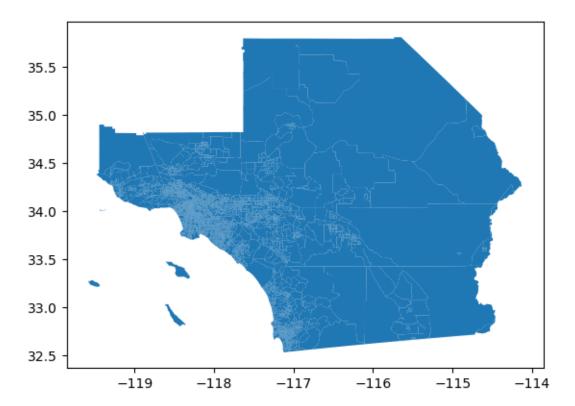
Exercise2

March 20, 2024

```
[1]: import geopandas as gpd
      import matplotlib.pyplot as plt
 [3]:
     import pandas as pd
 [4]: import mapclassify
           1. Using the file ~/data/scag_region.parquet create a new GeoDataFrame that
           contains only the census tract data for San Diego County. Be sure to reset the
           index of the newly created GeoDataFrame.
 [5]:
     scag_region = gpd.read_parquet("~/data/scag_region.parquet")
 [7]: print(scag_region.columns)
     Index(['geoid', 'n_asian_under_15', 'n_black_under_15', 'n_hispanic_under_15',
            'n_native_under_15', 'n_white_under_15', 'n_persons_under_18',
            'n_asian_over_60', 'n_black_over_60', 'n_hispanic_over_60',
            'year', 'n_total_housing_units_sample', 'p_nonhisp_white_persons',
            'p_white_over_60', 'p_black_over_60', 'p_hispanic_over_60',
            'p_native_over_60', 'p_asian_over_60', 'p_disabled', 'geometry'],
           dtype='object', length=194)
 [8]: gdf = gpd.read_parquet("~/data/scag_region.parquet")
[10]:
     gdf.shape
[10]: (4580, 194)
[11]: type(gdf)
[11]: geopandas.geodataframe.GeoDataFrame
[13]: gdf.plot()
```

[13]: <Axes: >



```
[14]: scag_region['06073'] = scag_region['geoid'].str.slice(2, 5)
[15]: san_diego_tracts = scag_region[scag_region['06073'] == '073'].
       ⇔reset_index(drop=True)
[16]: san_diego_tracts.head()
[16]:
               geoid n_asian_under_15 n_black_under_15 n_hispanic_under_15 \
      0 06073014901
                                  59.0
                                                     27.0
                                                                         109.0
      1 06073000300
                                   0.0
                                                     0.0
                                                                          46.0
      2 06073000800
                                  16.0
                                                    77.0
                                                                          78.0
      3 06073002201
                                  62.0
                                                    139.0
                                                                         868.0
      4 06073018509
                                  70.0
                                                     56.0
                                                                        1032.0
         n_native_under_15 n_white_under_15 n_persons_under_18 n_asian_over_60 \
      0
                       0.0
                                       318.0
                                                            705.0
                                                                               NaN
                       0.0
                                        40.0
      1
                                                            191.0
                                                                               NaN
      2
                       0.0
                                        59.0
                                                            298.0
                                                                               NaN
      3
                       0.0
                                         0.0
                                                           1302.0
                                                                               NaN
      4
                       0.0
                                        83.0
                                                           1671.0
                                                                               NaN
```

```
n black over 60 n hispanic over 60 ... n total housing units sample
0
                NaN
                                     NaN
                                                                      1876.0
1
                NaN
                                     NaN
                                                                     3046.0
2
                NaN
                                     NaN
                                                                     2702.0
3
                NaN
                                     NaN
                                                                     1321.0
4
                                                                     1701.0
                NaN
                                     {\tt NaN}
                                                p_black_over_60
   p_nonhisp_white_persons
                             p_white_over_60
0
                  65.158807
                                           NaN
                                                             NaN
1
                  72.801901
                                           NaN
                                                             NaN
2
                  59.056509
                                           NaN
                                                             NaN
3
                   9.626473
                                           NaN
                                                             NaN
4
                  23.131806
                                           NaN
                                                             NaN
   p_hispanic_over_60
                       p_native_over_60    p_asian_over_60    p_disabled
0
                   NaN
                                       NaN
                                                        NaN
                                                                     NaN
                   NaN
                                       NaN
                                                         NaN
1
                                                                     NaN
2
                                                        NaN
                   NaN
                                       NaN
                                                                     NaN
3
                   NaN
                                       NaN
                                                         NaN
                                                                     NaN
                                                        NaN
                   NaN
                                       NaN
                                                                     NaN
                                                         06073
                                               geometry
O POLYGON ((-117.01957 32.76373, -117.01562 32.7...
                                                          073
1 POLYGON ((-117.16864 32.74897, -117.16602 32.7...
                                                          073
2 POLYGON ((-117.14632 32.74842, -117.14250 32.7...
                                                          073
3 POLYGON ((-117.11577 32.75522, -117.11362 32.7...
                                                          073
4 POLYGON ((-117.37213 33.20012, -117.36902 33.2...
                                                          073
[5 rows x 195 columns]
0.0.2 2.
                    Create
                               a
                                     second
                                                GeoDataFrame
                                                                    for
                                                                           the
      ~/data/shared/tims/sdcounty 2020 fatal.geojson This data records fatal
      traffic collisions in San Diego County from https://tims.berkeley.edu.
```

file:

Y

```
[18]: sd_fatal_collisions = gpd.read_file('~/data/shared/tims/sdcounty_2020_fatal.
       ⇔geojson')
[19]: sd_fatal_collisions.head()
[19]:
        COLLISION_DATE
                         COLLISION_TIME
                                         DAY_OF_WEEK
                                                       NUMBER_KILLED ALCOHOL_INVOLVED
      0
            2020-12-04
                                    1839
                                                    5
                                                                    1
            2020-12-17
                                   1939
                                                    4
                                                                    1
                                                                                      N
      1
                                                    7
                                                                    2
      2
            2020-12-20
                                   2151
                                                                                      Y
      3
            2020-03-06
                                    804
                                                    5
                                                                    1
                                                                                      N
```

2028

4

2020-05-05

2

```
geometry
     0 POINT (-117.08523 33.08923)
      1 POINT (-117.07560 33.10338)
      2 POINT (-117.09288 33.16100)
      3 POINT (-117.06862 33.12628)
      4 POINT (-117.06314 33.12370)
     0.1 3. What are the beginning and ending dates for the collision data?
     December 4, 2020 - May 5, 2020
          4. How many fatal collisions occurred during this period?
     5 fatal collisions occured during this time.
     0.3 5. How many individuals were killed in these collisions?
     9 people were killed from the collisions.
     0.4 6. What percentage of collisions were alcohol involved?
     40% of the collisions involved alcohol.
     0.5 7. What percentage of the fatalities were alcohol involved?
     66.7% of the fatalities involved alcohol.
[22]: import matplotlib.pyplot as plt
[24]: san_diego_tracts.plot(ax=ax, color='whitesmoke', edgecolor='black', linewidth=0.
       ⇒5)
[24]: <Axes: >
     <Figure size 640x480 with 0 Axes>
[25]: sd_fatal_collisions.plot(ax=ax, marker='o', color='red', markersize=5)
[25]: <Axes: >
     <Figure size 640x480 with 0 Axes>
[26]: ax.set_title('San Diego County - Census Tracts and Fatal Collisions')
      plt.show()
[27]: plt.show()
```

[28]: print(san_diego_tracts.crs)

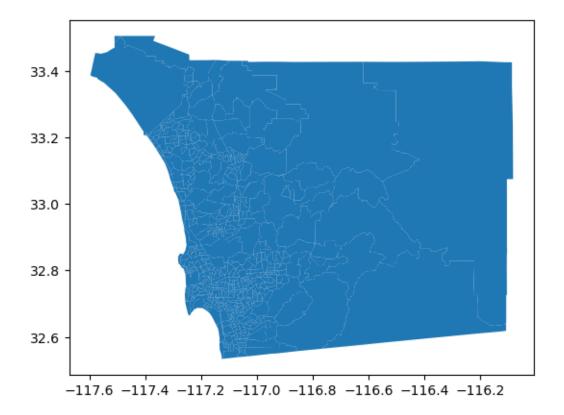
```
{"$schema": "https://proj.org/schemas/v0.7/projjson.schema.json", "type":
"GeographicCRS", "name": "WGS 84", "datum_ensemble": {"name": "World Geodetic
System 1984 ensemble", "members": [{"name": "World Geodetic System 1984
(Transit)"}, {"name": "World Geodetic System 1984 (G730)"}, {"name": "World
Geodetic System 1984 (G873)"}, {"name": "World Geodetic System 1984 (G1150)"},
{"name": "World Geodetic System 1984 (G1674)"}, {"name": "World Geodetic System
1984 (G1762)"}, {"name": "World Geodetic System 1984 (G2139)"}], "ellipsoid":
{"name": "WGS 84", "semi_major_axis": 6378137, "inverse_flattening":
298.257223563}, "accuracy": "2.0", "id": {"authority": "EPSG", "code": 6326}},
"coordinate_system": {"subtype": "ellipsoidal", "axis": [{"name": "Geodetic
latitude", "abbreviation": "Lat", "direction": "north", "unit": "degree"},
{"name": "Geodetic longitude", "abbreviation": "Lon", "direction": "east",
"unit": "degree"}]}, "scope": "Horizontal component of 3D system.", "area":
"World.", "bbox": {"south_latitude": -90, "west_longitude": -180,
"north_latitude": 90, "east_longitude": 180}, "id": {"authority": "EPSG",
"code": 4326}}
```

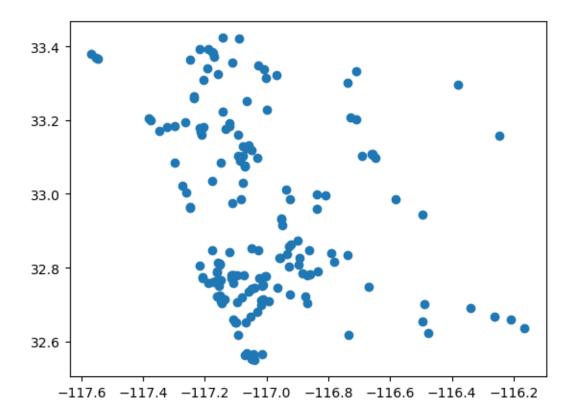
[29]: print(sd_fatal_collisions.crs)

EPSG:4326

```
[30]: if san_diego_tracts.crs != sd_fatal_collisions.crs: sd_fatal_collisions = sd_fatal_collisions.to_crs(san_diego_tracts.crs)
```

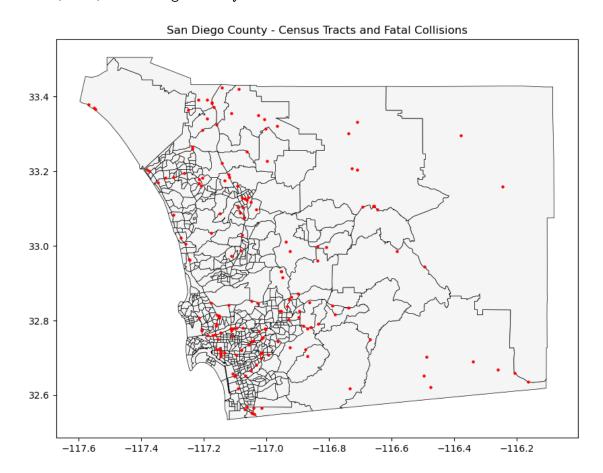
```
[31]: san_diego_tracts.plot() plt.show()
```

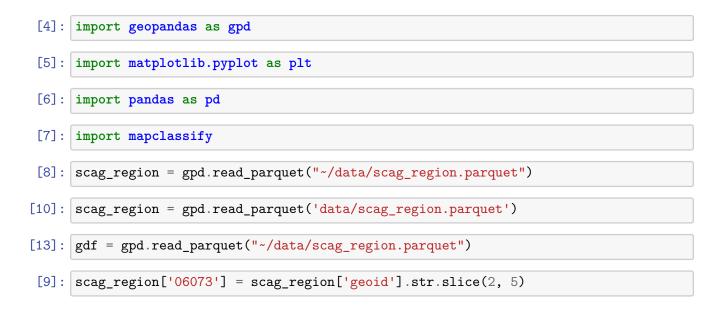




0.5.1 8. Create a two layer map that overlays the collision data on the tracts for San Diego County.

[39]: Text(0.5, 1.0, 'San Diego County - Census Tracts and Fatal Collisions')





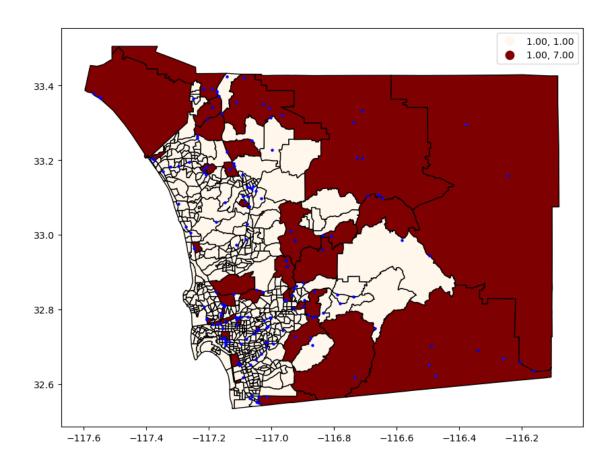
```
[10]: san_diego_tracts = scag_region[scag_region['06073'] == '073'].
       ⇔reset_index(drop=True)
[13]: sd_fatal_collisions = gpd.read_file('~/data/shared/tims/sdcounty_2020_fatal.
       ⇔geojson')
 [3]: import geopandas as gpd
 [8]: scag_region = gpd.read_parquet("~/data/scag_region.parquet")
      scag_region['06073'] = scag_region['geoid'].str.slice(2, 5)
 [9]:
[10]: san_diego_tracts = scag_region[scag_region['06073'] == '073'].
       ⇔reset_index(drop=True)
[13]: sd_fatal_collisions = gpd.read_file('~/data/shared/tims/sdcounty_2020_fatal.
       ⇔geojson')
[14]: | joined = gpd.sjoin(san_diego_tracts, sd_fatal_collisions, how="left", ___

→predicate="contains")
[16]: | joined = gpd.sjoin(san_diego_tracts, sd_fatal_collisions, how="left",__
       ⇔predicate="contains")
[17]: print(joined.columns)
     Index(['geoid', 'n_asian_under_15', 'n_black_under_15', 'n_hispanic_under_15',
             'n_native_under_15', 'n_white_under_15', 'n_persons_under_18',
            'n_asian_over_60', 'n_black_over_60', 'n_hispanic_over_60',
             'p_asian_over_60', 'p_disabled', 'geometry', '06073', 'index_right',
            'COLLISION_DATE', 'COLLISION_TIME', 'DAY_OF_WEEK', 'NUMBER_KILLED',
            'ALCOHOL_INVOLVED'],
           dtype='object', length=201)
[18]: collision_counts = joined.groupby('geoid').size()
     0.5.2 10. Create a new variable in the tracts GeoDataFrame called fatal that reports
            the number of fatal collisions that occurred in the tract.
```

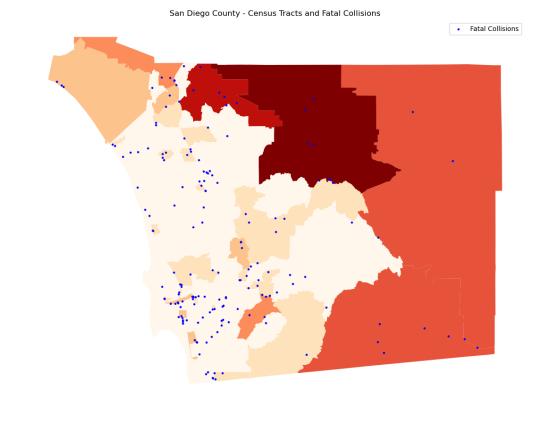
```
[19]: san_diego_tracts['fatal'] = san_diego_tracts['geoid'].map(collision_counts).
```

0.5.3 11. Create a new variable in the collisions GeoDataFrame called tractidx that reports the index of the tract that contains the collision.

```
[48]:
      sd_fatal_collisions['tractidx'] = joined['index_right']
[24]: joined.reset_index(inplace=True)
[25]: sd_fatal_collisions['tract_geoid'] = joined['geoid']
      san_diego_tracts.reset_index(inplace=True, drop=False)
[27]:
[28]: | joined = gpd.sjoin(san_diego_tracts, sd_fatal_collisions, how="left", __
       ⇔predicate="contains")
[30]: import matplotlib.pyplot as plt
[31]: fig, ax = plt.subplots(figsize=(10, 10))
      san_diego_tracts.plot(ax=ax, column='fatal', legend=True, cmap='OrRd',_
       ⇔scheme='quantiles', edgecolor='black')
      sd_fatal_collisions.plot(ax=ax, marker='o', color='blue', markersize=5)
      plt.show()
     /opt/tljh/user/lib/python3.10/site-packages/mapclassify/classifiers.py:1592:
     UserWarning: Not enough unique values in array to form 5 classes. Setting k to
     2.
       self.bins = quantile(y, k=k)
```



0.5.4 12. Create a static, two layer map with the first layer offering a choropleth of variable fatal for each tract, and the second layer showing the locations of the fatal collisions.



0.5.5 13. Create an interactive map with the same two layers. Modify the tooltip argument in both layers to limit the number of variables that show when hovering over the polygons/points. The tooltip for the tracts should include the geoid and fatal variables, the tooltip for the point layer should include tractidx as well as the other attributes of the collision.

Number of Fatal Collisions

```
name='Choropleth',
  data=san_diego_tracts,
  columns=['geoid', 'fatal'],
  key_on='feature.properties.geoid',
  fill_color='YlGn',
  fill_opacity=0.7,
  line_opacity=0.2,
  legend_name='Fatal Collisions Count',
  highlight=True
).add_to(m)
```

[42]: <folium.features.Choropleth at 0x76fe9f1efca0>

```
[49]: for _, row in sd_fatal_collisions.iterrows():
    folium.Marker(
        location=[row.geometry.y, row.geometry.x],
        popup=f'Tract ID: {row["tractidx"]}',
        icon=folium.Icon(color='red', icon='info-sign')
    ).add_to(m)
```

```
[50]: m
```

[50]: <folium.folium.Map at 0x76fe940ca890>

0.5.6 15. Based on your exploration, provide an interpretation of the spatial distribution of fatal collisions.

The fatal accidents are noticeably in more densely populated areas, even though the census tracts such as the Santa Ynez Indian Reservation show more fatal collisions, which is due to the size of the tiny census tracts of the urban areas of San Diego.

```
[]:
```