```
In [89]: import json
         import plotly.express as px
         import plotly.graph_objects as go
         import folium
         import pandas as pd
         import geopandas as gpd
         from shapely.geometry import Point
         from PIL import Image
         from IPython.display import IFrame
         from IPython.display import display
         import matplotlib.pyplot as plt
         from matplotlib.offsetbox import OffsetImage, AnnotationBbox
         from mpl_toolkits.mplot3d import Axes3D
         import glob
         import logging
         import pyogrio
         import geopandas as gpd
         import pyogrio
         import fiona
         from fiona.crs import from epsg
         from osgeo import gdal
```

Public data from https://www.liepaja.lv/dokumenti/statistikas-raditaji-izglitiba/ (Total children and Children in kindergardens per neighborhood)

Plotly on geomap

```
In [88]:
         # Neighborhood data with approximate coordinates
         data = {
             'Rajons': ['Dienvidrietumu', 'Ezerkrasts', 'Vecliepāja', 'Jaunliepāja',
                         'Ziemeļu priekšpilsēta', 'Karosta', 'Tosmare', 'Zaļā birze'],
             'PII': [515, 277, 1220, 0, 1180, 151, 0, 200],
             'Total': [296, 667, 356, 361, 780, 448, 208, 280],
             'Latitude': [56.4912, 56.4832, 56.5080, 56.5204, 56.53516, 56.5500, 56.5500, 56
              'Longitude': [20.9950, 21.0185, 21.0050, 21.0131, 21.022455, 21.0056, 21.0451,
         df = pd.DataFrame(data)
         # Create a scatter map
         fig = go.Figure()
         # Add markers for Total children
         fig.add_trace(go.Scattermapbox(
             lat=df['Latitude'],
             lon=df['Longitude'],
             mode='markers',
             marker=go.scattermapbox.Marker(
                 size=df['Total'] / 30, # Scale marker size for visibility
                 color='red',
                 opacity=0.6
```

```
text=df.apply(lambda row: f"Neighborhood: {row['Rajons']}<br>Total: {row['Total
    name='Total Children'
))
# Add markers for PII (children in kindergardens)
fig.add_trace(go.Scattermapbox(
    lat=df['Latitude'],
    lon=df['Longitude'],
    mode='markers',
    marker=go.scattermapbox.Marker(
        size=df['PII'] / 30, # Scale marker size for visibility
        color='blue',
        opacity=0.4
    ),
    text=df.apply(lambda row: f"Neighborhood: {row['Rajons']}<br/>br>PII: {row['PII']}"
    name='Children in Kindergardens (PII)'
))
# Update Layout for map
fig.update_layout(
    mapbox=dict(
        style="open-street-map",
        zoom=10.5,
        center=dict(lat=df['Latitude'].mean(), lon=df['Longitude'].mean())
    ),
    margin={"r":0,"t":0,"l":0,"b":0},
    title="Children and Schools Data in Liepāja Neighborhoods"
# Show the figure
fig.show()
```

Scatter Plot

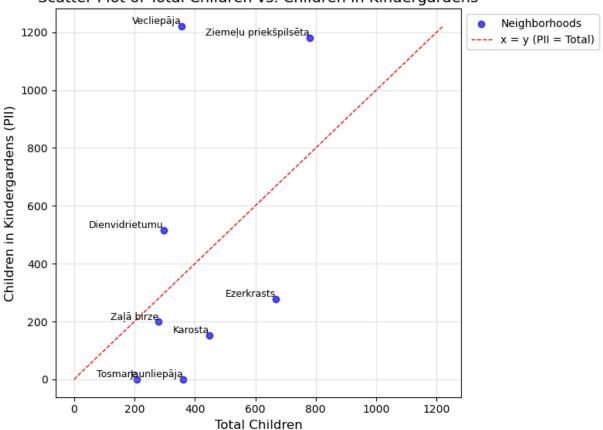
```
plt.plot([0, max_value], [0, max_value], color='red', linestyle='--', linewidth=1,

# Add titles and labels
plt.title('Scatter Plot of Total Children vs. Children in Kindergardens', fontsize=
plt.xlabel('Total Children', fontsize=12)
plt.ylabel('Children in Kindergardens (PII)', fontsize=12)

# Place Legend outside the plot
plt.legend(loc='upper left', bbox_to_anchor=(1, 1))

# Show the plot
plt.grid(alpha=0.3)
plt.tight_layout()
plt.show()
```

Scatter Plot of Total Children vs. Children in Kindergardens

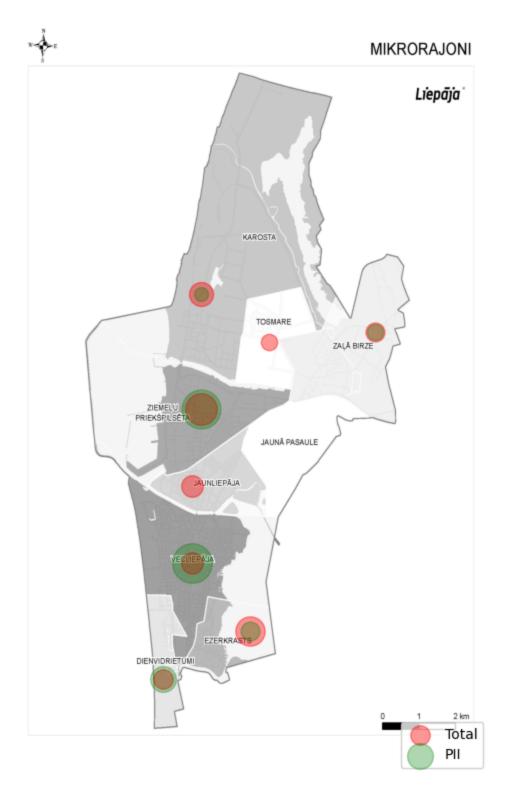


```
# Load the map image
map_image = Image.open("Mikrorajoni_robezas_LiepajaBW.png")

# Create a plot
fig, ax = plt.subplots(figsize=(10,10))
ax.imshow(map_image, extent=[0, 500, 0, 800]) # Adjust extent as necessary

# Overlay data
for i, row in df.iterrows():
    # Plot PII and Total, /1.5 to adjust the bubble size
    ax.scatter(row['x_pixel'], row['y_pixel'], s=row['Total'] / 1.5, color='red', a
    ax.scatter(row['x_pixel'], row['y_pixel'], s=row['PII'] / 1.5, color='green', a
    # ax.text(row['x_pixel'], row['y_pixel'], row['Rajons'], fontsize=9, ha='center

# Legend
ax.axis('off') # Hide axes
ax.legend(loc='lower right')
plt.show()
```



```
In [75]: # Create a GeoDataFrame
data = pd.read_csv('PII.csv')

geometry = [Point(xy) for xy in zip(data['longitude'], data['latitude'])]
gdf = gpd.GeoDataFrame(data, geometry=geometry)
latvia_shapefile = 'overpass-turbo-Liepaja.geojson'
latvia = gpd.read_file(latvia_shapefile)
```

```
fig, ax = plt.subplots(1, 1, figsize=(5, 5))

# Plot the base map of Latvia
latvia.plot(ax=ax, color='white', edgecolor='black')

# Plot the population density data
gdf.plot(ax=ax, marker='o', color='red', markersize=gdf['Total']*2, alpha=0.5)

plt.title('Population Density in Latvia')
plt.xlabel('Longitude')
plt.ylabel('Latitude')
plt.show()
```

Population Density in Latvia 56.60 56.58 56.54 56.52 56.46 20.96 20.98 21.00 21.02 21.04 21.06 21.08 21.10 Longitude

An alternative approach using just the GeoJSON file and plotly, which doesn't require fiona or pyogrio

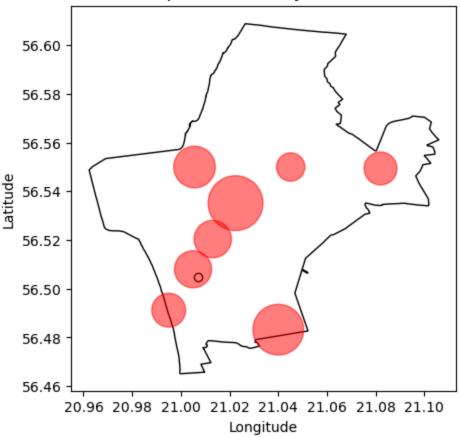
```
In [80]: # Read GeoJSON file
with open('overpass-turbo-Liepaja.geojson', 'r', encoding='utf-8') as f:
    liepaja_geojson = json.load(f)
# Create DataFrame from your data
```

```
data = pd.read_csv('PII.csv')
# Create figure
fig = px.scatter_mapbox(data,
                       lat='latitude',
                       lon='longitude',
                       size='Total',
                       color='PII',
                       hover_name='Rajons', # adjust column name if different
                       hover_data=['Total'],
                       zoom=10.5,
                       title='PII Density in Liepāja',
                       color_continuous_scale=px.colors.sequential.Turbo[::-1], # R
                        opacity=0.8)
# Update Layout
fig.update_layout(
    mapbox_style="open-street-map",
    mapbox=dict(
        center=dict(lat=56.5050, lon=21.0100), # Liepāja center coordinates
    ),
    margin={"r":0,"t":30,"1":0,"b":0}
fig.show()
```

with Fiona

```
In [22]: # Create a GeoDataFrame
    data = pd.read_csv('PII.csv')
    geometry = [Point(xy) for xy in zip(data['longitude'], data['latitude'])]
    gdf = gpd.GeoDataFrame(data, geometry=geometry)
    latvia_shapefile = 'overpass-turbo-Liepaja.geojson'
    latvia = gpd.read_file(latvia_shapefile)
    fig, ax = plt.subplots(1, 1, figsize=(5, 5))
    # Plot the base map of Latvia
    latvia.plot(ax=ax, color='white', edgecolor='black')
# Plot the population density data
    gdf.plot(ax=ax, marker='o', color='red', markersize=gdf['Total']*2, alpha=0.5)
    plt.title('Population Density in Latvia')
    plt.xlabel('Longitude')
    plt.ylabel('Latitude')
    plt.show()
```

Population Density in Latvia



The simplest version with Plotly express

```
In [84]: # Create the data dictionary
         data_dict = {
             'Rajons': ['Dienvidrietumu', 'Ezerkrasts', 'Vecliepāja', 'Jaunliepāja',
                         'Ziemeļu priekšpilsēta', 'Karosta', 'Tosmare', 'Zaļā birze'],
             'PII': [515, 277, 1220, 0, 1180, 151, 0, 200],
             'Total': [296, 667, 356, 361, 780, 448, 208, 280],
             'latitude': [56.4912, 56.4832, 56.508, 56.5204, 56.53516, 56.55, 56.55, 56.5494
             'longitude': [20.995, 21.02, 21.005, 21.0131, 21.02246, 21.0056, 21.0451, 21.08
         }
         # Create DataFrame
         data = pd.DataFrame(data_dict)
         # Create figure using plotly express
         fig = px.scatter_mapbox(data,
                                lat='latitude',
                                lon='longitude',
                                size='Total', # Size of markers based on Total
                                color='PII', # Color based on PII
                                 color_continuous_scale=px.colors.sequential.Turbo_r,
                                hover_name='Rajons',
                                hover_data=['PII', 'Total'],
                                zoom=10.5,
                                title='Liepāja Districts - PII and Total Children',
```

```
# Update Layout
fig.update_layout(
    mapbox_style="open-street-map",
    mapbox=dict(
        center=dict(lat=56.5050, lon=21.0100)
    ),
    margin={"r":0,"t":30,"l":0,"b":0}
)
fig.show()
```

```
In [85]: # Path to the uploaded .geojson file
    geojson_path = "overpass-turbo-Liepaja.geojson"

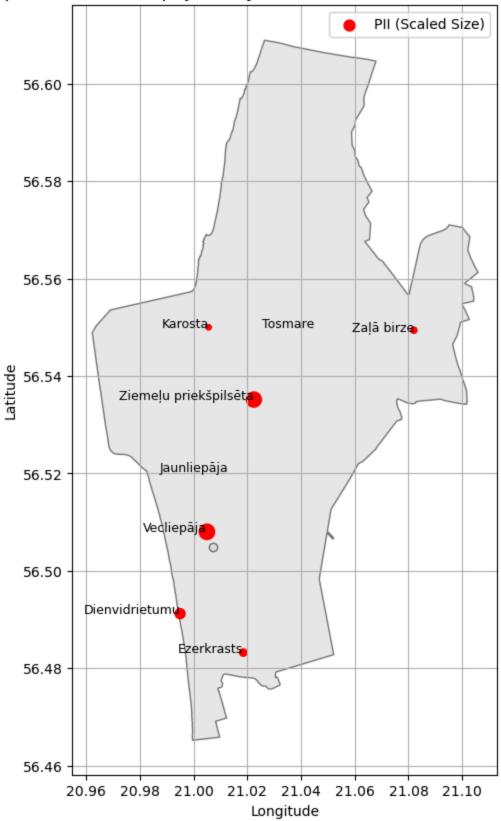
# Read the file using Fiona
with fiona.open(geojson_path) as src:
    print(src.schema) # Schema of the GeoJSON
    print(src.crs) # CRS of the GeoJSON
    print(next(iter(src))) # Inspect the first feature

# Convert to a GeoDataFrame while the collection is open
    gdf = gpd.GeoDataFrame.from_features(src, crs=src.crs)
```

```
# Inspect the GeoDataFrame
         print(gdf.head())
        {'properties': {'id': 'str', '@id': 'str', '@relations': 'json', 'ISO3166-2': 'str',
        'admin_level': 'str', 'boundary': 'str', 'name': 'str', 'ref': 'str', 'start_date':
        'date', 'type': 'str', 'wikidata': 'str'}, 'geometry': 'Unknown'}
        EPSG:4326
        fiona.Feature(geometry=fiona.Geometry(coordinates=[[(21.0363453, 56.6078383), ...]],
        type='Polygon'), id='0', properties=fiona.Properties(id='relation/13048685', @id='re
        lation/13048685', @relations=None, ISO3166-2='LV-LPX', admin_level='5', boundary='ad
        ministrative', name='Liepāja', ref='100003044', start_date='2021-07-01', type='bound
        ary', wikidata='Q167668'))
                                                                             id \
                                                    geometry
        0 POLYGON ((21.03635 56.60784, 21.03254 56.60841... relation/13048685
                                   POINT (21.00709 56.50484)
                                                                node/27155834
                         @id
                                                                     @relations \
        0 relation/13048685
                                                                           None
               node/27155834 [{'role': 'label', 'rel': 13048685, 'reltags':...
        1
          ISO3166-2 admin level
                                       boundary
                                                    name
                                                                ref start date \
                             5 administrative Liepāja 100003044 2021-07-01
        0
             LV-LPX
        1
               None
                                          None
                                                   None
                                                               None
                                                                           None
                          None
               type wikidata
        0 boundary Q167668
        1
               None
                       None
In [32]: # Load GeoJSON file using GeoPandas (underlying Fiona)
         geojson_path = "overpass-turbo-Liepaja.geojson"
         with fiona.open(geojson_path) as f:
             crs = f.crs # Read CRS information
         geo_data = gpd.read_file(geojson_path)
         # Display GeoJSON file structure
         print(geo_data.head())
         # Create a DataFrame with the given data
         data = {
             'Rajons': ['Dienvidrietumu', 'Ezerkrasts', 'Vecliepāja', 'Jaunliepāja',
                        'Ziemeļu priekšpilsēta', 'Karosta', 'Tosmare', 'Zaļā birze'],
             'PII': [515, 277, 1220, 0, 1180, 151, 0, 200],
             'Total': [296, 667, 356, 361, 780, 448, 208, 280],
             'Latitude': [56.4912, 56.4832, 56.5080, 56.5204, 56.53516, 56.5500, 56.5500, 56
             'Longitude': [20.9950, 21.0185, 21.0050, 21.0131, 21.022455, 21.0056, 21.0451,
         df = pd.DataFrame(data)
         # Create a GeoDataFrame from the provided data
         geometry = [Point(xy) for xy in zip(df['Longitude'], df['Latitude'])]
         gdf = gpd.GeoDataFrame(df, geometry=geometry)
         # Set the CRS (Coordinate Reference System) explicitly using Fiona's CRS
         gdf.set_crs(crs, inplace=True)
```

```
# Plot the GeoJSON data
 fig, ax = plt.subplots(1, 1, figsize=(10, 10))
 geo_data.plot(ax=ax, color='lightgrey', edgecolor='black', alpha=0.5)
 # Add the points from the GeoDataFrame
 gdf.plot(ax=ax, color='red', markersize=gdf['PII'] / 10, label='PII (Scaled Size)')
 # Annotate each point with its region name
 for x, y, label in zip(gdf.geometry.x, gdf.geometry.y, gdf['Rajons']):
     ax.text(x, y, label, fontsize=9, ha='right')
 # Add a legend and title
 plt.legend()
 plt.title("Spatial Plot of Liepaja GeoJSON Data and Additional Dataset", fontsize=1
 plt.xlabel("Longitude")
 plt.ylabel("Latitude")
 plt.grid(True)
 # Show the plot
 plt.show()
                 id
                                   @id \
0 relation/13048685 relation/13048685
      node/27155834
                         node/27155834
                                         @relations ISO3166-2 admin_level \
                                               None LV-LPX
1 [ { "role": "label", "rel": 13048685, "reltags...
                                                         None
                                                                     None
         boundary
                     name
                                 ref start_date
                                                     type wikidata \
0 administrative Liepāja 100003044 2021-07-01 boundary Q167668
                                                     None
            None
                     None
                                None
                                            NaT
                                                              None
                                           geometry
0 POLYGON ((21.03635 56.60784, 21.03254 56.60841...
                          POINT (21.00709 56.50484)
1
```

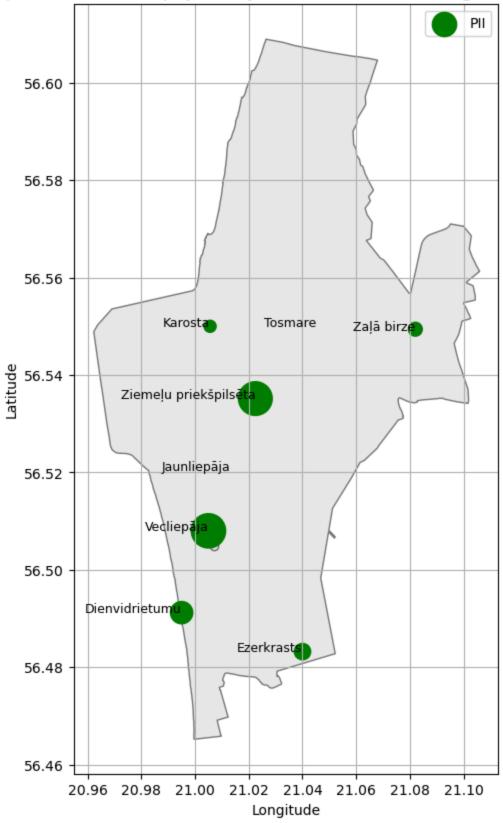
Spatial Plot of Liepaja GeoJSON Data and Additional Dataset



```
# Display GeoJSON fi
# Display GeoJSON file structure
print(geo_data.head(5))
# Create a DataFrame with the given data
data = {
   'Rajons': ['Dienvidrietumu', 'Ezerkrasts', 'Vecliepāja', 'Jaunliepāja',
               'Ziemeļu priekšpilsēta', 'Karosta', 'Tosmare', 'Zaļā birze'],
    'PII': [515, 277, 1220, 0, 1180, 151, 0, 200],
    'Total': [296, 667, 356, 361, 780, 448, 208, 280],
    'Latitude': [56.4912, 56.4832, 56.5080, 56.5204, 56.53516, 56.5500, 56.5500, 56
    'Longitude': [20.9950, 21.04, 21.0050, 21.0131, 21.022455, 21.0056, 21.0451, 21
df = pd.DataFrame(data)
# Create a GeoDataFrame from the provided data
geometry = [Point(xy) for xy in zip(df['Longitude'], df['Latitude'])]
gdf = gpd.GeoDataFrame(df, geometry=geometry)
# Set the CRS (Coordinate Reference System) to match the GeoJSON file
gdf.crs = geo_data.crs
# Plot the GeoJSON data
fig, ax = plt.subplots(1, 1, figsize=(10, 10))
geo_data.plot(ax=ax, color='lightgrey', edgecolor='black', alpha=0.5)
# Add the points from the GeoDataFrame
gdf.plot(ax=ax, color='green', markersize=gdf['PII'] / 2, label='PII')
# Annotate each point with its region name
for x, y, label in zip(gdf.geometry.x, gdf.geometry.y, gdf['Rajons']):
   ax.text(x, y, label, fontsize=9, ha='right')
# Add a Legend and title
plt.legend()
plt.title("Spatial Plot of Liepaja GeoJSON Data and Kindergarden data", fontsize=14
plt.xlabel("Longitude")
plt.ylabel("Latitude")
plt.grid(True)
# Show the plot
plt.show()
```

```
@id \
             id
0 relation/13048685 relation/13048685
1 node/27155834 node/27155834
                               @relations ISO3166-2 admin_level \
                                    None LV-LPX 5
1 [ { "role": "label", "rel": 13048685, "reltags... None
                                                   None
                        boundary
               name
0 administrative Liepāja 100003044 2021-07-01 boundary Q167668
        None None None
                                 NaT None None
                                 geometry
0 POLYGON ((21.03635 56.60784, 21.03254 56.60841...
                    POINT (21.00709 56.50484)
1
```

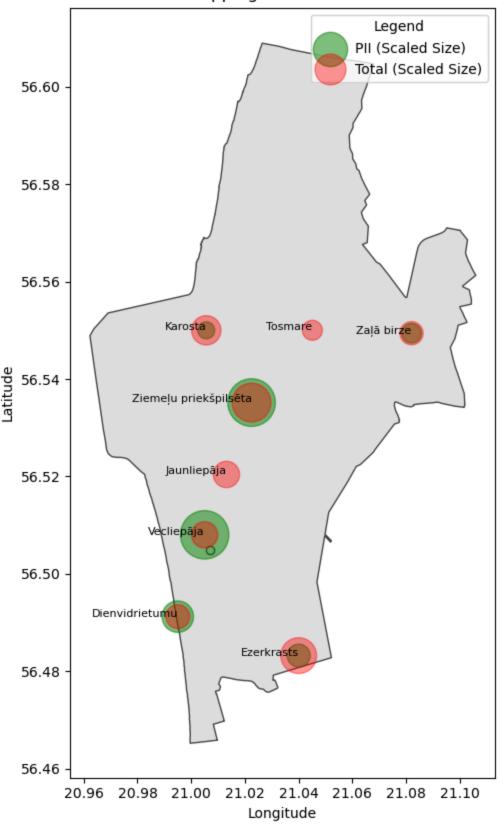
Spatial Plot of Liepaja GeoJSON Data and Kindergarden data



```
GeoDataFrame columns: Index(['id', '@id', '@relations', 'ISO3166-2', 'admin_level',
        'boundary',
                'name', 'ref', 'start date', 'type', 'wikidata', 'geometry'],
              dtype='object')
        DataFrame columns: Index(['Rajons', 'PII', 'Total', 'Latitude', 'Longitude'], dtype
        ='object')
Out[37]:
                                                          ISO3166-
                          id
                                         @id @relations
                                                                    admin level
                                                                                   boundary I
          0 relation/13048685 relation/13048685
                                                            LV-LPX
                                                                             5 administrative Li
                                                   None
                                                 [ { "role":
                                                  "label",
          1
                                                    "rel":
               node/27155834
                               node/27155834
                                                             None
                                                                          None
                                                                                       None
                                               13048685.
                                                "reltags...
In [39]: # 1. Create a GeoDataFrame for Neighborhoods. Use the coordinates to create point g
         # Data for neighborhoods
          data = {
              'Rajons': ['Dienvidrietumu', 'Ezerkrasts', 'Vecliepāja', 'Jaunliepāja',
                         'Ziemelu priekšpilsēta', 'Karosta', 'Tosmare', 'Zalā birze'],
              'PII': [515, 277, 1220, 0, 1180, 151, 0, 200],
              'Total': [296, 667, 356, 361, 780, 448, 208, 280],
              'Latitude': [56.4912, 56.4832, 56.5080, 56.5204, 56.53516, 56.5500, 56.5500, 56
              'Longitude': [20.9950, 21.04, 21.0050, 21.0131, 21.022455, 21.0056, 21.0451, 21
         }
         # Create a GeoDataFrame for the neighborhoods
         df = gpd.GeoDataFrame(data, geometry=gpd.points_from_xy(data['Longitude'], data['La
         # 2. Ensure GeoJSON File Has Polygons in Correct CRS
         # Load the GeoJSON data and verify that it is in the same coordinate reference syst
          # Load GeoJSON file
          geo_data = gpd.read_file("overpass-turbo-Liepaja.geojson")
         # Ensure the CRS matches
         if geo data.crs != "EPSG:4326":
             geo_data = geo_data.to_crs("EPSG:4326")
          # 3. Perform Spatial Join to assign each neighborhood point to the polygon (if appl
          result = gpd.sjoin(df, geo_data, how="left", predicate="within")
          # Plot GeoJSON data (polygons)
         fig, ax = plt.subplots(figsize=(10, 10))
          geo_data.plot(ax=ax, color="lightgray", edgecolor="black", alpha=0.7)
         # Plot neighborhood points scaled by 'PII' (e.g., red circles)
```

```
result.plot(
   ax=ax,
   color="green",
   markersize=result["PII"],
   label="PII (Scaled Size)",
   alpha=0.5,
# Plot neighborhood points scaled by 'Total' (e.g., blue circles)
result.plot(
   ax=ax,
   color="red",
   markersize=result["Total"],
   label="Total (Scaled Size)",
   alpha=0.4,
# Annotate neighborhoods
for x, y, label in zip(result.geometry.x, result.geometry.y, result["Rajons"]):
   ax.text(x, y, label, fontsize=8, ha='right', color="black")
# Add title, labels, and legend
plt.title("Spatial Plot of Liepaja GeoJSON Data\nOverlapping PII and Total Data")
plt.xlabel("Longitude")
plt.ylabel("Latitude")
plt.legend(title="Legend")
plt.show()
```

Spatial Plot of Liepaja GeoJSON Data Overlapping PII and Total Data



```
'PII': [515, 277, 1220, 0, 1180, 151, 0, 200],
    'Total': [296, 667, 356, 361, 780, 448, 208, 280]
}
df = pd.DataFrame(data)
# Normalize data for bubble chart
df['PII_scaled'] = df['PII'] / max(df['PII']) * 100
df['Total_scaled'] = df['Total'] / max(df['Total']) * 100
# Bubble chart setup
fig, ax = plt.subplots(figsize=(10,6))
# Scatter plot for PII and Total
scatter1 = ax.scatter(df['Rajons'], df['PII'], s=50, c='green', alpha=0.6, label='P
scatter2 = ax.scatter(df['Rajons'], df['Total'], s=50, c='red', alpha=0.6, label='T
# Adding Labels
for i, row in df.iterrows():
   ax.text(row['Rajons'], row['PII'], f"{row['PII']}", fontsize=8, ha='center', va
   ax.text(row['Rajons'], row['Total'], f"{row['Total']}", fontsize=8, ha='center'
# Chart formatting
ax.set_title("Comparison of PII and Total Across Neighborhoods", fontsize=16)
ax.set_ylabel("Values", fontsize=14)
ax.set_xlabel("Neighborhoods (Rajons)", fontsize=14)
ax.set_xticks(df['Rajons'])
ax.set_xticklabels(df['Rajons'], rotation=45, ha='right', fontsize=10)
ax.legend(loc='upper right', fontsize=12, title="Legend")
ax.grid(True, which='both', linestyle='--', linewidth=0.5, alpha=0.5)
plt.tight_layout()
plt.show()
```

