LEVEL 2 - TASK 3: GEOGRAPHIC ANALYSIS

- --3:1 Plot the locations of restaurants on a map using longitude and lattitude coordinates.
- -3:2 Identify any patterns or clusters of restaurants in specific areas.

3:1 PLOT THE LOCATIONS OF RESTAURANTS ON A MAP USING LONGITUDE AND LATTITUDE COORDINATES.

```
#import libraries
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
import plotly.express as px
pip install folium pandas
Collecting folium
  Downloading folium-0.19.4-py2.py3-none-any.whl.metadata (3.8 kB)
Requirement already satisfied: pandas in c:\users\dimpi\anaconda3\lib\
site-packages (2.2.2)
Collecting branca>=0.6.0 (from folium)
  Downloading branca-0.8.1-py3-none-any.whl.metadata (1.5 kB)
Requirement already satisfied: jinja2>=2.9 in c:\users\dimpi\
anaconda3\lib\site-packages (from folium) (3.1.4)
Requirement already satisfied: numpy in c:\users\dimpi\anaconda3\lib\
site-packages (from folium) (1.26.4)
Requirement already satisfied: requests in c:\users\dimpi\anaconda3\
lib\site-packages (from folium) (2.32.3)
Requirement already satisfied: xyzservices in c:\users\dimpi\
anaconda3\lib\site-packages (from folium) (2022.9.0)
Requirement already satisfied: python-dateutil>=2.8.2 in c:\users\
dimpi\anaconda3\lib\site-packages (from pandas) (2.9.0.post0)
Requirement already satisfied: pytz>=2020.1 in c:\users\dimpi\
anaconda3\lib\site-packages (from pandas) (2024.1)
Requirement already satisfied: tzdata>=2022.7 in c:\users\dimpi\
anaconda3\lib\site-packages (from pandas) (2023.3)
Requirement already satisfied: MarkupSafe>=2.0 in c:\users\dimpi\
anaconda3\lib\site-packages (from jinja2>=2.9->folium) (2.1.3)
Requirement already satisfied: six>=1.5 in c:\users\dimpi\anaconda3\
lib\site-packages (from python-dateutil>=2.8.2->pandas) (1.16.0)
Reguirement already satisfied: charset-normalizer<4,>=2 in c:\users\
dimpi\anaconda3\lib\site-packages (from requests->folium) (3.3.2)
Requirement already satisfied: idna<4,>=2.5 in c:\users\dimpi\
anaconda3\lib\site-packages (from requests->folium) (3.7)
Requirement already satisfied: urllib3<3,>=1.21.1 in c:\users\dimpi\
anaconda3\lib\site-packages (from requests->folium) (2.2.3)
Requirement already satisfied: certifi>=2017.4.17 in c:\users\dimpi\
anaconda3\lib\site-packages (from requests->folium) (2024.8.30)
```

```
Downloading folium-0.19.4-py2.py3-none-any.whl (110 kB)
Downloading branca-0.8.1-py3-none-any.whl (26 kB)
Installing collected packages: branca, folium
Successfully installed branca-0.8.1 folium-0.19.4
Note: you may need to restart the kernel to use updated packages.
#import data
dataset= pd.read csv("dataset.csv")
#check data
dataset.head(10)
   Restaurant ID
                                           Restaurant Name Country
Code \
         6317637
                                          Le Petit Souffle
162
1
         6304287
                                          Izakaya Kikufuji
162
                                    Heat - Edsa Shangri-La
         6300002
162
3
         6318506
                                                       0oma
162
         6314302
                                                Sambo Kojin
162
                                              Din Tai Fung
5
        18189371
162
                                                Buffet 101
         6300781
6
162
7
         6301290
                                                    Vikings
162
         6300010 Spiral - Sofitel Philippine Plaza Manila
162
         6314987
                                                   Locavore
162
               City
                                                                Address
/
        Makati City Third Floor, Century City Mall, Kalayaan Avenu...
1
        Makati City
                     Little Tokyo, 2277 Chino Roces Avenue, Legaspi...
   Mandaluyong City
                     Edsa Shangri-La, 1 Garden Way, Ortigas, Mandal...
   Mandaluyong City Third Floor, Mega Fashion Hall, SM Megamall, O...
3
   Mandaluyong City Third Floor, Mega Atrium, SM Megamall, Ortigas...
                     Ground Floor, Mega Fashion Hall, SM Megamall, ...
   Mandaluyong City
         Pasay City Building K, SM By The Bay, Sunset Boulevard, M...
6
```

```
7
         Pasay City Building B, By The Bay, Seaside Boulevard, Mal...
8
                     Plaza Level, Sofitel Philippine Plaza Manila, ...
         Pasay City
         Pasig City Brixton Technology Center, 10 Brixton Street, ...
                                          Locality \
         Century City Mall, Poblacion, Makati City
0
1
        Little Tokyo, Legaspi Village, Makati City
2
        Edsa Shangri-La, Ortigas, Mandaluyong City
3
            SM Megamall, Ortigas, Mandaluyong City
4
            SM Megamall, Ortigas, Mandaluyong City
5
            SM Megamall, Ortigas, Mandaluyong City
  SM by the Bay, Mall of Asia Complex, Pasay City
6
7
   SM by the Bay, Mall of Asia Complex, Pasay City
8
       Sofitel Philippine Plaza Manila, Pasay City
9
                                         Kapitolyo
                                    Locality Verbose Longitude
Latitude \
O Century City Mall, Poblacion, Makati City, Mak... 121.027535
14.565443
1 Little Tokyo, Legaspi Village, Makati City, Ma... 121.014101
14.553708
  Edsa Shangri-La, Ortigas, Mandaluyong City, Ma... 121.056831
14.581404
3 SM Megamall, Ortigas, Mandaluyong City, Mandal... 121.056475
14.585318
  SM Megamall, Ortigas, Mandaluyong City, Mandal... 121.057508
14.584450
5 SM Megamall, Ortigas, Mandaluyong City, Mandal... 121.056314
14.583764
  SM by the Bay, Mall of Asia Complex, Pasay Cit... 120.979667
14.531333
7 SM by the Bay, Mall of Asia Complex, Pasay Cit... 120.979333
14.540000
8 Sofitel Philippine Plaza Manila, Pasay City, P... 120.980090
14.552990
                               Kapitolyo, Pasig City 121.056532
14.572041
                             Cuisines
                                                    Currency \
           French, Japanese, Desserts
0
                                            Botswana Pula(P)
1
                             Japanese
                                            Botswana Pula(P)
2
     Seafood, Asian, Filipino, Indian
                                            Botswana Pula(P)
3
                      Japanese, Sushi
                                            Botswana Pula(P)
                                       . . .
4
                     Japanese, Korean
                                            Botswana Pula(P)
                                       . . .
5
                              Chinese
                                            Botswana Pula(P)
6
                                            Botswana Pula(P)
                      Asian, European
                                      . . .
```

```
7
   Seafood, Filipino, Asian, European
                                                Botswana Pula(P)
                                                Botswana Pula(P)
8
               European, Asian, Indian
9
                                Filipino
                                                Botswana Pula(P)
  Has Table booking Has Online delivery Is delivering now \
0
                 Yes
                                        No
                                                            No
1
                 Yes
                                        No
                                                            No
2
                 Yes
                                        No
                                                            No
3
                                        No
                  No
                                                            No
4
                                        No
                 Yes
                                                            No
5
                  No
                                        No
                                                            No
6
                 Yes
                                        No
                                                            No
7
                 Yes
                                        No
                                                            No
8
                 Yes
                                        No
                                                            No
9
                 Yes
                                        No
                                                            No
  Switch to order menu Price range
                                                           Rating color \
                                       Aggregate rating
0
                                    3
                      No
                                                      4.8
                                                             Dark Green
                                    3
1
                      No
                                                      4.5
                                                             Dark Green
2
                      No
                                    4
                                                      4.4
                                                                   Green
3
                                    4
                                                      4.9
                      No
                                                             Dark Green
4
                                    4
                                                      4.8
                                                             Dark Green
                      No
5
                                    3
                                                      4.4
                      No
                                                                   Green
6
                      No
                                    4
                                                      4.0
                                                                   Green
7
                                    4
                                                      4.2
                      No
                                                                   Green
8
                      No
                                    4
                                                      4.9
                                                             Dark Green
9
                                    3
                                                             Dark Green
                                                      4.8
                      No
  Rating text Votes
    Excellent
                 314
    Excellent
                 591
1
2
    Very Good
                 270
3
    Excellent
                 365
4
    Excellent
                 229
5
    Very Good
                 336
    Very Good
6
                 520
7
    Very Good
                 677
    Excellent
8
                 621
    Excellent
                 532
[10 rows x 21 columns]
#check database shape
dataset.shape
(9551, 21)
#check dataset information
dataset.info()
```

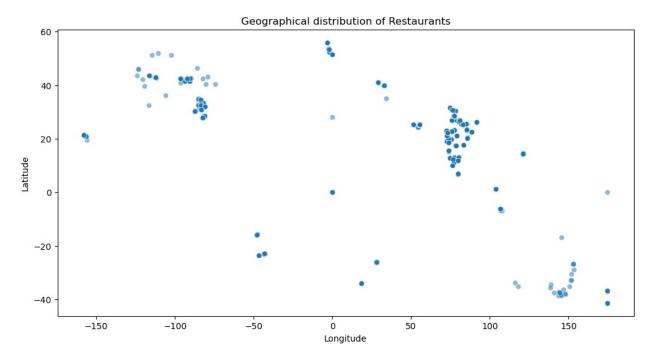
```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 9551 entries, 0 to 9550
Data columns (total 21 columns):
     Column
                           Non-Null Count Dtvpe
     -----
 0
     Restaurant ID
                           9551 non-null
                                           int64
                           9551 non-null
 1
     Restaurant Name
                                           object
 2
     Country Code
                           9551 non-null
                                           int64
 3
    City
                           9551 non-null
                                           object
 4
    Address
                           9551 non-null
                                           object
 5
    Locality
                           9551 non-null
                                           object
 6
    Locality Verbose
                           9551 non-null
                                           object
 7
                           9551 non-null
                                           float64
    Longitude
 8
                           9551 non-null
                                           float64
    Latitude
 9
     Cuisines
                           9542 non-null
                                           object
 10 Average Cost for two 9551 non-null
                                           int64
 11 Currency
                           9551 non-null
                                           object
                           9551 non-null
 12 Has Table booking
                                           object
 13 Has Online delivery
                           9551 non-null
                                           object
                           9551 non-null
14 Is delivering now
                                           obiect
15 Switch to order menu 9551 non-null
                                           object
16 Price range
                           9551 non-null
                                           int64
                           9551 non-null
 17 Aggregate rating
                                           float64
 18 Rating color
                           9551 non-null
                                           object
                           9551 non-null
19 Rating text
                                           object
                           9551 non-null
                                           int64
20 Votes
dtypes: float64(3), int64(5), object(13)
memory usage: 1.5+ MB
#check dataset column names
dataset.columns
Index(['Restaurant ID', 'Restaurant Name', 'Country Code', 'City',
'Address',
       Locality', 'Locality Verbose', 'Longitude', 'Latitude',
'Cuisines',
       'Average Cost for two', 'Currency', 'Has Table booking',
       'Has Online delivery', 'Is delivering now', 'Switch to order
menu',
       'Price range', 'Aggregate rating', 'Rating color', 'Rating
text',
       'Votes'],
      dtype='object')
```

Data Preprocessing

```
#check for null values
pd.isnull(dataset).sum()
```

```
Restaurant ID
                         0
Restaurant Name
                         0
Country Code
                         0
                         0
City
Address
                         0
Locality
                         0
Locality Verbose
                         0
Longitude
                         0
Latitude
                         0
Cuisines
                         9
Average Cost for two
                         0
Currency
                         0
Has Table booking
                         0
                         0
Has Online delivery
Is delivering now
                         0
Switch to order menu
                         0
Price range
                         0
                         0
Aggregate rating
                         0
Rating color
                         0
Rating text
                         0
Votes
dtype: int64
#drop all null values
dataset.dropna(inplace=True)
#check database
dataset.shape
(9542, 21)
dataset.info()
<class 'pandas.core.frame.DataFrame'>
Index: 9542 entries, 0 to 9550
Data columns (total 21 columns):
#
     Column
                            Non-Null Count
                                             Dtvpe
- - -
     _ _ _ _ _ _
     Restaurant ID
                            9542 non-null
                                             int64
 0
 1
     Restaurant Name
                            9542 non-null
                                             object
 2
                            9542 non-null
     Country Code
                                             int64
 3
     City
                            9542 non-null
                                             object
                            9542 non-null
 4
     Address
                                             object
 5
     Locality
                            9542 non-null
                                             object
 6
     Locality Verbose
                            9542 non-null
                                             object
 7
                            9542 non-null
                                             float64
     Longitude
 8
                            9542 non-null
     Latitude
                                             float64
 9
     Cuisines
                            9542 non-null
                                             object
 10 Average Cost for two 9542 non-null
                                             int64
                            9542 non-null
 11 Currency
                                             object
```

```
12
     Has Table booking
                           9542 non-null
                                           object
 13
    Has Online delivery
                           9542 non-null
                                           object
 14 Is delivering now
                           9542 non-null
                                           object
 15 Switch to order menu 9542 non-null
                                           obiect
 16 Price range
                           9542 non-null
                                           int64
 17 Aggregate rating
                           9542 non-null
                                           float64
 18 Rating color
                           9542 non-null
                                           object
 19
    Rating text
                           9542 non-null
                                           object
 20 Votes
                           9542 non-null
                                           int64
dtypes: float64(3), int64(5), object(13)
memory usage: 1.6+ MB
#check description of data
dataset[['Average Cost for two', 'Price range', 'Aggregate rating',
'Votes'll.describe()
       Average Cost for two Price range Aggregate rating
Votes
                9542.000000
                             9542.000000
                                               9542.000000
count
9542.000000
                                1.804968
                                                  2.665238
mean
                1200.326137
156.772060
std
               16128.743876
                                0.905563
                                                  1.516588
430.203324
                   0.000000
                                1.000000
                                                  0.000000
min
0.000000
25%
                 250,000000
                                1.000000
                                                  2.500000
5.000000
50%
                 400,000000
                                2.000000
                                                  3.200000
31.000000
75%
                 700.000000
                                2.000000
                                                  3.700000
130,000000
              800000.000000
max
                                4.000000
                                                  4.900000
10934.000000
import folium
from folium.plugins import MarkerCluster
#create a base map centered around the average coordinates
map center= [dataset["Latitude"].mean(), dataset["Longitude"].mean()]
restaurant map = folium.Map(location=map center, zoom start=12)
#add a marker cluster for better visualization
marker cluster= MarkerCluster().add to(restaurant map)
#add restaurant location to the map
for _,row in dataset.iterrows():
                                          #' ' is uised to ignore the
index
    folium.Marker(
            location=[row["Latitude"], row["Longitude"]],
```



3:2 IDENTIFY ANY PATTERNS OR CLUSTERS OF RESTAURANTS IN SPECIFIC AREAS.

```
from sklearn.cluster import KMeans

#remove rows with missing latitude and longitude values
dataset_clean= dataset.dropna(subset=["Latitude","Longitude"])

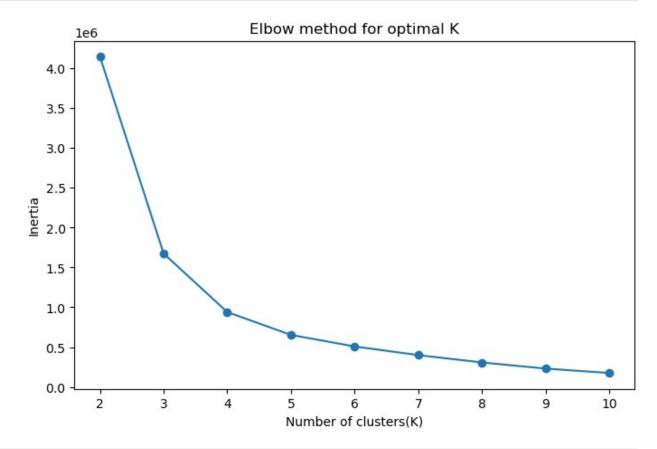
#extract coordinates
coords= dataset_clean[["Latitude","Longitude"]].values

#determine the optimal number of clusters using the elbow method
inertia=[]
```

```
K_range= range(2,11) #testing k from 2 to 10

for k in K_range:
    kmeans= KMeans(n_clusters=k, random_state=42, n_init=10)
    kmeans.fit(coords)
    inertia.append(kmeans.inertia_)

#plot the elbow curve
plt.figure(figsize=(8,5))
plt.plot(K_range,inertia,marker="o", linestyle="-")
plt.xlabel("Number of clusters(K)")
plt.ylabel("Inertia")
plt.title("Elbow method for optimal K")
plt.show()
```



```
# Based on the Elbow plot, selecting an optimal K (assuming the
"elbow" occurs around 4 or 5)
optimal_k = 5

# Apply K-Means clustering
kmeans = KMeans(n_clusters=optimal_k, random_state=42, n_init=10)
dataset_clean["Cluster"] = kmeans.fit_predict(coords)

# Plot clusters
```

```
plt.figure(figsize=(12, 6))
sns.scatterplot(
    x=dataset_clean["Longitude"],
    y=dataset clean["Latitude"],
    hue=dataset clean["Cluster"],
    palette="viridis",
    alpha=0.6
)
plt.scatter(
    kmeans.cluster_centers_[:, 1],
    kmeans.cluster_centers_[:, 0],
    c="red", marker="X", s=200, label="Centroids"
)
plt.xlabel("Longitude")
plt.ylabel("Latitude")
plt.title("Restaurant Clusters Based on Location")
plt.legend()
plt.show()
```

