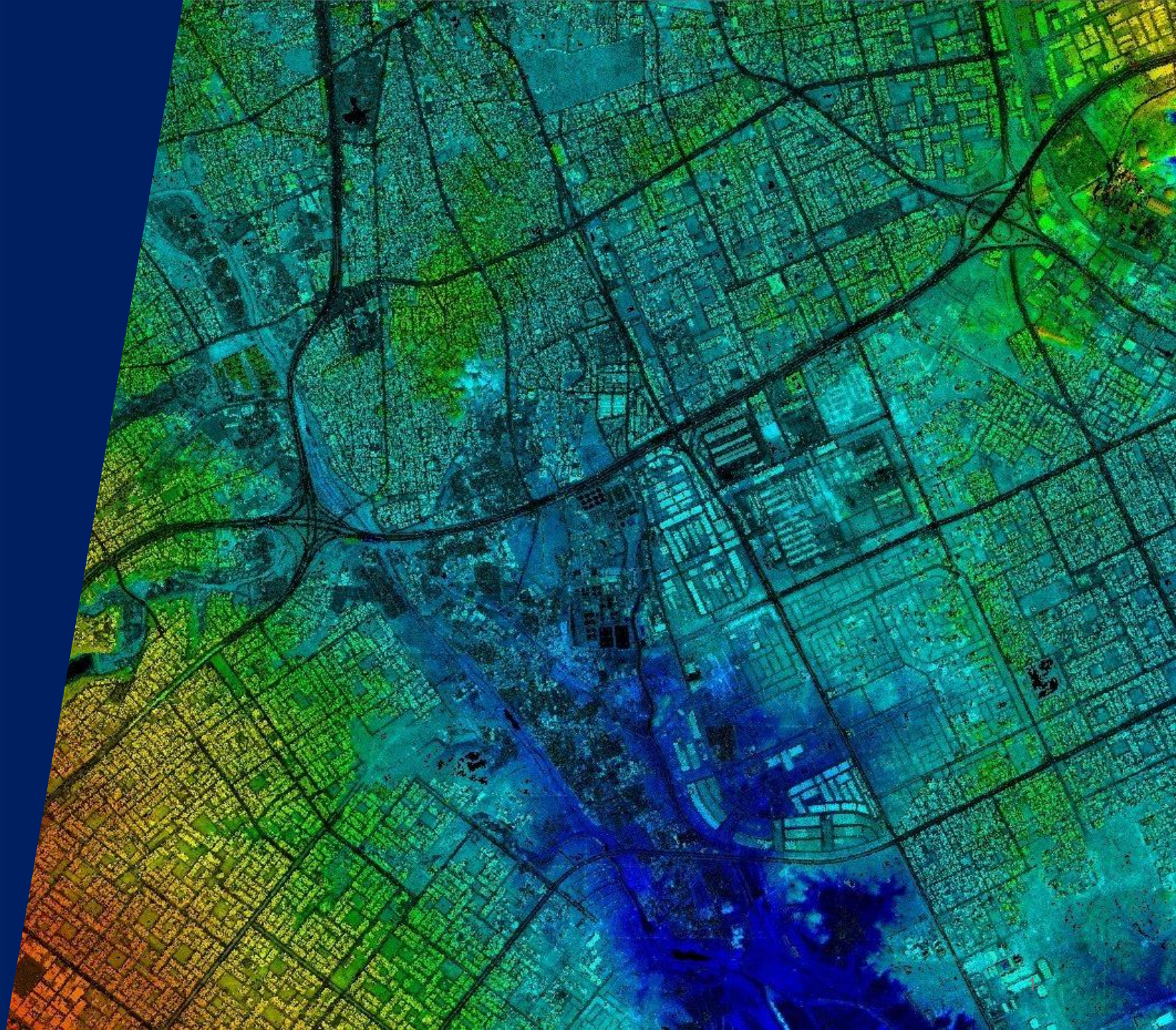




SAINT LOUIS
UNIVERSITY.

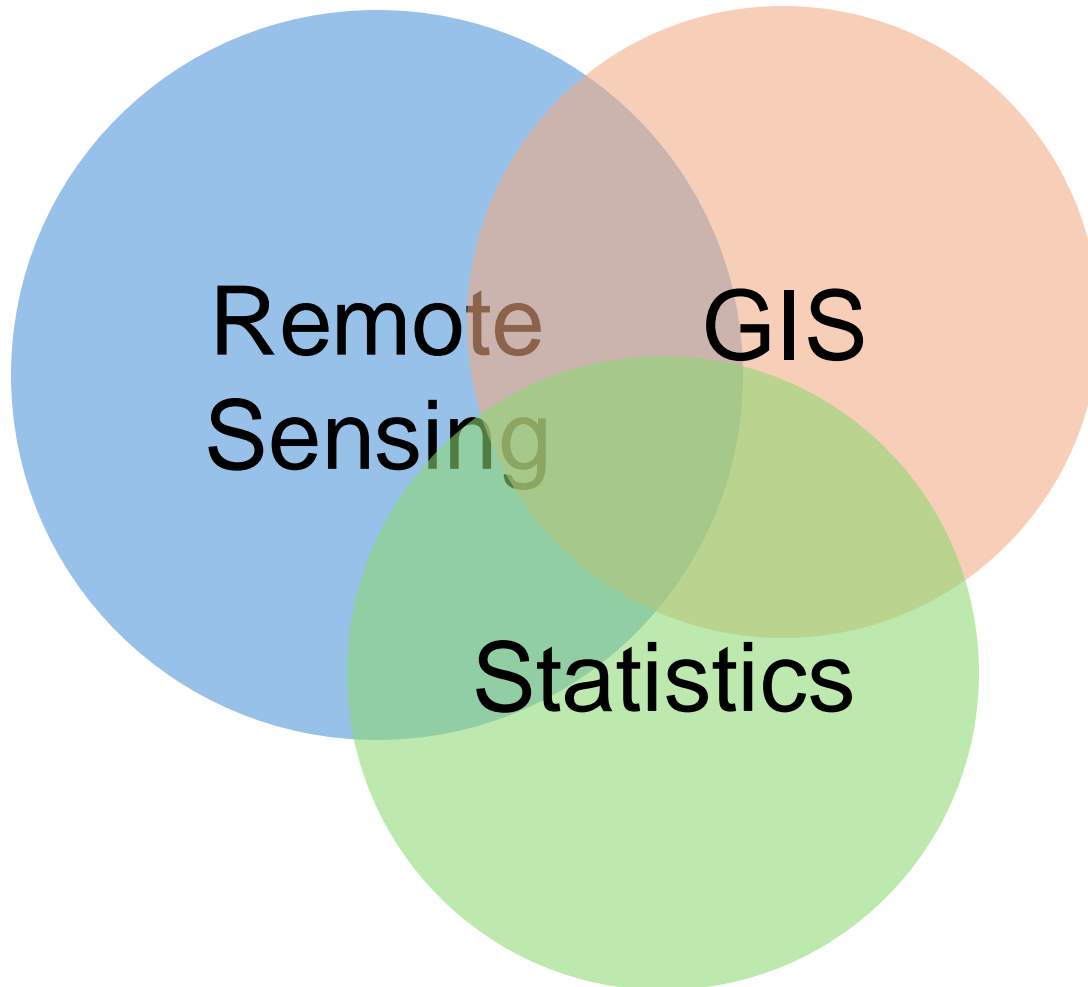
Conceptual Frameworks of Geospatial Analysis

Sourav Bhadra, Ph. D.





So, what is Geospatial Analytics?



- Spatial Modeling
- Geocomputation
- Data Visualization
- Big Data
- Geographic Patterns
- Spatial Relationship
- Environmental Modeling
- Machine Learning



GIS is integral part of Geospatial Analytics

Data



Methods



Software



People



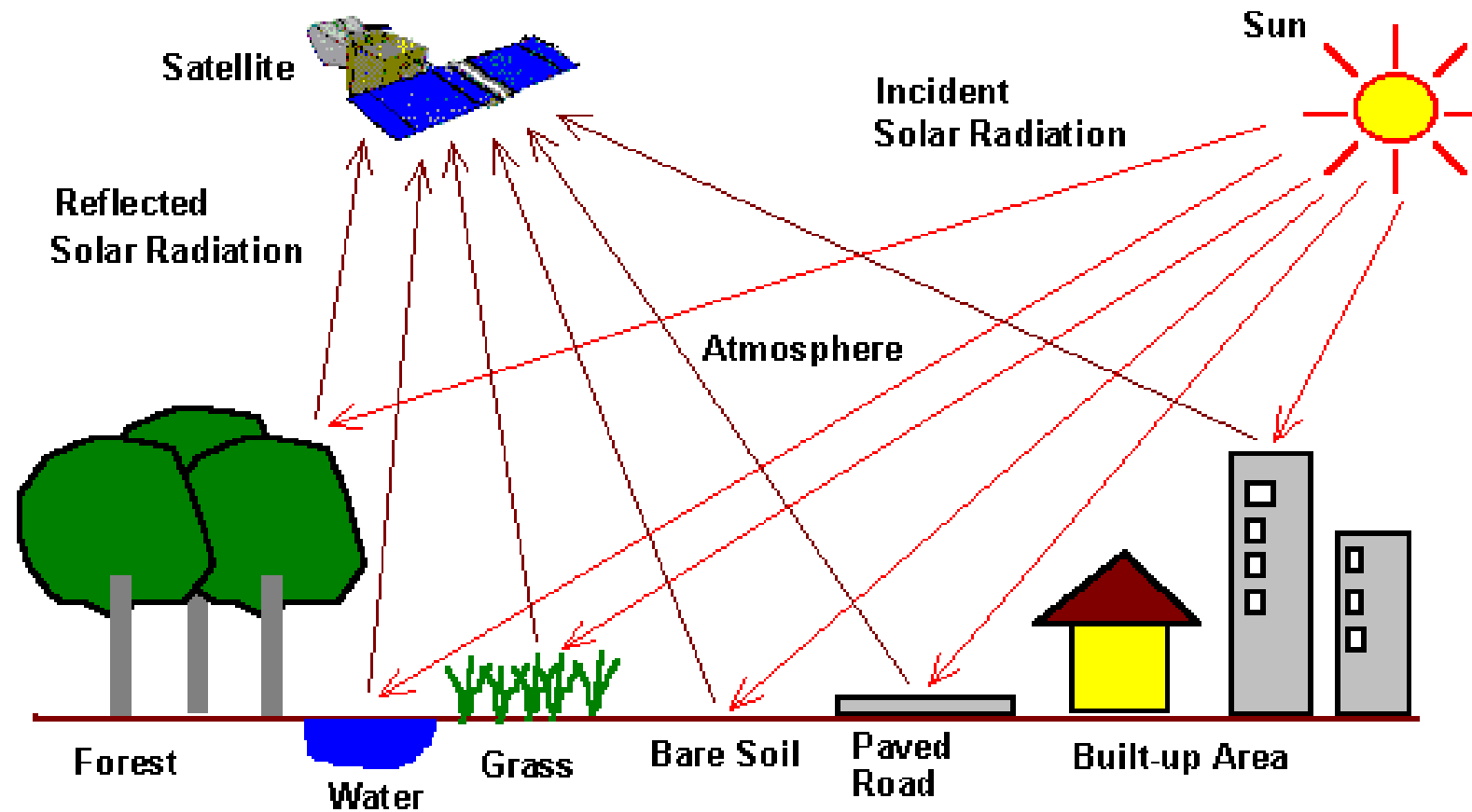
Hardware



[Source](#)



Remote Sensing is another component



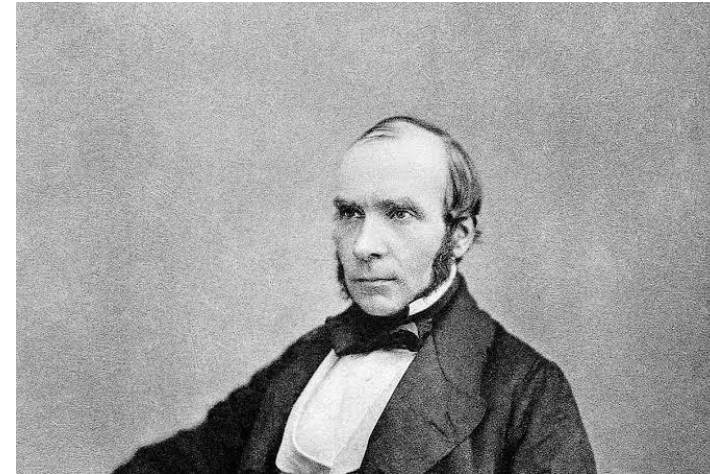
[Source](#)



Spatial Statistics is the backbone of the analysis



[Source](#)



Dr. John Snow (1813 – 1858)

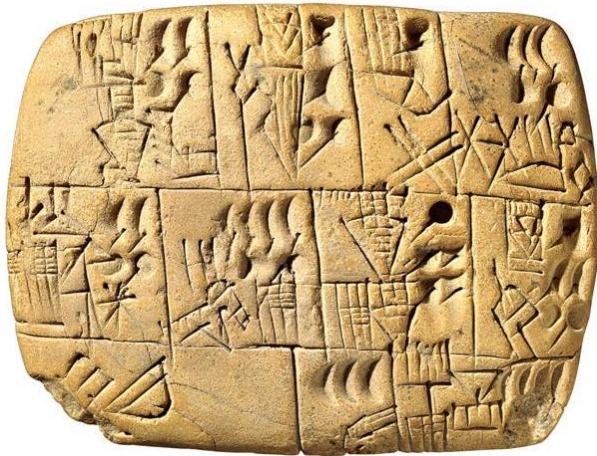
John Snow's cholera map was the first spatial analysis to reveal the correlation between cholera outbreaks and contaminated water sources by mapping the locations of deaths relative to water pumps in London.



What makes a “data” geospatial?



Abstraction of real-world relationship has been the backbone of mathematical representation



[Source](#)

Count the number of Bisons

12, 14, 15

Differentiate between # Bison
and weight of Meat

$x = \text{Bisons}, y = \text{Meat}$

Understand relationship
between Bison and Meat

$y = mx + c$

More complex relationship at
multiple dimensions

$ax^2 + bx + c = y$

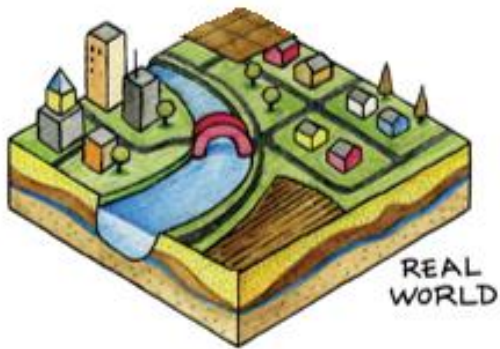
Efficient solution to represent
multiple equations

$\begin{bmatrix} 2 & -5 \\ 3 & 7 \end{bmatrix} = \begin{bmatrix} 3 \\ 7 \end{bmatrix}$

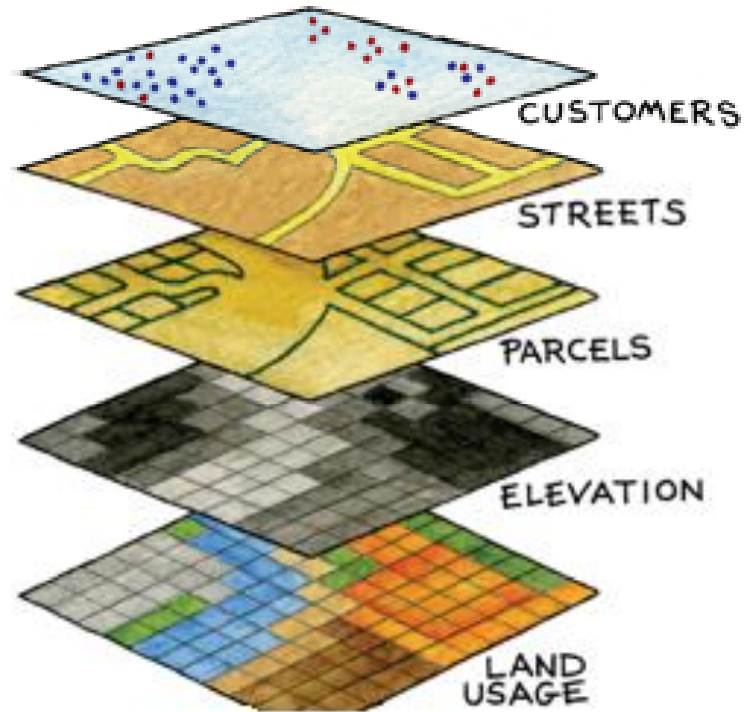


GIS recreates real world spatial data

Complex real data
without any inherent
meanings



Structured data
representing different
themes



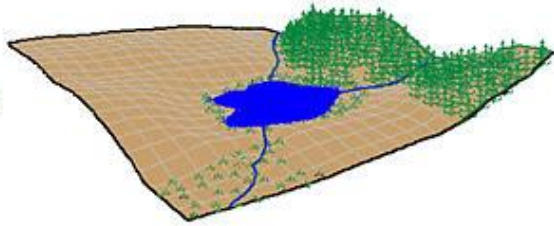
Specific information
generated from
analyzing the data





Two types of geospatial data

The Real World



Geospatial or coordinate data can be represented in two different data formats

Examples

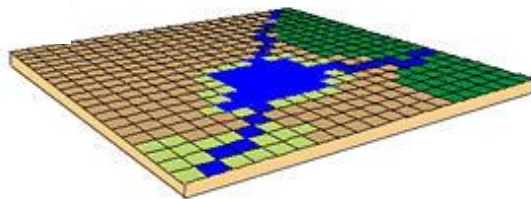
Vector Data



Vector:
e.g., points, lines, and polygons

School locations,
road networks

Raster Data



Raster:
e.g., row and column matrix

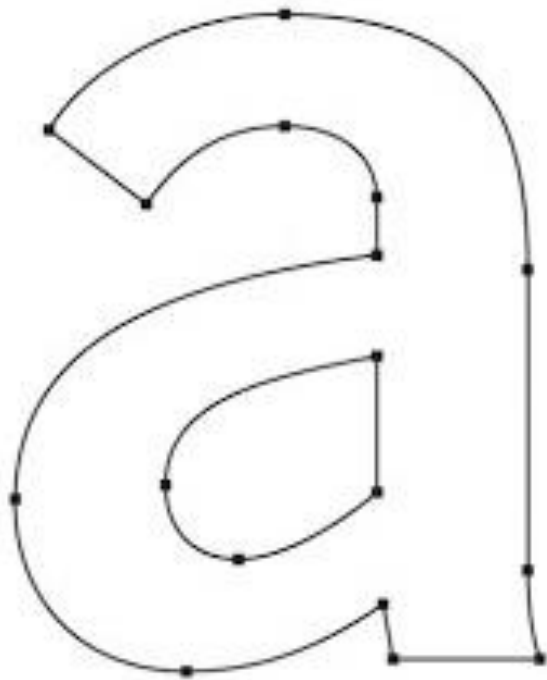
Land use land cover,
Digital Elevation
Model

Images © [University of Washington](#)



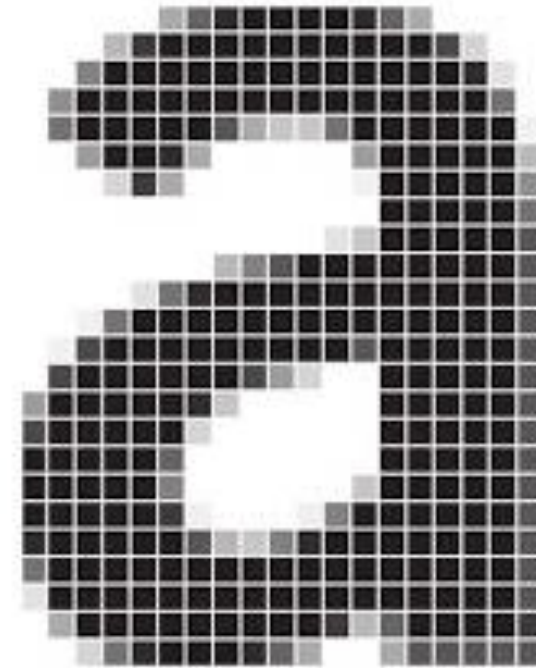
Vector vs Raster

Vector Model



Composed of coordinates

Raster Model



Composed of pixels

Image courtesy of [Zina Yonten](#)



Points, lines and polygons as vector

Points



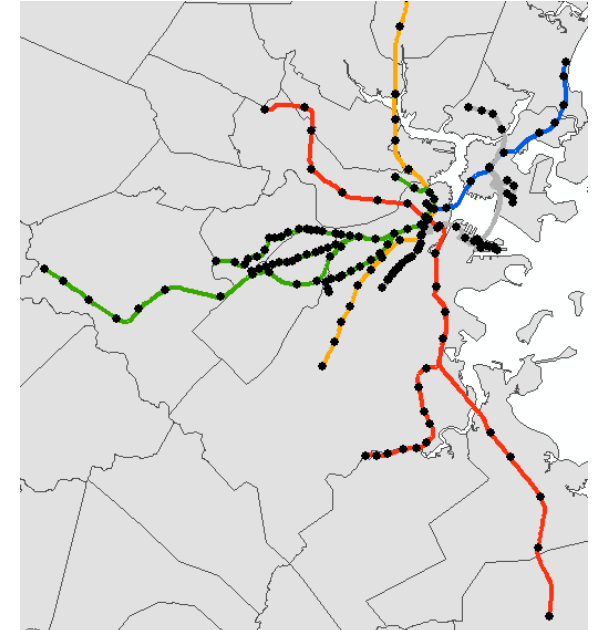
Lines



Polygons



Combined





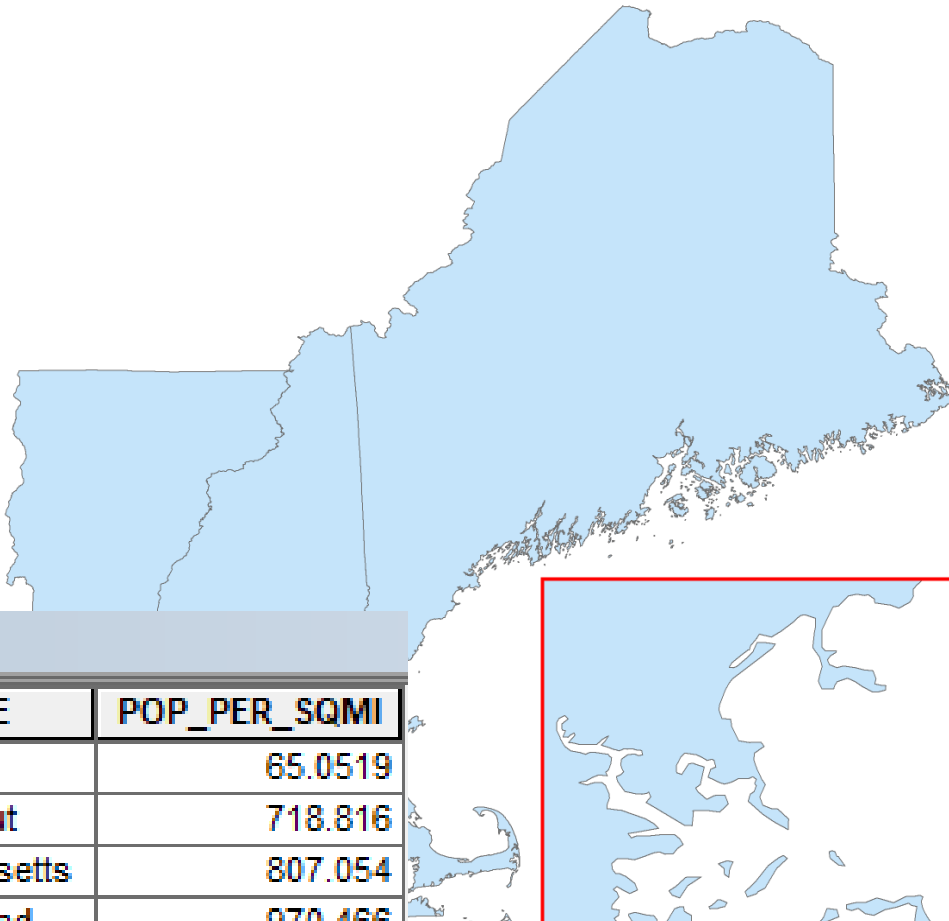
Vector data is represented in two fronts

Vectors have a **frontend geometry**

In this example the geometry represents state polygons

Vectors have a **backend database**, normally called an 'attribute table'

- **rows** represent unique geometries (e.g. state polygons)
- **columns** represent a number of variables (theoretically infinite)
- Here each row (state) is symbolized by 'NAME' (categorical variable)



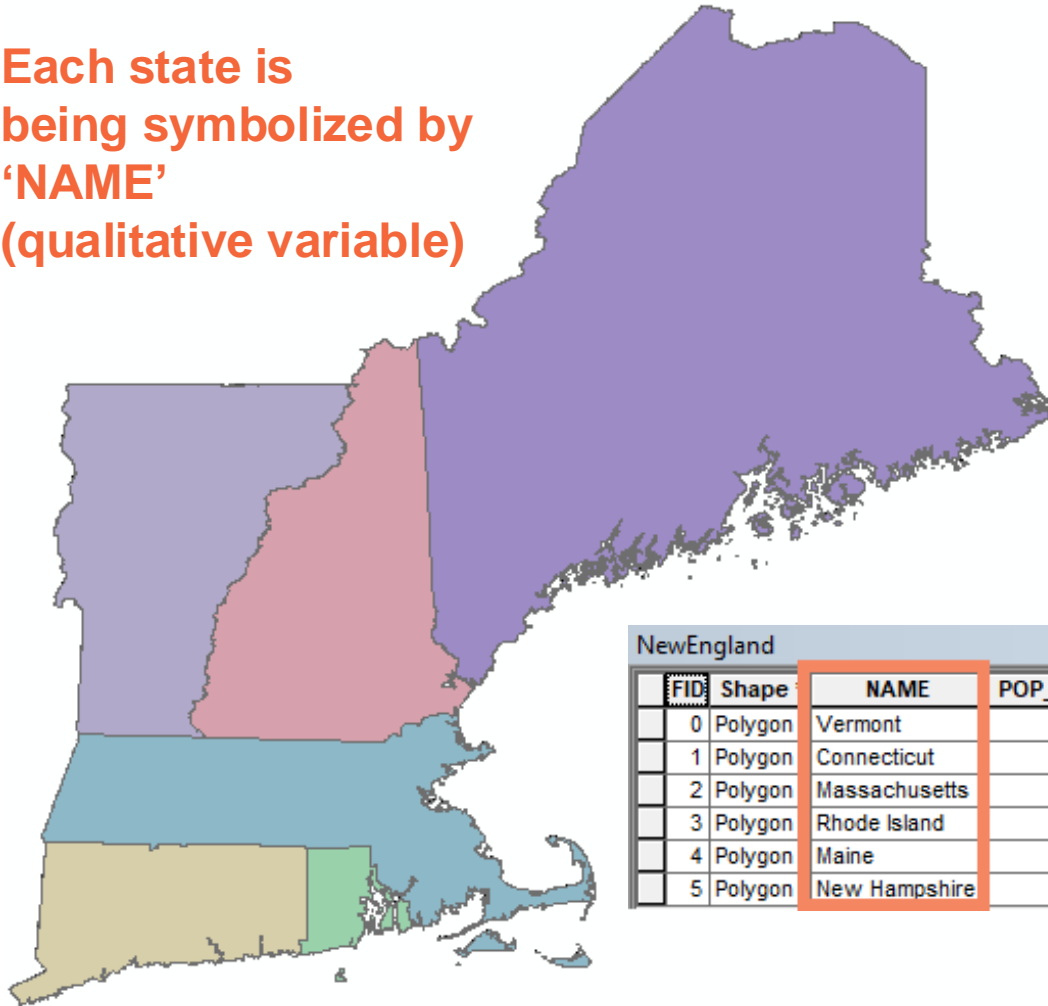
A map of the New England region showing the states of Vermont, Connecticut, Massachusetts, Rhode Island, Maine, and New Hampshire. The states are colored in light blue. A red rectangular box highlights the southern part of the region, specifically the states of Massachusetts, Rhode Island, and Connecticut.

	FID	Shape *	NAME	POP_PER_SQMI
	0	Polygon	Vermont	65.0519
	1	Polygon	Connecticut	718.816
	2	Polygon	Massachusetts	807.054
	3	Polygon	Rhode Island	970.466
	4	Polygon	Maine	40.891
	5	Polygon	New Hampshire	142.186



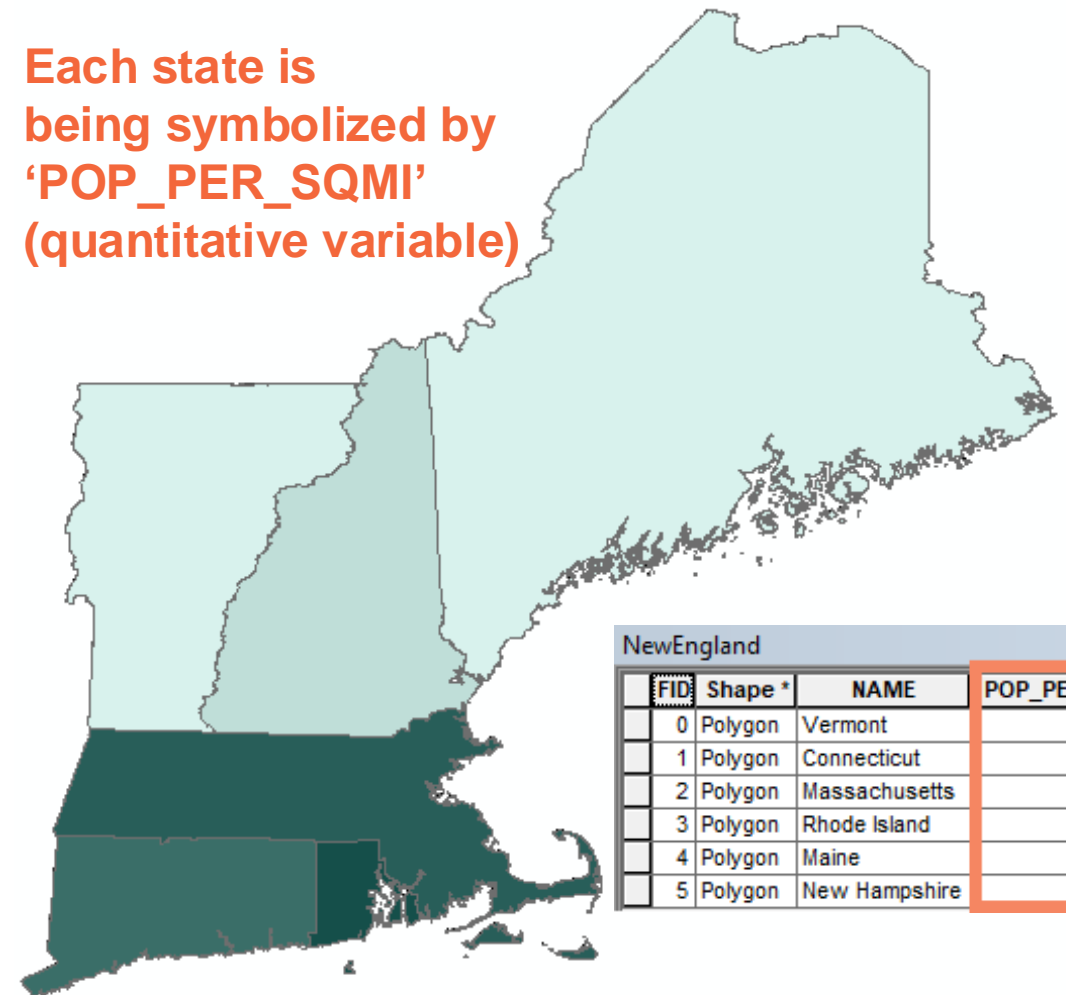
Vector data can be symbolized by different data

Each state is
being symbolized by
'NAME'
(qualitative variable)



NewEngland				
FID	Shape	NAME	POP_PER_SQMI	
0	Polygon	Vermont	65.0519	
1	Polygon	Connecticut	718.816	
2	Polygon	Massachusetts	807.054	
3	Polygon	Rhode Island	970.466	
4	Polygon	Maine	40.891	
5	Polygon	New Hampshire	142.186	

Each state is
being symbolized by
'POP_PER_SQMI'
(quantitative variable)



NewEngland				
FID	Shape *	NAME	POP_PER_SQMI	
0	Polygon	Vermont	65.0519	
1	Polygon	Connecticut	718.816	
2	Polygon	Massachusetts	807.054	
3	Polygon	Rhode Island	970.466	
4	Polygon	Maine	40.891	
5	Polygon	New Hampshire	142.186	



Different levels of measurement for attribute data

Categorical

Nominal

- Gender, ethnicity, eye color, blood type
- Land use, land cover

Ordinal

- Income level
- Customer ratings
- Political orientation

Numerical

Interval

- No true zero.
- Temperature in Fahrenheit or Celsius
 - Test scores

Ratio

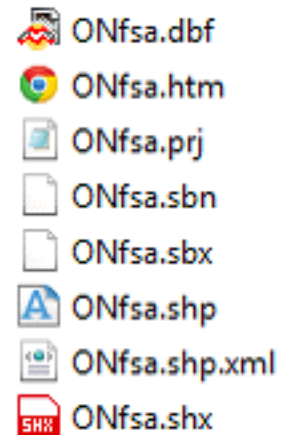
- Has true zero.
- Age
 - Height
 - Weight
 - Temperature in Kelvin



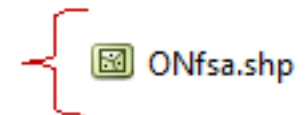
The most common vector data format is '.shp'

- “A” shapefile is a collection of several different files with different extensions
- Each file serves different purposes which in combine represent a vector data model
- The three required files are:
 - SHP** is the feature geometry.
 - SHX** is the shape index position.
 - DBF** is the attribute data.
- –**PRJ** is the projection system metadata.
- –**XML** is the associated metadata.
- –**SBN** is the spatial index for optimizing queries.
- –**SBX** optimizes loading times.

How a shapefile
looks in Windows
Explorer:



How a shapefile
looks in ArcMap:





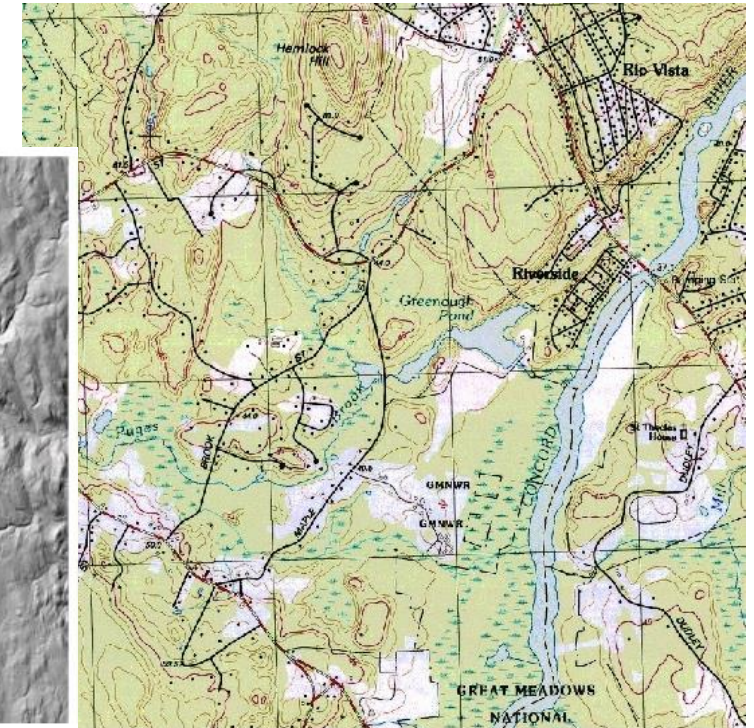
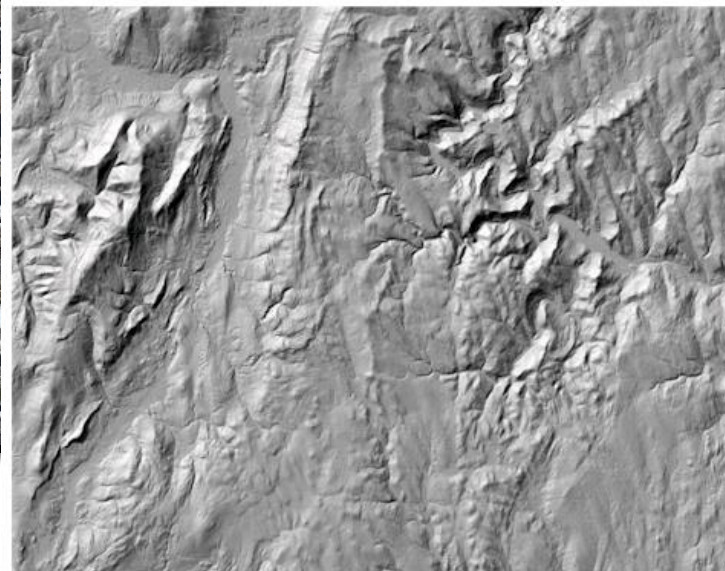
There are other popular vector data formats

- .GEOJSON: GeoJSON is a format for encoding geographic data structures, such as points, lines, and polygons, using JavaScript Object Notation (JSON)
- .GML: GML allows for the use of geographic coordinates extension of XML.
- .KML: KML stands for Keyhole Markup Language. This GIS format is XML-based and is primarily used for Google Earth.
- Learn more at: <https://gisgeography.com/gis-formats/>



Raster data model

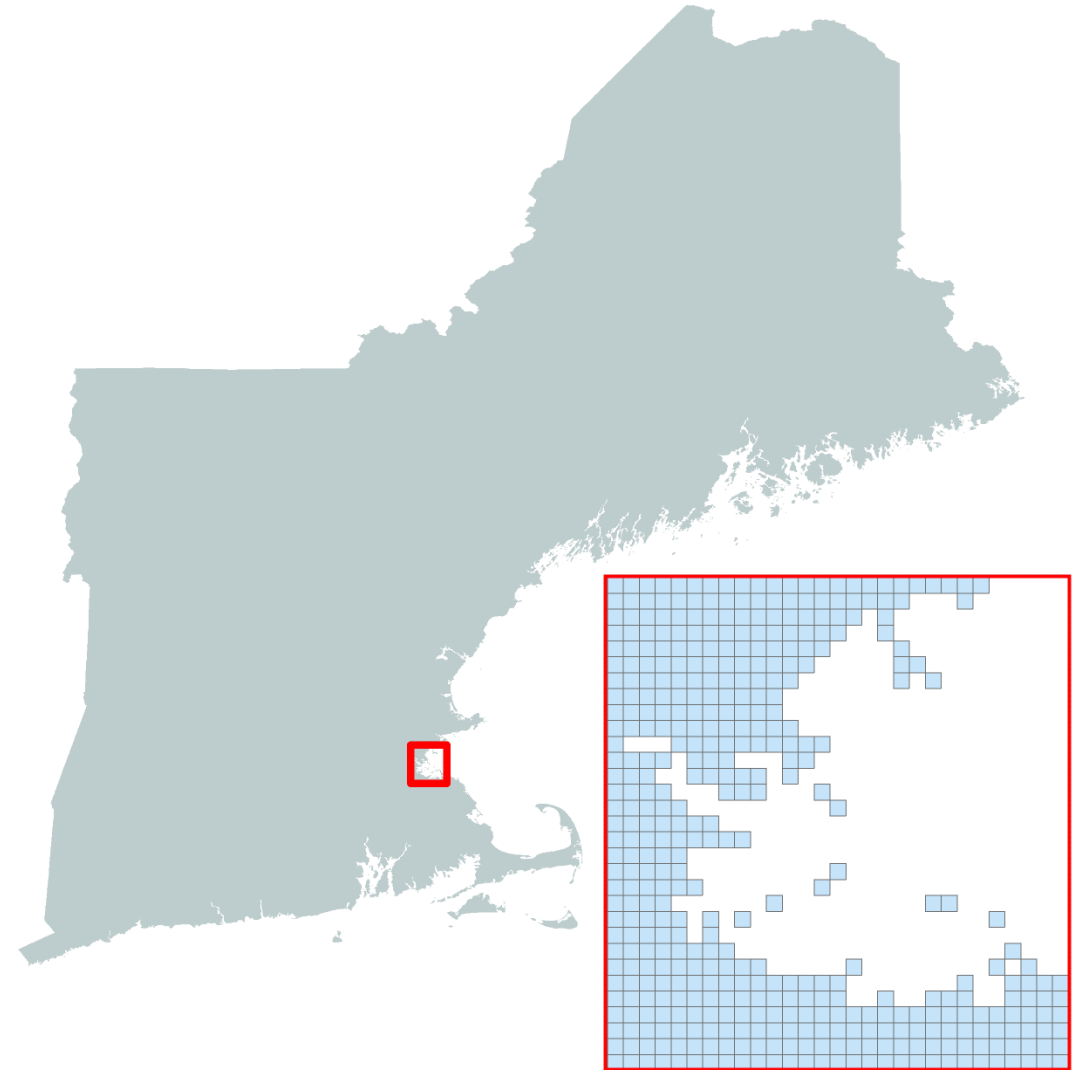
Raster data includes aerial photographs, digital elevation models, and scanned maps.





Raster data has a frontend cell matrix

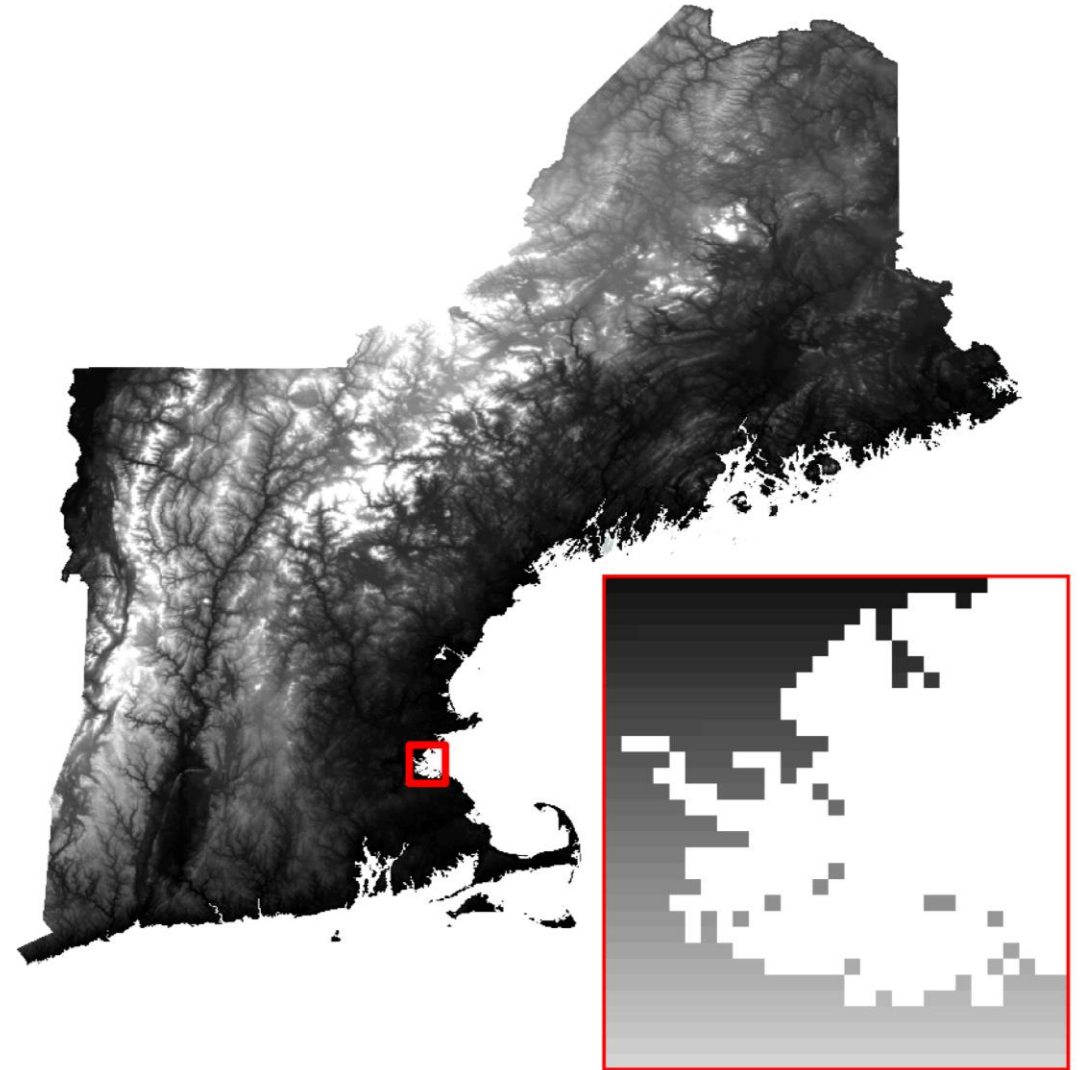
- Where each cell has its own value
- A raster can only symbolize one variable at a time
- Multiple bands can be stacked together to represent multiple variables





Raster data has a frontend cell matrix

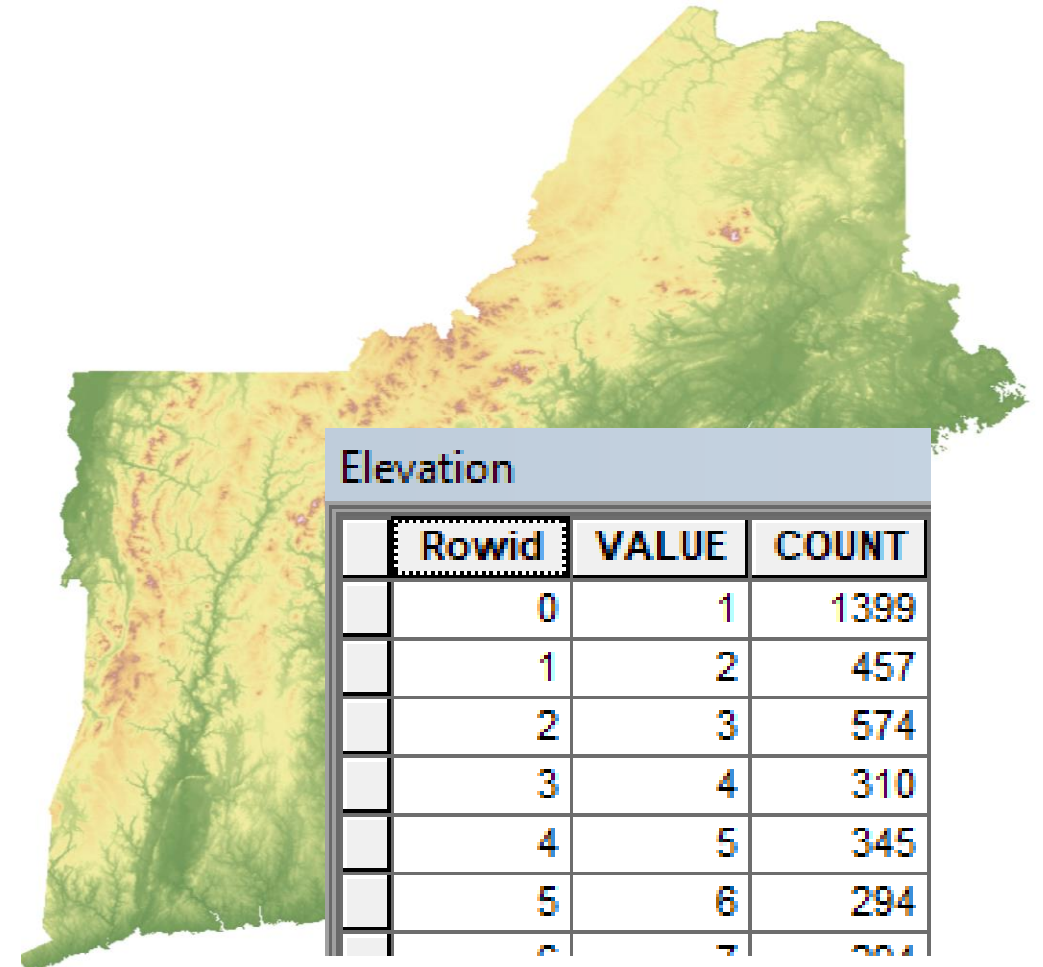
- Where each cell has its own value
- A raster can only symbolize one variable at a time
- Multiple bands can be stacked together to represent multiple variables
- **Here each cell/pixel is being symbolized by elevation value**





Raster data can have a **backend database** too

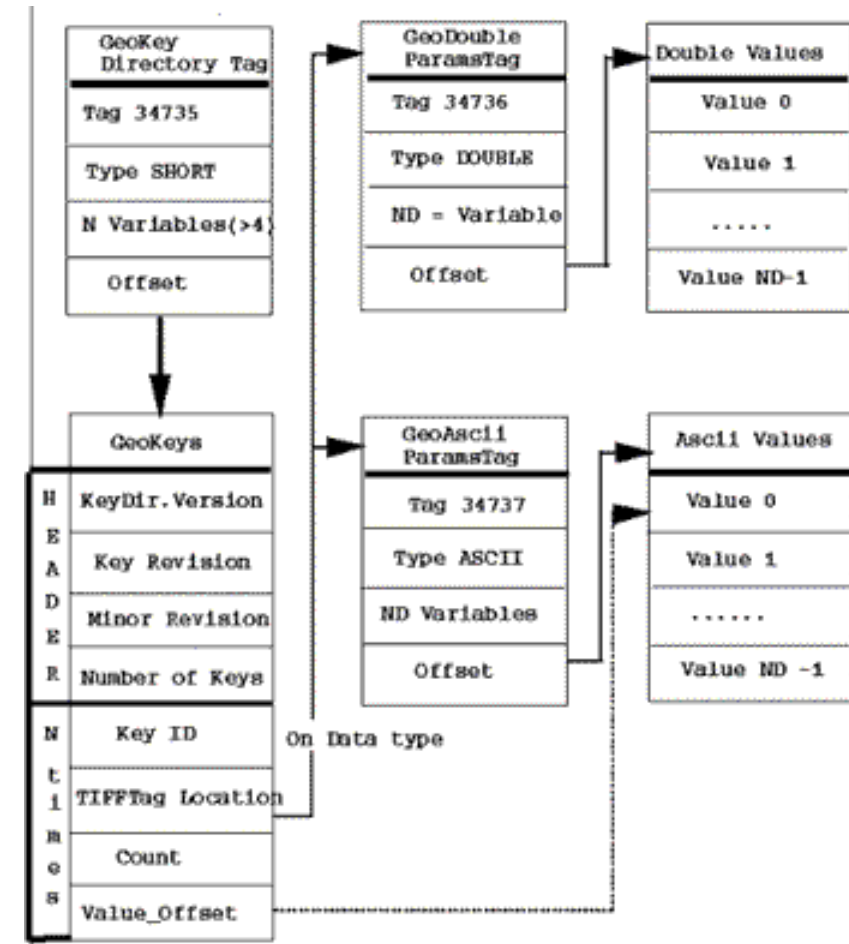
- Raster data have a **backend database**, normally called an 'attribute table'
- **rows** represent unique values (1m, 2m, 3m, etc.)
- **columns** have specific variables
 - 1) unique 'ROW ID'
 - 2) unique 'VALUE'
 - 3) 'COUNT' of pixels with that 'VALUE'





My go to choice as raster data format is GeoTIFF

- A .tif file stores metadata or attributes about the file as embedded tif tags.
- A GeoTIFF is a standard .tif image format with additional spatial (georeferencing) information embedded in the file as tags.
- Some example of tags:
 - Extent
 - Resolution
 - Coordinate Reference System (CRS) - we will introduce this concept in a later episode
 - Values that represent missing data (NoDataValue)



[Source](#)



Tabular data is also a common data format needed in geospatial analytics

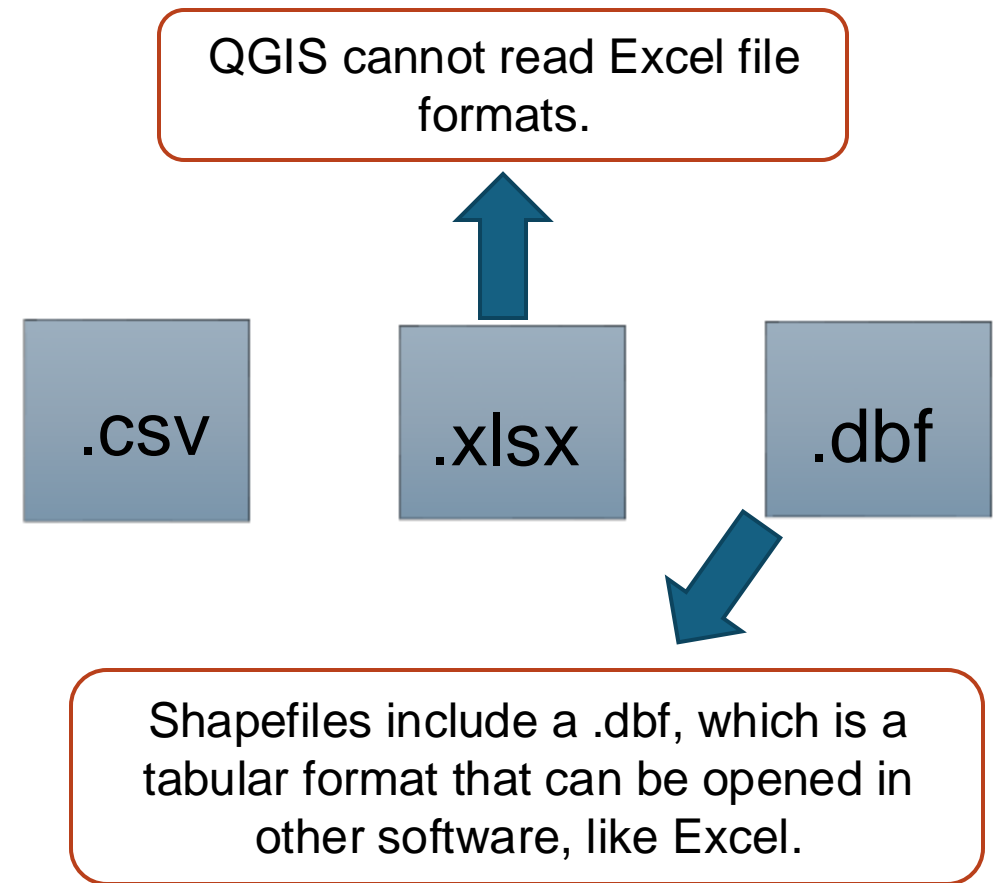
Tabular data can be transformed into spatial data in two ways:

1. Joining

- **Use a shared unique identifier** (GEOID, name, etc.) to match up tabular data to the spatial data's attribute table.

2. Geocoding

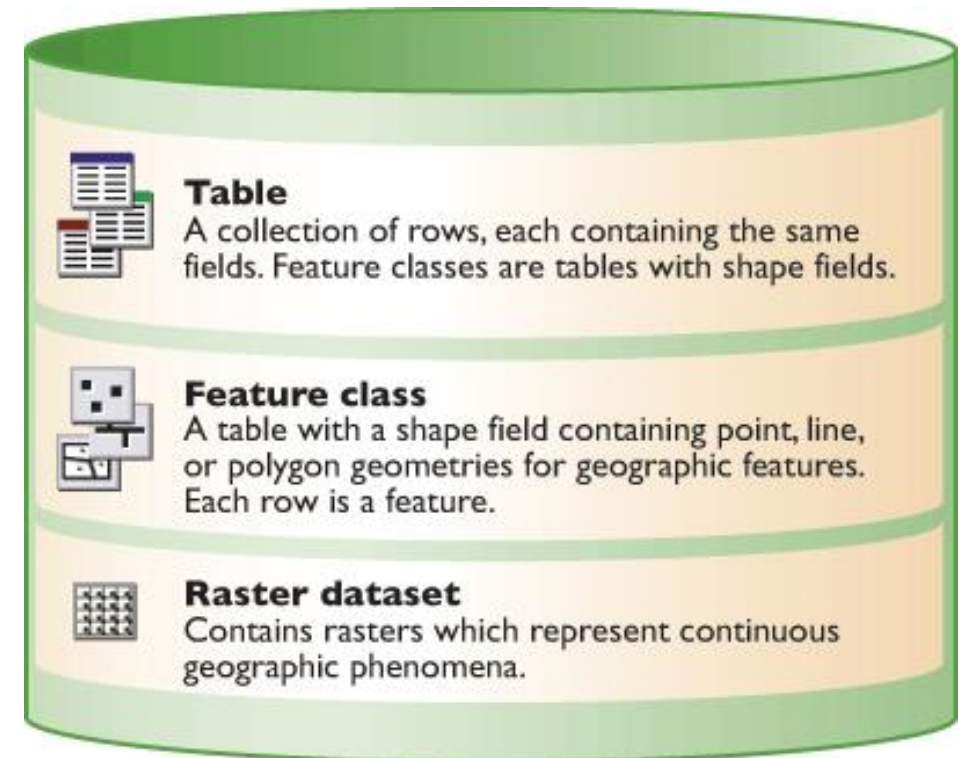
- **Use lat/lon** coordinates in table to plot as points on map
- **Use addresses** to plot locations based on a street network





Geodatabase is a more complex and efficient data structure to represent multiple geospatial data

- ESRI/ArcGIS storage system
- A collection of geographic datasets of various types held in a common file system folder
- **Advantages:** larger files size limits, faster processing time when using analysis tools
- **Disadvantages:** can only be opened in ESRI software
- Learn more about [using geodatabases in Pro](#).



[Source](#)



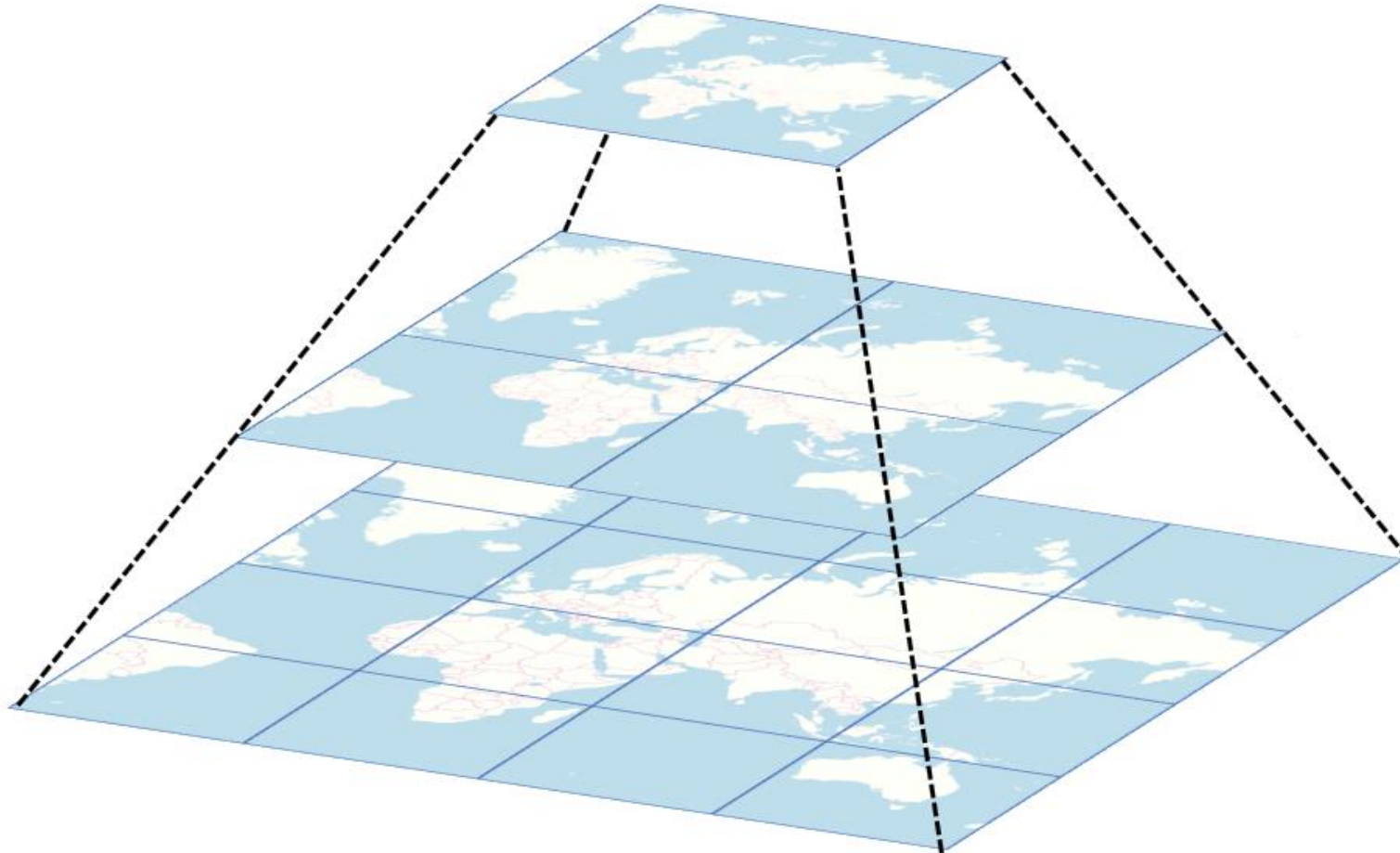
Raster and vector tiles are now the face of online mapping



[Source](#)



Vector tiles are replacing the use of raster tiles



- Vector tiles are a way of storing and serving geographic data in a compact and efficient format.
- Unlike traditional raster tiles, which are pre-rendered images, vector tiles contain vector data that can be rendered dynamically on the client side.



Why should we care about projections or CRS?

If a coordinate system is wrong or missing, data will not display in the correct location

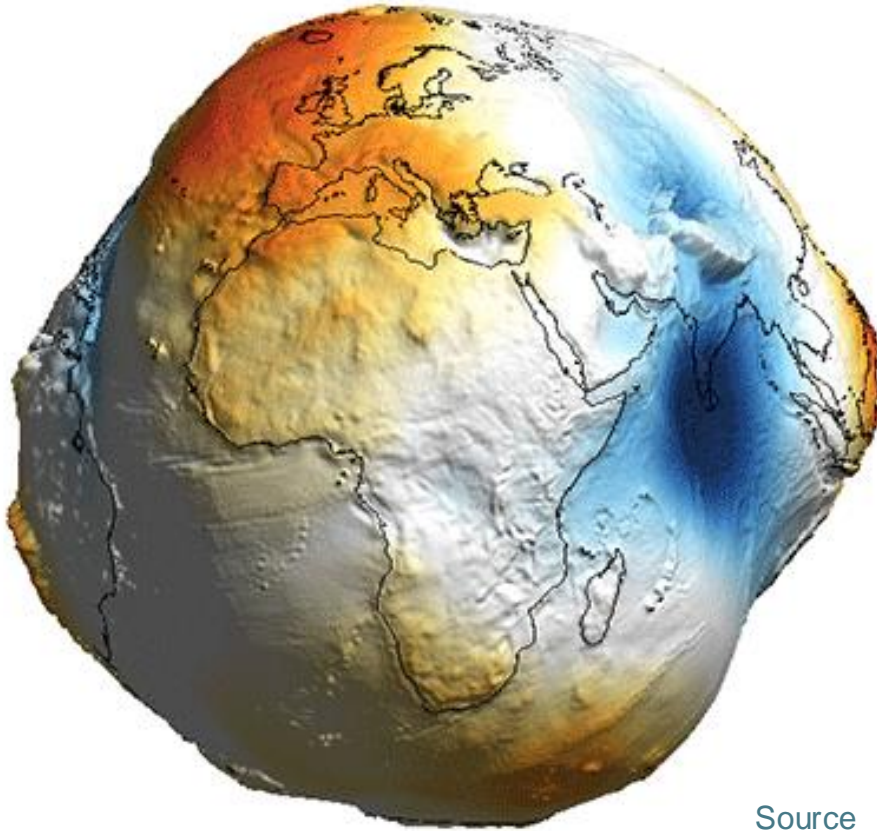


Source: Dan Mahr. <https://ihatecoordinatesystems.com/>

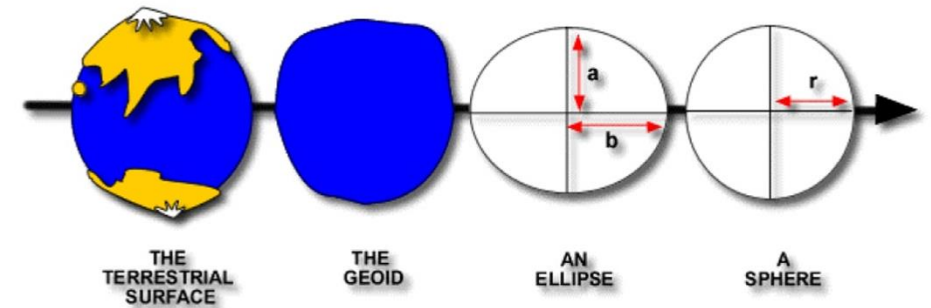


Earth's geoid is a complex shape to map

The geoid is an irregular-shaped model of the Earth's gravity field



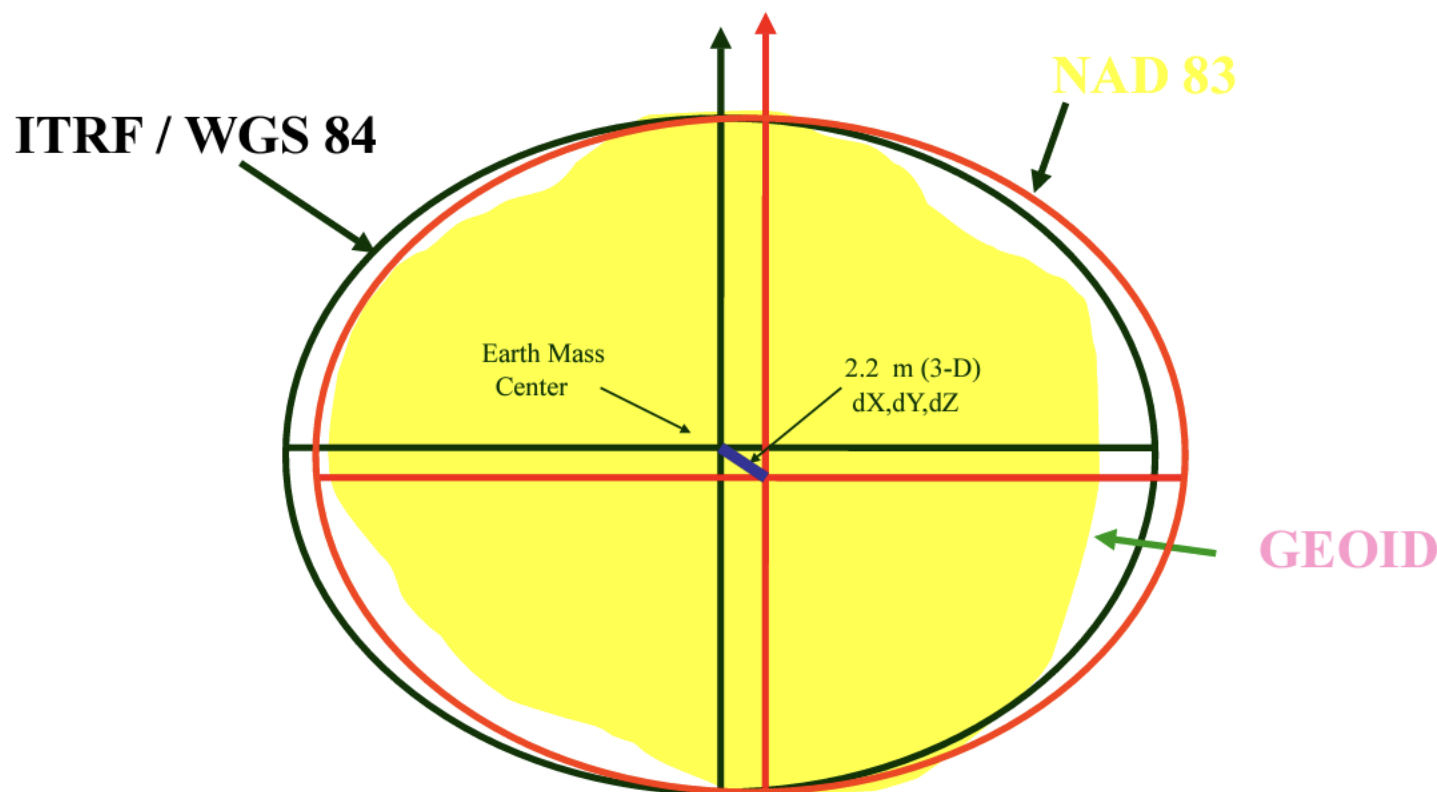
[Source](#)



- Sphere can be used as a first approximation to the geoid.
- Fits well locally
- Globally it is a poor approximation.
- Difference between equatorial and polar radius: 21km
- Rotational or biaxial ellipsoid is a good approximation both locally and globally.



Datum is an idealized mathematical representation of the Earth's 3D model

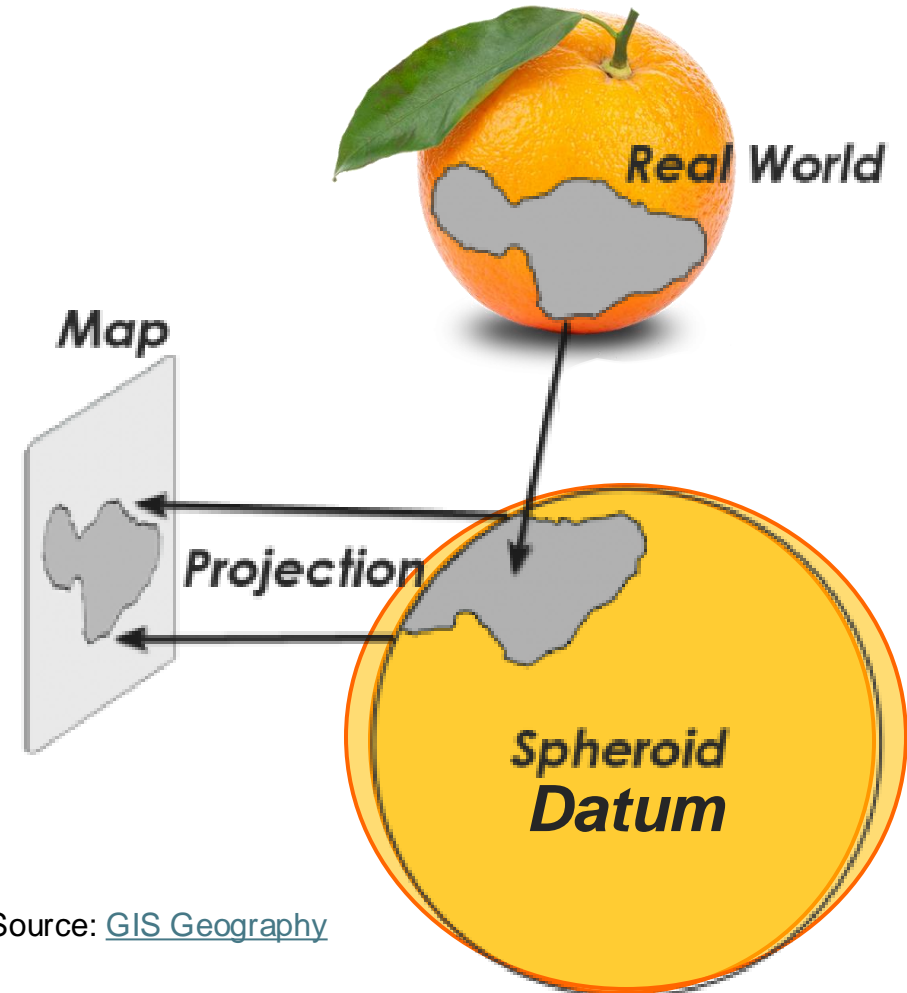


- Geographic Coordinate System (GCS) is the 3D representation of the Earth's coordinates.
- WGS84 (EPSG:4326), NAD83 (EPSG:4269)



Projection algorithm is applied to GCS to create a Projected Coordinate System (PCS)

- Imagine an orange as the Earth, and you want to be able to peel it in such a way as to lay the peel flat.
- Similarly, **projection is a method by which cartographers translate a 3D globe (spheroid or ellipsoid) to a 2D map surface.**



Source: [GIS Geography](#)

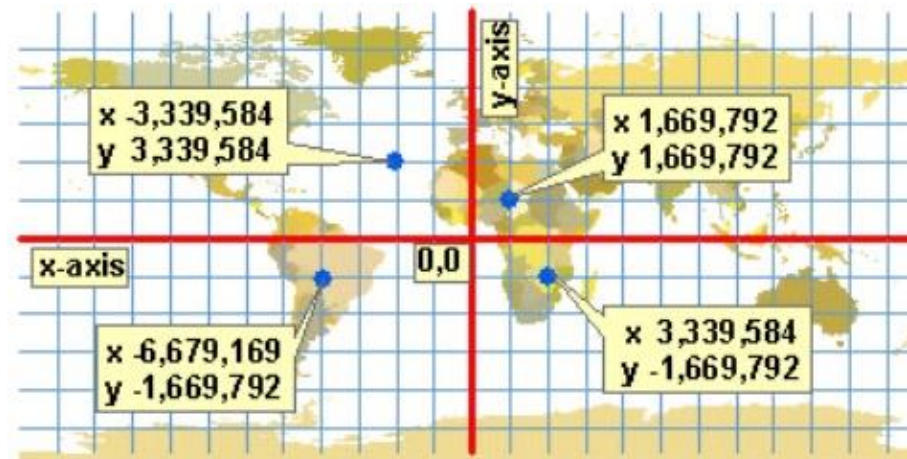
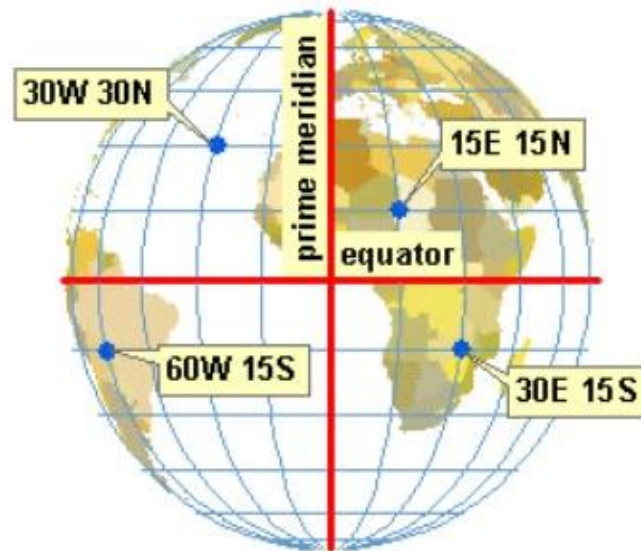


PCS is consisted of several items

- Geographic Coordinate System
- Projection Algorithm
- Linear Unit
- Parameters that center the system on a certain location



<https://www.youtube.com/watch?v=kIID5FDi2JQ>

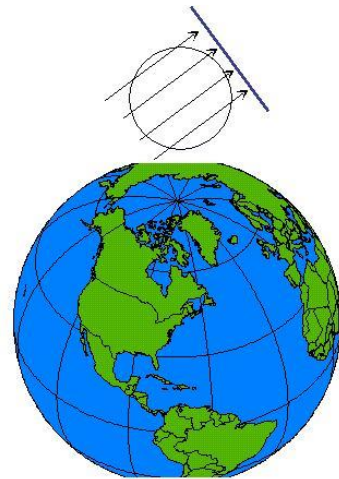


Source: Jochen Albrecht

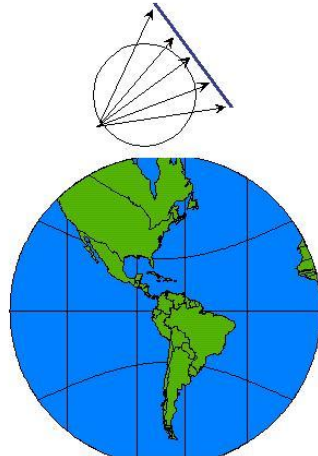


Lots of option for projection systems

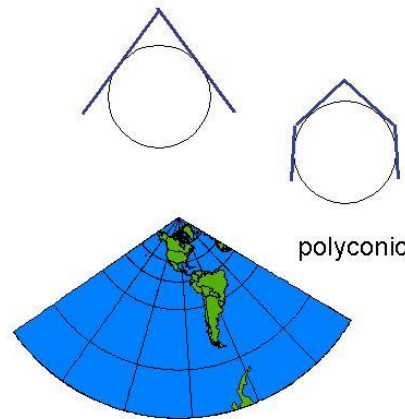
- There are many different types of projections.
- Each have certain strengths and limitations in the following types of distortions: shape, area, distance, direction



View from space
Orthographic/ Azimuthal

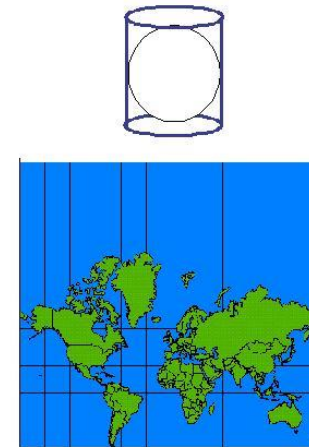


gnomonic

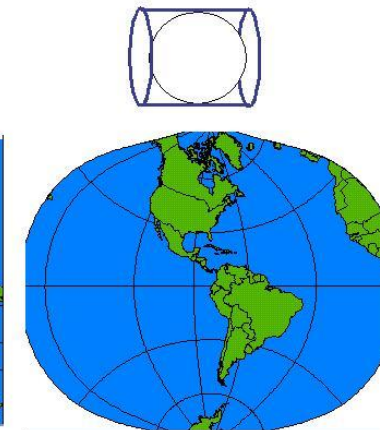


conic
(Lambert conformal)

polyconic



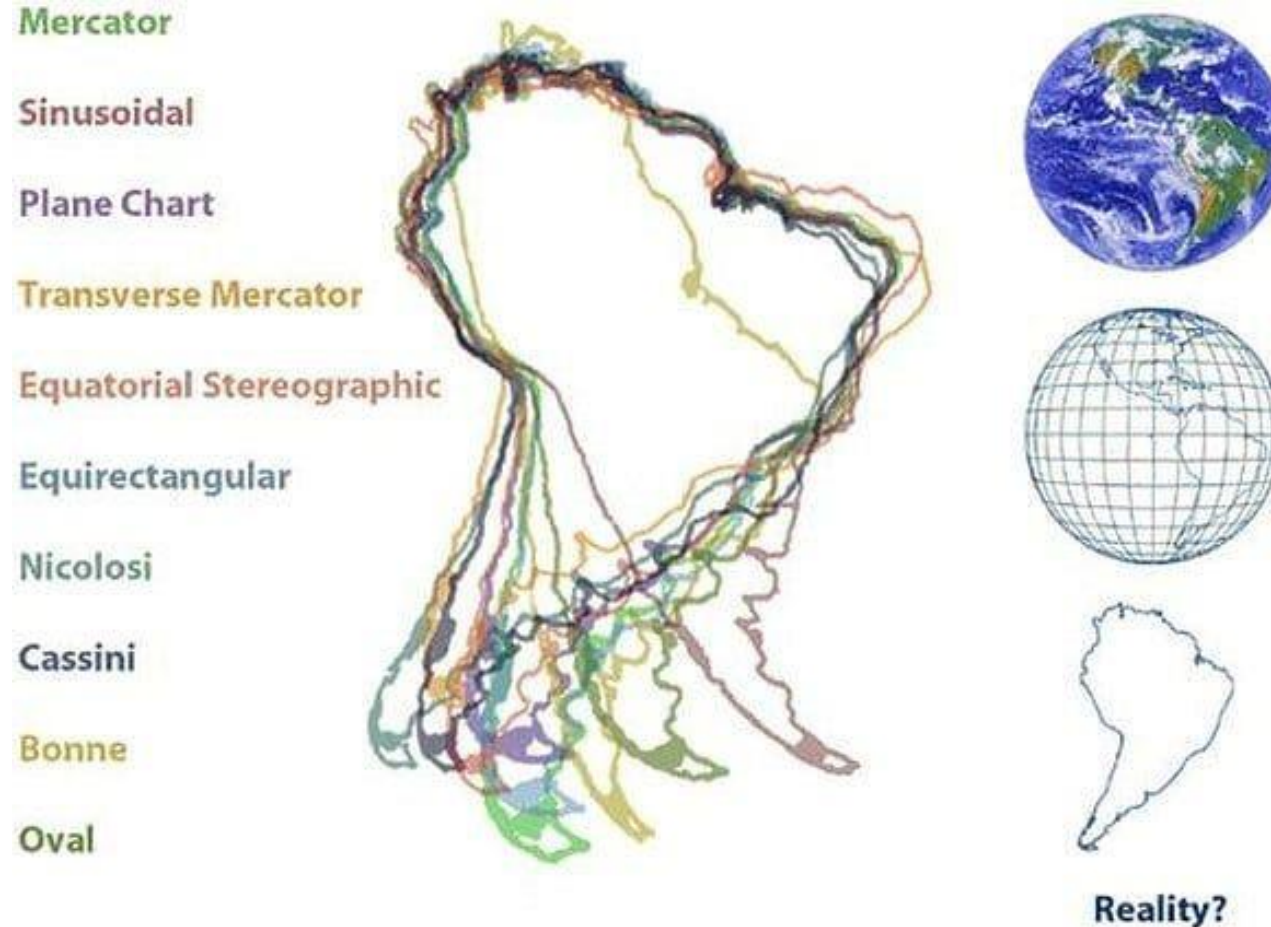
Mercator
cylindrical



Universal Transverse Mercator
(UTM, 1927, grid zone 17, 81W)

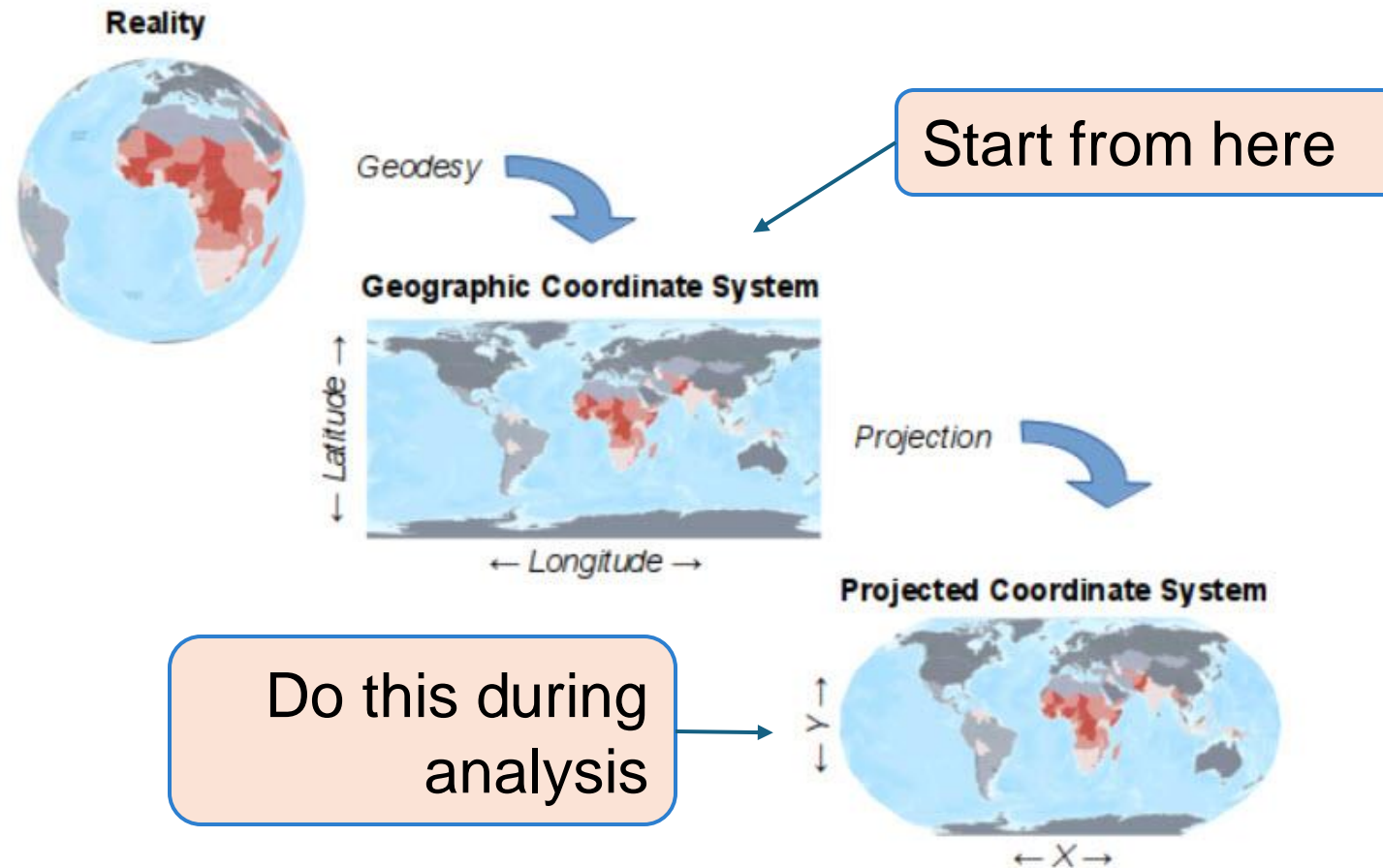


Analysis tools with shape, area or distance calculations require data to be in a projection





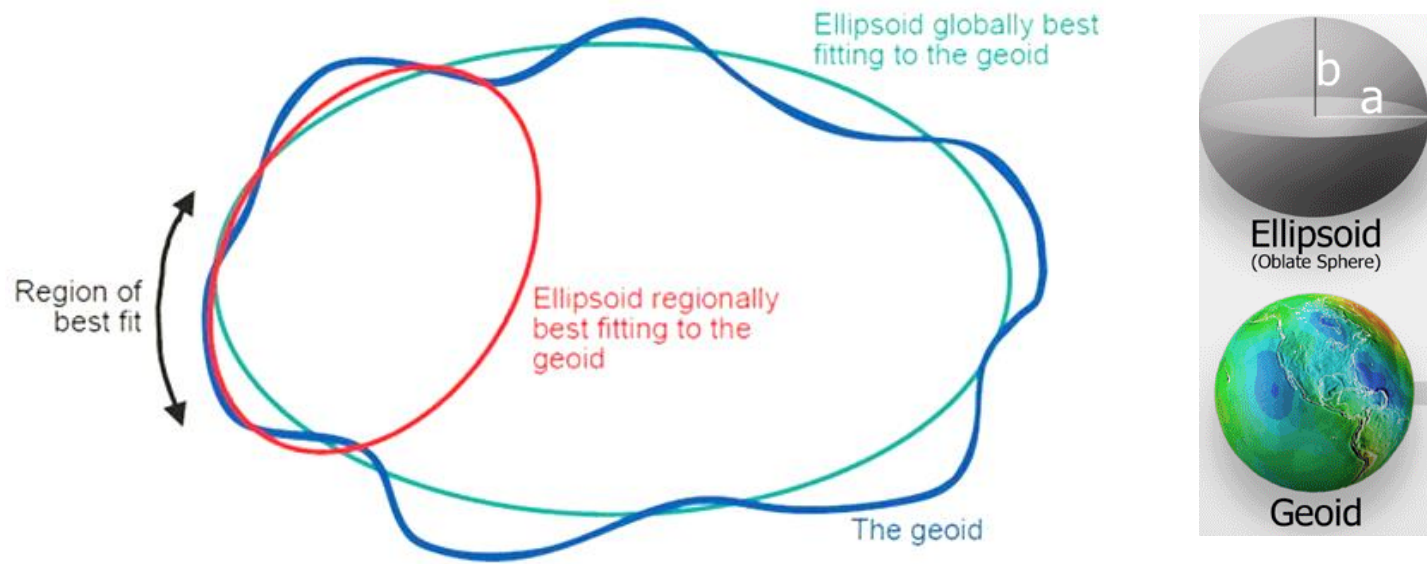
So, what to do?





Commonly encountered systems

- Geographic Coordinate System
- NAD83 (North American Datum) – best fitting ellipsoid for North America
- WGS1984 (World Geodetic System) – best fitting ellipsoid for the globe/world

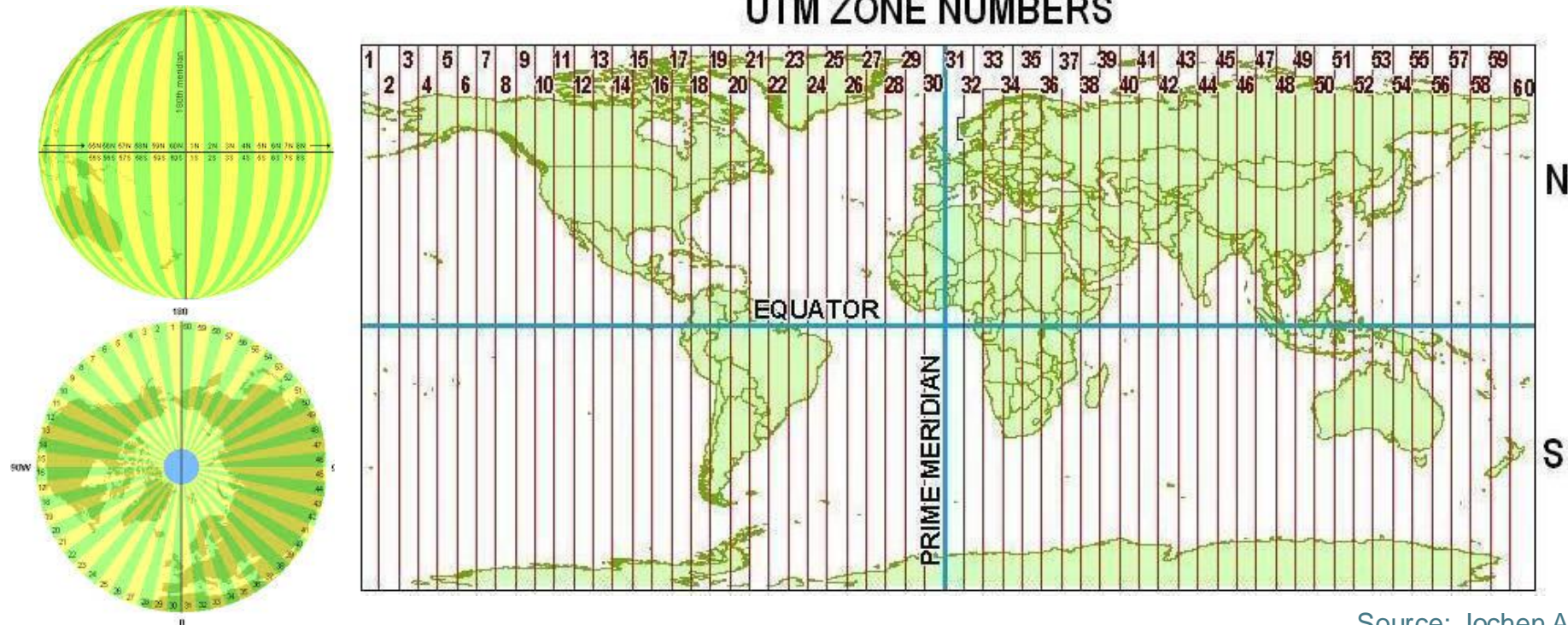


Courtesy of NOAA



Commonly encountered systems

- Projected Coordinate System
- UTM (Universal Transverse Mercator) – often best for large regions



[Source: Jochen Albrecht](#)



Always consider “scale” in your geospatial analysis



LOCAL



REGIONAL






GLOBAL

[Source](#)



Always consider “scale” in your geospatial analysis

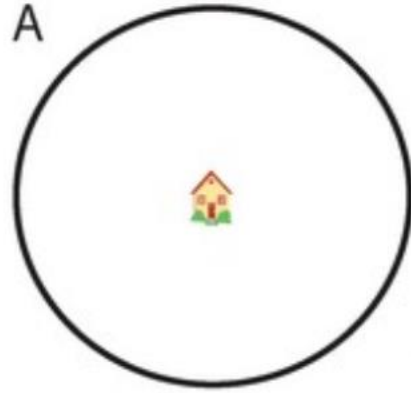
	NETWORK	FLows	SPATIAL CONSTRUCTS
 LOCAL	<ul style="list-style-type: none">• Transit systems• Street networks	<ul style="list-style-type: none">• Commuting• Personal and social trips• Deliveries	<ul style="list-style-type: none">• Activity space• District / Neighborhood• Terminal / Development zone• Town / City
 REGIONAL	<ul style="list-style-type: none">• Commuter rail• Regional air networks• National highway systems• National railway systems• Short sea shipping / feeders	<ul style="list-style-type: none">• Intercity passenger flows• Distribution	<ul style="list-style-type: none">• Metropolitan area• Market area• Hinterland / Corridor• Urban region
 GLOBAL	<ul style="list-style-type: none">• International air networks• Maritime shipping networks• Telecommunication networks	<ul style="list-style-type: none">• Trade• Tourism and business trips• Migration	<ul style="list-style-type: none">• Value chains• Landbridge• Trade area

[Source](#)



Neighborhood is a contextual concept

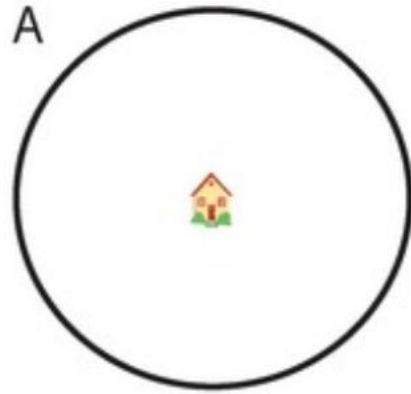
Neighborhood is defined as a circle centered on the house, extending equally in all directions.





Neighborhood is a contextual concept

Neighborhood is defined as a circle centered on the house, extending equally in all directions.

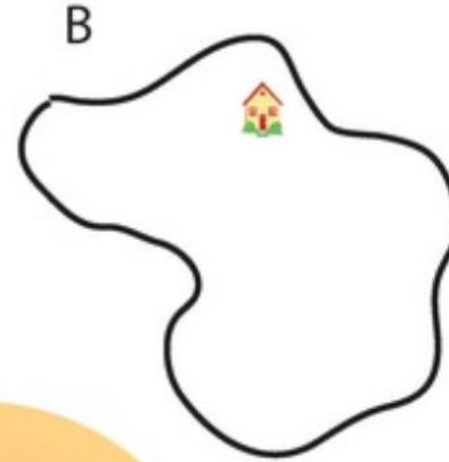
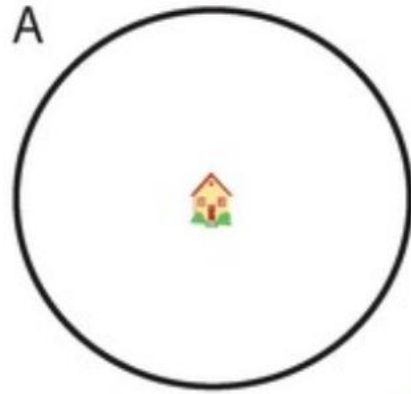


Neighborhood is equated with an existing zone, i.e., census tract or precinct, reflecting the common strategy of using existing aggregated data to characterize a household's surroundings.



Neighborhood is a contextual concept

Neighborhood is defined as a circle centered on the house, extending equally in all directions.



Neighborhood is equated with an existing zone, i.e., census tract or precinct, reflecting the common strategy of using existing aggregated data to characterize a household's surroundings.

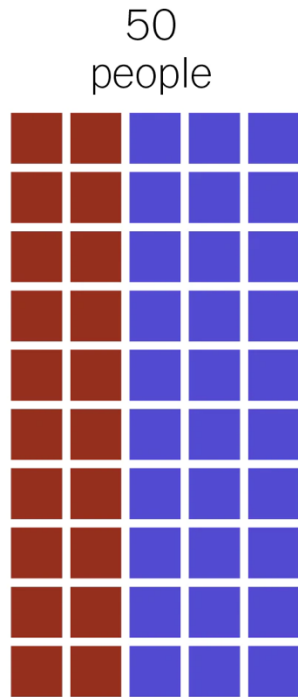
Weights are applied to surroundings based on distance, allowing neighborhood to be defined as a convolution with weight decreasing as a simple function of distance.



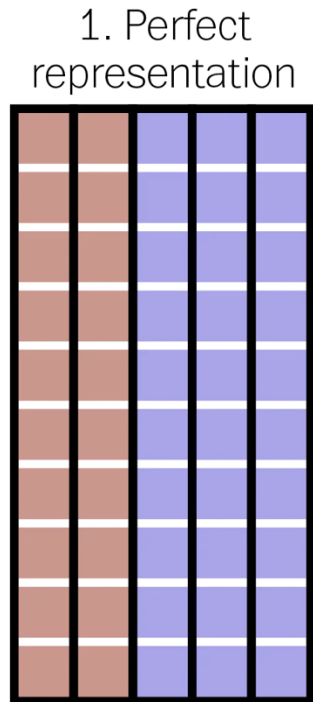


Gerrymandering – a controversial topic in elections

Three different ways to divide 50 people into five districts

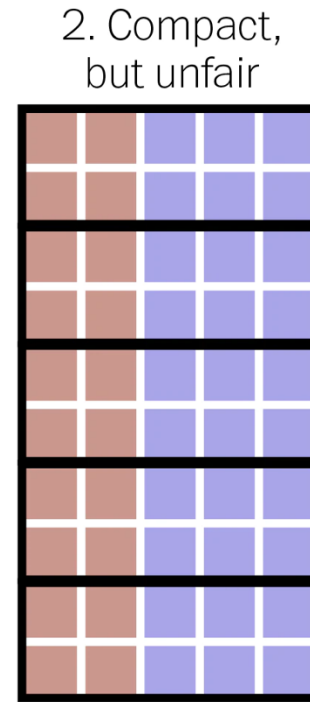


**60% blue,
40% red**



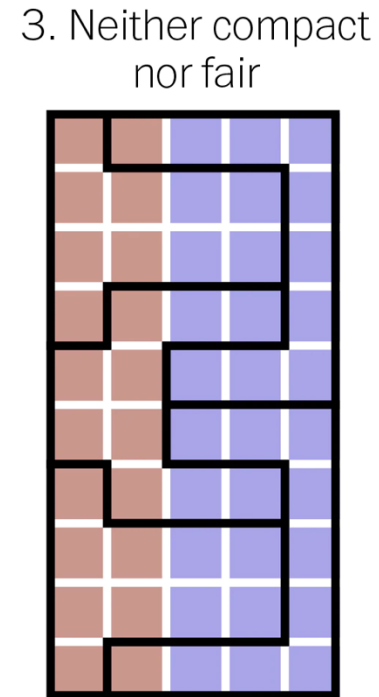
**3 blue districts,
2 red districts**

BLUE WINS



**5 blue districts,
0 red districts**

BLUE WINS



**2 blue districts,
3 red districts**

RED WINS

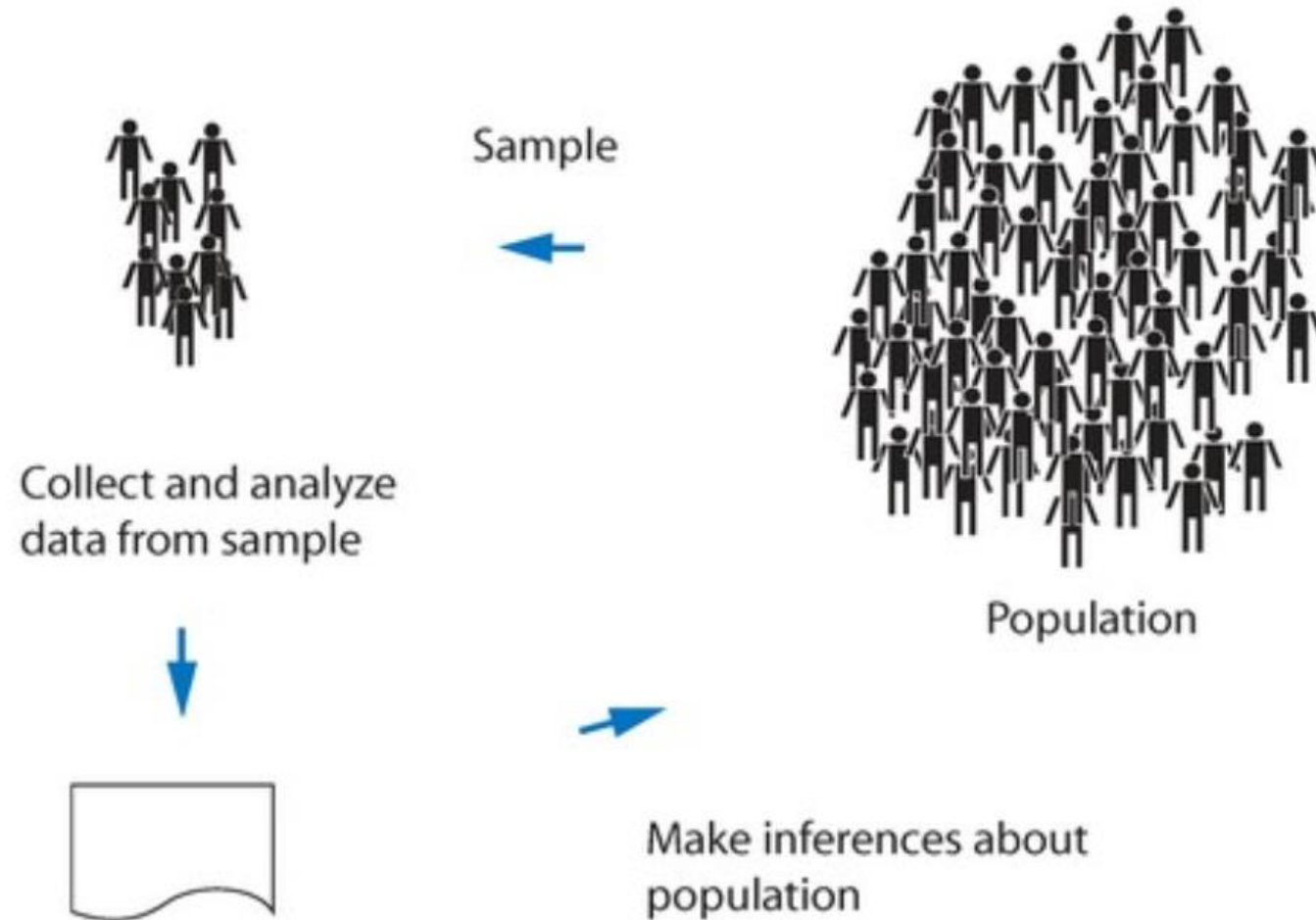
“Disclaimer: The color
is imaginary, and if it
matches with any real-
world scenario, I am
not responsible for any
resemblance or
confusion.”



[Source](#)



Spatial sampling helps us making inference about real population without using the entire population





Econometrics is the statistical analysis of economic data and involves lots of spatial statistics

- Applies econometric techniques to spatial data, considering location-based dependencies.
- Accounts for the similarity between nearby spatial data points.
- Models how neighboring regions influence each other's economic outcomes.
- Adjusts for spatially correlated errors in data analysis.
- Used in analyzing geographic patterns in fields like urban planning and environmental economics.
- Location Quotient
- Spatial Regression
- Spatial Lag
- Shift-share analysis



Spatial heterogeneity is everywhere

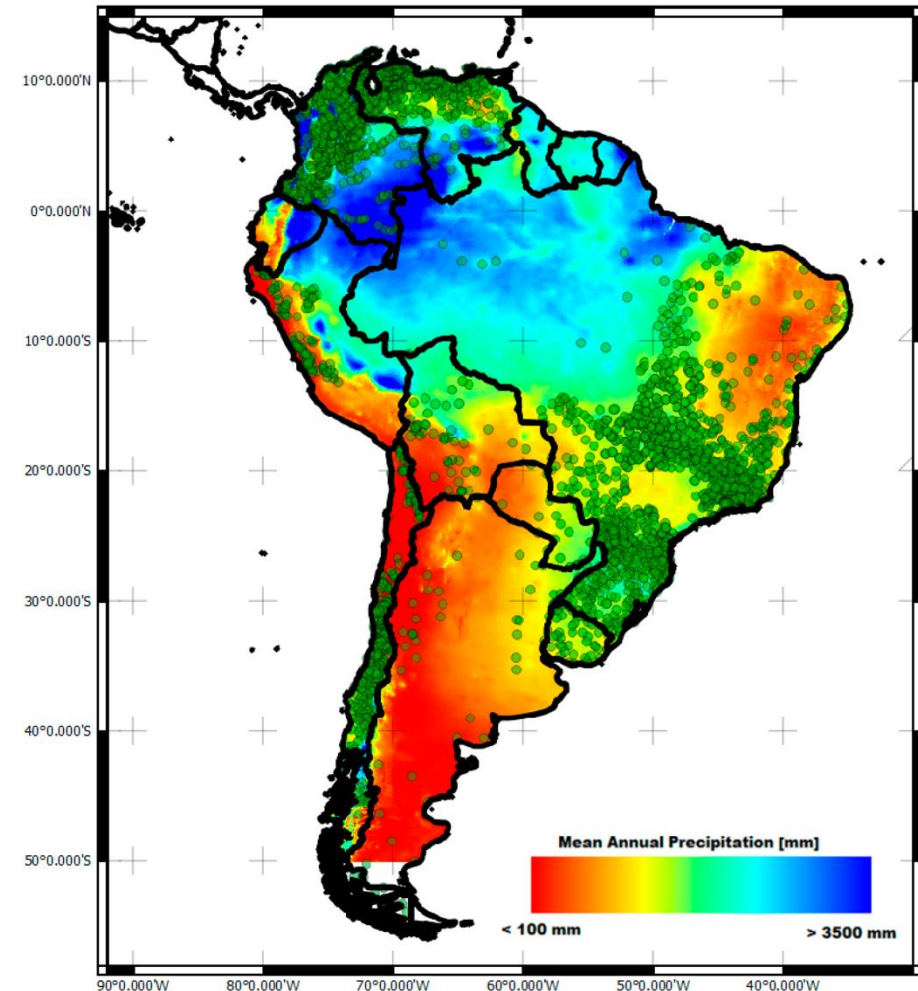


- The Earth's surface displays incredible spatial heterogeneity
- Analysis performed in one area cannot be simply transferred to another area without considering its heterogeneity
- Local relationship should be given priority in specific analysis



Spatial dependence – the first rule of geography

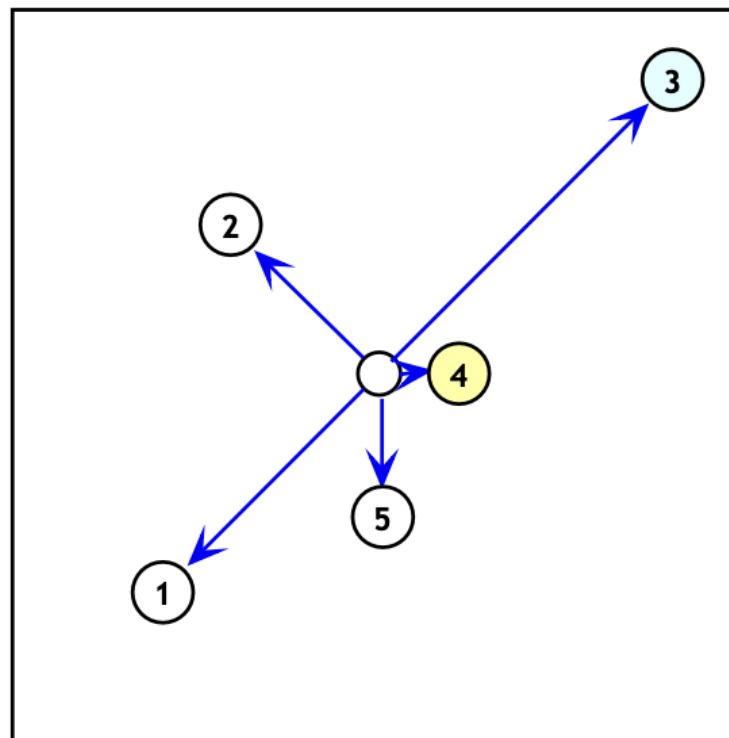
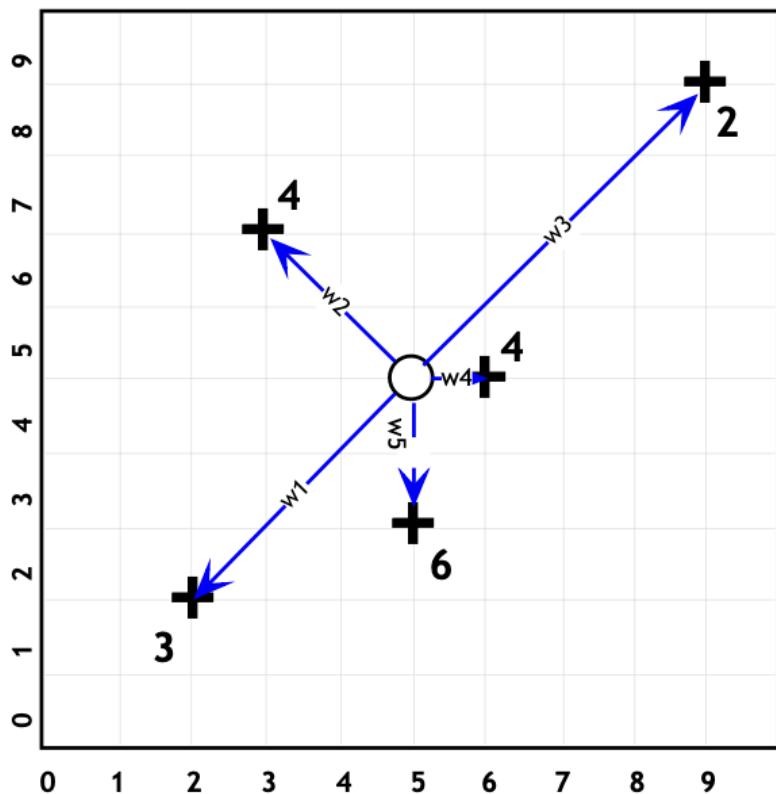
- Tobler's rule: *"All things are related, but nearby things are more related than distant things."*
- Spatial dependence underlines the field of **Geostatistics**
- If we know the information of certain location, we can "interpolate/predict" similar information based on location



[Source](#)



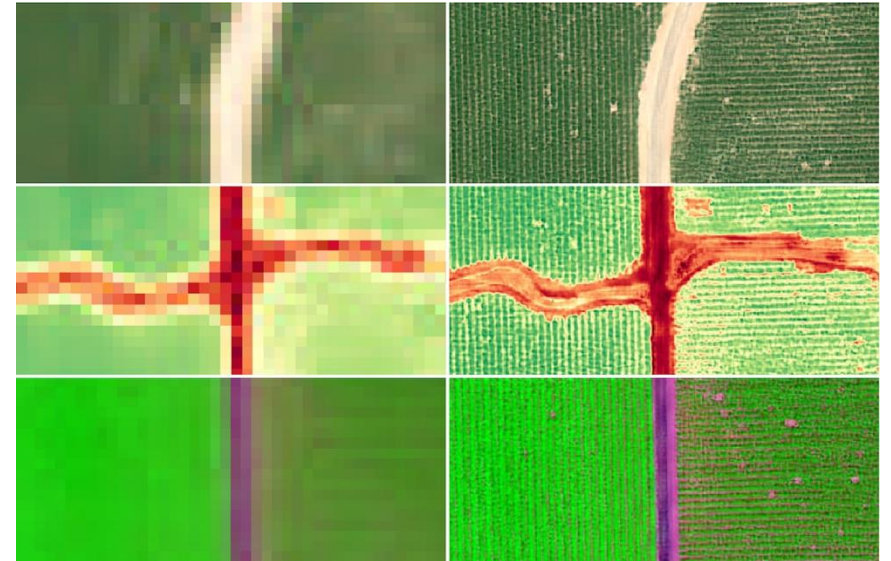
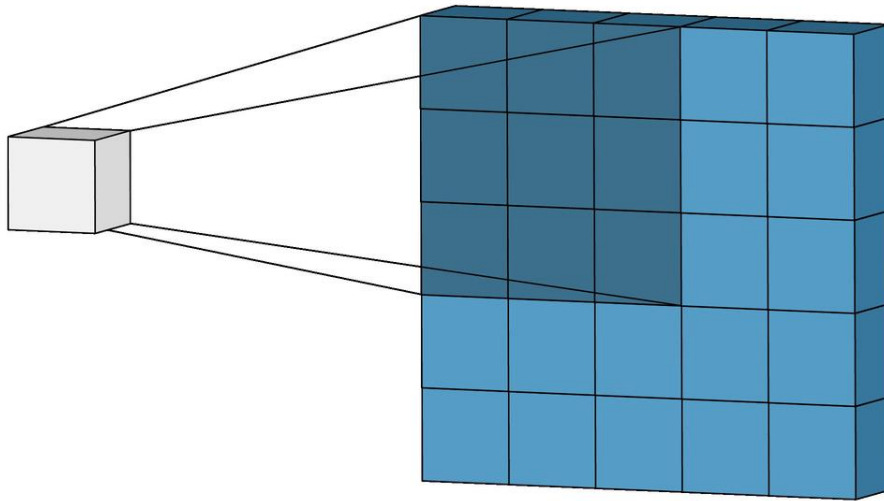
Spatial interpolation uses geostatistics principles to interpolate unknown values at given location



- We can only interpolate **continuous** variable, NOT discrete variables
- Deterministic interpolation and geostatistical interpolation



Smoothing often generalizes a complex spatial process and helps with the inference



[Source](#)



Summary

- The context of geospatial analytics
- Vector and raster data model
- Different formats of geospatial data
- Projection systems
- Spatial Statistics
 - Scale, neighborhood, spatial heterogeneity, dependence, interpolation, sampling, smoothing and sharpening
 - Spatial econometrics



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Thank You

