

# **MINING SPATIAL DATA**

**STQD6414 PERLOMBONGAN DATA**



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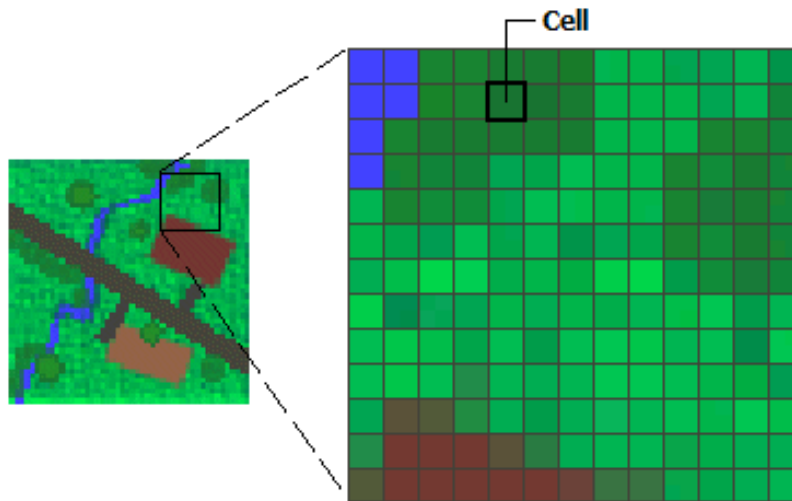
# INTRODUCTION:

- Spatial data is a data that involves space, location and geography.
- Spatial data includes "spatial objects" or "spatial fields".
  - i) **Spatial Objects:** objects with a borders. **Example:** river, road, country, city, etc.
  - ii) **Spatial Field:** objects with no border. **Example:** altitude, temperature, air quality, etc.
- Spatial objects are usually represented in the form of vector data.
- Vector data consists of information such as “geometry” or “shape” related to a location, as well as information about the variables to be analyzed.
- **Example:** a set of vector data might describe the information about the border of countries in the world altogether with information about population sizes.



# INTRODUCTION:

- While, spatial fields are commonly shown in a raster form.
- A raster consist a grid of equally sized rectangles (referred to as cells or pixels)
- Thus, raster data are determined based on the length and width of the image in units of pixels or the number of bits per pixel.
- Raster data is commonly used to represent spatially continuous phenomena such as elevation.

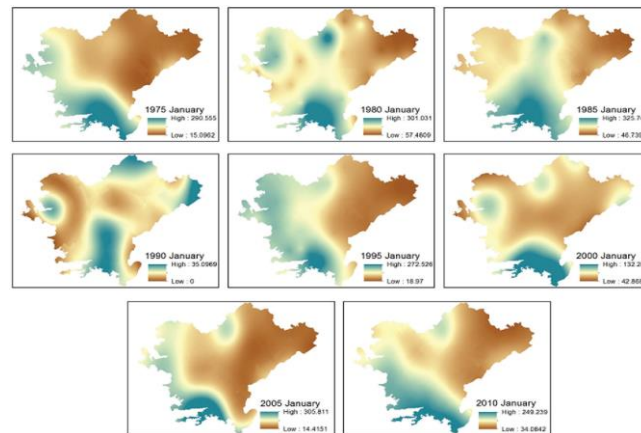


# APPLICATIONS OF SPATIAL ANALYSIS:

- There are various applications of spatial analysis involving meteorological data, earth science, image analysis and etc.
- If spatial data is collected together with time information, it is known as space-time (spatio-temporal).

## 1. Meteorological Data:

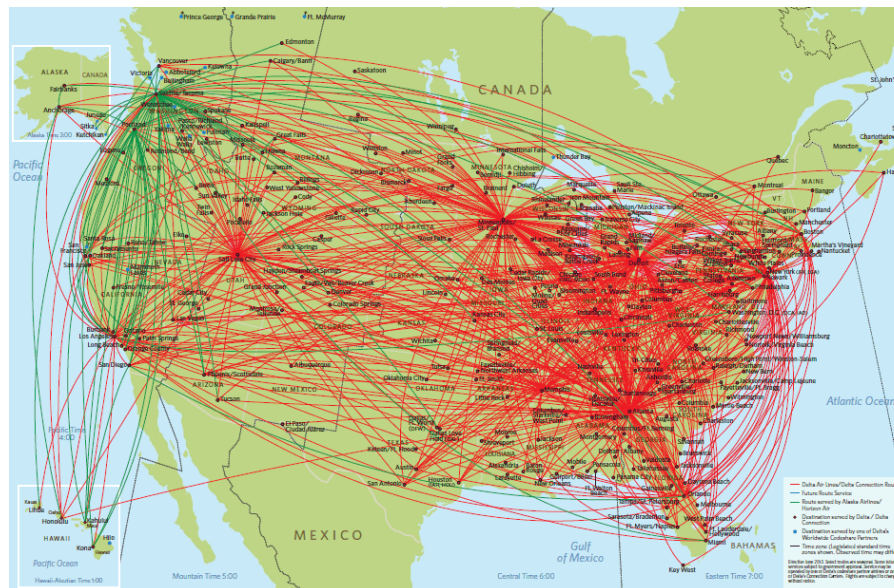
- Weather-related analysis, such as temperature, rainfall and pressure.
- Generally, this type of data is observed in different geographical locations.
- It needs to be analyzed simultaneously to extract useful information related to the country weather.



# APPLICATIONS OF SPATIAL ANALYSIS:

## 2. Moving Objects Data:

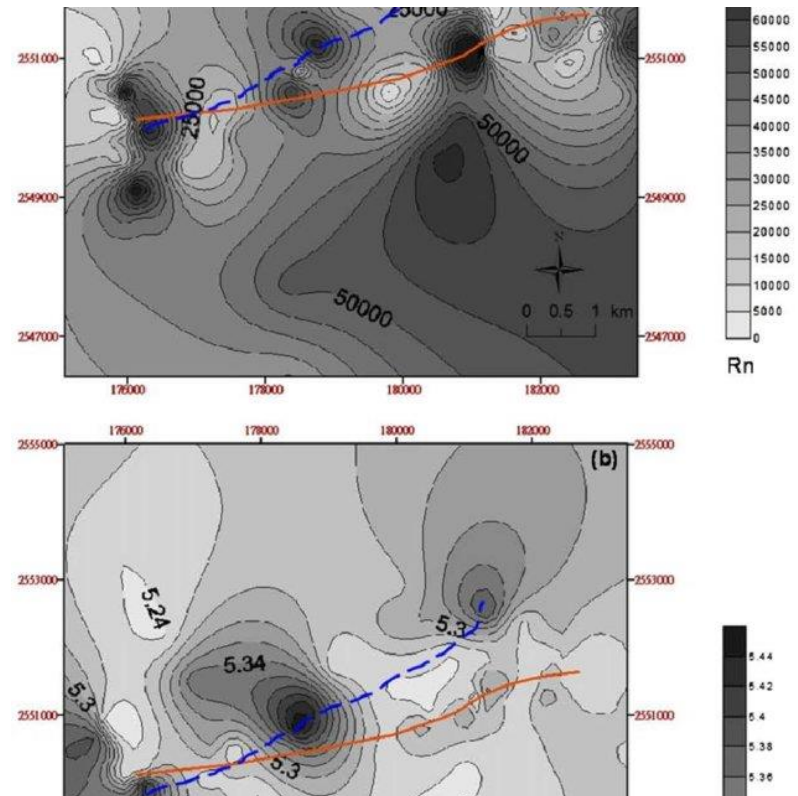
- Moving objects data can be obtained from trajectories path.
- **Example:** Flight trajectories, Waze, GPS and etc.
- These trajectories data can be analyzed to unearth information such as feature trends, or determining anomalous object paths.



# APPLICATIONS OF SPATIAL ANALYSIS:

## 3. Earth Science Data:

- Soils in different spatial locations indicate different properties.
- **Example:** land altitude, forest density, and etc.
- Anomalies in Earth Science data show anomalous trends in human activities.
- **Example:** deforestation activities, anomalous vegetation trends, and etc.

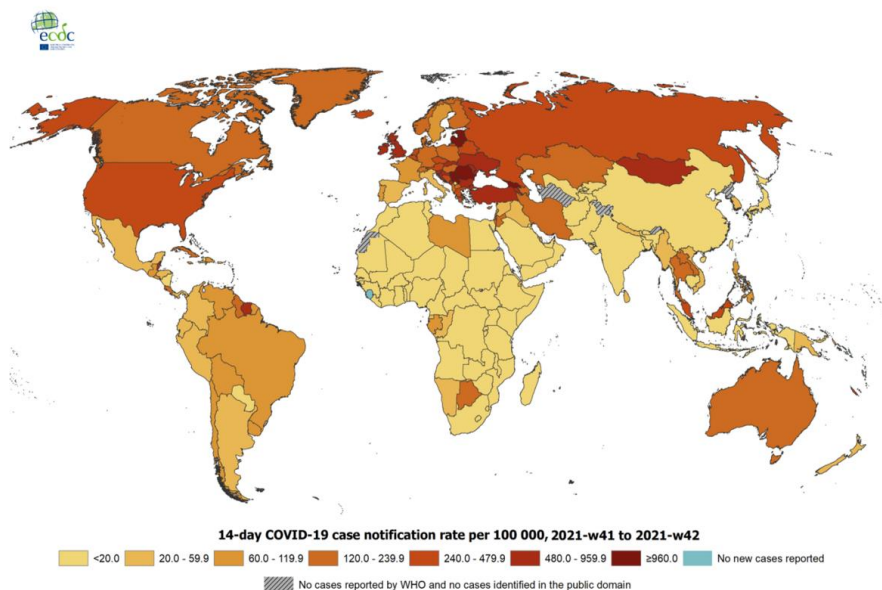




# APPLICATIONS OF SPATIAL ANALYSIS:

## 4. Disease Outbreak Data:

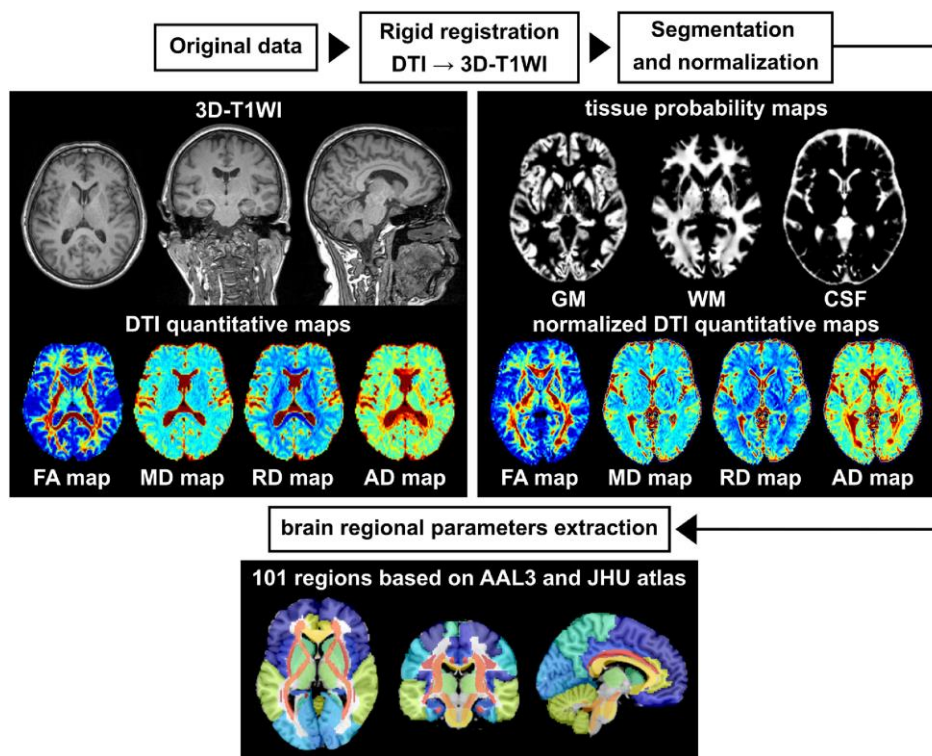
- Data on disease outbreaks is often aggregated by spatial location such as ZIP code, district and state.
- Analysis of trends in this kind of data provide information about the origins of the epidemic.
- Thus, it help the authorities in managing the risk in reducing the disease spreading.



# APPLICATIONS OF SPATIAL ANALYSIS :

## 5. Medical Diagnostics Data:

- Magnetic resonance imaging (MRI) data are spatial data in 2 or 3 dimensions.
- The detection of unusual anomalies in these data can be helpful in detecting diseases such as brain tumors, onset of Alzheimer's disease, etc.

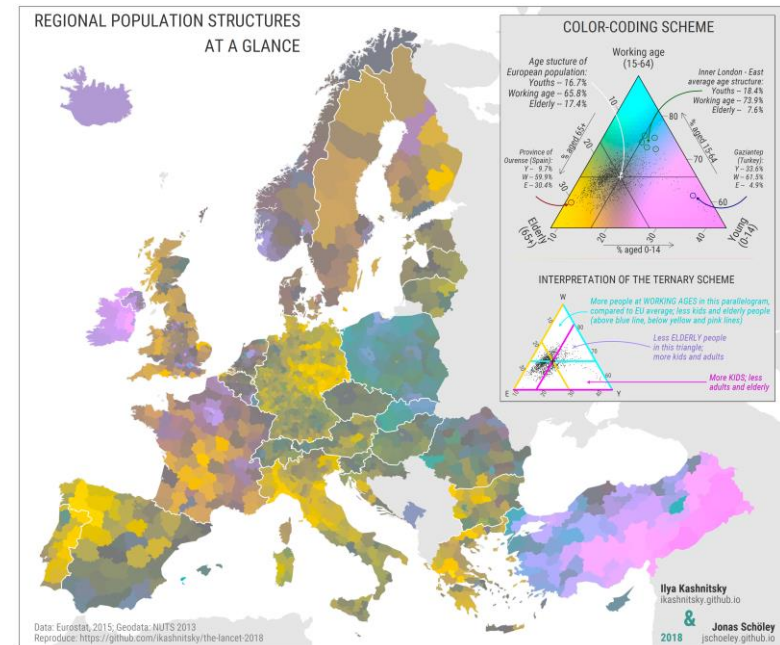




# APPLICATIONS OF SPATIAL ANALYSIS :

## 6. Demographic Data:

- Demographic attributes such as age, gender, race and salary correspond to their spatial attributes provide information about the distribution of demographic patterns.
- This information is important for the government to develop a reasonable policy.
- For business, this information is important for marketing and business planning.

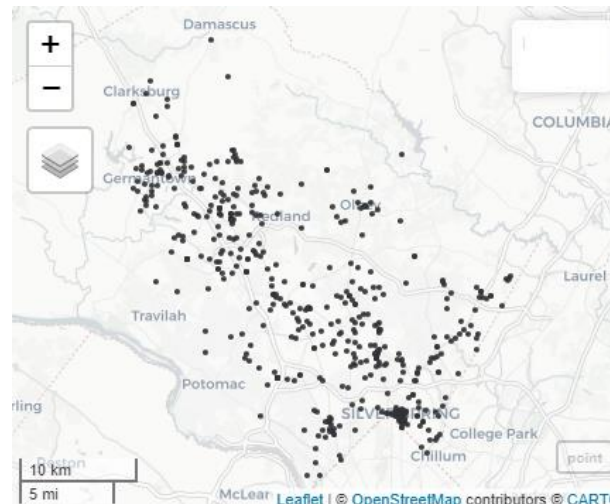


# SPATIAL DATA: VECTOR FORM

- There are three main types of vector data in spatial analysis.

## i) Point Data:

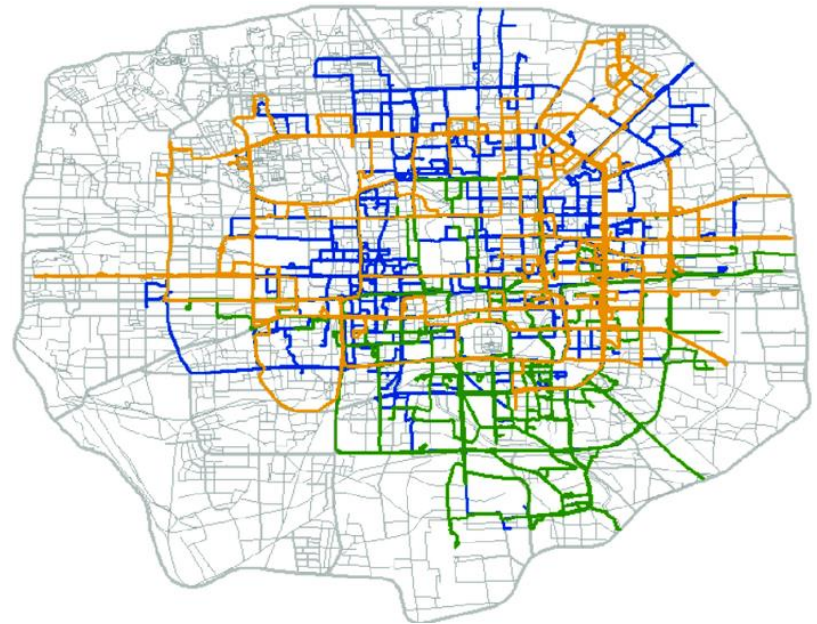
- Each point has a pair of coordinates, and their associated variables.
- Example:** a dot may represent a location where an outbreak cases was detected. Other characteristics may include; the date it was detected, the information about the patient, such as; gender, race, social status and etc.
- This data can also consist a combination of several points in a multi-point structure, with a single attribute record.
- Example:** all coffee shops in the city will be considered a combination of several points.



# SPATIAL DATA: VECTOR FORM

## ii) Lines Data:

- Lines data refer to one or more poly-lines or connected line segments.
- **Example:** rivers, roads and all tributaries are lines.
- Lines are shown as ordered sets of coordinates (nodes).
- Actual line segments can be determined and drawn on a map by connecting the dots.



# SPATIAL DATA: VECTOR FORM

## iii) Polygon data:

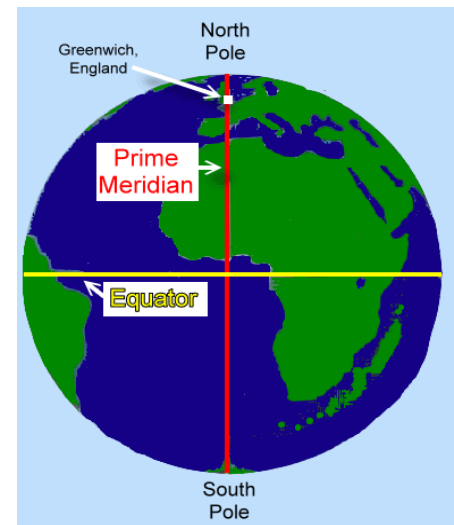
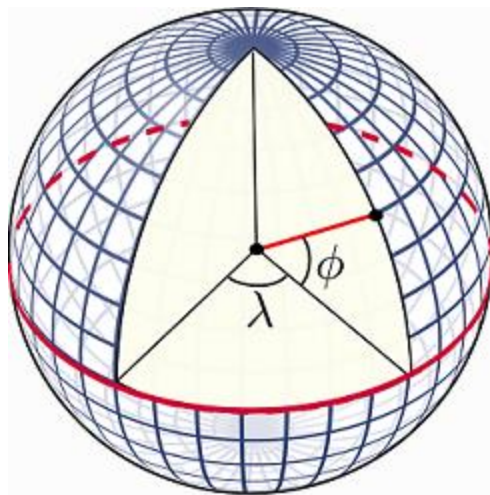
- Polygons refer to sets of closed polylines.
- The last pair of coordinates is equal to their the first pair of coordinates.
- Several polygons can be combined in a single geometry.
- **Example:** Malaysia is form by a combination of several states.



# COORDINATE REFERENCE SYSTEMS(CRS):

## i) Angular and Planar Coordinates:

- The CRS for geographic data is referred to longitude and latitude system.
- This CRS is known as the Angular system.
- Latitude is determined by the angle between the equatorial line and the perpendicular line that passes through a point from the center of the Earth.
- Longitude is the angle from the reference meridian line to the meridian line for the location.



# COORDINATE REFERENCE SYSTEMS(CRS):

- The determination of the coordinates is made through the pair of angles and also the reference datum (model for the shape of the earth).
- The most commonly used datum is type WGS84 (World Geodesic System 1984).
- Projections for a 3-dimensional to 2-dimensional Angular System are referred to as planar systems ("Cartesian").

## ii) Notation:

- The CRS planar system is defined from projection information, datum and some set of parameters.
- In R, commonly the notation of PROJ.4 is used of vector data and the notation of utm is used of raster data.





# SPATIAL VECTOR DATA IN R:

- In R software, the `sp` class indicates a spatial data object.
- Among the important packages are `sp`, `raster`, `spatial`, `rgdal`, and many more.
- The three basic forms of spatial vector data in R are:
  - i) `SpatialPoints`
  - ii) `SpatialLines`
  - iii) `SpatialPolygons`
- On these basic of vector data, the value of new attributes can be added.

## Example:

- `SpatialPointsDataFrame` and `SpatialPolygonsDataFrame`



# SPATIAL RASTER DATA IN R:

- The three basic forms of Raster data in R are RasterLayer, RasterBrick, RasterStack.

## i) RasterLayer:

- RasterLayer objects represent single-layer raster data.
- It describes basic parameters of raster data such as the number of columns, rows and the Coordinate Reference System (CRS).
- Attribute-related information can also be stored in the RasterLayer.

## ii) RasterStack and RasterBrick:

- RasterStack and RasterBrick can be used to form a raster data from multi layers of data.



# DATA MANIPULATION FOR SPATIAL VECTOR:

- Data manipulation is the process of converting data into a more organized form.
- The process depends on the objectives of the analysis.
- Some spatial vector data manipulation techniques:
  - i) Presenting spatial data as a data.frame format.
  - ii) Extract specific attributes.
  - iii) Add new attribute information.
  - iv) Delete any attribute.
  - v) Data integration.
  - vi) Select a subset of data.
  - vii) Data Aggregation.
  - viii) Map Manipulation.
  - ix) And many more.



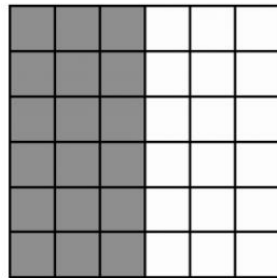
# DATA MANIPULATION FOR SPATIAL RASTER:

- Some techniques for raster data manipulation:
  - i) Extracts a single RasterLayer object from a RasterBrick or RasterStack object.
  - ii) Algebra in raster data.
  - iii) Add new values in the cell.
  - iv) Add new attribute information.
  - v) Crop and merge raster data.
  - vi) Descriptive functions.
  - vii) And many more.

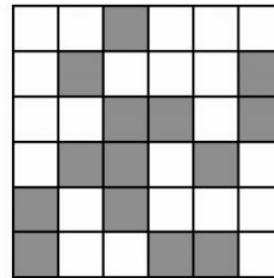


# SPATIAL AUTOCORRELATION:

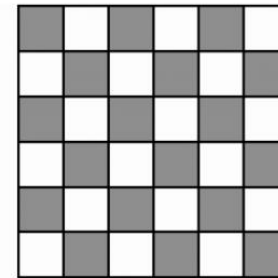
- Spatial autocorrelation is a measure of similarity between nearby observations.
- A positive spatial autocorrelation value indicates that a nearby observations have similar properties and vice versa for a negative value.
- A commonly used statistics that measure spatial autocorrelation are:
  - i) Moran's-I statistic.
  - ii) Geary's-C statistic (for binary data).
  - iii) Semi-variogram.



Positive spatial  
autocorrelation



No spatial  
autocorrelation

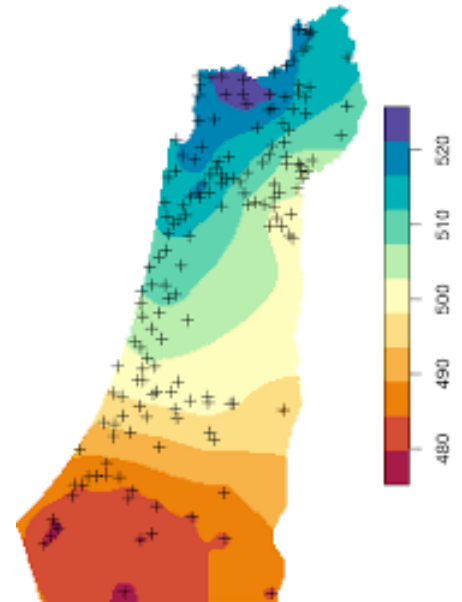


Negative spatial  
autocorrelation



# SPATIAL INTERPOLATION:

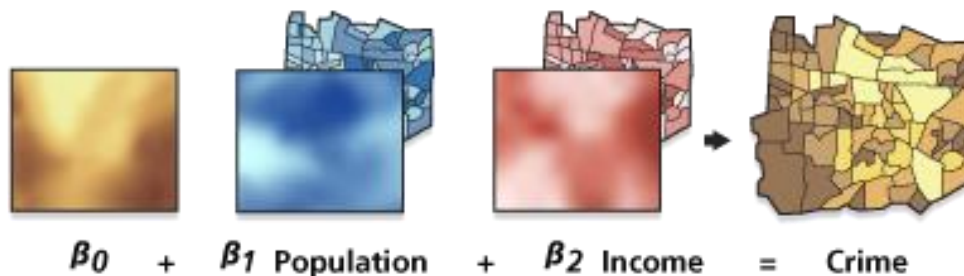
- This technique is useful to predict values at locations where no measurements have been made.
- Based on spatial autocorrelation, values in nearby locations tend to be similar.
- **Example:** Spatial interpolation can estimate the temperatures at locations without recorded data by using known temperature readings at nearby weather stations.
- Among the methods of spatial interpolation:
  - i) Proximity polygons.
  - ii) Nearest neighbour interpolation.
  - iii) Inverse distance weighted.
  - iv) Kriging.





# LOCAL SPATIAL REGRESSION:

- In spatial context, local refer to location.
- Instead of fitting single regression model to spatial data, it is better to fit several regression models with each one referring to a specific location.
- This technique known as geographically weighted regression, (GWR).
- GWR takes into account non-stationary variables (Example: demographic factors; characteristics of the physical environment) and models the local relationship between the predictor variable and the response variable.
- GWR is a technique that is used to get an insight about the changes in importance of different variables over space.



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**NEXT TOPIC:**

# **Mining Graph Data**

