

The background of the slide is a map of an urban area. It features several layers of information: a base map showing streets and building footprints, a semi-transparent colored overlay (green, yellow, orange, pink, purple, blue) that delineates different zones or districts, and a network of small black dots scattered across the map. The text 'SRAI' is prominently displayed in green on the left side, with 'Design and usage' in black below it.

# SRAI

Design and usage

**What is SRAI?**

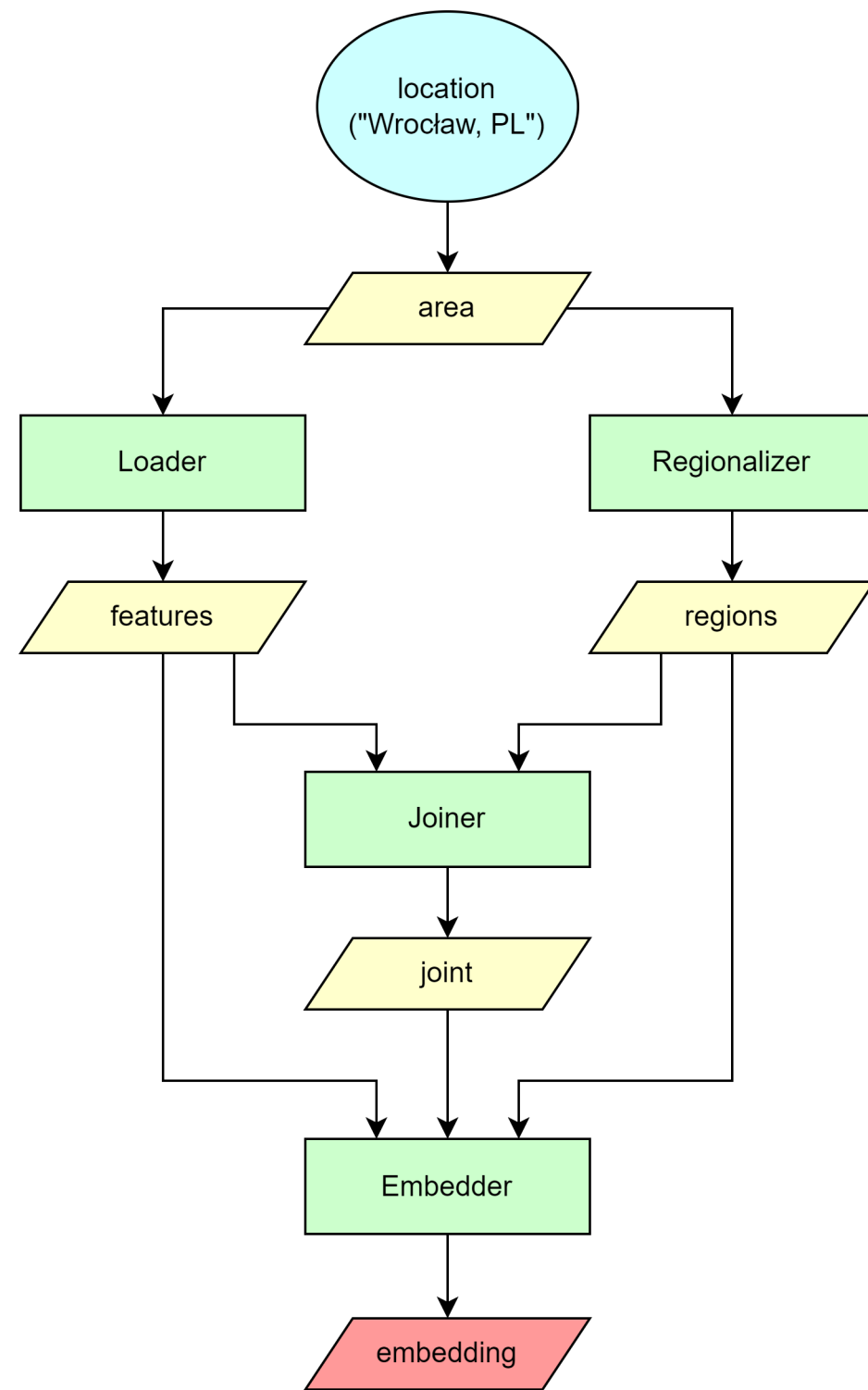
**What is SRAI?**

**A toolbox for geospatial AI**

# What is SRAI?

## A toolbox for geospatial AI

that aims to standardize the domain and make your life easier



## Task 0

Specify the city you want to work on for the rest of the exercise.

# Task 0

Specify the city you want to work on for the rest of the exercise.

```
In [2]: # change if needed
```

```
CITY = "Warsaw"
```

```
COUNTRY = "Poland"
```

```
area_name = f"{CITY}, {COUNTRY}"
```

```
area_name
```

```
Out[2]: 'Warsaw, Poland'
```

## Task 1

Now download the area's polygon based on the `area_name` specified above. Use `.geocode_to_region_gdf` from `srai.regionalizers`.



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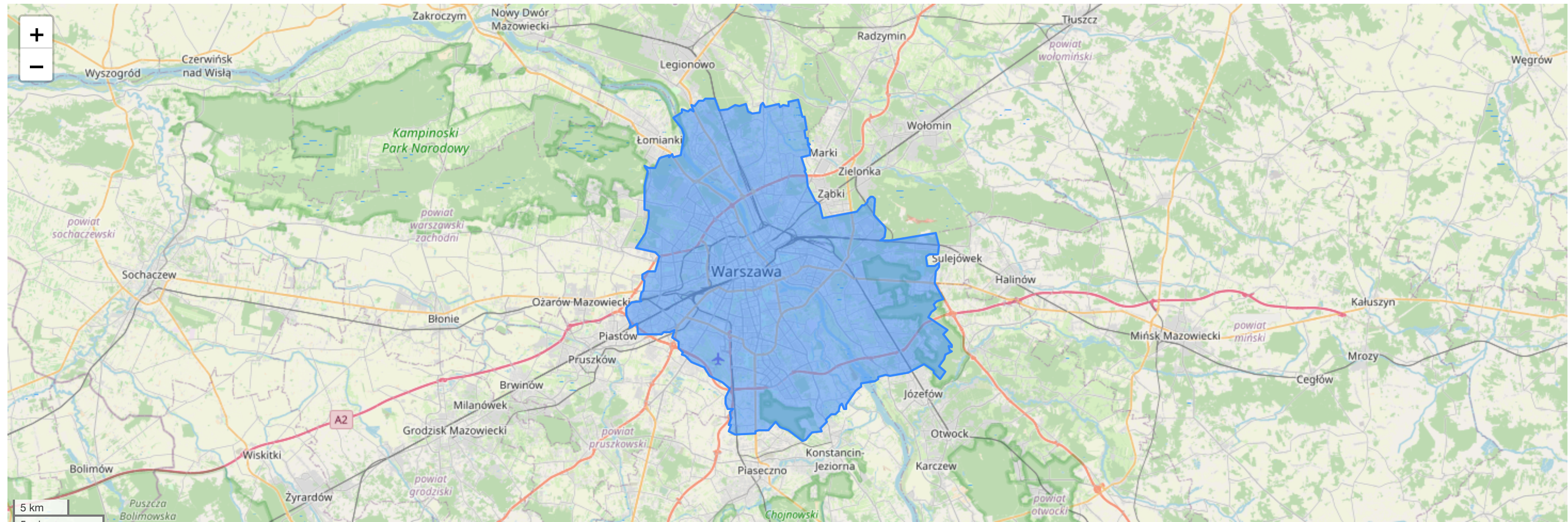
```
In [3]: area = None

### BEGIN SOLUTION
from srai.regionalizers import geocode_to_region_gdf

area = geocode_to_region_gdf(area_name)
### END SOLUTION

area.explore(height=500)
```

Out[3]:



# Loaders

# Loaders

- used to load spatial data from different sources
- unify loading into a single interface
- prepare data for the embedding methods

API

Examples

Types of loaders:

- GTFS
- OSM Online
- OSM Pbf
- OSM Way
- OSM Tile

```
In [4]: from srai.loaders.osm_loaders.filters import GEOFABRIK_LAYERS
```

```
GEOFABRIK_LAYERS
```

```
Out[4]: {'public': {'amenity': ['police',  
    'fire_station',  
    'post_box',  
    'post_office',  
    'telephone',  
    'library',  
    'townhall',  
    'courthouse',  
    'prison',  
    'embassy',  
    'community_centre',  
    'nursing_home',  
    'arts_centre',  
    'grave_yard',  
    'marketplace',  
    'recycling',  
    'public_building'],  
    'office': ['diplomatic'],  
    'landuse': ['cemetery']},  
    'education': {'amenity': ['university', 'school', 'kindergarten', 'college']},  
    'health': {'amenity': ['pharmacy',  
    'hospital']},
```

## Task 2

Let's create an A4 city poster using data about main road infrastructure and water.

Now that we have the city's boundaries in `area` we can use them to fetch more data. For that task you can either use [OSMOnlineLoader](#) or [OSMPbfLoader](#) to `load` the data. Use the provided `tags`.

Additionally, as the loaded data is a bit bigger than the boundaries, `clip` it to the `area`.



```
In [5]: tags = {
    "highway": [
        "primary",
        "primary_link",
        "secondary",
        "secondary_link",
        "tertiary",
        "tertiary_link",
        "trunk",
        "trunk_link",
    ],
    "water": True,
    "waterway": True,
}

features = None

### BEGIN SOLUTION
from srai.loaders import OSMOnlineLoader

features = OSMOnlineLoader().load(area, tags).clip(area)
### END SOLUTION

features.head(3)
```

```
Downloading waterway: True           : 100%|██████████████████████| 10/10 [00:02<00:00, 3.44it/s]
```

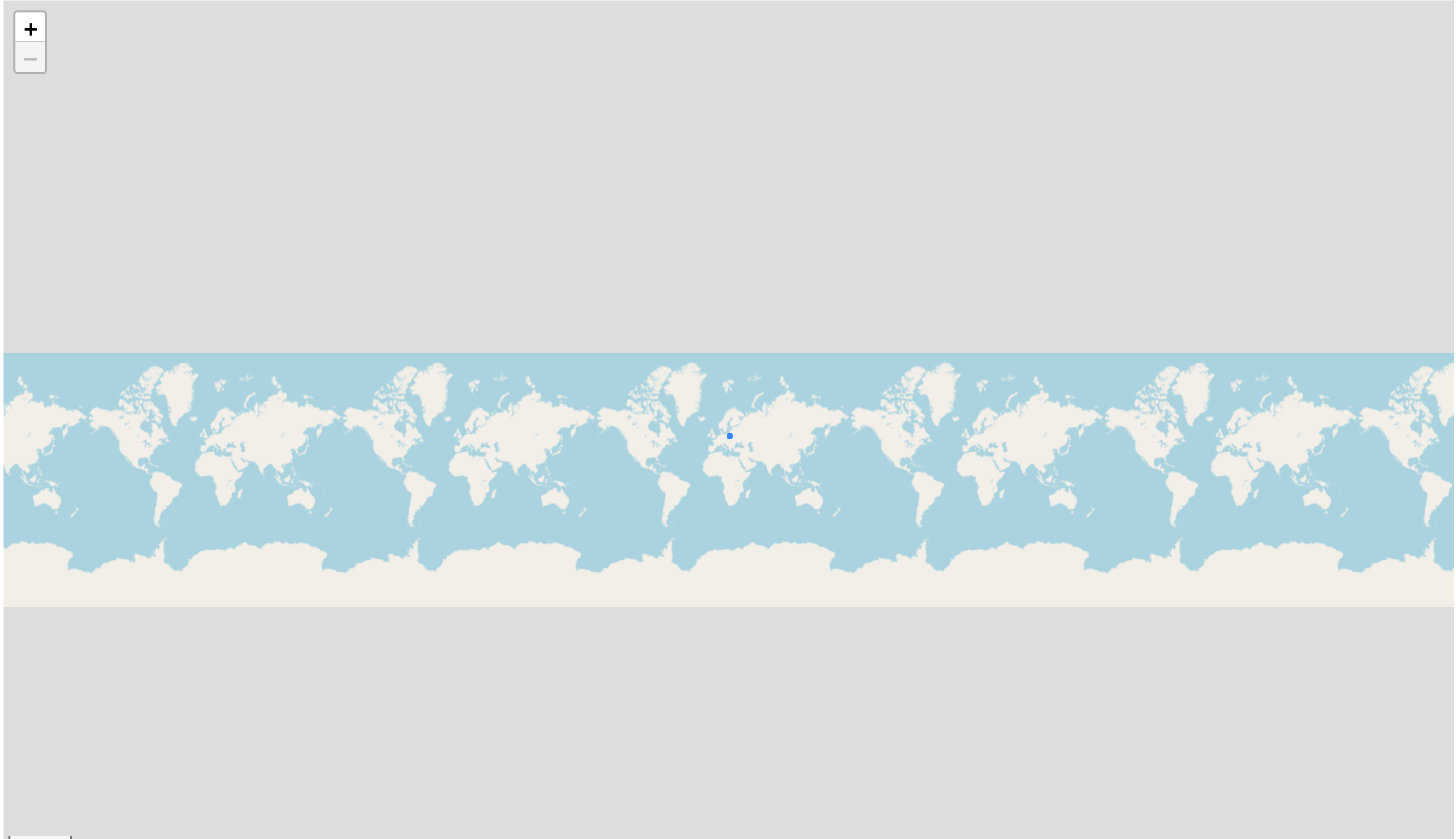
Out[5]:

	geometry	highway	water	waterway
feature_id				
way/913988111	POLYGON ((21.09793 52.10656, 21.09793 52.10656...	None	pond	None
way/624075792	LINESTRING (21.09721 52.10761, 21.09721 52.107...	None	None	stream
way/1051121778	LINESTRING (21.09772 52.11205, 21.09735 52.11244)	None	None	ditch

```
In [6]: features.explore()
```

```
/Users/kacper.lesniara/Projects/Personal/srai-tutorial/venv/lib/python3.10/site-packages/folium/features.py:1102: UserWarning:
GeoJsonTooltip is not configured to render for GeoJson GeometryCollection geometries. Please consider reworking these features:
[{'feature_id': 'way/456262354', 'highway': None, 'water': None, 'waterway': 'river'}] to MultiPolygon for full functionality.
https://tools.ietf.org/html/rfc7946#page-9
warnings.warn(
```

```
Out[6]:
```





We've downloaded the data for the given boundaries. Now we can plot the actual poster. Use the `plot_poster` function.

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```
In [7]: import matplotlib.pyplot as plt
        from utils import plot_poster

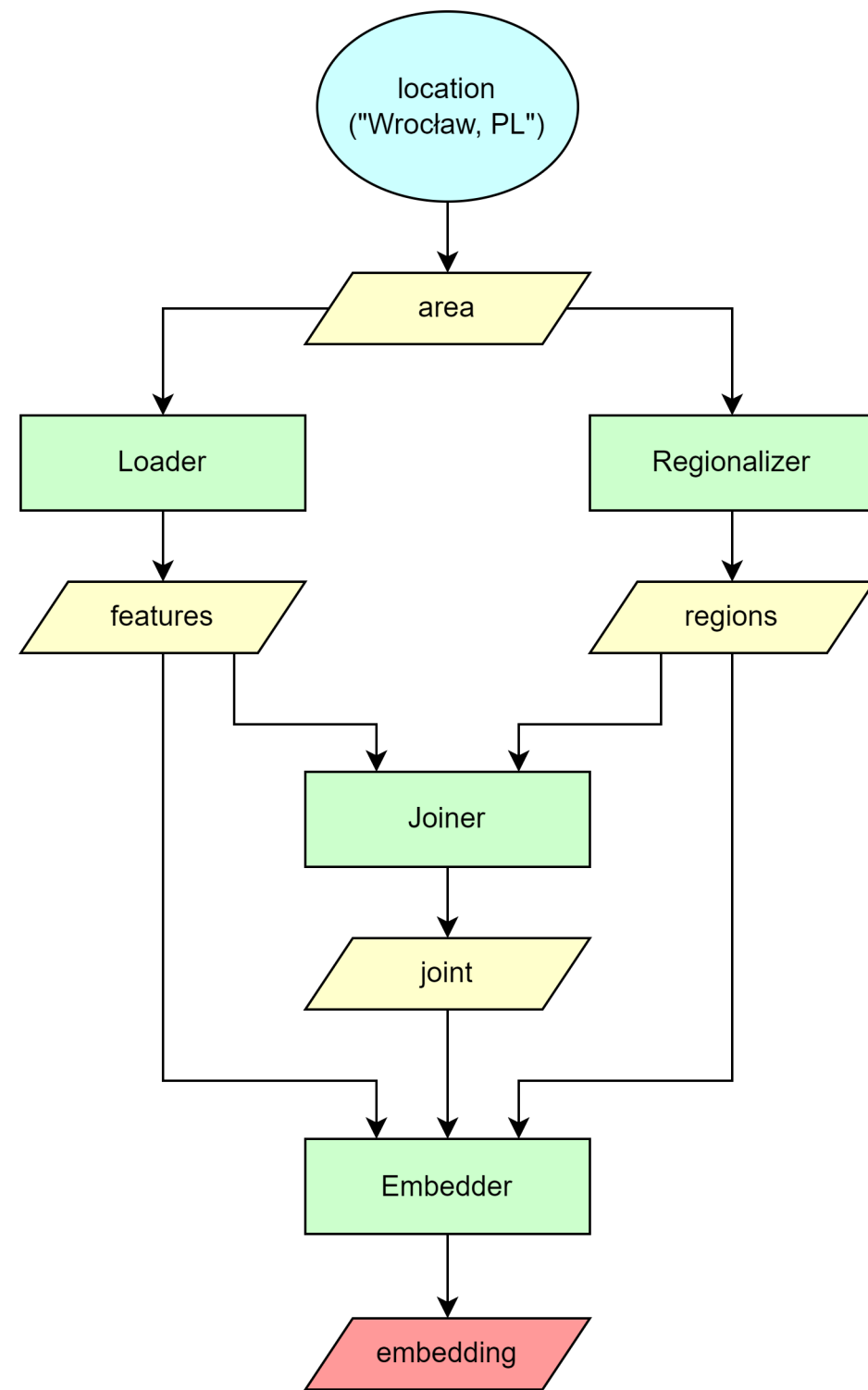
        ### BEGIN SOLUTION
        plot_poster(features, CITY, COUNTRY)
        ### END SOLUTION

        plt.savefig("poster.png", facecolor="#ecedeae", dpi=300)
```

/Users/kacper.lesniara/Projects/Personal/srai-tutorial/utils.py:77: UserWarning: Geometry is in a geographic CRS. Results from 'centroid' are likely incorrect. Use 'GeoSeries.to\_crs()' to re-project geometries to a projected CRS before this operation.

```
centroid = gdf.dissolve().centroid.item()
```





# Regionalizers

# Regionalizers

- unify methods for dividing a given area into smaller regions.
- can be based on spatial indexes.

API

Examples

Types of regionalizers:

- H3
- S2
- Voronoi
- Administrative Boundary

## Task 3

Let's divide our `area` into some regions. Looking above we have a couple of options, but we want you to focus mainly on `H3Regionalizer` and `AdministrativeBoundryRegionalizer`. Try using one of them (try both if you have the time) to `transform` our space. Both are available in `srai.regionalizers`. We suggest a `resolution=8` or `admin_level=9`, but feel free to experiment.

To plot the regions use `plot_regions` from `srai.plotting`. Use the provided pallete as a `colormap`.



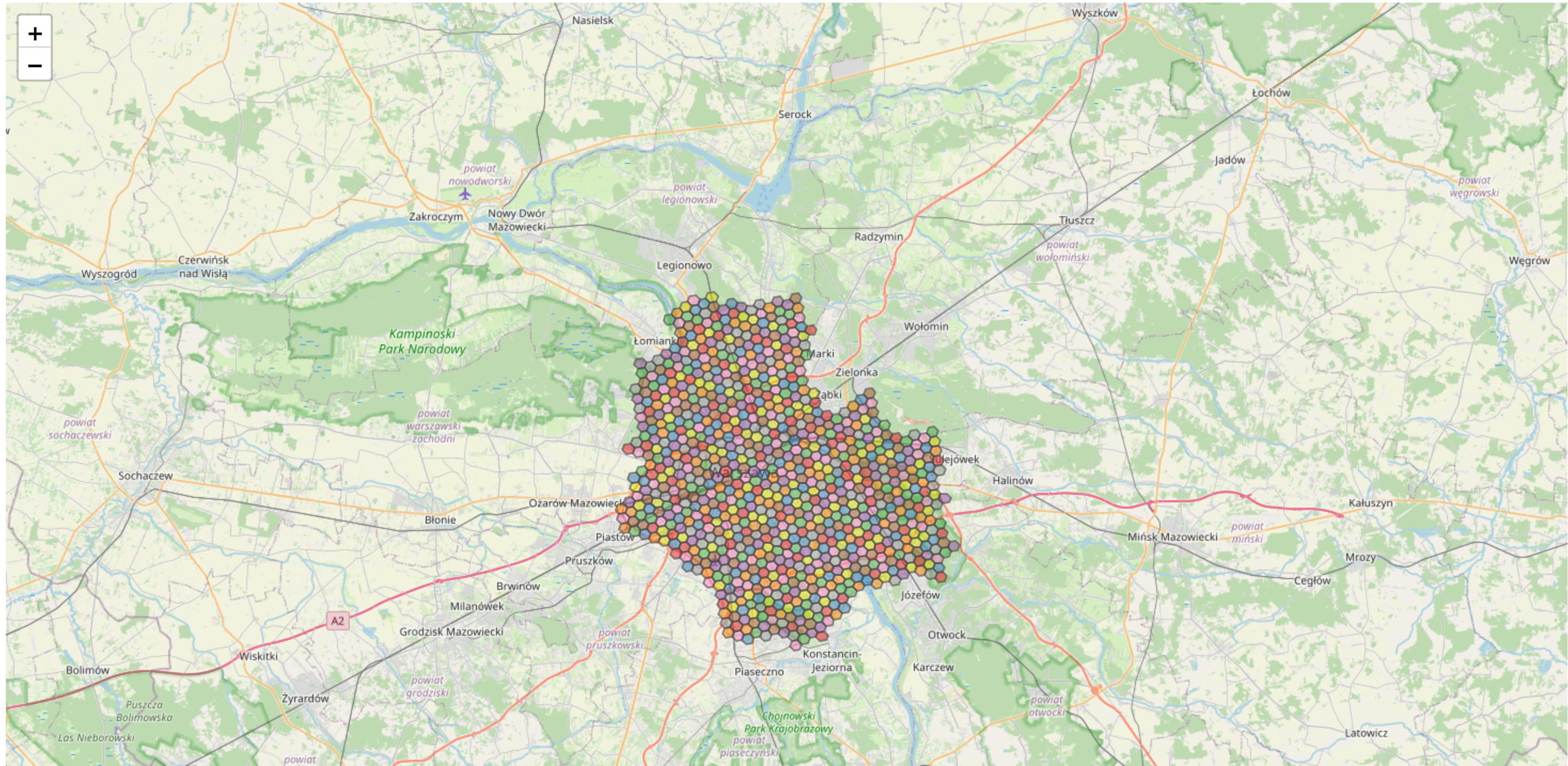
```
In [8]: from utils import CB_SAFE_PALLETE

regions = None

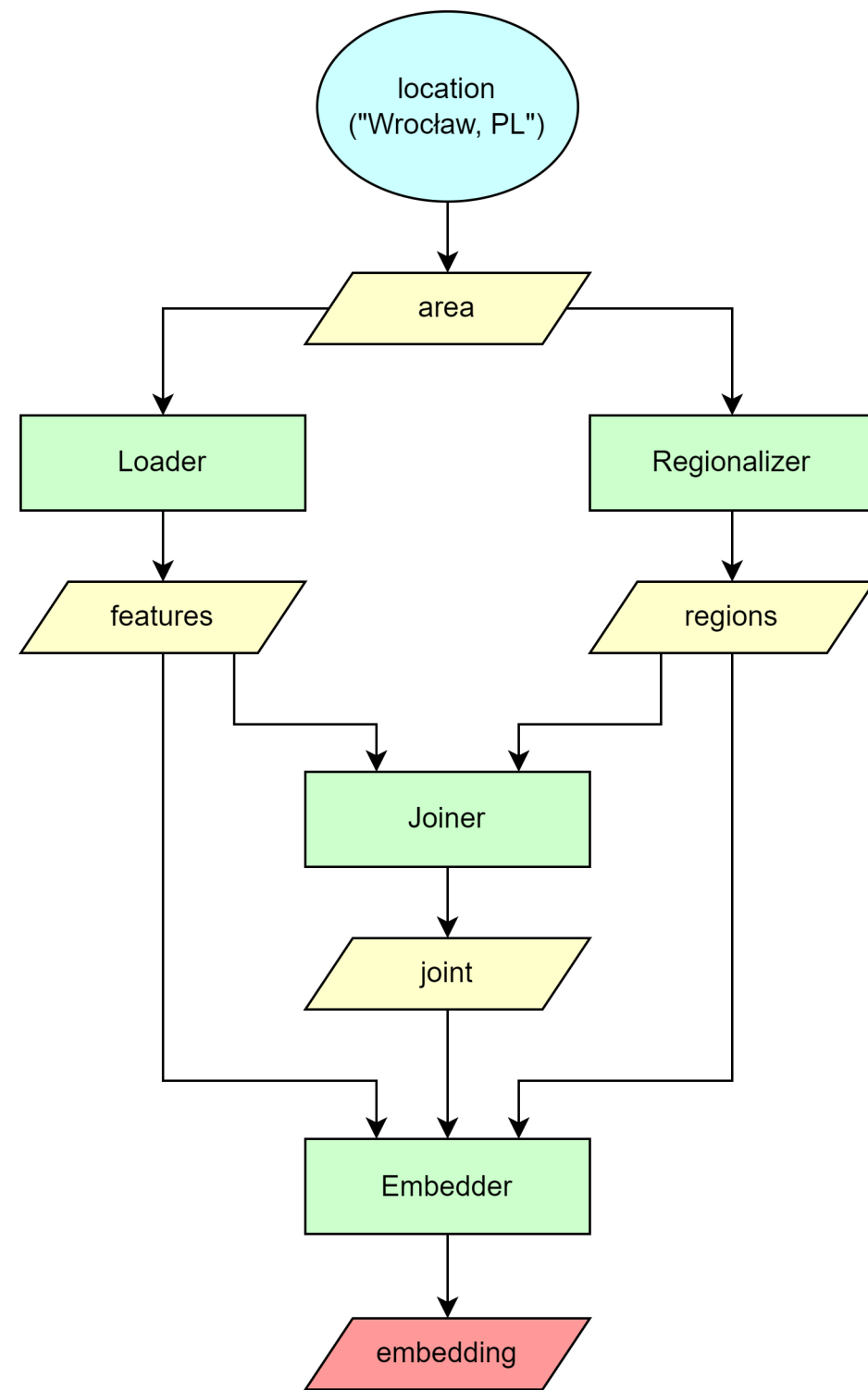
### BEGIN SOLUTION
from srai.regionalizers import H3Regionalizer
from srai.plotting import plot_regions

regions = H3Regionalizer(8).transform(area)
plot_regions(regions, colormap=CB_SAFE_PALLETE)
### END SOLUTION
```

Out[8]:







**Embedders**

# Embedders

Unify methods for mapping regions into a vector space.

API

Examples

Types of embedders:

- Count
- Contextual Count
- GTFS2Vec
- Hex2Vec
- Highway2Vec
- GeoVex

## Task 4

Now that we have `regions` and `features` we can try to combine (intersect) them together. This way we will know which feature lays within which region. Use `IntersectionJoiner` from `srai.joiners` to get the `joint` DataFrame.

## Task 4

Now that we have `regions` and `features` we can try to combine (intersect) them together. This way we will know which feature lays within which region. Use `IntersectionJoiner` from `srai.joiners` to get the `joint` DataFrame.

```
In [9]: joint = None

### BEGIN SOLUTION
from srai.joiners import IntersectionJoiner

joint = IntersectionJoiner().transform(regions, features)
### END SOLUTION

joint.head(3)
```

Out[9]:

region_id	feature_id
881f5352e7ffff	way/945954508
881f5352adffff	way/945954508
881f5352e7ffff	way/1096147590

## Task 5

Finally, we can combine results from the previous steps to create a geospatial embedding. There are a couple of methods to choose from, but let's use the simplest `embedder` - `CountEmbedder` from `srai.embedders`. It simply counts the occurrences of features across regions.

With it, transform `regions`, `features` and `joint` into the `embeddings`.

```
In [10]: embeddings = None

### BEGIN SOLUTION
from srai.embedders import CountEmbedder

embedder = CountEmbedder()
embeddings = embedder.transform(regions, features, joint)
### END SOLUTION

embeddings.head(3)
```

/Users/kacper.lesniara/Projects/Personal/srai-tutorial/venv/lib/python3.10/site-packages/torchmetrics/utilities/imports.py:24: DeprecationWarning: distutils Version classes are deprecated. Use packaging.version instead.  
\_PYTHON\_LOWER\_3\_8 = LooseVersion(\_PYTHON\_VERSION) < LooseVersion("3.8")

Out[10]:

		highway_primary	highway_primary_link	highway_secondary	highway_secondary_link	highway_tertiary	highway_tertiary_link	highway_trunk	highway_trunk_link	water_basin
region_id										
881f5352e7ffff	0	0	0	0	2	0	2	0	4	
881f53d9d9ffff	0	0	0	0	0	0	0	0	0	
881f53ca33ffff	0	0	6	0	10	5	7	2	0	

3 rows × 33 columns



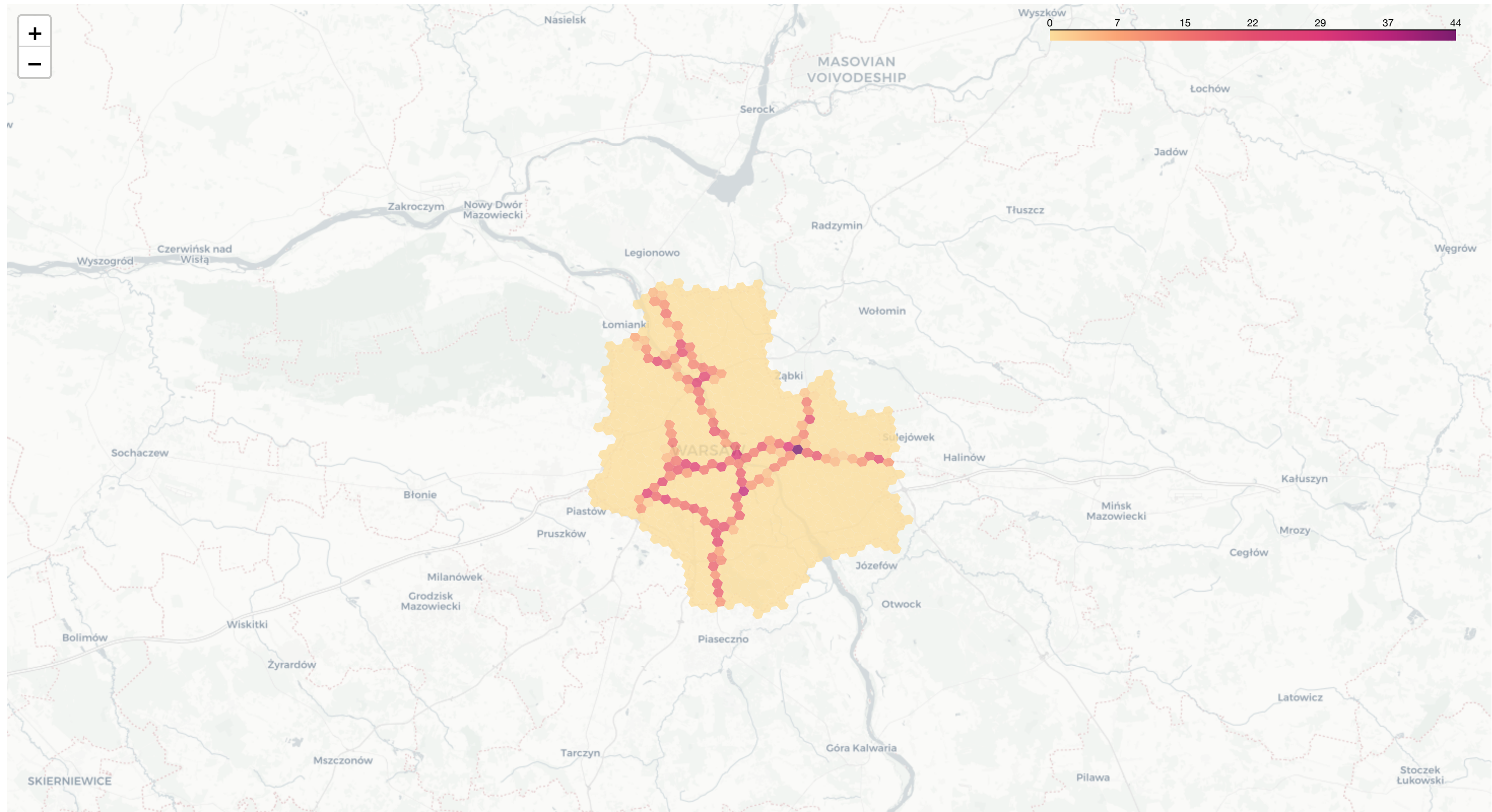
It would be nice to see the results. Use `plot_numeric_data` from `srai.plotting` to visualize the embeddings. As a `data_column` choose one of the columns available in the `embeddings` DataFrame.

```
In [11]: data_column = None

### BEGIN SOLUTION
from سراي.plotting import plot_numeric_data

data_column = "highway_primary"
plot_numeric_data(regions, data_column, embeddings)
### END SOLUTION
```

Out[11]:



## Summary

Good job! You managed to use all of the building blocks of `srai` to create an entire pipeline - from only a name of a city, to embeddings of regions in it.

**Questions?**