

A stylized world map in a light orange color serves as the background for the slide. The map shows the continents and major landmasses. Overlaid on the map are several horizontal lines: a thick teal line at the top, a thin teal line just below it, a thin grey line above the subtitle, a thick teal line below the subtitle, and another thin teal line at the bottom.

Visualizing Geospatial Data

Group 5 & 7 Presentation

Agenda

- ★ Introduction
- ★ Folium
- ★ Maps with Markers
- ★ Choropleth Map
- ★ Summary

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What is Geospatial Data



Geospatial data refers to information tied to geographic locations, typically represented by coordinates (latitude/longitude), addresses, or boundaries.

Applications: Urban planning, disaster management (e.g., wildfire tracking), agriculture, and navigation (e.g., Google Maps).

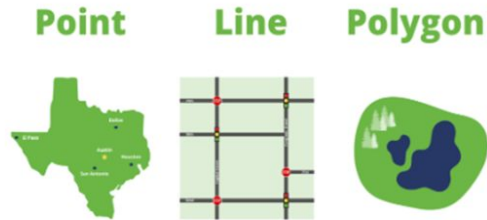
Vector Data

Vector data represent **discrete** data values, or data values that have separate, distinct units that we can count. In GIS, we store vector data using:

- **Points**, which represent distinct locations in space.
- **Lines**, which represent connected linear values.
- **Polygons**, which represent connected and bounded areas.

Some examples of data stored as vector values include:

- Points representing the location of hospitals.
- Lines representing a river.
- Lines representing a highway.
- Polygons representing town boundaries.



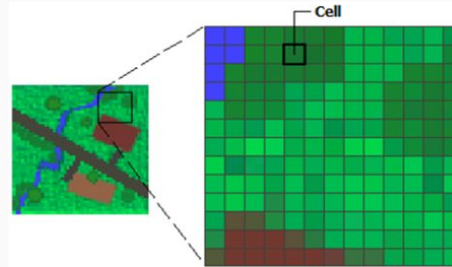
From: <https://id.land/blog/raster-vs-vector-data-the-ultimate-guide>

Raster Data

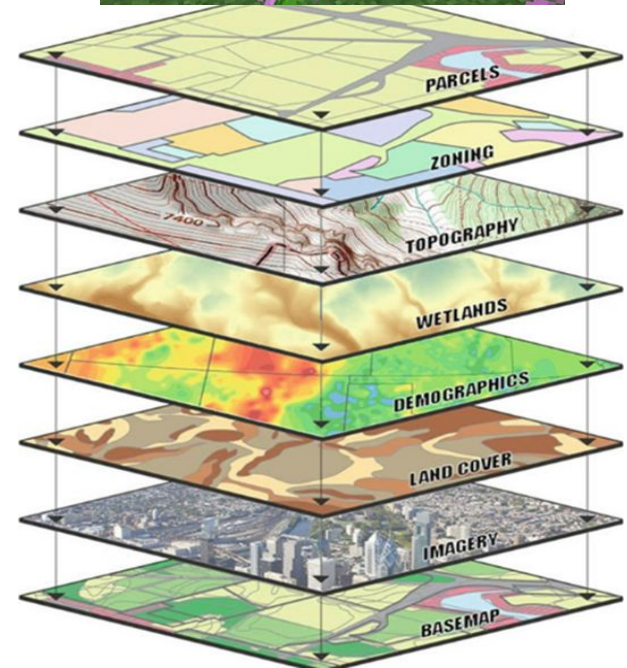
Raster data can represent discrete values, as well as **continuous** data values, or values that fall within an infinite spectrum of numbers that can be measured to any decimal place. In GIS, we store raster data using **cells/pixels organized into a grid**, and each cell represents a data value.

Some examples of data that are stored as rasters include:

- Temperature
- Elevation
- Aerial Images
- Soil types
- Satellite imagery



From: https://www.researchgate.net/figure/The-pixels-in-a-raster-layer_fig4_352709886





GeoPandas

Extends Pandas to support geospatial operations. Key features:

- ❑ Read/write shapefiles, GeoJSON.
- ❑ Spatial joins, buffering, and CRS transformations.

python

Copy

```
import geopandas as gpd
gdf = gpd.read_file("countries.shp")
gdf.plot()
```

Folium

Folium allows creating Leaflet maps using Python. This makes it very easy to build interactive maps within Python environments like Jupyter Notebooks.

python

Copy

```
import folium
m = folium.Map(location=[51.5, -0.1], zoom_start=12)
folium.Marker([51.5, -0.1], popup="London").add_to(m)
m.save("map.html")
```


Choropleth Maps

A *thematic* map where regions are shaded based on a variable (e.g., population). Requires:

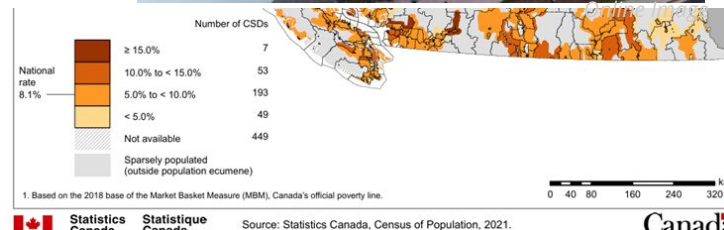
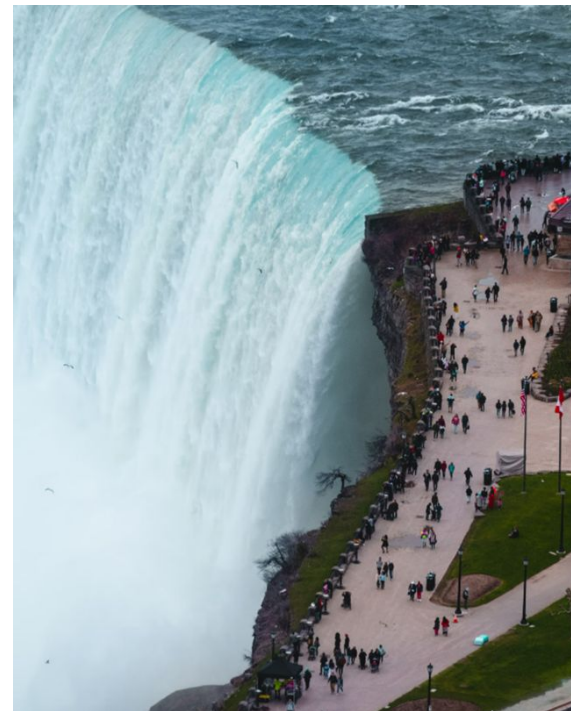
- ❑ GeoJSON/TopoJSON: Defines geographic boundaries.
- ❑ Data: Values to visualize (e.g., GDP by country).

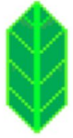
Additional Python libraries for geometry editing

Library	Key Function	Example Use
Shapely	Geometry ops (buffers, intersections)	Polygon overlaps, distance calc
Rasterio	Raster data I/O & processing	Satellite imagery analysis
PyProj	CRS conversions (e.g., WGS84 → UTM)	Reprojecting coordinates
Cartopy	Map plotting with projections	Visualizing geospatial data

Note:

- Shapely → Vector | Rasterio → Raster
- PyProj + Cartopy → Accurate maps





What is Folium

- A **Python** library for creating interactive, web-based maps with minimal code.
- Built on top of **Leaflet.js**, a popular JavaScript library for geospatial visualizations.
- Combines Python's data manipulation (**Pandas**, **NumPy**) with **JavaScript's** interactivity.
- Ideal for:
 - Visualizing location-based data.
 - Plotting routes and spatial trends.
 - Creating dynamic, user-friendly maps.
- Enables easy sharing via **HTML** exports.

Benefits and Disadvantages

		Benefit	Limitation
1	Easy to use(simple syntaxe)	✓	
2	Integration with Python Data Ecosystem (like Pandas, GeoPandas, and NumPy)	✓	
3	Quick Export to HTML	✓	
4	Not Ideal for Heavy Geographic Information System Analysis		✗
5	Limited in customization compared to JavaScript-based tools.		✗
6	Browser Performance It may not handle very large datasets well		✗

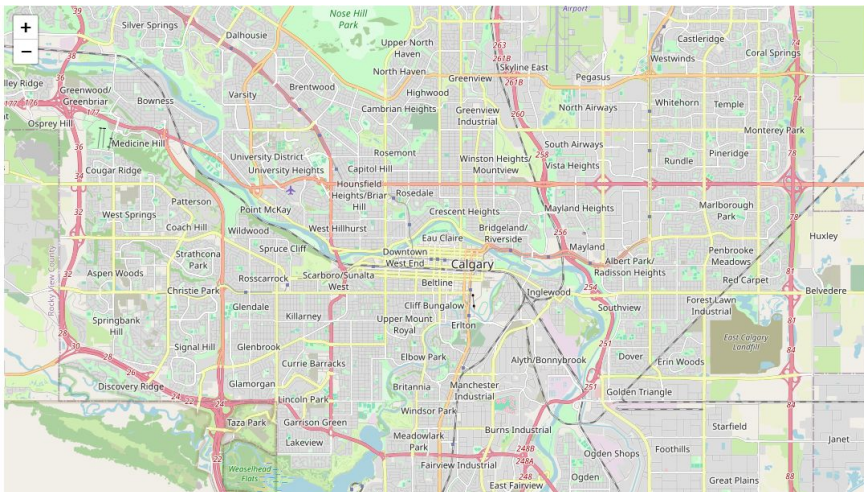
Get started with Folium

Installation : `!pip install folium`

Create a basic map :

```
import folium
#basic map centered around Calgary
location = [51.0447, -114.0719] # Decimal degrees coordinates for calgary
calgary_map = folium.Map(location=location, zoom_start=12)
calgary_map
```

```
#Save the map as HTML
calgary_map.save("calgary_map.html")
```



Built-in tile options in Folium

OpenStreetMap (default) : Open-source and regularly updated street maps.

Stamen Terrain :Physical terrain features like mountains, rivers, etc.

Stamen Toner:High-contrast black-and-white map, good for data overlays.

Stamen Watercolor: Artistic watercolor style.

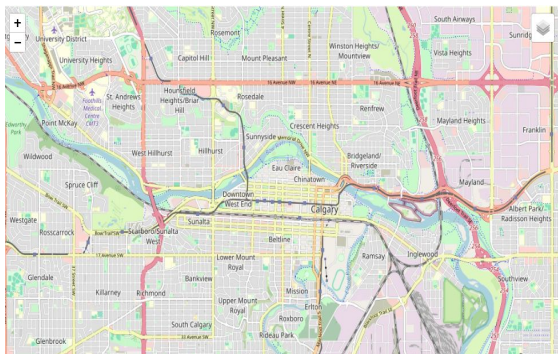
CartoDB positron: Light-themed modern base map.

CartoDB dark_matter: Dark-themed version of CartoDB, good for night mode or highlighting overlays.

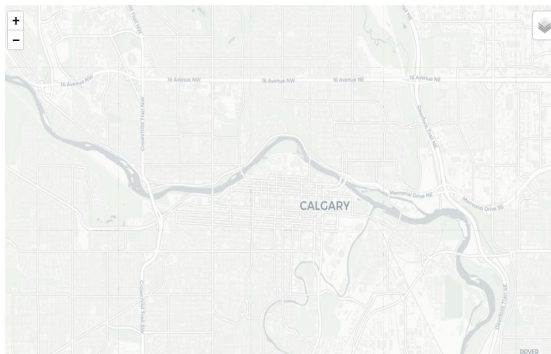
Different map styles using tile parameter

```
import folium
# Create a map centered on Calgary Downtown
calgary_map = folium.Map(location=[51.0447, -114.0719], zoom_start=13)
# Add different tile Layers (map styles)
folium.TileLayer('OpenStreetMap').add_to(calgary_map)
folium.TileLayer('Stamen Terrain').add_to(calgary_map)
folium.TileLayer('Stamen Toner').add_to(calgary_map)
folium.TileLayer('Stamen Watercolor').add_to(calgary_map)
folium.TileLayer('CartoDB positron').add_to(calgary_map)
folium.TileLayer('CartoDB dark_matter').add_to(calgary_map)
# Layer control to switch between styles
folium.LayerControl().add_to(calgary_map)
# Display the map
calgary_map
```

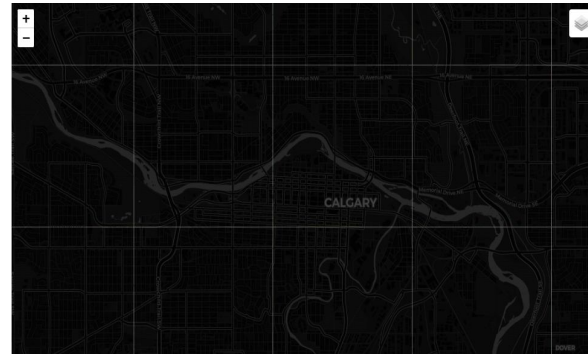
OpenStreetMap



CartoDB positron




CartoDB dark_matter



Folium Real world Uses cases

 **Public Health:** Disease spread maps

 **Logistics:** Delivery point tracking

 **Education:** Teaching geography and data visualization



 **Business:** Customer Location Analysis



Use Case:

A business wants to understand where their customers are located to improve marketing and delivery services.

Example:

A coffee shop chain collects customer addresses through loyalty programs. By converting addresses into coordinates (geocoding), they can:

- Map all customer locations on a Folium map
- Identify clusters of customers
- Decide where to open a new store

Maps with markers



Markers are like **signposts** that guide us through the map, highlighting important elements

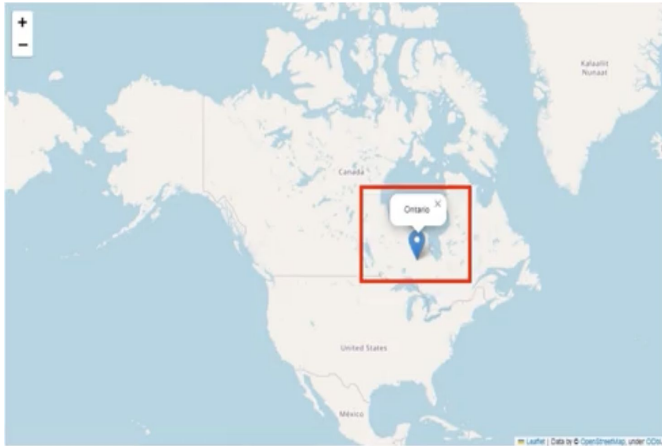


They represent **specific locations** or **points of interest**, providing **additional information** when clicked



Markers play a vital role in enhancing **interactivity** and adding **context** to maps

Add marker and label



```
import folium

# Create a map object centered at Canada
canada_map = folium.Map(location=[56.1304, -106.3468], zoom_start=4)

# Display the map with the marker
canada_map

# Add a marker for Ontario province
folium.Marker(location=[51.2538, -85.3232], popup='Ontario').add_to(canada_map)
```

Add Marker with feature group

```
# generate map of Canada
canada_map = folium.Map(
    location=[56.130, -106.35],
    zoom_start=4
)

## add a red marker to Ontario

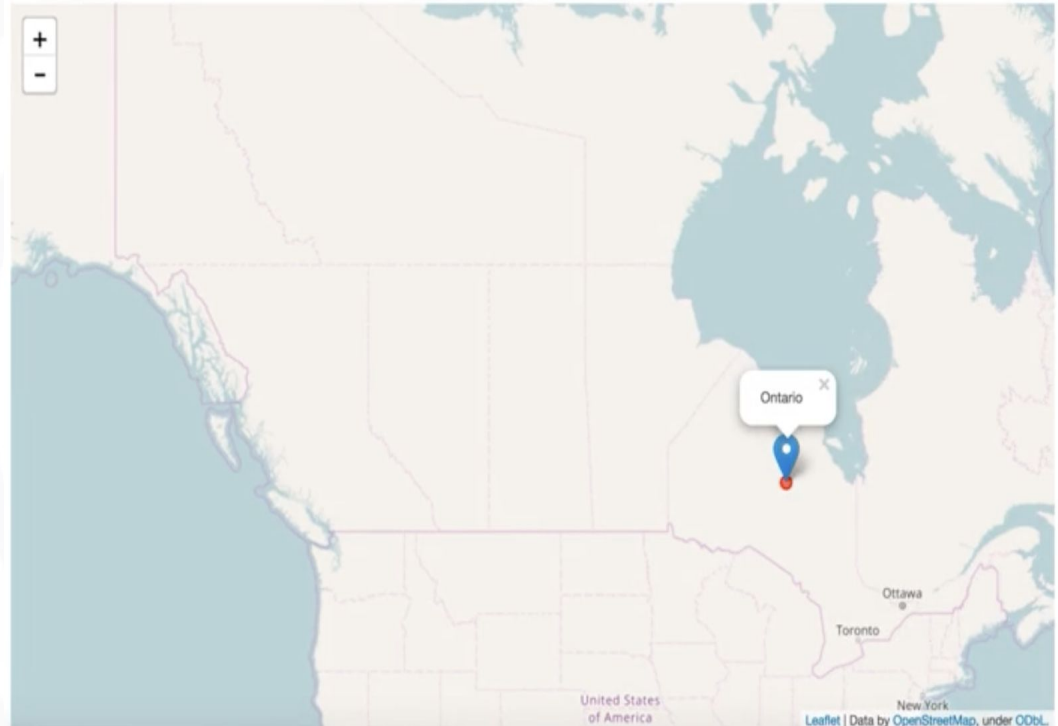
# create a feature group
ontario = folium.map.FeatureGroup()

# style the feature group
ontario.add_child(
    folium.features.CircleMarker(
        [51.25, -85.32], radius = 5,
        color = "red", fill_color = "Red"
    )
)

# add the feature group to the map
canada_map.add_child(ontario)

# label the marker
folium.Marker([51.25, -85.32],
    popup='Ontario').add_to(canada_map)

# display map
canada_map
```

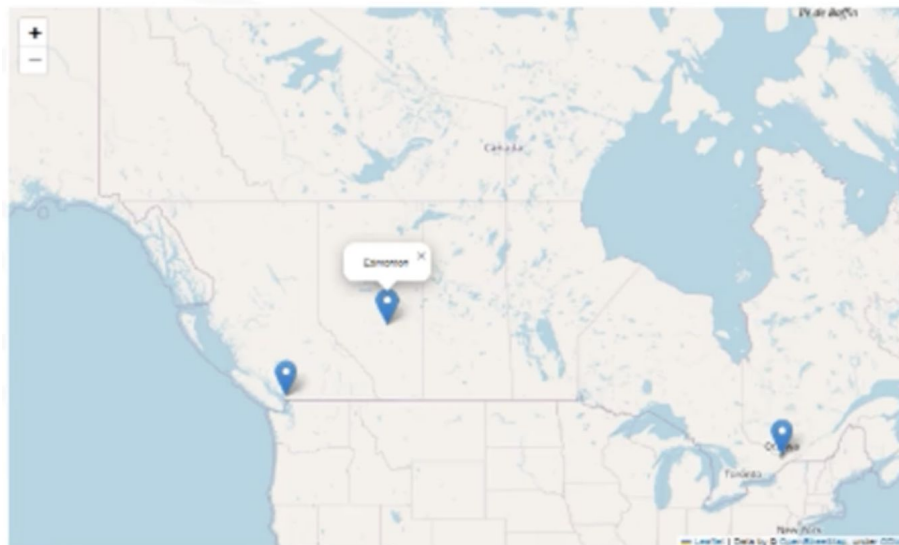


Multiple markers

```
# Define a list of locations and their corresponding popups
locations = [
    {"location": [45.4215, -75.6989], "popup": "Ottawa"},
    {"location": [53.5461, -113.4938], "popup": "Edmonton"},
    {"location": [49.2827, -123.1207], "popup": "Vancouver"},
    # Add more locations and their popups here
]
```

```
# Add markers for each location in the list
for loc in locations:
    folium.Marker(location=loc["location"],
                  popup=loc["popup"]).add_to(map)

# Display the map with the markers
map
```



MarkerCluster feature

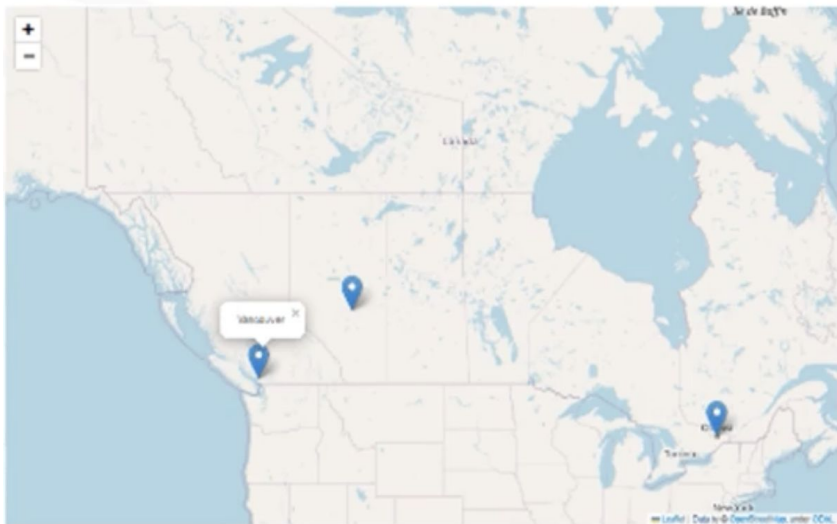


This clustering feature enhances the visual presentation by **preventing overcrowding** and ensuring a **clear representation** primarily when numerous markers are close.



The markers within the MarkerCluster will be **intelligently grouped** based on their **proximity** when the map is displayed.

Multiple markers using MarkerCluster feature

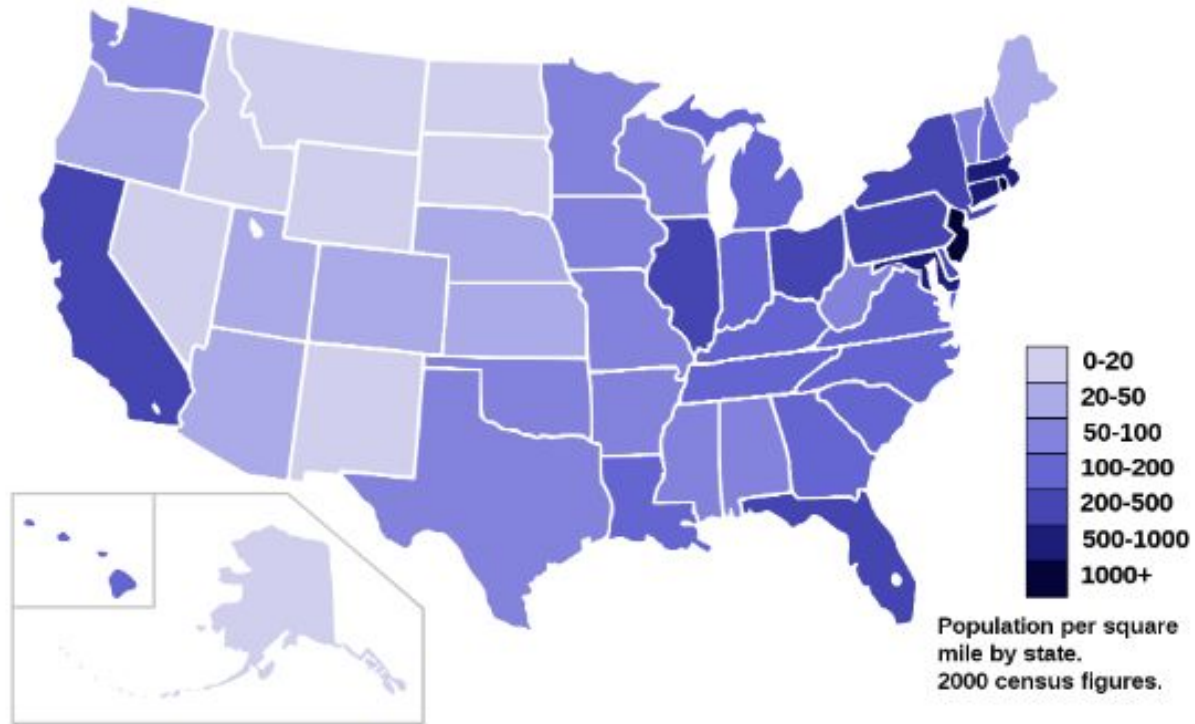


```
#import MarkerCluster  
from folium.plugins import MarkerCluster
```

```
# Create a MarkerCluster object  
marker_cluster = MarkerCluster().add_to(map)
```

```
# Add markers for each location in the list to the MarkerCluster  
for loc in locations:  
    folium.Marker(location=loc["location"],  
                  popup=loc["popup"]).add_to(marker_cluster)
```

Choropleth Maps



Now, let's create our own `Choropleth` map of the world depicting immigration from various countries to Canada.



```
world_map.choropleth(  
    geo_data=world_geo, ←  
    data=df_can,  
    columns=['Country', 'Total'],  
    key_on='feature.properties.name',  
    fill_color='YlOrRd',_  
    fill_opacity=0.7,_  
    line_opacity=0.2,  
    legend_name='Immigration to Canada',  
    reset=True  
)  
  
# display map  
world_map
```

```
# create a plain world map  
world_map = folium.Map(location=[0, 0], zoom_start=2)  
world_map
```



```
world_geo = r'https://cf-courses-data.s3.us.cloud-object-storage.appdomain.cloud/IBMDeveloperSkillsNetwork-DV0101EN-SkillsNetwork/Data%20Fi
```

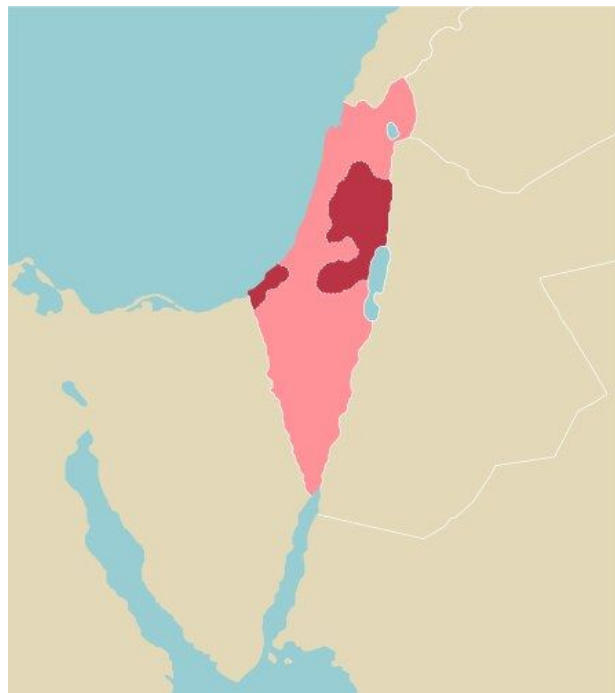
```
.us.cloud-object-storage.appdomain.cloud/IBMDeveloperSkillsNetwork-DV0101EN-SkillsNetwork/Data%20Files/world_countries.json' # geojson file
```

```
▼ root:
  type: "FeatureCollection"
  ▼ features: [] 177 items
    ▼ 0:
      type: "Feature"
      ▼ properties:
        name: "Afghanistan"
      ▼ geometry:
        type: "Polygon"
        ▼ coordinates: [] 1 item
          ▼ 0: [] 69 items
            ▼ 0: [] 2 items
              0: 61.210817
              1: 35.650072
            ▼ 1: [] 2 items
              0: 62.230651
              1: 35.270664
            ▼ 01: [] 2 items
            ► 62: [] 2 items
            ► 63: [] 2 items
            ► 64: [] 2 items
            ► 65: [] 2 items
            ► 66: [] 2 items
            ► 67: [] 2 items
            ► 68: [] 2 items
          id: "AFG"
```

Read geojson data and rename it to world_geo

Palestine geojson data: west bank and Gaza

```
{
  "type": "Feature",
  "properties": {
    "name": "Vanuatu",
    "geometry": {
      "type": "MultiPolygon",
      "coordinates": [
        [
          [
            [167.844877, -16.466333],
            [167.515181, -16.59785],
            [167.180008, -16.159995],
            [167.216801, -15.891846],
            [167.844877, -16.466333]
          ],
          [
            [167.107712, -14.93392],
            [167.270028, -15.740021],
            [167.001207, -15.614602],
            [166.793158, -15.668811],
            [166.649859, -15.392704],
            [166.629137, -14.626497],
            [167.107712, -14.93392]
          ]
        ]
      ],
      "id": "VUT"
    },
    "type": "Feature",
    "properties": {
      "name": "West Bank",
      "geometry": {
        "type": "Polygon",
        "coordinates": [
          [
            [35.545665, 32.393992],
            [35.545252, 31.782505],
            [35.397561, 31.489086],
            [34.927408, 31.353435],
            [34.970507, 31.616778],
            [35.225892, 31.754341],
            [34.974641, 31.866582],
            [35.18393, 32.532511],
            [35.545665, 32.393992]
          ]
        ],
        "id": "PSE"
      },
      "type": "Feature",
      "properties": {
        "name": "Yemen",
        "geometry": {
          "type": "Polygon",
          "coordinates": [
            [
              [53.108573, 16.651051],
              [52.385206, 16.382411],
              [52.191729, 15.938433],
              [52.168165, 15.59742],
              [51.172515, 15.17525],
              [49.574576, 14.708767],
              [48.679231, 14.003202],
              [48.238947, 13.94809],
              [47.938914, 14.007233],
              [47.354454, 13.59222],
              [46.717076, 13.399699],
              [45.877593, 13.347764],
              [45.62505, 13.290946],
              [45.406459, 13.026905],
              [45.144356, 12.953938],
              [44.989533, 12.699587],
              [44.494576, 12.721653],
              [44.175113, 12.58595],
              [43.482959, 12.6368],
              [43.222871, 13.22095],
              [43.251448, 13.767584],
              [43.087944, 14.06263],
              [42.892245, 14.802249],
              [42.604873, 15.213335],
              [42.805015, 15.261963],
              [42.702438, 15.718886],
              [42.823671, 15.911742],
              [42.779332, 16.347891],
              [43.218375, 16.66689],
              [43.115798, 17.08844],
              [43.380794, 17.579987],
              [43.791519, 17.319977],
              [44.062613, 17.410359],
              [45.216651, 17.433329],
              [45.399999, 17.333335],
              [46.366659, 17.233315],
              [46.749994, 17.283338],
              [47.000005, 16.949999],
              [47.466695, 17.116682],
              [48.183344, 18.166669],
              [49.116672, 18.616668],
              [52.00001, 19.000003],
              [52.782184, 17.349742],
              [53.108573, 16.651051]
            ]
          ],
          "id": "YEM"
        },
        "type": "Feature",
        "properties": {
          "name": "South Africa",
          "geometry": {
            "type": "Polygon",
            "coordinates": [
              [
                [31.521001, -29.257387],
                [31.325561, -29.401978],
                [30.901763, -29.909957],
                [30.622813, -30.423776],
                [30.085716, -31.140269],
                [28.925553, -32.172041],
                [28.219756, -32.771953],
                [27.464608, -33.226964],
                [26.419452, -33.61495],
                [25.909664, -33.66704],
                [25.780628, -33.944646],
                [25.172862, -33.796851],
                [24.677853, -33.987176],
                [23.594043, -33.794474],
                [22.988189, -33.916431],
                [22.574157, -33.864083],
                [21.542799, -34.258839],
                [20.689053, -34.417175],
                [20.071261, -34.795137],
                [19.616405, -34.819166],
                [19.193278, -34.462599],
                [18.855315, -34.444306],
                [18.424643, -33.997873],
                [18.377411, -34.136521],
                [18.244499, -33.867752],
                [18.25008, -33.281431],
                [17.92519, -32.611291],
                [18.24791, -32.429131],
                [18.221762, -31.661633],
                [17.566918, -30.725721],
                [17.064416, -29.878641],
                [17.062918, -29.875954],
                [16.344977, -28.576705],
                [16.824017, -28.082162],
                [17.218929, -28.355943],
                [17.387497, -28.783514],
                [17.836152, -28.856378],
                [18.464899, -29.054562],
                [19.002127, -28.972443],
                [19.894734, -28.461105],
                [19.895768, -24.76779],
                [20.165726, -24.917962],
                [20.758609, -25.868136],
                [20.66647, -26.477453],
                [20.889609, -26.828543],
                [21.605896, -26.726534],
                [22.105969, -26.280256],
                [22.579532, -25.979448],
                [22.824271, -25.500459],
                [23.312097, -25.26869],
                [23.73357, -25.390129],
                [24.211267, -25.670216],
                [25.025171, -25.71967],
                [25.664666, -25.486816],
                [25.765849, -25.174845],
                [25.941652, -24.696373],
                [26.485753, -24.616327],
                [26.786407, -24.240691],
                [27.11941, -23.574323],
                [28.017236, -22.827754],
                [29.432188, -22.091313],
                [29.839037, -22.102216],
                [30.322883, -22.271612],
                [30.659865, -22.151567],
                [31.191409, -22.25151],
                [31.670398, -23.658969],
                [31.930589, -24.369417],
                [31.752408, -25.484284],
                [31.837778, -25.843332],
                [31.333158, -25.660191],
                [31.04408, -25.731452],
                [30.949667, -26.022649],
                [30.676609, -26.398078],
                [30.685962, -26.743845],
                [31.282773, -27.285879],
                [31.86806, -27.177927],
                [32.071665, -26.73382],
                [32.83012, -26.742192],
                [32.580265, -27.470158],
                [32.462133, -28.301011],
                [32.203389, -28.752405],
                [31.521001, -29.257387]
              ]
            ],
            "id": "ZAF"
          ]
        ]
      ]
    }
  ]
}
```



Now, let's create our own `Choropleth` map of the world depicting immigration from various countries to Canada.

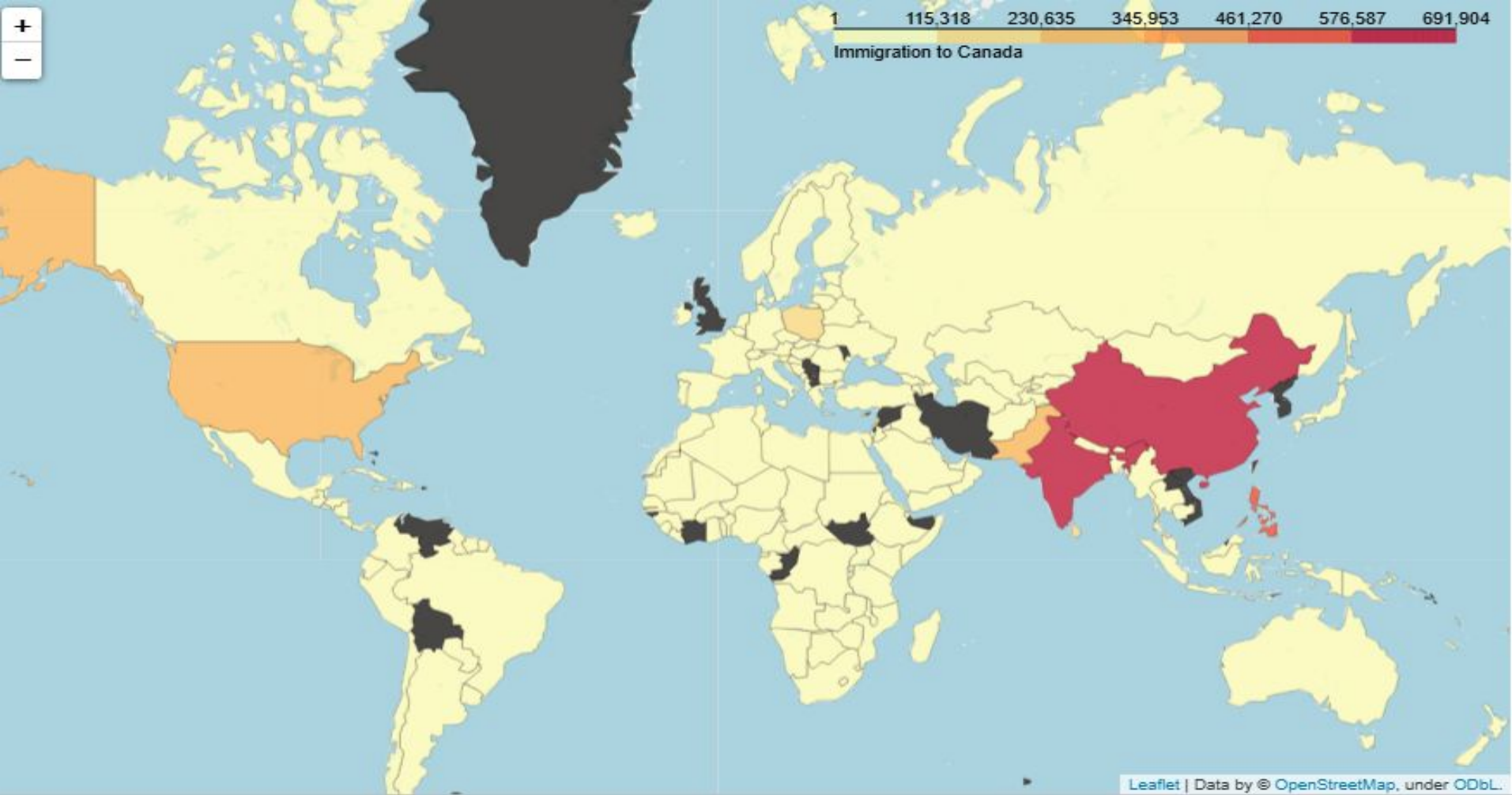
```
world_map.choropleth(  
    geo_data=world_geo,  
    data=df_can,  
    columns=['Country', 'Total'],  
    key_on='feature.properties.name',  
    fill_color='YlOrRd',_  
    fill_opacity=0.7,_  
    line_opacity=0.2,  
    legend_name='Immigration to Canada',  
    reset=True  
)
```

```
# display map  
world_map
```

df_can.head()

Country	Continent	Region	DevName	1980	1981	1982	1983	1984	1985	...	2005	2006	2007	2008	2009	2010	2011	2012	2013	Total
fghanistan	Asia	Southern Asia	Developing regions	16	39	39	47	71	340	...	3436	3009	2652	2111	1746	1758	2203	2635	2004	58639
Albania	Europe	Southern Europe	Developed regions	1	0	0	0	0	0	...	1223	856	702	560	716	561	539	620	603	15699
Algeria	Africa	Northern Africa	Developing regions	80	67	71	69	63	44	...	3626	4807	3623	4005	5393	4752	4325	3774	4331	69439
American Samoa	Oceania	Polynesia	Developing regions	0	1	0	0	0	0	...	0	1	0	0	0	0	0	0	0	6
Andorra	Europe	Southern Europe	Developed regions	0	0	0	0	0	0	...	0	1	1	0	0	0	0	1	1	15

rs x 39 columns

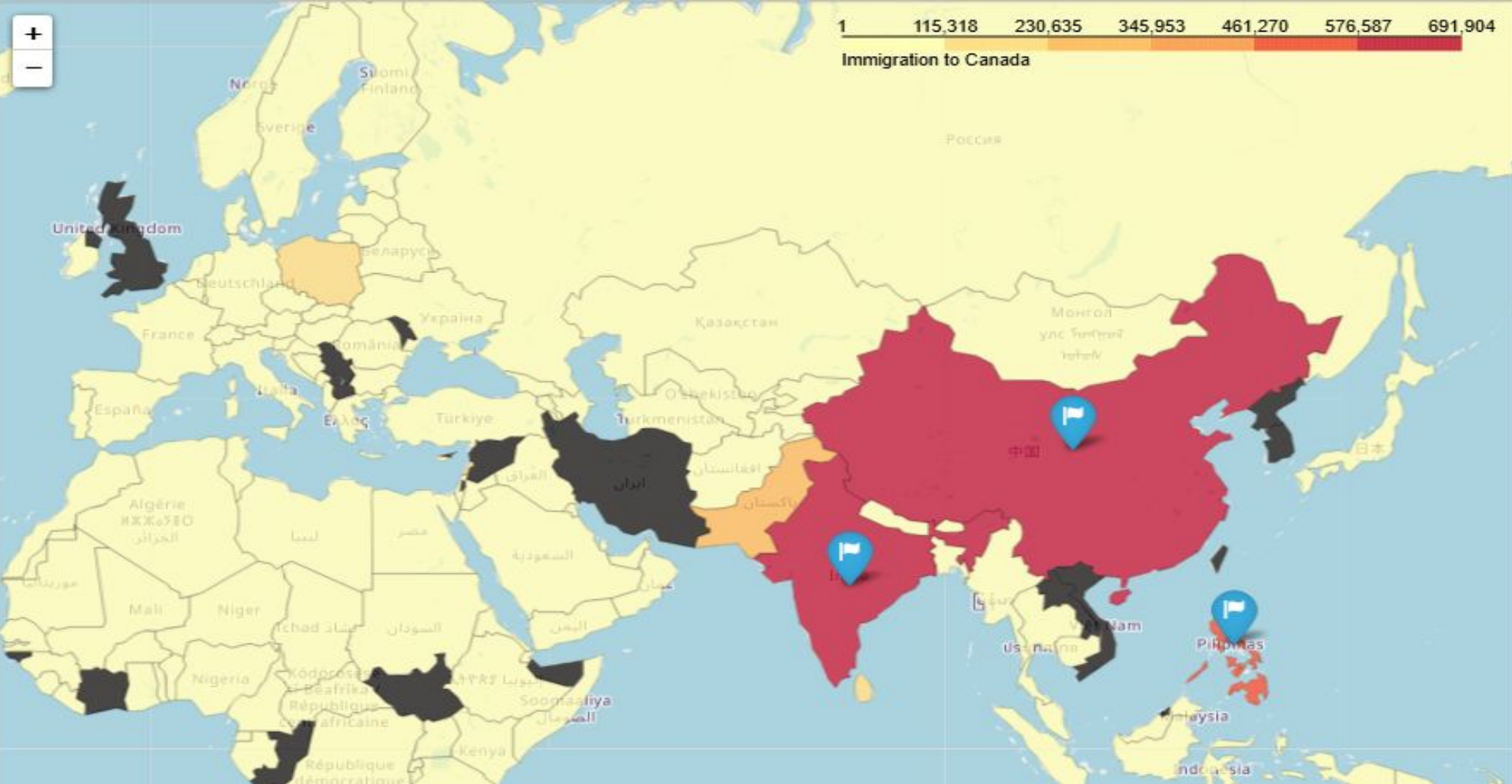


`Choropleth` map with some markers

```
# Example markers (we can use real coordinates from our dataset)
marker_data = [
    {"name": "India", "coords": [20.5937, 78.9629]},
    {"name": "China", "coords": [35.8617, 104.1954]},
    {"name": "Philippines", "coords": [13.41, 122.56]},
]

# Add markers
for loc in marker_data:
    folium.Marker(
        location=loc["coords"],
        popup=loc["name"],
        tooltip=f"{loc['name']}",
        icon=folium.Icon(color='blue', icon='flag')
    ).add_to(world_map)

# Show map
world_map
```



Black means no data match

```
import requests
import json

# Load GeoJSON from URL
url = 'https://cf-courses-data.s3.us.cloud-object-storage.appdomain.cloud/IBMDeveloperSkillsNetwork-DV0101EN-SkillsNetwork/Data%20Files/world_geo.json'
response = requests.get(url)
world_geo = response.json() # this is now a Python dictionary

# Now extract the country names
geo_names = [feature['properties']['name'] for feature in world_geo['features']]

# Compare with your DataFrame
missing = set(df_can['Country'].str.strip()) - set(geo_names)
print("Countries in data but not on map:", missing)
```

Countries in data but not on map: {'Mauritius', 'Venezuela (Bolivarian Republic of)', 'Liechtenstein', 'Brunei Darussalam', 'Singapore', 'Grenada', 'Côte d'Ivoire', 'Antigua and Barbuda', 'China, Macao Special Administrative Region', 'Bolivia (Plurinational State of)', 'Tonga', 'Comoros', 'Iran (Islamic Republic of)', 'Lao People's Democratic Republic', 'Dominica', 'Syrian Arab Republic', 'Maldives', 'American Samoa', 'Serbia', 'Congo', 'Nauru', 'Saint Vincent and the Grenadines', 'Democratic People's Republic of Korea', 'Andorra', 'Samoa', 'Republic of Korea', 'China, Hong Kong Special Administrative Region', 'The former Yugoslav Republic of Macedonia', 'Republic of Moldova', 'Seychelles', 'Monaco', 'Cabo Verde', 'Bahamas', 'United Kingdom of Great Britain and Northern Ireland', 'Palau', 'Kiribati', 'Bahrain', 'Malta', 'Marshall Islands', 'Barbados', 'Saint Lucia', 'Guinea-Bissau', 'Tuvalu', 'Viet Nam', 'Sao Tome and Principe', 'Saint Kitts and Nevis', 'San Marino', 'State of Palestine'}

Conclusion: Visualizing Geospatial Data

- Folium is a powerful Python library for creating interactive maps, enabling easy visualization of geospatial data.
- With multiple map styles (e.g., street-level, Stamen, Mapbox), Folium allows users to customize their visualizations using the tiles parameter.
- Markers enhance map interactivity, providing context and labels through the popup parameter.
- Choropleth maps offer valuable insights by visualizing statistical data across regions, requiring GeoJSON files for precise geospatial representation.

Overall, Folium simplifies geospatial data visualization, making it accessible and effective for diverse applications.

References

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