat': 51.377389,
        'lng': 0.101865,
        'labeledLatLngs': [{'label': 'display',
          'lat': 51.377389,
          'lna': 0.101865}1.
        'distance': 726,
        'postalCode': 'BR6 0TW',
        'cc': 'GB',
        'city': 'Orpington',
        'state': 'Greater London',
        'country': 'United Kingdom',
        'formattedAddress': ['High St',
         'Orpington',
         'Greater London',
         'BR6 0TW',
         'United Kingdom']},
       'categories': [{'id': '4def73e84765ae376e57713a',
         'name': 'Portuguese Restaurant',
         'pluralName': 'Portuguese Restaurants',
         'shortName': 'Portuguese',
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/foo
d/portuguese ',
          'suffix': '.png'},
         'primary': True}],
       'photos': {'count': 0, 'groups': []},
       'venuePage': {'id': '558959321'}},
      'referralId': 'e-0-5d72e64d6c160b00084fe41b-10'}.
     {'reasons': {'count': 0,
       'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'globalInteractionReason'}]},
      'venue': {'id': '4bf84c5d5ec320a1328888d3',
       'name': 'Fiesta Mexicana',
       'location': {'lat': 51.379134358653005,
        'lng': 0.10233840076970038,
        'labeledLatLngs': [{'label': 'display',
```

```
'lat': 51.379134358653005,
          'lng': 0.10233840076970038}],
        'distance': 919,
        'cc': 'GB',
        'country': 'United Kingdom',
        'formattedAddress': ['United Kingdom']},
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         'pluralName': 'Mexican Restaurants',
         'shortName': 'Mexican',
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/foo
d/mexican ',
          'suffix': '.png'},
         'primary': True}],
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       'location': {'address': 'Orpington Railway Station (ORP)',
        'crossStreet': 'Station Approach',
        'lat': 51.37362832054002.
        'lng': 0.08902778192130363,
        'labeledLatLngs': [{'label': 'display',
          'lat': 51.37362832054002.
          'lng': 0.08902778192130363}],
        'distance': 651.
        'postalCode': 'BR6 0SX',
        'cc': 'GB',
        'city': 'London',
        'state': 'Greater London',
        'country': 'United Kingdom',
        'formattedAddress': ['Orpington Railway Station (ORP) (Station
Approach)',
         'London',
         'Greater London',
         'BR6 0SX'.
         'United Kingdom']},
       'categories': [{'id': '4f4531504b9074f6e4fb0102',
         'name': 'Platform',
         'pluralName': 'Platforms'.
         'shortName': 'Platform',
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/tra
vel/trainstation ',
          'suffix': '.png'},
         'primary': True}],
       'photos': {'count': 0, 'groups': []}},
      'referralId': 'e-0-4d31b32beefa8cfac32d2eb3-29'},
     {'reasons': {'count': 0,
       'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'globalInteractionReason'}]},
      'venue': {'id': '4c645be311c4a5936722e911',
```

```
'name': 'White Hart',
       'location': {'address': '106 High St',
        'lat': 51.37926986082972,
        'lng': 0.10223905822128963,
        'labeledLatLngs': [{'label': 'display',
          'lat': 51.37926986082972,
          'lng': 0.10223905822128963}],
        'distance': 931.
        'postalCode': 'Br6',
        'cc': 'GB',
        'city': 'Orpington',
        'state': 'Greater London',
        'country': 'United Kingdom',
        'formattedAddress': ['106 High St'.
         'Orpington',
         'Greater London',
         ' Br6',
         'United Kingdom']},
       'categories': [{'id': '4bf58dd8d48988d11b941735',
         'name': 'Pub',
         'pluralName': 'Pubs',
         'shortName': 'Pub',
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/nig
htlife/pub_',
          'suffix': '.png'},
         'primary': True}],
       'photos': {'count': 0, 'groups': []}},
      'referralId': 'e-0-4c645be311c4a5936722e911-30'},
     {'reasons': {'count': 0,
       'items': [{'summary': 'This spot is popular',
         'type': 'general',
         'reasonName': 'globalInteractionReason'}]},
      'venue': {'id': '4d4ebe1520d3236aab9a9e28',
       'name': 'Platform 2',
       'location': {'address': 'Orpington Railway Station (ORP)',
        'lat': 51.37369424246071,
        'lng': 0.0885756000128438,
        'labeledLatLngs': [{'label': 'display',
          'lat': 51.37369424246071,
```

```
'lng': 0.0885756000128438}],
        'distance': 683,
        'postalCode': 'BR6 0SX',
        'cc': 'GB',
        'city': 'Orpington',
        'state': 'Greater London',
        'country': 'United Kingdom',
        'formattedAddress': ['Orpington Railway Station (ORP)',
         'Orpington',
         'Greater London'.
         'BR6 0SX',
         'United Kingdom']},
       'categories': [{'id': '4f4531504b9074f6e4fb0102',
         'name': 'Platform',
         'pluralName': 'Platforms',
         'shortName': 'Platform',
         'icon': {'prefix': 'https://ss3.4sqi.net/img/categories v2/tra
vel/trainstation ',
          'suffix': '.png'},
         'primary': True}],
       'photos': {'count': 0, 'groups': []}},
      'referralId': 'e-0-4d4ebe1520d3236aab9a9e28-31'}]}}
```

We know that all the information is in the items key. Before we proceed, let's borrow the get_category_type function from the Foursquare lab.

```
In [13]: # 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']
```

Now we are ready to clean the json and structure it into a pandas dataframe.

```
In [14]: venues = results['response']['groups'][0]['items']
          nearby venues = json normalize(venues) # flatten JSON
          # filter columns
          filtered columns = ['venue.name', 'venue.categories', 'venue.location.l
          at', 'venue.location.lng']
          nearby venues = nearby venues.loc[:, filtered columns]
          # filter the category for each row
          nearby venues['venue.categories'] = nearby venues.apply(get category ty
          pe, axis=1)
          # clean columns
          nearby venues.columns = [col.split(".")[-1] for col in nearby venues.co
          lumns1
          nearby venues.head()
Out[14]:
                                   categories
                                                  lat
                      name
                                                         Ing
          0
                   Primo Cafe
                                  Coffee Shop 51.374105 0.097830
           1
                            Chinese Restaurant 51.373900 0.098001
                    PureGym Gym / Fitness Center 51.376850 0.101661
          2
           3 Osteria Da Fabrizio
                              Italian Restaurant 51.375789 0.099196
                  Pato Lounge
                                   Restaurant 51.377009 0.099994
 In [ ]: print('{} venues were returned by Foursquare.'.format(nearby venues.sha
```

2: Explore Neighborhoods

pe[0]))

Let's create a function to repeat the same process to all the neighborhoods in Addington

```
In [17]: def getNearbyVenues(names, latitudes, longitudes, radius=500):
             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=
         {}&client 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]['it
         ems'l
                 # return only relevant information for each nearby venue
                 venues list.append([(
                     name,
                     lat.
                     lna.
                     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 fo
         r item in venue list])
             nearby_venues.columns = ['Neighborhood',
                            'Neighborhood Latitude',
                            'Neighborhood Longitude',
```

```
'Venue',
                            'Venue Latitude',
                            'Venue Longitude',
                            'Venue Category']
             return(nearby venues)
In [18]: london venues = getNearbyVenues(names=london df['Neighborhood'],
                                             latitudes=london df['Latitude'],
                                             longitudes=london df['Longitude']
         Addington
         Addiscombe
         Coombe
         Coulsdon
         Croydon
         Forestdale
         Kenley
         New Addington
         Norbury
         Old Coulsdon
         Purley
         Riddlesdown
         Sanderstead
         Selhurst
         Selsdon
         Shirley
         South Croydon
         South Norwood
         Thornton Heath
         Upper Norwood
         Waddon
         Woodside
         Albany Park
         Barnehurst
         Barnes Cray
         Belvedere
         Bexley
```

Bexleyheath

Blackfen

Blendon

Colyers

Crayford

Crook Log

Crossness

East Wickham

Erith

Foots Cray

Lamorbey

Lessness Heath

Longlands

North Cray

North End

Northumberland Heath

Sidcup

Slade Green

Upton

Welling

West Heath

Aldborough Hatch

Barkingside

Gants Hill

 ${\tt Goodmayes}$

Hainault

Ilford

Loxford

Newbury Park

Redbridge

Seven Kings

South Woodford

Wanstead

Woodford

Aldwych

Bayswater

Belgravia

Charing Cross

Chinatown

Covent Garden

 ${\sf Knightsbridge}$

Lisson Grove

Little Venice

Maida Vale

Marylebone

Mayfair

Millbank

Paddington

Pimlico

Soho

St James's

St John's Wood

Westminster

Alperton

Brent Park

Brondesbury

Church End

Dollis Hill

Harlesden

Kensal Green

Kingsbury

Neasden

Preston

Queen's Park

Stonebridge

Tokyngton

Wembley

Wembley Park

Willesden

Anerley

Aperfield

Beckenham

Bickley

Biggin Hill

Bromley

Bromley Common

Chelsfield

Chislehurst

Coney Hall

Crystal Palace

Cudham

Derry Downs

Downe

Eden Park

Elmers End

Elmstead

Goddington

Hayes

Hazelwood

Keston

Leaves Green

Locksbottom

Mottingham

Orpington

Penge

Petts Wood

Plaistow

Pratt's Bottom

Southborough

St Mary Cray

St Paul's Cray

Sundridge

West Wickham

Widmore

Angel

Archway

Barnsbury

Canonbury

Clerkenwell

De Beauvoir Town

Finsbury

Highbury

Holloway

Islington

Nag's Head

Pentonville

St Luke's

Upper Holloway

Ardleigh Green

Chase Cross

Collier Row

Cranham

Elm Park

Emerson Park

Gallows Corner

Gidea Park

Harold Hill

Harold Park

Harold Wood

Havering-atte-Bower

Hornchurch

Noak Hill

North Ockendon

Rainham

Romford

South Hornchurch

Upminster

Upminster Bridge

Wennington

Arkley

Barnet Gate

Barnet

Brent Cross

Brunswick Park

Burnt Oak

Burroughs, The

Childs Hill

Church End

Colindale

Colney Hatch

East Barnet

East Finchley

Edgware

Finchley

Friern Barnet

Golders Green

Grahame Park

The Hale

Hampstead Garden Suburb

Hendon

The Hyde

Mill Hill

Monken Hadley

New Barnet

New Southgate

North Finchley

Oakleigh Park

Osidge

Temple Fortune

Totteridge

West Hendon

Whetstone

Woodside Park

Arnos Grove

Botany Bay

Brimsdown

Bulls Cross

Crews Hill

Edmonton

Enfield Highway

Enfield Lock

Enfield Town

Enfield Wash

Freezywater

Grange Park

Hadley Wood

Palmers Green

Ponders End

Southgate

Winchmore Hill

Balham

Battersea

Earlsfield

Nine Elms

Putney

Roehampton Southfields

Tooting

Tooting Bec

Wandsworth

Bankside

Bermondsey

Camberwell

Denmark Hill

Dulwich

East Dulwich

Elephant and Castle

Newington

Nunhead

Peckham

Rotherhithe

Surrey Quays

Walworth

Barking

Becontree

Becontree Heath

Castle Green

Creekmouth

Dagenham

Marks Gate

..a. ..s care

Rush Green

Barnes

Castelnau

East Sheen

Eel Pie Island

Fulwell

Ham

Hampton

Hampton Hill

Hampton Wick

Kew

Mortlake

North Sheen

Petersham

Richmond

St Margarets

Strawberry Hill

Teddington

Twickenham

Whitton

Beckton

Canning Town

Custom House

East Ham

Forest Gate

Little Ilford

Manor Park

Maryland

North Woolwich

Plaistow

Silvertown

Stratford

Upton Park

West Ham

Beddington

Belmont

Carshalton

Cheam

Sutton

Wallington

Bedford Park

Ealing

Greenford

Hanwell

Northolt

Norwood Green

Perivale

Southall

West Ealing

Bellingham

Blackheath

Brockley

Catford

Chinbrook

Crofton Park

Deptford

Downham

Forest Hill

Grove Park

Hither Green

Honor Oak

Ladywell

Lee

Lewisham

New Cross

Southend

St Johns

Belmont

Harrow

Harrow on the Hill

Harrow Weald

Hatch End

North Harrow

Pinner

Rayners Lane

South Harrow

Stanmore

Wealdstone

West Harrow

Belsize Park

Bloomsbury

Camden Town

Chalk Farm

Fitzrovia

_ _ _ _ _

Frognal

Gospel Oak

Hampstead

Highgate

Holborn

Kentish Town

Primrose Hill

Somerstown

St Giles

St Pancras

Swiss Cottage

West Hampstead

Berrylands

Chessington

Coombe

Hook

Kingston Vale

Kingston upon Thames

Malden Rushett

Motspur Park

New Malden

Norbiton

Old Malden

Surbiton

Tolworth

Bethnal Green

Blackwall

Bow

Bromley

Cambridge Heath

Canary Wharf

Cubitt Town

Isle of Dogs

Leamouth

Limehouse

Mile End

Millwall

Old Ford

Poplar

Ratcliff

Shadwell

Spitalfields

Stepney

Tower Hill

Wapping

Whitechapel

Bounds Green

Bowes Park

Crouch End

Fortis Green

Harringay

Hornsey

Seven Sisters

South Tottenham

Stroud Green

Tottenham

Tottenham Green

Tottenham Hale

Turnpike Lane

West Green

Wood Green

Brentford

Cranford

East Bedfont

Feltham

Grove Park

Gunnersbury

Hanworth

Hatton

Heston

Hounslow

Isleworth

Lampton

Osterley

Woodlands

Brixton

Gipsy Hill

Herne Hill

Lambeth

0val

Stockwell

Streatham

Tulse Hill

Vauxhall

West Norwood

Cann Hall

Chingford

Highams Park

Leyton

Leytonstone

Upper Walthamstow

Walthamstow

Walthamstow Village

Chelsea

Earls Court

Holland Park

Kensington

North Kensington

Notting Hill

South Kensington

West Brompton

Colliers Wood

Lower Morden

Merton Park

Mitcham

Morden

Morden Park

Raynes Park

South Wimbledon

St Helier

Wimbledon

Cowley

Eastcote

Harefield

Harlington

Harmondsworth

Hayes

Hillingdon

Ickenham

Longford

Northwood

Ruislip

Sipson

South Ruislip

Uxbridge

West Drayton Yeading Yiewsley Dalston Hackney Hackney Central Hackney Marshes Hackney Wick Haggerston Homerton Hoxton Lea Bridge Lower Clapton Manor House Shacklewell Shoreditch South Hackney Stamford Hill Stoke Newington Upper Clapton West Hackney

Checking the size of the Datframe

In [19]: print(london_venues.shape) london_venues.head()

(5076, 7)

Out[19]:

	Neighborhood	Neighborhood Neighborhood Latitude Longitude		Venue	Venue Latitude	Venue Longitude	Venue Category
0	Addington	51.3714	0.0977	Primo Cafe	51.374105	0.097830	Coffee Shop
1	Addington	51.3714	0.0977	Xi'an	51.373900	0.098001	Chinese Restaurant
2	Addington	51.3714	0.0977	Osteria Da Fabrizio	51.375789	0.099196	Italian Restaurant

	Neighborhood	hborhood Neighborhood Neighbo Latitude Long		Venue	Venue Latitude	Venue Longitude	Venue Category
3	Addington	51.3714	0.0977	Tesco Extra	51.373557	0.096622	Supermarket
4	Addington	51.3714	0.0977	Domino's Pizza	51.374614	0.098277	Pizza Place

In [20]: london_venues.groupby('Neighborhood').count()

Out[20]:

	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
Neighborhood						
Addington	6	6	6	6	6	6
Addiscombe	6	6	6	6	6	6
Albany Park	29	29	29	29	29	29
Aldborough Hatch	41	41	41	41	41	41
Aldwych	1	1	1	1	1	1
Alperton	2	2	2	2	2	2
Anerley	39	39	39	39	39	39
Angel	4	4	4	4	4	4
Aperfield	39	39	39	39	39	39
Archway	4	4	4	4	4	4
Ardleigh Green	44	44	44	44	44	44
Arnos Grove	4	4	4	4	4	4
Balham	2	2	2	2	2	2
Bankside	3	3	3	3	3	3
Barking	7	7	7	7	7	7

	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
Neighborhood						
Barkingside	41	41	41	41	41	41
Barnehurst	29	29	29	29	29	29
Barnes	5	5	5	5	5	5
Barnes Cray	29	29	29	29	29	29
Barnsbury	4	4	4	4	4	4
Battersea	2	2	2	2	2	2
Bayswater	1	1	1	1	1	1
Beckenham	39	39	39	39	39	39
Beckton	14	14	14	14	14	14
Becontree	7	7	7	7	7	7
Becontree Heath	7	7	7	7	7	7
Beddington	2	2	2	2	2	2
Bedford Park	2	2	2	2	2	2
Belgravia	1	1	1	1	1	1
Bellingham	6	6	6	6	6	6
Wallington	2	2	2	2	2	2
Walworth	3	3	3	3	3	3
Wandsworth	2	2	2	2	2	2
Wanstead	41	41	41	41	41	41
Wapping	12	12	12	12	12	12
Welling	29	29	29	29	29	29
Wembley	2	2	2	2	2	2

	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
Neighborhood						
Wembley Park	2	2	2	2	2	2
Wennington	44	44	44	44	44	44
West Drayton	1	1	1	1	1	1
West Ealing	2	2	2	2	2	2
West Green	3	3	3	3	3	3
West Hackney	8	8	8	8	8	8
West Ham	14	14	14	14	14	14
West Hampstead	4	4	4	4	4	4
West Heath	29	29	29	29	29	29
West Norwood	9	9	9	9	9	9
West Wickham	39	39	39	39	39	39
Westminster	1	1	1	1	1	1
Whitechapel	12	12	12	12	12	12
Whitton	5	5	5	5	5	5
Widmore	39	39	39	39	39	39
Willesden	2	2	2	2	2	2
Wimbledon	2	2	2	2	2	2
Winchmore Hill	4	4	4	4	4	4
Wood Green	3	3	3	3	3	3
Woodford	41	41	41	41	41	41
Woodside	6	6	6	6	6	6

	Neighborhood Latitude	Neighborhood Longitude	Venue	Venue Latitude	Venue Longitude	Venue Category
Neighborhood						
Yeading	1	1	1	1	1	1
Yiewsley	1	1	1	1	1	1

397 rows × 6 columns

Lets find out how many unique categories in Venue category

```
In [21]: print('There are {} uniques categories.'.format(len(london_venues['Venu
e Category'].unique())))
```

There are 90 uniques categories.

```
In [22]: # print out the list of categories
london_venues['Venue Category'].unique()
```

```
Out[22]: array(['Coffee Shop', 'Chinese Restaurant', 'Italian Restaurant',
                'Supermarket', 'Pizza Place', 'Pub', 'Furniture / Home Store',
                'Clothing Store', 'Department Store', 'Bakery', 'Plaza',
                'Pharmacy', 'Sandwich Place', 'Video Game Store', 'Hotel',
                'American Restaurant', 'Portuguese Restaurant',
                'Fast Food Restaurant', 'Shopping Mall', 'Warehouse Store',
                'Movie Theater', 'Irish Pub', 'Theater', 'Bookstore',
                'Indian Restaurant', 'Buffet', 'Grocery Store',
                'Gvm / Fitness Center', 'Stationery Store', 'Turkish Restauran
         t',
                'Platform', 'Dessert Shop', 'Breakfast Spot', 'Golf Course',
                'Ice Cream Shop', 'Electronics Store', 'Burger Joint', 'Bar',
                'Asian Restaurant', 'Donut Shop', 'Chocolate Shop',
                'Sushi Restaurant', 'Cosmetics Shop', 'Café', 'English Restauran
         t',
                'Noodle House', 'Fish & Chips Shop', 'Martial Arts Dojo',
                'Metro Station', 'Multiplex', 'Gym', 'Discount Store', 'Boutiqu
         e',
```

```
'Music Store', 'Casino', 'Jewelry Store', 'Lingerie Store',
'Sporting Goods Shop', 'Park', 'Convenience Store',
'Construction & Landscaping', 'Harbor / Marina',
'Business Service', 'IT Services', 'Bus Station', 'Pool',
'Soccer Stadium', 'Train Station', 'Rafting', 'Airport',
'Airport Service', 'Airport Lounge', 'Duty-free Shop',
'Currency Exchange', 'Historic Site', 'Home Service',
'Veterinarian', 'Polish Restaurant', 'Bus Stop', 'Skate Park',
'Rugby Pitch', 'Nature Preserve', 'Pier', 'Lighthouse', 'Diner',
'Athletics & Sports', 'Food & Drink Shop', 'Playground', 'Stable
s',
'Restaurant'], dtype=object)
```

Check whether the results contain Indian Restaurant

```
In [23]: # check if the results contain "Indian Restaurant"
   "Neighborhood" in london_venues['Venue Category'].unique()
```

Out[23]: False

3. Analyze Each Neighborhood

```
In [24]: # one hot encoding
london_onehot = pd.get_dummies(london_venues[['Venue Category']], prefi
x="", prefix_sep="")

# add neighborhood column back to dataframe
london_onehot['Neighborhood'] = london_venues['Neighborhood']

# move neighborhood column to the first column
fixed_columns = [london_onehot.columns[-1]] + list(london_onehot.column
s[:-1])
london_onehot = london_onehot[fixed_columns]

london_onehot.head()
Out[24]:
```

	Neighborhood	Airport	Airport Lounge	Airport Service	American Restaurant	Asian Restaurant	Athletics & Sports	Bakery	Bar	Book
0	Addington	0	0	0	0	0	0	0	0	
1	Addington	0	0	0	0	0	0	0	0	
2	Addington	0	0	0	0	0	0	0	0	
3	Addington	0	0	0	0	0	0	0	0	
4	Addington	0	0	0	0	0	0	0	0	

5 rows × 91 columns

In [27]: london_onehot.shape

Out[27]: (5076, 91)

Next, let's group rows by neighborhood and by taking the mean of the frequency of occurrence of each category

Out[28]:

	Neighborhood	Airport	Airport Lounge	Airport Service	American Restaurant	Asian Restaurant	Athletics & Sports	Bakery	Bar	Во
0	Addington	0.0	0.0	0.0	0.000000	0.0	0.0	0.000000	0.0	(
1	Addiscombe	0.0	0.0	0.0	0.000000	0.0	0.0	0.000000	0.0	(
2	Albany Park	0.0	0.0	0.0	0.034483	0.0	0.0	0.034483	0.0	(
3	Aldborough Hatch	0.0	0.0	0.0	0.000000	0.0	0.0	0.073171	0.0	(

```
    Neighborhood
    Airport Lounge
    Airport Lounge
    American Restaurant
    Asian Restaurant
    Athletics & Sports
    Bakery
    Bar
    Both

    4
    Aldwych
    0.0
    0.0
    0.0
    0.000000
    0.0
    0.0
    0.000000
    0.0

    5 rows × 91 columns
```

Lets see the new size

```
In [29]: london_grouped.shape
Out[29]: (397, 91)
```

Let's print each neighborhood along with the top 5 most common venues

```
In [30]:
         num top venues = 5
         for hood in london grouped['Neighborhood']:
             print("----"+hood+"----")
             temp = london grouped[london grouped['Neighborhood'] == hood].T.res
         et index()
             temp.columns = ['venue','freq']
             temp = temp.iloc[1:]
             temp['freq'] = temp['freq'].astype(float)
             temp = temp.round({'freg': 2})
             print(temp.sort_values('freq', ascending=False).reset index(drop=Tr
         ue).head(num top venues))
             print('\n')
         ----Addington----
                         venue freq
                   Pizza Place 0.17
            Italian Restaurant 0.17
         2
                   Coffee Shop 0.17
                           Puh A 17
```

```
LUD GITI
         Supermarket 0.17
4
----Addiscombe----
               venue freq
         Pizza Place 0.17
  Italian Restaurant 0.17
         Coffee Shop 0.17
3
                 Pub 0.17
4
         Supermarket 0.17
----Albany Park----
           venue freq
0
             Pub 0.10
     Coffee Shop 0.10
  Clothing Store 0.10
3
     Supermarket 0.07
4
        Pharmacy 0.07
----Aldborough Hatch----
                 venue freq
        Clothing Store 0.10
0
1
           Supermarket 0.07
                Bakery 0.07
  Fast Food Restaurant 0.07
    Turkish Restaurant 0.05
----Aldwych----
           venue freq
  Breakfast Spot
                   1.0
         Airport
                   0.0
       Multiplex
                   0.0
      Playground
                   0.0
3
        Platform
                   0.0
```

```
----Alperton----
        venue freq
          Pub
                0.5
0
  Golf Course
                0.5
2
      Airport
                0.0
    Multiplex
               0.0
    Platform
                0.0
----Anerley----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
             Bar 0.05
2
3
    Burger Joint 0.05
    Pizza Place 0.05
----Angel----
              venue freq
0 Fish & Chips Shop 0.25
               Café 0.25
  Martial Arts Dojo 0.25
      Metro Station 0.25
        Music Store 0.00
----Aperfield----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
1
2
             Bar 0.05
3
    Burger Joint 0.05
     Pizza Place 0.05
----Archway----
              venue freq
0 Fish & Chips Shop 0.25
```

```
Café 0.25
  Martial Arts Dojo 0.25
3
      Metro Station 0.25
        Music Store 0.00
4
----Ardleigh Green----
                 venue freq
0
           Coffee Shop 0.09
                 Hotel 0.07
1
2
         Shopping Mall 0.07
        Clothing Store 0.07
  Fast Food Restaurant 0.05
----Arnos Grove----
                       venue freq
                        Park 0.50
           Convenience Store 0.25
  Construction & Landscaping 0.25
3
                   Irish Pub 0.00
          Italian Restaurant 0.00
----Balham----
                       venue freq
  Construction & Landscaping
                               0.5
                         Gym
                               0.5
1
2
                               0.0
                   Multiplex
3
                  Playground
                               0.0
4
                    Platform
                               0.0
----Bankside----
             venue freq
       IT Services 0.33
   Harbor / Marina 0.33
  Business Service 0.33
3
       Music Store 0.00
```

```
Playground 0.00
4
----Barking----
                 venue freq
                  Pool 0.14
  Gym / Fitness Center 0.14
                  Park 0.14
           Supermarket 0.14
3
           Golf Course 0.14
----Barkingside----
                 venue freq
        Clothing Store 0.10
1
           Supermarket 0.07
                Bakery 0.07
  Fast Food Restaurant 0.07
    Turkish Restaurant 0.05
----Barnehurst----
           venue freq
0
             Pub 0.10
     Coffee Shop 0.10
2 Clothing Store 0.10
3
     Supermarket 0.07
        Pharmacy 0.07
----Barnes----
                venue freq
                        0.2
0 Sporting Goods Shop
  American Restaurant
                        0.2
          Coffee Shop
                        0.2
       Train Station
                        0.2
3
       Soccer Stadium
                        0.2
```

```
----Barnes Cray----
           venue freq
             Pub 0.10
0
     Coffee Shop 0.10
1
  Clothing Store 0.10
     Supermarket 0.07
        Pharmacy 0.07
----Barnsbury----
              venue freq
0 Fish & Chips Shop 0.25
               Café 0.25
2 Martial Arts Dojo 0.25
3
      Metro Station 0.25
        Music Store 0.00
----Battersea----
                       venue freq
  Construction & Landscaping
                               0.5
                         Gym
                               0.5
                               0.0
2
                   Multiplex
                  Playground
                               0.0
                    Platform
                               0.0
----Bayswater----
           venue freq
   Breakfast Spot
                   1.0
         Airport
                   0.0
1
2
       Multiplex
                   0.0
3
      Playground
                   0.0
        Platform
                   0.0
----Beckenham----
           venue freq
0 Clothing Store 0.15
```

```
Coffee Shop 0.13
1
2
             Bar 0.05
3
    Burger Joint 0.05
     Pizza Place 0.05
----Beckton----
               venue freq
0
               Hotel 0.29
  Chinese Restaurant 0.07
2
      Sandwich Place 0.07
3
            Rafting 0.07
            Pharmacy 0.07
4
----Becontree----
                 venue freq
                 Pool 0.14
  Gym / Fitness Center 0.14
                  Park 0.14
3
           Supermarket 0.14
           Golf Course 0.14
----Becontree Heath----
                 venue freq
                 Pool 0.14
  Gym / Fitness Center 0.14
2
                  Park 0.14
3
           Supermarket 0.14
           Golf Course 0.14
----Beddington----
          venue freq
  Historic Site 1.0
        Airport 0.0
      Multiplex
2
                0.0
       Platform
                 0.0
3
```

```
Pizza Place 0.0
----Bedford Park----
             venue freq
      Home Service
                    0.5
  Business Service
                     0.5
2
           Airport
                     0.0
         Multiplex
                     0.0
3
4
          Platform
                     0.0
----Belgravia----
                  freq
           venue
  Breakfast Spot
                   1.0
         Airport
                   0.0
2
       Multiplex
                   0.0
3
      Playground
                   0.0
        Platform
                   0.0
----Bellingham----
                 venue freq
     Polish Restaurant 0.17
  Fast Food Restaurant 0.17
          Veterinarian 0.17
3
                   Pub 0.17
                  Park 0.17
----Belmont----
          venue freq
  Historic Site
                  1.0
        Airport
                  0.0
     Multiplex
                  0.0
      Platform
                  0.0
3
    Pizza Place
                  0.0
```

```
----Belsize Park----
             venue freq
        Skate Park 0.25
               Gym 0.25
1
2
       Rugby Pitch 0.25
   Business Service 0.25
           Airport 0.00
----Belvedere----
           venue freq
             Pub 0.10
     Coffee Shop 0.10
1
2 Clothing Store 0.10
3
     Supermarket 0.07
        Pharmacy 0.07
----Bermondsey----
             venue freq
       IT Services 0.33
   Harbor / Marina 0.33
  Business Service 0.33
3
       Music Store 0.00
        Playground 0.00
----Berrylands----
           venue freq
  Clothing Store
                   1.0
         Airport
                   0.0
1
2
     Music Store
                   0.0
3
      Playground
                   0.0
        Platform
                   0.0
----Bethnal Green----
               venue freq
            Platform 0.17
```

```
Food & Drink Shop 0.08
2
     Nature Preserve 0.08
  Italian Restaurant 0.08
          Lighthouse 0.08
----Bexley----
           venue freq
0
             Pub 0.10
     Coffee Shop 0.10
1
2 Clothing Store 0.10
3
     Supermarket 0.07
        Pharmacy 0.07
----Bexleyheath----
           venue freq
             Pub 0.10
     Coffee Shop 0.10
  Clothing Store 0.10
3
     Supermarket 0.07
        Pharmacy 0.07
----Bickley----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
             Bar 0.05
    Burger Joint 0.05
    Pizza Place 0.05
----Biggin Hill----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
2
             Bar 0.05
3
    Burger Joint 0.05
```

```
Pizza Place 0.05
----Blackfen----
           venue freq
             Pub 0.10
     Coffee Shop 0.10
2 Clothing Store 0.10
3
     Supermarket 0.07
4
        Pharmacy 0.07
----Blackheath----
                 venue freq
     Polish Restaurant 0.17
  Fast Food Restaurant 0.17
          Veterinarian 0.17
3
                   Pub 0.17
4
                  Park 0.17
----Blackwall----
               venue freq
            Platform 0.17
  Food & Drink Shop 0.08
     Nature Preserve 0.08
  Italian Restaurant 0.08
          Lighthouse 0.08
----Blendon----
           venue freq
             Pub 0.10
     Coffee Shop 0.10
2 Clothing Store 0.10
     Supermarket 0.07
3
        Pharmacy 0.07
```

```
----Bloomsbury----
             venue freq
        Skate Park 0.25
               Gym 0.25
       Rugby Pitch 0.25
  Business Service 0.25
           Airport 0.00
----Botany Bay----
                      venue freq
                        Park 0.50
           Convenience Store 0.25
2 Construction & Landscaping 0.25
                   Irish Pub 0.00
          Italian Restaurant 0.00
----Bounds Green----
             venue freq
              Park 0.33
  Business Service 0.33
        Skate Park 0.33
2
           Airport 0.00
     Music Store 0.00
----Bow----
               venue freq
            Platform 0.17
  Food & Drink Shop 0.08
     Nature Preserve 0.08
  Italian Restaurant 0.08
          Lighthouse 0.08
----Bowes Park----
             venue freq
             Park 0.33
```

```
Business Service 0.33
2
        Skate Park 0.33
           Airport 0.00
3
       Music Store 0.00
4
----Brent Park----
        venue freq
          Pub
                0.5
0
  Golf Course
                0.5
2
     Airport
                0.0
3
    Multiplex
               0.0
    Platform
---Brimsdown----
                       venue freq
                        Park 0.50
           Convenience Store 0.25
2 Construction & Landscaping 0.25
3
                   Irish Pub 0.00
          Italian Restaurant 0.00
----Brixton----
           venue freq
     Coffee Shop 0.22
1
             Pub 0.22
     Supermarket 0.22
  Soccer Stadium 0.11
            Café 0.11
----Brockley----
                 venue freq
     Polish Restaurant 0.17
1 Fast Food Restaurant 0.17
2
          Veterinarian 0.17
3
                   Pub 0.17
```

```
Park 0.17
4
----Bromley----
           venue freq
  Clothing Store 0.12
     Coffee Shop 0.12
2
        Platform 0.04
    Burger Joint 0.04
3
             Bar 0.04
----Bromley Common----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
2
             Bar 0.05
    Burger Joint 0.05
3
    Pizza Place 0.05
----Brondesbury----
        venue freq
          Pub
                0.5
  Golf Course
               0.5
     Airport
2
              0.0
3
    Multiplex
              0.0
    Platform
               0.0
----Bulls Cross----
                      venue freq
                        Park 0.50
           Convenience Store 0.25
2 Construction & Landscaping 0.25
                   Irish Pub 0.00
3
          Italian Restaurant 0.00
```

```
----Camberwell----
             venue freq
       IT Services 0.33
   Harbor / Marina 0.33
  Business Service 0.33
       Music Store 0.00
       Playground 0.00
----Cambridge Heath----
               venue freq
            Platform 0.17
   Food & Drink Shop
                     0.08
     Nature Preserve 0.08
  Italian Restaurant 0.08
          Lighthouse 0.08
----Camden Town----
             venue freq
        Skate Park 0.25
               Gym 0.25
2
       Rugby Pitch 0.25
  Business Service 0.25
           Airport 0.00
----Canary Wharf----
               venue freq
            Platform
                     0.17
   Food & Drink Shop
     Nature Preserve 0.08
  Italian Restaurant 0.08
          Lighthouse 0.08
----Canning Town----
               venue freq
               Hotel 0.29
```

```
Chinese Restaurant 0.07
2
      Sandwich Place 0.07
             Rafting 0.07
3
            Pharmacy 0.07
4
----Canonbury----
              venue freq
  Fish & Chips Shop 0.25
               Café 0.25
2 Martial Arts Dojo 0.25
3
      Metro Station 0.25
        Music Store 0.00
----Carshalton----
          venue freq
  Historic Site
                  1.0
        Airport
                  0.0
      Multiplex
                  0.0
3
       Platform
                  0.0
    Pizza Place
                  0.0
----Castelnau----
                venue freq
0 Sporting Goods Shop
                        0.2
  American Restaurant
                        0.2
                        0.2
          Coffee Shop
       Train Station
                        0.2
       Soccer Stadium
----Castle Green----
                 venue freq
                  Pool 0.14
  Gym / Fitness Center 0.14
2
                  Park 0.14
3
           Supermarket 0.14
```

```
Golf Course 0.14
4
----Catford----
                 venue freq
     Polish Restaurant 0.17
  Fast Food Restaurant 0.17
          Veterinarian 0.17
                   Pub 0.17
3
4
                  Park 0.17
----Chalk Farm----
             venue freq
        Skate Park 0.25
               Gym 0.25
       Rugby Pitch 0.25
3
   Business Service 0.25
           Airport 0.00
----Charing Cross----
           venue freq
   Breakfast Spot
                   1.0
         Airport
                   0.0
2
       Multiplex
                   0.0
3
      Playground
                   0.0
        Platform
                   0.0
----Chase Cross----
                 venue freq
           Coffee Shop 0.09
                 Hotel 0.07
         Shopping Mall 0.07
3
        Clothing Store
                       0.07
  Fast Food Restaurant 0.05
```

```
----Cheam----
           venue freq
  Historic Site
                  1.0
        Airport
                   0.0
1
2
      Multiplex
                   0.0
       Platform
                  0.0
    Pizza Place
                  0.0
----Chelsfield----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
             Bar 0.05
2
3
    Burger Joint 0.05
     Pizza Place 0.05
----Chessington----
           venue freq
  Clothing Store
                   1.0
1
         Airport
                   0.0
2
     Music Store
                   0.0
3
      Playground
                   0.0
        Platform
                   0.0
----Chinatown----
           venue freq
  Breakfast Spot
                   1.0
         Airport
                   0.0
1
2
       Multiplex
                   0.0
3
      Playground
                   0.0
        Platform
                   0.0
----Chinbrook----
                  venue freq
     Polish Restaurant 0.17
```

```
Fast Food Restaurant 0.17
2
          Veterinarian 0.17
3
                   Pub 0.17
4
                  Park 0.17
----Chislehurst----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
1
2
             Bar 0.05
    Burger Joint 0.05
     Pizza Place 0.05
----Church End----
        venue freq
          Pub
                0.5
  Golf Course
               0.5
      Airport
               0.0
2
3
    Multiplex
                0.0
     Platform
                0.0
----Clerkenwell----
              venue freq
0 Fish & Chips Shop 0.25
               Café 0.25
2 Martial Arts Dojo 0.25
      Metro Station 0.25
3
        Music Store 0.00
----Collier Row----
                 venue freq
           Coffee Shop 0.09
1
                 Hotel 0.07
2
         Shopping Mall 0.07
3
        Clothing Store 0.07
```

```
4 Fast Food Restaurant 0.05
----Colliers Wood----
        venue freq
          Pub
               1.0
              0.0
1
   Airport
    Multiplex
              0.0
    Platform 0.0
4 Pizza Place
              0.0
----Colyers----
           venue freq
0
             Pub 0.10
     Coffee Shop 0.10
2 Clothing Store 0.10
3
     Supermarket 0.07
4
        Pharmacy 0.07
----Coney Hall----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
1
             Bar 0.05
    Burger Joint 0.05
    Pizza Place 0.05
----Coombe----
               venue freq
0 Italian Restaurant 0.14
                 Pub 0.14
         Coffee Shop 0.14
      Clothing Store 0.14
3
         Pizza Place 0.14
```

```
----Coulsdon----
               venue freq
         Pizza Place 0.17
0
  Italian Restaurant
                      0.17
2
         Coffee Shop
                      0.17
3
                 Pub 0.17
         Supermarket 0.17
----Covent Garden----
           venue freq
  Breakfast Spot
                   1.0
         Airport
                   0.0
1
2
       Multiplex
                   0.0
3
      Playground
                   0.0
        Platform
                   0.0
----Cowley----
          venue freq
0
        Stables
                  1.0
1
        Airport
                  0.0
  Movie Theater
                  0.0
3
       Platform
                  0.0
    Pizza Place
                  0.0
---Cranham----
                 venue freq
           Coffee Shop 0.09
0
                 Hotel 0.07
1
2
         Shopping Mall 0.07
3
        Clothing Store 0.07
  Fast Food Restaurant 0.05
----Crayford----
           venue freq
             Pub 0.10
```

```
Coffee Shop 0.10
  Clothing Store 0.10
     Supermarket 0.07
3
        Pharmacy 0.07
4
----Creekmouth----
                 venue freq
0
                  Pool 0.14
  Gym / Fitness Center 0.14
2
                  Park 0.14
3
           Supermarket 0.14
           Golf Course 0.14
----Crews Hill----
                       venue freq
                        Park 0.50
           Convenience Store 0.25
2 Construction & Landscaping 0.25
3
                   Irish Pub 0.00
          Italian Restaurant 0.00
----Crofton Park----
                 venue freq
     Polish Restaurant 0.17
  Fast Food Restaurant 0.17
2
          Veterinarian 0.17
3
                   Pub 0.17
4
                  Park 0.17
----Crook Log----
           venue freq
             Pub 0.10
     Coffee Shop 0.10
  Clothing Store 0.10
     Supermarket 0.07
```

```
Pharmacy 0.07
4
----Crossness----
           venue freq
             Pub 0.10
     Coffee Shop 0.10
2 Clothing Store 0.10
3
     Supermarket 0.07
4
        Pharmacy 0.07
----Crouch End----
             venue freq
              Park 0.33
  Business Service 0.33
2
        Skate Park 0.33
3
           Airport 0.00
     Music Store 0.00
----Croydon----
               venue freq
         Pizza Place 0.17
  Italian Restaurant 0.17
         Coffee Shop 0.17
3
                 Pub 0.17
         Supermarket 0.17
----Crystal Palace----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
             Bar 0.05
    Burger Joint 0.05
3
    Pizza Place 0.05
```

```
----Cubitt Town----
               venue freq
            Platform 0.17
   Food & Drink Shop
                     0.08
     Nature Preserve 0.08
3 Italian Restaurant 0.08
          Lighthouse 0.08
----Cudham----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
             Bar 0.05
2
    Burger Joint 0.05
    Pizza Place 0.05
----Custom House----
               venue freq
               Hotel 0.29
  Chinese Restaurant 0.07
      Sandwich Place 0.07
2
             Rafting 0.07
            Pharmacy 0.07
----Dagenham----
                 venue freq
                  Pool 0.14
1 Gym / Fitness Center 0.14
2
                  Park 0.14
3
           Supermarket 0.14
           Golf Course 0.14
----Dalston----
              venue freq
0 Indian Restaurant 0.38
```

```
Hotel 0.12
1
2
      Train Station 0.12
3
               Park 0.12
4
         Restaurant 0.12
----De Beauvoir Town----
              venue freq
0 Fish & Chips Shop 0.25
               Café 0.25
  Martial Arts Dojo 0.25
3
      Metro Station 0.25
        Music Store 0.00
----Denmark Hill----
             venue freq
       IT Services 0.33
   Harbor / Marina 0.33
  Business Service 0.33
3
       Music Store 0.00
       Playground 0.00
----Deptford----
                 venue freq
     Polish Restaurant 0.17
  Fast Food Restaurant 0.17
          Veterinarian 0.17
                   Pub 0.17
4
                  Park 0.17
----Derry Downs----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
2
             Bar 0.05
3
    Burger Joint 0.05
```

```
Pizza Place 0.05
----Dollis Hill----
        venue freq
          Pub
               0.5
  Golf Course
               0.5
     Airport
               0.0
2
    Multiplex
3
               0.0
    Platform
               0.0
----Downe----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
             Bar 0.05
3
    Burger Joint 0.05
    Pizza Place 0.05
----Downham----
                 venue freq
     Polish Restaurant 0.17
  Fast Food Restaurant 0.17
          Veterinarian 0.17
3
                   Pub 0.17
                 Park 0.17
----Dulwich----
             venue freq
       IT Services 0.33
   Harbor / Marina 0.33
  Business Service 0.33
       Music Store 0.00
3
       Playground 0.00
```

```
----Ealing----
             venue freq
      Home Service
                     0.5
   Business Service
                     0.5
2
           Airport
                     0.0
         Multiplex
                     0.0
          Platform
                     0.0
----Earlsfield----
                       venue freq
  Construction & Landscaping
                               0.5
                               0.5
                         Gym
2
                   Multiplex
                               0.0
                  Playground
                               0.0
                               0.0
                    Platform
----East Dulwich----
             venue freq
       IT Services 0.33
   Harbor / Marina 0.33
  Business Service 0.33
       Music Store 0.00
        Playground 0.00
----East Ham----
               venue freq
               Hotel 0.29
  Chinese Restaurant 0.07
2
      Sandwich Place 0.07
             Rafting 0.07
            Pharmacy 0.07
----East Sheen----
                venue freq
0 Sporting Goods Shop 0.2
```

```
American Restaurant
                        0.2
2
          Coffee Shop
                        0.2
        Train Station
                        0.2
3
       Soccer Stadium
                        0.2
4
----East Wickham----
           venue freq
0
             Pub 0.10
     Coffee Shop 0.10
1
2 Clothing Store 0.10
     Supermarket 0.07
3
        Pharmacy 0.07
----Eastcote----
          venue freq
        Stables
                 1.0
        Airport
                  0.0
  Movie Theater
                  0.0
3
       Platform
                 0.0
    Pizza Place
                  0.0
----Eden Park----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
             Bar 0.05
    Burger Joint 0.05
    Pizza Place 0.05
----Edmonton----
                       venue freq
                        Park 0.50
0
           Convenience Store 0.25
  Construction & Landscaping 0.25
                   Irish Pub 0.00
```

```
Italian Restaurant 0.00
4
----Eel Pie Island----
                venue freq
                        0.2
O Sporting Goods Shop
1 American Restaurant
                        0.2
          Coffee Shop
                        0.2
                        0.2
3
       Train Station
       Soccer Stadium
                        0.2
----Elephant and Castle----
             venue freq
       IT Services 0.33
   Harbor / Marina 0.33
  Business Service 0.33
3
       Music Store 0.00
        Playground 0.00
----Elm Park----
                 venue freq
           Coffee Shop 0.09
                 Hotel 0.07
2
         Shopping Mall 0.07
        Clothing Store 0.07
  Fast Food Restaurant 0.05
----Elmers End----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
             Bar 0.05
    Burger Joint 0.05
3
     Pizza Place 0.05
```

```
----Elmstead----
           venue freq
   Clothing Store 0.15
     Coffee Shop 0.13
2
             Bar 0.05
    Burger Joint 0.05
     Pizza Place 0.05
----Emerson Park----
                 venue freq
           Coffee Shop 0.09
                 Hotel 0.07
1
2
         Shopping Mall 0.07
        Clothing Store
                       0.07
  Fast Food Restaurant 0.05
----Enfield Highway----
                       venue freq
0
                        Park 0.50
           Convenience Store 0.25
  Construction & Landscaping 0.25
                   Irish Pub 0.00
          Italian Restaurant 0.00
----Enfield Lock----
                       venue freq
                        Park 0.50
0
           Convenience Store 0.25
2 Construction & Landscaping 0.25
3
                   Irish Pub 0.00
          Italian Restaurant 0.00
----Enfield Town----
                       venue freq
0
                        Park 0.50
```

```
Convenience Store 0.25
  Construction & Landscaping 0.25
                   Irish Pub 0.00
          Italian Restaurant 0.00
4
----Enfield Wash----
                       venue freq
0
                        Park 0.50
           Convenience Store 0.25
2 Construction & Landscaping 0.25
                   Irish Pub 0.00
          Italian Restaurant 0.00
4
----Erith----
           venue freq
             Pub 0.10
     Coffee Shop 0.10
  Clothing Store 0.10
     Supermarket 0.07
3
        Pharmacy 0.07
----Finsbury----
              venue freq
0 Fish & Chips Shop 0.25
               Café 0.25
2 Martial Arts Dojo 0.25
      Metro Station 0.25
3
        Music Store 0.00
----Fitzrovia----
             venue freq
        Skate Park 0.25
1
               Gym 0.25
       Rugby Pitch 0.25
  Business Service 0.25
```

```
Airport 0.00
4
----Foots Cray----
           venue freq
             Pub 0.10
     Coffee Shop 0.10
2 Clothing Store 0.10
     Supermarket 0.07
3
4
        Pharmacy 0.07
----Forest Gate----
               venue freq
               Hotel 0.29
  Chinese Restaurant 0.07
      Sandwich Place 0.07
2
             Rafting 0.07
3
4
            Pharmacy 0.07
----Forest Hill----
                 venue freq
     Polish Restaurant 0.17
  Fast Food Restaurant 0.17
          Veterinarian 0.17
3
                   Pub 0.17
                  Park 0.17
----Forestdale----
               venue freq
         Pizza Place 0.17
  Italian Restaurant 0.17
         Coffee Shop 0.17
3
                 Pub 0.17
         Supermarket 0.17
```

```
----Fortis Green----
             venue freq
              Park 0.33
  Business Service 0.33
2
        Skate Park 0.33
           Airport 0.00
       Music Store 0.00
----Freezywater----
                       venue freq
                        Park 0.50
           Convenience Store 0.25
2 Construction & Landscaping 0.25
                   Irish Pub 0.00
          Italian Restaurant 0.00
----Frognal----
             venue freq
        Skate Park 0.25
               Gym 0.25
2
       Rugby Pitch 0.25
  Business Service 0.25
           Airport 0.00
----Fulwell----
                venue freq
9 Sporting Goods Shop
                        0.2
1 American Restaurant
                        0.2
2
          Coffee Shop
                        0.2
3
        Train Station
                        0.2
       Soccer Stadium
                        0.2
----Gallows Corner----
                 venue freq
           Coffee Shop 0.09
```

```
Hotel 0.07
1
2
         Shopping Mall 0.07
        Clothing Store 0.07
3
  Fast Food Restaurant 0.05
----Gants Hill----
                 venue freq
        Clothing Store 0.10
0
           Supermarket 0.07
1
                Bakery 0.07
  Fast Food Restaurant 0.07
    Turkish Restaurant 0.05
----Gidea Park----
                 venue freq
           Coffee Shop
                       0.09
                 Hotel 0.07
         Shopping Mall 0.07
        Clothing Store 0.07
  Fast Food Restaurant 0.05
----Gipsy Hill----
           venue freq
     Coffee Shop 0.22
             Pub 0.22
1
     Supermarket 0.22
  Soccer Stadium 0.11
            Café 0.11
----Goddington----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
2
             Bar 0.05
3
    Burger Joint 0.05
```

```
Pizza Place 0.05
----Goodmayes----
                 venue freq
        Clothing Store 0.10
           Supermarket 0.07
1
2
                Bakery 0.07
3 Fast Food Restaurant 0.07
    Turkish Restaurant 0.05
----Gospel Oak----
             venue freq
        Skate Park 0.25
               Gym 0.25
       Rugby Pitch 0.25
  Business Service 0.25
3
           Airport 0.00
----Grange Park----
                       venue freq
0
                        Park 0.50
           Convenience Store 0.25
2 Construction & Landscaping 0.25
3
                   Irish Pub 0.00
          Italian Restaurant 0.00
----Greenford----
             venue freq
      Home Service
                   0.5
  Business Service
                   0.5
           Airport
                     0.0
3
         Multiplex
                     0.0
          Platform
                     0.0
```

```
----Grove Park----
                 venue freq
     Polish Restaurant 0.17
  Fast Food Restaurant 0.17
          Veterinarian 0.17
3
                   Pub 0.17
                  Park 0.17
----Hackney----
              venue freq
  Indian Restaurant 0.38
              Hotel 0.12
      Train Station 0.12
2
               Park 0.12
         Restaurant 0.12
----Hackney Central----
              venue freq
  Indian Restaurant 0.38
              Hotel 0.12
      Train Station 0.12
2
               Park 0.12
4
         Restaurant 0.12
----Hackney Marshes----
              venue freq
  Indian Restaurant 0.38
              Hotel 0.12
1
2
      Train Station 0.12
               Park 0.12
         Restaurant 0.12
----Hackney Wick----
              venue freq
0 Indian Restaurant 0.38
```

```
Hotel 0.12
1
2
      Train Station 0.12
3
               Park 0.12
4
         Restaurant 0.12
----Hadley Wood----
                       venue freq
0
                        Park 0.50
           Convenience Store 0.25
  Construction & Landscaping 0.25
                   Irish Pub 0.00
          Italian Restaurant 0.00
4
----Haggerston----
              venue freq
   Indian Restaurant 0.38
              Hotel 0.12
2
      Train Station 0.12
3
               Park 0.12
         Restaurant 0.12
----Hainault----
                 venue freq
        Clothing Store 0.10
0
1
           Supermarket 0.07
                Bakery 0.07
  Fast Food Restaurant 0.07
    Turkish Restaurant 0.05
----Ham----
                venue freq
0 Sporting Goods Shop
                        0.2
  American Restaurant
                        0.2
2
          Coffee Shop
                        0.2
3
        Train Station
                        0.2
```

```
Soccer Stadium 0.2
4
----Hampstead----
             venue freq
        Skate Park 0.25
               Gym 0.25
2
       Rugby Pitch 0.25
  Business Service 0.25
           Airport 0.00
4
----Hampton----
                venue freq
  Sporting Goods Shop
                         0.2
  American Restaurant
                        0.2
          Coffee Shop
                        0.2
3
        Train Station
                        0.2
       Soccer Stadium
                        0.2
----Hampton Hill----
                venue freq
  Sporting Goods Shop
                        0.2
  American Restaurant
                        0.2
          Coffee Shop
                        0.2
3
        Train Station
                        0.2
       Soccer Stadium
                        0.2
----Hampton Wick----
                venue freq
                         0.2
  Sporting Goods Shop
  American Restaurant
                        0.2
          Coffee Shop
                        0.2
        Train Station
                        0.2
3
       Soccer Stadium
                        0.2
```

```
----Hanwell----
             venue freq
      Home Service
                     0.5
                     0.5
  Business Service
                     0.0
2
           Airport
3
         Multiplex
                     0.0
          Platform
                     0.0
----Harefield----
          venue freq
        Stables
                  1.0
                  0.0
        Airport
1
  Movie Theater
                  0.0
3
       Platform
                  0.0
                  0.0
    Pizza Place
----Harlesden----
        venue freq
          Pub
                0.5
                0.5
  Golf Course
      Airport
                0.0
2
    Multiplex
                0.0
     Platform
                0.0
----Harlington----
          venue freq
        Stables
                  1.0
0
1
        Airport
                  0.0
  Movie Theater
                  0.0
3
       Platform
                  0.0
    Pizza Place
                  0.0
----Harmondsworth----
          venue freq
0
        Stables
                  1.0
```

```
Airport
                  0.0
   Movie Theater
                  0.0
       Platform
                  0.0
3
    Pizza Place
                  0.0
----Harold Hill----
                 venue freq
0
           Coffee Shop 0.09
                 Hotel 0.07
1
2
         Shopping Mall 0.07
        Clothing Store 0.07
  Fast Food Restaurant 0.05
----Harold Park----
                 venue freq
           Coffee Shop
                        0.09
                 Hotel 0.07
2
         Shopping Mall
                        0.07
        Clothing Store
                        0.07
  Fast Food Restaurant 0.05
----Harold Wood----
                 venue freq
           Coffee Shop 0.09
1
                 Hotel 0.07
2
         Shopping Mall 0.07
        Clothing Store 0.07
4 Fast Food Restaurant 0.05
----Harringay----
             venue freq
              Park 0.33
   Business Service 0.33
2
        Skate Park 0.33
3
           Airport 0.00
```

```
Music Store 0.00
4
----Havering-atte-Bower----
                 venue freq
           Coffee Shop 0.09
                 Hotel 0.07
        Shopping Mall 0.07
        Clothing Store 0.07
  Fast Food Restaurant 0.05
----Hayes----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.12
    Burger Joint 0.05
3
             Bar 0.05
    Pizza Place 0.05
----Hazelwood----
           venue freq
  Clothing Store 0.15
1
     Coffee Shop 0.13
             Bar 0.05
3
    Burger Joint 0.05
    Pizza Place 0.05
----Herne Hill----
           venue freq
     Coffee Shop 0.22
             Pub 0.22
     Supermarket 0.22
  Soccer Stadium 0.11
            Café 0.11
```

```
----Highbury----
              venue freq
  Fish & Chips Shop 0.25
               Café 0.25
  Martial Arts Dojo 0.25
      Metro Station 0.25
        Music Store 0.00
----Highgate----
             venue freq
        Skate Park 0.25
               Gym 0.25
1
       Rugby Pitch 0.25
  Business Service 0.25
           Airport 0.00
----Hillingdon----
          venue freq
        Stables
                  1.0
0
        Airport
                  0.0
  Movie Theater
                  0.0
       Platform
                 0.0
    Pizza Place
                  0.0
----Hither Green----
                 venue freq
     Polish Restaurant 0.17
  Fast Food Restaurant 0.17
2
          Veterinarian 0.17
                   Pub 0.17
                  Park 0.17
----Holborn----
             venue freq
        Skate Park 0.25
```

```
Gym 0.25
1
2
       Rugby Pitch 0.25
  Business Service 0.25
           Airport 0.00
----Holloway----
              venue freq
0 Fish & Chips Shop 0.25
               Café 0.25
2 Martial Arts Dojo 0.25
3
      Metro Station 0.25
        Music Store 0.00
----Homerton----
              venue freq
  Indian Restaurant 0.38
              Hotel 0.12
2
      Train Station 0.12
3
               Park 0.12
         Restaurant 0.12
----Honor Oak----
                 venue freq
     Polish Restaurant 0.17
  Fast Food Restaurant 0.17
          Veterinarian 0.17
                   Pub 0.17
                  Park 0.17
----Hook----
           venue freq
  Clothing Store
                  1.0
         Airport
                   0.0
2
     Music Store
                   0.0
3
     Playground
                   0.0
```

```
Platform 0.0
4
----Hornchurch----
                 venue freq
           Coffee Shop 0.09
                 Hotel 0.07
        Shopping Mall 0.07
        Clothing Store 0.07
  Fast Food Restaurant 0.05
----Hornsey----
             venue freq
              Park 0.33
  Business Service 0.33
2
        Skate Park 0.33
3
           Airport 0.00
       Music Store 0.00
4
----Hoxton----
              venue freq
  Indian Restaurant 0.38
              Hotel 0.12
      Train Station 0.12
3
               Park 0.12
         Restaurant 0.12
----Ickenham----
          venue freq
        Stables
                 1.0
        Airport
                  0.0
  Movie Theater
                  0.0
       Platform
                 0.0
3
    Pizza Place
                  0.0
```

```
----Ilford----
                 venue freq
        Clothing Store 0.10
           Supermarket 0.07
1
                Bakery 0.07
  Fast Food Restaurant 0.07
    Turkish Restaurant 0.05
----Isle of Dogs----
               venue freq
            Platform
                     0.17
   Food & Drink Shop
                     0.08
     Nature Preserve 0.08
  Italian Restaurant 0.08
          Lighthouse 0.08
----Islington----
              venue freq
0 Fish & Chips Shop 0.25
               Café 0.25
  Martial Arts Dojo 0.25
      Metro Station 0.25
        Music Store 0.00
----Kenley----
               venue freq
         Pizza Place 0.17
  Italian Restaurant 0.17
2
         Coffee Shop 0.17
                 Pub 0.17
         Supermarket 0.17
----Kensal Green----
        venue freq
0
          Pub
                0.5
```

```
Golf Course
                0.5
2
      Airport
                0.0
    Multiplex
                0.0
3
     Platform
                0.0
----Kentish Town----
             venue freq
0
        Skate Park 0.25
1
               Gym 0.25
       Rugby Pitch 0.25
   Business Service 0.25
           Airport 0.00
----Keston----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
             Bar 0.05
3
    Burger Joint 0.05
     Pizza Place 0.05
----Kew----
                venue freq
0 Sporting Goods Shop
                        0.2
  American Restaurant
                        0.2
                        0.2
2
          Coffee Shop
       Train Station
                        0.2
       Soccer Stadium
----Kingsbury----
        venue freq
          Pub
                0.5
  Golf Course
                0.5
2
      Airport
                0.0
3
    Multiplex
                0.0
```

```
Platform 0.0
4
----Kingston Vale----
           venue freq
  Clothing Store
                   1.0
1
         Airport
                   0.0
2
     Music Store
                   0.0
3
      Playground
                   0.0
4
        Platform
                   0.0
----Kingston upon Thames----
           venue freq
  Clothing Store
                   1.0
1
         Airport
                   0.0
2
     Music Store
                   0.0
      Playground
3
                   0.0
4
        Platform
                   0.0
----Knightsbridge----
           venue freq
  Breakfast Spot
                   1.0
1
         Airport
                   0.0
2
       Multiplex
                   0.0
3
      Playground
                   0.0
        Platform
                   0.0
----Ladywell----
                  venue freq
     Polish Restaurant 0.17
  Fast Food Restaurant 0.17
          Veterinarian 0.17
3
                   Pub 0.17
                  Park 0.17
```

```
----Lambeth----
           venue freq
     Coffee Shop 0.22
             Pub 0.22
1
     Supermarket 0.22
  Soccer Stadium 0.11
            Café 0.11
----Lamorbey----
           venue freq
             Pub 0.10
     Coffee Shop 0.10
1
2 Clothing Store 0.10
3
     Supermarket 0.07
        Pharmacy 0.07
----Lea Bridge----
              venue freq
  Indian Restaurant 0.38
              Hotel 0.12
2
      Train Station 0.12
               Park 0.12
         Restaurant 0.12
----Leamouth----
               venue freq
            Platform 0.17
  Food & Drink Shop 0.08
     Nature Preserve 0.08
  Italian Restaurant 0.08
          Lighthouse 0.08
----Leaves Green----
           venue freq
0 Clothing Store 0.15
```

```
Coffee Shop 0.13
2
             Bar 0.05
    Burger Joint 0.05
3
    Pizza Place 0.05
----Lee----
                 venue freq
     Polish Restaurant 0.17
1 Fast Food Restaurant 0.17
          Veterinarian 0.17
3
                  Pub 0.17
                 Park 0.17
4
----Lessness Heath----
           venue freq
             Pub 0.10
     Coffee Shop 0.10
2 Clothing Store 0.10
     Supermarket 0.07
3
        Pharmacy 0.07
----Lewisham----
                 venue freq
     Polish Restaurant 0.17
1 Fast Food Restaurant 0.17
          Veterinarian 0.17
                  Pub 0.17
                 Park 0.17
----Limehouse----
               venue freq
            Platform
                     0.17
  Food & Drink Shop 0.08
     Nature Preserve 0.08
3 Italian Restaurant 0.08
```

```
Lighthouse 0.08
4
----Lisson Grove----
           venue freq
  Breakfast Spot
                   1.0
         Airport
                   0.0
1
2
       Multiplex
                   0.0
      Playground
3
                   0.0
        Platform
                   0.0
----Little Ilford----
               venue freq
               Hotel 0.29
  Chinese Restaurant 0.07
      Sandwich Place 0.07
2
3
             Rafting 0.07
4
            Pharmacy 0.07
----Little Venice----
           venue freq
   Breakfast Spot
                   1.0
1
         Airport
                   0.0
2
       Multiplex
                   0.0
3
      Playground
                   0.0
        Platform
                   0.0
----Locksbottom----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
             Bar 0.05
3
    Burger Joint 0.05
     Pizza Place 0.05
```

```
----Longford----
                freq
          venue
        Stables
                  1.0
0
        Airport
                  0.0
  Movie Theater
                  0.0
       Platform
                  0.0
3
    Pizza Place
                  0.0
----Longlands----
           venue freq
             Pub 0.10
     Coffee Shop 0.10
1
2 Clothing Store 0.10
3
     Supermarket 0.07
        Pharmacy 0.07
----Lower Clapton----
              venue freq
   Indian Restaurant 0.38
              Hotel 0.12
2
      Train Station 0.12
               Park 0.12
         Restaurant 0.12
----Lower Morden----
        venue freq
          Pub
                1.0
0
1
     Airport
                0.0
2
    Multiplex
                0.0
     Platform
                0.0
4 Pizza Place
                0.0
----Loxford----
                 venue freq
0
        Clothing Store 0.10
```

```
Supermarket 0.07
1
                Bakery 0.07
  Fast Food Restaurant 0.07
    Turkish Restaurant 0.05
----Maida Vale----
           venue freq
   Breakfast Spot
                   1.0
         Airport
                   0.0
1
2
       Multiplex
                   0.0
3
      Playground
                   0.0
        Platform
                   0.0
----Malden Rushett----
           venue freq
  Clothing Store
                   1.0
         Airport
                   0.0
     Music Store
                   0.0
3
      Playground
                   0.0
        Platform
                   0.0
----Manor House----
              venue freq
   Indian Restaurant 0.38
              Hotel 0.12
2
      Train Station 0.12
               Park 0.12
         Restaurant 0.12
----Manor Park----
               venue freq
               Hotel 0.29
  Chinese Restaurant 0.07
      Sandwich Place 0.07
2
3
             Rafting 0.07
```

```
Pharmacy 0.07
4
----Marks Gate----
                 venue freq
                  Pool 0.14
  Gym / Fitness Center 0.14
                  Park 0.14
           Supermarket 0.14
3
4
           Golf Course 0.14
----Maryland----
               venue freq
               Hotel 0.29
  Chinese Restaurant 0.07
      Sandwich Place 0.07
2
             Rafting 0.07
3
4
            Pharmacy 0.07
----Marylebone----
           venue freq
  Breakfast Spot
                   1.0
1
         Airport
                   0.0
2
       Multiplex
                   0.0
3
      Playground
                   0.0
        Platform
                   0.0
----Mayfair----
           venue freq
  Breakfast Spot
                   1.0
         Airport
                   0.0
       Multiplex
                   0.0
3
      Playground
                   0.0
        Platform
                   0.0
```

```
----Merton Park----
        venue freq
          Pub
                1.0
1
    Airport
                0.0
2
    Multiplex
                0.0
     Platform
               0.0
  Pizza Place
               0.0
----Mile End----
               venue freq
            Platform
                      0.17
   Food & Drink Shop
                      0.08
     Nature Preserve 0.08
  Italian Restaurant 0.08
          Lighthouse 0.08
----Millbank----
           venue freq
   Breakfast Spot
                   1.0
         Airport
                   0.0
2
       Multiplex
                   0.0
      Playground
                   0.0
        Platform
                   0.0
----Millwall----
               venue freq
            Platform
                     0.17
   Food & Drink Shop
                     0.08
     Nature Preserve 0.08
  Italian Restaurant 0.08
          Lighthouse 0.08
----Mitcham----
        venue freq
0
          Pub
               1.0
```

```
Airport
                 0.0
1
2
    Multiplex
                 0.0
     Platform
                 0.0
  Pizza Place
                 0.0
----Morden----
                freq
         venue
0
          Pub
                1.0
     Airport
                 0.0
1
2
    Multiplex
                 0.0
     Platform
                0.0
4 Pizza Place
                0.0
----Morden Park----
        venue freq
           Pub
                1.0
1
                0.0
     Airport
2
    Multiplex
                0.0
     Platform
                0.0
  Pizza Place
                0.0
----Mortlake----
                 venue freq
  Sporting Goods Shop
                         0.2
   American Restaurant
                         0.2
2
                         0.2
          Coffee Shop
3
       Train Station
                         0.2
        Soccer Stadium
                         0.2
----Motspur Park----
            venue freq
  Clothing Store
                    1.0
1
          Airport
                    0.0
2
     Music Store
                    0.0
3
      Playground
                    0.0
```

```
Platform 0.0
4
----Mottingham----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
2
             Bar 0.05
    Burger Joint 0.05
3
    Pizza Place 0.05
----Nag's Head----
              venue freq
0 Fish & Chips Shop 0.25
               Café 0.25
2 Martial Arts Dojo 0.25
      Metro Station 0.25
3
4
        Music Store 0.00
---Neasden----
        venue freq
          Pub
                0.5
  Golf Course
               0.5
     Airport
2
              0.0
3
    Multiplex
              0.0
    Platform
               0.0
----New Addington----
               venue freq
         Pizza Place 0.17
  Italian Restaurant 0.17
         Coffee Shop 0.17
3
                 Pub 0.17
         Supermarket 0.17
```

```
----New Cross----
                 venue freq
      Polish Restaurant 0.17
   Fast Food Restaurant 0.17
2
          Veterinarian 0.17
3
                   Pub 0.17
                  Park 0.17
----New Malden----
           venue freq
  Clothing Store
                   1.0
         Airport
                   0.0
1
     Music Store
2
                   0.0
      Playground
                   0.0
        Platform
                   0.0
----Newbury Park----
                 venue freq
        Clothing Store 0.10
0
1
           Supermarket 0.07
                Bakery 0.07
  Fast Food Restaurant 0.07
    Turkish Restaurant 0.05
---Newington----
             venue freq
       IT Services 0.33
   Harbor / Marina 0.33
  Business Service 0.33
3
       Music Store 0.00
        Playground 0.00
----Nine Elms----
                       venue freq
0 Construction & Landscaping
                               0.5
```

```
0.5
1
                         Gym
2
                   Multiplex
                               0.0
3
                  Playground
                               0.0
4
                    Platform
                               0.0
----Noak Hill----
                 venue freq
0
           Coffee Shop 0.09
1
                 Hotel 0.07
2
         Shopping Mall 0.07
        Clothing Store 0.07
  Fast Food Restaurant 0.05
----Norbiton----
                 freq
           venue
  Clothing Store
                   1.0
1
         Airport
                   0.0
2
     Music Store
                   0.0
3
      Playground
                   0.0
        Platform
                   0.0
----Norbury----
               venue freq
         Pizza Place 0.17
  Italian Restaurant 0.17
2
         Coffee Shop 0.17
3
                  Pub 0.17
4
         Supermarket 0.17
----North Cray----
           venue freq
             Pub 0.10
0
     Coffee Shop 0.10
  Clothing Store 0.10
3
      Supermarket 0.07
```

```
Pharmacy 0.07
4
----North End----
           venue freq
             Pub 0.10
     Coffee Shop 0.10
2 Clothing Store 0.10
3
     Supermarket 0.07
4
        Pharmacy 0.07
----North Ockendon----
                 venue freq
           Coffee Shop 0.09
                 Hotel 0.07
         Shopping Mall 0.07
3
        Clothing Store
                        0.07
  Fast Food Restaurant 0.05
----North Sheen----
                venue freq
  Sporting Goods Shop
                        0.2
  American Restaurant
                        0.2
          Coffee Shop
                        0.2
3
        Train Station
                        0.2
       Soccer Stadium
                        0.2
----North Woolwich----
               venue freq
               Hotel 0.29
  Chinese Restaurant 0.07
      Sandwich Place 0.07
             Rafting 0.07
3
            Pharmacy 0.07
```

```
----Northolt----
              venue freq
      Home Service
                     0.5
   Business Service
                     0.5
2
           Airport
                     0.0
         Multiplex
                     0.0
          Platform
                     0.0
----Northumberland Heath----
           venue freq
             Pub 0.10
     Coffee Shop 0.10
1
2 Clothing Store 0.10
3
     Supermarket 0.07
        Pharmacy 0.07
----Northwood----
          venue freq
0
        Stables
                  1.0
1
        Airport
                  0.0
  Movie Theater
                  0.0
       Platform
                  0.0
    Pizza Place
                  0.0
----Norwood Green----
             venue freq
      Home Service
                     0.5
   Business Service
                     0.5
2
           Airport
                     0.0
3
         Multiplex
                     0.0
          Platform
                     0.0
---Nunhead----
             venue freq
       IT Services 0.33
```

```
Harbor / Marina 0.33
   Business Service 0.33
       Music Store 0.00
3
        Playground 0.00
4
----Old Coulsdon----
               venue freq
         Pizza Place 0.17
   Italian Restaurant 0.17
2
         Coffee Shop 0.17
3
                 Pub 0.17
         Supermarket 0.17
4
----Old Ford----
               venue freq
            Platform
                      0.17
   Food & Drink Shop
                     0.08
     Nature Preserve 0.08
3 Italian Restaurant 0.08
          Lighthouse 0.08
----Old Malden----
           venue freq
  Clothing Store
         Airport
                   0.0
1
2
     Music Store
                   0.0
3
     Playground
                   0.0
        Platform
                   0.0
----Orpington----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
2
             Bar 0.05
3
    Burger Joint 0.05
```

```
Pizza Place 0.05
----0val----
           venue freq
     Coffee Shop 0.22
             Pub 0.22
     Supermarket 0.22
  Soccer Stadium 0.11
            Café 0.11
----Paddington----
           venue freq
  Breakfast Spot
                   1.0
         Airport
                   0.0
2
       Multiplex
                   0.0
3
      Playground
                   0.0
        Platform
                  0.0
----Palmers Green----
                       venue freq
0
                        Park 0.50
           Convenience Store 0.25
2 Construction & Landscaping 0.25
3
                   Irish Pub 0.00
          Italian Restaurant 0.00
----Peckham----
             venue freq
       IT Services 0.33
   Harbor / Marina 0.33
  Business Service 0.33
       Music Store 0.00
3
       Playground 0.00
```

```
----Penge----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
2
             Bar 0.05
    Burger Joint 0.05
    Pizza Place 0.05
----Pentonville----
              venue freq
0 Fish & Chips Shop 0.25
               Café 0.25
2 Martial Arts Dojo 0.25
3
      Metro Station 0.25
        Music Store 0.00
----Perivale----
             venue freq
      Home Service
                     0.5
   Business Service
                     0.5
                     0.0
2
           Airport
         Multiplex
                     0.0
          Platform
                     0.0
----Petersham----
                venue freq
9 Sporting Goods Shop
                        0.2
1 American Restaurant
                        0.2
2
          Coffee Shop
                        0.2
3
                        0.2
        Train Station
       Soccer Stadium
                        0.2
----Petts Wood----
           venue freq
0 Clothing Store 0.15
```

```
Coffee Shop 0.13
1
2
             Bar 0.05
3
    Burger Joint 0.05
     Pizza Place 0.05
----Pimlico----
           venue freq
  Breakfast Spot
                   1.0
         Airport
                   0.0
1
2
       Multiplex
                   0.0
3
      Playground
                   0.0
        Platform
                   0.0
----Plaistow----
           venue freq
  Clothing Store 0.11
     Coffee Shop 0.09
           Hotel 0.08
3 Sandwich Place 0.04
             Bar 0.04
----Ponders End----
                       venue freq
                        Park 0.50
0
           Convenience Store 0.25
2 Construction & Landscaping 0.25
                   Irish Pub 0.00
          Italian Restaurant 0.00
----Poplar----
               venue freq
            Platform 0.17
   Food & Drink Shop 0.08
     Nature Preserve 0.08
3 Italian Restaurant 0.08
```

```
Lighthouse 0.08
4
----Pratt's Bottom----
           venue freq
0 Clothing Store 0.15
     Coffee Shop 0.13
2
             Bar 0.05
3
    Burger Joint 0.05
    Pizza Place 0.05
----Preston----
        venue freq
          Pub
               0.5
1 Golf Course
               0.5
     Airport
2
              0.0
3
    Multiplex
              0.0
    Platform
              0.0
----Primrose Hill----
             venue freq
        Skate Park 0.25
0
               Gym 0.25
       Rugby Pitch 0.25
  Business Service 0.25
           Airport 0.00
----Purley----
               venue freq
         Pizza Place 0.17
  Italian Restaurant 0.17
         Coffee Shop 0.17
3
                 Pub 0.17
         Supermarket 0.17
```

```
----Putney----
                       venue freq
                               0.5
  Construction & Landscaping
                               0.5
                         Gym
2
                   Multiplex
                               0.0
                               0.0
                  Playground
                    Platform
                               0.0
----Queen's Park----
        venue freq
          Pub
                0.5
  Golf Course
                0.5
2
      Airport
                0.0
    Multiplex
                0.0
     Platform
                0.0
----Rainham----
                 venue freq
           Coffee Shop 0.09
1
                 Hotel 0.07
         Shopping Mall 0.07
2
        Clothing Store 0.07
  Fast Food Restaurant 0.05
----Ratcliff----
               venue freq
            Platform
                     0.17
   Food & Drink Shop
                     0.08
     Nature Preserve 0.08
  Italian Restaurant 0.08
          Lighthouse 0.08
----Raynes Park----
        venue freq
0
          Pub
               1.0
```

```
Airport
1
                0.0
2
    Multiplex
                0.0
     Platform
                0.0
  Pizza Place
                0.0
----Redbridge----
                  venue freq
        Clothing Store 0.10
0
            Supermarket 0.07
1
2
                 Bakery 0.07
  Fast Food Restaurant 0.07
    Turkish Restaurant 0.05
----Richmond----
                       freq
                 venue
  Sporting Goods Shop
                         0.2
  American Restaurant
                         0.2
          Coffee Shop
                         0.2
        Train Station
3
                         0.2
       Soccer Stadium
                         0.2
----Riddlesdown----
                venue freq
         Pizza Place
                      0.17
  Italian Restaurant
                      0.17
2
         Coffee Shop 0.17
3
                  Pub 0.17
4
         Supermarket 0.17
----Roehampton----
                        venue freq
  Construction & Landscaping
                                0.5
1
                               0.5
                          Gym
2
                   Multiplex
                                0.0
3
                  Playground
                                0.0
```

```
Platform 0.0
4
----Romford----
                 venue freq
           Coffee Shop 0.09
                 Hotel 0.07
         Shopping Mall 0.07
        Clothing Store 0.07
  Fast Food Restaurant 0.05
----Rotherhithe----
             venue freq
       IT Services 0.33
   Harbor / Marina 0.33
  Business Service 0.33
3
       Music Store 0.00
        Playground 0.00
4
----Ruislip----
          venue freq
        Stables
                 1.0
0
        Airport
                  0.0
  Movie Theater
                  0.0
3
       Platform
                  0.0
    Pizza Place
                  0.0
----Rush Green----
                 venue freq
                  Pool 0.14
  Gym / Fitness Center 0.14
                  Park 0.14
3
           Supermarket 0.14
           Golf Course 0.14
```

```
----Sanderstead----
               venue freq
         Pizza Place 0.17
  Italian Restaurant
                     0.17
2
         Coffee Shop 0.17
                 Pub 0.17
         Supermarket 0.17
----Selhurst----
               venue freq
         Pizza Place 0.17
  Italian Restaurant 0.17
         Coffee Shop 0.17
2
                 Pub 0.17
         Supermarket 0.17
----Selsdon----
               venue freq
         Pizza Place 0.17
  Italian Restaurant 0.17
         Coffee Shop 0.17
2
                 Pub 0.17
         Supermarket 0.17
----Seven Kings----
                 venue freq
        Clothing Store 0.10
0
1
           Supermarket 0.07
2
                Bakery 0.07
  Fast Food Restaurant 0.07
    Turkish Restaurant 0.05
----Seven Sisters----
             venue freq
0
              Park 0.33
```

```
Business Service 0.33
2
        Skate Park 0.33
3
           Airport 0.00
       Music Store 0.00
4
----Shacklewell----
              venue freq
  Indian Restaurant 0.38
              Hotel 0.12
1
2
      Train Station 0.12
               Park 0.12
4
         Restaurant 0.12
---Shadwell----
               venue freq
            Platform
                     0.17
   Food & Drink Shop
                     0.08
     Nature Preserve 0.08
3 Italian Restaurant 0.08
          Lighthouse 0.08
----Shirley----
               venue freq
         Pizza Place 0.17
  Italian Restaurant 0.17
         Coffee Shop 0.17
                 Pub 0.17
         Supermarket 0.17
----Shoreditch----
              venue freq
  Indian Restaurant 0.38
              Hotel 0.12
2
      Train Station 0.12
3
               Park 0.12
```

```
Restaurant 0.12
4
----Sidcup----
           venue freq
             Pub 0.10
     Coffee Shop 0.10
2 Clothing Store 0.10
     Supermarket 0.07
3
4
        Pharmacy 0.07
----Silvertown----
               venue freq
               Hotel 0.29
  Chinese Restaurant 0.07
      Sandwich Place 0.07
2
             Rafting 0.07
3
4
            Pharmacy 0.07
----Sipson----
          venue freq
        Stables
                 1.0
0
        Airport
                0.0
2 Movie Theater
                 0.0
3
       Platform 0.0
    Pizza Place
                 0.0
----Slade Green----
           venue freq
             Pub 0.10
     Coffee Shop 0.10
2 Clothing Store 0.10
     Supermarket 0.07
3
        Pharmacy 0.07
```

```
----Soho----
           venue freq
   Breakfast Spot
                   1.0
         Airport
                   0.0
2
       Multiplex
                   0.0
      Playground
                   0.0
        Platform
                   0.0
----Somerstown----
             venue freq
        Skate Park 0.25
               Gym 0.25
1
       Rugby Pitch 0.25
   Business Service 0.25
           Airport 0.00
----South Croydon----
               venue freq
         Pizza Place 0.17
   Italian Restaurant
                     0.17
         Coffee Shop 0.17
2
                 Pub 0.17
         Supermarket 0.17
----South Hackney----
              venue freq
   Indian Restaurant 0.38
              Hotel 0.12
1
2
      Train Station 0.12
3
               Park 0.12
         Restaurant 0.12
----South Hornchurch----
                 venue freq
0
           Coffee Shop 0.09
```

```
Hotel 0.07
1
2
         Shopping Mall 0.07
3
        Clothing Store 0.07
  Fast Food Restaurant 0.05
----South Norwood----
               venue freq
         Pizza Place 0.17
  Italian Restaurant 0.17
2
         Coffee Shop 0.17
                 Pub 0.17
4
         Supermarket 0.17
----South Ruislip----
          venue freq
        Stables
                 1.0
        Airport
                  0.0
  Movie Theater
                  0.0
3
       Platform
                  0.0
    Pizza Place
                  0.0
----South Tottenham----
             venue freq
              Park 0.33
  Business Service 0.33
2
        Skate Park 0.33
3
           Airport 0.00
       Music Store 0.00
----South Wimbledon----
        venue freq
          Pub
                1.0
1
                0.0
     Airport
2
    Multiplex
                0.0
3
     Platform
                0.0
```

```
4 Pizza Place 0.0
----South Woodford----
                 venue freq
        Clothing Store 0.10
1
           Supermarket 0.07
2
                Bakery 0.07
3 Fast Food Restaurant 0.07
    Turkish Restaurant 0.05
----Southall----
             venue freq
      Home Service
                    0.5
  Business Service
                     0.5
2
           Airport
                     0.0
3
         Multiplex
                     0.0
          Platform
                     0.0
----Southborough----
           venue freq
  Clothing Store 0.15
1
     Coffee Shop 0.13
             Bar 0.05
3
    Burger Joint 0.05
    Pizza Place 0.05
----Southend----
                 venue freq
     Polish Restaurant 0.17
  Fast Food Restaurant 0.17
          Veterinarian 0.17
3
                   Pub 0.17
                  Park 0.17
```

```
----Southfields----
                       venue freq
   Construction & Landscaping
                               0.5
                               0.5
                         Gym
2
                   Multiplex
                               0.0
                  Playground
                               0.0
                    Platform
                               0.0
----Southgate----
                       venue freq
                        Park 0.50
           Convenience Store 0.25
2 Construction & Landscaping 0.25
                   Irish Pub 0.00
          Italian Restaurant 0.00
----Spitalfields----
               venue freq
            Platform 0.17
   Food & Drink Shop 0.08
     Nature Preserve 0.08
  Italian Restaurant 0.08
          Lighthouse 0.08
----St Giles----
             venue freq
        Skate Park 0.25
               Gym 0.25
1
       Rugby Pitch 0.25
   Business Service 0.25
           Airport 0.00
----St Helier----
        venue freq
0
          Pub
               1.0
```

```
Airport
                0.0
1
2
    Multiplex
                0.0
     Platform
                0.0
  Pizza Place
                0.0
----St James's----
           venue freq
   Breakfast Spot
                   1.0
         Airport
1
                   0.0
2
       Multiplex
                   0.0
3
      Playground
                   0.0
        Platform
                   0.0
----St John's Wood----
           venue freq
   Breakfast Spot
                   1.0
1
         Airport
                   0.0
       Multiplex
                   0.0
3
      Playground
                   0.0
        Platform
                   0.0
----St Johns----
                 venue freq
     Polish Restaurant 0.17
   Fast Food Restaurant 0.17
2
          Veterinarian 0.17
3
                   Pub 0.17
4
                  Park 0.17
----St Luke's----
              venue freq
0 Fish & Chips Shop 0.25
               Café 0.25
  Martial Arts Dojo 0.25
      Metro Station 0.25
```

```
Music Store 0.00
4
----St Margarets----
                venue freq
                       0.2
0 Sporting Goods Shop
1 American Restaurant
                       0.2
          Coffee Shop 0.2
      Train Station 0.2
3
   Soccer Stadium
                       0.2
----St Mary Cray----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
             Bar 0.05
    Burger Joint 0.05
3
    Pizza Place 0.05
----St Pancras----
             venue freq
        Skate Park 0.25
               Gym 0.25
       Rugby Pitch 0.25
  Business Service 0.25
           Airport 0.00
----St Paul's Cray----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
             Bar 0.05
    Burger Joint 0.05
3
    Pizza Place 0.05
```

```
----Stamford Hill----
              venue freq
  Indian Restaurant 0.38
              Hotel 0.12
      Train Station 0.12
2
               Park 0.12
         Restaurant 0.12
----Stepney----
               venue freq
            Platform 0.17
  Food & Drink Shop 0.08
     Nature Preserve 0.08
  Italian Restaurant 0.08
          Lighthouse 0.08
----Stockwell----
           venue freq
     Coffee Shop 0.22
             Pub 0.22
     Supermarket 0.22
2
  Soccer Stadium 0.11
            Café 0.11
----Stoke Newington----
              venue freq
  Indian Restaurant 0.38
              Hotel 0.12
1
2
     Train Station 0.12
3
               Park 0.12
         Restaurant 0.12
----Stonebridge----
        venue freq
0
          Pub
               0.5
```

```
Golf Course
                0.5
2
      Airport
                0.0
    Multiplex
3
               0.0
    Platform
               0.0
----Stratford----
               venue freq
               Hotel 0.29
  Chinese Restaurant 0.07
      Sandwich Place 0.07
2
3
            Rafting 0.07
4
            Pharmacy 0.07
----Strawberry Hill----
                venue freq
  Sporting Goods Shop
                        0.2
1 American Restaurant
                        0.2
          Coffee Shop
                        0.2
        Train Station
3
                        0.2
       Soccer Stadium
                        0.2
----Streatham----
           venue freq
     Coffee Shop 0.22
1
             Pub 0.22
     Supermarket 0.22
  Soccer Stadium 0.11
            Café 0.11
----Stroud Green----
             venue freq
              Park 0.33
  Business Service 0.33
2
        Skate Park 0.33
3
           Airport 0.00
```

```
Music Store 0.00
4
----Sundridge----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
2
             Bar 0.05
    Burger Joint 0.05
3
    Pizza Place 0.05
----Surbiton----
           venue freq
  Clothing Store
                   1.0
         Airport
                   0.0
     Music Store
                   0.0
     Playground
3
                   0.0
        Platform
                  0.0
----Surrey Quays----
             venue freq
       IT Services 0.33
   Harbor / Marina 0.33
2 Business Service 0.33
3
      Music Store 0.00
       Playground 0.00
----Sutton----
          venue freq
  Historic Site
                 1.0
        Airport
                0.0
    Multiplex
                0.0
      Platform
                 0.0
3
    Pizza Place
                  0.0
```

```
----Swiss Cottage----
             venue freq
        Skate Park 0.25
               Gym 0.25
1
2
       Rugby Pitch 0.25
   Business Service 0.25
           Airport 0.00
----Teddington----
                venue freq
0 Sporting Goods Shop
                        0.2
  American Restaurant
                        0.2
          Coffee Shop
                        0.2
2
3
       Train Station
                        0.2
       Soccer Stadium
                        0.2
----Thornton Heath----
               venue freq
         Pizza Place 0.17
   Italian Restaurant
                     0.17
         Coffee Shop 0.17
2
                 Pub 0.17
         Supermarket 0.17
----Tokyngton----
        venue freq
          Pub
                0.5
  Golf Course
                0.5
2
      Airport
                0.0
3
    Multiplex
                0.0
     Platform
                0.0
----Tolworth----
           venue freq
0 Clothing Store
                  1.0
```

```
0.0
1
         Airport
2
     Music Store
                   0.0
3
      Playground
                   0.0
        Platform
                   0.0
4
----Tooting----
                       venue freq
                                0.5
  Construction & Landscaping
                               0.5
1
                          Gym
2
                   Multiplex
                               0.0
3
                  Playground
                                0.0
                    Platform
                                0.0
4
----Tooting Bec----
                              freq
                        venue
  Construction & Landscaping
                                0.5
                               0.5
                          Gym
2
                   Multiplex
                                0.0
3
                  Playground
                                0.0
                    Platform
                                0.0
----Tottenham----
             venue freq
              Park 0.33
  Business Service 0.33
2
        Skate Park 0.33
3
           Airport 0.00
       Music Store 0.00
----Tottenham Green----
             venue freq
              Park 0.33
  Business Service 0.33
2
        Skate Park 0.33
3
           Airport 0.00
```

```
Music Store 0.00
4
----Tottenham Hale----
             venue freq
              Park 0.33
  Business Service 0.33
        Skate Park 0.33
3
         Airport 0.00
  Music Store 0.00
----Tower Hill----
               venue freq
            Platform 0.17
  Food & Drink Shop 0.08
     Nature Preserve 0.08
  Italian Restaurant 0.08
          Lighthouse 0.08
----Tulse Hill----
           venue freq
     Coffee Shop 0.22
             Pub 0.22
     Supermarket 0.22
  Soccer Stadium 0.11
            Café 0.11
----Turnpike Lane----
            venue freq
              Park 0.33
  Business Service 0.33
        Skate Park 0.33
           Airport 0.00
3
       Music Store 0.00
```

```
----Twickenham----
                venue freq
                        0.2
   Sporting Goods Shop
   American Restaurant
                        0.2
2
          Coffee Shop
                        0.2
        Train Station
                        0.2
       Soccer Stadium
                        0.2
----Upminster----
                 venue freq
           Coffee Shop 0.09
                 Hotel 0.07
1
2
         Shopping Mall 0.07
        Clothing Store
                       0.07
  Fast Food Restaurant 0.05
----Upminster Bridge----
                 venue freq
           Coffee Shop 0.09
1
                 Hotel 0.07
2
         Shopping Mall 0.07
        Clothing Store 0.07
  Fast Food Restaurant 0.05
----Upper Clapton----
              venue freq
   Indian Restaurant 0.38
              Hotel 0.12
1
2
      Train Station 0.12
3
               Park 0.12
         Restaurant 0.12
----Upper Holloway----
              venue freq
0 Fish & Chips Shop 0.25
```

```
Café 0.25
  Martial Arts Dojo 0.25
      Metro Station 0.25
3
        Music Store 0.00
4
----Upper Norwood----
               venue freq
         Pizza Place 0.17
  Italian Restaurant 0.17
2
         Coffee Shop 0.17
                 Pub 0.17
         Supermarket 0.17
4
----Upton----
           venue freq
             Pub 0.10
     Coffee Shop 0.10
  Clothing Store 0.10
3
     Supermarket 0.07
4
        Pharmacy 0.07
----Upton Park----
               venue freq
               Hotel 0.29
  Chinese Restaurant 0.07
      Sandwich Place 0.07
3
            Rafting 0.07
4
            Pharmacy 0.07
----Uxbridge----
          venue freq
        Stables
                  1.0
0
        Airport
                  0.0
  Movie Theater
                  0.0
3
       Platform
                  0.0
```

```
Pizza Place 0.0
----Vauxhall----
           venue freq
     Coffee Shop 0.22
             Pub 0.22
2
     Supermarket 0.22
  Soccer Stadium 0.11
            Café 0.11
----Waddon----
               venue freq
         Pizza Place 0.17
  Italian Restaurant 0.17
2
         Coffee Shop 0.17
3
                 Pub 0.17
4
         Supermarket 0.17
----Wallington----
          venue freq
  Historic Site
                 1.0
        Airport
                 0.0
      Multiplex
                 0.0
3
       Platform
                  0.0
    Pizza Place
                  0.0
----Walworth----
             venue freq
       IT Services 0.33
   Harbor / Marina 0.33
  Business Service 0.33
       Music Store 0.00
3
        Playground 0.00
```

```
----Wandsworth----
                       venue freq
                               0.5
   Construction & Landscaping
                               0.5
                         Gym
2
                   Multiplex
                               0.0
                               0.0
                  Playground
                    Platform
                               0.0
----Wanstead----
                 venue freq
        Clothing Store 0.10
           Supermarket 0.07
1
                Bakery 0.07
2
  Fast Food Restaurant 0.07
    Turkish Restaurant 0.05
----Wapping----
               venue freq
            Platform 0.17
   Food & Drink Shop
                     0.08
     Nature Preserve 0.08
  Italian Restaurant 0.08
          Lighthouse 0.08
----Welling----
           venue freq
             Pub 0.10
0
     Coffee Shop 0.10
1
2 Clothing Store 0.10
     Supermarket 0.07
3
        Pharmacy 0.07
----Wembley----
        venue freq
0
          Pub
                0.5
```

```
Golf Course
                0.5
2
      Airport
                0.0
    Multiplex
                0.0
3
     Platform
                0.0
----Wembley Park----
        venue freq
0
          Pub
                0.5
  Golf Course
                0.5
2
      Airport
                0.0
3
    Multiplex
                0.0
     Platform
                0.0
----Wennington----
                  venue freq
           Coffee Shop
                        0.09
1
                 Hotel 0.07
2
         Shopping Mall 0.07
        Clothing Store 0.07
  Fast Food Restaurant 0.05
----West Drayton----
          venue freq
        Stables
                  1.0
0
1
        Airport
                  0.0
  Movie Theater
                  0.0
       Platform
                  0.0
3
    Pizza Place
                  0.0
----West Ealing----
             venue freq
      Home Service
                     0.5
  Business Service
                     0.5
2
           Airport
                     0.0
3
         Multiplex
                     0.0
```

```
Platform 0.0
4
----West Green----
             venue freq
             Park 0.33
  Business Service 0.33
        Skate Park 0.33
3
         Airport 0.00
  Music Store 0.00
----West Hackney----
              venue freq
  Indian Restaurant 0.38
              Hotel 0.12
    Train Station 0.12
3
               Park 0.12
         Restaurant 0.12
----West Ham----
               venue freq
               Hotel 0.29
1 Chinese Restaurant 0.07
      Sandwich Place 0.07
3
            Rafting 0.07
            Pharmacy 0.07
----West Hampstead----
             venue freq
        Skate Park 0.25
               Gym 0.25
       Rugby Pitch 0.25
  Business Service 0.25
           Airport 0.00
```

```
----West Heath----
           venue freq
             Pub 0.10
0
     Coffee Shop 0.10
1
  Clothing Store 0.10
     Supermarket 0.07
        Pharmacy 0.07
----West Norwood----
           venue freq
     Coffee Shop 0.22
             Pub 0.22
1
     Supermarket 0.22
2
  Soccer Stadium 0.11
            Café 0.11
----West Wickham----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
2
             Bar 0.05
    Burger Joint 0.05
    Pizza Place 0.05
----Westminster----
           venue freq
   Breakfast Spot
                  1.0
         Airport
                   0.0
1
2
       Multiplex
                   0.0
3
      Playground
                   0.0
        Platform
                   0.0
----Whitechapel----
               venue freq
            Platform 0.17
```

```
Food & Drink Shop 0.08
      Nature Preserve
                      0.08
  Italian Restaurant 0.08
          Lighthouse 0.08
----Whitton----
                venue freq
  Sporting Goods Shop
                        0.2
  American Restaurant
                        0.2
2
          Coffee Shop
                        0.2
                        0.2
        Train Station
       Soccer Stadium
                        0.2
----Widmore----
           venue freq
  Clothing Store 0.15
     Coffee Shop 0.13
             Bar 0.05
    Burger Joint 0.05
     Pizza Place 0.05
----Willesden----
        venue freq
           Pub
                0.5
  Golf Course
                0.5
2
      Airport
                0.0
    Multiplex
                0.0
     Platform
                0.0
----Wimbledon----
        venue freq
          Pub
                1.0
1
                0.0
      Airport
2
    Multiplex
                0.0
3
     Platform
                0.0
```

```
4 Pizza Place 0.0
----Winchmore Hill----
                       venue freq
                        Park 0.50
           Convenience Store 0.25
2 Construction & Landscaping 0.25
                   Irish Pub 0.00
          Italian Restaurant 0.00
----Wood Green----
             venue freq
              Park 0.33
  Business Service 0.33
2
        Skate Park 0.33
3
           Airport 0.00
       Music Store 0.00
----Woodford----
                 venue freq
        Clothing Store 0.10
           Supermarket 0.07
                Bakery 0.07
3 Fast Food Restaurant 0.07
    Turkish Restaurant 0.05
----Woodside----
               venue freq
         Pizza Place 0.17
  Italian Restaurant 0.17
         Coffee Shop 0.17
3
                 Pub 0.17
         Supermarket 0.17
```

```
----Yeading----
                   venue freq
                 Stables 1.0
         0
                 Airport
                           0.0
         2 Movie Theater
                           0.0
                 Platform 0.0
              Pizza Place 0.0
         ----Yiewsley----
                    venue freq
                 Stables 1.0
                 Airport
                           0.0
         1
         2 Movie Theater
                           0.0
                 Platform
                           0.0
         3
             Pizza Place 0.0
In [31]: def return_most_common_venues(row, num_top_venues):
             row categories = row.iloc[1:]
             row categories sorted = row categories.sort values(ascending=False)
             return row categories sorted.index.values[0:num top venues]
In [32]: num top venues = 10
         indicators = ['st', 'nd', 'rd']
         # create columns according to number of top venues
         columns = ['Neighborhood']
         for ind in np.arange(num top venues):
             try:
                 columns.append('{}{} Most Common Venue'.format(ind+1, indicator
         s[ind]))
             except:
                 columns.append('{}th Most Common Venue'.format(ind+1))
```

```
# create a new dataframe
neighborhoods_venues_sorted = pd.DataFrame(columns=columns)
neighborhoods_venues_sorted['Neighborhood'] = london_grouped['Neighborhood']

for ind in np.arange(london_grouped.shape[0]):
    neighborhoods_venues_sorted.iloc[ind, 1:] = return_most_common_venu
es(london_grouped.iloc[ind, :], num_top_venues)
neighborhoods_venues_sorted.head()
```

Out[32]:

	Neighborhood	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 M Comm Ver
0	Addington	Pizza Place	Coffee Shop	Chinese Restaurant	Supermarket	Italian Restaurant	Pub	Do Sl
1	Addiscombe	Pizza Place	Coffee Shop	Chinese Restaurant	Supermarket	Italian Restaurant	Pub	Do Sl
2	Albany Park	Pub	Coffee Shop	Clothing Store	Fast Food Restaurant	Italian Restaurant	Supermarket	Pharm
3	Aldborough Hatch	Clothing Store	Fast Food Restaurant	Supermarket	Bakery	Turkish Restaurant	Grocery Store	Co1 SI
4	Aldwych	Breakfast Spot	English Restaurant	Cosmetics Shop	Currency Exchange	Department Store	Dessert Shop	Di
4	4							•

In [33]: len(london_grouped[london_grouped["Indian Restaurant"] > 0])

Out[33]: 31

Create a new dataframe with only Indian Restuarant data

In [34]: london_data = london_grouped[["Neighborhood","Indian Restaurant"]]

```
In [35]: london_data.head()
Out[35]:
                  Neighborhood Indian Restaurant
            0
                     Addington
                                        0.00000
            1
                    Addiscombe
                                        0.00000
            2
                    Albany Park
                                        0.00000
            3 Aldborough Hatch
                                        0.02439
                       Aldwych
                                        0.00000
```

4. Cluster Neighbhorhoods

We will extract Indian restaurant data from above table and fit this into the code for finding best value of K.

```
In [36]: import matplotlib.pyplot as plt # plotting library
# backend for rendering plots within the browser
%matplotlib inline

from sklearn.cluster import KMeans
from sklearn.datasets.samples_generator import make_blobs
from sklearn.preprocessing import StandardScaler

X = london_data.values[:,1:]
X = np.nan_to_num(X)
cluster_london = StandardScaler().fit_transform(X)
cluster_london

cost=[]
for i in range(1,11):
    KM=KMeans(n_clusters=i, max_iter=500)
    KM.fit(cluster_london)
    cost.append(KM.inertia_)
```

```
plt.plot(range(1,11), cost, color='g',linewidth='3')
plt.xlabel('Value of k')
plt.vlabel('Squared Error(cost)')
plt.grid()
plt.show()
C:\Users\nived\Anaconda3\lib\site-packages\sklearn\utils\validation.py:
595: DataConversionWarning: Data with input dtype object was converted
to float64 by StandardScaler.
 warnings.warn(msg, DataConversionWarning)
C:\Users\nived\Anaconda3\lib\site-packages\sklearn\utils\validation.py:
595: DataConversionWarning: Data with input dtype object was converted
to float64 by StandardScaler.
 warnings.warn(msg, DataConversionWarning)
C:\Users\nived\Anaconda3\lib\site-packages\sklearn\cluster\k means .py:
971: ConvergenceWarning: Number of distinct clusters (3) found smaller
than n clusters (4). Possibly due to duplicate points in X.
  return n iter=True)
C:\Users\nived\Anaconda3\lib\site-packages\sklearn\cluster\k means .py:
971: ConvergenceWarning: Number of distinct clusters (3) found smaller
than n clusters (5). Possibly due to duplicate points in X.
  return n iter=True)
C:\Users\nived\Anaconda3\lib\site-packages\sklearn\cluster\k means .py:
971: ConvergenceWarning: Number of distinct clusters (3) found smaller
than n clusters (6). Possibly due to duplicate points in X.
  return n iter=True)
C:\Users\nived\Anaconda3\lib\site-packages\sklearn\cluster\k means .py:
971: ConvergenceWarning: Number of distinct clusters (3) found smaller
than n clusters (7). Possibly due to duplicate points in X.
  return n iter=True)
C:\Users\nived\Anaconda3\lib\site-packages\sklearn\cluster\k means .py:
971: ConvergenceWarning: Number of distinct clusters (3) found smaller
than n clusters (8). Possibly due to duplicate points in X.
  return n iter=True)
C:\Users\nived\Anaconda3\lib\site-packages\sklearn\cluster\k means .py:
971: ConvergenceWarning: Number of distinct clusters (3) found smaller
than n clusters (9). Possibly due to duplicate points in X.
  return n iter=True)
```

C:\Users\nived\Anaconda3\lib\site-packages\sklearn\cluster\k_means_.py:
971: ConvergenceWarning: Number of distinct clusters (3) found smaller
than n_clusters (10). Possibly due to duplicate points in X.
 return_n_iter=True)



From the above image we see that best value of K will be 2 according to Elbow method. We will merge above table with our London dataframe so that we will get coordinates of all neighborhoods Run k-means to cluster the neighborhood into 2 clusters.

```
In [37]: # set number of clusters
kclusters = 2

london_grouped_clustering = london_grouped.drop('Neighborhood', 1)

# run k-means clustering
kmeans = KMeans(n_clusters=kclusters, random_state=0).fit(london_groupe
d_clustering)

# check cluster labels generated for each row in the dataframe
kmeans.labels_[0:10]
```

Out[37]: array([0, 0, 0, 0, 1, 0, 0, 0, 0])

Let's create a new dataframe that includes the cluster as well as the top 10 venues for each neighborhood.

```
In [38]: # add clustering labels
    neighborhoods_venues_sorted.insert(0, 'Cluster Labels', kmeans.labels_)
    london_merged = london_data

# merge london_grouped with london_data to add latitude/longitude for e
    ach
    london_merged = london_merged.join(neighborhoods_venues_sorted.set_inde
    x('Neighborhood'), on='Neighborhood')
    london_merged= london_merged.join(london_df.set_index('Neighborhood'),
    on='Neighborhood')# check the last columns!
```

In [39]: london_merged.head()

Out[39]:

	Neighborhood	Indian Restaurant	Cluster Labels	1st Most Common Venue	2nd Most Common Venue	3rd Most Common Venue	4th Most Common Venue	5th Most Common Venue
0	Addington	0.00000	0	Pizza Place	Coffee Shop	Chinese Restaurant	Supermarket	Italian Restaurant
1	Addiscombe	0.00000	0	Pizza Place	Coffee Shop	Chinese Restaurant	Supermarket	Italian Restaurant
2	Albany Park	0.00000	0	Pub	Coffee Shop	Clothing Store	Fast Food Restaurant	Italian Restaurant
3	Aldborough Hatch	0.02439	0	Clothing Store	Fast Food Restaurant	Supermarket	Bakery	Turkish Restaurant
4	Aldwych	0.00000	1	Breakfast Spot	English Restaurant	Cosmetics Shop	Currency Exchange	Department Store
4								>

```
In [40]: # 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  for i 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(london merged['Latitude'], london mer
         ged['Longitude'], london merged['Neighborhood'], london merged['Cluster
          Labels'1):
             label = folium.Popup(str(poi) + ' Cluster ' + str(cluster), parse h
         tml=True)
             folium.CircleMarker(
                 [lat, lon],
                 radius=5,
                 popup=label,
                 color=rainbow[cluster-1],
                 fill=True,
                 fill color=rainbow[cluster-1],
                 fill opacity=0.7).add to(map clusters)
         map clusters
Out[40]:
```

5. Examine Clusters

Here, we have 2 clusters 0 and 1 respectively. In cluster 0 we have neighborhoods which have more number of Indian Restaurants. Cluster 0 has Red color in the map.

Cluster 0

In [41]: london_merged.loc[london_merged['Cluster Labels'] == 0]

Out[41]:

	Neighborhood	Indian Restaurant	Cluster Labels	1st Most Common Venue	2nd Most Common Venue	3rd Most Common Venue	4th Most Common Venue	
0	Addington	0.00000	0	Pizza Place	Coffee Shop	Chinese Restaurant	Supermarket	R
1	Addiscombe	nany Park 0,00000 0 Pub Coffee Shop Clothing Fa		Supermarket	R			
2	Albany Park			Pub	Coffee Shop	-	Fast Food Restaurant	R
3	Aldborough Hatch	0.02439	0	Clothing Store	Fast Food Restaurant	Supermarket	Bakery	R
5	Alperton	0.00000	0	Golf Course	Pub	Warehouse Store	Duty-free Shop	Cor

	Neighborhood	Indian Restaurant	Cluster Labels	1st Most Common Venue	2nd Most Common Venue	3rd Most Common Venue	4th Most Common Venue	
6	Anerley	0.00000	0	Clothing Store	Coffee Shop	Pizza Place	Bar	Bu
7	Angel	0.00000	0	Martial Arts Dojo	Metro Station	Café	Fish & Chips Shop	ı
8	Aperfield	0.00000	0	Clothing Store	Coffee Shop	Pizza Place	Bar	Bu
9	Archway	0.00000	0	Martial Arts Dojo	Metro Station	Café	Fish & Chips Shop	I
10	Ardleigh Green	0.00000	0	Coffee Shop	Clothing Store	Hotel	Shopping Mall	I
11	Arnos Grove	Arnos Grove Hillion Hill Park		Convenience Store	Construction & Landscaping	Cosmetics Shop	ı	
12	2 Balham 0.00000 0 Gym		Construction & Landscaping	Warehouse Store	Electronics Store	(
13	Bankside	0.00000	0	Harbor / Marina	IT Services	Business Service	Electronics Store	(
14	Barking	0.00000	0	Gym / Fitness Center	Park	Golf Course	Pool	Suţ
15	Barkingside	0.02439	0	Clothing Store	Fast Food Restaurant	Supermarket	Bakery	R
16	Barnehurst	0.00000	0	Pub	Coffee Shop	Clothing Store	Fast Food Restaurant	R
17	Barnes	0.00000	0	Train Station	American Restaurant	Sporting Goods Shop	Soccer Stadium	Со
18	Barnes Cray	0.00000	0	Pub	Coffee Shop	Clothing Store	Fast Food Restaurant	R

	Neighborhood	Indian Restaurant	Cluster Labels	1st Most Common Venue	2nd Most Common Venue	3rd Most Common Venue	4th Most Common Venue	
19	Barnsbury	0.00000	0	Martial Arts Dojo	Metro Station	Café	Fish & Chips Shop	l
20	Battersea	0.00000	0	Gym	Construction & Landscaping	Warehouse Store	Electronics Store	(
22	Beckenham	0.00000	0	Clothing Store	Coffee Shop	Pizza Place	Bar	Bu
23	Beckton	0.00000	0	Hotel	Airport	Italian Restaurant	Currency Exchange	R
24	Becontree	0.00000	0	Gym / Fitness Center	Park	Golf Course	Pool	Sup
25	Becontree Heath	0.00000	0	Gym / Fitness Center	Park	Golf Course	Pool	Suţ
26	Beddington	0.00000	0	Historic Site	Construction & Landscaping	Cosmetics Shop	Currency Exchange	De
27	Bedford Park	0.00000	0	Home Service	Business Service	Electronics Store	Cosmetics Shop	1
29	Bellingham	0.00000	0	Veterinarian	Park	Polish Restaurant	Pub	I R
30	Belmont	0.00000	0	Historic Site	Construction & Landscaping	Cosmetics Shop	Currency Exchange	D€
30	Belmont	0.00000	0	Historic Site	Construction & Landscaping	Cosmetics Shop	Currency Exchange	De
31	Belsize Park	0.00000	0	Skate Park	Gym	Business Service	Rugby Pitch	

	Neighborhood	Indian Restaurant	Cluster Labels	1st Most Common Venue	2nd Most Common Venue	3rd Most Common Venue	4th Most Common Venue	
366	Waddon	0.00000	0	Pizza Place	Coffee Shop	Chinese Restaurant	Supermarket	R
367	Wallington	0.00000	0	Historic Site	Construction & Landscaping	Cosmetics Shop	Currency Exchange	De
368	Walworth	0.00000	0	Harbor / Marina	IT Services	Business Service	Electronics Store	(
369	Wandsworth	0.00000	0	Gym	Construction & Landscaping	Warehouse Store	Electronics Store	(
370 371	Wanstead	0.02439	0	Clothing Store	Fast Food Restaurant	Supermarket	Bakery	R
	Wapping	0.00000	0	Platform	Italian Restaurant	Coffee Shop	Park	
372	Welling	Welling 0.00000	0	Pub	Coffee Shop	Clothing Store	Fast Food Restaurant	R
373	Wembley	0.00000	0	Golf Course	Pub Pub	Warehouse Store	Duty-free Shop	Cor
374	Wembley Park	0.00000	0	Golf Course		Warehouse Store	Duty-free Shop	Cor
375	Wennington	0.00000	0	Coffee Shop	Clothing Store	Hotel	Shopping Mall	I
376	West Drayton	0.00000	0	Stables	Warehouse Store	Electronics Store	Convenience Store	(
377	West Ealing	0.00000	0	Home Service	Business Service	Electronics Store	Cosmetics Shop	I
378	West Green	0.00000	0	Skate Park	Park	Business Service	Construction & Landscaping	(
379	West Hackney	0.37500	0	Indian Restaurant	Hotel	Train Station	Park	I R

	Neighborhood	ghborhood Restaurant Labels Comm		1st Most Common Venue	n Common Commo		4th Most Common Venue	
380	West Ham	0.00000	0	Hotel	Airport	Italian Restaurant	Currency Exchange	R
381	West Hampstead	0.00000	0	Skate Park	Gym	Business Service	Rugby Pitch	
382	West Heath	0.00000	0	Pub	Coffee Shop	Clothing Store	Fast Food Restaurant	R
383	West Norwood	t Norwood 0.00000		Supermarket	Pub	Coffee Shop	Playground	
384	West Wickham	am 0.00000		Clothing Store	Coffee Shop	Pizza Place	Bar	Bu
386	Whitechapel	0.00000	0	Platform	Italian Restaurant	Coffee Shop	Park	
387	Whitton	0.00000	0	Train Station	American Restaurant	Sporting Goods Shop	Soccer Stadium	Со
388	Widmore	0.00000	0	Clothing Store	Coffee Shop	Pizza Place	Bar	Ви
389	Willesden	0.00000	0	Golf Course	Pub	Warehouse Store Duty-free Shop	Duty-free Shop	Cor
390	Wimbledon	0.00000	0		Warehouse Store		Convenience Store	(
391	Winchmore Hill	0.00000	0		Convenience Store	Construction & Landscaping	Cosmetics Shop	I
392	2 Wood Green 0.00000 0		Skate Park	Park	Business Service	Construction & Landscaping	(
393	Woodford	Woodford 0.02439 0 CI	Clothing Store	Fast Food Restaurant			y R	
394	Woodside	0.00000	0	Pizza Place	Coffee Shop	Chinese Restaurant	Supermarket	R

	Neighborhood	Indian Restaurant	Cluster 1st Most Common Venue		2nd Most Common Venue	3rd Most Common Venue	4th Most Common Venue	
395	Yeading	0.00000	0	Stables	Warehouse Store	Electronics Store	Convenience Store	(
396	Yiewsley	0.00000	0	Stables	Warehouse Store	Electronics Store	Convenience Store	(

385 rows × 18 columns

In the cluster 1: We have all neighborhoods which have highly dense Indian Restaurants. Cluster 1 has purple color on map.

Cluster 1

In [42]: london_merged.loc[london_merged['Cluster Labels'] == 1]

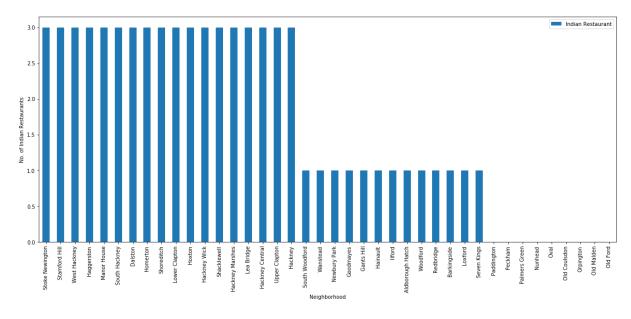
Out[42]:

	Neighborhood	Indian Restaurant	Cluster Labels	1st Most Common Venue	2nd Most Common Venue	3rd Most Common Venue	4th Most Common Venue	5th Most Common Venue	•
4	Aldwych	0.0	1	Breakfast Spot	English Restaurant	Cosmetics Shop	Currency Exchange	Department Store	
21	Bayswater	0.0	1	Breakfast Spot	English Restaurant	Cosmetics Shop	Currency Exchange	Department Store	
28	Belgravia	0.0	1	Breakfast Spot	English Restaurant	Cosmetics Shop	Currency Exchange	Department Store	
68	Charing Cross	0.0	1	Breakfast Spot	English Restaurant	Cosmetics Shop	Currency Exchange	Department Store	
73	Chinatown	0.0	1	Breakfast Spot	English Restaurant	Cosmetics Shop	Currency Exchange	Department Store	
84	Covent Garden	0.0	1	Breakfast Spot	English Restaurant	Cosmetics Shop	Currency Exchange	Department Store	

	Neighborhood	Indian Restaurant	Cluster Labels	1st Most Common Venue	2nd Most Common Venue	3rd Most Common Venue	4th Most Common Venue	5th Most Common Venue	(
198	Knightsbridge	0.0	1	Breakfast Spot	English Restaurant	Cosmetics Shop	Currency Exchange	Department Store	
209	Lisson Grove	0.0	1	Breakfast Spot	English Restaurant	Cosmetics Shop	Currency Exchange	Department Store	
211	Little Venice	0.0	1	Breakfast Spot	English Restaurant	Cosmetics Shop	Currency Exchange	Department Store	
218	Maida Vale	0.0	1	Breakfast Spot	English Restaurant	Cosmetics Shop	Currency Exchange	Department Store	
224	Marylebone	0.0	1	Breakfast Spot	English Restaurant	Cosmetics Shop	Currency Exchange	Department Store	
225	Mayfair	0.0	1	Breakfast Spot	English Restaurant	Cosmetics Shop	Currency Exchange	Department Store	
228	Millbank	0.0	1	Breakfast Spot	English Restaurant	Cosmetics Shop	Currency Exchange	Department Store	
262	Paddington	0.0	1	Breakfast Spot	English Restaurant	Cosmetics Shop	Currency Exchange	Department Store	
270	Pimlico	0.0	1	Breakfast Spot	English Restaurant	Cosmetics Shop	Currency Exchange	Department Store	
304	Soho	0.0	1	Breakfast Spot	English Restaurant	Cosmetics Shop	Currency Exchange	Department Store	
322	St James's	0.0	1	Breakfast Spot	English Restaurant	Cosmetics Shop	Currency Exchange	Department Store	
323	St John's Wood	0.0	1	Breakfast Spot	English Restaurant	Cosmetics Shop	Currency Exchange	Department Store	
385	Westminster	0.0	1	Breakfast Spot	English Restaurant	Cosmetics Shop	Currency Exchange	Department Store	
4									•

Lets visualize the maximum number of Indian Restaurants

Out[43]: <function matplotlib.pyplot.show(*args, **kw)>



Results

1. Most of the Indian restuarants are concentrated in the central London city, with the highest number in cluster. On the otherhand, cluster 1 has very low number to totally no of Indian restuarants in the neighborhoods. This represents a great opportunity and high potential areas to open new reaturant as there is less competitions. Therefore, this project recommends property developers to capitalize on these findings to open new restaurants in neighborhoods in cluster 1 with little to no competition.

- 2. If we observe the above data Visulaization graph, this gives a fair idea on which neighborhoods to consider and which on not to consider.
- 3. Property developers with unique selling propositions to stand out from the competition can also open new Indian restuarants in neighborhoods in cluster 0 with more competition. Lastly, property developers are advised to avoid neighborhoods in cluster 0 which already have high concentration of Indian restuarants and suffering from intense competition.

In []: