MTH522 Block: 1; Project: 1

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Importing libraries

In [49]: import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import geopandas as gpd
from shapely.geometry import Point

Importing Data

In [10]:	<pre>df = pd.read_csv("/Volumes/work/MTH522/data/fatal-police-shootings-data.csv"</pre>											
In [11]:	df.head()											
Out[11]:		id	name	date	manner_of_death	armed	age	gender	race	city	state	si
	0	3	Tim Elliot	2015- 01-02	shot	gun	53.0	М	А	Shelton	WA	
	1	4	Lewis Lee Lembke	2015- 01-02	shot	gun	47.0	М	W	Aloha	OR	
	2	5	John Paul Quintero	2015- 01-03	shot and Tasered	unarmed	23.0	М	Н	Wichita	KS	
	3	8	Matthew Hoffman	2015- 01- 04	shot	toy weapon	32.0	М	W	San Francisco	СА	
	4	9	Michael Rodriguez	2015- 01- 04	shot	nail gun	39.0	М	Н	Evans	СО	
In [12]:	<pre>df.info()</pre>											

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 7743 entries, 0 to 7742
Data columns (total 17 columns):

#	Column	Non-Null Count	Dtype				
0	id	7743 non-null	int64				
1	name	7321 non-null	object				
2	date	7743 non-null	object				
3	manner_of_death	7743 non-null	object				
4	armed	7534 non-null	object				
5	age	7258 non-null	float64				
6	gender	7722 non-null	object				
7	race	6271 non-null	object				
8	city	7743 non-null	object				
9	state	7743 non-null	object				
10	signs_of_mental_illness	7743 non-null	bool				
11	threat_level	7743 non-null	object				
12	flee	6866 non-null	object				
13	body_camera	7743 non-null	bool				
14	longitude	6906 non-null	float64				
15	latitude	6906 non-null	float64				
16	is_geocoding_exact	7743 non-null	bool				
dtypes: bool(3), float64(3), int64(1), object(10)							
memory usage: 869.7+ KB							

memory usage: 869.7+ K

In [13]: df.describe()

Out[13]:

	id	age	longitude	latitude
count	7743.000000	7258.000000	6906.000000	6906.000000
mean	4275.703862	37.180077	-97.051309	36.683896
std	2417.587293	12.960438	16.593829	5.402856
min	3.000000	2.000000	-160.007000	19.498000
25%	2170.500000	27.000000	-112.038000	33.480000
50%	4301.000000	35.000000	-94.215500	36.105000
75%	6368.500000	45.000000	-83.069750	40.033000
max	8421.000000	92.000000	-67.867000	71.301000

```
In [14]: df.isnull().values.any()
```

Out[14]: True

In [15]: df.isnull().sum()

```
Out[15]: id
                                          0
          name
                                        422
          date
                                          0
          manner_of_death
                                          0
          armed
                                        209
                                        485
          age
          gender
                                         21
                                       1472
          race
                                          0
          city
          state
                                          0
          signs_of_mental_illness
                                          0
          threat level
                                          0
          flee
                                        877
          body camera
                                          0
          longitude
                                        837
          latitude
                                        837
          is geocoding exact
                                          0
          dtype: int64
```

Observation: From looking at the above data we can conclude that these list of columns are addressed using **classication**

- 1. manner_of_death
- 2. armed
- 3. age
- 4. gender
- 5. race
- 6. city
- 7. state
- 8. signs_of_mental_illness
- 9. threat_level
- 10. flee
- 11. body_camera

```
In [42]: usa = gpd.read_file('/volumes/work/mth522/data/geo/states.shp')
    type(usa)
# this date is taken from "https://www.arcgis.com/home/item.html?id=da77eeb2
```

Out [42]: geopandas.geodataframe.GeoDataFrame

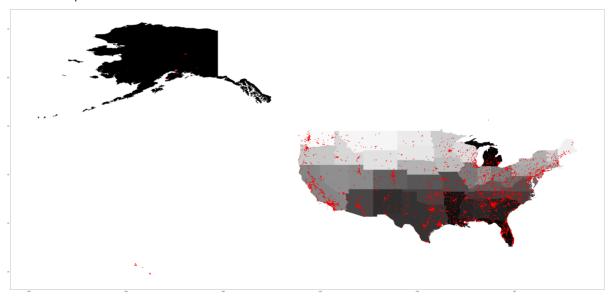
```
In [43]: usa.head()
```

Out[43]:		STATE_NAME	DRAWSEQ	STATE_FIPS	SUB_REGION	STATE_ABBR	geometry
	0	Hawaii	1	15	Pacific	Н	MULTIPOLYGON (((-160.07380 22.00418, -160.0497
	1	Washington	2	53	Pacific	WA	MULTIPOLYGON (((-122.40202 48.22522, -122.4628
	2	Montana	3	30	Mountain	МТ	POLYGON ((-111.47543 44.70216, -111.48080 44.6
	3	Maine	4	23	New England	ME	MULTIPOLYGON (((-69.77728 44.07415, -69.85993
	4	North Dakota	5	38	West North Central	ND	POLYGON ((-98.73044 45.93827, -99.00683 45.939

```
In [12]: geometry = [Point(xy) for xy in zip(df['longitude'], df['latitude'])]
    gdf = gpd.GeoDataFrame(df, geometry=geometry)

gdf.plot(ax=usa.plot(cmap='binary', figsize=(70, 70)), marker='o', color='re
```

Out[12]: <AxesSubplot:>



Observation: From the above plot we can see that column *'latitude'* and *'longitude'* are addressed using clustering.