The Battle of Neighbourhoods (Week 2)

August 6, 2020

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Introduction and description of the problem

The objective of this project is to help entrepreneurs in the city of Madrid (Capital of Spain) to find the best neighborhood to open a business depending on what type of businesses are the most frequent in each neighborhood.

In this case I will follow the example proposed by the problem statement: if someone is looking to open a restaurant, where would you recommend that they open it?

0.0.1 Data

The data will be obtained from the URL https://es.wikipedia.org/wiki/Anexo:Distritos_de_Madrid, corresponding to the information on districts and inhabitants of the city of Madrid. This information is taken from Wikipedia.

0.0.2 Steps to follow

The necessary libraries will be loaded for the execution of the project.

The https://es.wikipedia.org/wiki/Anexo:Distritos_de_Madrid data will be obtained and transformed.

Obtain the coordinate data for each neighborhood in Madrid.

Get the top 100 venues that are in all the neighborhoods in Madrid from Foursquare.

Analyze Each Neighborhood and extract the top 3 most common venues.

0.0.3 Import necessary Libraries

```
[1]: import numpy as np # library to handle data in a vectorized manner
import pandas as pd # library for data analsysis
pd.set_option('display.max_columns', None)
pd.set_option('display.max_rows', None)
import requests # library to handle requests
!conda install -c conda-forge lxml --yes
!conda install -c conda-forge beautifulsoup4 --yes
import json # library to handle JSON files
```

```
!conda install -c conda-forge geopy --yes # uncomment this line if you haven|\cdot|_{\mathsf{t}_{\mathsf{U}}}
 →completed the Foursquare API lab
from geopy.geocoders import Nominatim # convert an address into latitude and
 \rightarrow longitude values
from pandas.io.json import json_normalize # tranform JSON file into a pandas_u
 \rightarrow 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 _{f L}
 →you haven't completed the Foursquare API lab
import folium # map rendering library
print('Libraries imported.')
Collecting package metadata (current_repodata.json): done
Solving environment: done
# All requested packages already installed.
Collecting package metadata (current_repodata.json): done
```

Solving environment: done

All requested packages already installed.

Collecting package metadata (current_repodata.json): done Solving environment: done

All requested packages already installed.

Libraries imported.

0.0.4 Define Foursquare Credentials and Version

```
[2]: CLIENT_ID = 'FGHDQZFOEA3OHDQUDDUOYCOUKJG5UNISL55BC4H3SFOZVIPQ' # your_
     \hookrightarrow Foursquare ID
     CLIENT_SECRET = 'HBRE212LJQAIVWL035BTKQNRIH0YX430MAN310QKFY5JCUQD' # your_
      \rightarrow Foursquare Secret
     VERSION = '20180604'
     LIMIT = 30
     print('Your credentails:')
```

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

Your credentails:

CLIENT_ID: FGHDQZF0EA30HDQUDDUOYCOUKJG5UNISL55BC4H3SF0ZVIPQ CLIENT_SECRET:HBRE212LJQAIVWL035BTKQNRIHOYX430MAN310QKFY5JCUQD

0.0.5 We obtain the data from 'https://es.wikipedia.org/wiki/Anexo:Distritos_de_Madrid', perform the necessary transformations and obtain the coordinate data for each neighborhood.

```
[3]: url = 'https://es.wikipedia.org/wiki/Anexo:Distritos_de_Madrid'
df = pd.read_html(url, header=0)[0]
df.rename(columns={'Nombre':'Name'}, inplace=True) # Translate
df = df[['Name']] + ", Madrid"
df['Latitude'] = ""
df['Longitude'] = ""
df = df.drop(len(df)-1) # Erase the last row for totals

for i in df.index:
    address = df["Name"][i]
    geolocator = Nominatim(user_agent="mad_explorer")
    location = geolocator.geocode(address)
    df['Latitude'][i] = location.latitude
    df['Longitude'][i] = location.longitude
```

```
[3]:
                               Name Latitude Longitude
    0
                     Centro, Madrid 40.4177 -3.70791
                 Arganzuela, Madrid 40.3981 -3.69373
    1
                     Retiro, Madrid 40.4111 -3.67606
    2
                  Salamanca, Madrid 40.427
    3
                                              -3.6806
    4
                  Chamartín, Madrid 40.459 -3.67613
    5
                     Tetuán, Madrid 40.4606 -3.69828
                   Chamberí, Madrid 40.4362 -3.70383
    6
    7
        Fuencarral-El Pardo, Madrid 40.5563 -3.77859
    8
            Moncloa-Aravaca, Madrid 40.4395
                                             -3.7442
    9
                     Latina, Madrid 40.4035 -3.73615
                Carabanchel, Madrid 40.3742 -3.74468
    10
    11
                      Usera, Madrid 40.3839 -3.70645
    12
         Puente de Vallecas, Madrid 40.3836 -3.65454
    13
                  Moratalaz, Madrid 40.4059 -3.64487
    14
              Ciudad Lineal, Madrid 40.4484 -3.65049
    15
                  Hortaleza, Madrid 40.4725 -3.64255
    16
                 Villaverde, Madrid 40.3456 -3.69596
    17
          Villa de Vallecas, Madrid
                                    40.374 -3.61216
```

```
18 Vicálvaro, Madrid 40.3966 -3.57662
19 San Blas-Canillejas, Madrid 40.4289 -3.604
20 Barajas, Madrid 40.4733 -3.57984
```

0.0.6 We obtain the geographical location of the center of Madrid

```
[4]: address = 'Madrid'

geolocator = Nominatim(user_agent="mad_explorer")
location = geolocator.geocode(address)
latitude = location.latitude
longitude = location.longitude
print('The geograpical coordinate of Madrid City are {}, {}.'.format(latitude, □
→longitude))
```

The geograpical coordinate of Madrid City are 40.4167047, -3.7035825.

0.0.7 Create a map of Madrid with neighborhoods superimposed on top.

```
[14]: # create map of Madrid using latitude and longitude values
      map madrid = folium.Map(location=[latitude, longitude], zoom_start=10)
      # add markers to map
      for lat, lng, name in zip(df['Latitude'], df['Longitude'], df['Name']):
          label = '{}'.format(name)
          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_madrid)
      map_madrid
```

[14]: <folium.folium.Map at 0x7f78f4072978>

0.0.8 Let's get the top 100 venues that are in all the neighborhoods in Madrid within a radius of 500 meters.

```
[6]: def getNearbyVenues(names, latitudes, longitudes, radius=500):
    venues_list=[]
    for name, lat, lng in zip(names, latitudes, longitudes):
```

```
# 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]['items']
             # return only relevant information for each nearby venue
             venues_list.append([(
                 name.
                 lat,
                 lng,
                 v['venue']['name'],
                 v['venue']['location']['lat'],
                 v['venue']['location']['lng'],
                 v['venue']['categories'][0]['name']) for v in results])
         nearby_venues = pd.DataFrame([item for venue_list in venues_list for item_
      →in venue_list])
         nearby venues.columns = ['Neighbourhood',
                       'Neighbourhood Latitude',
                       'Neighbourhood Longitude',
                       'Venue',
                       'Venue Latitude',
                       'Venue Longitude',
                       'Venue Category']
         return(nearby_venues)
[7]: madrid_venues = getNearbyVenues(names=df['Name'],
                                     latitudes=df['Latitude'],
                                      longitudes=df['Longitude']
                                    )
     print(madrid_venues.shape)
                                   # print shape
    (371, 7)
[8]: madrid_venues.groupby('Neighbourhood').count()
```

[8]:		Neighb	ourhood Latitude	Neighbourhood	Longitude	\
	Neighbourhood					
	Arganzuela, Madrid		30		30	
	Barajas, Madrid		30		30	
	Carabanchel, Madrid		15		15	
	Centro, Madrid		30		30	
	Chamartín, Madrid		30		30	
	Chamberí, Madrid		30		30	
	Ciudad Lineal, Madrid		29		29	
	Hortaleza, Madrid		20		20	
	Latina, Madrid		8		8	
	Moncloa-Aravaca, Madrid		3		3	
	Moratalaz, Madrid		16		16	
	Puente de Vallecas, Madrid		9		9	
	Retiro, Madrid		23		23	
	Salamanca, Madrid		30		30	
	San Blas-Canillejas, Madrid		7		7	
	Tetuán, Madrid		30		30	
	Usera, Madrid		18		18	
	Vicálvaro, Madrid		1		1	
	Villa de Vallecas, Madrid		9		9	
	Villaverde, Madrid		3		3	
		Venue	Venue Latitude	Venue Longitude	· \	
	Neighbourhood					
	Arganzuela, Madrid	30	30	30		
	Barajas, Madrid	30	30	30		
	Carabanchel, Madrid	15	15	15		
	Centro, Madrid	30	30	30		
	Chamartín, Madrid	30	30	30		
	Chamberí, Madrid	30	30	30)	
	Ciudad Lineal, Madrid	29	29	29		
	Hortaleza, Madrid	20	20	20)	
	Latina, Madrid	8	8	8		
	Moncloa-Aravaca, Madrid	3	3	3	3	
	Moratalaz, Madrid	16	16	16	3	
	Puente de Vallecas, Madrid	9	9	9)	
	Retiro, Madrid	23	23	23	3	
	Salamanca, Madrid	30	30	30)	
	San Blas-Canillejas, Madrid	7	7	7	•	
	Tetuán, Madrid	30	30	30)	

Venue Category

Usera, Madrid

Vicálvaro, Madrid

Villaverde, Madrid

Villa de Vallecas, Madrid

```
Neighbourhood
Arganzuela, Madrid
                                          30
Barajas, Madrid
                                          30
Carabanchel, Madrid
                                          15
Centro, Madrid
                                          30
Chamartín, Madrid
                                          30
Chamberí, Madrid
                                          30
Ciudad Lineal, Madrid
                                          29
Hortaleza, Madrid
                                          20
Latina, Madrid
                                           8
Moncloa-Aravaca, Madrid
                                           3
Moratalaz, Madrid
                                          16
Puente de Vallecas, Madrid
                                           9
Retiro, Madrid
                                          23
Salamanca, Madrid
                                          30
                                           7
San Blas-Canillejas, Madrid
Tetuán, Madrid
                                          30
Usera, Madrid
                                          18
Vicálvaro, Madrid
                                            1
Villa de Vallecas, Madrid
                                            9
                                            3
Villaverde, Madrid
```

0.0.9 Analyze Each Neighborhood and group rows by neighborhood and by taking the mean of the frequency of occurrence of each category

```
[9]:
                      Neighbourhood American Restaurant
                                                             Arcade \
    0
                 Arganzuela, Madrid
                                                0.000000 0.000000
    1
                    Barajas, Madrid
                                                0.000000 0.000000
                 Carabanchel, Madrid
    2
                                                0.000000 0.000000
    3
                     Centro, Madrid
                                                0.000000 0.000000
    4
                   Chamartín, Madrid
                                                0.000000 0.033333
                    Chamberí, Madrid
    5
                                                0.033333 0.000000
    6
              Ciudad Lineal, Madrid
                                                0.000000 0.000000
```

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7
               Hortaleza, Madrid
                                               0.000000
                                                         0.000000
8
                  Latina, Madrid
                                               0.000000
                                                         0.000000
9
        Moncloa-Aravaca, Madrid
                                               0.000000
                                                         0.000000
10
               Moratalaz, Madrid
                                               0.000000
                                                         0.000000
11
     Puente de Vallecas, Madrid
                                               0.000000
                                                         0.000000
12
                  Retiro, Madrid
                                               0.00000
                                                         0.000000
13
               Salamanca, Madrid
                                               0.033333
                                                         0.000000
14
    San Blas-Canillejas, Madrid
                                               0.000000
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15
                  Tetuán, Madrid
                                               0.000000
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16
                   Usera, Madrid
                                               0.000000
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17
               Vicálvaro, Madrid
                                               0.000000
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18
      Villa de Vallecas, Madrid
                                               0.000000
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19
             Villaverde, Madrid
                                               0.000000
                                                         0.000000
    Argentinian Restaurant
                                                 BBQ Joint
                             Asian Restaurant
                                                               Bakery
                                                                             Bar
                                                                                  \
0
                   0.00000
                                      0.000000
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                                                             0.066667
                                                                       0.033333
1
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                   0.068966
7
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8
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9
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19
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    Beer Garden
                            Board Shop
                    Bistro
                                         Boarding House
                                                          Bookstore
                                                                      Boutique
0
       0.066667
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    Boxing Gym
                Brazilian Restaurant
                                        Breakfast Spot
                                                          Brewery
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    Bubble Tea Shop
                      Burger Joint
                                     Burrito Place
                                                    Bus Stop
                                                                   Café
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13
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19
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    Candy Store
                                                  Chocolate Shop
                    Castle
                             Chinese Restaurant
                                                                      Church
0
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                                        0.033333
                                                         0.000000
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1
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9
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14
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    Clothing Store
                     Cocktail Bar
                                    Coffee Shop
                                                  Convenience Store
0
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                                        0.033333
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19
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    Cosmetics Shop
                     Creperie
                               Dessert Shop
                                                          Dog Run
                                                                    Donut Shop
                                                  Diner
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    Electronics Store
                        Falafel Restaurant
                                             Farmers Market
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19 0.000000 0.00000 0.00000 Fast Food Restaurant Fish Market Flea Market Food & Drink Shop 0 0.00000 0.000000 0.033333 0.000000 1 0.000000 0.000000 0.00000 0.000000 2 0.00000 0.000000 0.00000 0.066667 0.00000 3 0.000000 0.00000 0.000000 4 0.033333 0.033333 0.00000 0.00000 5 0.000000 0.000000 0.000000 0.000000 6 0.00000 0.000000 0.000000 0.000000 7 0.050000 0.000000 0.000000 0.000000 8 0.000000 0.00000 0.00000 0.00000 9 0.00000 0.000000 0.000000 0.000000 0.000000 10 0.00000 0.000000 0.000000 11 0.00000 0.000000 0.00000 0.111111 12 0.00000 0.00000 0.00000 0.000000 13 0.00000 0.000000 0.00000 0.000000 14 0.000000 0.000000 0.000000 0.00000 15 0.00000 0.00000 0.00000 0.000000 16 0.055556 0.000000 0.00000 0.000000 17 0.00000 0.000000 0.00000 0.000000 18 0.00000 0.000000 0.00000 0.000000 19 0.000000 0.00000 0.00000 0.00000 French Restaurant Fried Chicken Joint Frozen Yogurt Shop Food Truck 0 0.000000 0.000000 0.000000 0.000000 1 0.000000 0.000000 0.000000 0.000000 2 0.00000 0.00000 0.00000 0.00000 0.033333 3 0.000000 0.00000 0.00000 4 0.00000 0.00000 0.000000 0.033333 5 0.000000 0.000000 0.000000 0.000000 6 0.00000 0.000000 0.00000 0.00000 7 0.000000 0.000000 0.000000 0.000000 8 0.000000 0.00000 0.00000 0.00000 9 0.000000 0.00000 0.00000 0.00000 10 0.00000 0.000000 0.000000 0.00000 11 0.000000 0.00000 0.00000 0.00000 12 0.00000 0.00000 0.00000 0.00000 13 0.000000 0.000000 0.000000 0.000000 14 0.000000 0.000000 0.00000 0.00000 15 0.000000 0.000000 0.00000 0.033333 16 0.000000 0.000000 0.000000 0.000000

Furniture / Home Store Garden Gastropub Gourmet Shop Grocery Store \

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              Gym / Fitness Center
                                      Health & Beauty Service
         Gym
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    Himalayan Restaurant
                           Historic Site
                                           Hostel
                                                              Ice Cream Shop
                                                       Hotel
0
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                                0.000000
                                                                     0.033333
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1
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2
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3
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    Indian Restaurant
                        Italian Restaurant
                                             Japanese Restaurant
                                                                   Jazz Club
0
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19
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    Juice Bar
               Korean Restaurant
                                      Lounge
                                                Market
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    Mediterranean Restaurant
                               Metro Station
                                               Mexican Restaurant
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19
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                                                           Music Venue
    Motorcycle Shop
                     Movie Theater
                                     Multiplex
                                                   Museum
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    Neighborhood
                  Nightclub
                              Noodle House
                                             Opera House
                                                               Park
                                                                     Pastry Shop
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19	0.00000	0.000000	0.000	0.00000	00	
	-	h Restaurant S	Steakhouse	Student Center	Supermarket	\
0	0.000000	0.000000	0.000000	0.000	0.000000	
1	0.000000	0.133333	0.000000	0.000	0.000000	
2	0.000000	0.133333	0.000000	0.000	0.066667	
3	0.000000	0.000000	0.000000	0.000	0.000000	
4	0.000000	0.133333	0.033333	0.000	0.066667	
5	0.000000	0.066667	0.000000	0.000	0.033333	
6	0.00000	0.137931	0.00000	0.000	0.068966	
7	0.00000	0.150000	0.00000	0.000	0.100000	
8	0.00000	0.000000	0.00000	0.125	0.125000	
9	0.00000	0.000000	0.00000	0.000	0.00000	
10	0.00000	0.000000	0.000000	0.000	0.062500	
11	0.00000	0.111111	0.00000	0.000	0.00000	
12	0.00000	0.217391	0.00000	0.000	0.086957	
13	0.00000	0.066667	0.00000	0.000	0.00000	
14	0.142857	0.000000	0.00000	0.000	0.142857	
15	0.00000	0.166667	0.00000	0.000	0.00000	
16	0.00000	0.055556	0.00000	0.000	0.00000	
17	0.000000	0.000000	0.000000	0.000	0.000000	
18	0.00000	0.000000	0.000000	0.000	0.111111	
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	_	pas Restaurant		Thrift / Vintag		
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3	0.000000	0.033333	0.000000		0.00000	
4	0.033333	0.033333	0.000000		0.00000	
5	0.000000	0.166667	0.066667		0.00000	
6	0.000000	0.034483	0.000000		0.00000	
7	0.000000	0.050000	0.000000		0.00000	
8	0.000000	0.000000	0.000000		0.00000	
9	0.000000	0.000000	0.000000		0.00000	
10	0.062500	0.000000	0.000000		0.00000	
11	0.000000	0.111111	0.000000		0.00000	
12	0.000000	0.043478	0.000000		0.00000	
13	0.000000	0.066667	0.000000		0.033333	
14	0.000000	0.000000	0.000000	C	0.00000	
15	0.033333	0.000000	0.000000	C	0.00000	
16	0.000000	0.000000	0.055556	C	0.00000	
17	0.000000	0.000000	0.000000	C	0.00000	

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   Trade School Wine Bar Wine Shop
                                       Women's Store
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```

0.0.10 Let's print each neighborhood along with the top 3 most common venues and put that into a pandas dataframe

```
[10]: 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]
```

```
indicators = ['st', 'nd', 'rd']

# create columns according to number of top venues
columns = ['Neighbourhood']
for ind in np.arange(num_top_venues):
    try:
        columns.append('{}{} Most Common Venue'.format(ind+1, indicators[ind]))
    except:
        columns.append('{}th Most Common Venue'.format(ind+1))

# create a new dataframe
```

```
neighbourhoods_venues_sorted = pd.DataFrame(columns=columns)
      neighbourhoods_venues_sorted['Neighbourhood'] = madrid_grouped['Neighbourhood']
      for ind in np.arange(madrid_grouped.shape[0]):
          neighbourhoods_venues_sorted.iloc[ind, 1:] = __
       -return_most_common_venues(madrid_grouped.iloc[ind, :], num_top_venues)
      neighbourhoods venues sorted
[11]:
                                            1st Most Common Venue
                         Neighbourhood
      0
                   Arganzuela, Madrid
                                                 Tapas Restaurant
      1
                      Barajas, Madrid
                                                             Hotel
      2
                  Carabanchel, Madrid
                                                 Tapas Restaurant
      3
                        Centro, Madrid
                                                             Plaza
      4
                     Chamartín, Madrid
                                                       Restaurant
      5
                      Chamberí, Madrid
                                                 Tapas Restaurant
                                               Spanish Restaurant
      6
                Ciudad Lineal, Madrid
      7
                     Hortaleza, Madrid
                                               Spanish Restaurant
      8
                        Latina, Madrid
                                                    Grocery Store
      9
              Moncloa-Aravaca, Madrid
                                                            Castle
      10
                     Moratalaz, Madrid
                                                             Plaza
      11
           Puente de Vallecas, Madrid
                                                              Park
      12
                        Retiro, Madrid
                                               Spanish Restaurant
      13
                     Salamanca, Madrid
                                                        Restaurant
      14
          San Blas-Canillejas, Madrid
                                               Seafood Restaurant
                        Tetuán, Madrid
      15
                                               Spanish Restaurant
      16
                         Usera, Madrid
                                               Chinese Restaurant
      17
                     Vicálvaro, Madrid
                                        Mediterranean Restaurant
      18
            Villa de Vallecas, Madrid
                                                 Tapas Restaurant
                   Villaverde, Madrid
                                                Convenience Store
      19
         2nd Most Common Venue
                                  3rd Most Common Venue
      0
                 Grocery Store
                                                  Bakery
      1
            Spanish Restaurant
                                 Argentinian Restaurant
      2
                     Restaurant
                                      Spanish Restaurant
      3
                         Hostel
                                               Bookstore
      4
            Spanish Restaurant
                                             Supermarket
      5
                            Bar
                                                 Theater
      6
                     Restaurant
                                               Gastropub
      7
                           Park
                                             Supermarket
                   Supermarket
      8
                                                    Park
      9
                      Bus Stop
                                                    Park
      10
                                                    Park
                            Bar
      11
                                                     Gym
            Spanish Restaurant
      12
                         Garden
                                             Supermarket
      13
                         Bakery
                                     Mexican Restaurant
      14
                           Park
                                             Supermarket
```

```
15 Brazilian Restaurant Grocery Store
16 Seafood Restaurant Grocery Store
17 Women's Store Gym / Fitness Center
18 Grocery Store Metro Station
19 Spanish Restaurant Breakfast Spot
```

```
[12]: df_filtered = neighbourhoods_venues_sorted.filter(items=['Neighbourhood', '1st_\] 

→Most Common Venue'])

df_filtered = df_filtered.loc[(df_filtered['1st Most Common Venue'] == 'Spanish_\]

→Restaurant')]

df_filtered.reset_index(inplace=True, drop = True)

df_filtered
```

```
[12]: Neighbourhood 1st Most Common Venue

0 Ciudad Lineal, Madrid Spanish Restaurant

1 Hortaleza, Madrid Spanish Restaurant

2 Retiro, Madrid Spanish Restaurant

3 Tetuán, Madrid Spanish Restaurant
```

0.0.11 Conclusion

Once we have obtained the list of neighborhoods, we can recommend one of these to open a local with typical national food or, better said: "Spanish Restaurant". The reason for recommending opening a business of this type in neighborhoods with more of this type of business is that it can be very touristy or gastronomic areas and therefore a greater possibility of having more clients. So we can recommend opening a "Spanish Restaurant" in the following neighborhoods:

```
[13]: df_filtered[['Neighbourhood']]
```

```
[13]: Neighbourhood

0 Ciudad Lineal, Madrid

1 Hortaleza, Madrid

2 Retiro, Madrid

3 Tetuán, Madrid
```