# Lab2P2

### January 15, 2024

```
[1]: from osgeo import ogr
[2]: r = ogr.Geometry(ogr.wkbLinearRing)
     r.AddPoint(1,1)
     r.AddPoint(5,1)
     r.AddPoint(5,5)
     r.AddPoint(1,5)
     r.AddPoint(1,1)
     poly = ogr.Geometry(ogr.wkbPolygon)
     poly.AddGeometry(r)
     print(poly.ExportToWkt())
    POLYGON ((1 1 0,5 1 0,5 5 0,1 5 0,1 1 0))
[3]: geojson = """{"type": "Polygon", "coordinates":
     \hookrightarrow [[[1,1],[5,1],[5,5],[1,5],[1,1]]]}"""
     polygon = ogr.CreateGeometryFromJson(geojson)
     print(polygon)
    POLYGON ((1 1,5 1,5 5,1 5,1 1))
[4]: # 1 create area
     print("The area of our polygon is %d" %polygon.Area())
    The area of our polygon is 16
[5]: cen = polygon.Centroid()
     print(cen)
    POINT (3 3)
[6]: # 4 convex bull does the same in this case as boundary, as our polygon is ___
     ⇔square:
     ch = polygon.ConvexHull()
     print(ch)
```

```
POLYGON ((1 1,1 5,5 5,5 1,1 1))
 [7]: # 5 buffer. A buffer value of 0 (zero) returns the same values as boundary and
      → convex hull in this example:
      buffer = polygon.Buffer(0)
      print(buffer)
     POLYGON ((1 1,1 5,5 5,5 1,1 1))
 [8]: #6 check if a point is inside our polygon
      point = ogr.Geometry(ogr.wkbPoint)
      point.AddPoint(10,10)
      polygon.Contains(point)
 [8]: False
 [9]: import osgeo.ogr, osgeo.osr
[10]: #1 set the spatial reference
      spatialReference = osgeo.osr.SpatialReference()
      spatialReference.ImportFromProj4('+proj=longlat +ells=WGS84+datum=WGS +no_defs')
      #2 create a new shapefile
      driver = osgeo.ogr.GetDriverByName('ESRI Shapefile')
      shapeData = driver.CreateDataSource('my_polygon.shp')
      #3 create the layer
      layer = shapeData.CreateLayer('polygon_layer', spatialReference, osgeo.ogr.
      →wkbPolygon)
      layerDefinition = layer.GetLayerDefn()
      #4 geometry is put inside feature
      featureIndex = 0
      feature = osgeo.ogr.Feature(layerDefinition)
      feature.SetGeometry(polygon)
      feature.SetFID(featureIndex)
      #5 feature is put into layer
      layer.CreateFeature(feature)
      #6 check if the file has been created correctly
      !ogrinfo my_polygon.shp
```

INFO: Open of `my\_polygon.shp'
 using driver `ESRI Shapefile' successful.

#### 1: my\_polygon (Polygon)

```
[11]: # import modules
      from osgeo import ogr
      import os
      #reference the shapefile and specify driver type
      shapefile = r"Data/10m_cultural/ne_10m_populated_places.shp"
      driver = ogr.GetDriverByName("ESRI Shapefile")
      #open the data source with driver, zero means open in read-only mode
      dataSource = driver.Open(shapefile, 0)
      #use the GetLayer() function for referencing the layer that holds the data
      layer = dataSource.GetLayer()
      #pass in the coordinates for the data frame to the SetSpatialFilterRect()_{\sqcup}
       →function. This filter creates a rectangular extent and selects the features_
       \rightarrow inside the extent
      layer.SetSpatialFilterRect(-102, 26, -94, 36)
      for feature in layer:
          # select only the cities inside of the USA
          # we can do this through a SQL query:
          # we skip the cities inside of the USA,
          # and print the names of the cities that are
          if feature.GetField("ADMONAME") != "United States of America":
                   continue
          else:
                  print(feature.GetField("NAME"))
```

Ardmore McAlester Bryan San Marcos Longview McAllen Harlingen Alice New Braunfels Cleburne Brownwood Big Spring Vernon Childress Texas City Pasadena Baytown

Arlington

Texarkana

Fort Smith

Lawton

Norman

Muskogee

Shawnee

Conroe

Nacogdoches

Eagle Pass

Edinburg

Kingsville

Huntsville

Killeen

Lufkin

Del Rio

San Angelo

Sherman

Beaumont

Bay City

Port Lavaca

Falfurrias

Beeville

Dumas

Denton

Temple

 ${\tt Galveston}$ 

Freeport

Victoria

Wichita Falls

Waco

Lubbock

Abilene

Tyler

Ft. Worth

Corpus Christi

Austin

Amarillo

Laredo

Oklahoma City

San Antonio

Dallas

Houston

```
[12]: from shapely.geometry import Polygon
p1 = Polygon(((1, 2), (5, 3), (5, 7), (1, 9), (1, 2)))
p2 = Polygon(((6,6), (7,6), (10,4), (11,8), (6,6)))
```

p1

[12]:



[13]: # A new command line is required for printing the second polygon: p2

[13]:



```
[14]: # Point takes tuples as well as positional coordinate values

from shapely.geometry import Point
point = Point(2.0, 2.0)
q = Point((2.0, 2.0))
q
```

[14]:

0

```
[15]: # line geometry
from shapely.geometry import LineString
line = LineString([(0, 0), (10,10)])
line
```

[15]:



```
[16]: # linear rings
      from shapely.geometry.polygon import LinearRing
      ring = LinearRing([(0,0), (3,3), (3,0)])
      ring
[16]:
[17]: # collection of points
      from shapely.geometry import MultiPoint
      points = MultiPoint([(0.0, 0.0), (3.0, 3.0)])
      points
[17]:
[18]: # collection of lines
      from shapely.geometry import MultiLineString
      coords = [((0, 0), (1, 1)), ((-1, 0), (1, 0))]
```

coords

[18]: [((0, 0), (1, 1)), ((-1, 0), (1, 0))]

```
[19]: # collection of polygons
                    from shapely.geometry import MultiPolygon
                    polygons = MultiPolygon([p1, p2,])
                    polygons
[19]:
[20]: print(p1.area)
                    print(p1.bounds)
                    print(p1.length)
                    print(p1.geom_type)
                  22.0
                   (1.0, 2.0, 5.0, 9.0)
                  19.59524158061724
                  Polygon
[21]: import json
                    from shapely.geometry import mapping, shape
                    p = shape(json.loads('{"type": "Polygon", "coordinates":[[[1,1], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], [1,3], 
                      →[3,3]]]}'))
                    print(json.dumps(mapping(p)))
                    p.area
                   {"type": "Polygon", "coordinates": [[[1.0, 1.0], [1.0, 3.0], [3.0, 3.0], [1.0,
                  1.0]]]}
[21]: 2.0
[22]: import fiona
                    c = fiona.open(r"Data/110m_cultural/ne_110m_admin_1_states_provinces.shp")
                    rec = next(iter(c))
                    rec.keys()
[22]: dict_keys(['type', 'id', 'properties', 'geometry'])
[23]: import pprint
                    pprint.pprint(rec['type'])
                    pprint.pprint(rec['id'])
                    pprint.pprint(rec['properties'])
```

### pprint.pprint(rec['geometry'])

```
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0'
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                        (-89.84283098016755, 47.464725857119504),
                        (-89.95765601272012, 47.286907253603175)]],
      'type': 'Polygon'}
[24]: print(len(c)) # prints total amount of features
      print(c.driver) # prints driver name
      print(c.crs) # prints coordinate reference system of data file
     51
     ESRI Shapefile
     {'init': 'epsg:4326'}
[25]: import pprint, fiona
      with fiona.open\
      (r"Data/110m_cultural/ne_110m_admin_1_states_provinces.shp") as src:
          pprint.pprint(src[0])
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[27]: geom = shape(minnesota)
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[27]:



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[28]: import geopandas as gpd
%matplotlib inline
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6	Arizona			AZ Ariz.	
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24		None						
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46		None						
47		None						
48	•••	None						
49		None						
50	•••	None						

	FCLASS_UA	FCLASS_TLC	geometry
0	None	None	POLYGON ((-89.95766 47.28691, -90.13175 47.292
1	None	None	POLYGON ((-116.04823 49.00037, -113.05950 49.0
2	None	None	POLYGON ((-97.22894 49.00089, -97.21414 48.902
3	None	None	MULTIPOLYGON (((-155.93665 19.05939, -155.9080
4	None	None	POLYGON ((-116.04823 49.00037, -115.96780 47.9
5	None	None	POLYGON ((-117.03143 48.99931, -117.02665 47.7
6	None	None	POLYGON ((-109.04522 36.99991, -109.04367 31.3
7	None	None	POLYGON ((-114.64222 35.05311, -114.62212 34.9
8	None	None	POLYGON ((-102.05017 40.00081, -102.04012 38.4
9	None	None	POLYGON ((-117.02825 42.00002, -114.03422 41.9
10	None	None	POLYGON ((-109.04367 31.34190, -109.04522 36.9
11	None	None	POLYGON ((-116.91500 45.99998, -116.67900 45.8
12	None	None	POLYGON ((-114.03422 41.99312, -111.05024 42.0
13	None	None	POLYGON ((-111.08518 44.50615, -111.06719 44.5
14	None	None	POLYGON ((-89.66292 36.02307, -89.67351 35.940
15	None	None	POLYGON ((-96.45266 43.50179, -95.35994 43.500
16	None	None	POLYGON ((-102.04118 36.99198, -102.04012 38.4
17	None	None	POLYGON ((-89.66292 36.02307, -90.31539 36.023

```
18
        None
                          POLYGON ((-102.05017 40.00081, -102.05017 40.0...
                    None
                          POLYGON ((-103.00322 36.99516, -102.04118 36.9...
19
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                    None
                          POLYGON ((-96.53945 46.01797, -96.55689 45.872...
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                          POLYGON ((-94.05976 33.01212, -93.09403 33.010...
21
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22
                          POLYGON ((-106.50734 31.75429, -106.61953 31.9...
        None
                    None
                          POLYGON ((-73.49794 42.05451, -72.73222 42.035...
23
        None
                    None
24
                          POLYGON ((-71.80091 42.01325, -72.73222 42.035...
        None
                    None
25
        None
                    None
                          POLYGON ((-70.81505 42.86519, -70.93360 42.884...
26
                          POLYGON ((-71.85383 41.32004, -71.79295 41.466...
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                          POLYGON ((-72.45707 42.72708, -73.28203 42.743...
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                    None
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        None
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        None
                    None
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        None
                    None
                          POLYGON ((-90.24924 35.02083, -90.13493 35.113...
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                          MULTIPOLYGON (((-83.33059 36.67266, -83.17851 ...
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                    None
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                          POLYGON ((-91.22820 43.50125, -91.25466 43.613...
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41
        None
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                          POLYGON ((-81.97254 37.53595, -82.16728 37.554...
                          POLYGON ((-75.04839 38.44876, -75.71462 38.449...
42
        None
                    None
                          POLYGON ((-77.04124 38.78954, -77.04123 38.789...
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        None
                    None
                          POLYGON ((-75.37754 38.01538, -75.37754 38.015...
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        None
                    None
45
                          POLYGON ((-75.52781 39.49865, -75.55427 39.691...
        None
                    None
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        None
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                          POLYGON ((-73.49794 42.05451, -73.55349 41.289...
47
                          POLYGON ((-80.51893 40.64111, -80.51627 42.324...
        None
                    None
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                          POLYGON ((-70.64573 43.09008, -70.75102 43.080...
        None
                    None
                          POLYGON ((-89.95766 47.28691, -89.84283 47.464...
49
        None
                    None
                          MULTIPOLYGON (((-153.22873 57.96897, -152.5647...
50
        None
                    None
```

[51 rows x 122 columns]

```
[29]: type(df)
```

[29]: geopandas.geodataframe.GeoDataFrame

```
[30]: df.shape
```

[30]: (51, 122)

[31]: df.columns

```
[31]: Index(['featurecla', 'scalerank', 'adm1_code', 'diss_me', 'iso_3166_2',
             'wikipedia', 'iso_a2', 'adm0_sr', 'name', 'name_alt',
             'FCLASS_ID', 'FCLASS_PL', 'FCLASS_GR', 'FCLASS_IT', 'FCLASS_NL',
             'FCLASS_SE', 'FCLASS_BD', 'FCLASS_UA', 'FCLASS_TLC', 'geometry'],
            dtype='object', length=122)
[32]: df.loc[0]
[32]: featurecla
                                                     Admin-1 scale rank
      scalerank
                                                                       2
                                                                USA-3514
      adm1_code
      diss_me
                                                                    3514
      iso_3166_2
                                                                   US-MN
      FCLASS_SE
                                                                    None
      FCLASS_BD
                                                                    None
      FCLASS_UA
                                                                    None
      FCLASS_TLC
                                                                    None
                    POLYGON ((-89.95765601272012 47.28690725360318...
      geometry
      Name: 0, Length: 122, dtype: object
[33]: df['name']
[33]: 0
                        Minnesota
      1
                          Montana
      2
                    North Dakota
      3
                           Hawaii
      4
                            Idaho
      5
                       Washington
      6
                          Arizona
      7
                       California
      8
                         Colorado
      9
                           Nevada
                      New Mexico
      10
      11
                           Oregon
      12
                             Utah
      13
                          Wyoming
      14
                         Arkansas
      15
                             Iowa
      16
                           Kansas
      17
                         Missouri
      18
                         Nebraska
      19
                         Oklahoma
      20
                    South Dakota
      21
                        Louisiana
      22
                            Texas
```

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24
                   Massachusetts
      25
                   New Hampshire
      26
                    Rhode Island
      27
                          Vermont
      28
                          Alabama
      29
                          Florida
      30
                          Georgia
      31
                     Mississippi
      32
                  South Carolina
                         Illinois
      33
      34
                          Indiana
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                         Kentucky
      36
                  North Carolina
      37
                             Ohio
      38
                       Tennessee
      39
                         Virginia
      40
                        Wisconsin
      41
                   West Virginia
      42
                         Delaware
      43
            District of Columbia
      44
                         Maryland
      45
                      New Jersey
      46
                         New York
      47
                    Pennsylvania
      48
                            Maine
      49
                         Michigan
      50
                           Alaska
      Name: name, dtype: object
[34]: california = df.loc[df['name'] == "California"]
      california
                 featurecla scalerank adm1_code
                                                   diss_me iso_3166_2 \setminus
[34]:
         Admin-1 scale rank
                                      2 USA-3521
                                                       3521
                                                                  US-CA
                                        wikipedia iso_a2 adm0_sr
                                                                           name \
      7 http://en.wikipedia.org/wiki/California
                                                       US
                                                                     California
          name_alt ... FCLASS_ID FCLASS_PL FCLASS_GR FCLASS_IT FCLASS_NL FCLASS_SE \
         CA|Calif.
                            None
                                      None
                                                 None
                                                           None
                                                                      None
                                                                                None
        FCLASS_BD FCLASS_UA FCLASS_TLC \
             None
                       None
                                   None
                                                    geometry
      7 POLYGON ((-114.64222 35.05311, -114.62212 34.9...
```

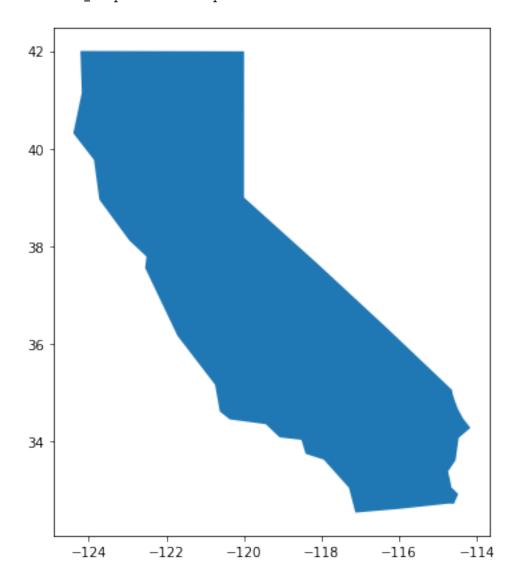
23

Connecticut

## [1 rows x 122 columns]

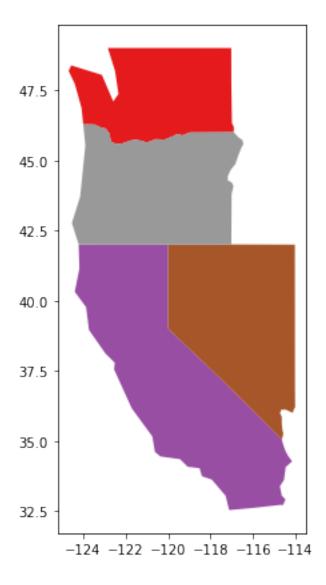
```
[35]: california.plot(figsize=(7,7))
```

[35]: <matplotlib.axes.\_subplots.AxesSubplot at 0x7b3114127950>



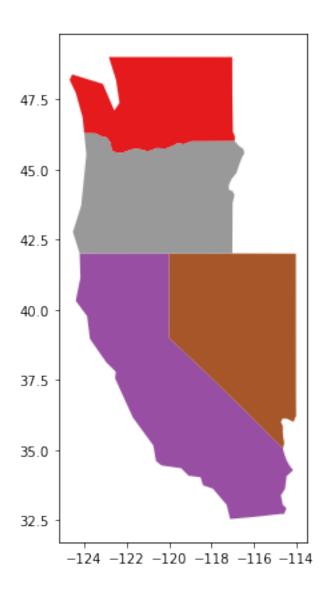
```
[36]: multipl = df.iloc[[5,7,9,11]]
multipl.plot(cmap="Set1", figsize=(7,7))
```

[36]: <matplotlib.axes.\_subplots.AxesSubplot at 0x7b310e1e0a90>



```
[37]: exp = df.cx[-124:-118,30:50]
exp.plot(cmap="Set1", figsize=(7,7))
```

[37]: <matplotlib.axes.\_subplots.AxesSubplot at 0x7b310e1eb9d0>



```
[38]: import geopandas
[39]: states = geopandas.read_file(r"Data/110m_cultural/
       →ne_110m_admin_1_states_provinces.shp")
[40]: states
[40]:
                  featurecla scalerank adm1_code
                                                    diss_me iso_3166_2 \setminus
          Admin-1 scale rank
                                       2 USA-3514
                                                       3514
                                                                 US-MN
      0
          Admin-1 scale rank
                                       2 USA-3515
                                                       3515
      1
                                                                 US-MT
      2
          Admin-1 scale rank
                                      2 USA-3516
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                                                                 US-ND
      3
          Admin-1 scale rank
                                      2 USA-3517
                                                       3517
                                                                 US-HI
      4
          Admin-1 scale rank
                                      2
                                         USA-3518
                                                       3518
                                                                 US-ID
          Admin-1 scale rank
                                       2 USA-3519
                                                       3519
                                                                 US-WA
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6
    Admin-1 scale rank
                                     USA-3520
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7
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    Admin-1 scale rank
                                     USA-3521
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                                                             US-CA
8
    Admin-1 scale rank
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                                                   3522
                                                              US-CO
    Admin-1 scale rank
9
                                     USA-3523
                                                   3523
                                                              US-NV
    Admin-1 scale rank
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                                     USA-3524
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                                                             US-NM
11
    Admin-1 scale rank
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                                     USA-3525
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                                                             US-OR
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   Admin-1 scale rank
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                                     USA-3526
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                                                             US-WY
    Admin-1 scale rank
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                                                             US-AR
    Admin-1 scale rank
                                     USA-3529
15
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                                                             US-IA
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                                                             US-KS
                                     USA-3531
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    Admin-1 scale rank
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                                                             US-MO
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    Admin-1 scale rank
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                                                   3532
                                                             US-NE
                                     USA-3533
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    Admin-1 scale rank
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                                                   3533
                                                             US-OK
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                                  2
                                     USA-3534
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    Admin-1 scale rank
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                                                   3535
                                                             US-LA
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    Admin-1 scale rank
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                                                   3536
                                                             US-TX
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                                                              US-CT
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    Admin-1 scale rank
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                                                              US-MA
25
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                                     USA-3538
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                                                             US-NH
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                                  2
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                                                             US-RI
                                     USA-3540
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    Admin-1 scale rank
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                                                             US-VT
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                                                             US-AL
29
    Admin-1 scale rank
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                                     USA-3542
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                                                             US-FL
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    Admin-1 scale rank
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                                                             US-GA
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    Admin-1 scale rank
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    Admin-1 scale rank
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    Admin-1 scale rank
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                                                              US-VA
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                                                             US-MD
    Admin-1 scale rank
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                                                             US-NJ
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                                                   3561
                                                             US-ME
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                                                   3563
                                                             US-AK
```

wikipedia iso\_a2 adm0\_sr \

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                    http://en.wikipedia.org/wiki/Idaho
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    http://en.wikipedia.org/wiki/Georgia_(U.S._state)
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                http://en.wikipedia.org/wiki/Kentucky
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          http://en.wikipedia.org/wiki/North_Carolina
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               http://en.wikipedia.org/wiki/Tennessee
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                http://en.wikipedia.org/wiki/New_York
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```

47	http://en.wik	ipedia.org/wiki/Pennsylvan	ia US	1			
48	http:/	/en.wikipedia.org/wiki/Mai	ne US	6			
49	http://en	.wikipedia.org/wiki/Michig	an US	1			
50	http://	en.wikipedia.org/wiki/Alas	ka US	6			
	name			name_alt	\		
0	Minnesota			MN Minn.			
1	Montana			MT Mont.			
2	North Dakota			ND N.D.			
3	Hawaii			HI Hawaii			
4	Idaho			ID Idaho			
5	Washington			WA Wash.			
6	Arizona			AZ Ariz.			
7	California			CA Calif.			
8	Colorado			CO Colo.			
9	Nevada			NV   Nev.			
10	New Mexico			NM N.M.			
11	Oregon			OR Ore.			
12	Utah			UT			
13	Wyoming			WY Wyo.			
14	Arkansas			AR Ark.			
15	Iowa			IA Iowa			
16	Kansas			KS Kans.			
17	Missouri			MO			
18	Nebraska			NE Nebr.			
19	Oklahoma			OK Okla.			
20	South Dakota			SD S.D.			
21	Louisiana			LA			
22	Texas			TX Tex.			
23	Connecticut			CT   Conn.			
24	Massachusetts	Commonwealth o	f Massachu	setts MA Mass.			
25	New Hampshire			NH N.H.			
26	Rhode Island	State of Rhode Island and	Providenc	e Plantatio			
27	Vermont			VT			
28	Alabama			AL Ala.			
29	Florida			FL Fla.			
30	Georgia			GA Ga.			
31	Mississippi			MS Miss.			
32	South Carolina			SC S.C.			
33	Illinois			IL I11.			
34	Indiana			IN Ind.			
35	Kentucky	Com	monwealth	of Kentucky KY			
36	North Carolina			NC N.C.			
37	Ohio			OH Ohio			
38	Tennessee			TN Tenn.			
39	Virginia			VA			
40	Wisconsin			WI Wis.			

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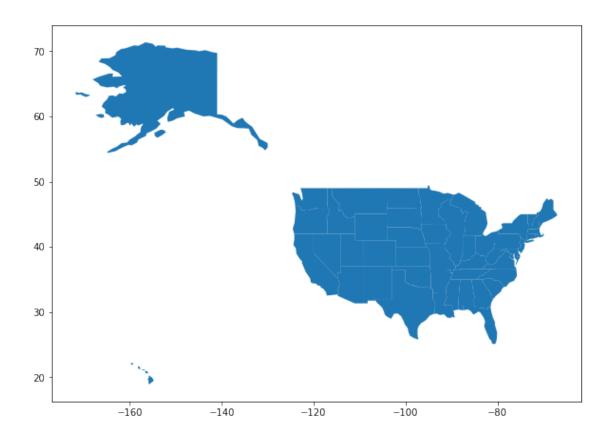
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14         None         POLYGON ((-89.66292 36.02307, -89.67351 35.940)           15         None         None         POLYGON ((-96.45266 43.50179, -95.35994 43.500)           16         None         None         POLYGON ((-102.04118 36.99198, -102.04012 38.4)           17         None         None         POLYGON ((-89.66292 36.02307, -90.31539 36.023)           18         None         None         POLYGON ((-102.05017 40.00081, -102.05017 40.0)           19         None         None         POLYGON ((-103.00322 36.99516, -102.04118 36.9)           20         None         None         POLYGON ((-96.53945 46.01797, -96.55689 45.872)           21         None         None         POLYGON ((-94.05976 33.01212, -93.09403 33.010)           22         None         None         POLYGON ((-106.50734 31.75429, -106.61953 31.9)           23         None         None         POLYGON ((-73.49794 42.05451, -72.73222 42.035)           24         None         None         POLYGON ((-71.80091 42.01325, -72.73222 42.035)           25         None         None         POLYGON ((-70.81505 42.86519, -70.93360 42.884)           26         None         None         POLYGON ((-71.85383 41.32004, -71.79295 41.466)	12	None	None	POLYGON ((-114.03422 41.99312, -111.05024 42.0
15         None         None         POLYGON ((-96.45266 43.50179, -95.35994 43.500)           16         None         None         POLYGON ((-102.04118 36.99198, -102.04012 38.4)           17         None         None         POLYGON ((-89.66292 36.02307, -90.31539 36.023)           18         None         None         POLYGON ((-102.05017 40.00081, -102.05017 40.0)           19         None         None         POLYGON ((-103.00322 36.99516, -102.04118 36.9)           20         None         None         POLYGON ((-96.53945 46.01797, -96.55689 45.872)           21         None         None         POLYGON ((-94.05976 33.01212, -93.09403 33.010)           22         None         None         POLYGON ((-106.50734 31.75429, -106.61953 31.9)           23         None         None         POLYGON ((-73.49794 42.05451, -72.73222 42.035)           24         None         None         POLYGON ((-71.80091 42.01325, -72.73222 42.035)           25         None         None         POLYGON ((-70.81505 42.86519, -70.93360 42.884)           26         None         None         POLYGON ((-71.85383 41.32004, -71.79295 41.466)	13	None	None	POLYGON ((-111.08518 44.50615, -111.06719 44.5
16         None         None         POLYGON ((-102.04118 36.99198, -102.04012 38.4)           17         None         None         POLYGON ((-89.66292 36.02307, -90.31539 36.023)           18         None         None         POLYGON ((-102.05017 40.00081, -102.05017 40.0)           19         None         None         POLYGON ((-103.00322 36.99516, -102.04118 36.9)           20         None         None         POLYGON ((-96.53945 46.01797, -96.55689 45.872)           21         None         None         POLYGON ((-94.05976 33.01212, -93.09403 33.010)           22         None         None         POLYGON ((-106.50734 31.75429, -106.61953 31.9)           23         None         None         POLYGON ((-73.49794 42.05451, -72.73222 42.035)           24         None         None         POLYGON ((-71.80091 42.01325, -72.73222 42.035)           25         None         None         POLYGON ((-70.81505 42.86519, -70.93360 42.884)           26         None         None         POLYGON ((-71.85383 41.32004, -71.79295 41.466)	14	None	None	POLYGON ((-89.66292 36.02307, -89.67351 35.940
17         None         None         POLYGON ((-89.66292 36.02307, -90.31539 36.023           18         None         None         POLYGON ((-102.05017 40.00081, -102.05017 40.0           19         None         None         POLYGON ((-103.00322 36.99516, -102.04118 36.9           20         None         None         POLYGON ((-96.53945 46.01797, -96.55689 45.872           21         None         None         POLYGON ((-94.05976 33.01212, -93.09403 33.010           22         None         None         POLYGON ((-106.50734 31.75429, -106.61953 31.9           23         None         None         POLYGON ((-73.49794 42.05451, -72.73222 42.035           24         None         None         POLYGON ((-71.80091 42.01325, -72.73222 42.035           25         None         None         POLYGON ((-70.81505 42.86519, -70.93360 42.884           26         None         None         POLYGON ((-71.85383 41.32004, -71.79295 41.466	15	None	None	POLYGON ((-96.45266 43.50179, -95.35994 43.500
18         None         None         POLYGON ((-102.05017 40.00081, -102.05017 40.0)           19         None         None         POLYGON ((-103.00322 36.99516, -102.04118 36.9)           20         None         None         POLYGON ((-96.53945 46.01797, -96.55689 45.872)           21         None         None         POLYGON ((-94.05976 33.01212, -93.09403 33.010)           22         None         None         POLYGON ((-106.50734 31.75429, -106.61953 31.9)           23         None         None         POLYGON ((-73.49794 42.05451, -72.73222 42.035)           24         None         None         POLYGON ((-71.80091 42.01325, -72.73222 42.035)           25         None         None         POLYGON ((-70.81505 42.86519, -70.93360 42.884)           26         None         None         POLYGON ((-71.85383 41.32004, -71.79295 41.466)	16	None	None	POLYGON ((-102.04118 36.99198, -102.04012 38.4
19         None         None         POLYGON ((-103.00322 36.99516, -102.04118 36.9)           20         None         None         POLYGON ((-96.53945 46.01797, -96.55689 45.872)           21         None         None         POLYGON ((-94.05976 33.01212, -93.09403 33.010)           22         None         None         POLYGON ((-106.50734 31.75429, -106.61953 31.9)           23         None         None         POLYGON ((-73.49794 42.05451, -72.73222 42.035)           24         None         None         POLYGON ((-71.80091 42.01325, -72.73222 42.035)           25         None         None         POLYGON ((-70.81505 42.86519, -70.93360 42.884)           26         None         None         POLYGON ((-71.85383 41.32004, -71.79295 41.466)	17	None	None	POLYGON ((-89.66292 36.02307, -90.31539 36.023
20         None         None         POLYGON ((-96.53945 46.01797, -96.55689 45.872           21         None         None         POLYGON ((-94.05976 33.01212, -93.09403 33.010           22         None         None         POLYGON ((-106.50734 31.75429, -106.61953 31.9           23         None         None         POLYGON ((-73.49794 42.05451, -72.73222 42.035           24         None         None         POLYGON ((-71.80091 42.01325, -72.73222 42.035           25         None         None         POLYGON ((-70.81505 42.86519, -70.93360 42.884           26         None         None         POLYGON ((-71.85383 41.32004, -71.79295 41.466	18	None	None	POLYGON ((-102.05017 40.00081, -102.05017 40.0
21         None         None         POLYGON ((-94.05976 33.01212, -93.09403 33.010           22         None         None         POLYGON ((-106.50734 31.75429, -106.61953 31.9           23         None         None         POLYGON ((-73.49794 42.05451, -72.73222 42.035           24         None         None         POLYGON ((-71.80091 42.01325, -72.73222 42.035           25         None         None         POLYGON ((-70.81505 42.86519, -70.93360 42.884           26         None         None         POLYGON ((-71.85383 41.32004, -71.79295 41.466	19	None	None	POLYGON ((-103.00322 36.99516, -102.04118 36.9
22         None         None         POLYGON ((-106.50734 31.75429, -106.61953 31.9           23         None         None         POLYGON ((-73.49794 42.05451, -72.73222 42.035           24         None         None         POLYGON ((-71.80091 42.01325, -72.73222 42.035           25         None         None         POLYGON ((-70.81505 42.86519, -70.93360 42.884           26         None         None         POLYGON ((-71.85383 41.32004, -71.79295 41.466	20	None	None	POLYGON ((-96.53945 46.01797, -96.55689 45.872
None         None         POLYGON ((-73.49794 42.05451, -72.73222 42.035           None         None         POLYGON ((-71.80091 42.01325, -72.73222 42.035           None         None         POLYGON ((-70.81505 42.86519, -70.93360 42.884           None         None         POLYGON ((-71.85383 41.32004, -71.79295 41.466	21	None	None	POLYGON ((-94.05976 33.01212, -93.09403 33.010
24       None       None       POLYGON ((-71.80091 42.01325, -72.73222 42.035         25       None       None       POLYGON ((-70.81505 42.86519, -70.93360 42.884         26       None       None       POLYGON ((-71.85383 41.32004, -71.79295 41.466	22	None	None	POLYGON ((-106.50734 31.75429, -106.61953 31.9
25 None None POLYGON ((-70.81505 42.86519, -70.93360 42.884 26 None POLYGON ((-71.85383 41.32004, -71.79295 41.466	23	None	None	POLYGON ((-73.49794 42.05451, -72.73222 42.035
26 None POLYGON ((-71.85383 41.32004, -71.79295 41.466	24	None	None	POLYGON ((-71.80091 42.01325, -72.73222 42.035
·	25	None	None	POLYGON ((-70.81505 42.86519, -70.93360 42.884
27 None POLYGON ((-72.45707 42.72708, -73.28203 42.743	26	None	None	POLYGON ((-71.85383 41.32004, -71.79295 41.466
	27	None	None	POLYGON ((-72.45707 42.72708, -73.28203 42.743
28 None POLYGON ((-88.16696 34.99967, -86.90968 34.999	28	None	None	POLYGON ((-88.16696 34.99967, -86.90968 34.999

```
29
        None
                   None
                          POLYGON ((-87.53039 30.27420, -87.45789 30.411...
30
                          POLYGON ((-85.00519 30.99069, -85.05442 31.108...
        None
                   None
                          POLYGON ((-91.15624 33.01000, -91.10808 33.206...
31
        None
                   None
                          POLYGON ((-80.86501 32.03316, -81.03644 32.084...
32
        None
                   None
33
        None
                   None POLYGON ((-91.43033 40.36860, -91.41023 40.551...
                         POLYGON ((-88.05108 37.81960, -88.01881 38.021...
34
        None
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35
                         POLYGON ((-89.49836 36.50620, -89.27398 36.611...
        None
                   None
                   None POLYGON ((-83.07637 34.97903, -84.32097 34.986...
36
        None
                         POLYGON ((-84.82368 39.10653, -84.81787 39.799...
37
        None
                   None
38
        None
                         POLYGON ((-90.24924 35.02083, -90.13493 35.113...
                   None
39
                         MULTIPOLYGON (((-83.33059 36.67266, -83.17851 ...
        None
                   None
40
        None
                   None POLYGON ((-91.22820 43.50125, -91.25466 43.613...
41
        None
                   None POLYGON ((-81.97254 37.53595, -82.16728 37.554...
42
        None
                   None
                         POLYGON ((-75.04839 38.44876, -75.71462 38.449...
43
                   None POLYGON ((-77.04124 38.78954, -77.04123 38.789...
        None
                         POLYGON ((-75.37754 38.01538, -75.37754 38.015...
44
        None
                   None
45
                         POLYGON ((-75.52781 39.49865, -75.55427 39.691...
        None
                   None
46
                         POLYGON ((-73.49794 42.05451, -73.55349 41.289...
        None
                   None
                   None POLYGON ((-80.51893 40.64111, -80.51627 42.324...
47
        None
48
        None
                         POLYGON ((-70.64573 43.09008, -70.75102 43.080...
                   None
49
                   None POLYGON ((-89.95766 47.28691, -89.84283 47.464...
        None
50
                         MULTIPOLYGON (((-153.22873 57.96897, -152.5647...
        None
                   None
```

[51 rows x 122 columns]

```
[41]: %matplotlib inline states.plot(figsize=(10,10))
```

[41]: <matplotlib.axes.\_subplots.AxesSubplot at 0x7b310e187b90>



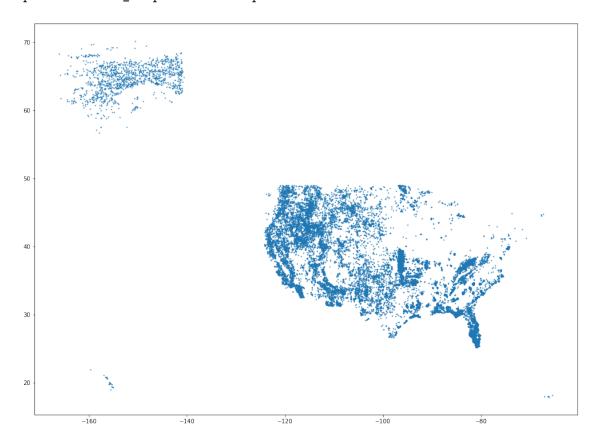
[42]: fires = geopandas.read\_file(r"Data/mtbs\_FODpoints\_DD/mtbs\_FODpoints\_DD.shp") fires

[42]:		Event_ID	:_ID irwinID \		<b>\</b>			
	0	AK6448214467319840607				None		
	1	SD4308410285019840906				None		
	2	MT4880411345819840819				None		
	3	MT4533610695819840826				None		
	4	MT4561710632319840918				None		
	•••	•••				•••		
	30413	AL3403308569720210307	4AEFD78F-C2	BE-470C-AE	B5F-1B091	8A84A23		
	30414	FL2862308067720200715	A7B0E005-54	EE-4827-A9	962-59495	C4B0623		
	30415	SC3450308143420210307				None		
	30416	AZ3415810972420210707	F1B3DE00-D5	8E-40FF-AF	F91-CE3C8	4389F80		
	30417	MT4566510682820210810	996C6346-4C	63-4FA8-A1	193-770E1	DE76344		
		${ t Incid\_Name}$	<pre>Incid_Type</pre>	Map_ID M	Map_Prog	${\tt Asmnt\_T}$	уре	\
	0	GLACIER CREEK	Wildfire	4534	MTBS	Initial (	(SS)	
	1	SANDOZ	Wildfire	4535	MTBS	Init	ial	
	2	NAPI PEAK	Wildfire	4536	MTBS	Exten	ided	
	3	KIRBY	Wildfire	4537	MTBS	Exten	ıded	

```
4
            LAKE CREEK
                                Wildfire
                                          4538
                                                        MTBS
                                                                   Initial
                 •••
                                 •••
                                               •••
30413
            MT WIESNER
                                Wildfire 10024251
                                                        MTBS
                                                                  Extended
30414 FMU 5.1 C AND D
                        Prescribed Fire 10024252
                                                        MTBS
                                                                   Initial
30415
               UNNAMED
                        Prescribed Fire 10024253
                                                       MTBS
                                                                   Initial
               FIREBOX
                                Wildfire 10024338
                                                        MTBS
30416
                                                                  Extended
30417
             LAME DEER
                                Wildfire 10024341
                                                       MTBS
                                                                   Initial
       BurnBndAc BurnBndLat BurnBndLon ... dNBR offst dNBR stdDv NoData T
0
            1897
                      64.482
                              -144.673 ...
                                                -9999
                                                            -9999
                                                                      9999
1
            2691
                     43.084
                              -102.850 ...
                                                  211
                                                            -9999
                                                                      -970
2
            3680
                     48.804
                             -113.458 ...
                                                  -62
                                                            -9999
                                                                      -970
3
            1597
                     45.336
                              -106.958 ...
                                                    52
                                                            -9999
                                                                      -970
                     45.617
                               -106.323 ...
                                                                      -970
4
            3617
                                                  -104
                                                            -9999
            1905
                                                                      -970
30413
                     34.019
                               -85.687
                                                    16
                                                               16
             914
                     28.641
                               -80.69
                                                               15
                                                                      -970
30414
                                                    18
30415
             645
                     34.504
                               -81.435
                                                    -5
                                                               13
                                                                      -970
            1075
                     34.157
                              -109.732 ...
                                                               29
                                                                      -970
30416
                                                    11
30417
            5470
                     45.644
                              -106.775
                                                    50
                                                               26
                                                                      -970
      IncGreen_T Low_T Mod_T High_T
                                         Comment ORIG FID
0
            9999
                    550
                            165
                                   -20
                                            None
                                                          0
1
                            700
                                            None
                                                          1
            -150
                    220
                                   9999
2
            -150
                    160
                            308
                                    515
                                            None
3
            -150
                    150
                            309
                                    525
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                                   9999
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30416
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                            313
                                   600
                                                      30416
30417
            -150
                            375
                                   9999
                                            None
                    110
                                                      30417
                           geometry
0
       POINT (-144.67325 64.48231)
1
       POINT (-102.84988 43.08393)
2
       POINT (-113.45772 48.80434)
3
       POINT (-106.95829 45.33640)
4
       POINT (-106.32284 45.61684)
      POINT (-85.68731 34.01841)
30413
30414
      POINT (-80.68930 28.64502)
30415 POINT (-81.43491 34.50382)
30416 POINT (-109.73103 34.15523)
30417 POINT (-106.77410 45.64768)
```

```
[43]: fires.plot(markersize=1, figsize=(17,17))
```

[43]: <matplotlib.axes.\_subplots.AxesSubplot at 0x7b310e18b2d0>



```
[44]: fires.crs
```

[44]: <Geographic 2D CRS: EPSG:4269>

Name: NAD83

Axis Info [ellipsoidal]:

- Lat[north]: Geodetic latitude (degree)
- Lon[east]: Geodetic longitude (degree)

Area of Use:

- name: North America - onshore and offshore: Canada - Alberta; British
Columbia; Manitoba; New Brunswick; Newfoundland and Labrador; Northwest
Territories; Nova Scotia; Nunavut; Ontario; Prince Edward Island; Quebec;
Saskatchewan; Yukon. Puerto Rico. United States (USA) - Alabama; Alaska;
Arizona; Arkansas; California; Colorado; Connecticut; Delaware; Florida;
Georgia; Hawaii; Idaho; Illinois; Indiana; Iowa; Kansas; Kentucky; Louisiana;
Maine; Maryland; Massachusetts; Michigan; Minnesota; Mississippi; Missouri;

Montana; Nebraska; Nevada; New Hampshire; New Jersey; New Mexico; New York; North Carolina; North Dakota; Ohio; Oklahoma; Oregon; Pennsylvania; Rhode Island; South Carolina; South Dakota; Tennessee; Texas; Utah; Vermont; Virginia; Washington; West Virginia; Wisconsin; Wyoming. US Virgin Islands. British Virgin Islands.

- bounds: (167.65, 14.92, -47.74, 86.46)

Datum: North American Datum 1983

- Ellipsoid: GRS 1980

- Prime Meridian: Greenwich

#### [45]: states.crs

[45]: <Geographic 2D CRS: EPSG:4326>

Name: WGS 84

Axis Info [ellipsoidal]:

Lat[north]: Geodetic latitude (degree)Lon[east]: Geodetic longitude (degree)

Area of Use: - name: World.

- bounds: (-180.0, -90.0, 180.0, 90.0)
Datum: World Geodetic System 1984 ensemble

- Ellipsoid: WGS 84

- Prime Meridian: Greenwich

```
[46]: fires = fires.to_crs("epsg:4326")
```

/opt/conda/lib/python3.7/site-packages/IPython/core/interactiveshell.py:3242: FutureWarning: The `op` parameter is deprecated and will be removed in a future release. Please use the `predicate` parameter instead.

if (await self.run\_code(code, result, async\_=asy)):

\	irwinID	Event_ID	[47]:
	None	AK6448214467319840607	0
	None	AK6393015752719840606	11
	None	AK6375715753719840609	12
	None	AK6535415457219840611	13
	None	AK6640915520219840617	14
			•••
	None	OH3869908322420090424	16992
	DB43038A-5584-4163-B1D1-E7A6F878F79B	OH3861408255620190322	28175
	4BA45C3A-34FE-44E4-976F-B5D1FAF86CAB	OH3948808216720210324	29456
	None	MA4250107165620050416	11907
	ODFC1976-D66F-40EA-B769-734EA8E42F99	MA4273407316920210514	29401

```
Map_ID Map_Prog \
                             Incid_Name
                                               Incid_Type
0
                         GLACIER CREEK
                                                 Wildfire
                                                                4534
                                                                         MTBS
11
                                                                4545
                                                                         MTBS
                               MUD FIRE
                                                 Wildfire
12
                            WAPOO FIRE
                                                 Wildfire
                                                                4546
                                                                         MTBS
13
                                 414008
                                                 Wildfire
                                                                4547
                                                                         MTBS
14
                              HUS NW 30
                                                                4548
                                                                         MTBS
                                                 Wildfire
16992
                                                                         MTBS
                                UNNAMED
                                                 Wildfire
                                                               18381
28175
       CY19 BLUEGRASS PRESCRIBED BURN
                                         Prescribed Fire 10017178
                                                                         MTBS
29456
              LONG RIDGE RX UNIT 1-12 Prescribed Fire
                                                            10021862
                                                                         MTBS
11907
                              THE RANGE
                                                 Wildfire
                                                               14408
                                                                         MTBS
29401
                         EAST MOUNTAIN
                                                 Wildfire
                                                          10021537
                                                                         MTBS
                      BurnBndAc BurnBndLat BurnBndLon ... NoData_T
          Asmnt_Type
0
        Initial (SS)
                                      64.482
                            1897
                                                -144.673
                                                                 9999
                                      63.930
                                                -157.527
                                                                 9999
11
       Extended (SS)
                           10243
12
       Extended (SS)
                           37083
                                      63.757
                                                -157.537
                                                                 9999
                                                -154.572
13
       Extended (SS)
                             3169
                                      65.354
                                                                 9999
14
       Extended (SS)
                             1990
                                      66.409
                                                -155.202
                                                                 9999
16992
                             3259
                                                 -83.224
                                                                 -970
             Initial
                                      38.699
28175
             Initial
                             1190
                                      38.617
                                                 -82.542
                                                                 -970
             Initial
                                                 -82.181 ...
                                                                 -970
29456
                             1037
                                      39.487
11907
             Initial
                              760
                                      42.501
                                                 -71.656 ...
                                                                 -970
29401
             Initial
                              964
                                      42.723
                                                 -73.157 ...
                                                                 -970
      IncGreen_T Low_T Mod_T High_T \
0
            9999
                    550
                          165
                                   -20
11
            9999
                    475
                          335
                                   225
12
             9999
                    450
                          300
                                   200
            9999
                    500
                                 -9999
13
                          260
14
             9999
                    490
                          140
                                   325
16992
            -150
                     70
                          299
                                   560
28175
            -150
                     20
                          215
                                  9999
29456
            -150
                         9999
                                  9999
                     75
11907
            -150
                    150
                         9999
                                  9999
29401
            -150
                     25
                         9999
                                  9999
                                                              ORIG FID \
                                                    Comment
0
                                                       None
                                                                     0
11
                         Hard to determine fire perimeter
                                                                    11
12
                                                       None
                                                                    12
13
                        Perimeter difficult to delineate.
                                                                    13
14
                                                                    14
                                                       None
```

```
16992
                                                      None
                                                                16992
                                                             28175
28175
       Revised 06/02/2021 - adjusted thresholds, remo...
29456
                                                      None
                                                                29456
11907
                                                      None
                                                                11907
29401
                                                      None
                                                                29401
                                                            name
                                     index_right
                           geometry
0
       POINT (-144.67325 64.48231)
                                               50
                                                          Alaska
                                                          Alaska
11
       POINT (-157.52685 63.92986)
                                               50
12
       POINT (-157.53652 63.75710)
                                               50
                                                          Alaska
13
       POINT (-154.57250 65.35357)
                                                          Alaska
                                               50
14
       POINT (-155.20182 66.40871)
                                               50
                                                          Alaska
•••
        POINT (-83.22436 38.69879)
16992
                                               37
                                                            Ohio
28175
        POINT (-82.54279 38.61839)
                                               37
                                                            Ohio
29456
        POINT (-82.17959 39.48788)
                                               37
                                                            Ohio
11907
        POINT (-71.64979 42.49544)
                                                   Massachusetts
                                               24
29401
        POINT (-73.15671 42.72522)
                                               24
                                                   Massachusetts
[30291 rows x 26 columns]
```

[48]: counts\_per\_state = state\_fires.groupby('name').size()
counts\_per\_state.sort\_values(axis=0, ascending=False)

### [48]: name

Florida 5507 Kansas 1982 California 1979 Idaho 1587 Texas 1503 Alaska 1377 Arizona 1279 Oklahoma 1112 Oregon 1071 New Mexico 1039 Nevada 1036 Mississippi 909 Montana 878 Alabama 833 South Carolina 815 Louisiana 746 Utah 715 Arkansas 700 Georgia 634 Washington 590 Minnesota 521 Wyoming 449

```
Missouri
                          315
      West Virginia
                          311
      North Carolina
                          303
      South Dakota
                          243
      Tennessee
                          210
      Virginia
                          158
      Nebraska
                          129
      New Jersey
                          114
      North Dakota
                          114
      Michigan
                           82
      Indiana
                           65
      Wisconsin
                           53
                           45
      Illinois
      Maryland
                           40
                           22
      Hawaii
      Pennsylvania
                           18
      Iowa
                           13
      New York
                           11
                            4
      Maine
      Ohio
                            4
      Delaware
                            3
                            2
      Massachusetts
      dtype: int64
[49]: states = states.merge(counts_per_state.reset_index(name='number_of_fires'))
      states.head()
[49]:
                 featurecla scalerank adm1_code
                                                    diss_me iso_3166_2 \setminus
      0 Admin-1 scale rank
                                       2 USA-3514
                                                        3514
                                                                  US-MN
      1 Admin-1 scale rank
                                       2 USA-3515
                                                        3515
                                                                  US-MT
      2 Admin-1 scale rank
                                       2 USA-3516
                                                        3516
                                                                  US-ND
      3 Admin-1 scale rank
                                       2 USA-3517
                                                        3517
                                                                  US-HI
      4 Admin-1 scale rank
                                       2 USA-3518
                                                                  US-ID
                                                        3518
                                           wikipedia iso_a2
                                                              adm0 sr
                                                                                name
      0
            http://en.wikipedia.org/wiki/Minnesota
                                                         US
                                                                    1
                                                                           Minnesota
      1
              http://en.wikipedia.org/wiki/Montana
                                                         US
                                                                    1
                                                                             Montana
        http://en.wikipedia.org/wiki/North_Dakota
      2
                                                         US
                                                                    1
                                                                       North Dakota
      3
               http://en.wikipedia.org/wiki/Hawaii
                                                         US
                                                                    8
                                                                              Hawaii
                http://en.wikipedia.org/wiki/Idaho
      4
                                                         US
                                                                               Idaho
          name_alt ... FCLASS_PL FCLASS_GR FCLASS_IT FCLASS_NL FCLASS_SE FCLASS_BD
      0
          MN | Minn.
                            None
                                       None
                                                 None
                                                            None
                                                                      None
                                                                                 None
      1
          MT | Mont.
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                                                 None
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                                                                                 None
      2
           ND|N.D.
                            None
                                       None
                                                 None
                                                            None
                                                                      None
                                                                                 None
```

403

367

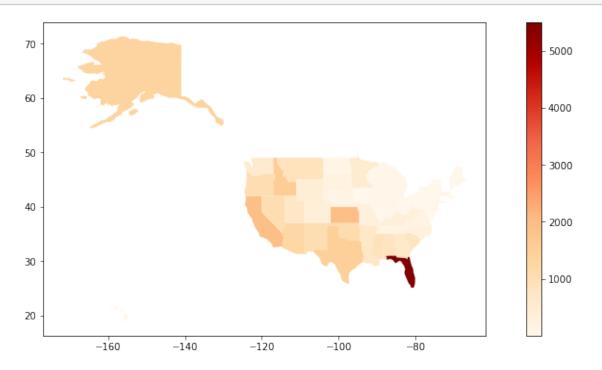
Colorado

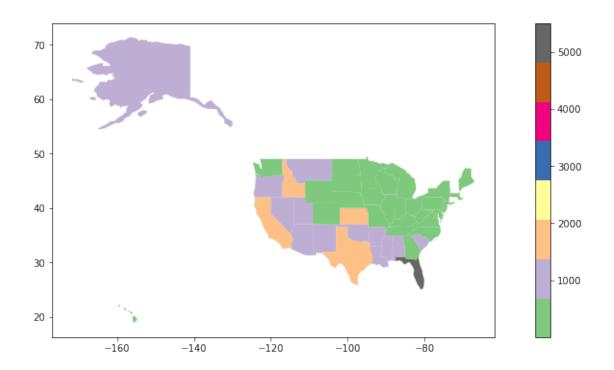
Kentucky

```
3 HI|Hawaii ...
                      None
                                None
                                           None
                                                     None
                                                                None
                                                                           None
    ID|Idaho
                                                                           None
                      None
                                None
                                           None
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 FCLASS_UA FCLASS_TLC
                                                                    geometry \
0
       None
                  None
                         POLYGON ((-89.95766 47.28691, -90.13175 47.292...
       None
                  None
                         POLYGON ((-116.04823 49.00037, -113.05950 49.0...
1
2
                        POLYGON ((-97.22894 49.00089, -97.21414 48.902...
       None
                  None
3
       None
                  None
                        MULTIPOLYGON (((-155.93665 19.05939, -155.9080...
                        POLYGON ((-116.04823 49.00037, -115.96780 47.9...
4
       None
                  None
   number_of_fires
0
               521
               878
1
2
               114
3
                22
4
              1587
```

[5 rows x 123 columns]

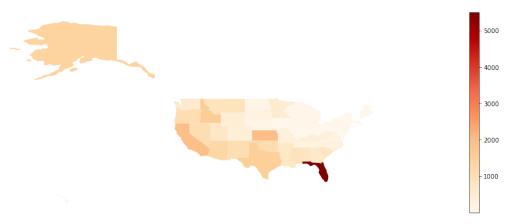
```
[50]: ax = states.plot(column='number_of_fires', figsize=(15, 6),
cmap='OrRd', legend=True)
```





```
[52]: import matplotlib.pyplot as plt
f, ax = plt.subplots(1, figsize=(18,6))
ax = states.plot(column='number_of_fires', cmap='OrRd',
    legend=True, ax=ax)
    lims = plt.axis('equal')
    f.suptitle('US Wildfire count per state in 1984-2015')
ax.set_axis_off()
plt.show()
```

US Wildfire count per state in 1984-2015



```
[53]: len(fires.index)
[53]: 30418
[54]: counts_per_state.sum()
[54]: 30291
[55]: fires.empty #checks if there are empty fields in the dataframe
[55]: False
[56]: fires['geometry'].empty
[56]: False
[]:
[]:
```

In this lab, I used four key Python libraries - OGR, Shapely, Fiona, and GeoPandas - to examine geographic data in depth. The investigation began with the creation of vector geometries like polygons using the OGR package. By linking together separate points, I illustrated how to define points and form polygons. In addition, I demonstrated how to read and write vector data as well as change vector geometries. I also demonstrated how to perform fundamental geometric operations such as calculating areas, centroids, and borders, as well as searching for points within a polygon. The tutorial then moved on to using Shapely and Fiona, both important library, to generate various geometries such as polygons, points, and lines. Shapely makes it easy to view geometries by simplifying the plotting process. Fiona is used for reading and interacting with shapefile. Then, it explains how to explore the data's characteristics and geometry. Following that, I learned to process more complex geospatial activities, such as spatial joins, choropleth map construction, and data inspection, using GeoPandas. These activities necessitated data reading and cleansing, as well as geographical operations to count and show wildfire occurrences by state.

Throughout the analysis, data inspection played a pivotal role in ensuring data quality and identifying missing or erroneous values. The guidance provides the techniques of how to check for missing values and empty fields in the dataset, emphasizing the importance of data quality for accurate analysis and visualization. This data analysis highlighted the versatility of these Python libraries for geospatial tasks, enabling users to handle geospatial data effectively from start to finish.