

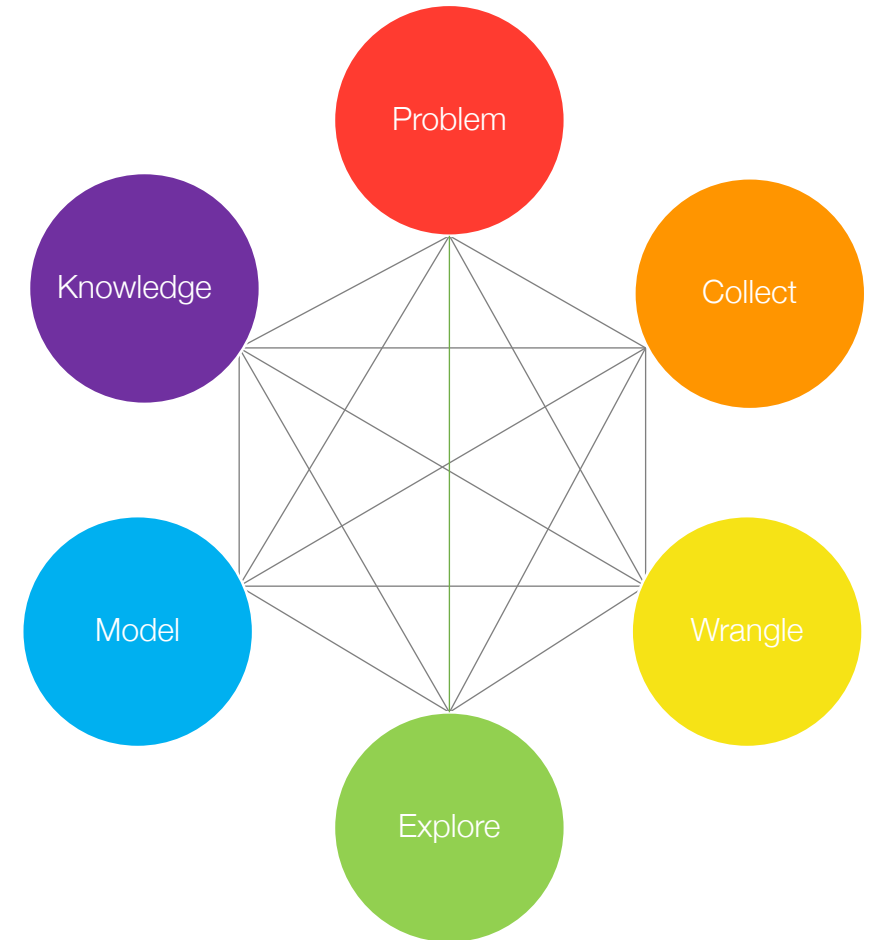
GEOG0114: PRINCIPLES OF SPATIAL ANALYSIS

WEEK 2: GRAPHICAL REPRESENTATION OF SPATIAL DATA

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UCL Geography

Contents

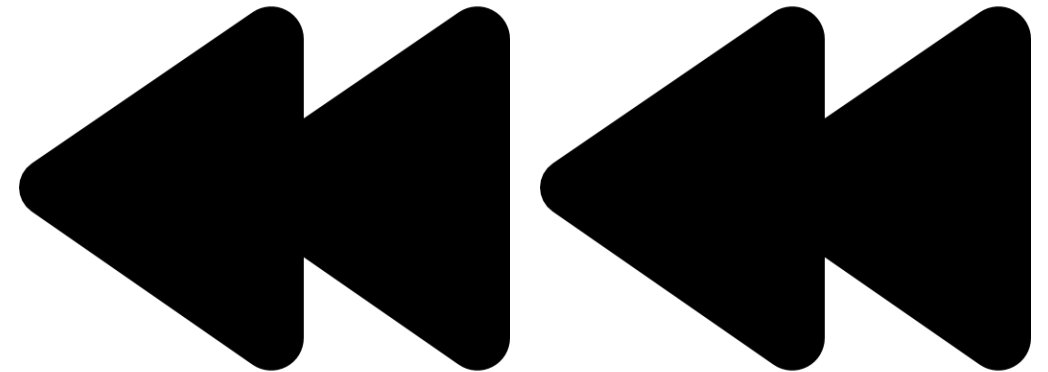
1. **Types of spatial data formats used to describe reality**
 - Vector
 - Raster
2. **Spatial Operations (or Geoprocessing)**
3. **Thematic Mapping**
 - Choropleths
 - Proportional symbol map
 - Raster map
 - Isopleth / Contour maps
4. **Issues**
 - Ecological Fallacy bias
 - Absolute versus Relative
 - Resolution matters...



QUICK RECAP

1. Spatial statistics is grounded on **spatial dependence** and from **Tobler's 1st Law of Geography**
2. We mentioned some fundamental concepts, and two key words for explaining spatial dependence:
 - **Distance decay**
 - **Spatial autocorrelation**
 - **Spatial spillovers**
3. Event information presented spatially can either be:
 - **Areal/Regional (aka aggregated)**
 - **Point patterns**
 - **Geostatistical**

Let's rewind a bit to last week



Types of Spatial Data Formats

Suppose we want to map the following from this landscape:

1. Physical objects:

- Location of buildings
- Farm plots
- Locations of trees
- Road network
- Block areas (divided by the road)

2. Levels of soil moisture across the landscape



An aerial photograph of a rural landscape. A river flows from the top left towards the bottom right. A road network, including a bridge, crosses the river. The landscape is divided into various land-use plots, some of which are agricultural fields. Individual trees are scattered throughout the scene. The image is overlaid with several text labels in white boxes.

Individual buildings

Road network

Land-use plots (Farm)

**Area blocks (partitioned by
the roads)**

Individual trees

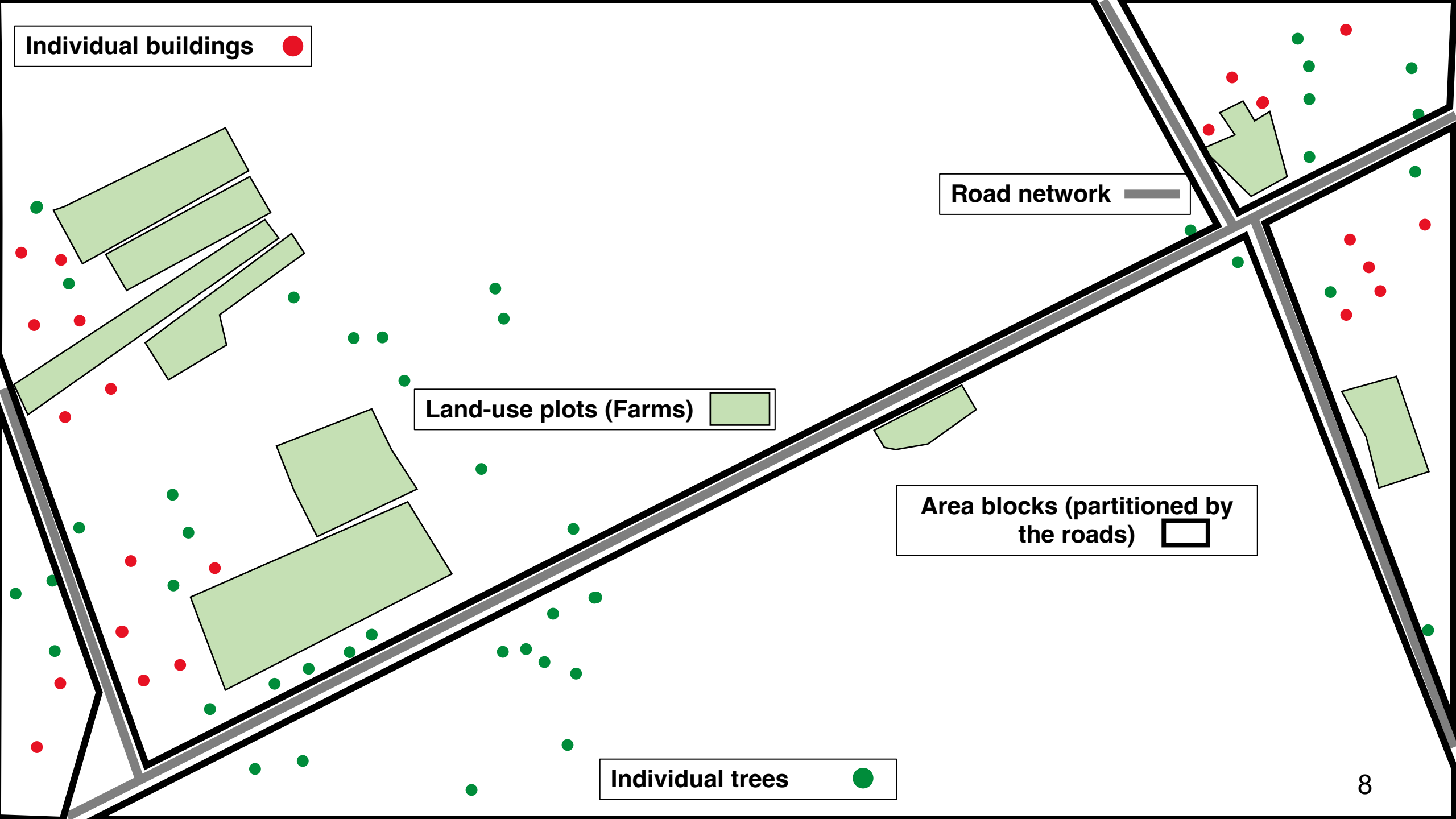
Individual buildings ●

Road network —

Land-use plots (Farms) □

Area blocks (partitioned by the roads) □

Individual trees ●

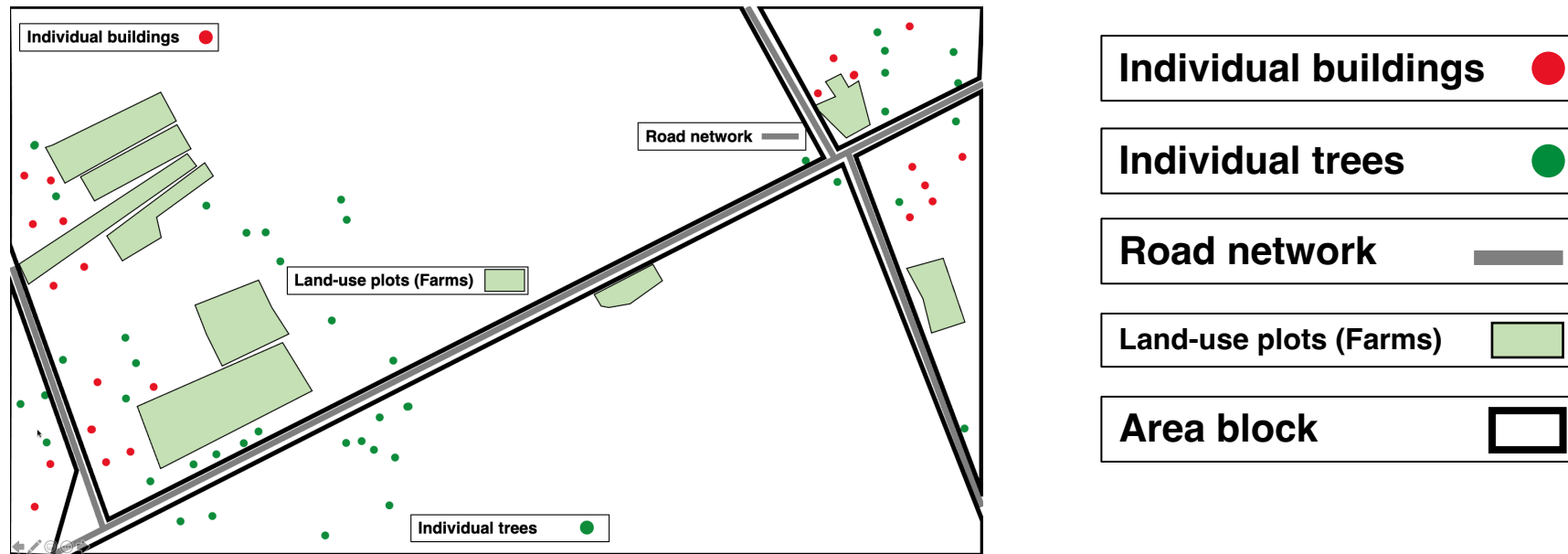




The above objects listed are called “**Features**”. A feature can be described according to its characteristics which is termed an “**Attribute**” in GIS. The attribute of a feature can be a **numeric** or **text** observation.

For example:

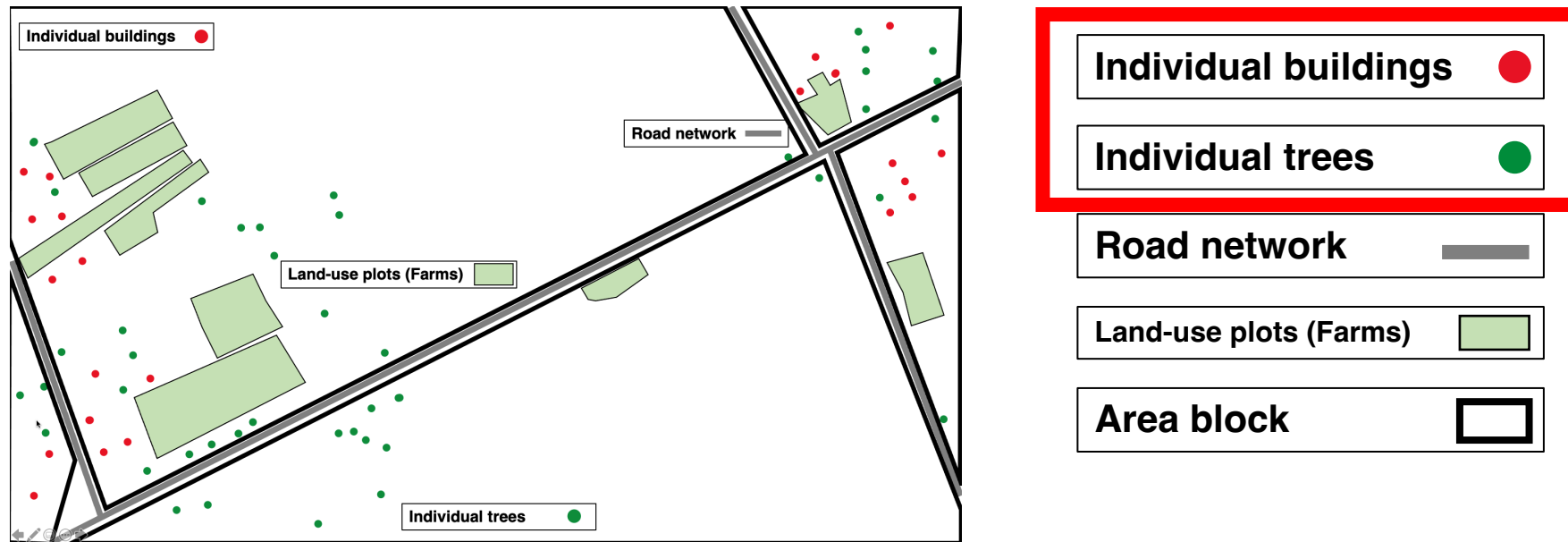
- A building is a **point feature** on this map, the number of people living a building is a **numeric attribute** describing this **feature**. Type of building (i.e., Victorian or modern) is a **text attribute**
- The road network is a **polyline feature**, the length (or distance (m)) of the road is a **numeric attribute** describing the road
- Land-use plot is a **polygon (or area) feature**, the type of land-use (i.e., farming) is the **text attribute** describing what that polygon is etc.



Now, the above objects are typically **Discrete** features, and therefore classed as **Vector Data**

There are three main types of **Vector Data**:

1. **Point vector**
2. **Polylines or Line vector**
3. **Polygon vector**



Now, the above objects are typically **Discrete** features, and therefore classed as **Vector Data**

There are three main types of **Vector Data**:

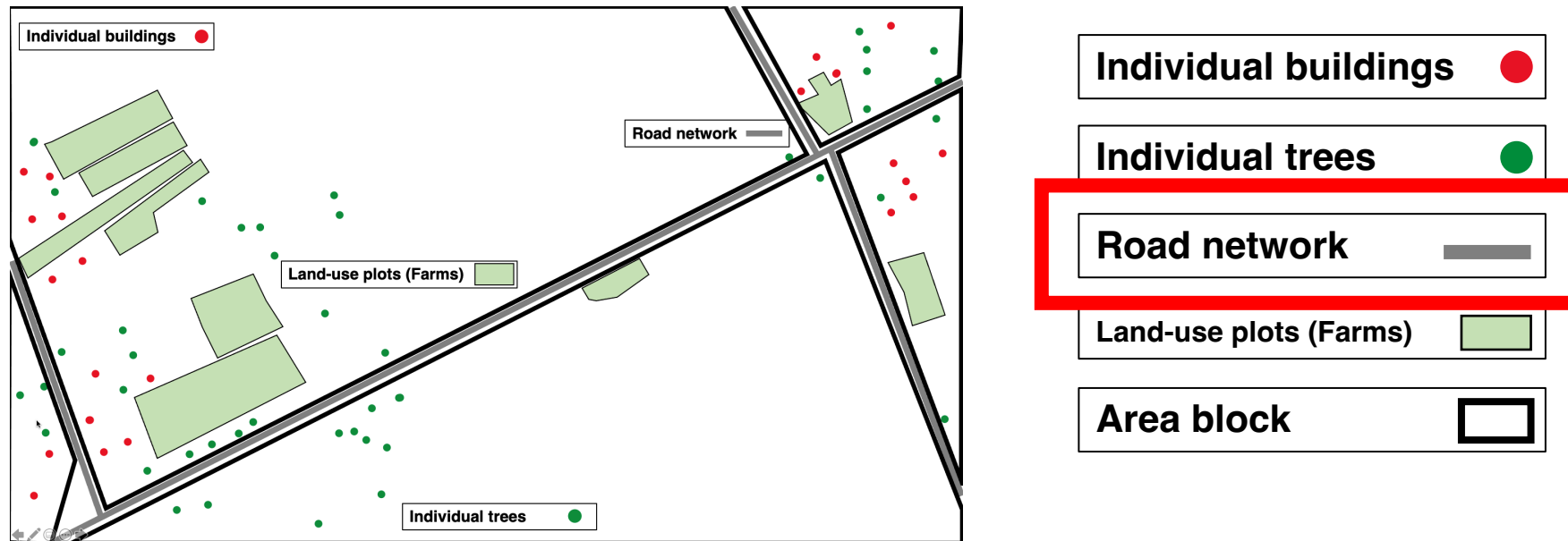
1. Point vector

2. Polylines or Line vector

3. Polygon vector

Characteristics of a point vector

- X, Y location characterize as a coordinate
- Has no area
- Has no length
- This applies to discrete features of sample points
- Its geometry consists of a single **node** or **vertex**



Now, the above objects are typically **Discrete** features, and therefore classed a **Vector Data**

There are three main types of **Vector Data**:

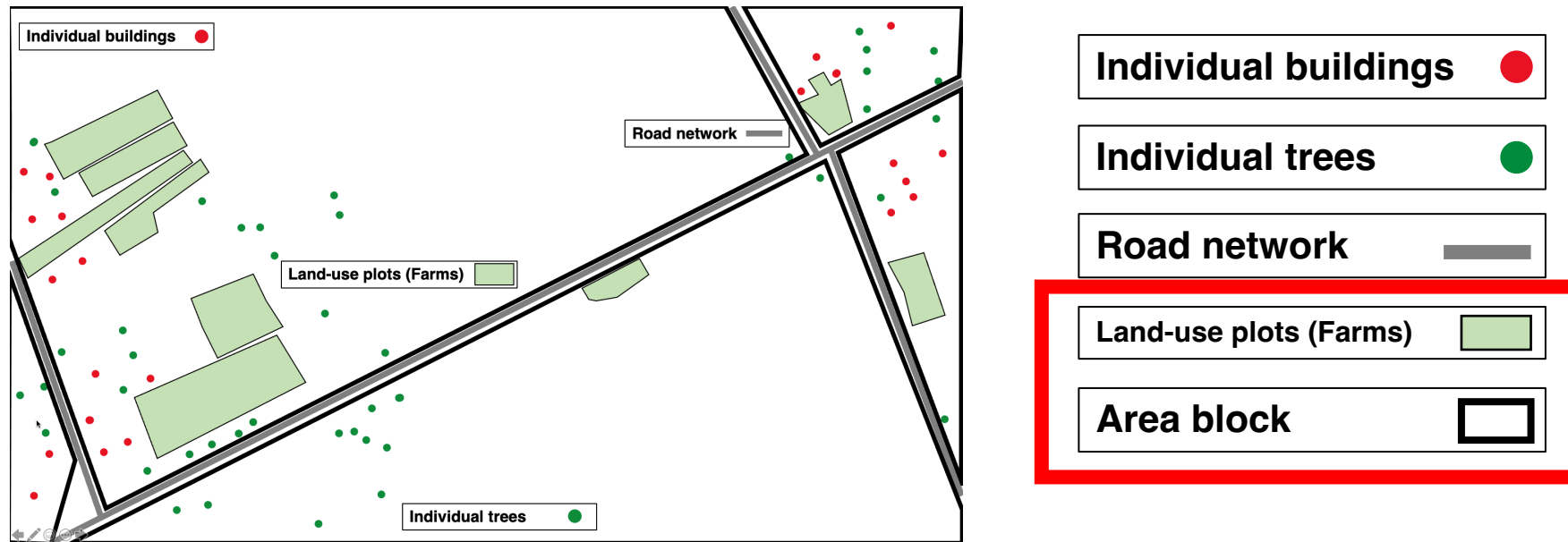
1. Point vector

2. Polylines or Line vector

3. Polygon vector

Characteristics of a polyline or line vector

- These are a series of X, Y points characterize by coordinates to form a line
- Has no area
- They have a length
- They have a direction (important for visualizing rivers steams & roads)
- Connectivity (it connecting to other lines segments in the network)
- This applies to features without an area but with a length – roads, rivers, railway tracks or migration flows between two or more locations.
- Its geometry consists of **2 nodes** (i.e., beginning and end of point of line) & can have more than one **vertex** (i.e., point(s) that connect different lines together)
- It is never enclosed



Now, the above objects are typically **Discrete** features, and therefore classed a **Vector Data**

There are three main types of **Vector Data**:

1. **Point vector**

2. **Polylines or Line vector**

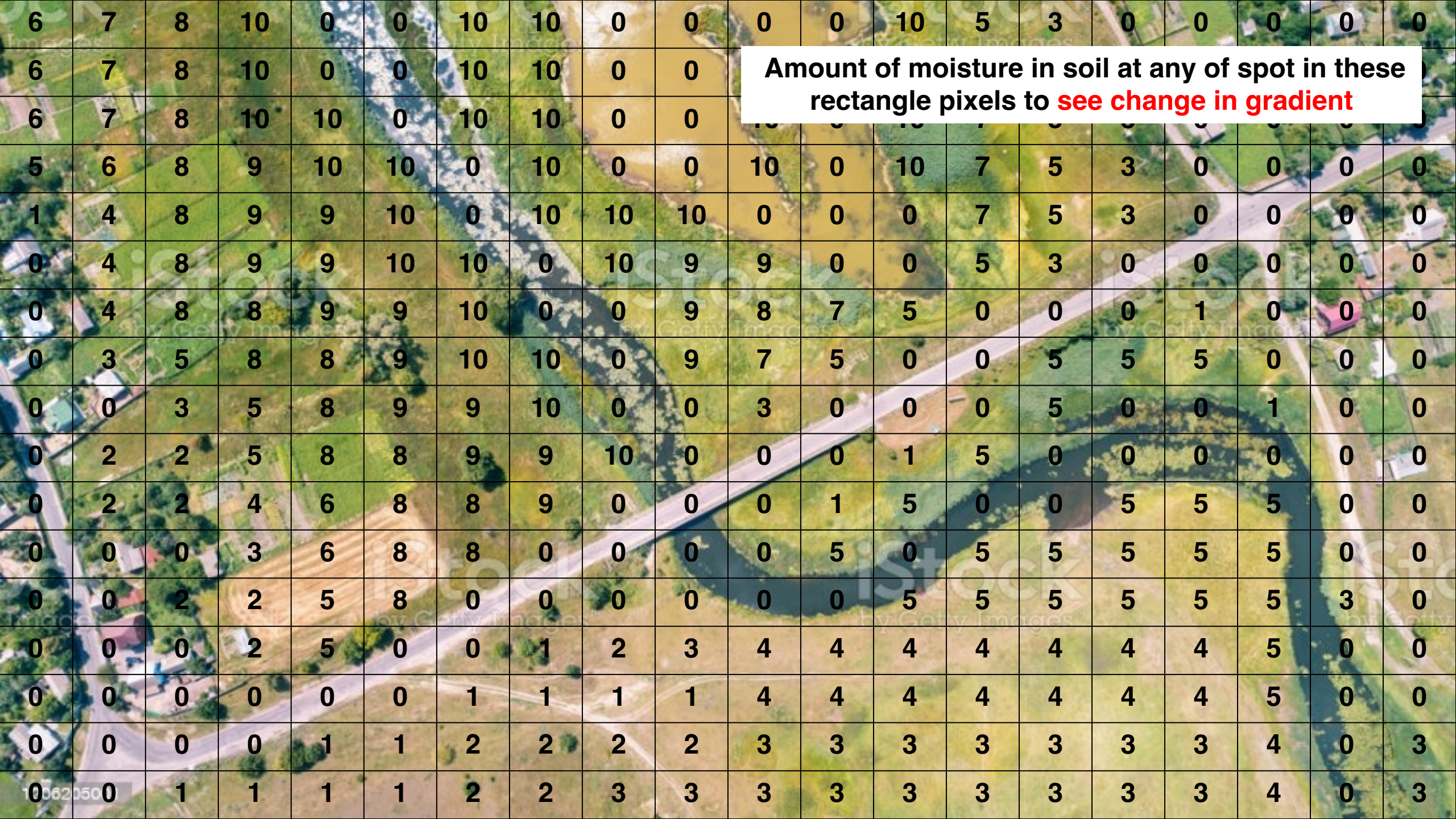
3. **Polygon vector**

Characteristics of a polygon vector

- These are a series of X, Y points characterize by coordinates to form an enclosed region
- It has an area
- It has no length but rather a perimeter instead
- This applies to features with enclosed regions – e.g., postcode areas, area of residential premise, counties (other administrative boundaries) etc.
- Polygons have **three vertices** or more each connecting sequentially where the first vertex connects with the last vertex.

An aerial photograph showing a river with a bridge crossing it. The river has a dark, winding path with some green vegetation along its banks. The surrounding area includes green fields, some residential buildings, and a road. The water in the river appears to have some sediment or algae, giving it a slightly yellowish-brown hue in some areas. The bridge is a simple concrete structure with a single lane. The overall scene is a mix of natural and developed land.

What about the soil moisture



6	7	8	10	0	0	10	10	0	0	0	0	10	5	3	0	0	0	0	0
6	7	8	10	0	0	10	10	0	0	10	0	10	6	3	0	0	0	0	0
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0	0	0	0	0	0	1	1	1	1	4	4	4	4	4	4	4	4	5	0
0	0	0	0	1	1	2	2	2	2	3	3	3	3	3	3	3	3	4	0
0	0	1	1	1	1	2	2	3	3	3	3	3	3	3	3	3	3	4	0

Soil moisture index	
	10
	7 to 9
	4 to 6
	1 to 3
	0

Unlike the vector data. The above feature describes how moisture levels across the surface of the landscape – the feature is is not measured discretely but on a **continuous** surface to show gradient in changes for soil moisture across the landscape

Now, this **Non-discrete** feature is classed a **Raster Data**

What is Raster Data?

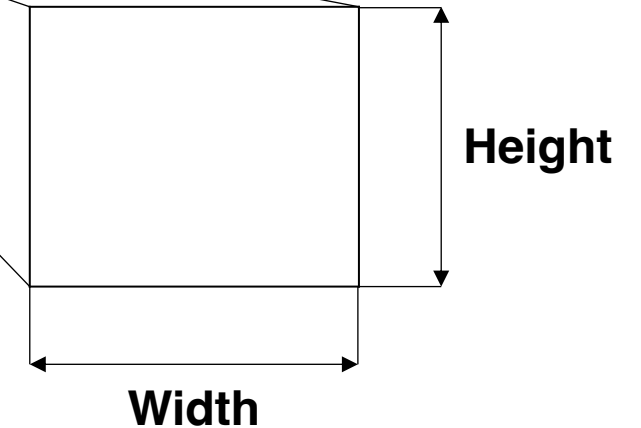
- It is a matrix of pixels or grid-cells that contains a numeric or text value for a feature its representing
- It is composed of rows and columns
- Each pixel or grid-cell has a resolution (or size for height and width)

6	7	8	10	0	0	10	10	0	0	0	0	10	5	3	0	0	0	0	0
6	7	8	10	0	0	10	10	0	0	10	0	10	6	3	0	0	0	0	0
6	7	8	10	10	0	10	10	0	0	10	0	10	7	5	3	0	0	0	0
5	6	8	9	10	10	0	10	0	0	10	0	10	7	5	3	0	0	0	0
1	4	8	9	9	10	0	10	10	10	0	0	0	7	5	3	0	0	0	0
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0	0	0	0	0	0	1	1	1	1	4	4	4	4	4	4	4	5	0	0
0	0	0	0	1	1	2	2	2	2	3	3	3	3	3	3	3	4	0	3
0	0	1	1	1	1	2	2	3	3	3	3	3	3	3	3	3	4	0	3

Soil moisture index	
	10
	7 to 9
	4 to 6
	1 to 3
	0

Characteristics of Raster Data and its pixels (or grid cells):

- It can take any shape (circle, square, rectangle, hexagon etc.). The usual shape you will encounter is a **square**
- Resolution (width and height: units - m, km, miles etc.)



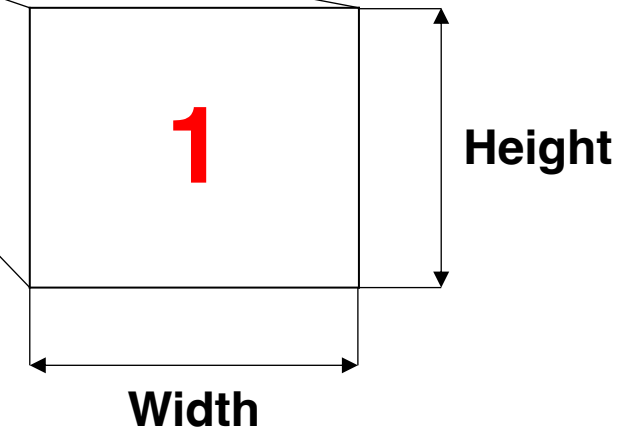
6	7	8	10	0	0	10	10	0	0	0	0	10	5	3	0	0	0	0	0
6	7	8	10	0	0	10	10	0	0	10	0	10	6	3	0	0	0	0	0
6	7	8	10	10	0	10	10	0	0	10	0	10	7	5	3	0	0	0	0
5	6	8	9	10	10	0	10	0	0	10	0	10	7	5	3	0	0	0	0
1	4	8	9	9	10	0	10	10	10	0	0	0	7	5	3	0	0	0	0
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0	4	8	8	9	9	10	0	0	9	8	7	5	0	0	0	1	0	0	0
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0	2	3	5	8	9	9	10	0	0	3	0	0	0	5	0	0	1	0	0
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0	2	2	4	6	8	8	9	0	0	0	0	1	5	0	0	5	5	5	0
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0	0	0	0	1	1	2	2	2	2	3	3	3	3	3	3	3	3	4	0
0	0	1	1	1	1	2	2	3	3	3	3	3	3	3	3	3	3	4	0

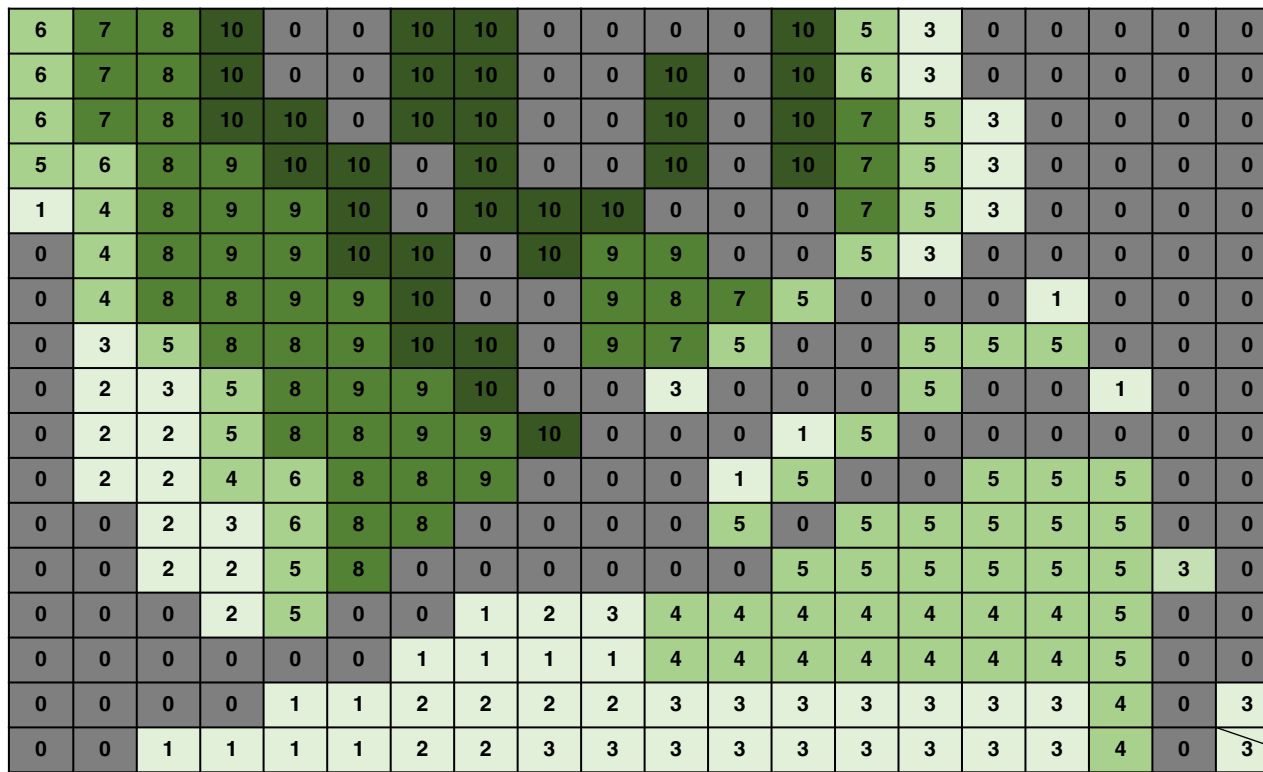
Soil moisture index	
	10
	7 to 9
	4 to 6
	1 to 3
	0

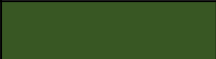




Example with Boolean

Characteristics of Raster Data and its pixels (or grid cells):

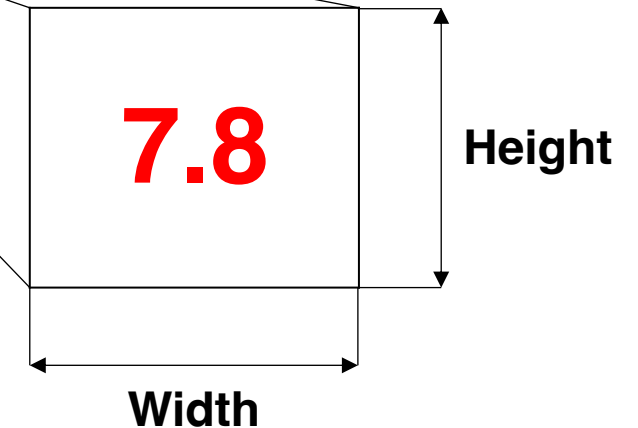
- It can take any shape (circle, square, rectangle, hexagon etc.). The usual shape you will encounter is a **square**
- Resolution (width and height: units - m, km, miles etc.)
- Data types:
 - Integer: for discrete values (e.g., above raster for moisture)
 - Boolean (or Binary) 1 = “Yes” and 0 = “No” (Presence/absence)**





Soil moisture index	
	10
	7 to 9
	4 to 6
	1 to 3
	0

Example with Float



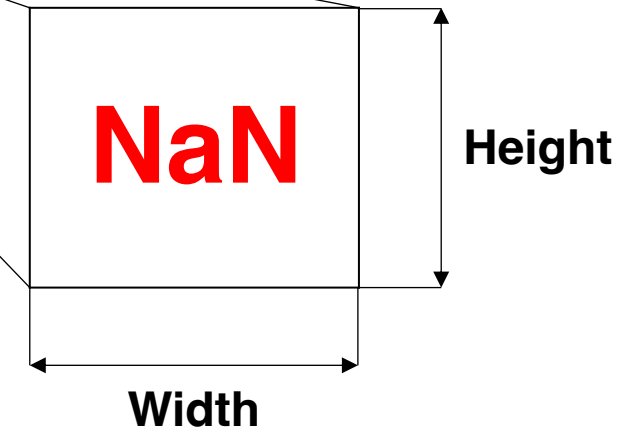
Characteristics of Raster Data and its pixels (or grid cells):

- It can take any shape (circle, square, rectangle, hexagon etc.). The usual shape you will encounter is a **square**
- Resolution (width and height: units - m, km, miles etc.)
- Data types:
 - Integer: for discrete values (e.g., above raster for moisture)
 - Boolean (or Binary) 1 = “Yes” and 0 = “No” (Presence/absence)
 - **Float (or continuous data)**

6	7	8	10	0	0	10	10	0	0	0	0	10	5	3	0	0	0	0	0
6	7	8	10	0	0	10	10	0	0	10	0	10	6	3	0	0	0	0	0
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5	6	8	9	10	10	0	10	0	0	10	0	10	7	5	3	0	0	0	0
1	4	8	9	9	10	0	10	10	10	0	0	0	7	5	3	0	0	0	0
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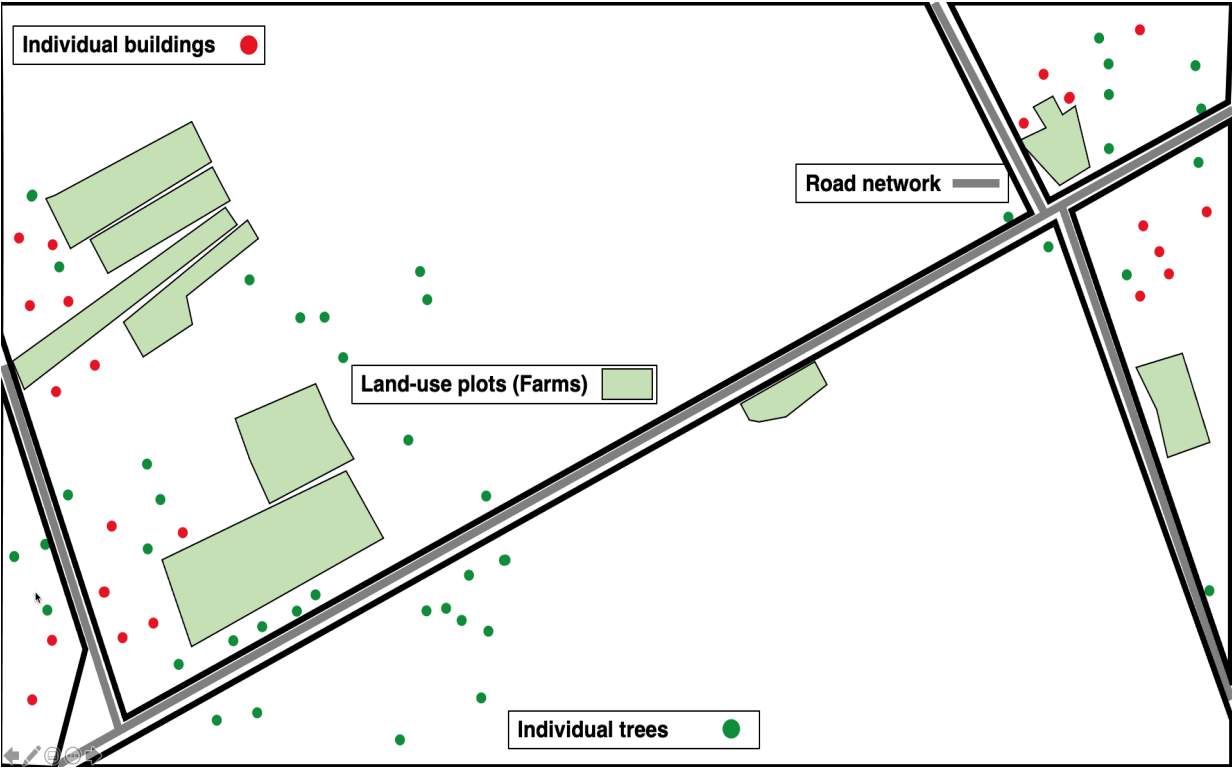
Soil moisture index	
	10
	7 to 9
	4 to 6
	1 to 3
	0

Example with Missing



Characteristics of Raster Data and its pixels (or grid cells):

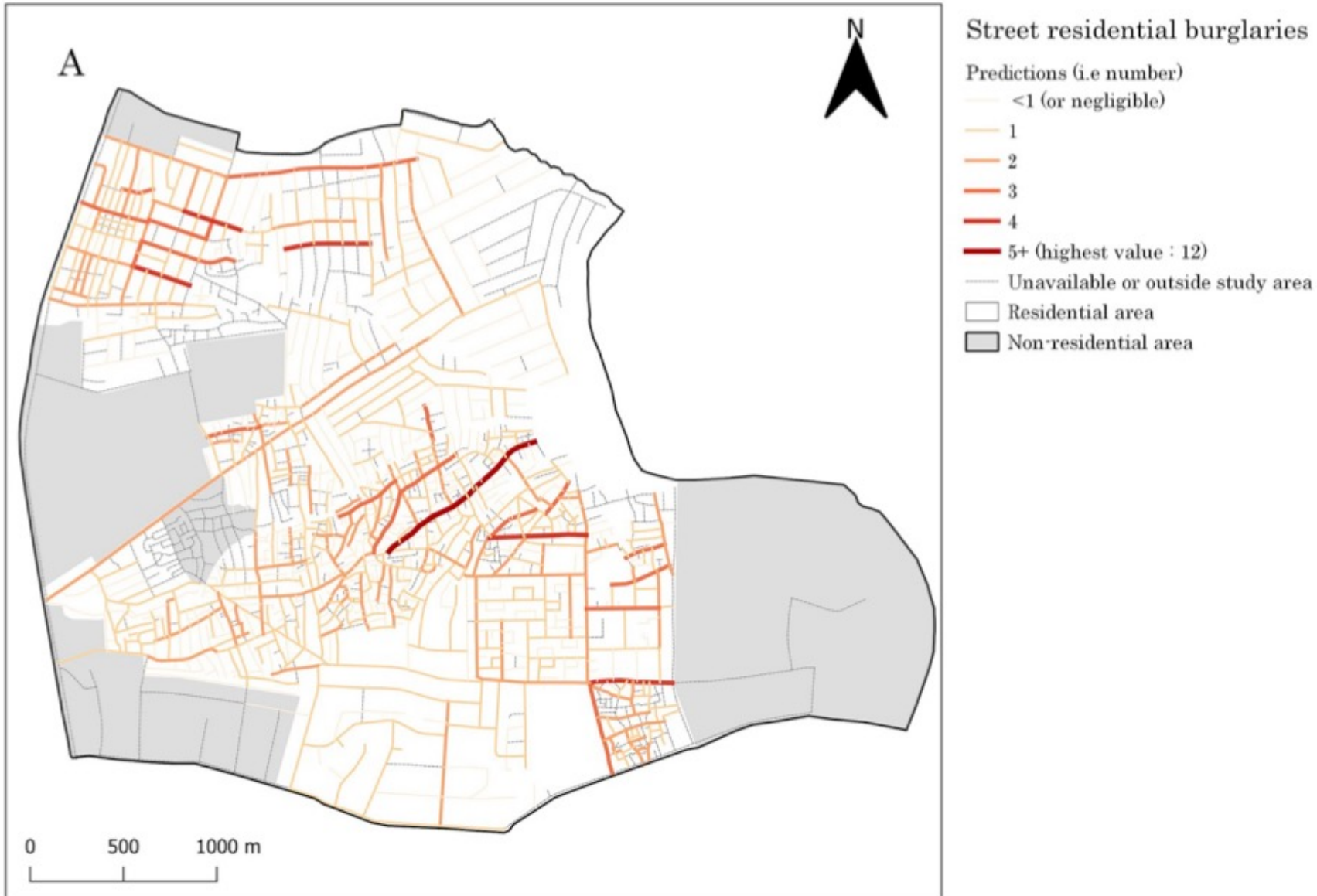
- It can take any shape (circle, square, rectangle, hexagon etc.). The usual shape you will encounter is a **square**
- Resolution (width and height: units - m, km, miles etc.)
- Data types:
 - Integer: for discrete values (e.g., above raster for moisture)
 - Boolean (or Binary) 1 = “Yes” and 0 = “No” (Presence/absence)
 - Float (or continuous data)
 - No data, missing value in pixel: NA, NaN



Vector data

6	7	8	10	0	0	10	10	0	0	0	0	10	5	3	0	0	0	0	0
6	7	8	10	0	0	10	10	0	0	10	0	10	6	3	0	0	0	0	0
6	7	8	10	10	0	10	10	0	0	10	0	10	7	5	3	0	0	0	0
5	6	8	9	10	10	0	10	0	0	10	0	10	7	5	3	0	0	0	0
1	4	8	9	9	10	0	10	10	10	0	0	0	7	5	3	0	0	0	0
0	4	8	9	9	10	10	0	10	9	9	0	0	5	3	0	0	0	0	0
0	4	8	8	9	9	10	0	0	9	8	7	5	0	0	0	1	0	0	0
0	3	5	8	8	9	10	10	0	9	7	5	0	0	5	5	5	0	0	0
0	2	3	5	8	9	9	10	0	0	3	0	0	0	5	0	0	1	0	0
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0	0	1	1	1	1	2	2	3	3	3	3	3	3	3	3	3	3	4	0

Raster data



The map on the left shows the predicted numbers of burglaries across streets for a small city in Kaduna Nigeria (*Musah et al. 2020*)

- What type of spatial data is shown in the map on the left?
- What kinds of **features** are included in this visualisation?
- What is the main **feature and attribute** for this visualisation?

Image: Show predicted cases of residential burglaries in study area

Sources:

Musah, A., et al. (2020): <https://doi.org/10.1016/j.apgeog.2019.102126>



Image: Show predicted cases of residential burglaries in study area

Sources:

Musah, A., et al. (2020): <https://doi.org/10.1016/j.apgeog.2019.102126>

Street residential burglaries

Predictions (i.e number)

<1 (or negligible)

1

2

3

4

5+ (highest value : 12)

Unavailable or outside study area

Residential area

Non-residential area

- What type spatial data is shown in the map on the left?

Vector Data

- What kinds of **features** are included in this visualization?

Polyline (Street segments)

Polygon (Study area)

- What is the main **feature and attribute** for this visualization?

Feature: Polyline (Streets)

Attribute: Predicted burglaries

The map is an example of **Choropleth (with line segments)**, which is one of many types of **thematic maps**

Spatial Operations, or Geoprocessing

Definition: Geoprocessing is a collection of tools that offers a framework for dealing with geographic data

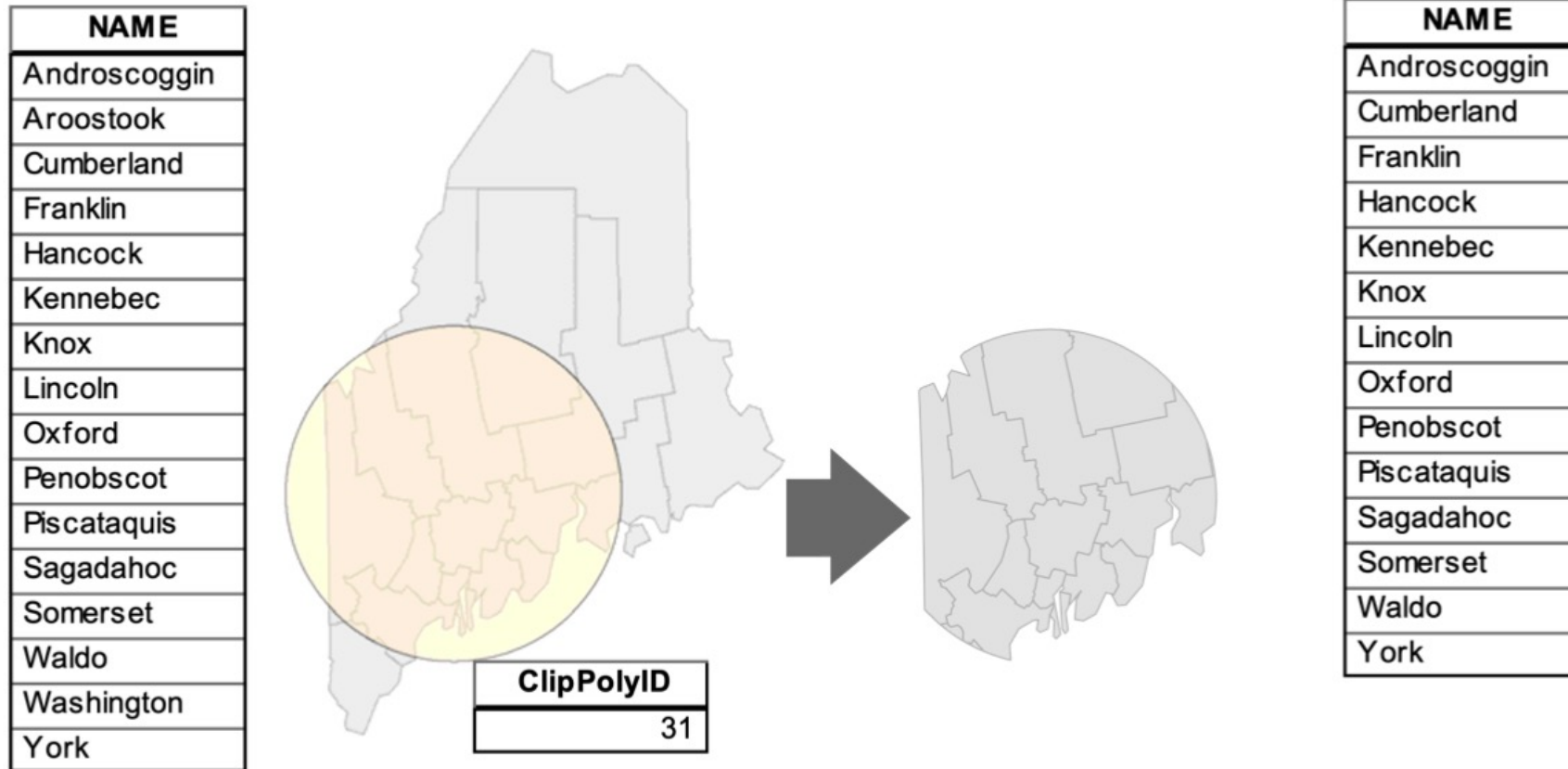
- Its purpose is to help users in the data management and automation of GIS tasks for spatial data.
- For performing geospatial modelling and analysis of vector and raster data.

In terms of spatial operations, the most problem you will encounter are:

- 1. Clipping**
- 2. Intersection**
- 3. Union**
- 4. Dissolving**
- 5. Aggregation**
- 6. Buffer**

Clipping

Capture spatial data within a region of interest



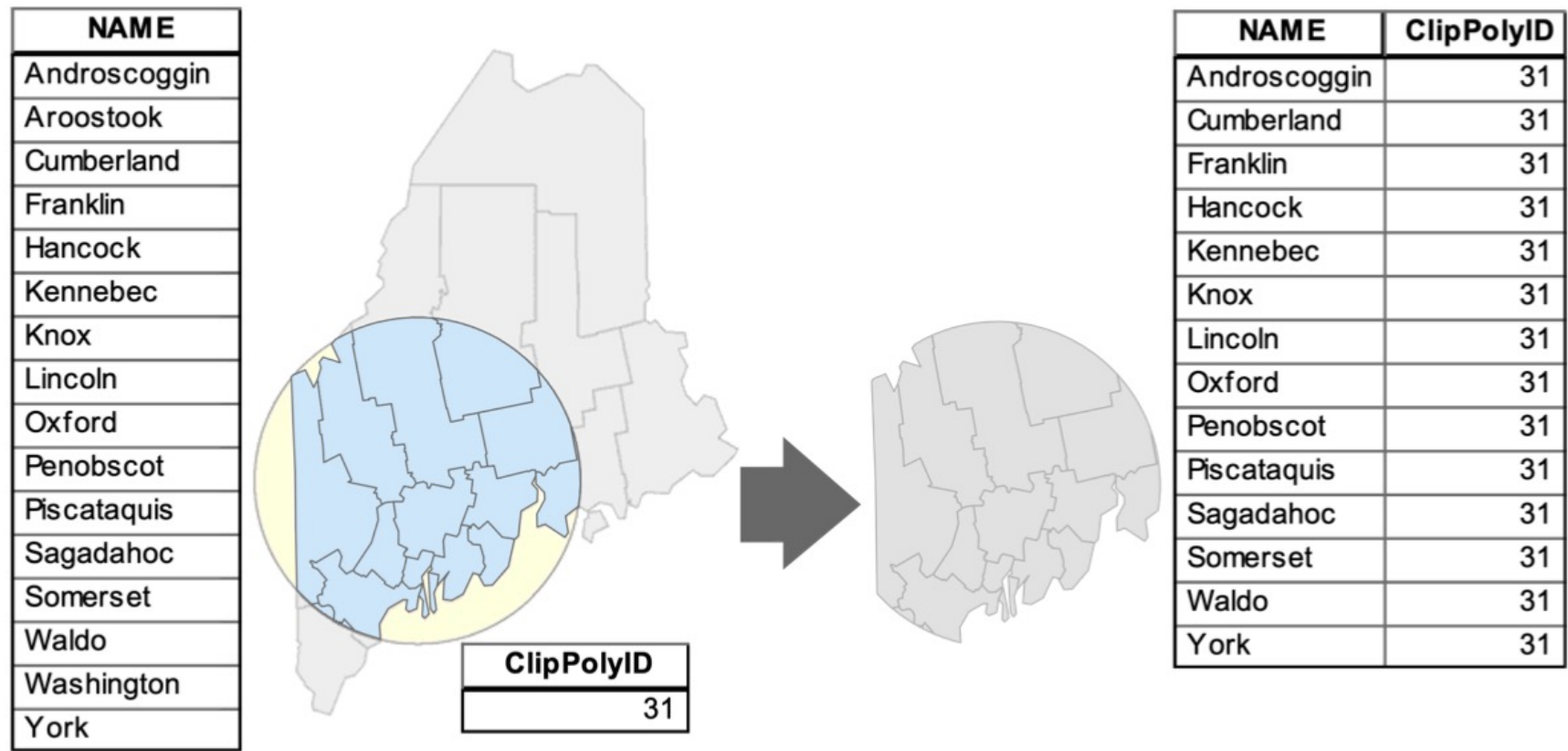
Source: Gimdond, M. 2021. Intro to GIS and Spatial Analysis. [online]. <https://mgimond.github.io/Spatial/introGIS.html>

This spatial operation can be applied to all types of spatial data:

- Clipping points to fall within an area (i.e., vector to vector)
- Clipping smaller areal units to fall within a larger area (i.e., vector to vector)
- Clipping raster cells to fall within an spatial area (i.e., vector to raster)

Intersection

Capture spatial data between two or more overlapping spatial data



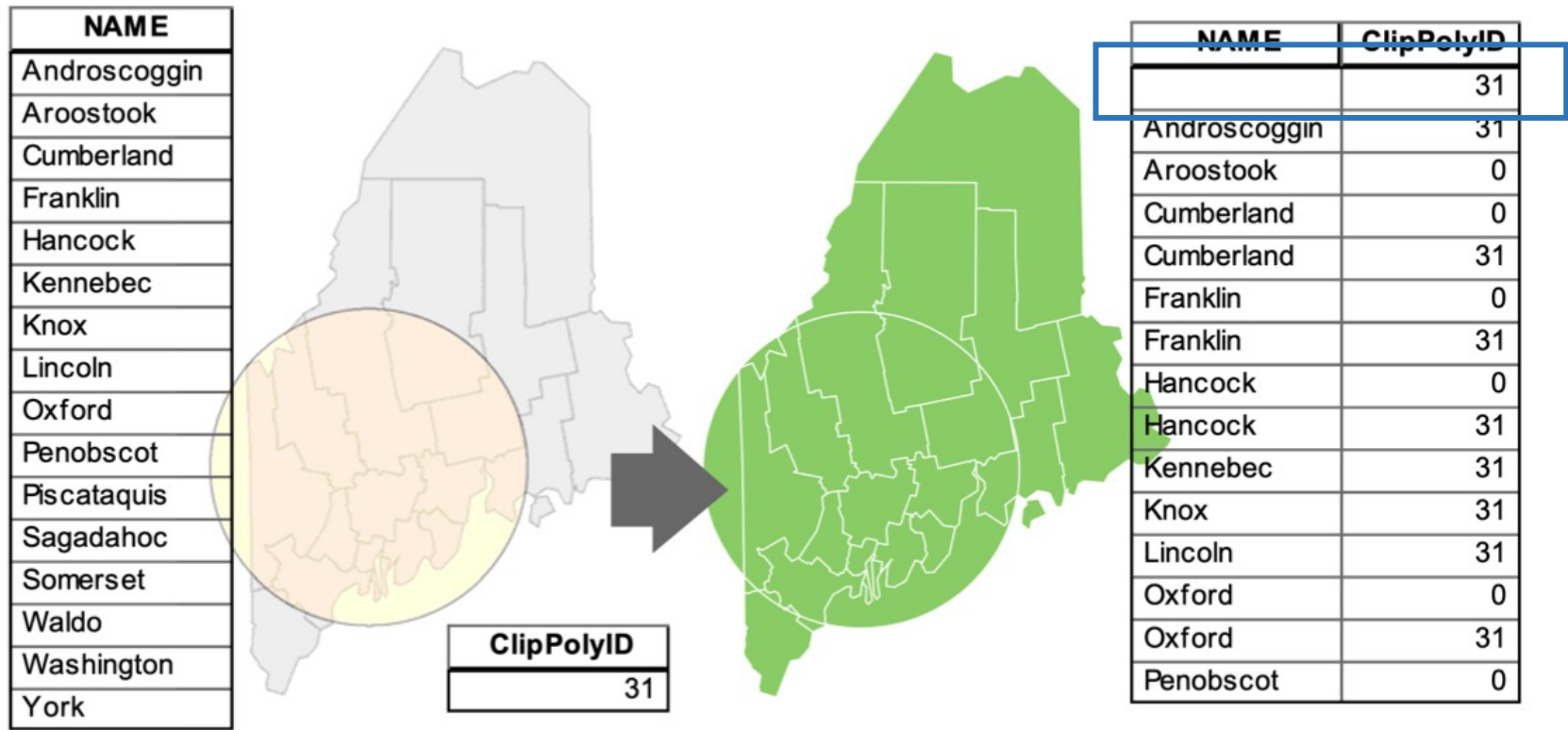
Source: Gimdond, M. 2021. Intro to GIS and Spatial Analysis. [online]. <https://mgimond.github.io/Spatial/introGIS.html>

This type of spatial operation can be applied to the following:

- Intersecting points to areas (i.e., vector to vector)
- Intersecting smaller areal units that fall within a larger area (i.e., vector to vector)]
- Intersecting points with raster (i.e., vector to raster)

Union

Bringing together two or more different vectors objects to one



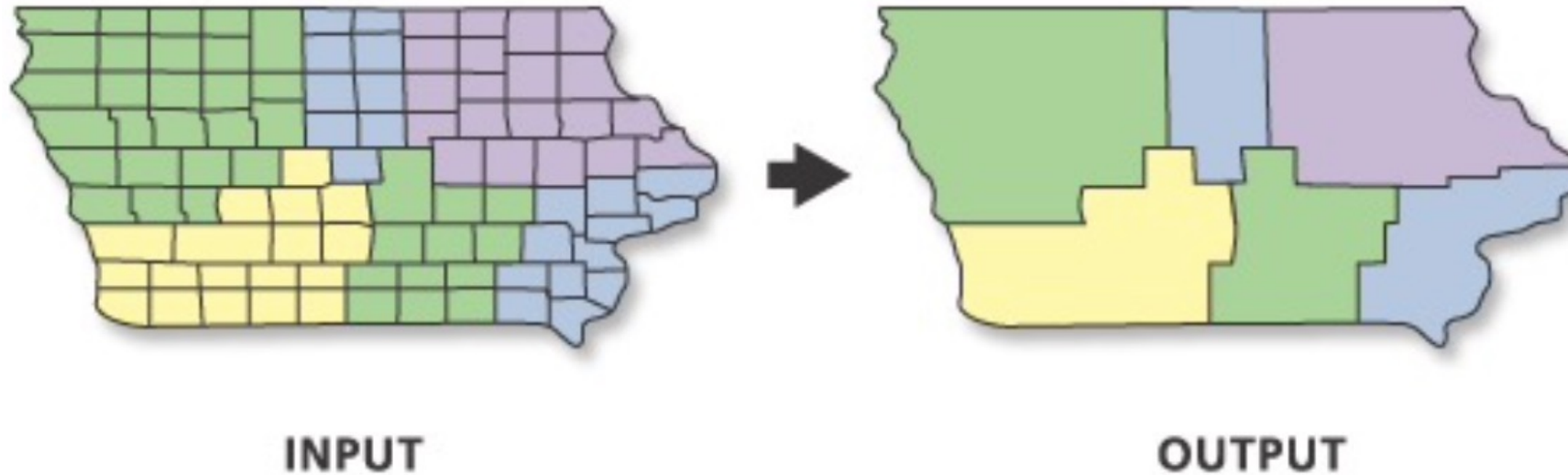
Source: Gimdond, M. 2021. Intro to GIS and Spatial Analysis. [online]. <https://mgimond.github.io/Spatial/introGIS.html>

This type of spatial operation can be applied to the following:

- You union all types of vector data (i.e., points, lines and polygons)
- It's a vector to vector spatial operation only. You cannot union a vector with a raster. The raster must be vectorised before it can be in union with another vector

Dissolving

Amalgamate or merge smaller adjacent vector units to form another vector unit.



Source: ESRI (2021) Dissolve <https://pro.arcgis.com/en/pro-app/latest/tool-reference/data-management/dissolve.htm>

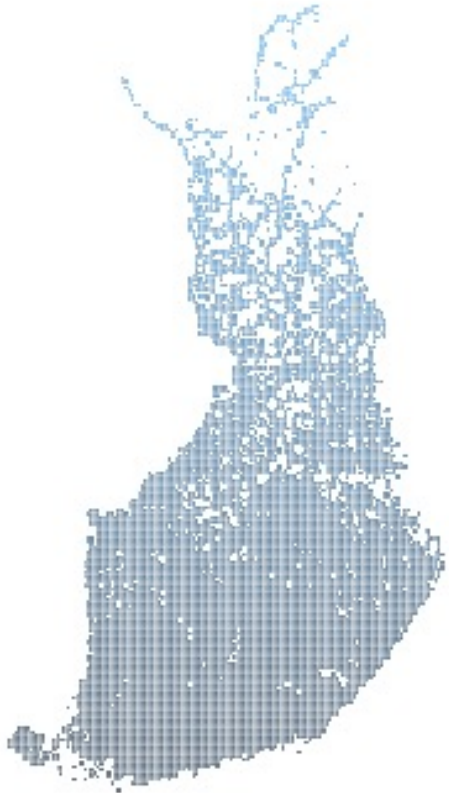
This type of spatial operation can be applied to the following:

- You dissolve only the following types of vector data (i.e., lines and polygons)
- It cannot be applied to vector points

Aggregation

Aggregating values (i.e., summing, or averaging) of smaller spatial units that fall within a larger spatial unit.

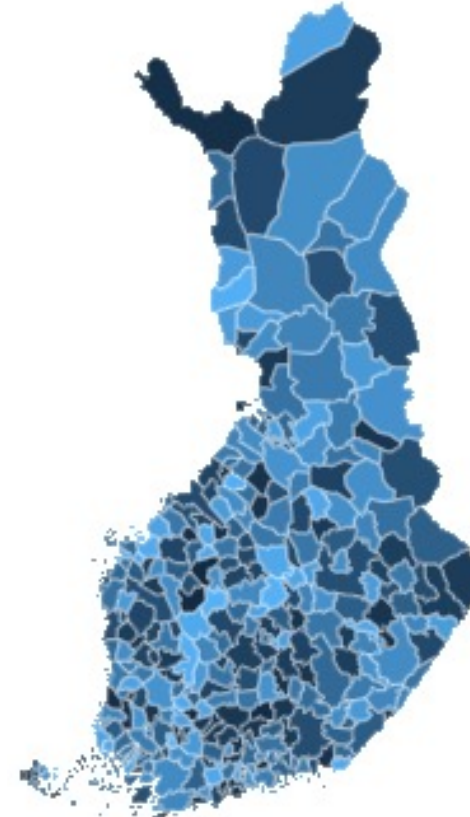
Population density grid (raster)



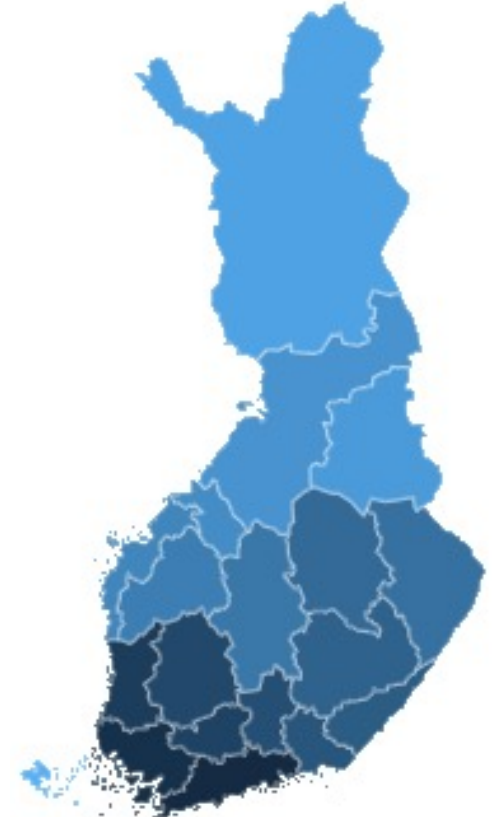
Postcode areas (vector)



Municipalities (vector)



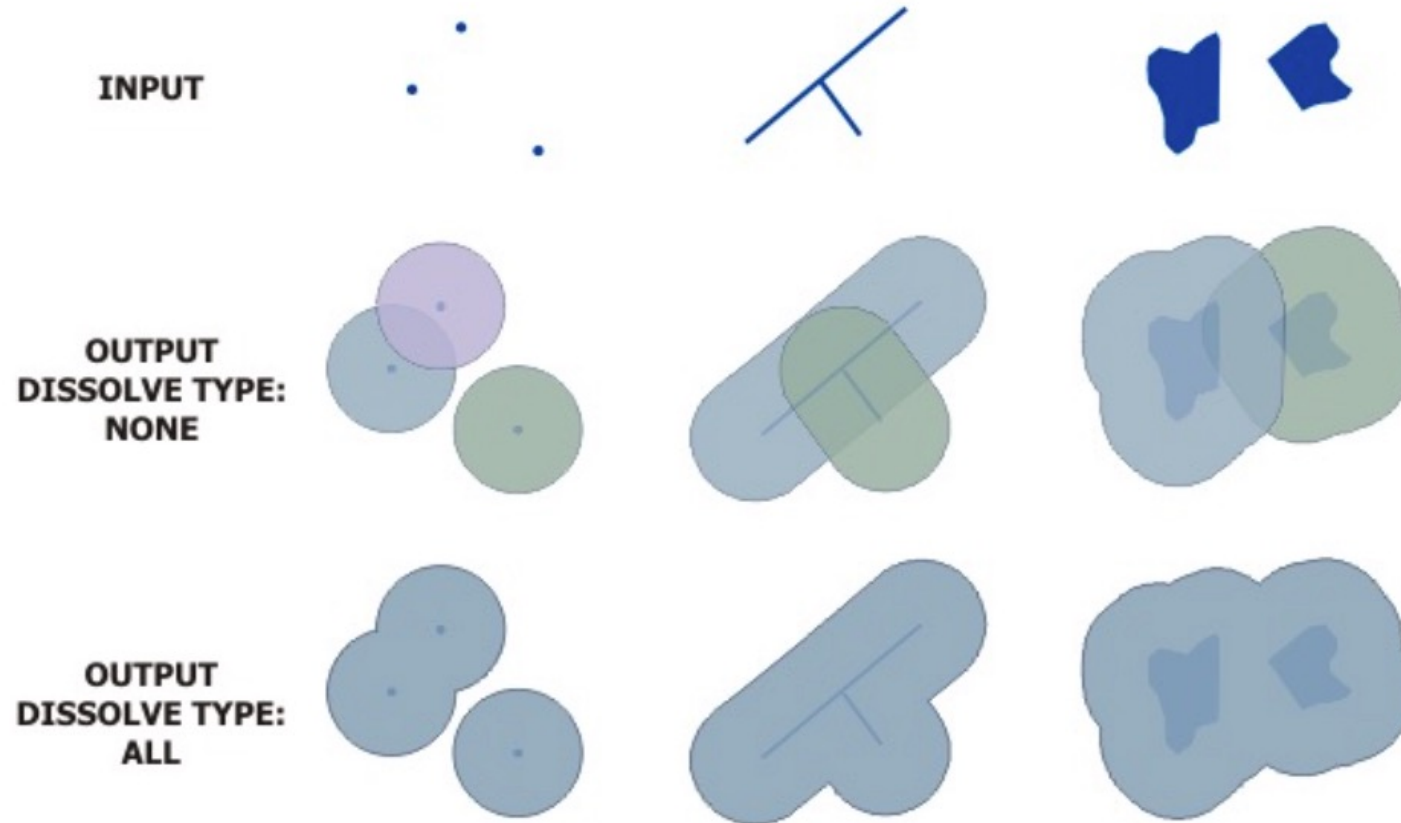
Regions (vector)



By aggregating (and summing) the gridded values within any of these vector shapefile, it will produce another shapefile containing the estimated total population within such boundaries

Buffering

Is an area, created by a specified distance, used to surround one or more features



Source: ESRI (2021). Buffer. <https://pro.arcgis.com/en/pro-app/latest/tool-reference/analysis/buffer.htm>

This type of spatial operation can be applied to the following:

- You can create buffers using any type of vector data (i.e., points, lines and polygons)
- Buffers is a spatial operation reserved for vector only. This cannot be applied to raster data unless it's vectorised to a form that is incredibly manageable for applying a buffer.

Definition: Geoprocessing is a collection of tools that offers a framework for dealing with geographic data

- Its purpose is to help users in the data management and automation of GIS tasks for spatial data.
- For performing geospatial modelling and analysis of vector and raster data.

In terms of spatial operations, the most problem you will encounter are:

- 1. Clipping**
- 2. Intersection**
- 3. Union**
- 4. Dissolving**
- 5. Aggregation**
- 6. Buffer**

Other types of spatial operations not covered here (but will see frequently in the practicals!)

- Spatial transforms of coordinates (reprojecting etc.)
- Coordinate systems and projections
- Distances

(See video within week 2's tutorials)

Thematic Mapping & Issues

Definition:

Thematic maps are graphical outputs that typically show geographic patterns of a particular theme in a geographic area

There are several types of thematic maps – the most common maps you will encounter are:

- 1. Choropleths (e.g., Dot, Lines and Dasymetric maps)**
- 2. Proportional point symbol maps**
- 3. Raster maps**

Choropleth Map:

This type of map uses various colour schemes to represent aggregated values (i.e., sum, mean, and some other statistic) of an attribute within a predefined feature (i.e., points, lines or polygons)

- The key characteristics about Choropleths are the shading to show data on a map:
 - **Intensity of colours** – darker the colour (e.g., deep reds) may represent a higher value and the lighter colour (e.g., brighter reds) is vice versa
 - **Divergent colours** – it is best to represent two extremes e.g., deprivation map of London.
 - **Random colours** – it is best to use them for categorical variable whose categories have no order (e.g., urban rural classification, land use type etc.)

Choropleths are great to use as they are easy to read and visually Impressive... but they come with their own issues thought!

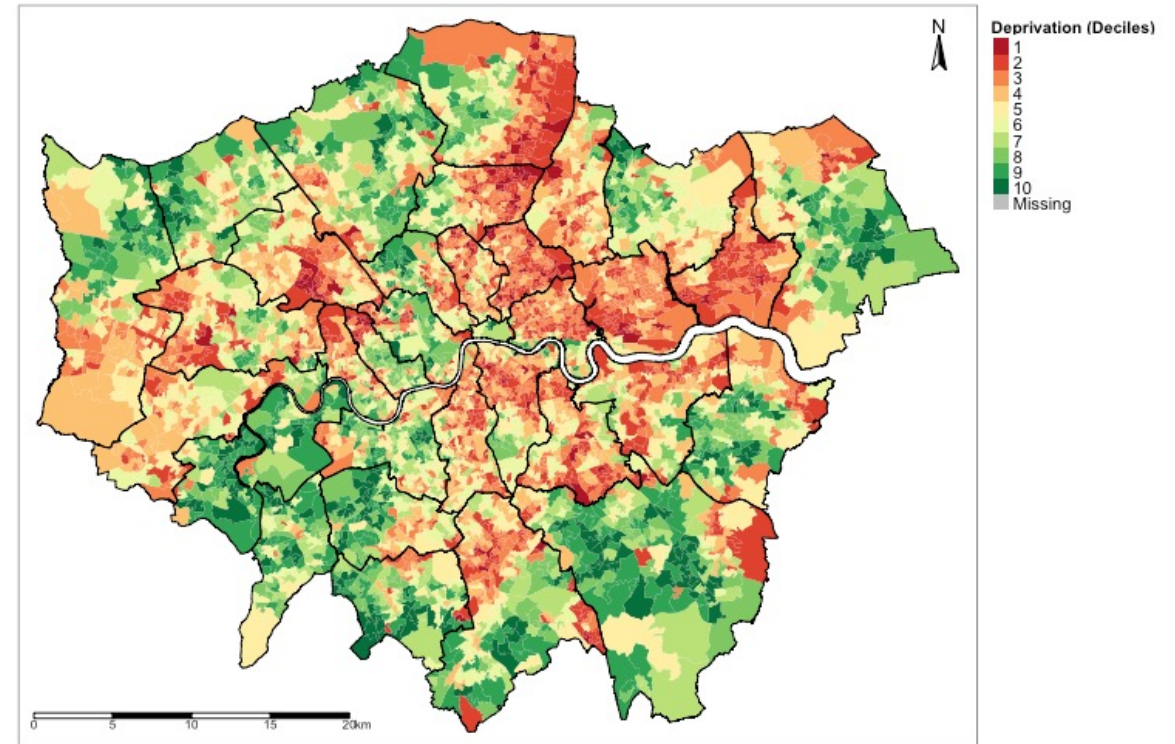
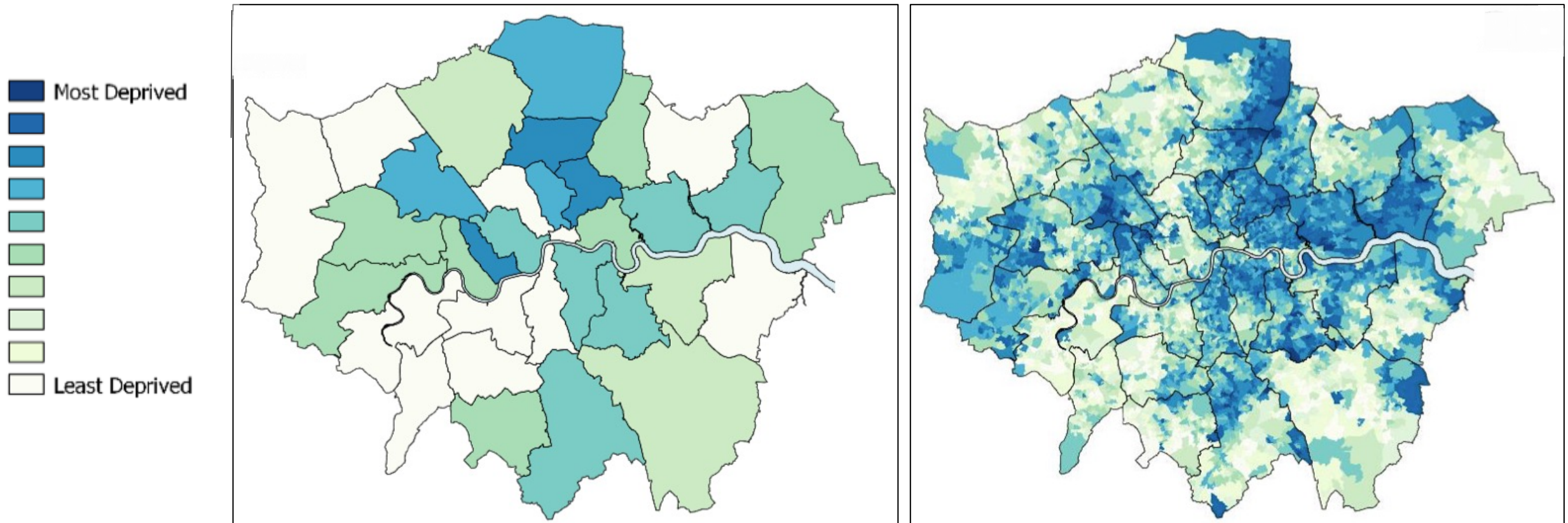


Image: We have generated a choropleth before in Week 1's practical. A map showing distribution of deprivation in London

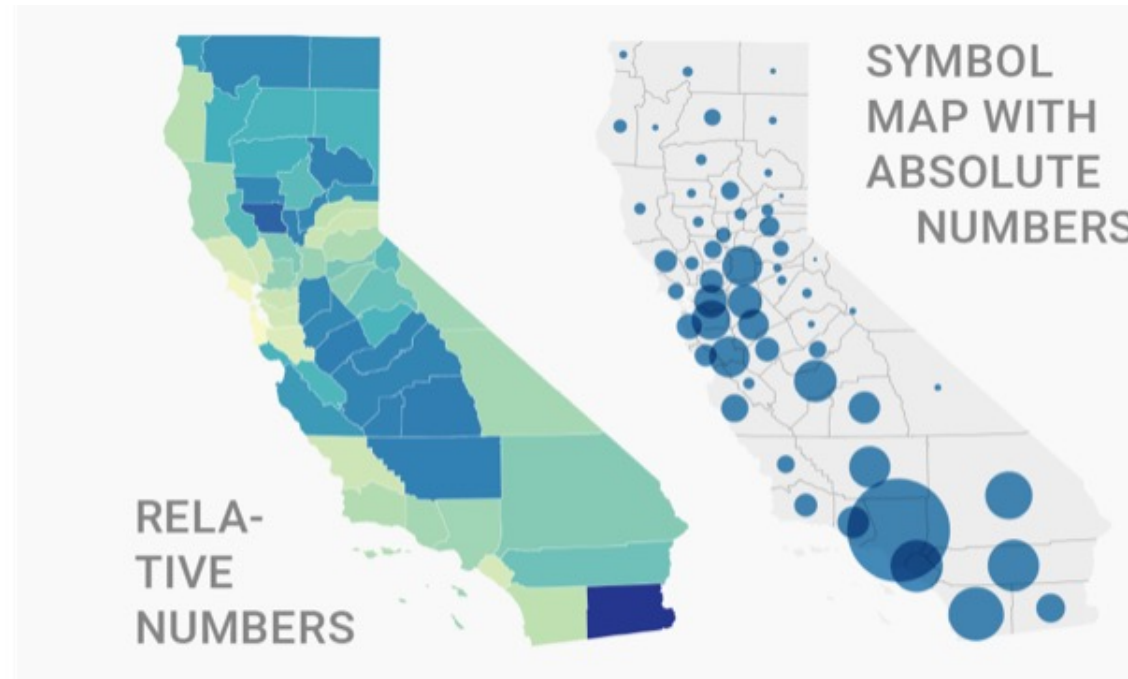


The two maps show the same thing – the one on the left shows levels of Deprivation based on the boroughs of London. While the one on the right shows it at a much higher resolution at a Lower Super Output Area level.

Problems:

1. The left map assumes the **whole area has the same value** – so it does not allow for variation within an area. We can see that this is not true because the right shows significant variation within an area.
2. The left map shows changes from one borough to another are **very abrupt** – which should not be the case. The variation from least to most deprived should be gradual (i.e., can be clearly seen on right map)
3. **Ecological Fallacy bias** is so pronounced in the left map.

The map on the right is a far better Choropleth – this is an example of **Dasymetric Map (more revealing)**



More Problems with Choropleth:

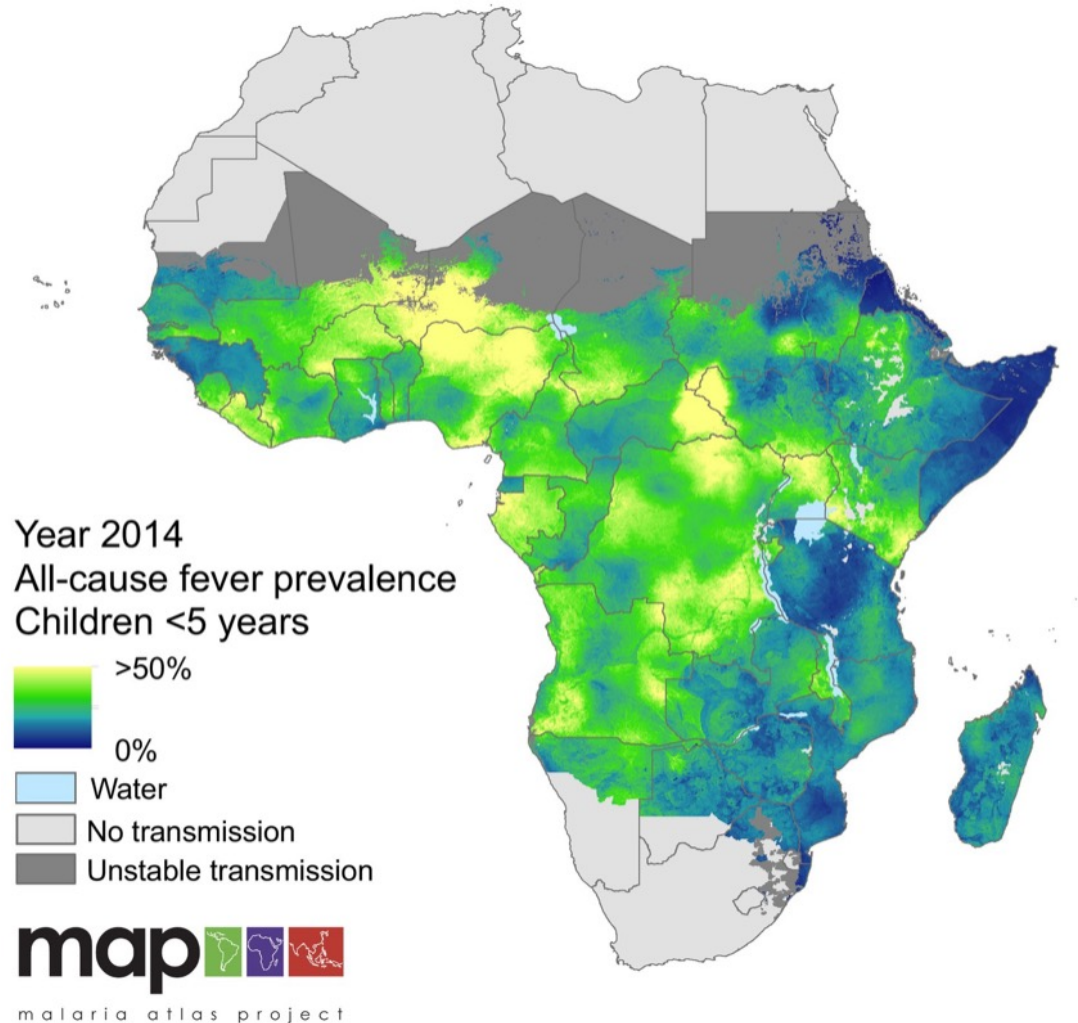
1. The far-left map uses **raw (or absolute) numbers** (i.e., number of people unemployed in counties in California). This is not an ideal way for visualizing such data because there is **no way** for us to compare difference across counties without knowing their population sizes. They are best visualized with **relative numbers** (i.e., unemployment rate or proportion) (middle map).
2. If you got to map absolute data – because the denominators are unavailable – then use symbols whose sizes are proportional to the absolute value (i.e., far-right map)

The map on the far-right is a far better Choropleth for absolute values – that example is called **Proportional Point Symbol Map**

Raster Map:

Spatial resolution matters with raster data!

- Problems:
 - Re-analysis of the same data but at different pixel size can yield wildly different results which is annoying
 - Unlike vector data, which are series of vector layers can be easily overlaid spatial joining etc., Raster are difficult to achieve this (i.e., align one raster with another) if again, pixel sizes are different.
 - Incredibly difficult to work with – especially if they are in a high-dimensional format e.g., NetCDF
 - Depending on the number of pixels and amount of data stored in them – a single raster file can consume a lot of storage space on a PC.
 - Performing geostatistical modelling and generating raster at a high-resolution can be time consuming and cost-prohibitive for your PC.



Summary

The take home message is:

- Vector and Raster data, are the two types of spatial data – the former maps out discrete entities and the latter visualizes entities over a continuous surface.
- Features are entities visualized on a map output, the attribute is a quantitative or qualitative description of that feature.
- Vectors are points, lines and polygon. A raster is a collection of pixels.
- Types of spatial operation
- Both types of outputs provide valuable information, but we should be aware of certain limitations for example – vector-based choropleths can result in a severe form of bias known as Ecological Fallacy
- Raster outputs on the other hand are dependent pixel size. Two can use the same data and yield different results due to this artefact.

Any questions?

