



# CS-GY 6313 B: Information Visualization

10/03/2024

# Logistics

- Assignment 1 presentations
- Lecture
- Final project: look for partners, brainstorm ideas, consult with me



# 2D Viz: Spatial Data

# Geographical data

- Any data that contains geographical data

- Spatial objects

- Counties

- Rivers, lakes

- Regions

- Etc.

- Buildings

- Non-spatial geolocated objects

- Cars

- People

- Animals

- Weather stations

- Etc.

# Spatial data

- Use the given spatial position
- When?
  - Dataset contains spatial attributes and they have primary importance
  - Central tasks revolve around understanding spatial relationships
- Eg:
  - Geographical/cartographic data
  - Sensor/simulation data

# Geographic maps

- Interlocking marks!
  - Shape coded
  - Area coded
  - Position coded
- Cannot encode another attribute with these channels. They are taken!

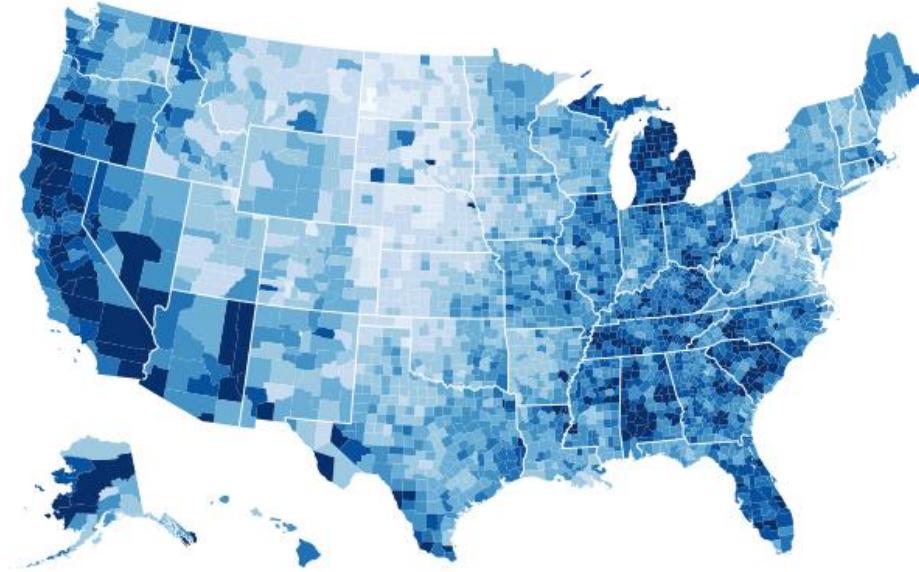


# Thematic maps

- Shows the spatial variability in an attribute (the “theme”)
  - Combine geographic / reference map with (simple, flat) tabular data
  - “Region” has 2 meanings here:
    - Interlocking area marks (provinces, countries with outline shapes)
    - Categorical key attribute in a table
- Major techniques:
  - Choropleth
  - Symbol map
  - Cartogram
  - Dot density map

# Choropleth map

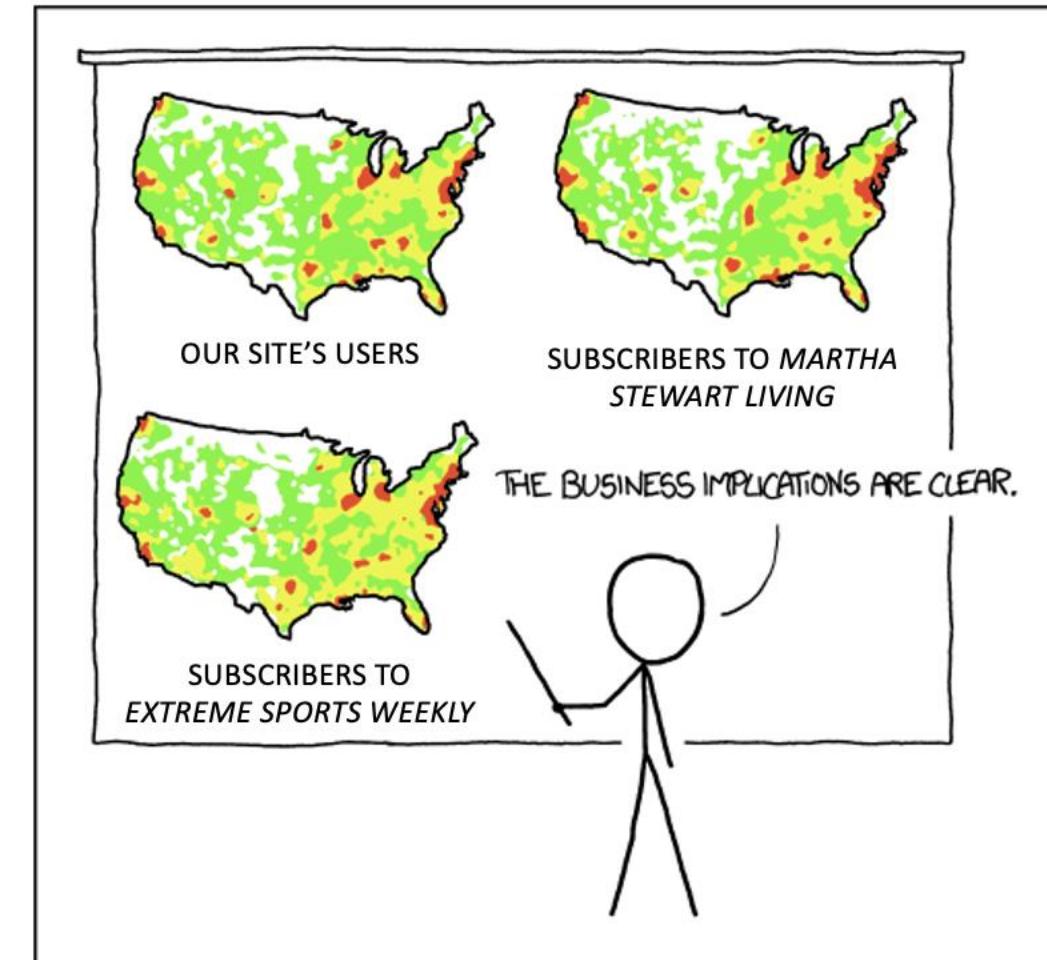
- Use when the central task is understanding spatial relationships
- Data:
  - Geographic geometry
  - Table with 1 quant. attribute per region
- Encoding:
  - Position: use given geometry for area mark boundaries
  - Color: sequential segmented color map



<http://bl.ocks.org/mbostock/4060606>

# Beware: population map trickiness!

- Spurious correlations: most attributes just show where people live
- Consider when to normalize by population density
  - Encode raw data values → tied to underlying population
  - Use normalized values → account for population density
    - E.g. unemployed people per 100 citizens
- Not restricted to choropleth maps!
  - General issue in viz
  - Failure to normalize is a common error



# Choropleth map: recommendations

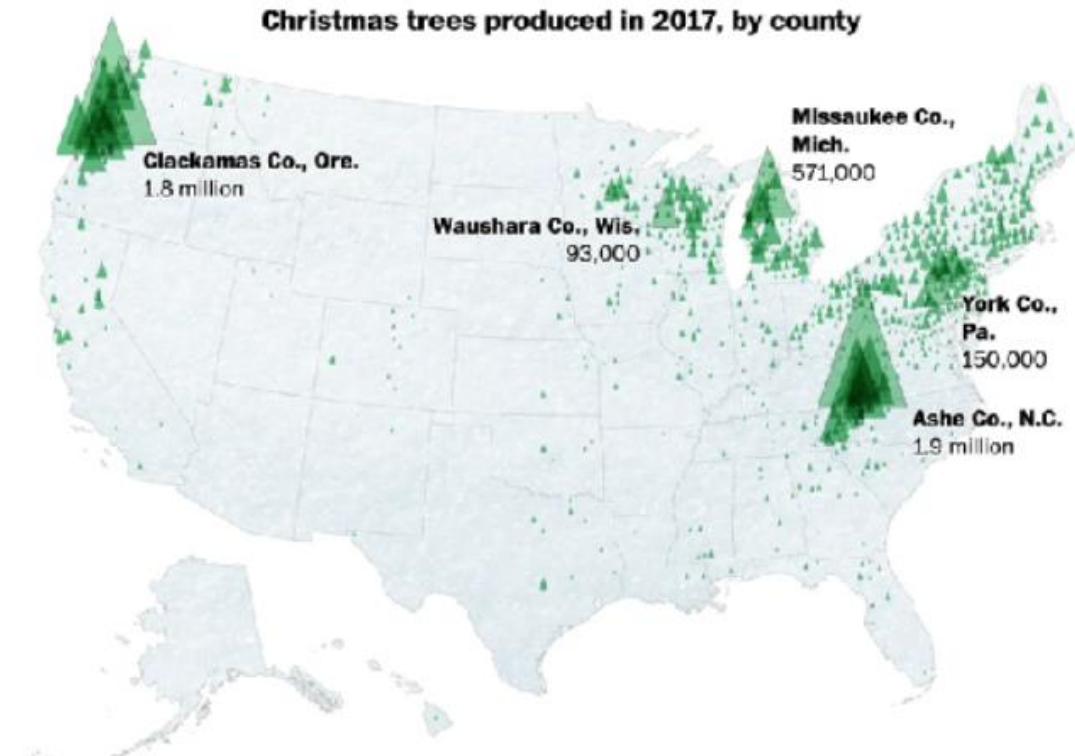
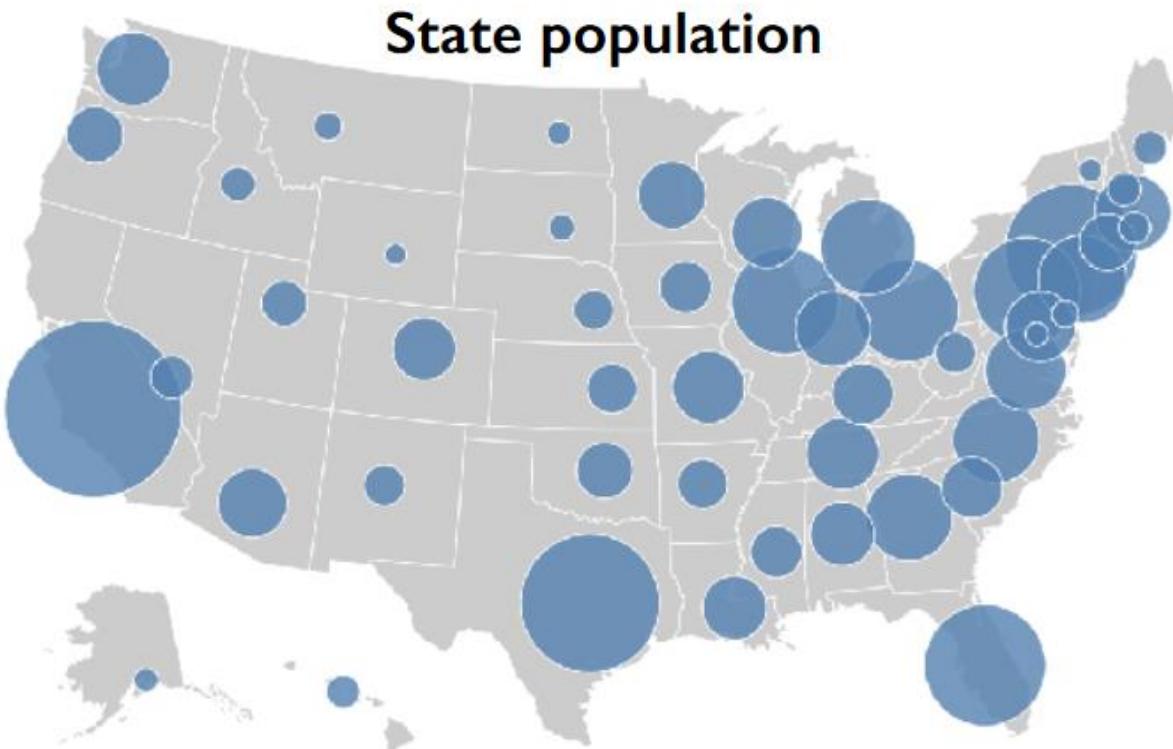
- Only use when central task is understanding spatial relationships
- Show only one variable at a time
- Normalize when appropriate
- Be careful when choosing colors & bins
- Best case: regions are roughly equal sized

# Choropleth map: pros and cons

- Pros:
  - Easy to read and understand
  - Well established visualization (no learning curve)
  - Data is often collected and aggregated by geographical regions
- Cons:
  - Most effective visual variable used for geographic location
  - Visual salience depends on region size, not true importance w.r.t. attribute value
    - Large regions appear more important than small ones
  - Color palette choice has a huge influence on the result

# Symbol maps

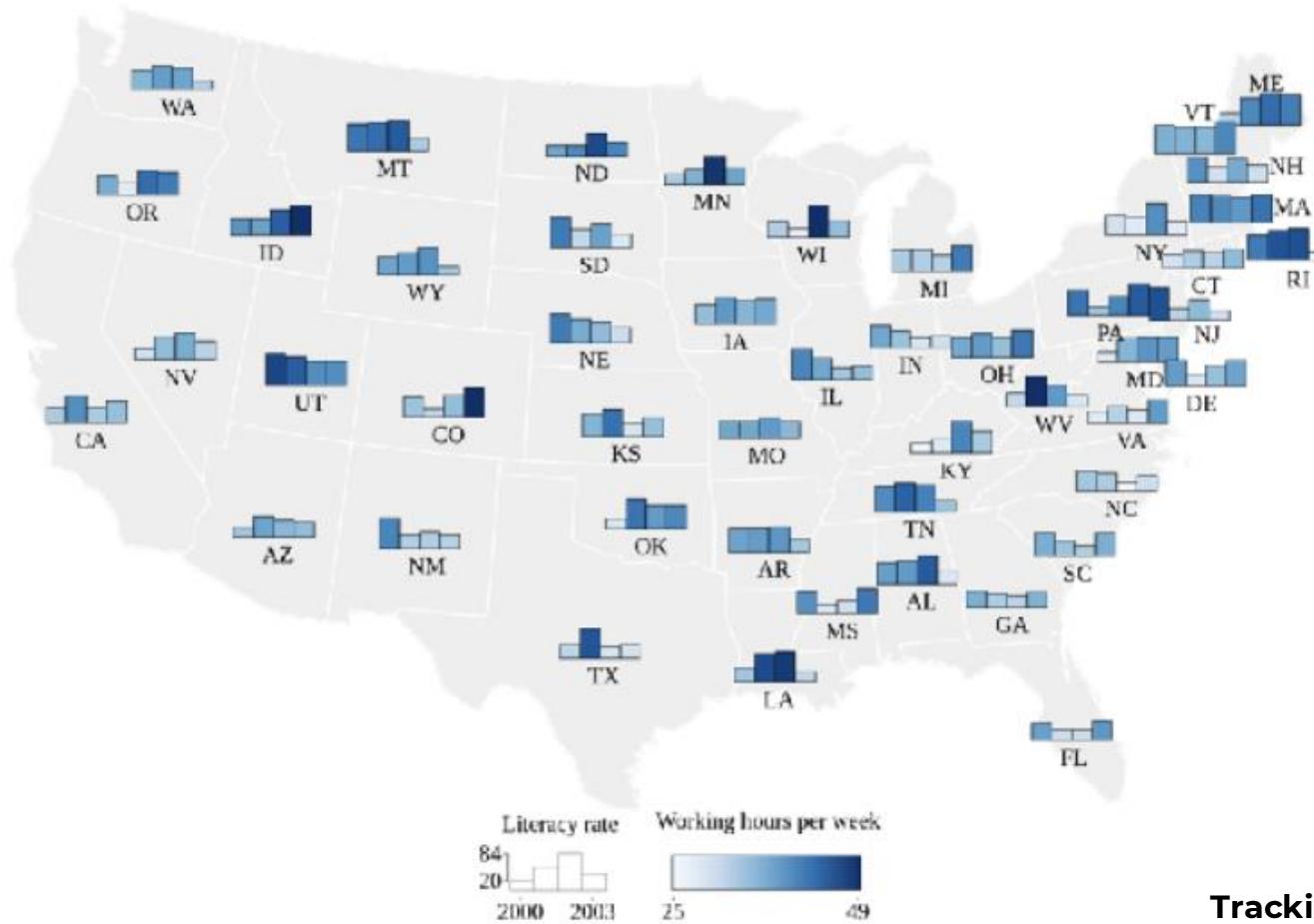
- A symbol is used to represent aggregated data (marks or glyphs)
  - Allows the use of size and shape and color channels
    - AKA proportional symbol maps, graduated symbol maps
- Keep original spatial geometry in the background
- Often a good alternative to choropleth maps



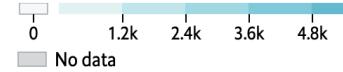
# Symbol maps with glyphs

UPDATED ON FEBRUARY 5TH

- Glyph = complex marks

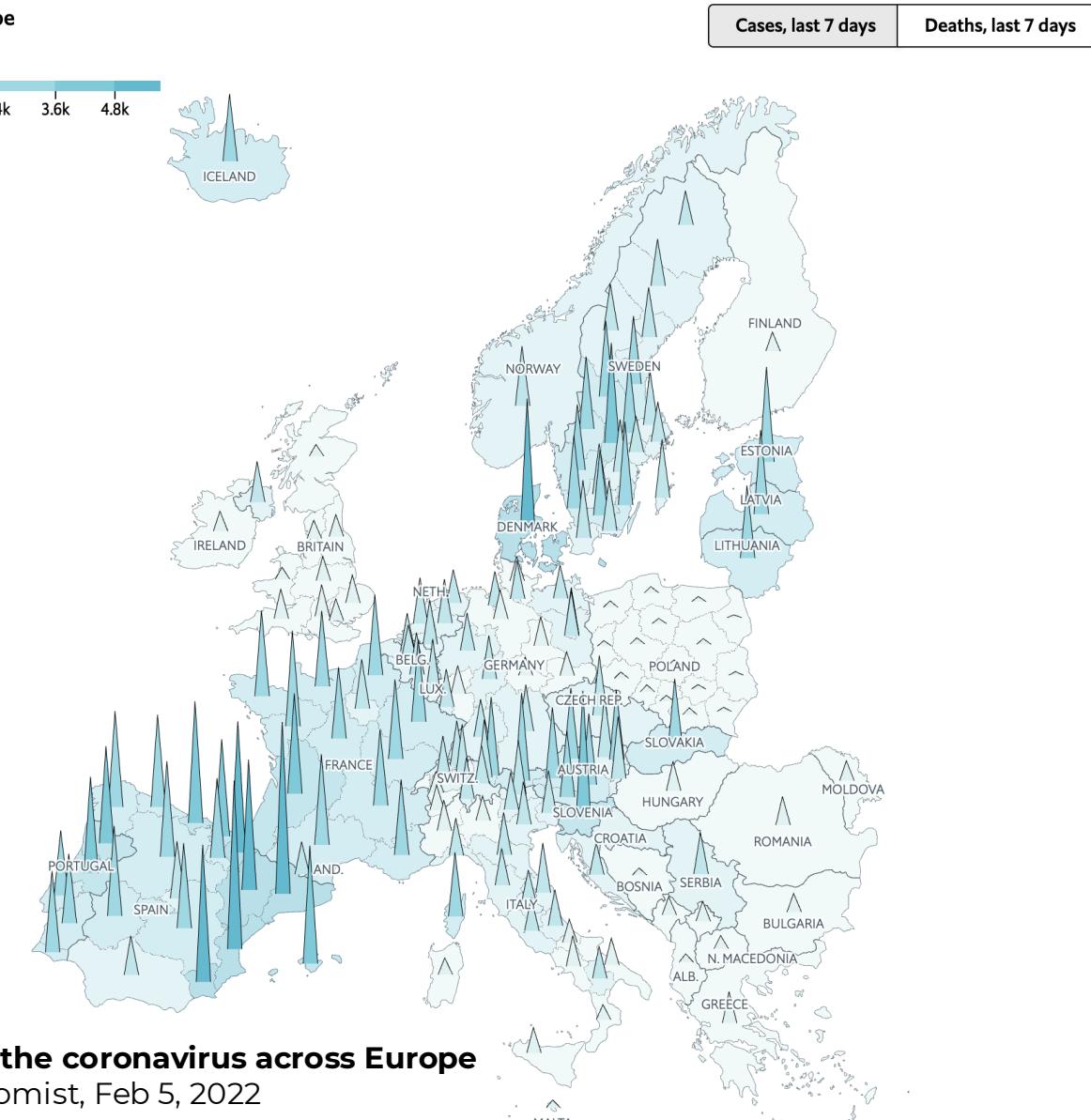


Covid-19 in Europe  
Per 100,000 people



<https://www.economist.com/graphic-detail/tracking-coronavirus-across-europe>

Tracking the coronavirus across Europe  
The Economist, Feb 5, 2022

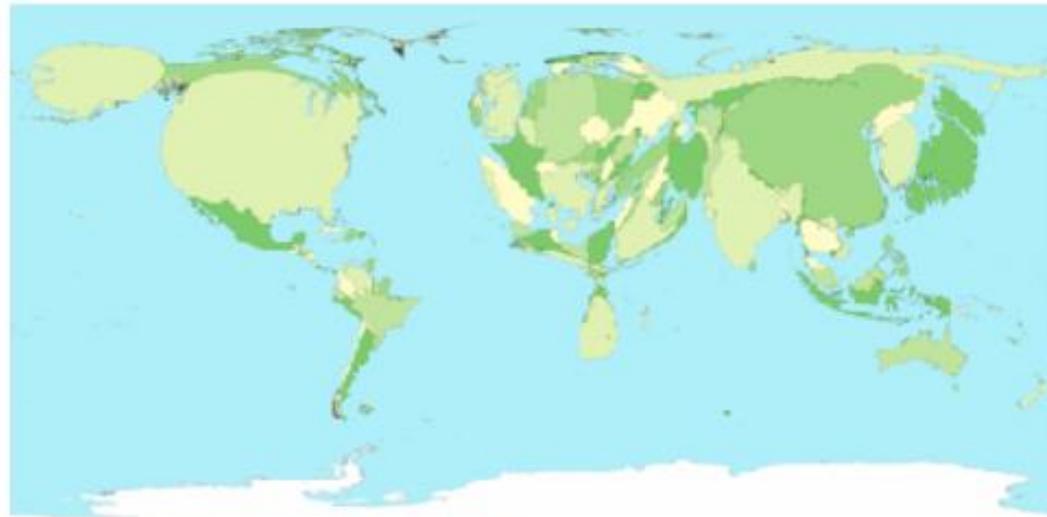


# Symbol map: Pros & cons

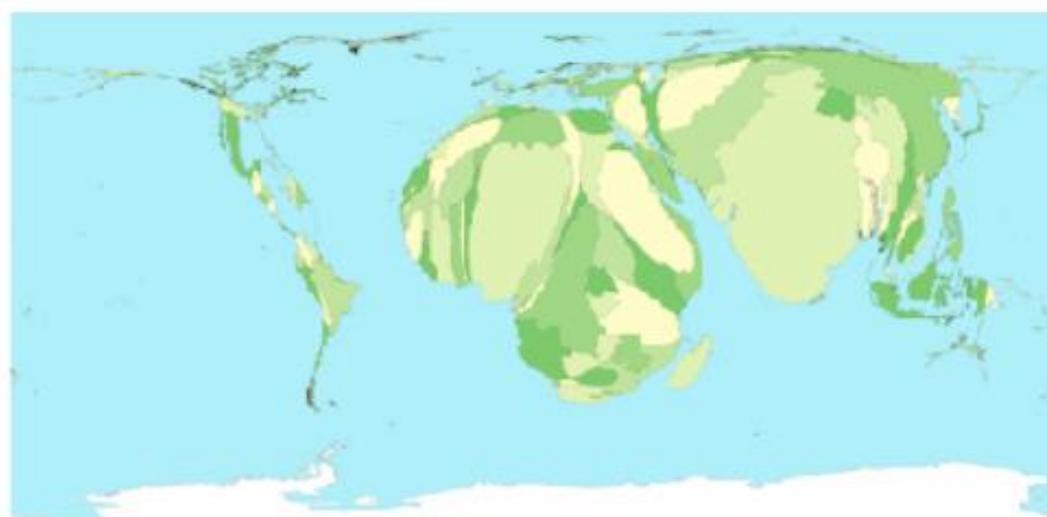
- Pros:
  - Somewhat intuitive to read and understand
  - Mitigate problems with region size vs data salience
    - Marks: symbol size follows attribute value
    - Glyphs: symbol size can be uniform
- Cons:
  - Possible occlusion / overlap
    - Symbols could overlap each other
    - Symbols could occlude region boundaries
  - Complex glyphs may require explanation / training

# Contiguous cartogram

- Interlocking marks: shape, area, and position coded
- Derive new interlocking marks
  - Based on combination of original interlocking marks and new quantitative attribute
- Need an algorithm to create new marks
  - Input: target size
  - Goal: shape as close to the original as possible
  - Requirement: maintain constraints
    - Relative position
    - Contiguous boundaries with their neighbors



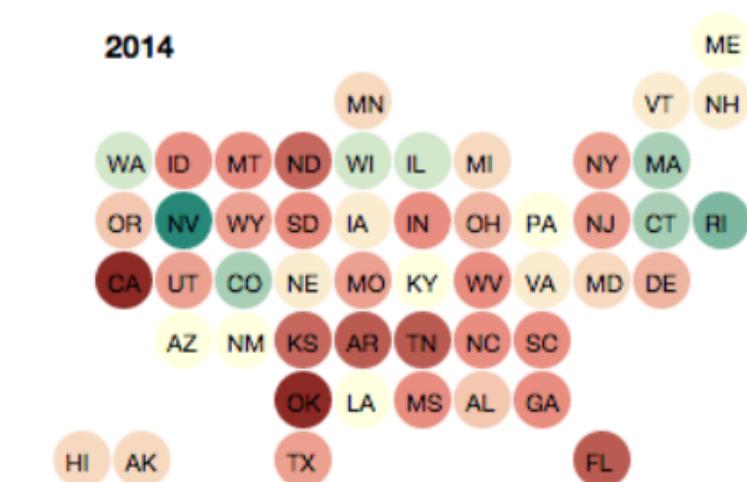
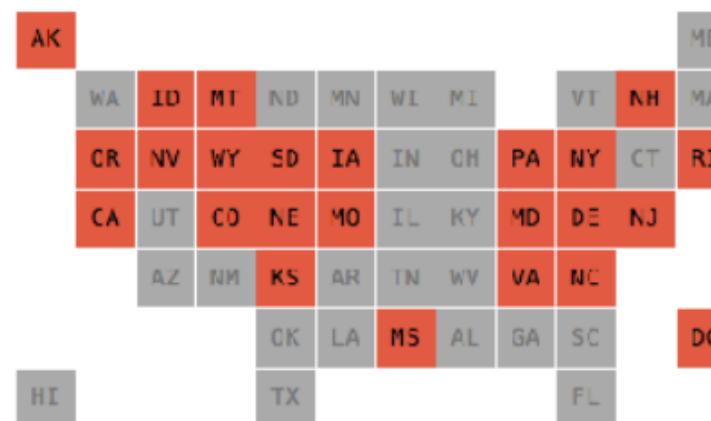
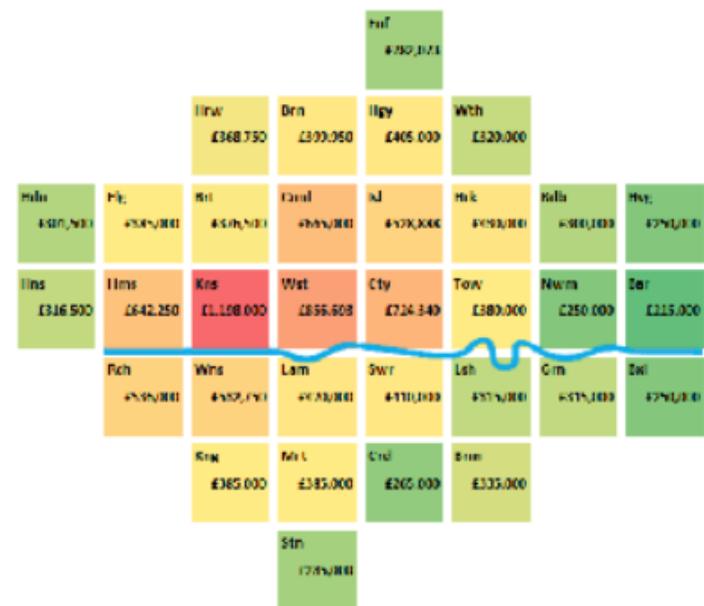
Greenhouse Emissions



Child Mortality

# Grid Cartogram

- Uniform-sized shapes arranged in rectilinear grid
- Maintain approximate spatial position and arrangement



# Cartogram: Pros & cons

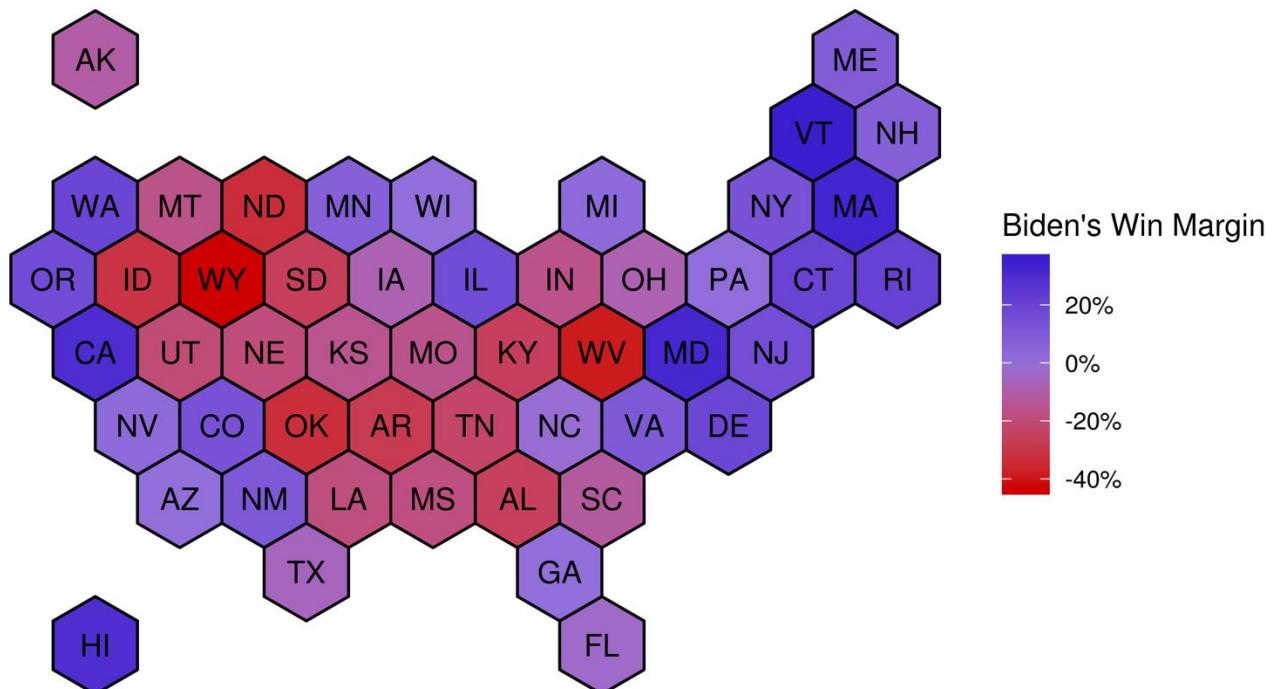
- Pros:
  - Can be intriguing and engaging
  - Best case: strong and surprising size disparities
  - Non-contiguous cartograms often easier to understand
- Cons:
  - Require substantial familiarity with original dataset & use of memory
    - Compare distorted marks to memory of original marks
    - Mitigation strategies: transitions or side by side views
  - Major distortion is problematic
    - May be aesthetically displeasing
    - May result in unrecognizable marks
  - Difficult to extract exact quantities

# Hexbin map

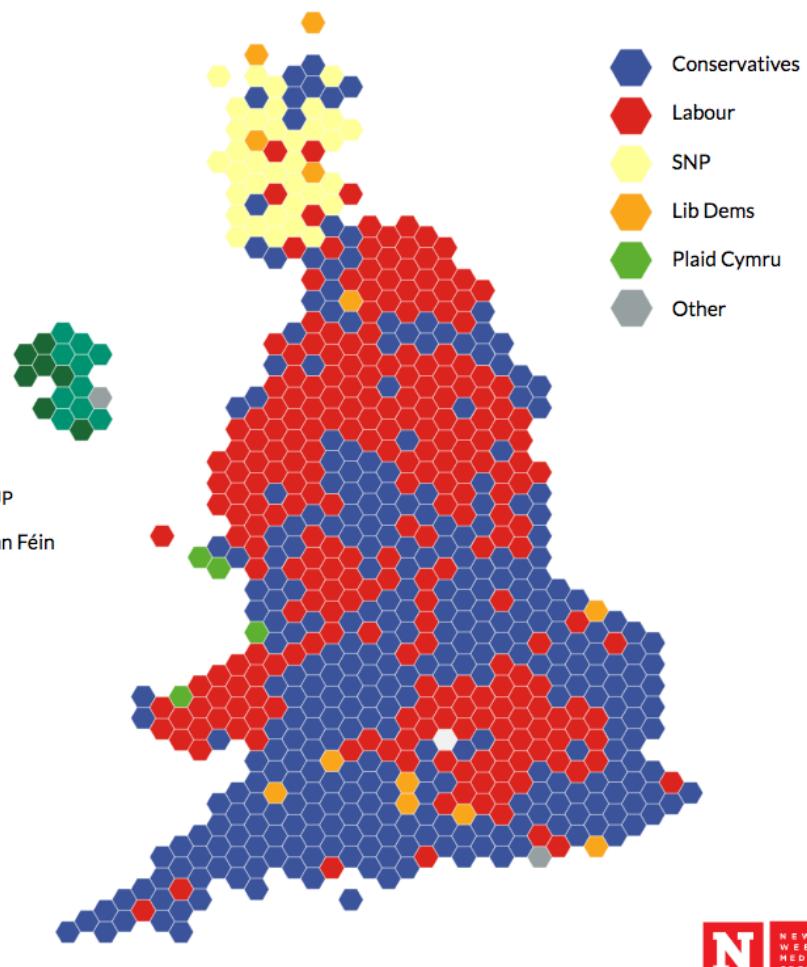
- Similar to cartograms
  - Hexbins use uniform shapes (hexagons)
    - Still a distortion from the original geographical shape

# 2020 Presidential Election Results

Combining a hexmap and gradient color scale gives us the most visually cohesive map yet, but showing each state with the same size obscures large differences in electoral importance

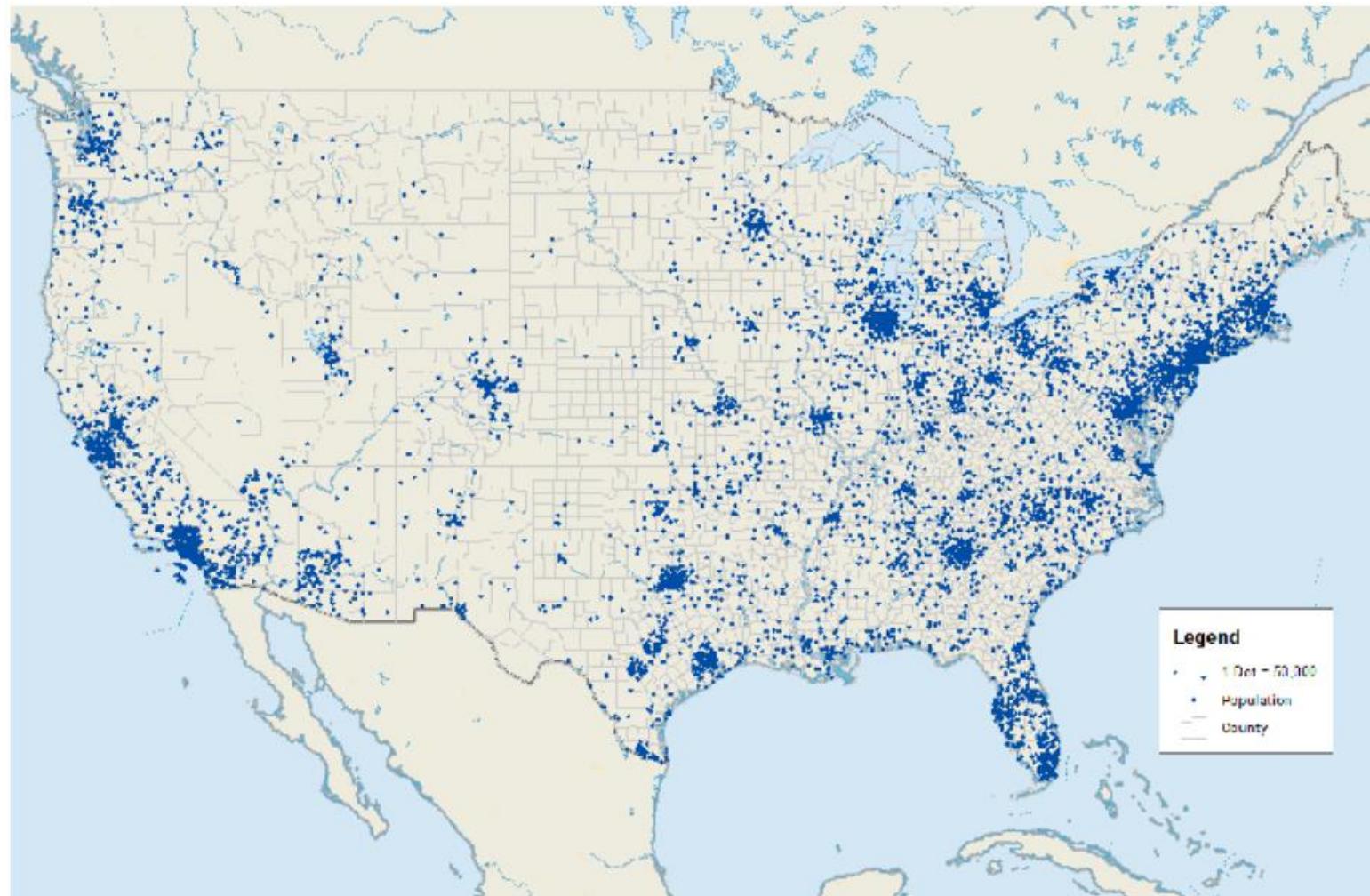


 The results



# Dot density maps

- Visualize distribution of a phenomenon by placing dots
- One symbol represents a constant number of items
  - Dots have uniform size & shape
  - Allows use of color channel
- Task: show spatial patterns, clusters



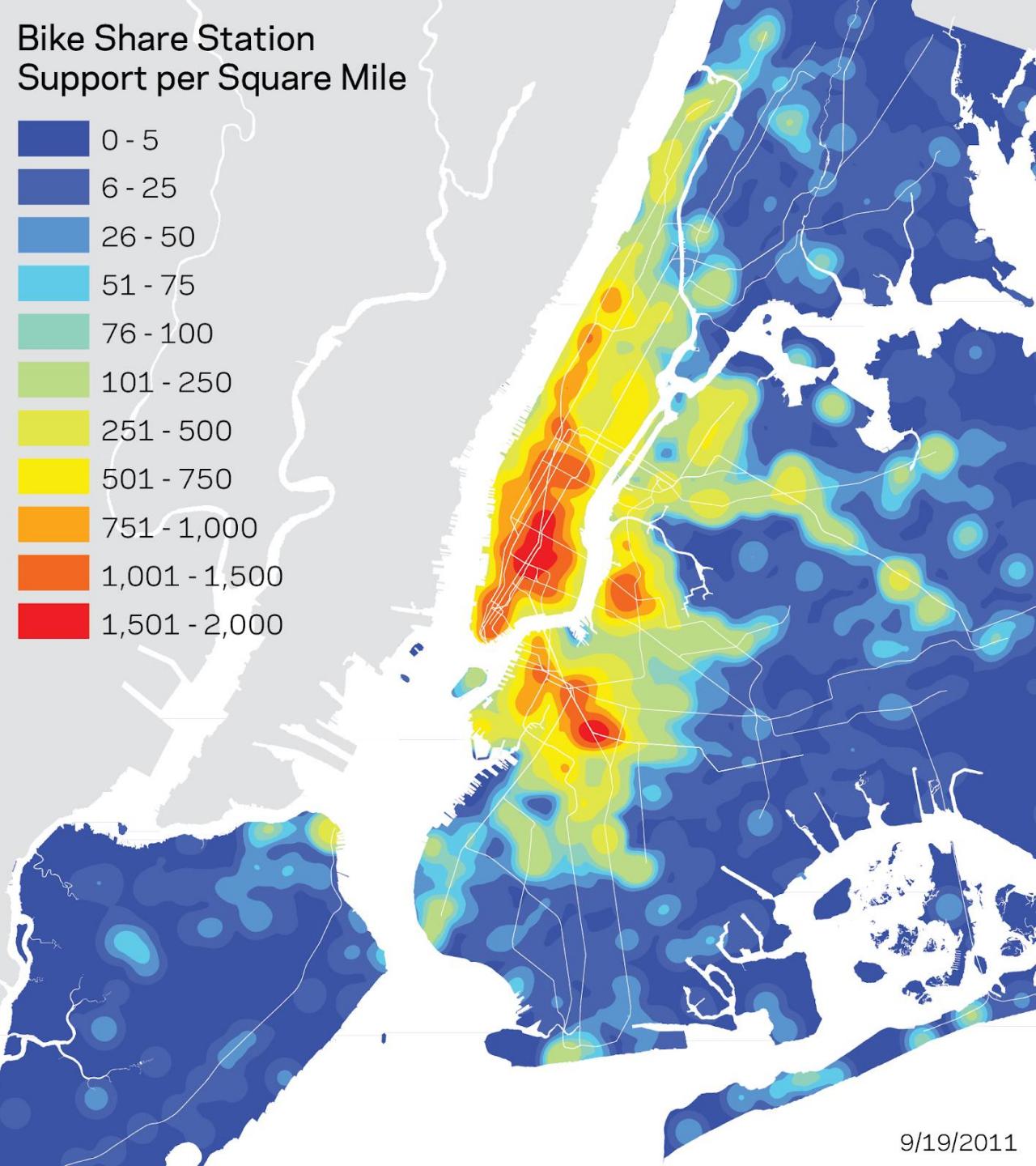
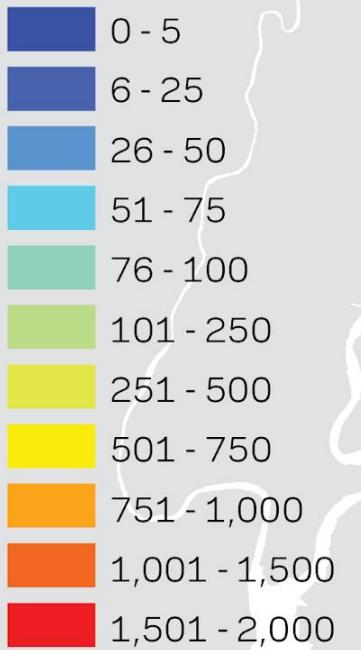
# Dot density maps: Pros and cons

- Pros:
  - Straightforward to understand
  - Avoids choropleth non-uniform region size problems
- Cons:
  - Challenge: normalization, just like choropleths
    - Show population density (correlated with attribute), not effect of interest
  - Perceptual disadvantage: difficult to extract quantities
  - Performance disadvantage: rendering many dots can be slow

# Heat maps

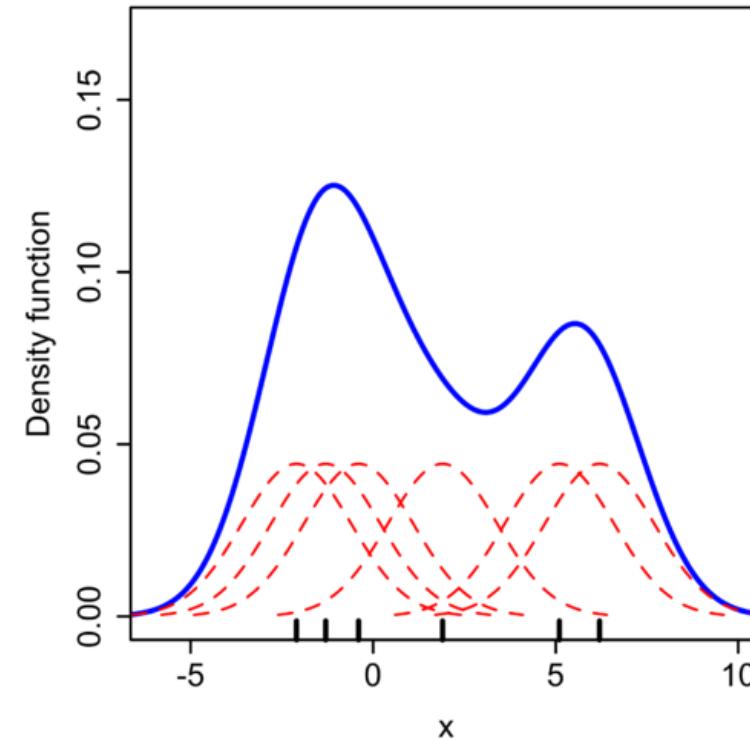
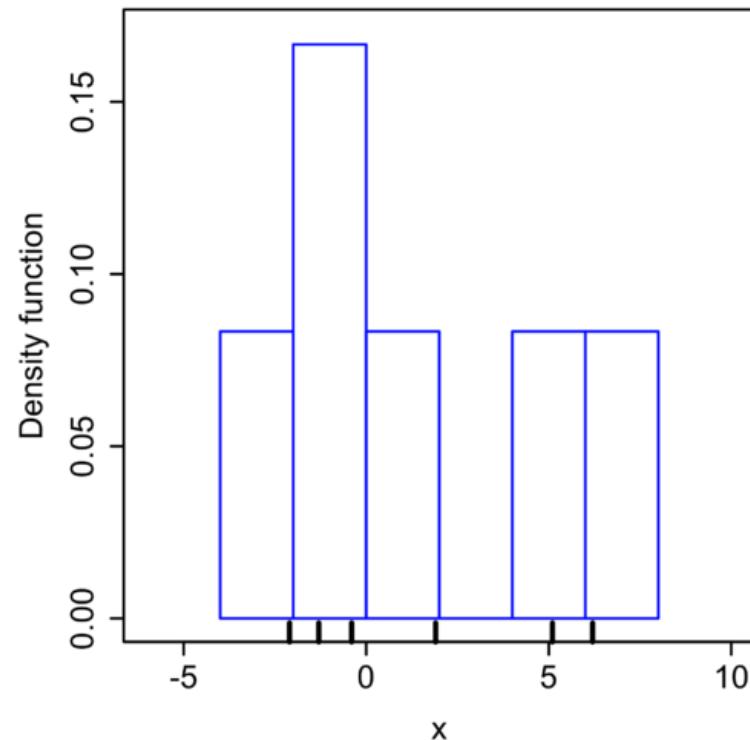
- Basically the same as dot density maps
- More continuous
  - Note: is an **estimate** of discrete data (dots)

Bike Share Station Support per Square Mile



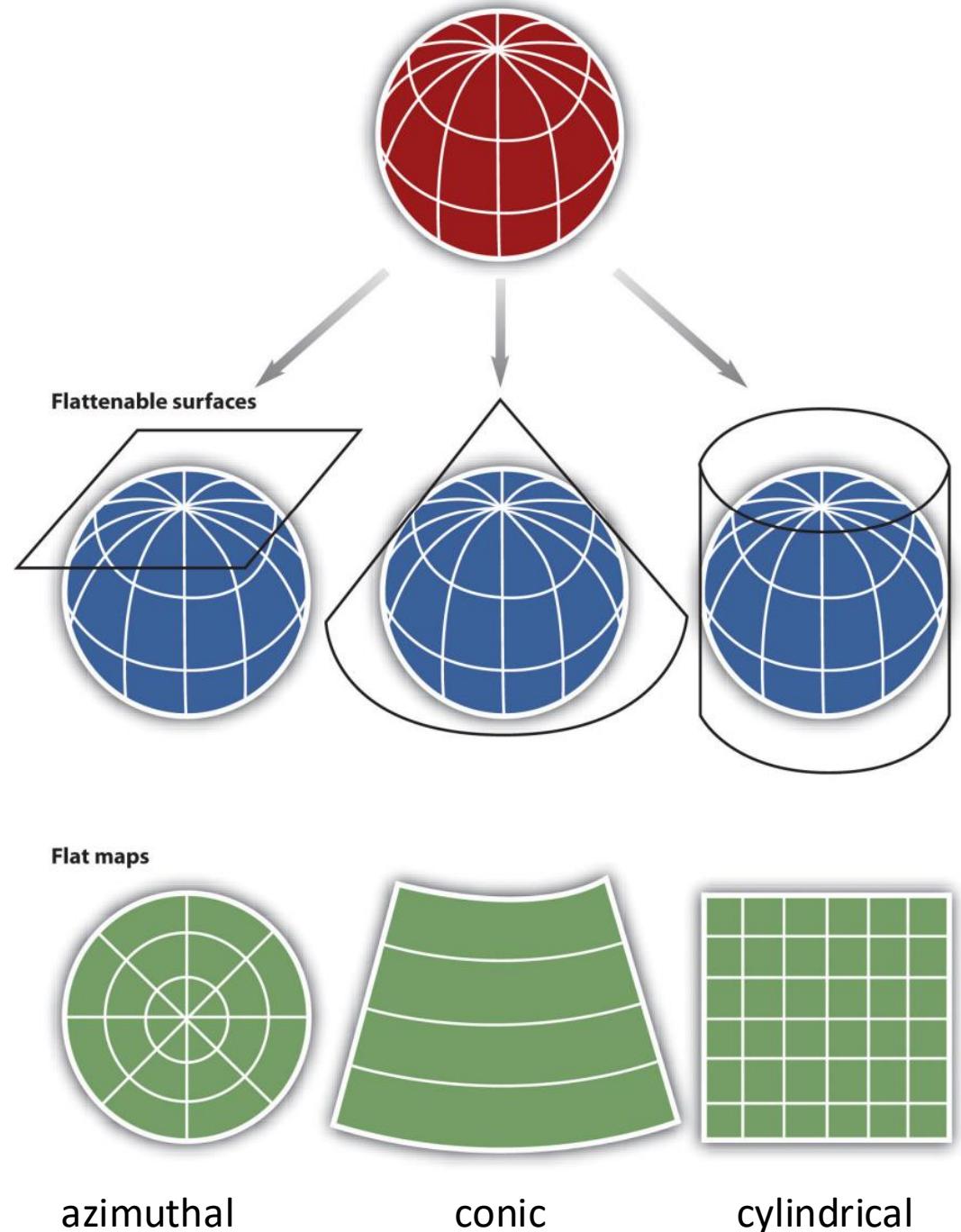
# Heat maps

- Basically the same as dot density maps
- More continuous
  - Note: is an **estimate** of discrete data (dots)
- Typically, use a “density estimation” method to estimate a continuous distribution



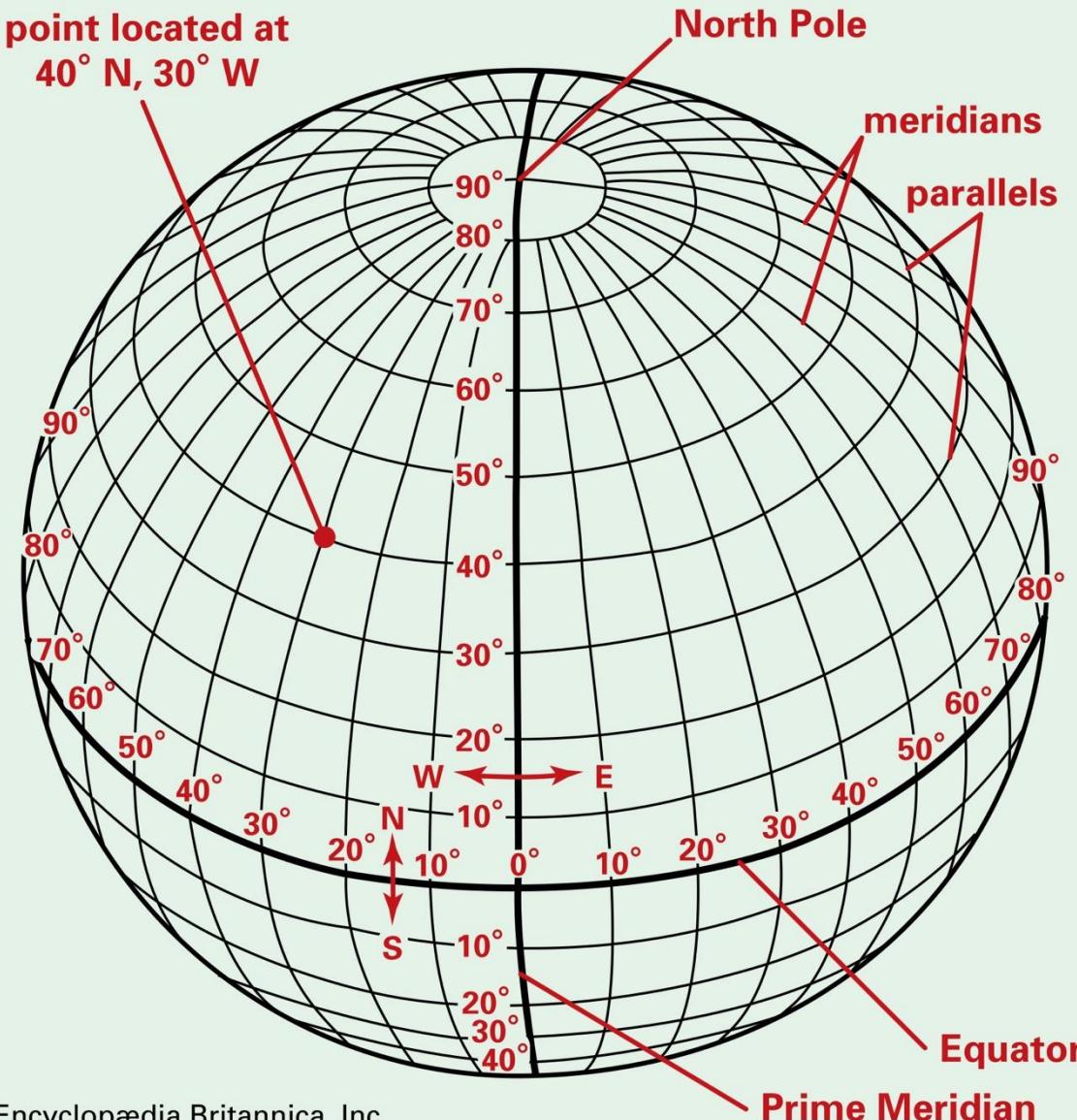
# Map Projections

- Dimensionality reduction!
  - Loss of data
- Mathematical functions that map 3D surface geometry of the Earth to 2D maps
- All projections of sphere on plane necessarily distort surface in some way

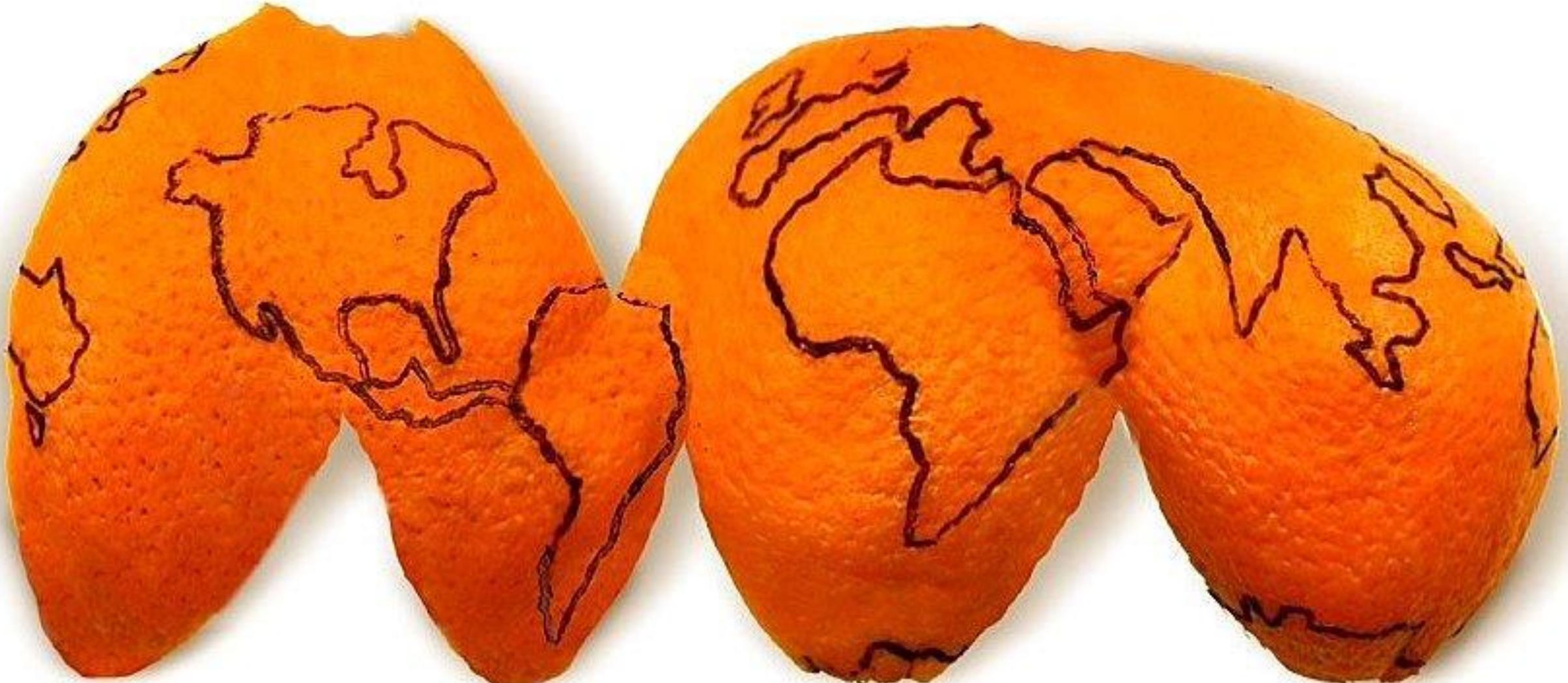


# Earth coordinates - spherical

## PARALLELS OF LATITUDE AND MERIDIANS OF LONGITUDE

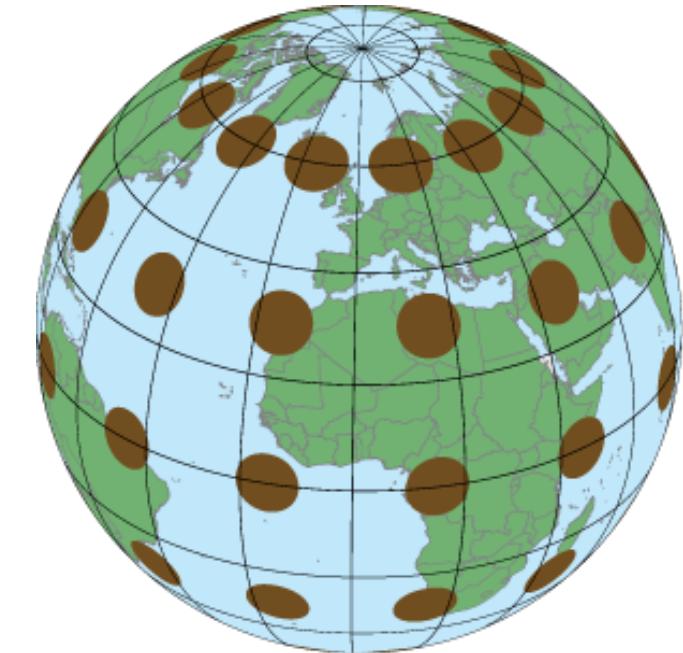


# Earth coordinates - flattened

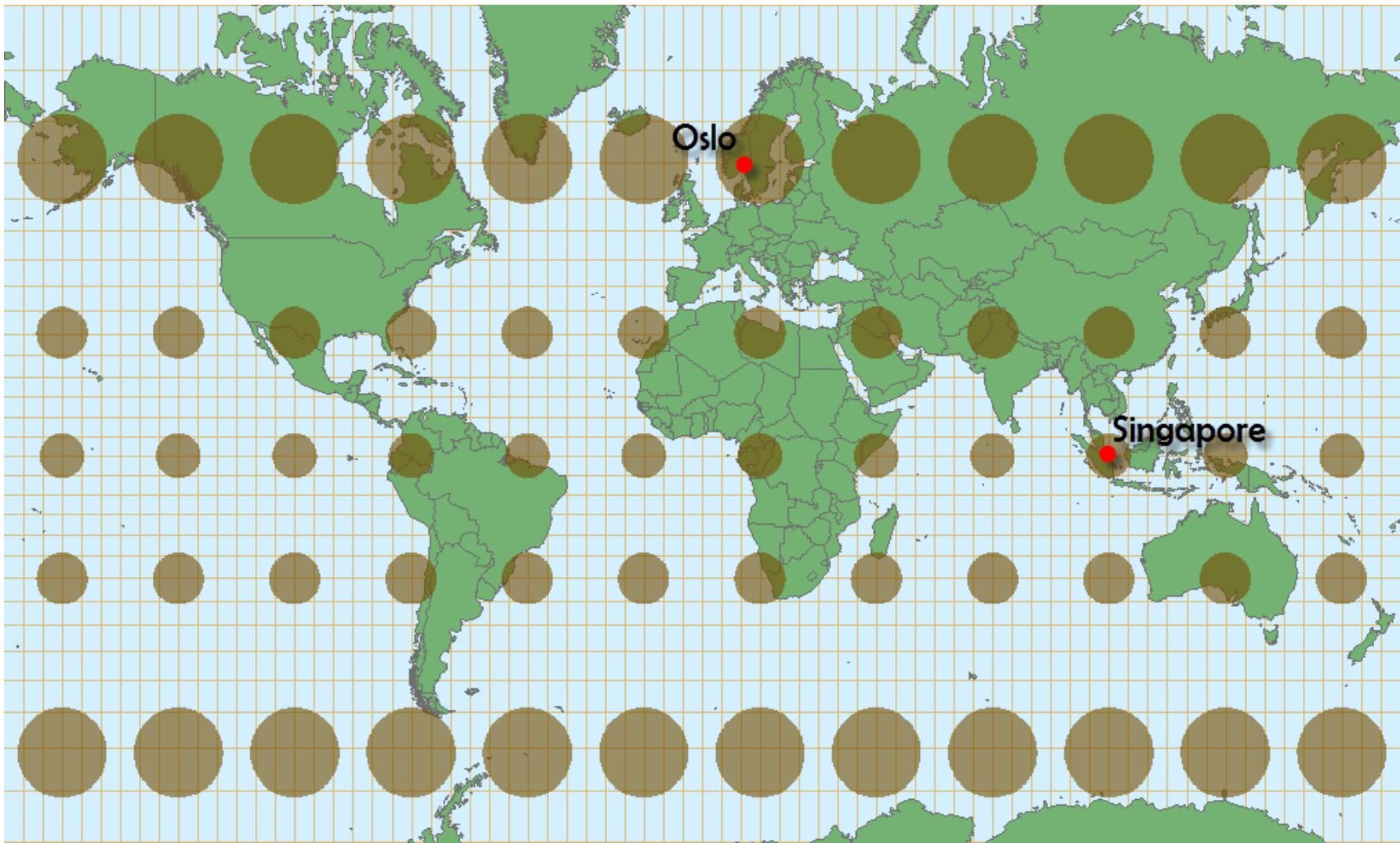


# Projection

- Data is distorted
  - Need to preserve *something* (distance, area, angle).
  - Must choose

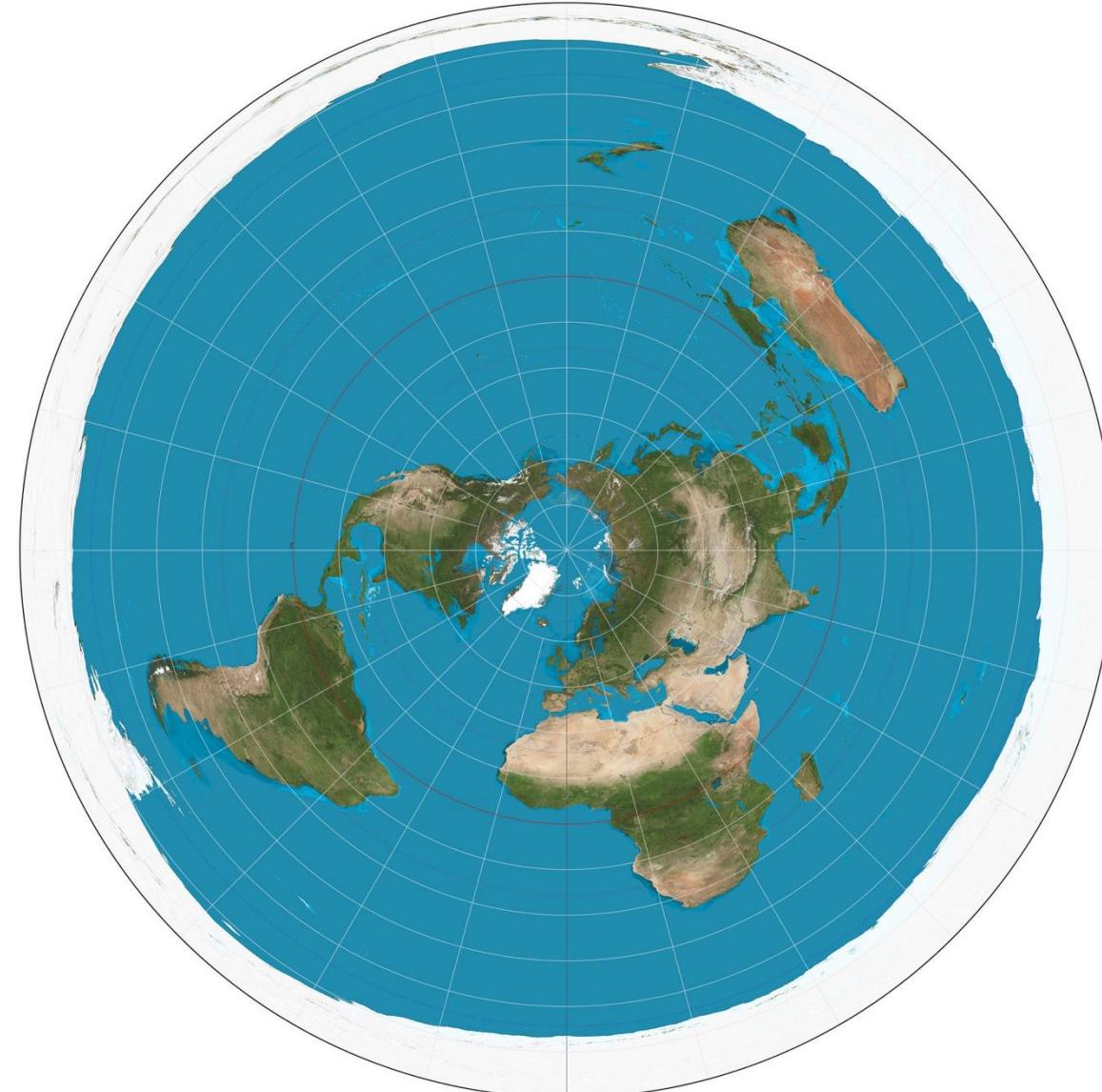


Tissot's indicatrix



# Azimuthal Equidistant

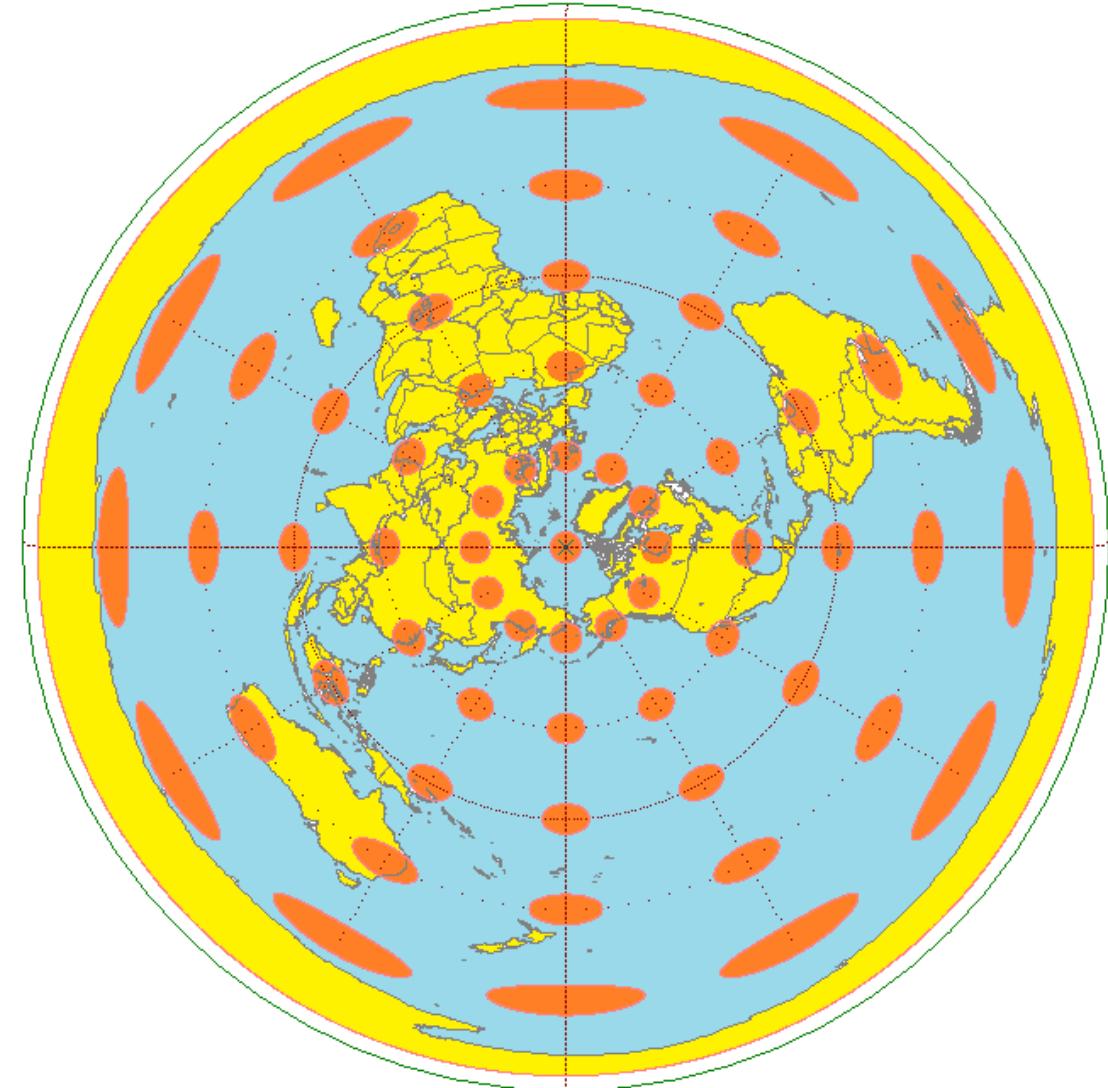
- Preserves distance and direction from center point.
- Used for travel, propagation from center point.



# Azimuthal Equidistant

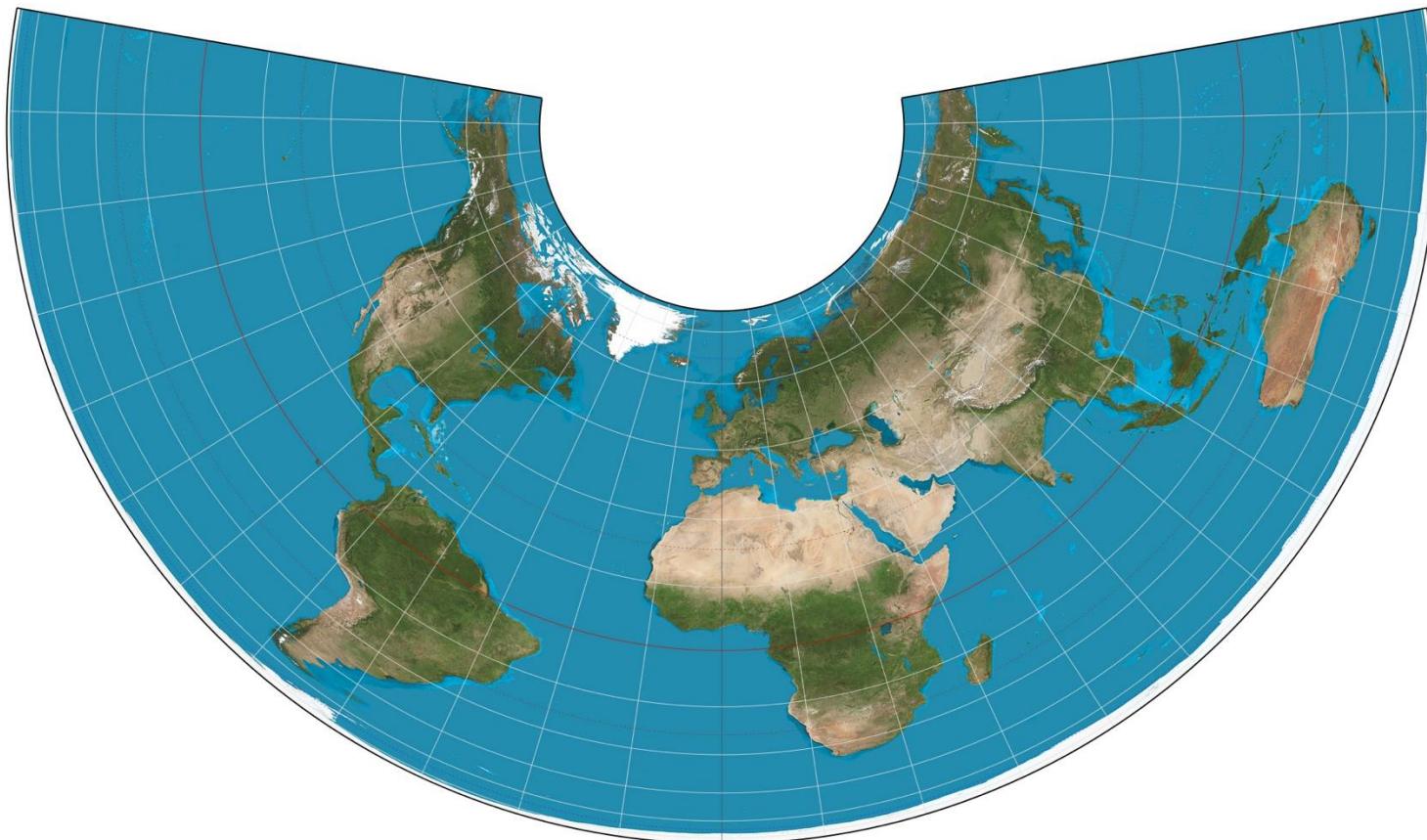
- Preserves distance and direction from center point.
- Used for travel, propagation from center point.

Tissot's indicatrix



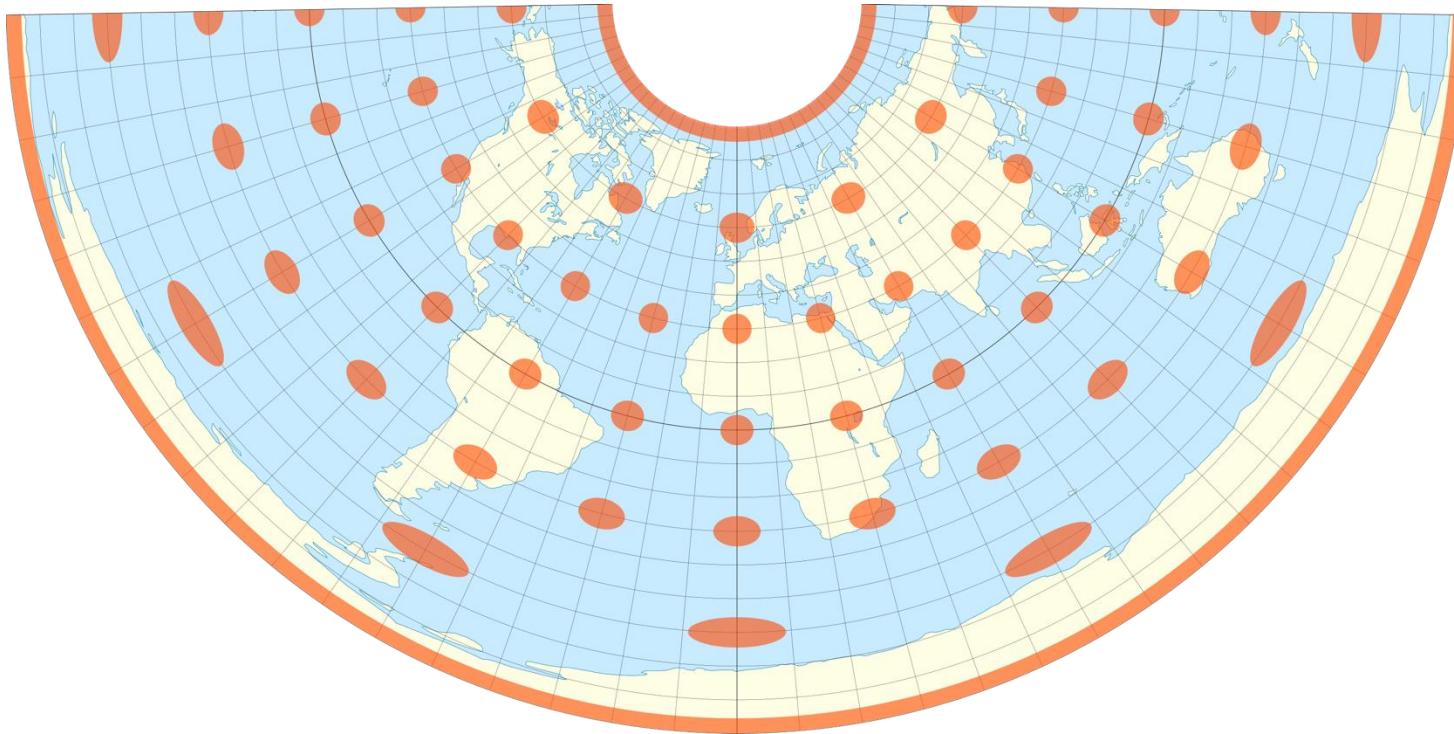
# Equidistant conic

- Preserves proportional area of regions.
- Used for land survey



# Equidistant conic

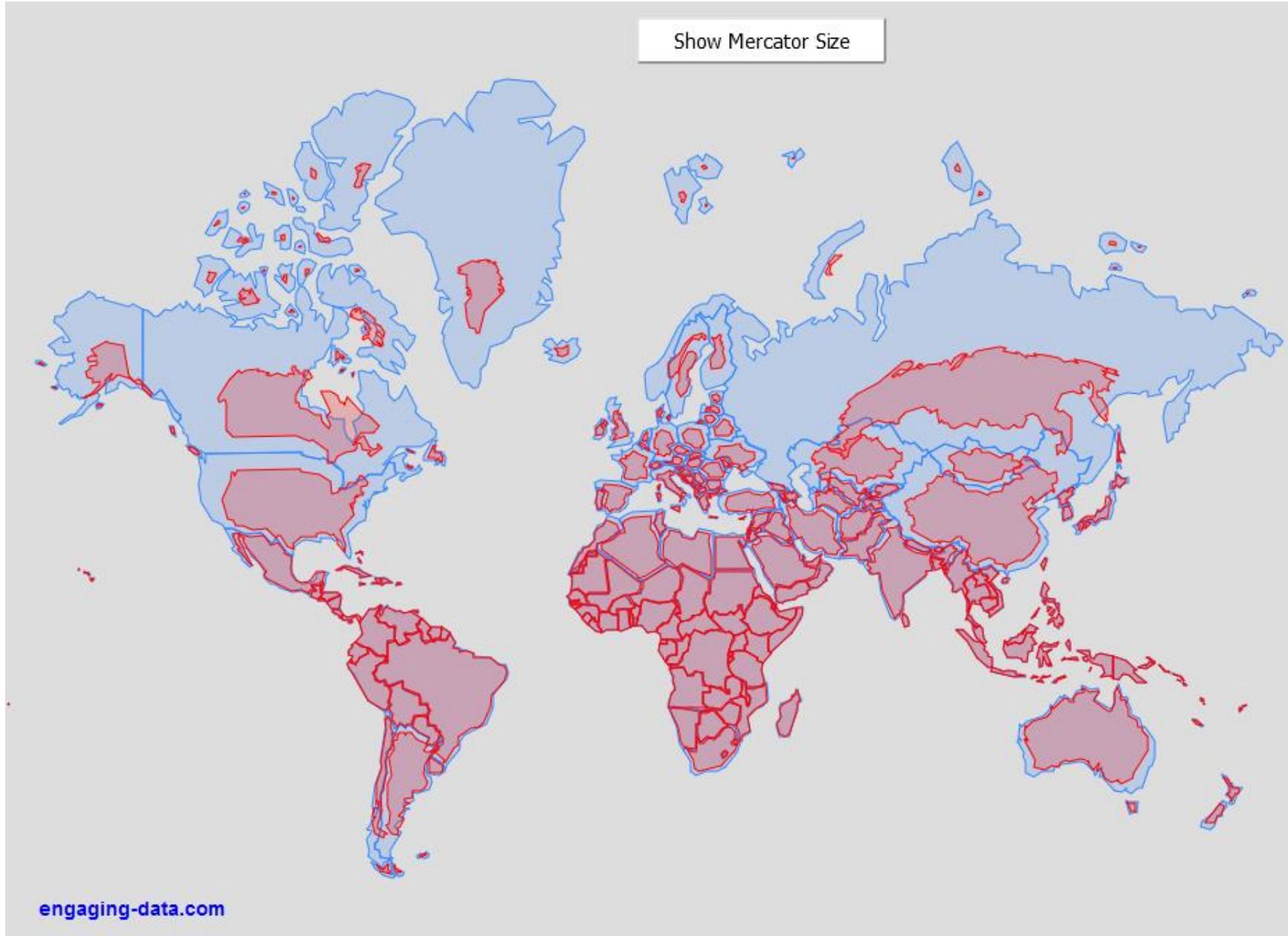
- Preserves proportional area of regions.
- Used for land survey



Tissot's indicatrix

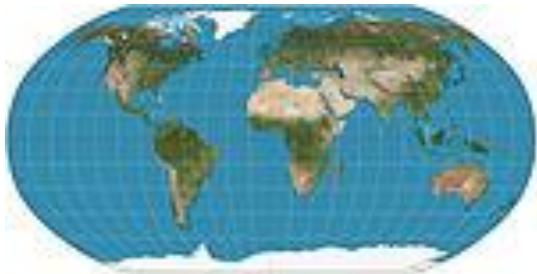
# Mercator Projection

- Preserves angle
- Used for navigation  
(and almost everything else)



# Lots of others!

- <https://philogb.github.io/page/myriahedral/> and <https://www.jasondavies.com/maps/>



Robinson



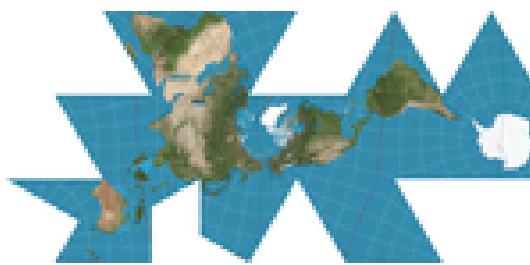
Goode homolosine



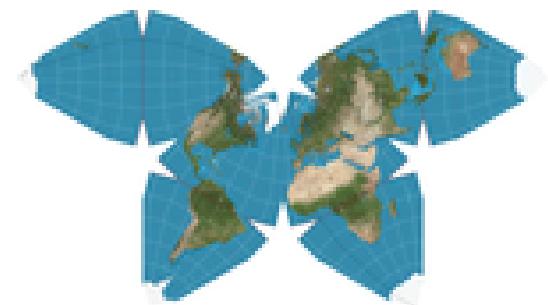
Gall-Peters



Orthographic

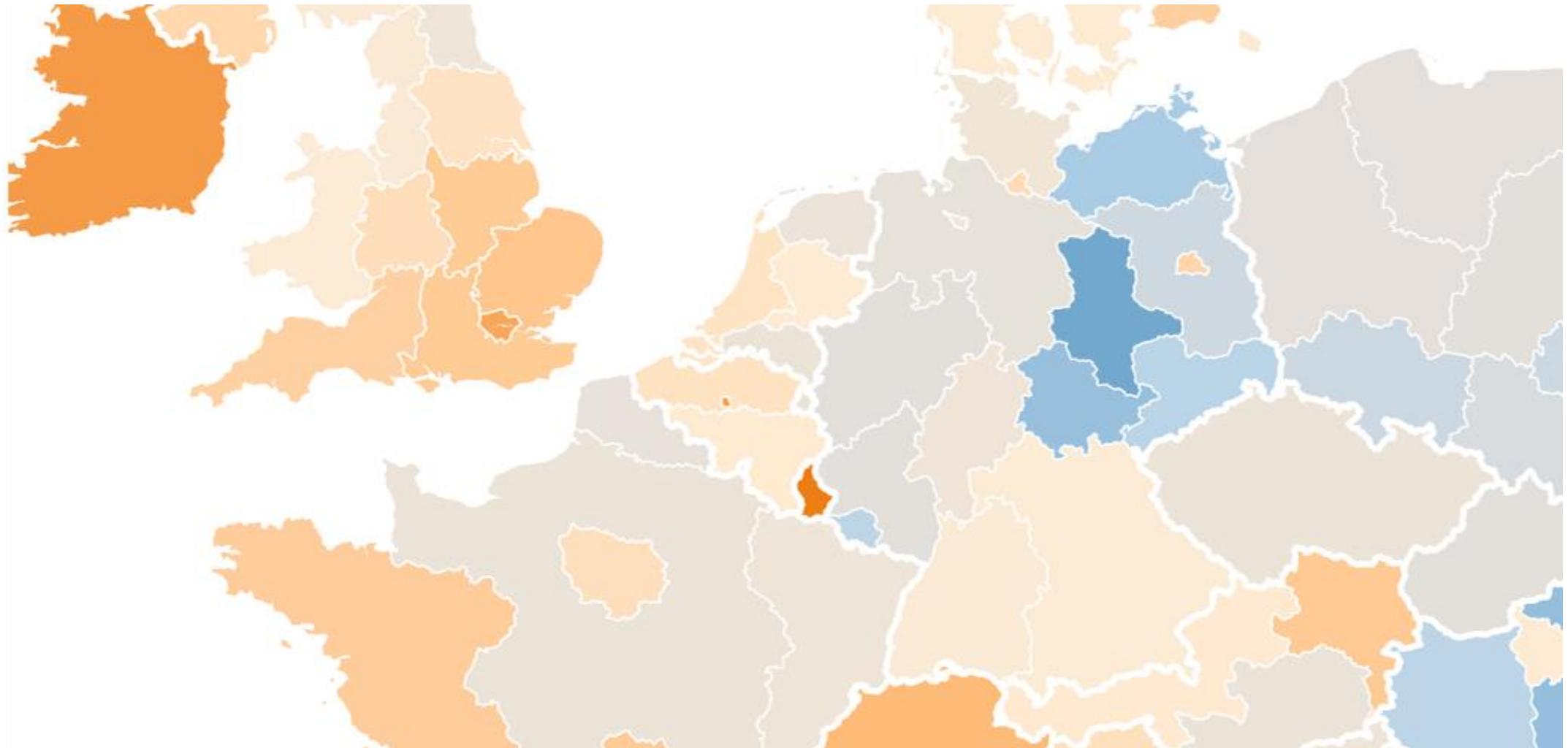


Dymaxion map



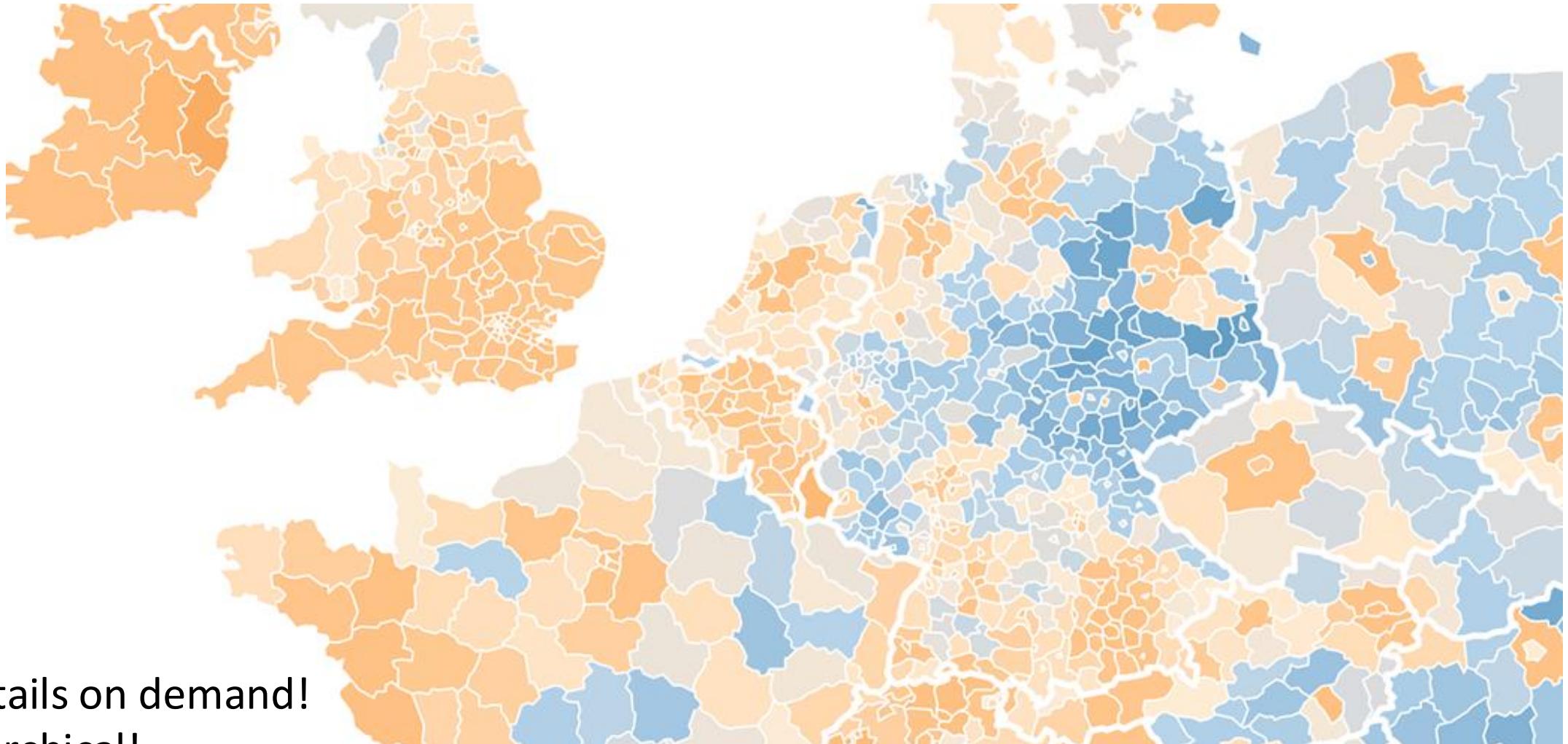
Waterman butterfly

# Level of detail



Source: <https://blog.datawrapper.de/weekly-chart-europegrowth/>

# Level of detail



- Details on demand!
- Hierarchical!

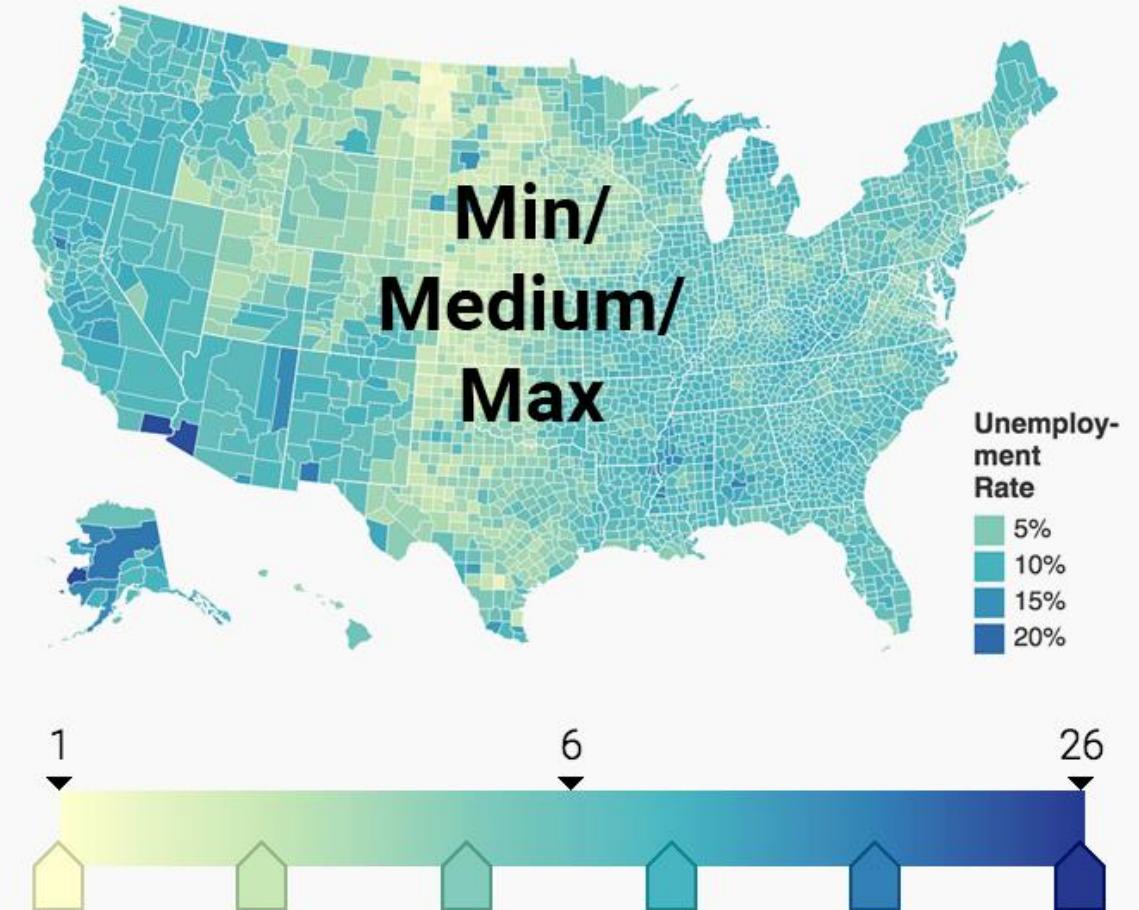
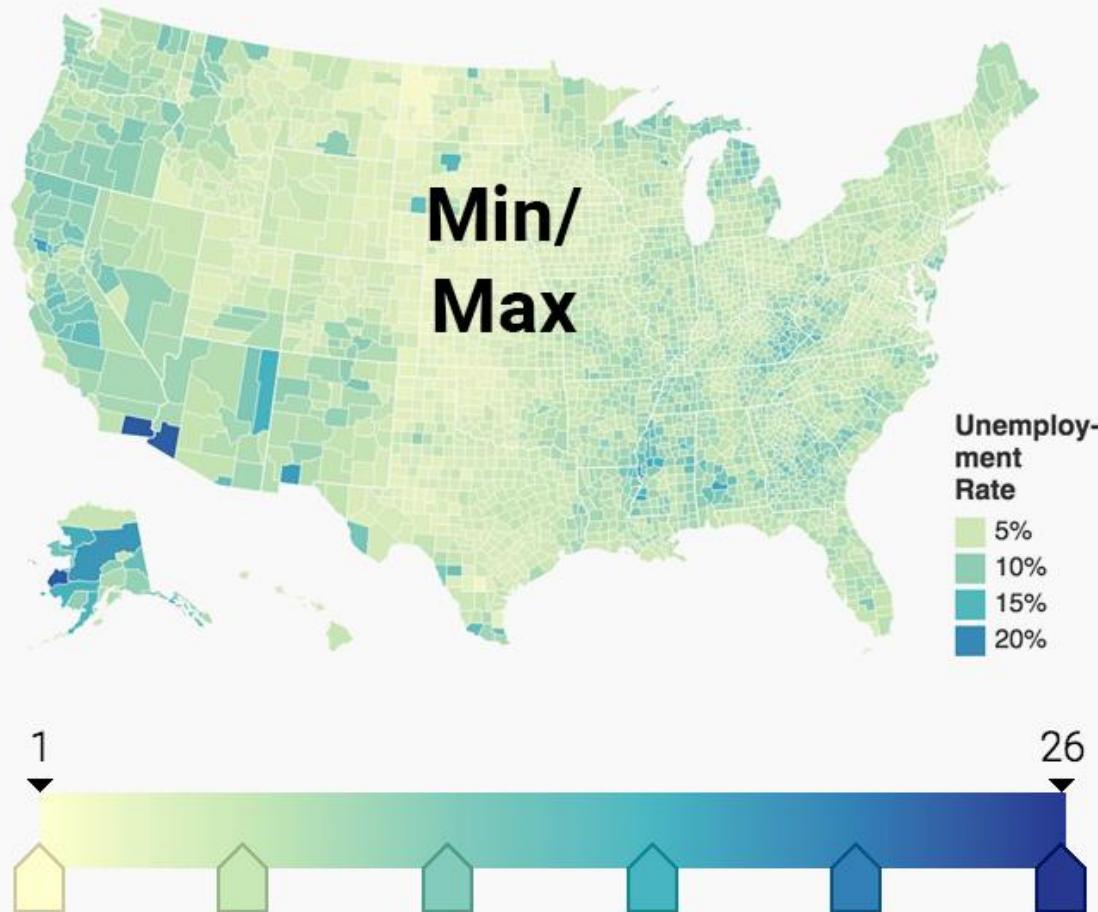
Source: <https://blog.datawrapper.de/weekly-chart-europegrowth/>



# Common Issues

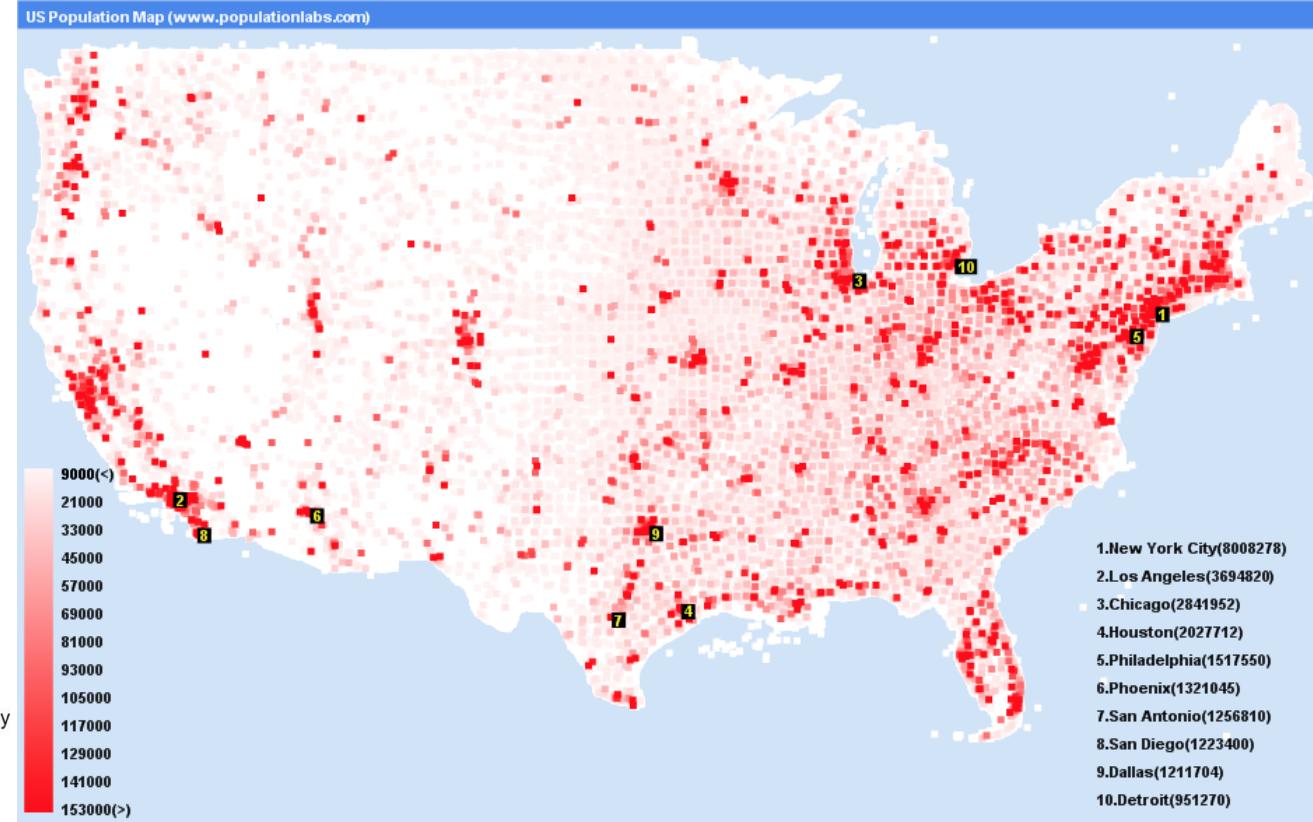
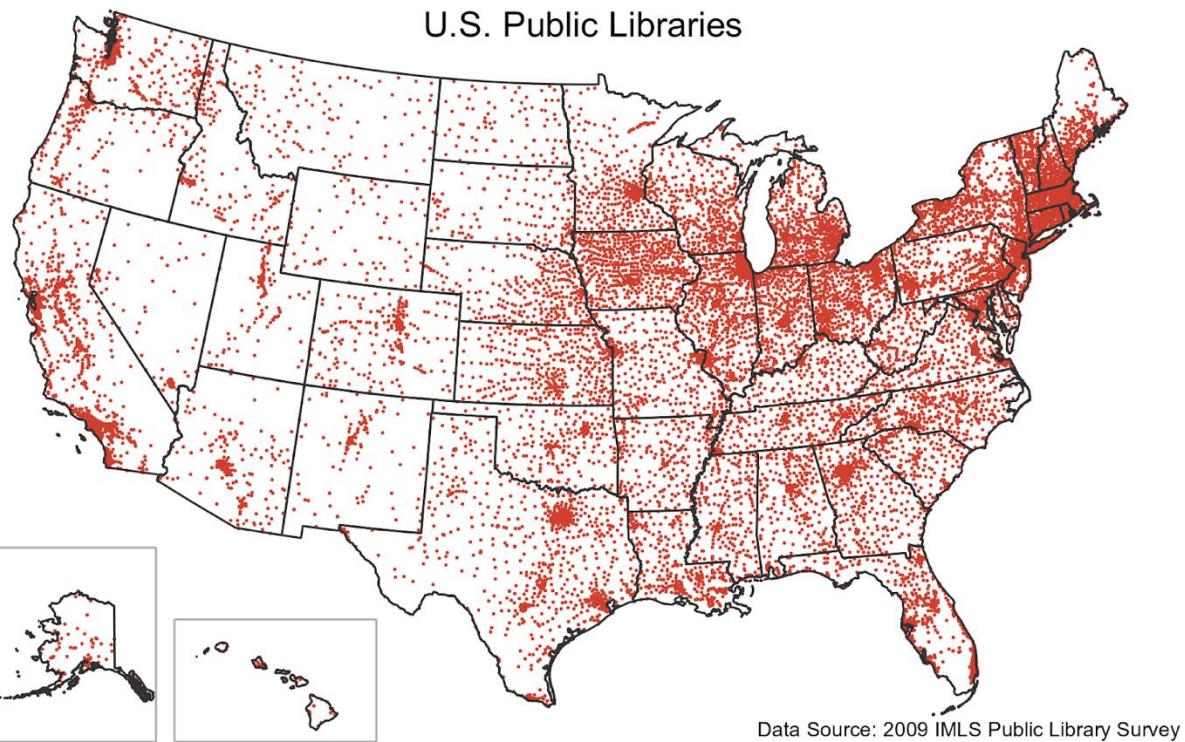
# Color matters!

- Color map and data range are important



Source: <https://academy.datawrapper.de/article/117-color-palette-for-your-map>

# Correlation with population density

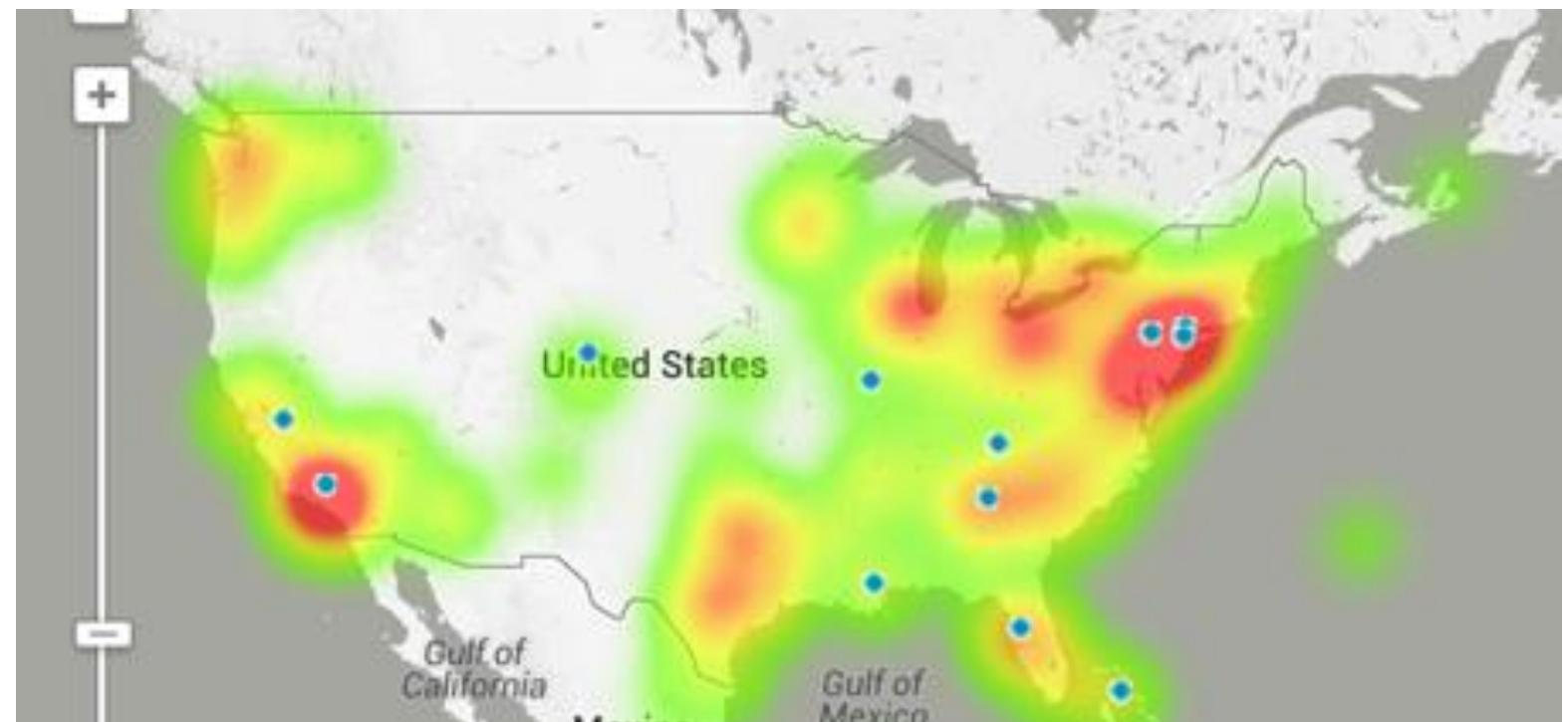


# Correlation with population density

True or False?

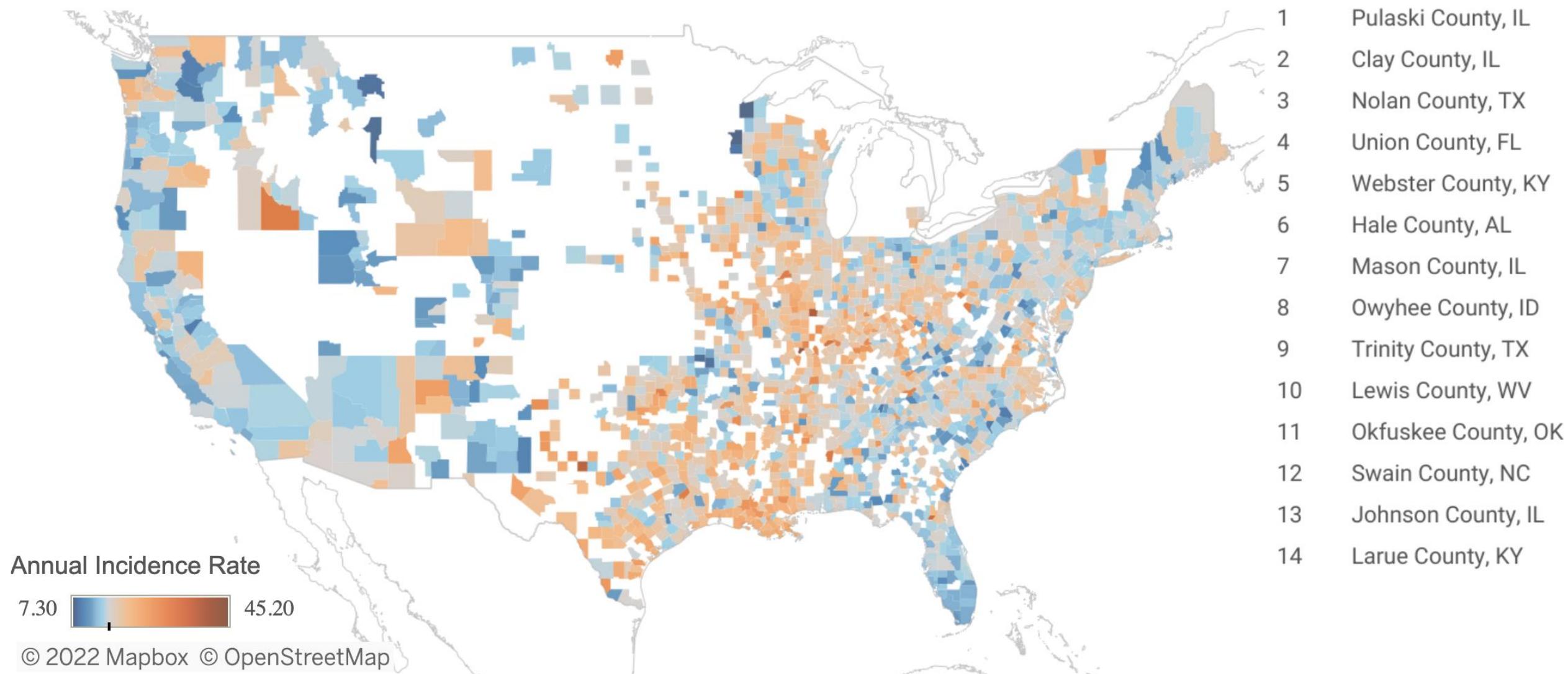
People in the west and east coast use Twitter more often than in the other regions.

Average Volume of Twitter Messages Posted in a Day



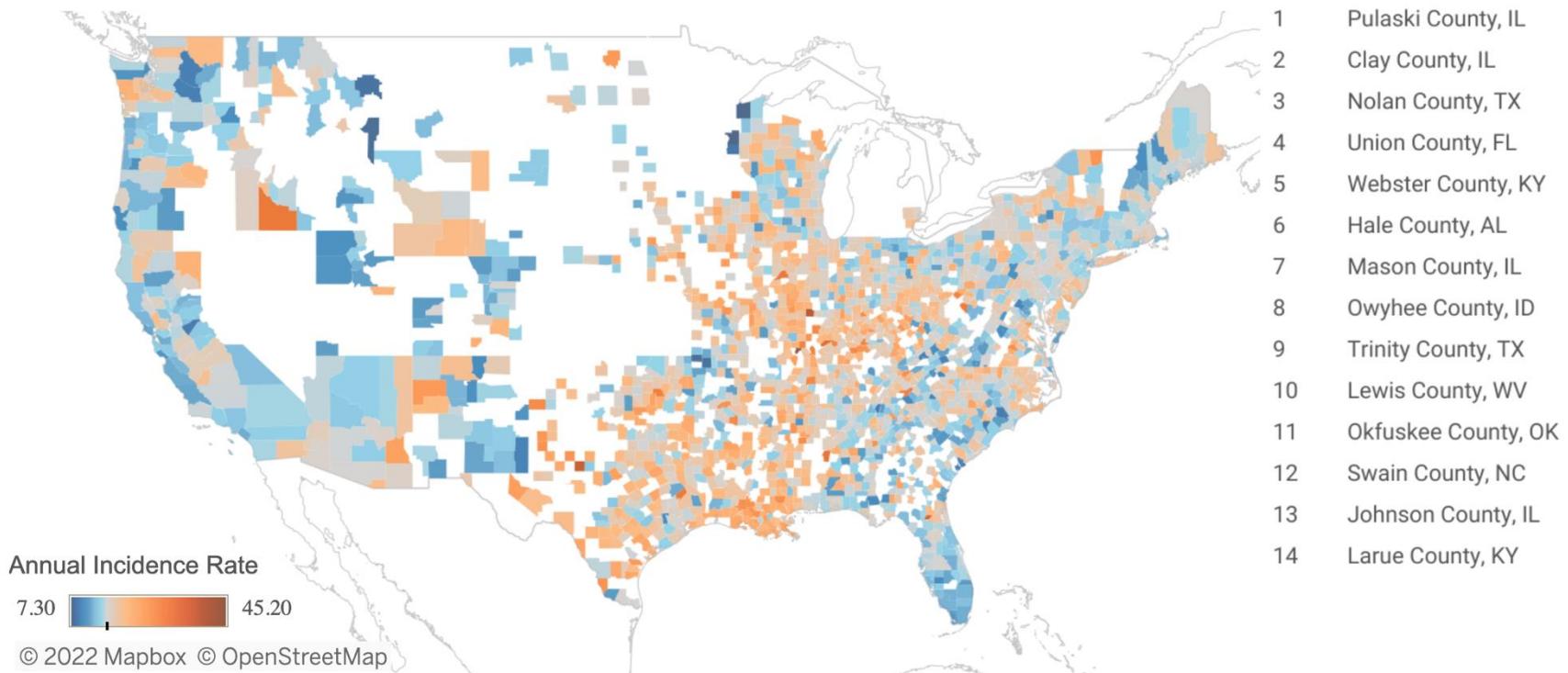
# Insensitivity to Sample Size

## Kidney Cancer and Insensitivity to Sample Size



Source: <https://dataremixed.com/2015/01/avoiding-data-pitfalls-part-2/>

# Kidney Cancer and Insensitivity to Sample Size



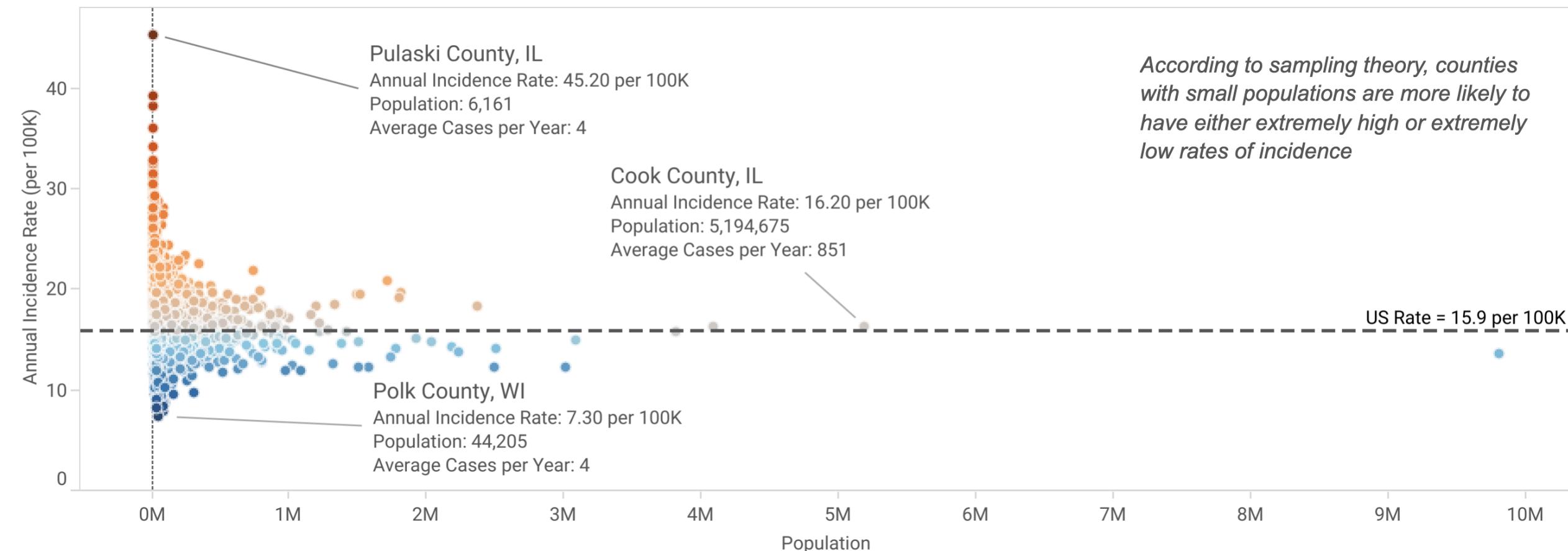
Wainer, Howard, and Harris L. Zwerling. "Evidence that smaller schools do not improve student achievement." *Phi Delta Kappan* 88.4 (2006): 300-303.

*"The counties in which the incidence of kidney cancer is **lowest** are mostly rural, sparsely populated, and located in traditionally Republican states in the Midwest, the South, and the West."* p.109

*"Now consider the counties in which the incidence of kidney cancer is **highest**. These ailing counties tend to be mostly rural, sparsely populated, and located in traditionally Republican states in the Midwest, the South, and the West."*

Source: <https://dataremixed.com/2015/01/avoiding-data-pitfalls-part-2/>

# Insensitivity to Sample Size

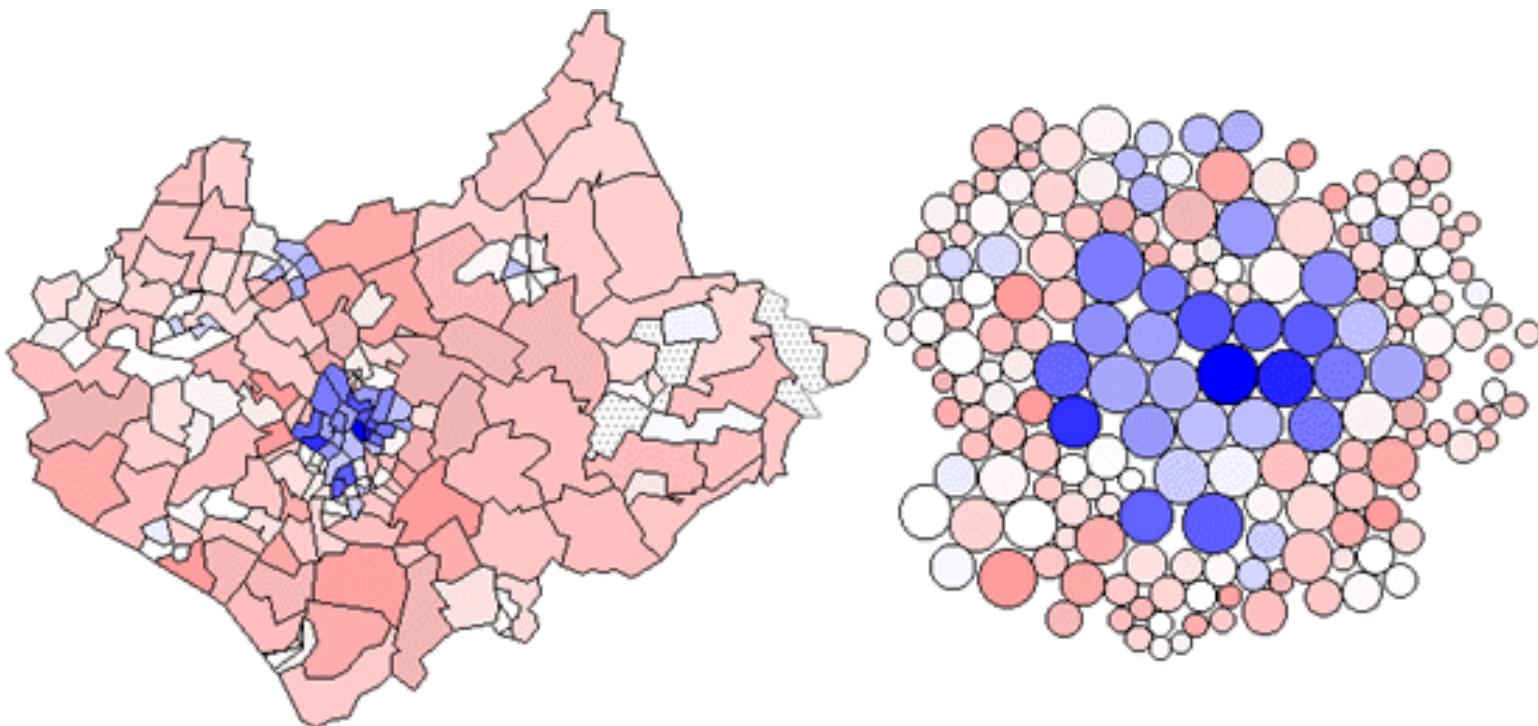


# Skewed Spatial Distributions



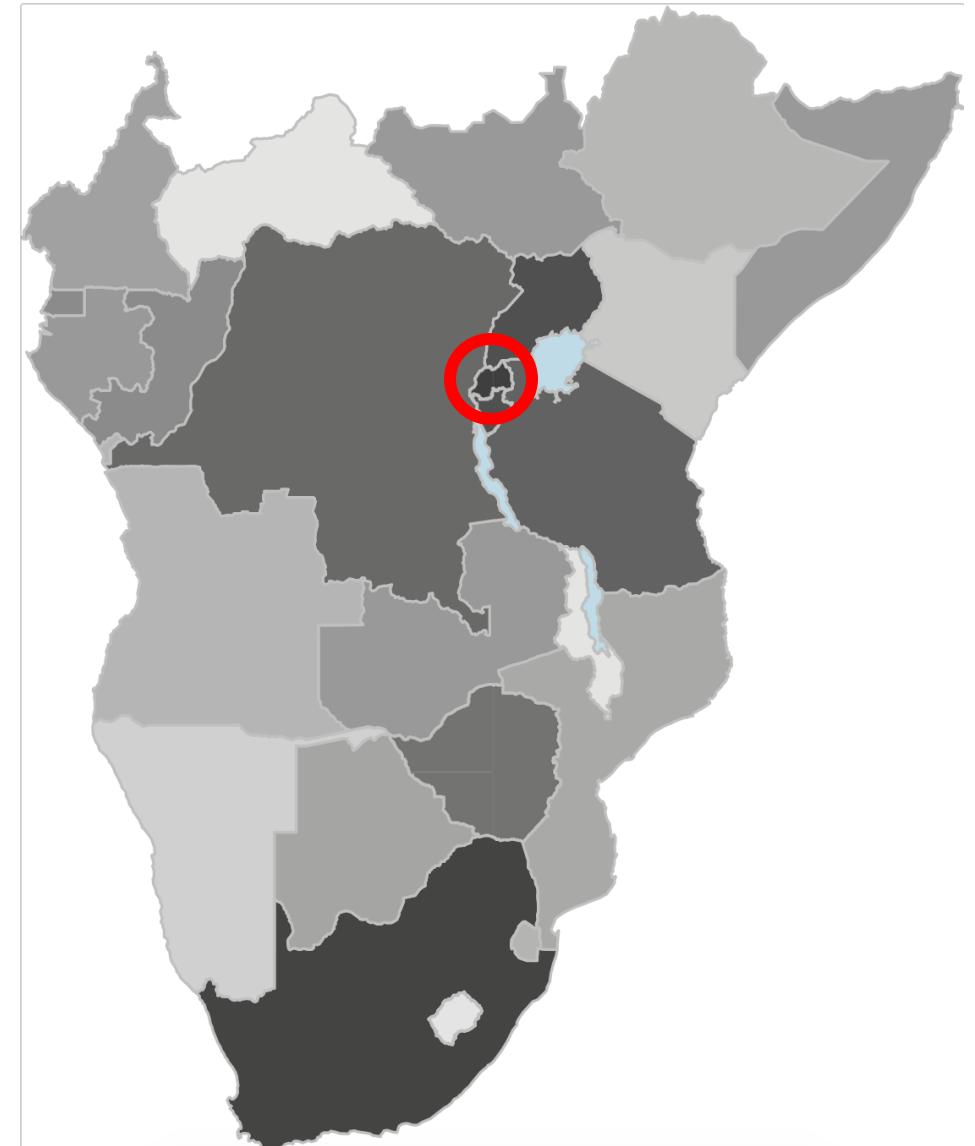
# Skewed Spatial Distributions

- Dorling Cartogram
  - Regions are represented by symbols instead of region borders.
  - Symbol size is not proportional to region size.
  - Topological relationship is preserved approximately.

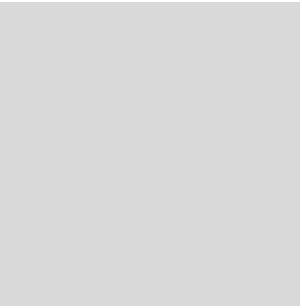


# Perception issues

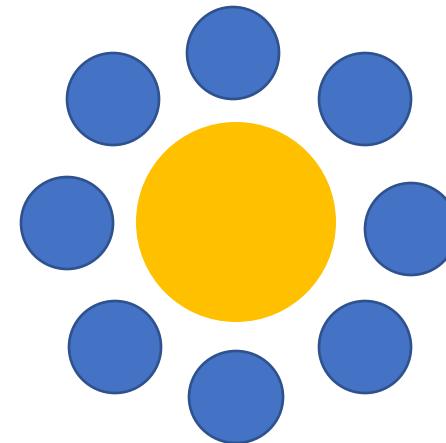
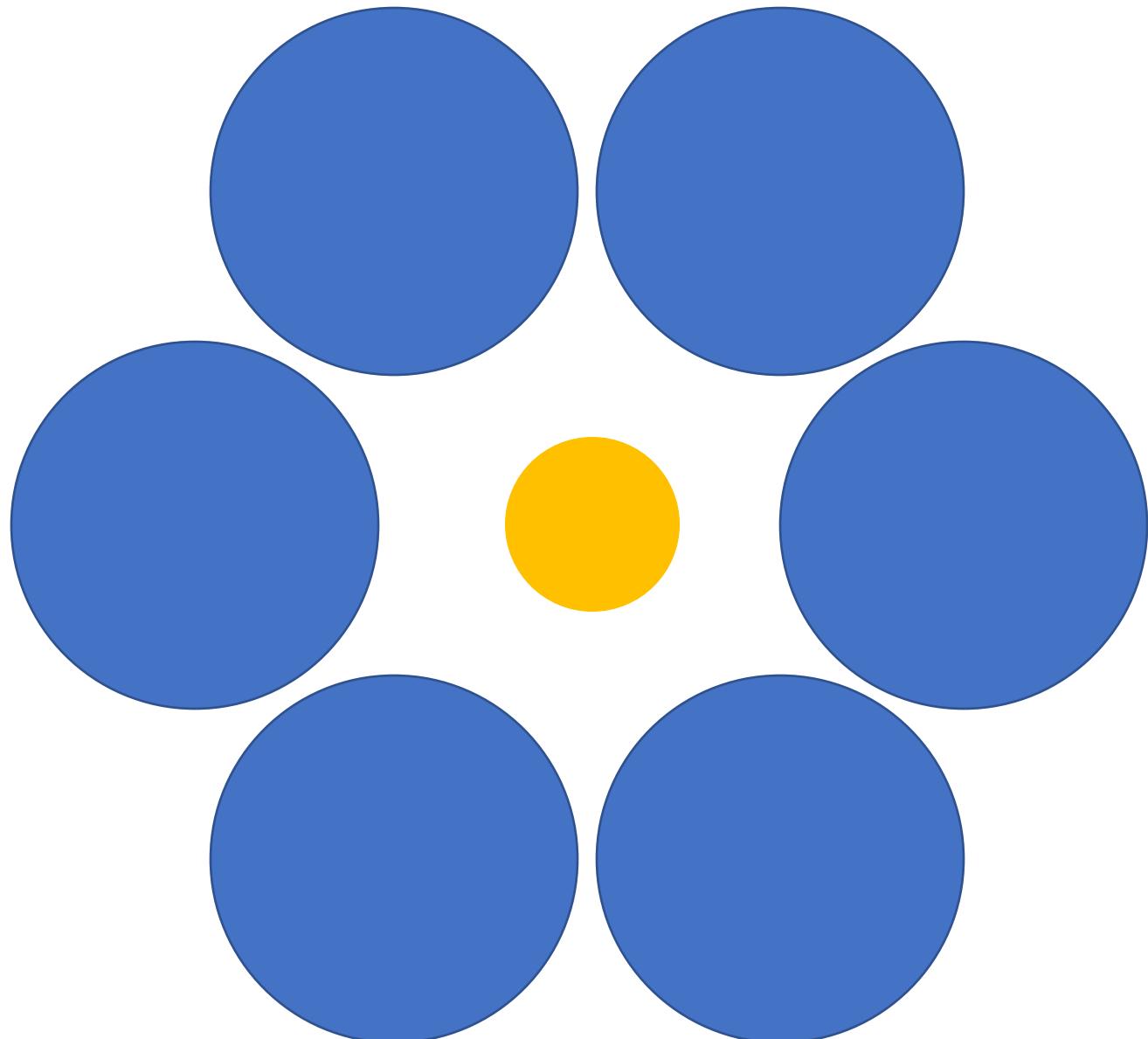
- Which country in Africa has the highest value?
- Why?
  - Color perception is highly affected by size.
  - Color of the surrounding regions affects the way we perceive color.



# Perception issues



# Perception issues





# Other types of spatial data

# Topographic map

- Data format is:
  - Geographic geometry
  - Scalar spatial field
    - 1 quant attribute per grid cell
- Visualize derived data
  - Isoline geometry
    - Isocontours computed for specific levels of scalar values
- Task:
  - Understanding terrain shape
    - Densely lined regions = steep



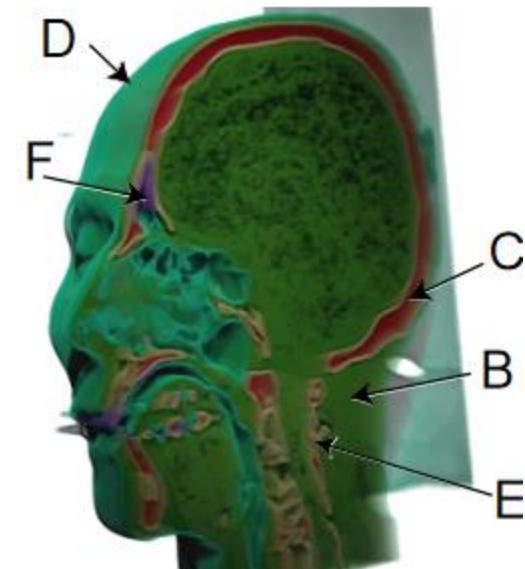
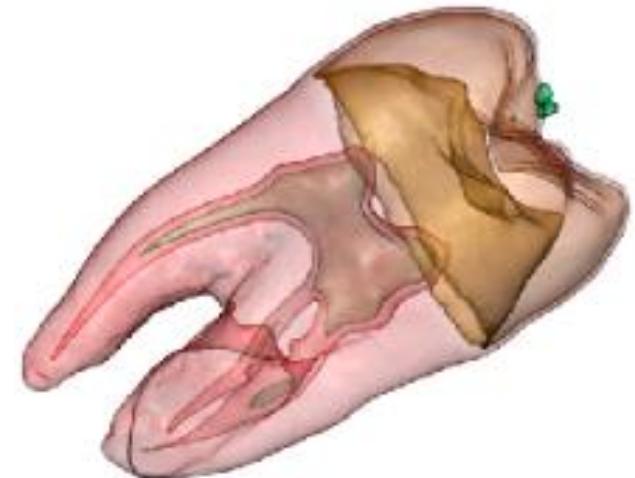
# Topographic map: pros and cons

- Pros:
  - use only 2D position, avoid 3D challenges
  - color channel available for other attributes
- Cons:
  - significant clutter from additional lines



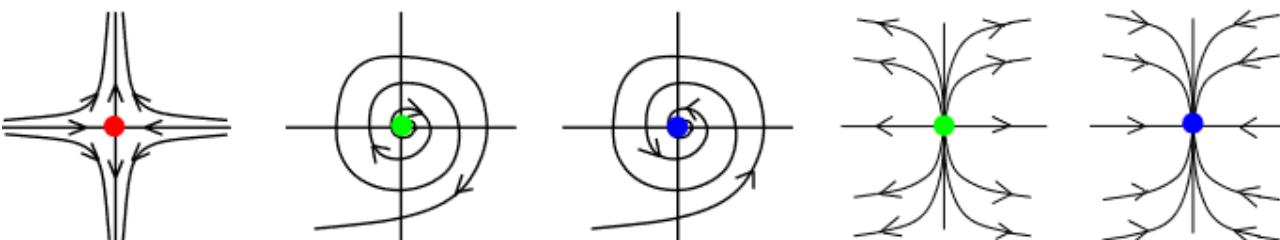
# Isosurfaces & direct volume rendering

- Data format is:
  - Scalar spatial field (3D volume)
    - 1 quant attribute per grid cell
- Task:
  - Shape understanding & spatial relationship
- Isosurface
  - Derived data: isocontours computed for specific levels of scalar values
- Direct volume rendering
  - Transfer function maps scalar values to color, opacity
    - No derived geometry → comes from the data

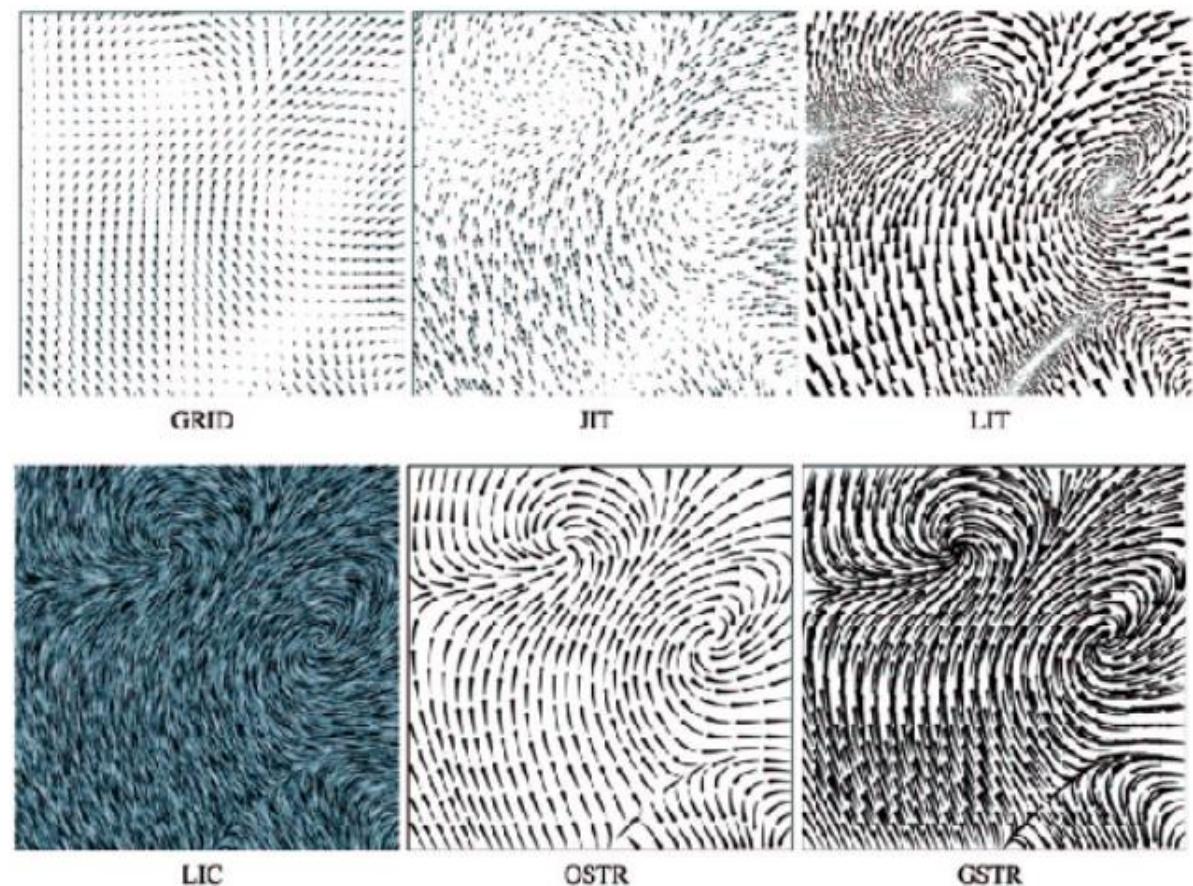


# Vector and tensor fields

- Data format:
  - Multiple attributes per cell (vector → 2 attributes)
- Tasks:
  - Find critical points, identify their types
  - Identify what type of critical point at a specific location
  - Predicting where a particle will end up based on starting position



Topology tracking for the visualization of time-dependent two-dimensional flows.  
Tricoche, Wischgoll, Scheuermann, and Hagen. Computers & Graphics 26:2 (2002), 249–257



Comparing 2D vector field visualization methods: A user study. Laidlaw et al. IEEE Trans. Visualization and Computer Graphics (TVCG) 11:1 (2005), 59–70.



# Break

# Final Project Time

- Find partners
- Brainstorm ideas
- Ask me questions