

## ✓ Long term care system in Maryland State.

### Introduction:

Long-term care analysis is critical for a number of reasons, the most important of which are the aging population and the possible financial load associated with longer healthcare demands. Therefore, I want to do a visual analysis of long-term care facilities and nursing homes to gain a comprehensive understanding of the quality of care provided in our society.

In this report, Maryland State will be used as an example. First of all, there are three datasets will be used in this project. They will be imported to Python by using database connection, api connection, and local file uploaded.

Secondly, according to those data, the program will caculate key indexes. For example, the bed supply rate of nursing houses in each county. This information will aid in identifying counties in Maryland that may require an expansion of long-term care facilities.

Finally, the program will present the obtained data through visualizations to enhance clarity and understanding. In this project, it shows three different data visualizations.

This report will provide relevant authorities with the current aging situation in each county in MD State. In addition, the visually presented map will provide information on senior care centers and geriatric hospitals in each region.

### Dataset List:

1)Population in MD State in 2020-2022.

Link:<https://www.census.gov/data/datasets/time-series/demo/popest/2020s-counties-detail.html>

2)Maryland Long Term Care Assisted Living - Long Term Care

Link: <https://data.imap.maryland.gov/datasets/maryland::maryland-long-term-care-assisted-living-long-term-care/explore?location=38.846676%2C-77.306000%2C8.94>

3)Maryland Long Term Care Assisted Living - Geriatric Care Hospitals

Link: [https://data.imap.maryland.gov/datasets/2d33670813aa4e1e84bcec0c12773ba2\\_2/explore](https://data.imap.maryland.gov/datasets/2d33670813aa4e1e84bcec0c12773ba2_2/explore)

### Part I. To get the datasets.

Firstly, the program will use differt ways to get those three datastats.

1. database connection
2. api connection
3. local file (csv)

```

1 """
2 In this cell, the program will connect to the MySQL Server which is at the GCP. (The server of Mysql is created at GCP Cloud)
3 Then the SQL command will get the data of the population in Maryland State in 2023.
4 After got the data in python, the program would clean data make sure the data can be used easily later.
5
6 request dataset1:
7 1. using Mysql connection.
8 2. clean data: to remove the string 'County' in [CTYNAME]. For example: Allegany State -> Allegany
9 """
10
11 !pip install pymysql
12 import pymysql
13 import pandas as pd
14
15 #1.
16 #SQL connection information
17 conn = pymysql.connect(host="34.171.30.129",user='workbench',password='1234',database='newdb')
18
19 #SQL query command
20 query = 'SELECT STATE, CTYNAME, AGE65PLUS_TOT,POPESTIMATE,AGE65PLUS_MALE,AGE65PLUS_FEM \
21         FROM newdb.`cc-est2022-agesex-24` WHERE STATE =24 AND YEAR = 4 ;'
22
23 mysql_result_dataFrame = pd.read_sql(query,conn)
24
25 #2.
26 #clean data
27 mysql_result_dataFrame['CTYNAME'] = mysql_result_dataFrame['CTYNAME'].str.replace(' County', '')
28 print(mysql_result_dataFrame)
29

```

Collecting pymysql

Downloading PyMySQL-1.1.0-py3-none-any.whl (44 kB)

44.8/44.8 kB 1.0 MB/s eta 0:00:00

Installing collected packages: pymysql

Successfully installed pymysql-1.1.0

	STATE	CTYNAME	AGE65PLUS_TOT	POPESTIMATE	AGE65PLUS_MALE \
0	24	Allegany	14185	67267	6333
1	24	Anne Arundel	96019	593286	42867
2	24	Baltimore	156497	846161	66306
3	24	Calvert	15601	94573	7141
4	24	Caroline	5915	33433	2665
5	24	Carroll	31678	175305	14253
6	24	Cecil	18175	104942	8505
7	24	Charles	23629	170102	10206
8	24	Dorchester	7560	32726	3347
9	24	Frederick	44554	287079	19914
10	24	Garrett	6899	28579	3266
11	24	Harford	46276	263867	20629
12	24	Howard	51753	335411	23255
13	24	Kent	5440	19320	2438
14	24	Montgomery	181307	1052521	79527
15	24	Prince George's	144490	946971	59761
16	24	Queen Anne's	10723	51711	5087
17	24	St. Mary's	16285	114877	7647
18	24	Somerset	4440	24546	2035
19	24	Talbot	11584	37932	5108
20	24	Washington	28379	155590	12691
21	24	Wicomico	17826	104664	7802
22	24	Worcester	15625	53866	7262
23	24	Baltimore city	89369	569931	36280

AGE65PLUS\_FEM

0	7852
1	53152
2	90191
3	8460
4	3250
5	17425
6	9670
7	13423
8	4213
9	24640
10	3633
11	25647
12	28498
13	3002
14	101780
15	84729
16	5636
17	8638
18	2405
19	6476

```

20
21      130000
22      10024
23      8363
24      53089
<ipython-input-1-057991a72e26>:23: UserWarning: pandas only supports SQLAlchemy connectable (engine/connection) or database
mysql_result_dataFrame = pd.read_sql(query,conn)

1 """
2 In this cell, the program will call api from Maryland.gov. Then, the program will get long term care assisted living informa
3 In this data set, it shows the assisted living facilities information, such as address, longitude, latitude, capacity etc.
4 After get the data, the program would do the simple data transformation before calculation and data visualization.
5
6
7
8 # 1.request dataset2 by using calling api
9 # 2.data transformation (rename column, drop column, add new column)
10 # note: The 'map_use' field is used to determine which data set it comes from and can be visually presented based on the map
11
12 """
13
14 import requests
15 import pandas as pd
16 import matplotlib.pyplot as plt
17
18 url = "https://geodata.md.gov/imap/rest/services/Health/MD_LongTermCareAssistedLiving/FeatureServer/6/query?where=1%3D1&outF
19
20 try:
21     response = requests.get(url)
22     # Check if the request was successful (status code 200)
23     if response.status_code == 200:
24         data = response.json()
25         # Now 'data' contains the JSON response from the API
26         # 2. Read data
27         features = data.get('features', [])
28         records = [feature.get('attributes', {}) for feature in features]
29         df_LTCLiving = pd.DataFrame(records)
30         #print(df_LTCLiving)
31     else:
32         print(f"Error: {response.status_code}")
33
34 except requests.exceptions.RequestException as e:
35     print(f"Request error: {e}")
36
37
38 #To rename columns , drop unuseless columns, and add columns
39
40 df_LTCLiving.rename(columns={'XCoordinate': 'Longitude'}, inplace=True)
41 df_LTCLiving.rename(columns={'YCoordinate': 'Latitude'}, inplace=True)
42
43 df_LTCLiving.drop(['OHQC_Index_No', 'OBJECTID'], axis=1, inplace=True)
44
45 #add column 'Map_use'. This is a column to recognize the data is from dataset 2 or dataset 3.
46 #value = 0 -> dataset2 , value =1 -> dataset3
47 df_LTCLiving['Map_use'] = 0
48
49
50 #print the result
51 print(df_LTCLiving)
52

```

	County	Facility_Name \
0	Allegany	Allegany Health Nursing and Rehab
1	Allegany	Devlin Manor Nursing and Rehabilitation Center
2	Allegany	Egle Nursing Home
3	Allegany	Sterling Care at Frostburg Village
4	Allegany	Cumberland Healthcare Center
..	...	...
222	Charles	Waldorf Center
223	Frederick	Ballenger Creek Center
224	Howard	The Lutheran Village at Miller's Grant
225	Montgomery	Ingleside at King Farm
226	Prince George's	Riderwood Village

	Facility_Address	Facility_City	Facility_State \
0	730 Furnace Street	Cumberland	MD
1	10301 North East Christie Road	Cumberland	MD
2	57 Jackson Street	Lonaconing	MD
3	One Kaylor Circle Route 36 & Route 40	Frostburg	MD
4	512 Winifred Road	Cumberland	MD

```

..          ...
222          4140 Old Washington Highway      Waldorf      MD
223          347 Ballenger Drive      Frederick      MD
224          9000 Fathers Legacy      Ellicott City      MD
225          701 King Farm Boulevard      Rockville      MD
226          3160 Gracefield Road      Silver Spring      MD

```

```

Facility_Zip Facility_Phone License_Capacity Longitude Latitude \
0      21502      301-777-5941      153      -78.764100      39.668600
1      21502      301-724-1400      124      -78.720300      39.665100
2      21539      301-463-5451      66      -78.978800      39.562900
3      21532      301-689-7500      122      -78.907600      39.645800
4      21502      301-724-6066      134      -78.743000      39.645700

..          ...
222      20602      301-645-2813      115      -76.932940      38.598529
223      21701      301-663-5181      130      -77.429570      39.396954
224      21042      410-696-6700      12      -76.842724      39.271801
225      20850      240-499-9015      45      -77.178051      39.111969
226      20904      301-572-8420      117      -76.942521      39.048594

```

```

Map_use
0      0
1      0
2      0
3      0
4      0

..          ...
222      0
223      0
224      0
225      0
226      0

```

[227 rows x 11 columns]

```

1 """
2 In this cell, the program will get the csv local file. The local file is provided by Maryland.gov.
3 In this dataset provide the information of geriatric care hospitals.
4 After get the data, the program would do the simple data transformation before calculation and data visualization.
5
6
7
8 # dataset3
9 #1.import a csv file from local machine
10 # 2.data transformation (rename column, drop column, add new column)
11 # note: The 'map_use' field is used to determine which data set it comes from and can be visually presented based on the map
12 """
13
14 import pandas as pd
15 import io
16
17 df_LTHospital = pd.read_csv('Maryland_Long_Term_Care_Assisted_Living_-_Geriatric_Care_Hospitals.csv')
18 #print(df_LTHospital)
19
20
21 #To rename columns , drop columns , and new a column to recognize
22 df_LTHospital.rename(columns={'XCoordinate':'Longitude'}, inplace = True)
23 df_LTHospital.rename(columns={'YCoordinate':'Latitude'}, inplace = True)
24
25 df_LTHospital.drop(['X', 'Y', 'MIEMSS_Region', 'OHCQ_Index_No_', 'OBJECTID'], axis=1, inplace = True)
26
27 #add column 'Map_use'. This is a column to recognize the data is from dataset 2 or dataset 3.
28 #value = 0 -> dataset2 , value =1 -> dataset3
29 df_LTHospital['Map_use']= 1
30
31 print(df_LTHospital)
32
33 #df_LTHospital.info()
34

```

```

County Facility_Name \
0 Washington Western Maryland Center
1 Baltimore City Levindale Hebrew Geriatric Center & Hospital
2 Wicomico Deer's Head Center
3 Prince George's Spellman Specialty Hospital And Nursing Care C...

```

```

Facility_Address Facility_City Facility_State Facility_Zip \
0 1500 Pennsylvania Avenue Hagerstown MD 21742
1 2434 West Belvedere Avenue Baltimore MD 21215
2 315 Deer'S Head Hospital Road Salisbury MD 21802

```

3	3001 Hospital Drive		Cheverly	MD	20785
	Facility_Phone	License_Capacity	Longitude	Latitude	Map_use
0	301-745-4140	60	-77.7175	39.6656	1
1	410-466-8700	100	-76.6651	39.3545	1
2	410-543-4000	0	-75.5958	38.3822	1
3	301-497-7953	52	-76.9206	38.9304	1

## Part II. date calculation part

In the section, 3 function would be created and be used to calculate the specific value. Some of them would do data merage when using two data frame.

- `calc_elders_rate`: This function is used to calculate the proportion of elderly people over 65 years old in each county to the total population of the county. This allows us to know which county has a severe aging population.
- `calc_male_to_female`: This function is used to calculate the proportion of men and women over 65 years old in each county.
- `calc_bed_occupancy_rate`: This function calculates the bed supply rate of nursing houses in each county. Calculation method: The number of nursing beds available for every 1,000 older adults in the area. The higher the value, the greater the number of nursing home beds in the area.

```

1 def calc_elders_rate(result_dataframe):
2     """ (pd.dataframe) -> pd.dataframe
3     This function is used to calculate the proportion of elderly people over 65 years old in each county to the total population
4     At last, the program will return a new dataframe which has two columns. (1)County Name (2) The ratio of the elders
5
6     """
7     #aggregate :groupby county column , sumup age over 65 population and all population
8     df_elders_rate = result_dataframe.groupby('CTYNAME')[['AGE65PLUS_TOT', 'POPESTIMATE']].sum()
9
10    # Reset the index
11    df_elders_rate.reset_index(inplace=True)
12
13
14    # Calculate the ratio
15    df_elders_rate['AGE65PLUS_RATIO'] = df_elders_rate['AGE65PLUS_TOT'] / df_elders_rate['POPESTIMATE']
16
17    return(df_elders_rate[['CTYNAME', 'AGE65PLUS_RATIO']])
18
19
20 #test function
21 df_age65_ratio_result = calc_elders_rate(mysql_result_dataframe)
22 print(df_age65_ratio_result)
23

```

	CTYNAME	AGE65PLUS_RATIO
0	Allegany	0.210876
1	Anne Arundel	0.161843
2	Baltimore	0.184949
3	Baltimore city	0.156807
4	Calvert	0.164963
5	Caroline	0.176921
6	Carroll	0.180702
7	Cecil	0.173191
8	Charles	0.138911
9	Dorchester	0.231009
10	Frederick	0.155198
11	Garrett	0.241401
12	Harford	0.175376
13	Howard	0.154297
14	Kent	0.281573
15	Montgomery	0.172260
16	Prince George's	0.152581
17	Queen Anne's	0.207364
18	Somerset	0.180885
19	St. Mary's	0.141760
20	Talbot	0.305389
21	Washington	0.182396
22	Wicomico	0.170316
23	Worcester	0.290072

```

1 def calc_male_to_female(mysql_result_dataframe):
2     """ (pd.dataframe)-> float, float
3     This function is used to calculate the proportion of men and women over 65 years old in each county by using the aggregate method.
4     At last, the program will return two float values. (1) the percentage of over 65 yrs old male (2) the percentage of over 65
5
6     """
7     # use aggregate to sum up 'AGE65PLUS_MALE', 'AGE65PLUS_FEM'
8     aggregated_df = mysql_result_dataframe.groupby('STATE').agg({'AGE65PLUS_MALE': 'sum', 'AGE65PLUS_FEM': 'sum'})
9
10    # Calculate total for each gender
11    total_male = aggregated_df['AGE65PLUS_MALE'].sum()
12    total_female = aggregated_df['AGE65PLUS_FEM'].sum()
13
14    # Calculate percentages
15    percent_male = (aggregated_df['AGE65PLUS_MALE'] / (total_male + total_female)) * 100
16    percent_female = (aggregated_df['AGE65PLUS_FEM'] / (total_male + total_female)) * 100
17
18    # print(percent_male) #43.8
19    # print(percent_female) #56.1
20
21    return percent_male, percent_female
22
23
24 # Test the function
25 result = calc_male_to_female(mysql_result_dataframe)
26 percent_male, percent_female = result
27
28

```

```

1
2 def calc_bed_occupancy_rate(mysql_result_dataframe, df_LTCLiving):
3     """ (pd.dataframe, pd.dataframe)-> pd.dataframe
4     This function calculates the bed supply rate of nursing houses in each county.
5     Calculation method: The number of nursing beds available for every 1,000 older adults in the area.
6     The higher the value, the greater the number of nursing home beds in the area.
7
8     1. utilize dataframe[df_LTCLiving] and aggregate the total capacity in each county.
9     2. use dataframe [mysql_result_dataframe] and [df_LTCLiving]. merge two dataframes on county column
10    3. calculate the rate.
11
12    """
13
14    # 1. use aggregate to sum up df_LTCLiving 'License_Capacity' by 'County'
15    agg_func = {'License_Capacity': 'sum'}
16    df_county_capacity = df_LTCLiving.groupby('County').agg(agg_func).reset_index()
17
18    # 2. merge two dataframes
19    merged_df = pd.merge(mysql_result_dataframe, df_county_capacity, left_on='CTYNAME', right_on='County')
20    # drop the same column
21    merged_df = merged_df.drop(columns=['County', 'POPESTIMATE', 'AGE65PLUS_FEM', 'AGE65PLUS_MALE'])
22
23    # 3. calculate
24    # print(df_county_capacity)
25    merged_df['Beds_Per_1000'] = (merged_df['License_Capacity'] / merged_df['AGE65PLUS_TOT']) * 1000
26
27
28    # 4. result
29    return(merged_df)
30
31
32 # test function
33 result_df = calc_bed_occupancy_rate(mysql_result_dataframe, df_LTCLiving)
34
35 print(result_df)

```

	STATE	CTYNAME	AGE65PLUS_TOT	License_Capacity	Beds_Per_1000
0	24	Allegany	14185	908	64.011280
1	24	Anne Arundel	96019	1606	16.725856
2	24	Baltimore	156497	347	2.217295
3	24	Calvert	15601	310	19.870521
4	24	Caroline	5915	187	31.614539
5	24	Carroll	31678	921	29.073805
6	24	Cecil	18175	431	23.713893
7	24	Charles	23629	491	20.779551
8	24	Dorchester	7560	233	30.820106
9	24	Frederick	44554	1082	24.285137
10	24	Garrett	6899	316	45.803740

11	24	Harford	46276	769	16.617685
12	24	Howard	51753	576	11.129790
13	24	Kent	5440	228	41.911765
14	24	Montgomery	181307	4544	25.062463
15	24	Prince George's	144490	2803	19.399266
16	24	Queen Anne's	10723	120	11.190898
17	24	St. Mary's	16285	563	34.571692
18	24	Somerset	4440	211	47.522523
19	24	Talbot	11584	269	23.221685
20	24	Washington	28379	1138	40.100074
21	24	Wicomico	17826	613	34.387973
22	24	Worcester	15625	307	19.648000

### PartIII. Data Visualization

In this part, the above-mentioned function calculation results will be used to present data visualizations.

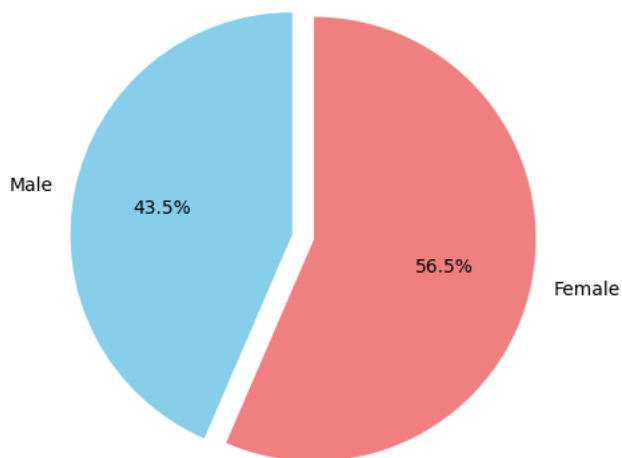
- Pie chart: The pie chart will show the male to female ratio of elderly people over 65 years old in Maryland state.
- Bar-Line chart: The bar line chart shows two metric values. One is the elder rate. The other is the bed supply rate of nursing houses. The best situation is low elder rate and a high nursing home bed supply rate.
- Map: This map will present the results of the fusion of two datasets (Maryland Long Term Care Assisted Living, Geriatric Care Hospitals) and use the field 'map\_use' to determine whether to display icons of nursing homes or geriatric hospitals. This map visualization will exhibit an aggregation and summation effect upon zooming out.

```

1 import matplotlib.pyplot as plt
2
3
4 def plot_pie_chart(percent_male,percent_female):
5
6     labels = ['Male', 'Female']
7     sizes = [percent_male.sum(), percent_female.sum()]
8     colors = ['skyblue', 'lightcoral']
9     explode = (0.1, 0) # explode the 1st slice (Male)
10
11     plt.pie(sizes, explode=explode, labels=labels, colors=colors, autopct='%1.1f%%', startangle=90)
12     plt.axis('equal')
13     plt.title('Maryland State Male to Female Ratio among Seniors')
14
15     # Display the pie chart
16     plt.show()
17
18 #test function
19 percent_male, percent_female = calc_male_to_female(mysql_result_dataframe)
20 plot_pie_chart(percent_male,percent_female)

```

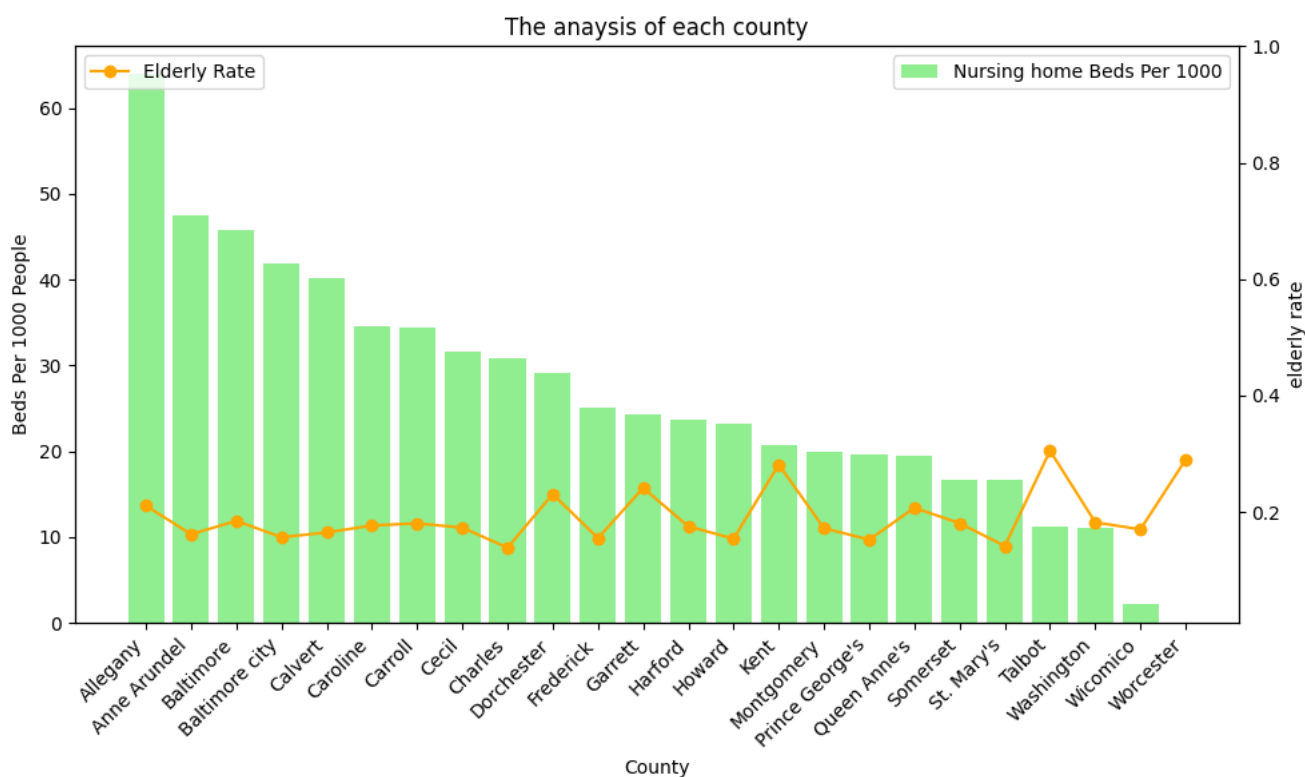
Maryland State Male to Female Ratio among Seniors



```

1
2 import matplotlib.pyplot as plt
3
4 def bar_line_chart(result_df,df_age65_ratio_result):
5     """
6     bar chart
7     """
8     #order by desc
9     result_df= result_df.sort_values(by='Beds_Per_1000', ascending=False)
10
11     # Create a bar chart with conditional coloring
12     plt.figure(figsize=(10, 6))
13     bars = plt.bar(result_df['CTYNAME'], result_df['Beds_Per_1000'], color=['lightgreen'])
14
15     plt.xlabel('County')
16     plt.ylabel('Beds Per 1000 People')
17     plt.title('The anaysis of each county')
18     plt.xticks(rotation=45, ha='right')
19
20     # Add a legend for color reference
21     legend_labels = ['Nursing home Beds Per 1000']
22     plt.legend(bars, legend_labels, loc='upper right')
23
24
25
26     """
27     line chart
28     """
29     ax2= plt.twinx()
30     ax2.set_ylabel("elderly rate")
31
32     ax2.set_ylim(0.01,1)
33
34     #data from df_elders_rate 'AGE65PLUS_RATIO'
35     ax2.plot(df_age65_ratio_result['CTYNAME'], df_age65_ratio_result['AGE65PLUS_RATIO'], color='orange', marker='o', label='')
36     ax2.legend(loc='upper left')
37
38
39
40     plt.tight_layout()
41     plt.show()
42
43
44 bar_line_chart(result_df,df_age65_ratio_result)

```





```
1 """
2 LTC_map(df_LTCLiving, df_LTCHospital)
3
4 """
5 import folium
6 from folium.plugins import MarkerCluster
7
8 # use concat_df dataframe to show the map visulization
9 def LTC_map(df_LTCLiving, df_LTCHospital):
10
11     # concat dataset2 and dataset3
12     concat_df = pd.concat([df_LTCLiving, df_LTCHospital])
13
14     #create map initize the map
15     map = folium.Map(location=[39.5, -78.5], zoom_start=9)
16
17     #create layer which can be add the points
18     marker_cluster = MarkerCluster().add_to(map)
19
20     # Add points to the map
21     for index, row in concat_df.iterrows():
22
23         lat, lon = row['Latitude'], row['Longitude']
24         #recognize the colomn 'Map_use' to mark different icons
25         map_icon = row['Map_use']
26
27         #custom icons
28         if map_icon == 0:
29             folium.Marker([lat, lon], icon=folium.CustomIcon('home.png')).add_to(marker_cluster)
30         else:
31             folium.Marker([lat, lon], icon=folium.CustomIcon('hos.png')).add_to(marker_cluster)
32
33     # Display the map
34     display(map)
35     # download as html file if it can not display on github
36     map.save("map.html")
37
38
39 ##test
40 LTC_map(df_LTCLiving, df_LTCHospital)
```

