

# Data Visualization and Visual Analytics

## Visualization of Geographic Data

Study Program Data Science  
Prof. Dr. Tillmann Schwörer

# Lecture Roadmap

## Data Domains

Comparing Categories | Relationships | Geospatial | Time |  
Part-to-whole | Distributions | Uncertainty | ...

Storytelling

Perception +  
Visualization Design

Python + Tools

Interactive  
Visualization

# Roadmap



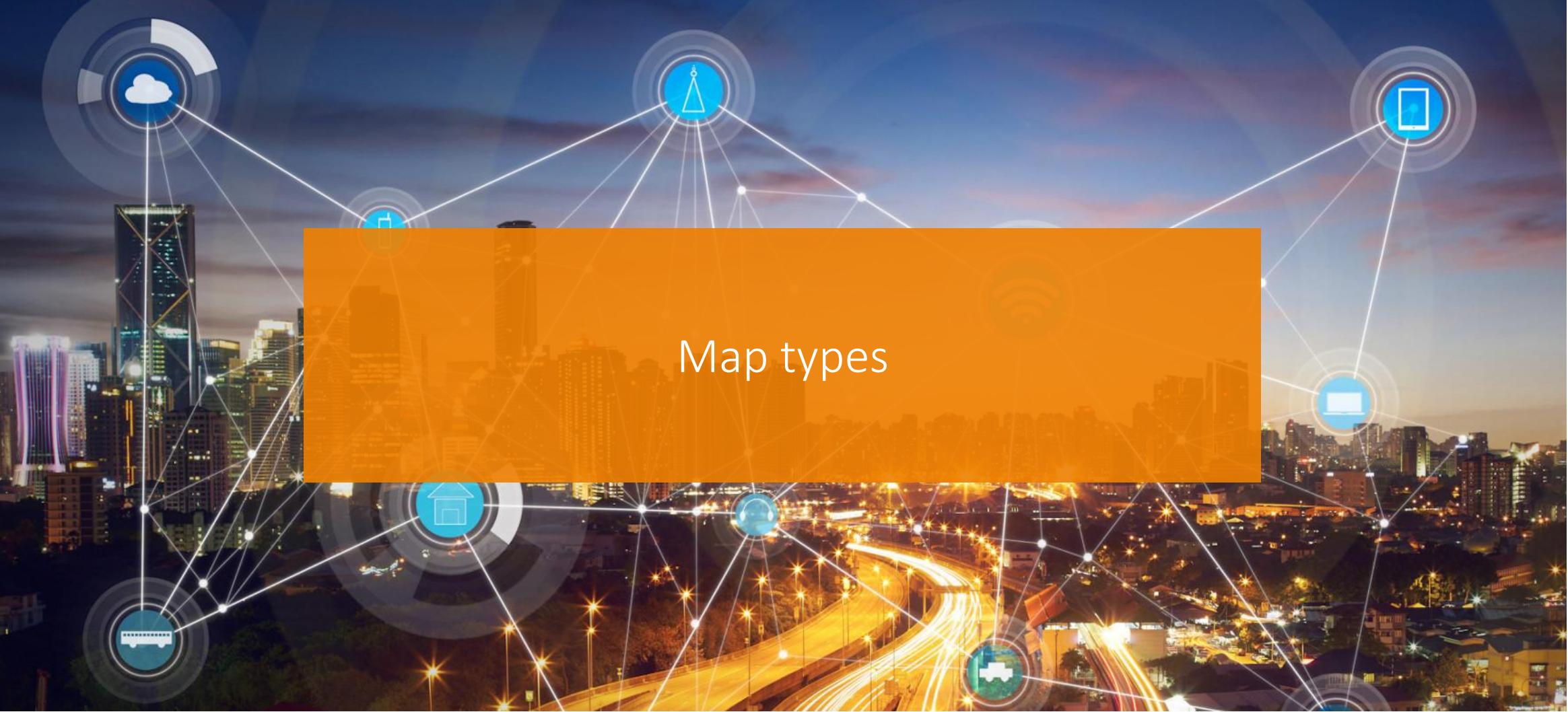
## Geo Data Visualization

Map types

Human  
Perception

Practical map  
creation

Spatial Operations



## Map types

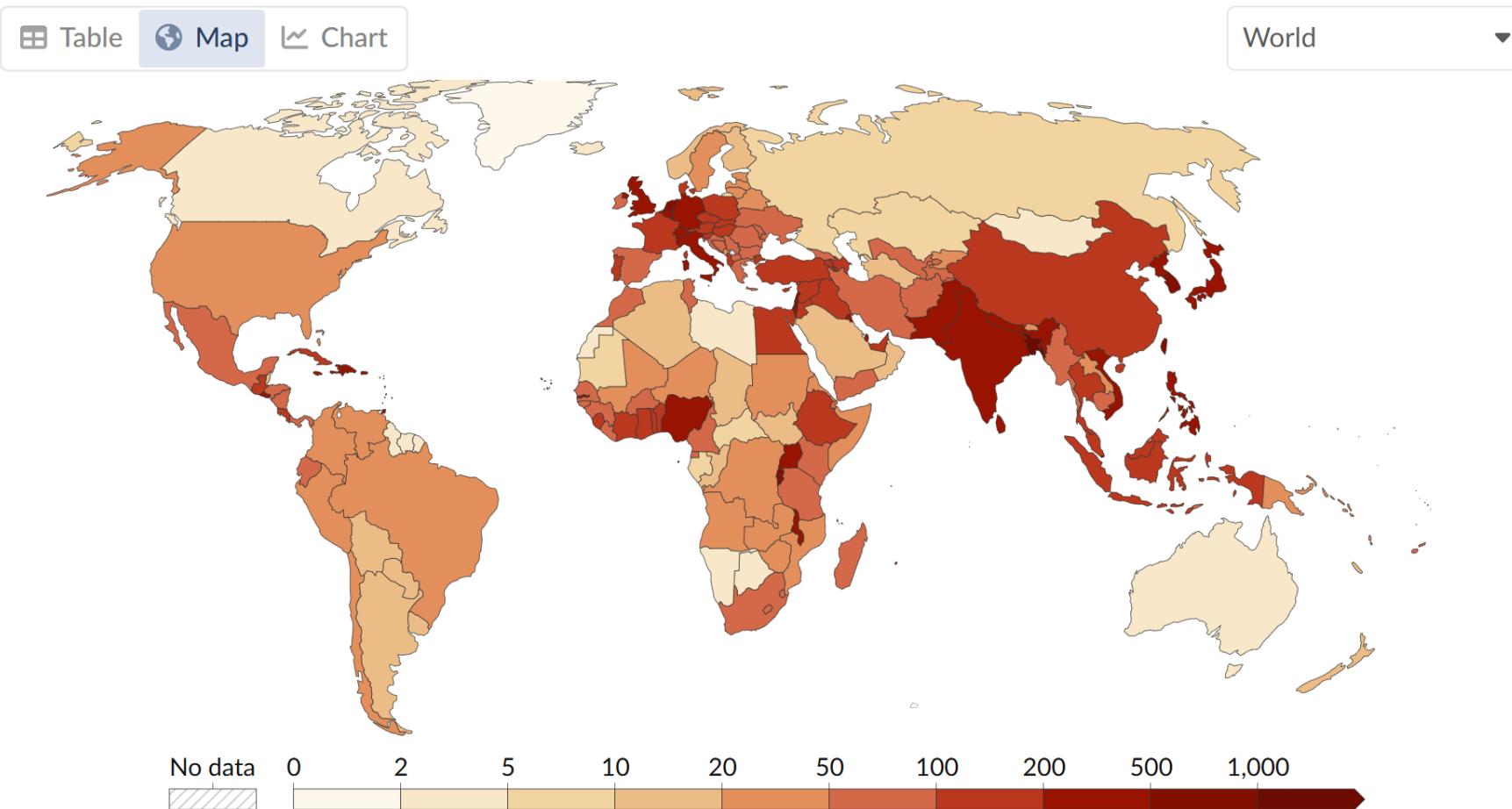
# Choropleth map

Use colored areas to represent data values

## Population density, 2024

The number of people per km<sup>2</sup> of land area

Our World  
in Data

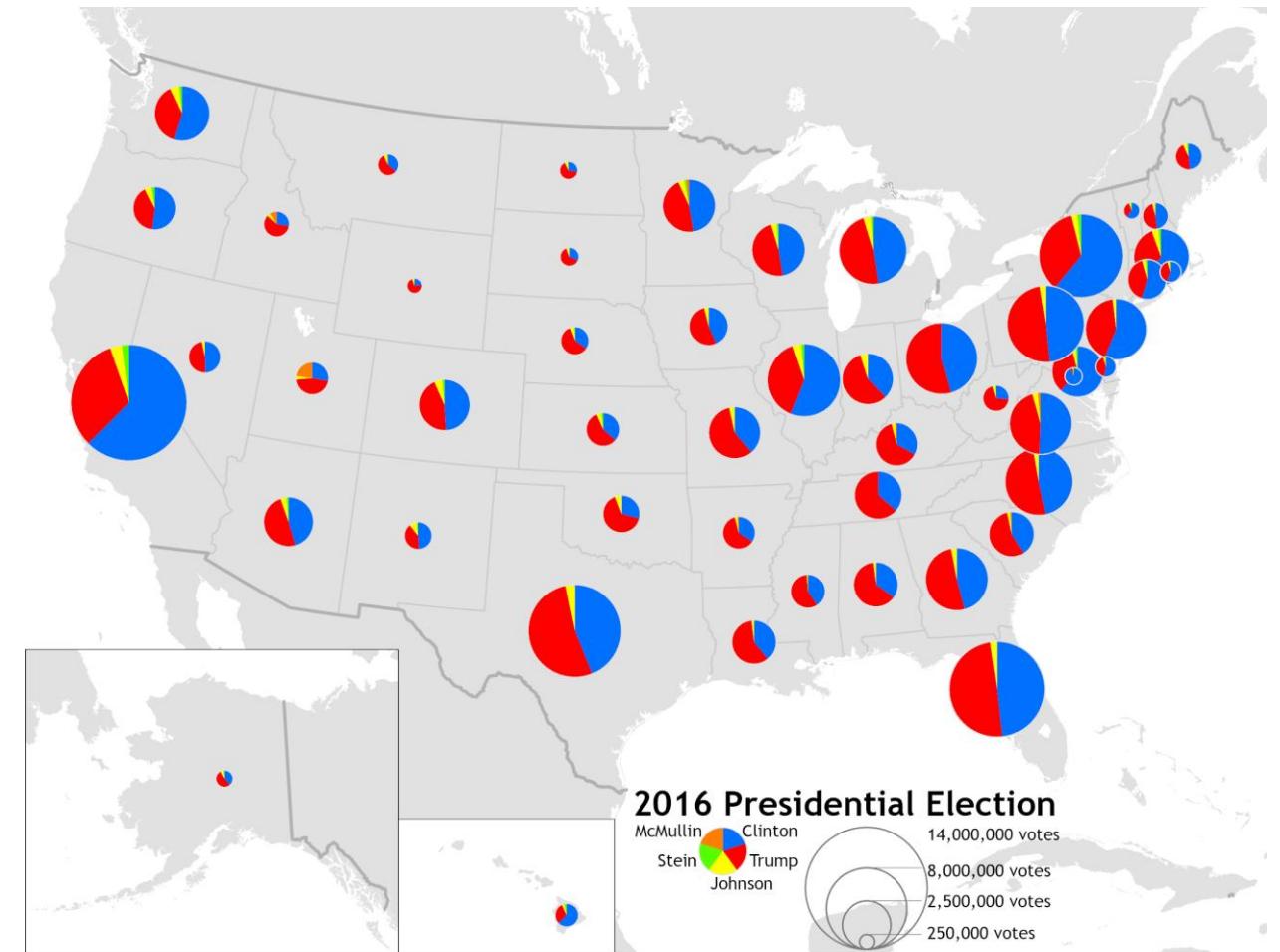
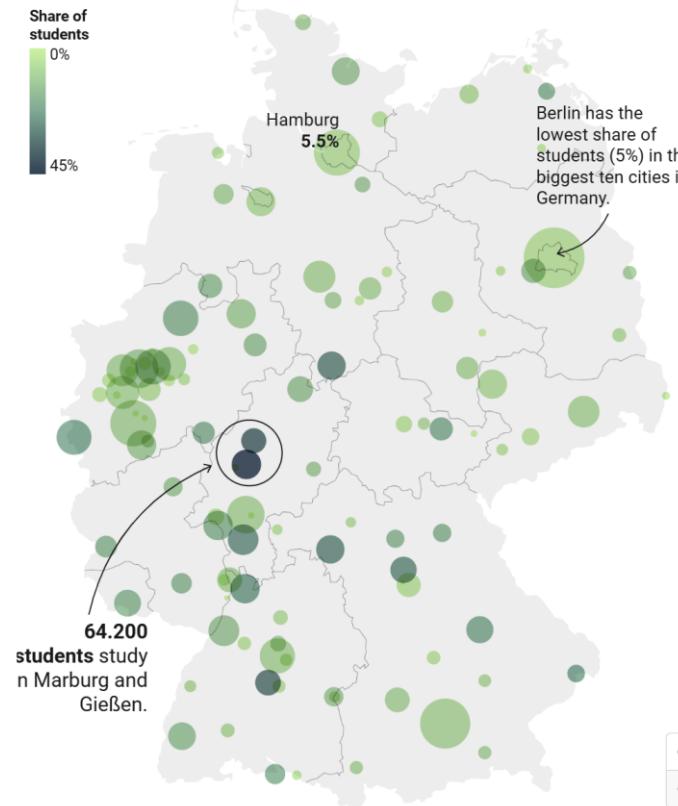


# Symbol map

Use symbol size, shape or color to represent data values

## Students in Germany: Where they live, how many they are.

There were 2.807.000 students in Germany in 2016. Where were they based, and which cities have the highest share of students? The size of the circle represents the number of students in these cities. The darker the circle, the higher the share of students.

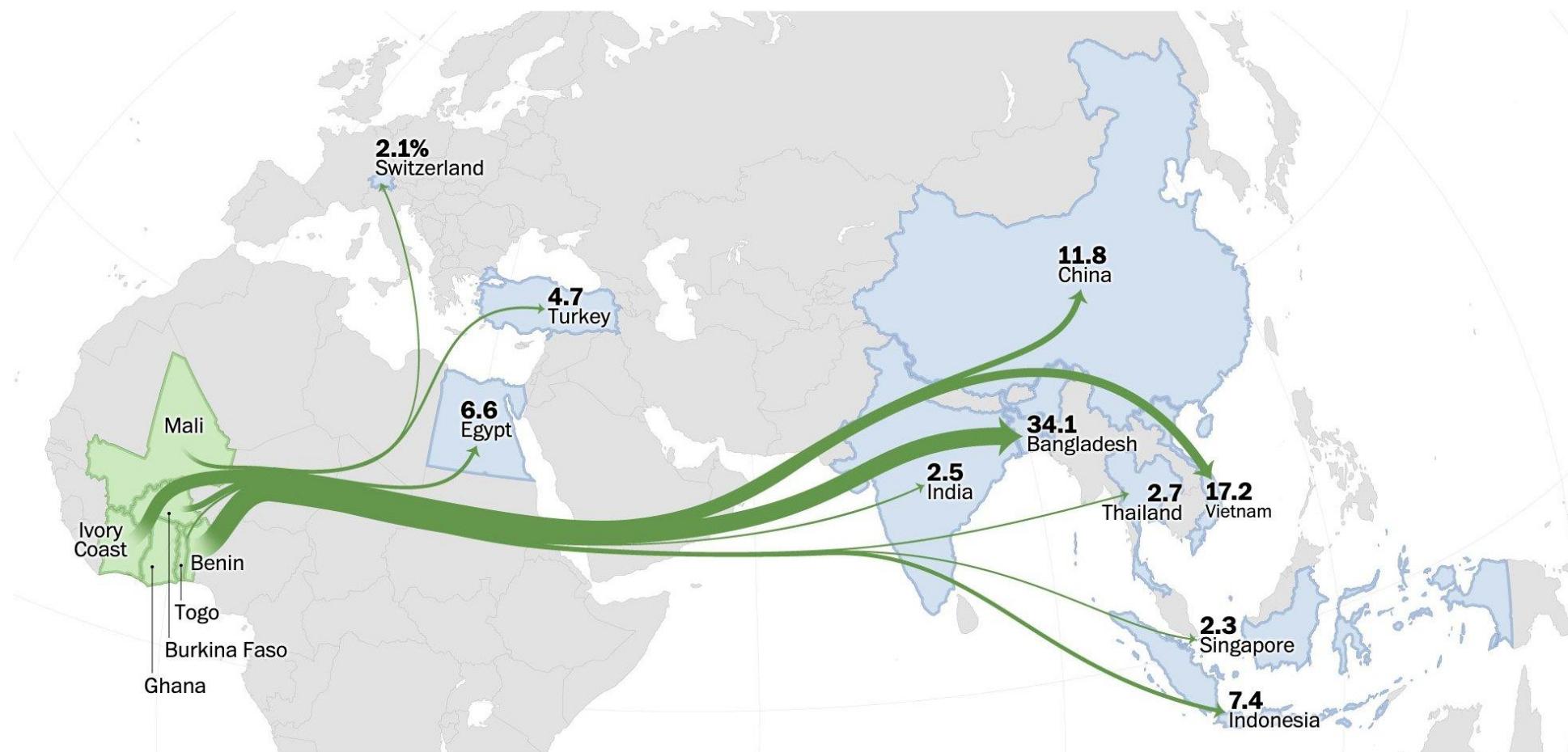


# Flow map

Use line width to represent flow magnitude

## Most West African cotton is exported to South and Southeast Asia

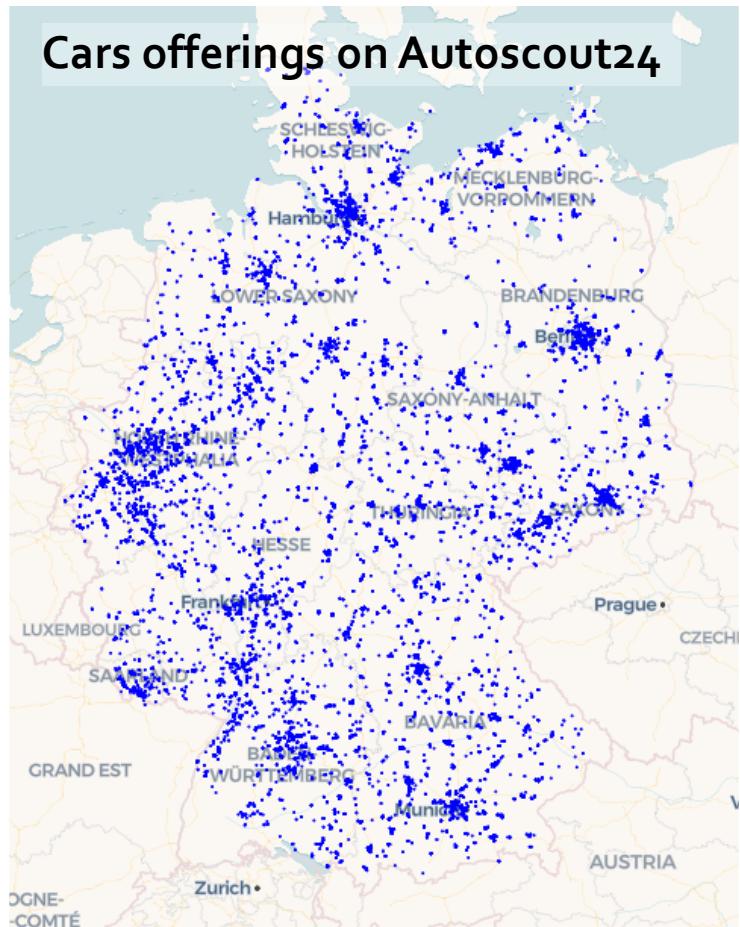
Percentage of raw cotton exported from five West African countries, measured in USD



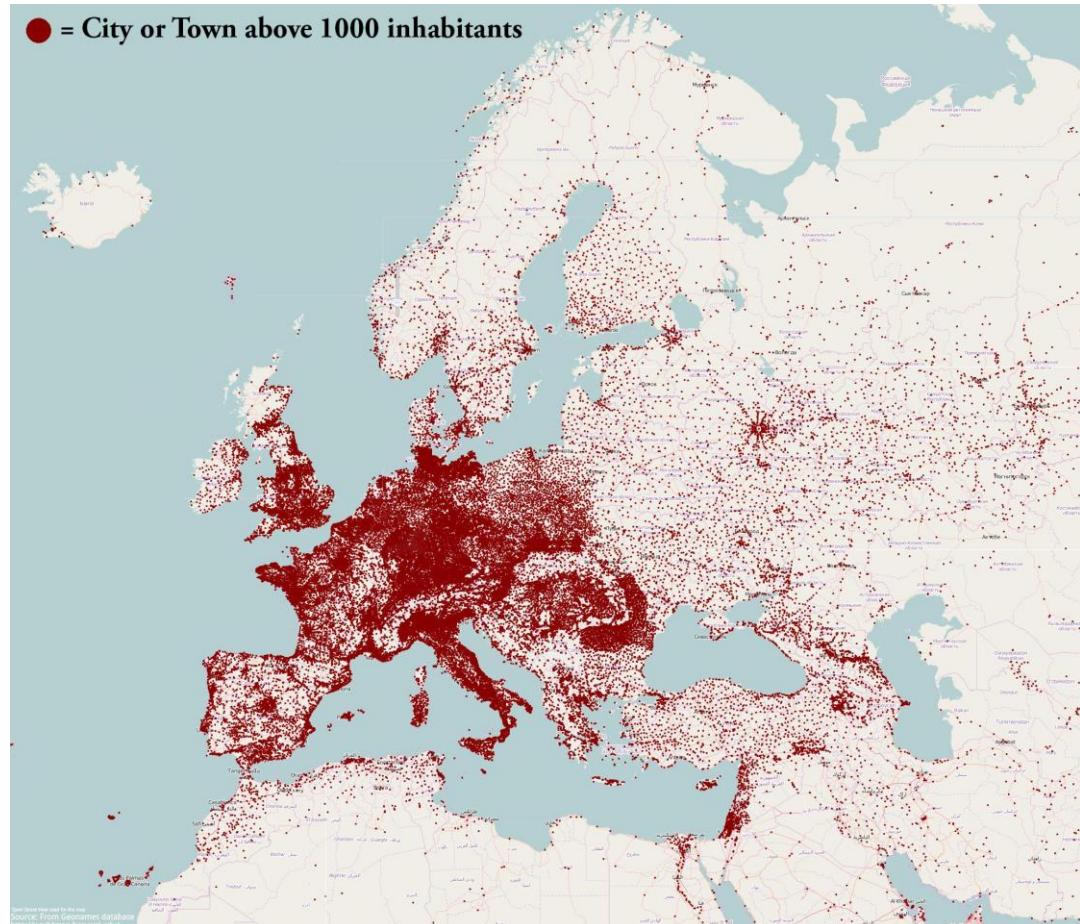
Source: The Atlas of Economic Complexity, U.N. Comtrade

ATTAR MIRZA/THE WASHINGTON POST

# Dot density map



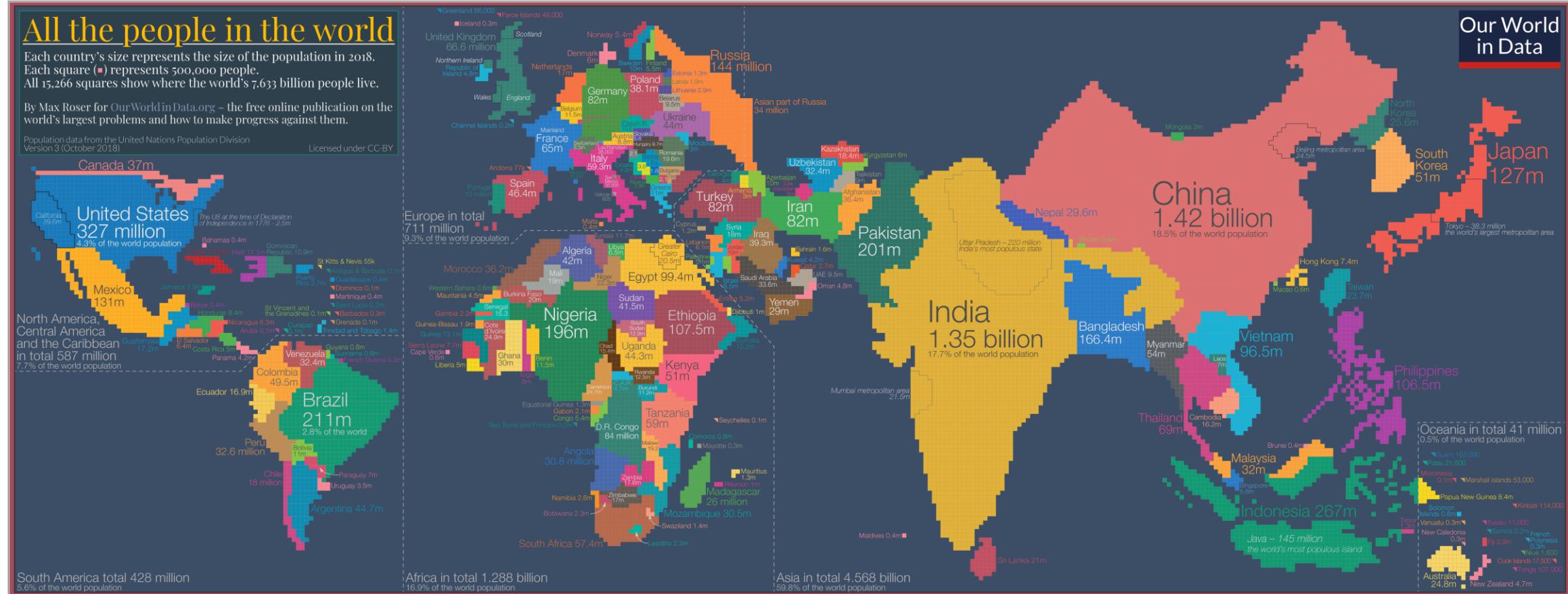
1 dot = 1 car



1 dot = 1000+ people

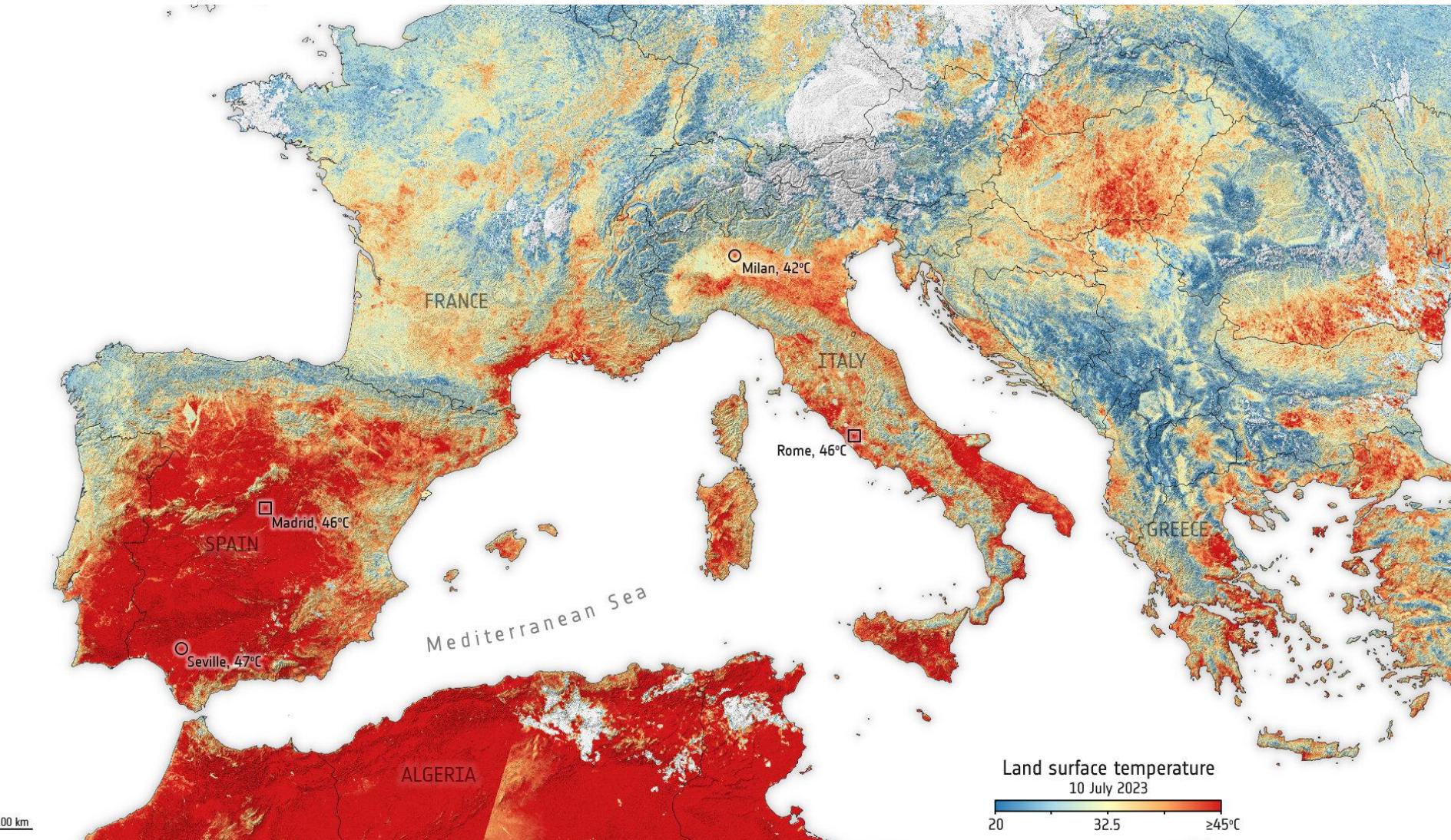
# Cartogram

Use size of geographic area to represent data values



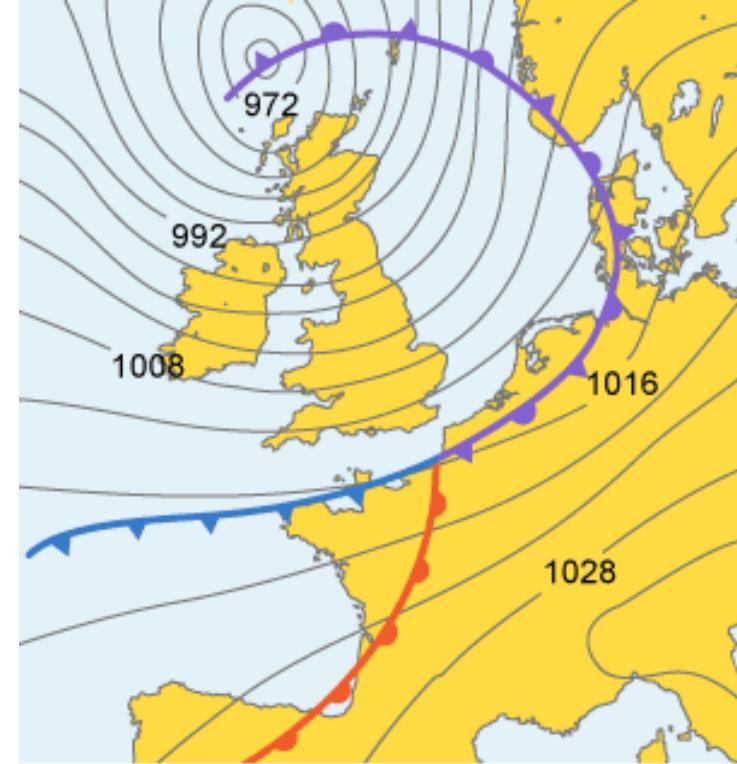
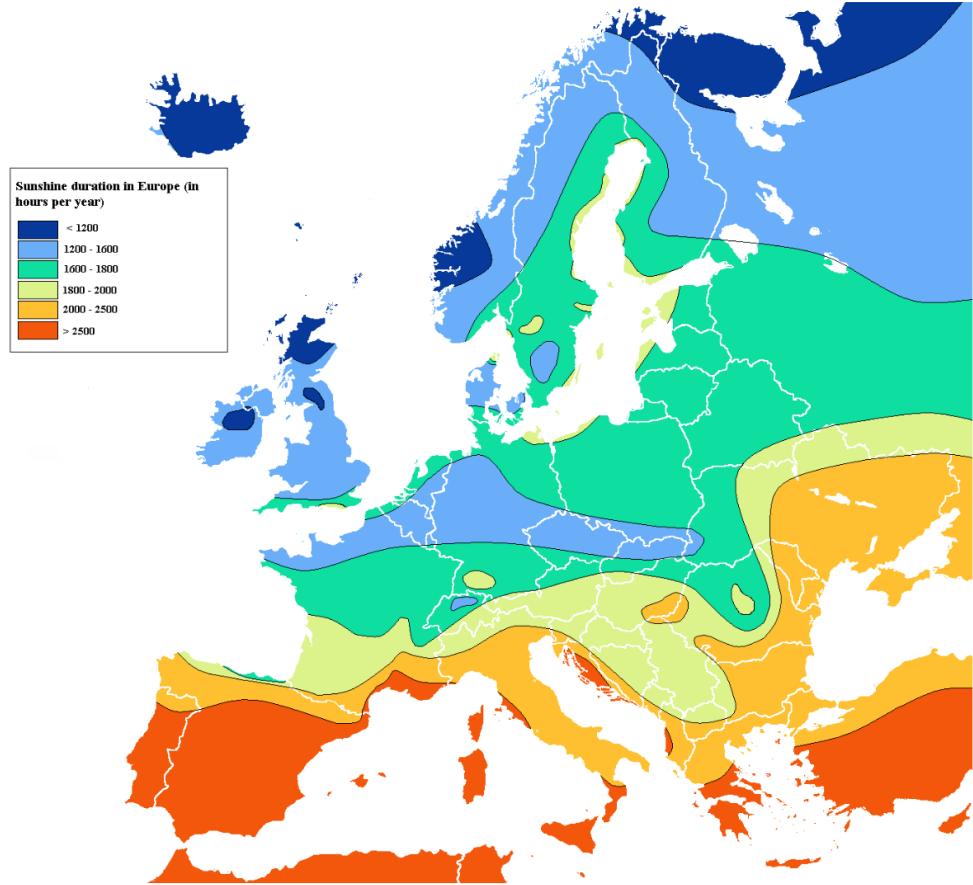
# Raster map

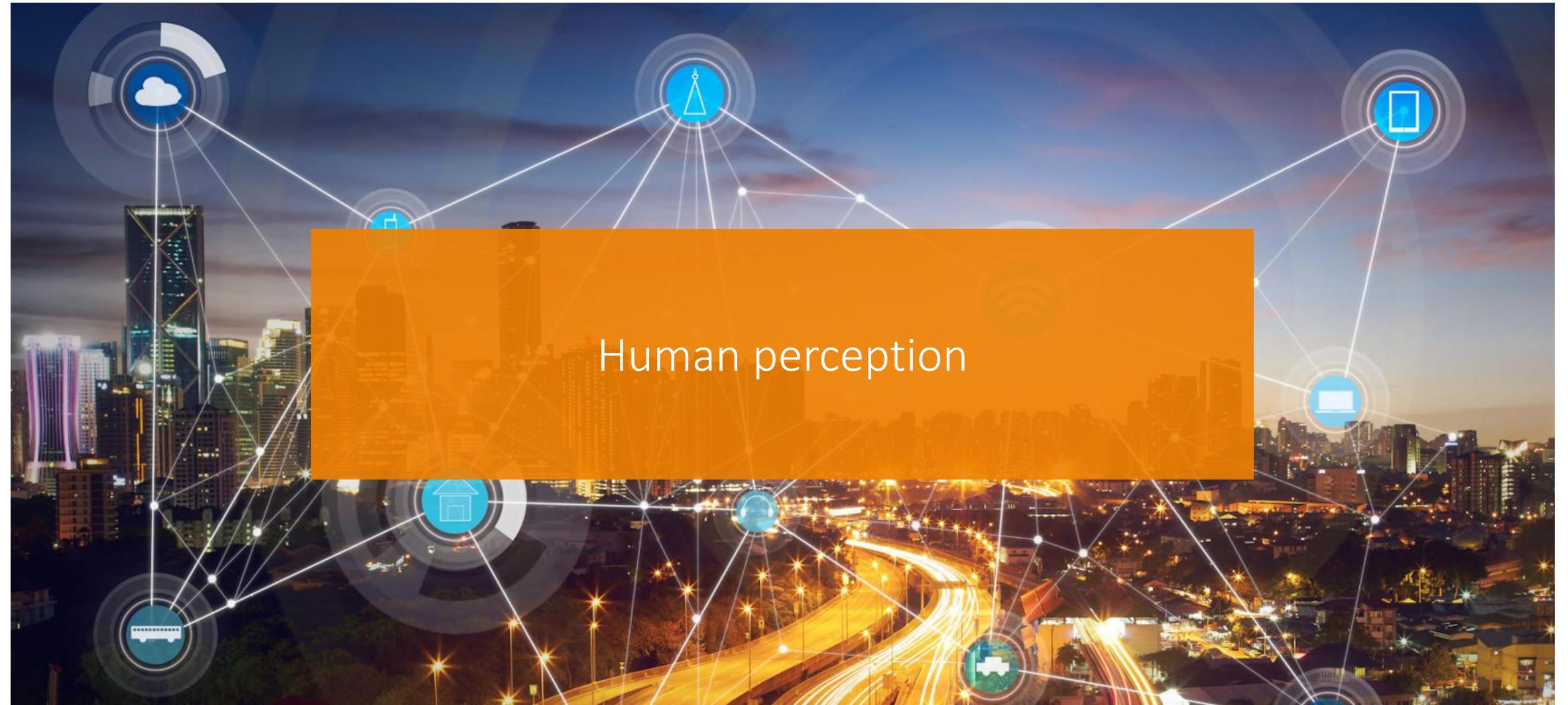
Use color of single pixels to represent data values for continuous phenomena



# Isoline Map

Use Lines to represent areas with equal values of a continuous phenomenon

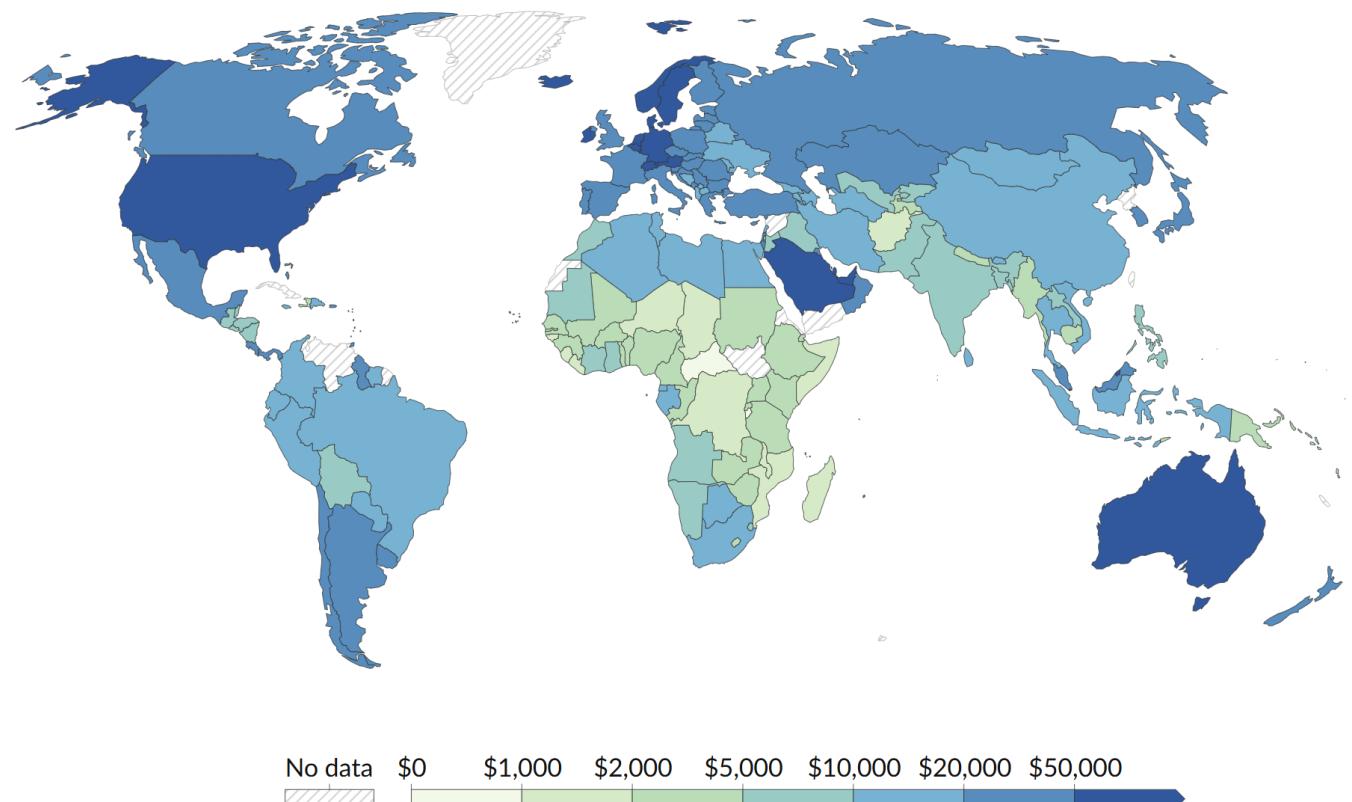




# Advantages of choropleth maps

## GDP per capita, 2022

This data is adjusted for inflation and for differences in the cost of living between countries.

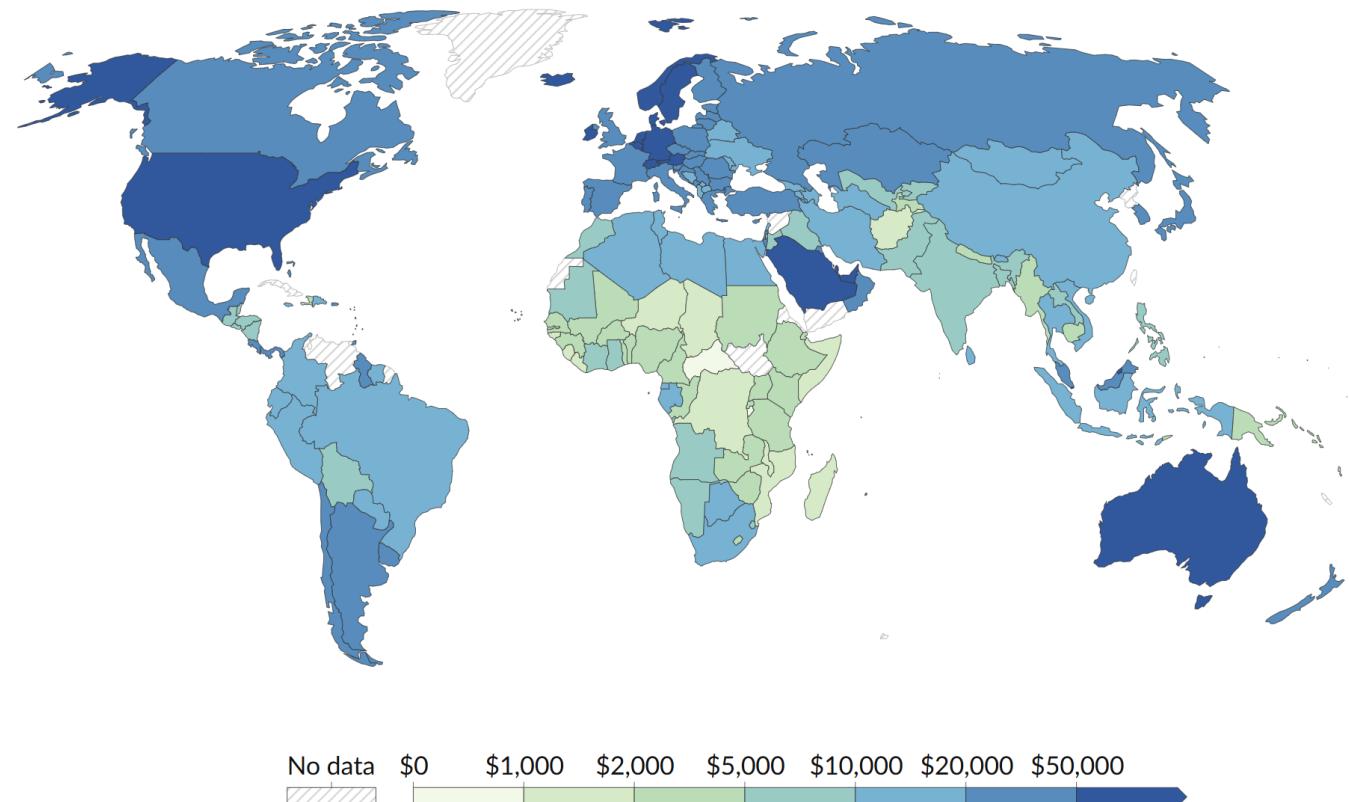


- ▶ Complete and compact representation of many data points
- ▶ Familiarity
- ▶ Useful if strong geographic patterns are present

# Disadvantages?

## GDP per capita, 2022

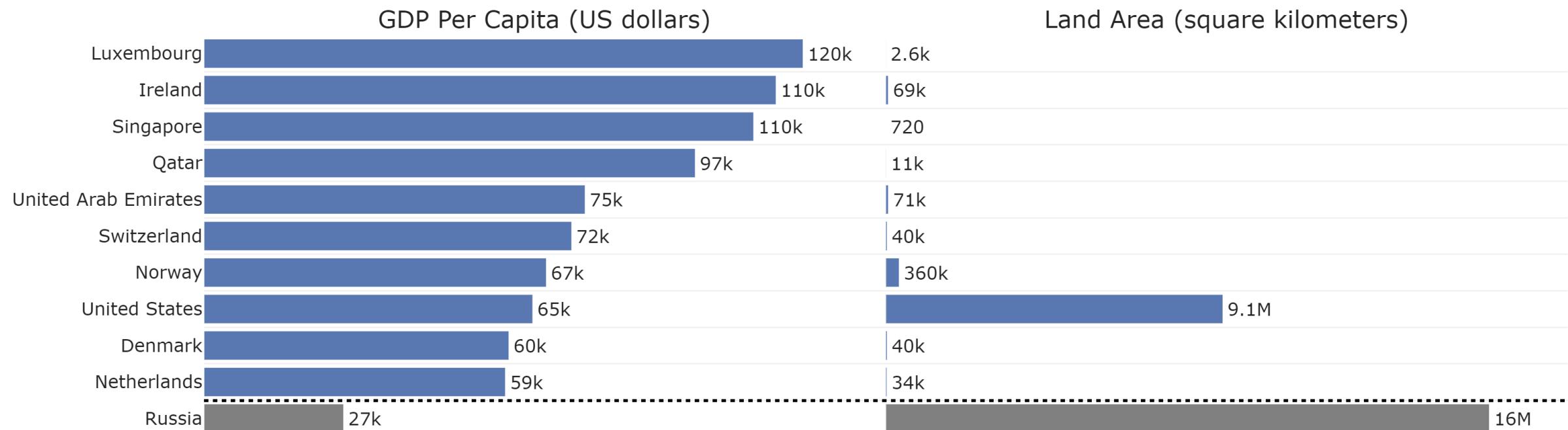
This data is adjusted for inflation and for differences in the cost of living between countries.



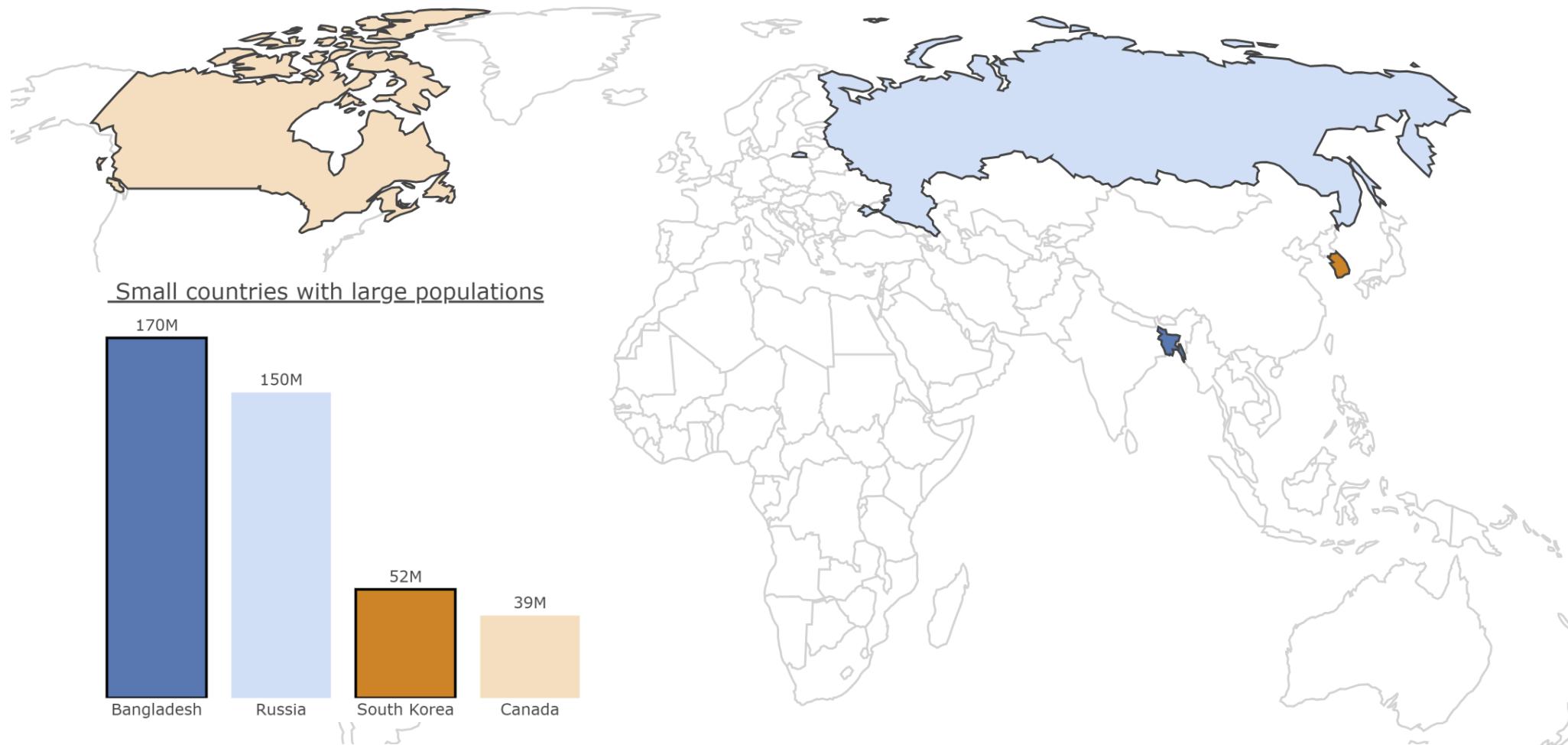
What is the GDP per capita of  
Singapur, Luxembourg, and  
Denmark?

# Bias towards large countries

- ▶ Only large countries are perceived well
- ▶ Most countries are small → they are hardly perceived on the map



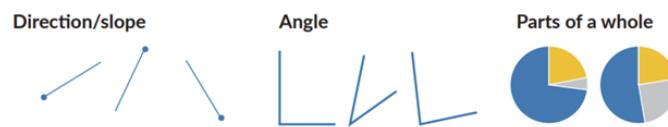
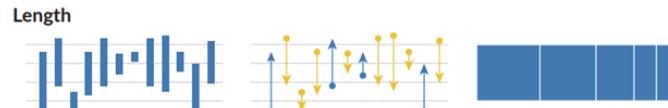
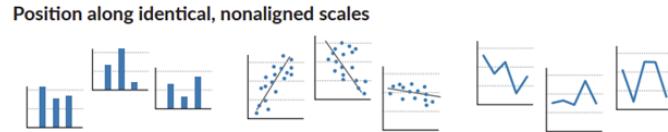
# Area is a questionable proxy for importance



**Bangladesh** has less than 1% of the area of **Russia**, but a larger population  
**South Korea** has about 1% of the area of **Canada**, but a larger population

# Inaccurate color perception

More  
accurate

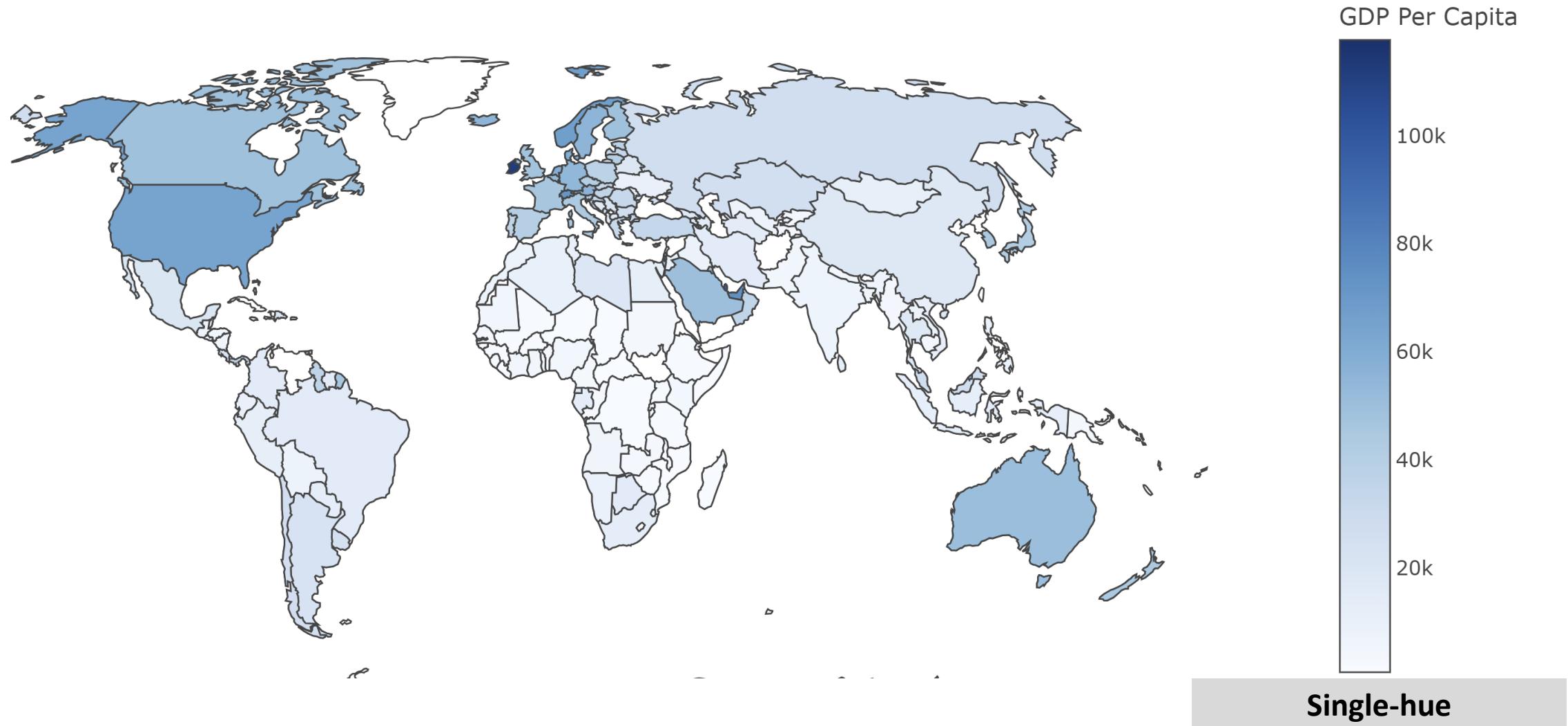


Less  
accurate

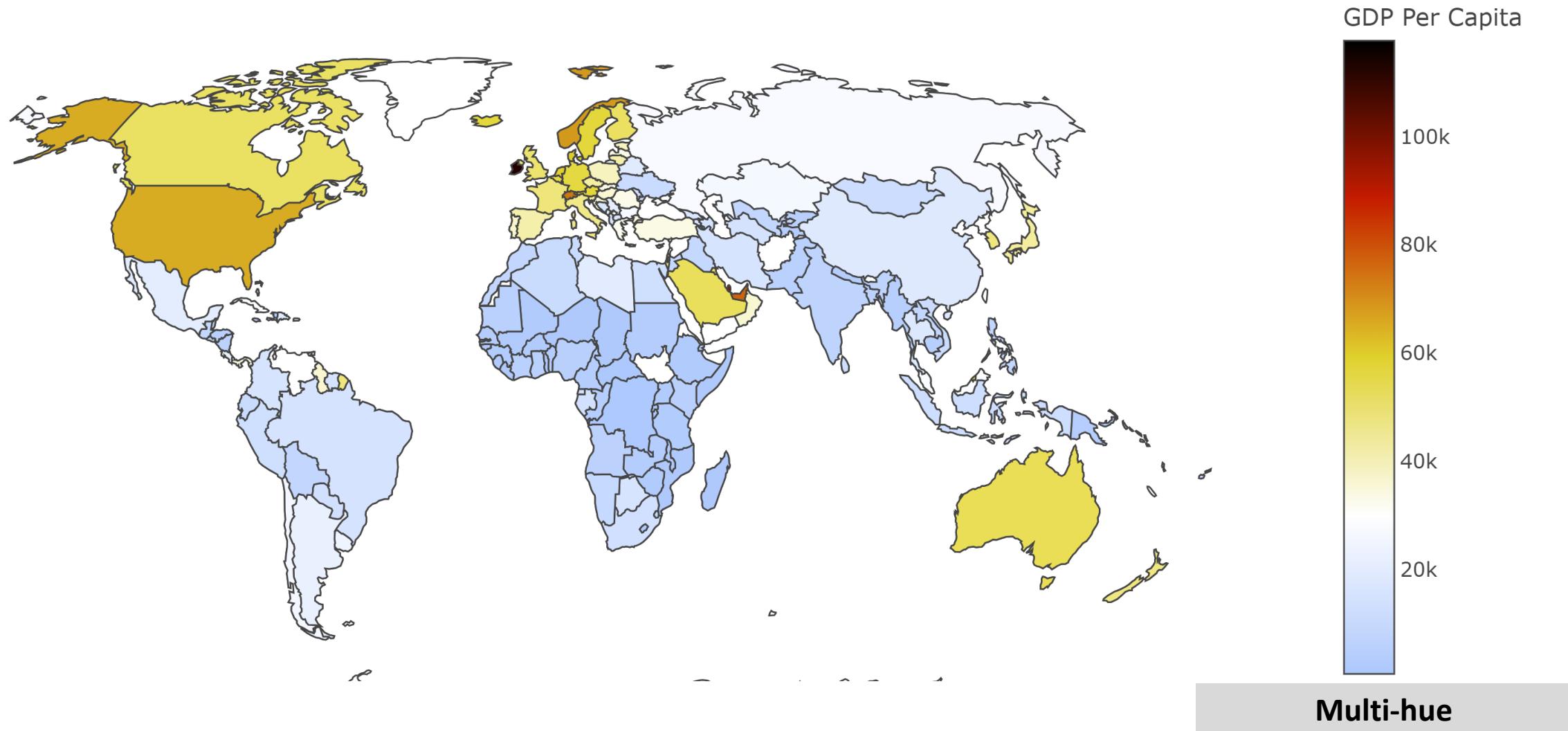


Choropleth maps encode data using colors,  
but humans are bad in decoding colors

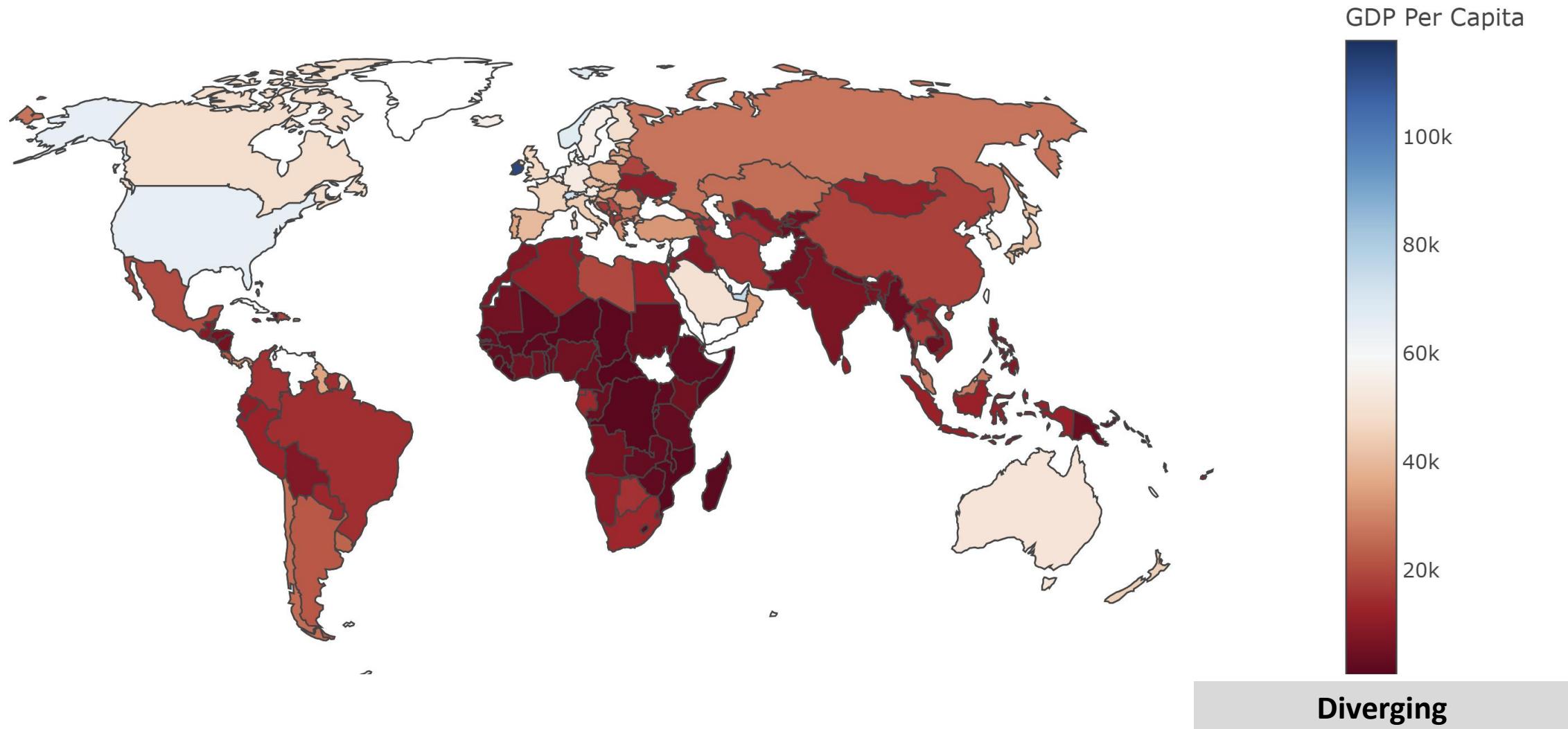
# Color scales affect interpretation



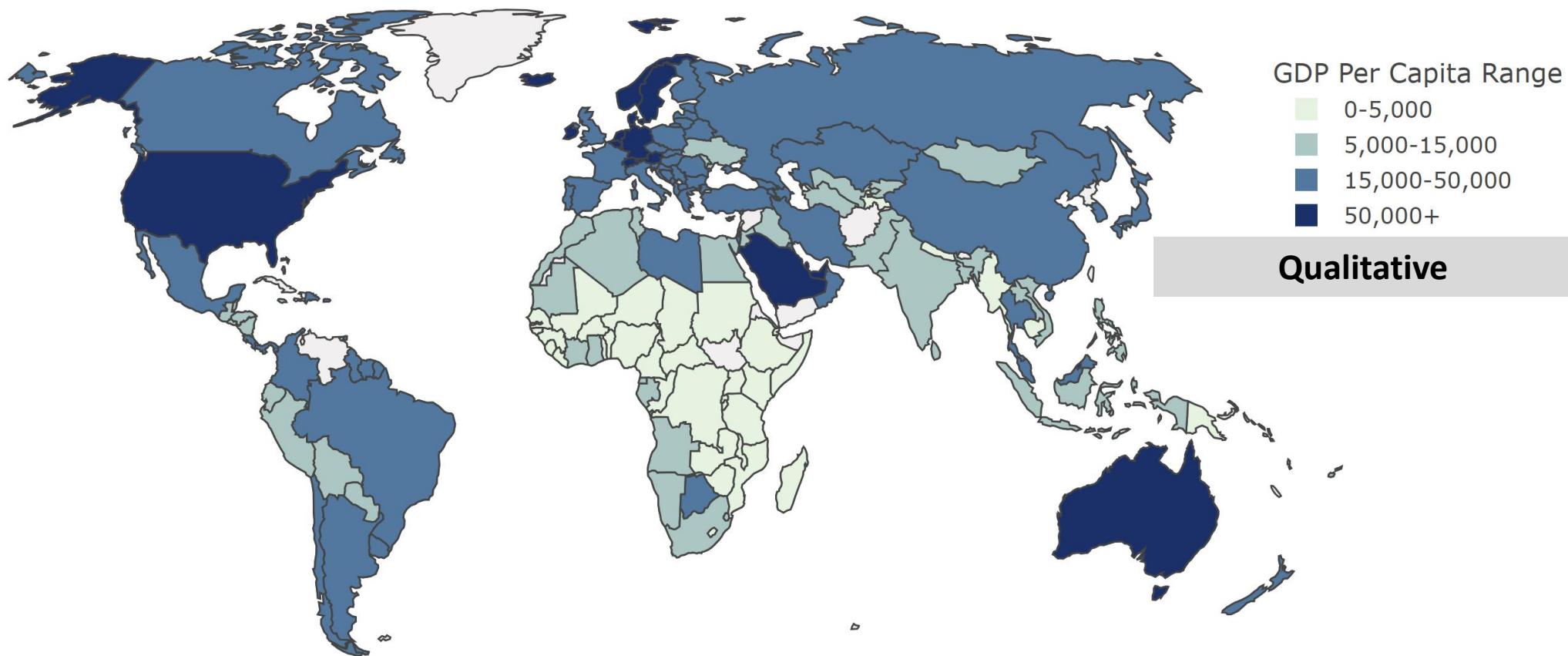
# Color scales affect interpretation



# Color scales affect interpretation

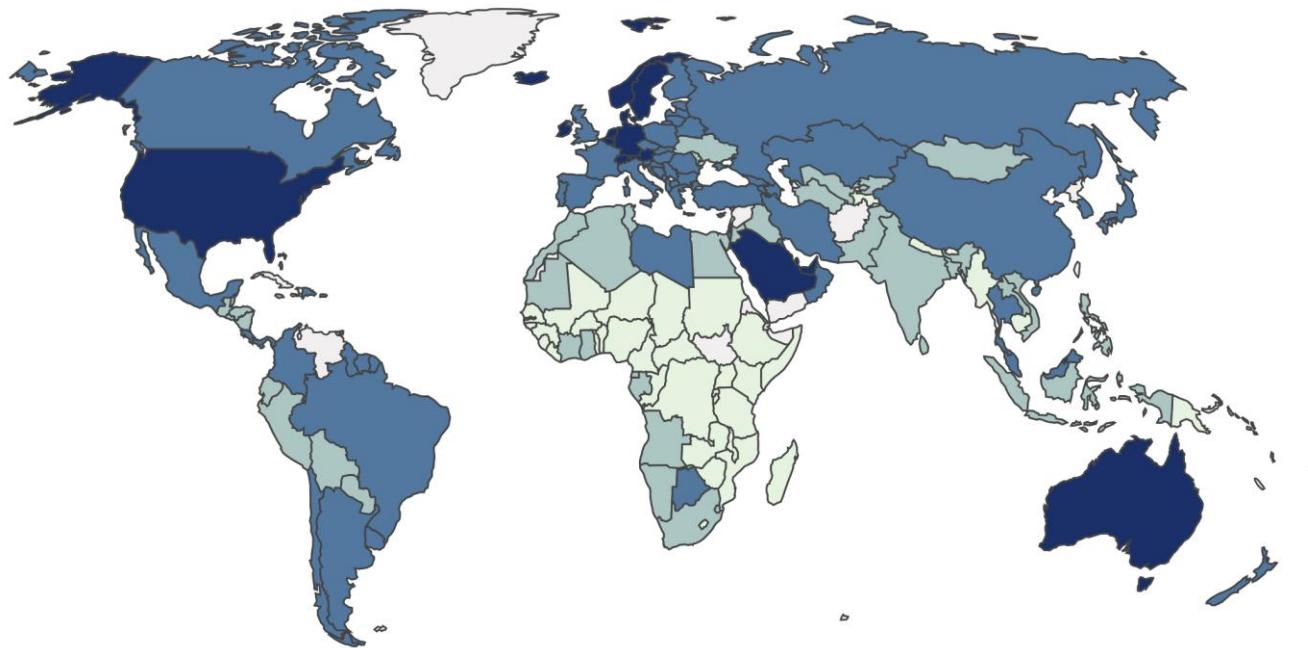


# Color scales affect interpretation



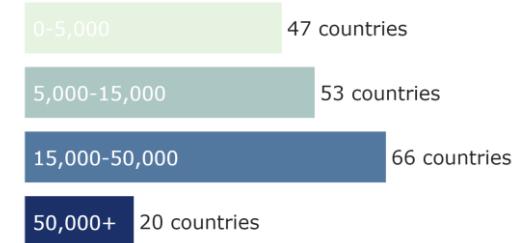
# Add complementary visualizations

Maps can show high-level geographic patterns – for details we need additional plots



The 3 Richest and Poorest Countries

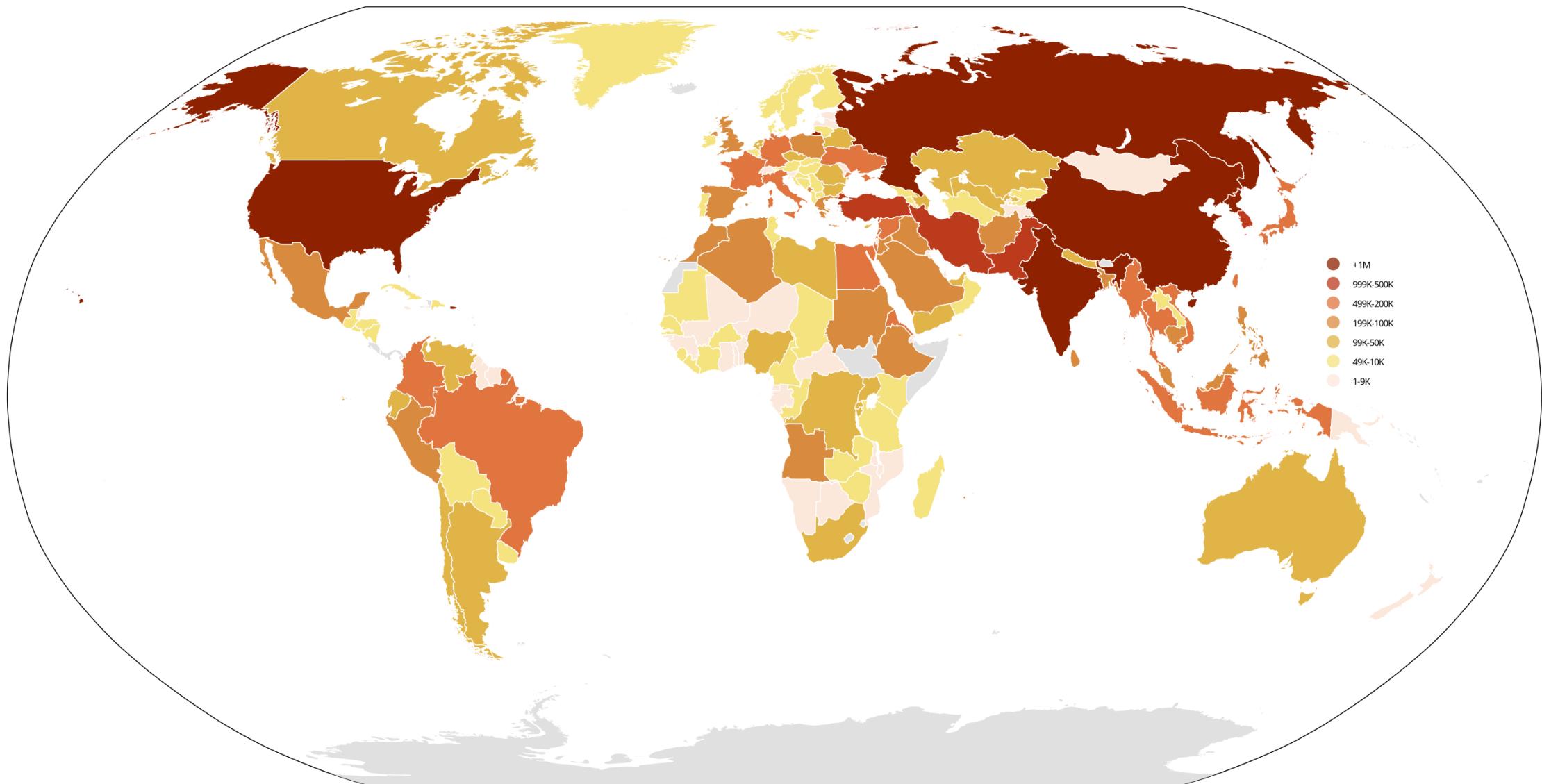
Luxembourg	117747
Ireland	112445
Singapore	108036
Democratic Republic of Congo	1133
Central African Republic	824
Burundi	708



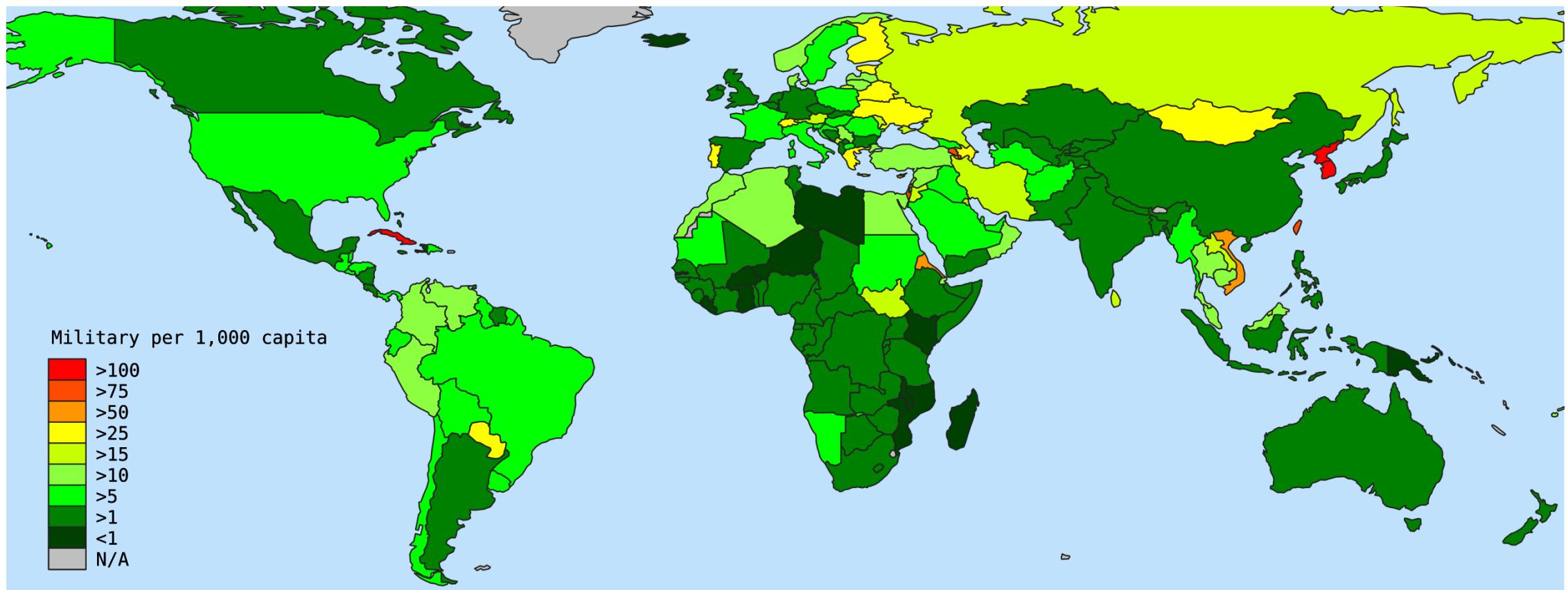
The 10 Poorest Countries

Burundi	708
Central African Republic	824
Democratic Republic of Congo	1133
Mozambique	1251
Niger	1275
Chad	1413
Somalia	1449
Liberia	1461
Malawi	1467
Madagascar	1502

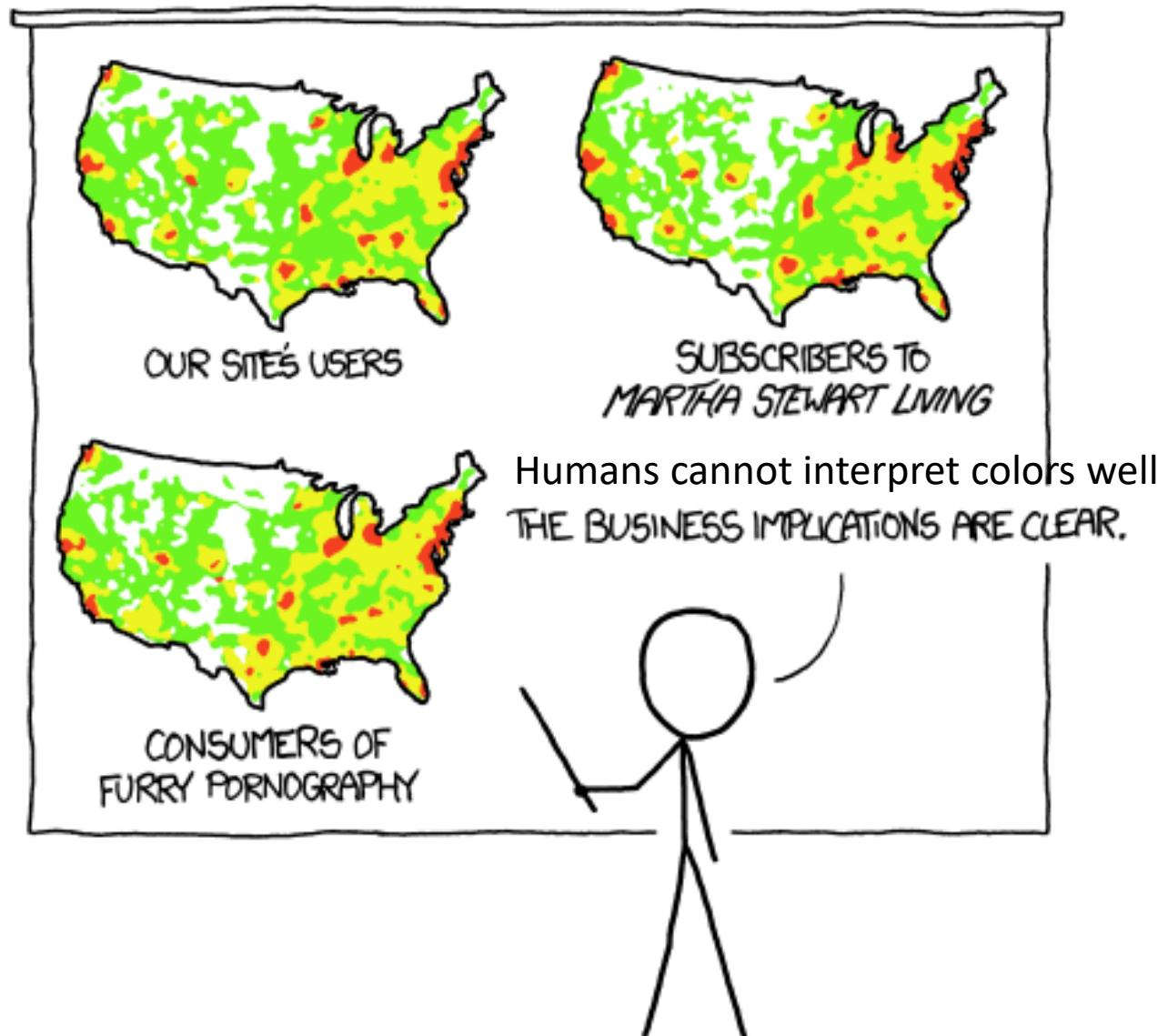
# Number of soldiers



## Number of soldiers per 1000 inhabitants



# Normalize your data!



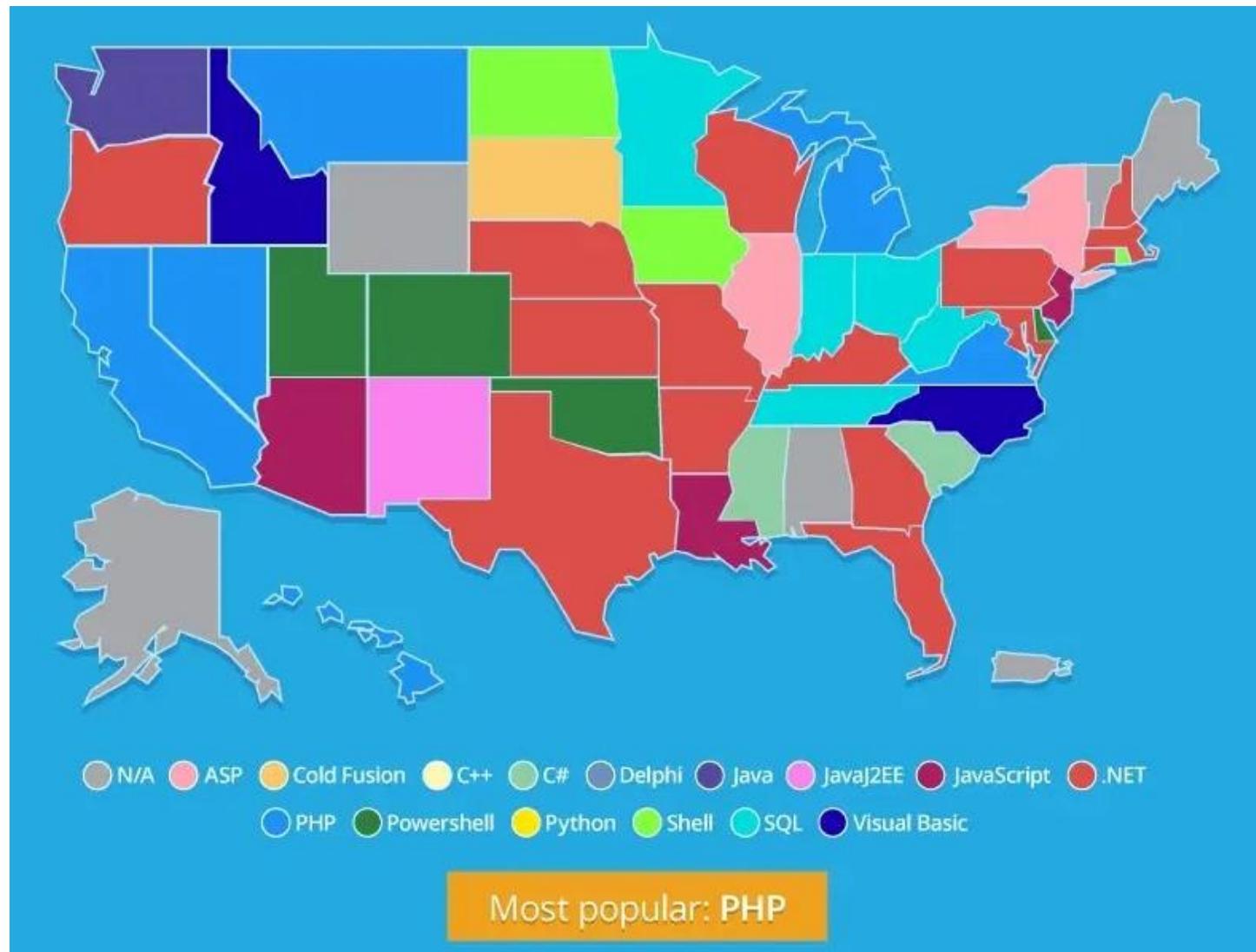
Often data correlates with population size or land mass

→ To make data comparable,  
normalize adequately!

- per capita
- per land area

Otherwise all maps essentially just show population/country size

# When to avoid maps



If you present data in form of a map, the audience will expect geographic patterns.

- In the absence of clear geographic patterns, the audience will be confused
- Consider a different plot type!

# Map projections distort perception

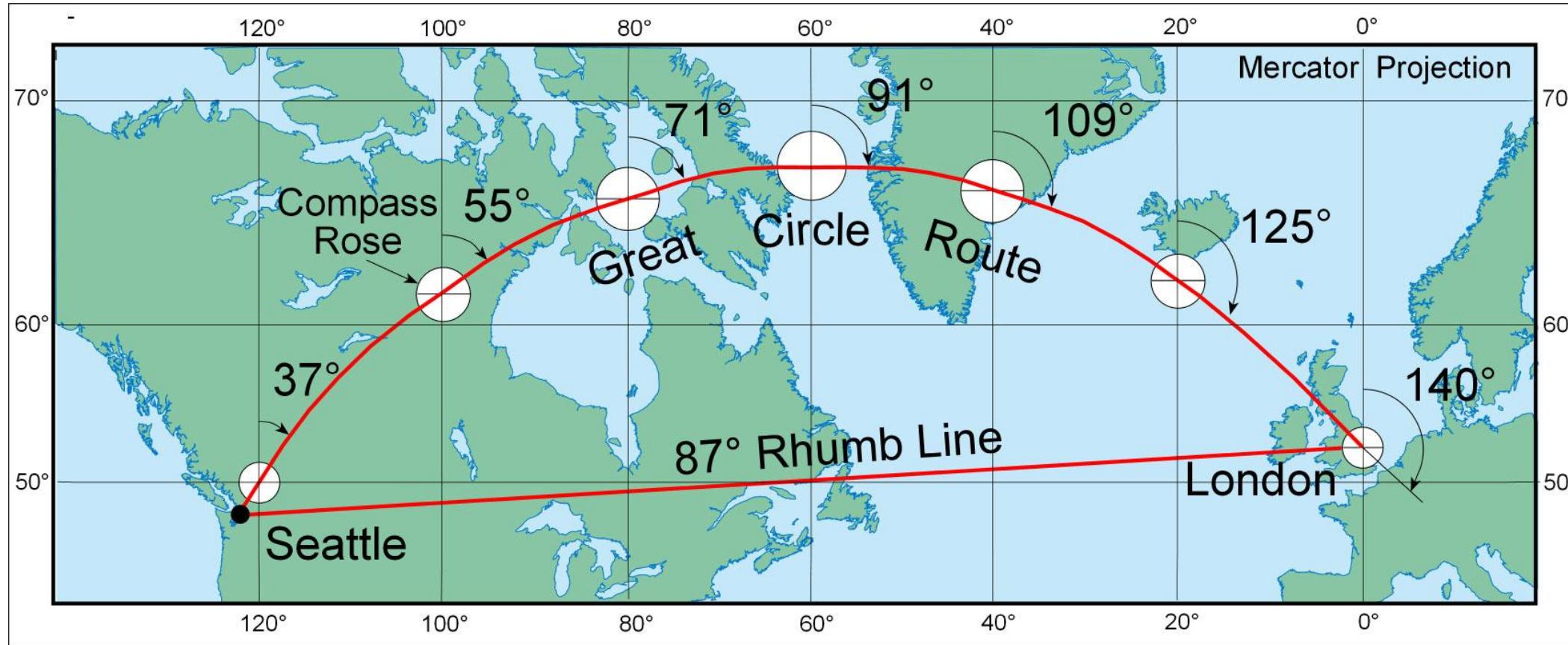


Mercator



Mollweide

# Why the Mercator projection was historically important

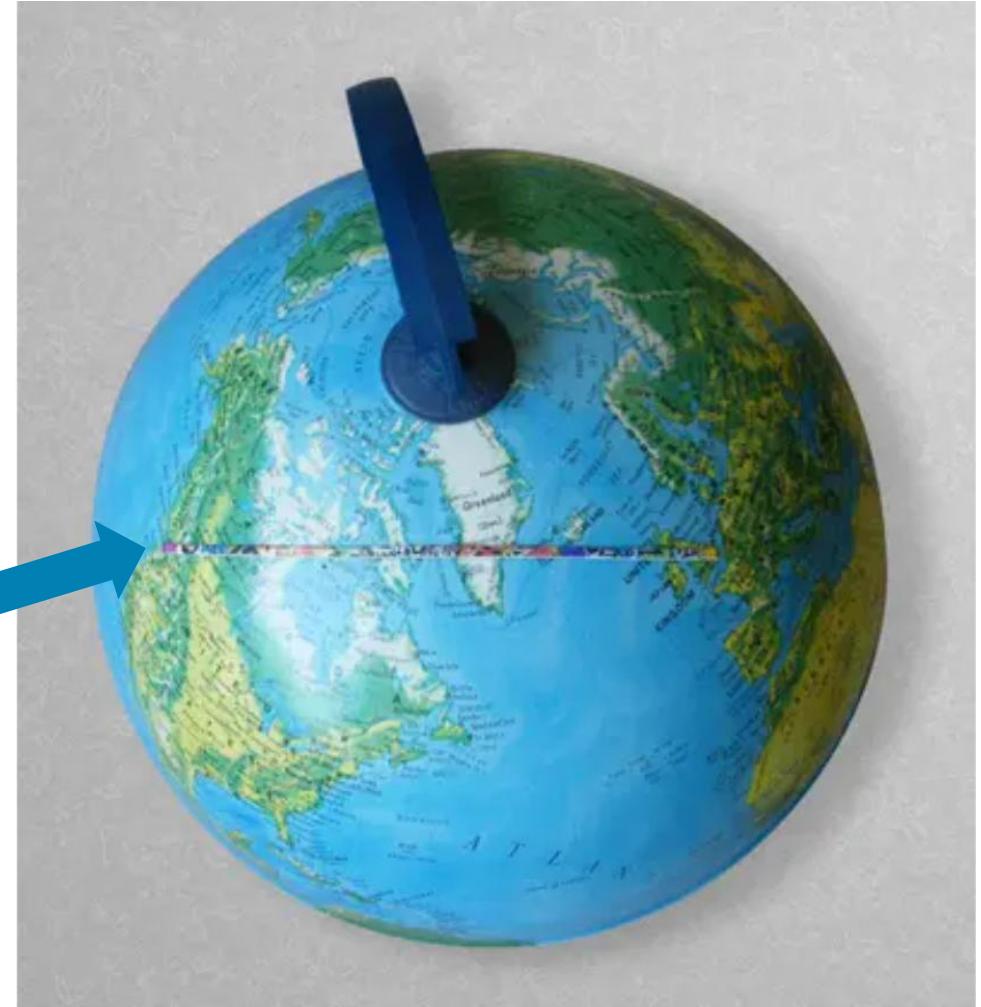


**Sailors** could represent their course on the Mercator map as a straight line (rhumb line), and then simply sail one constant compass bearing (here:  $87^\circ$ ) along this line

# Mercator distorts distances

- ▶ The shortest path from London to Seattle (rhumb line) on the Mercator map does not represent the shortest route in real life (great circle route)
- ▶ Do travel the shortest route seaman would need to adjust the compass bearing constantly

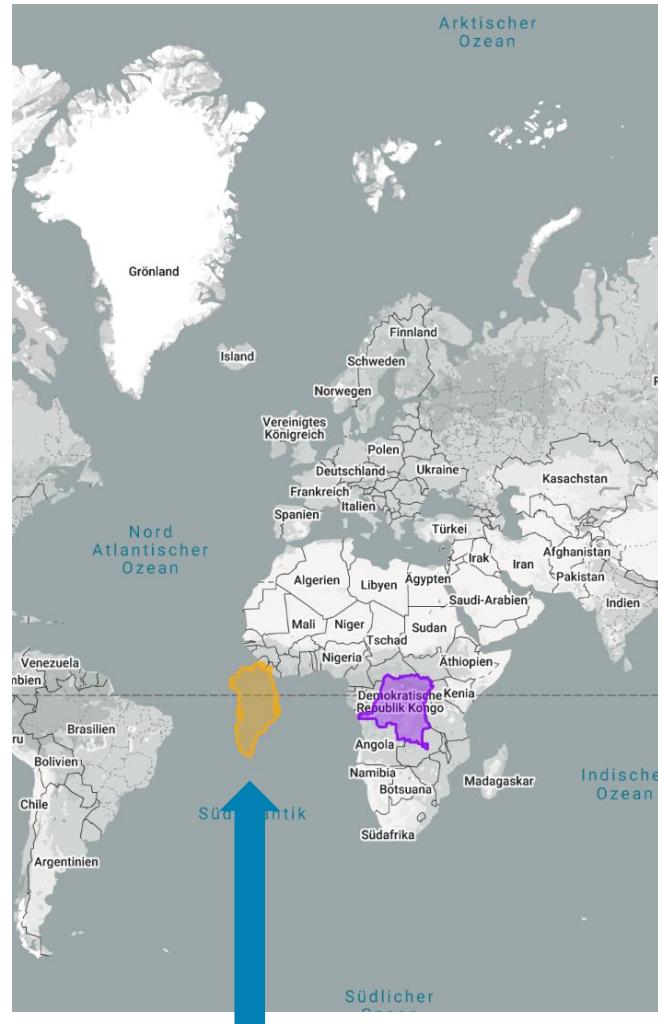
True shortest route



A 'great circle' route between any two places is the shortest distance, i.e. it is 'as the crow flies'.

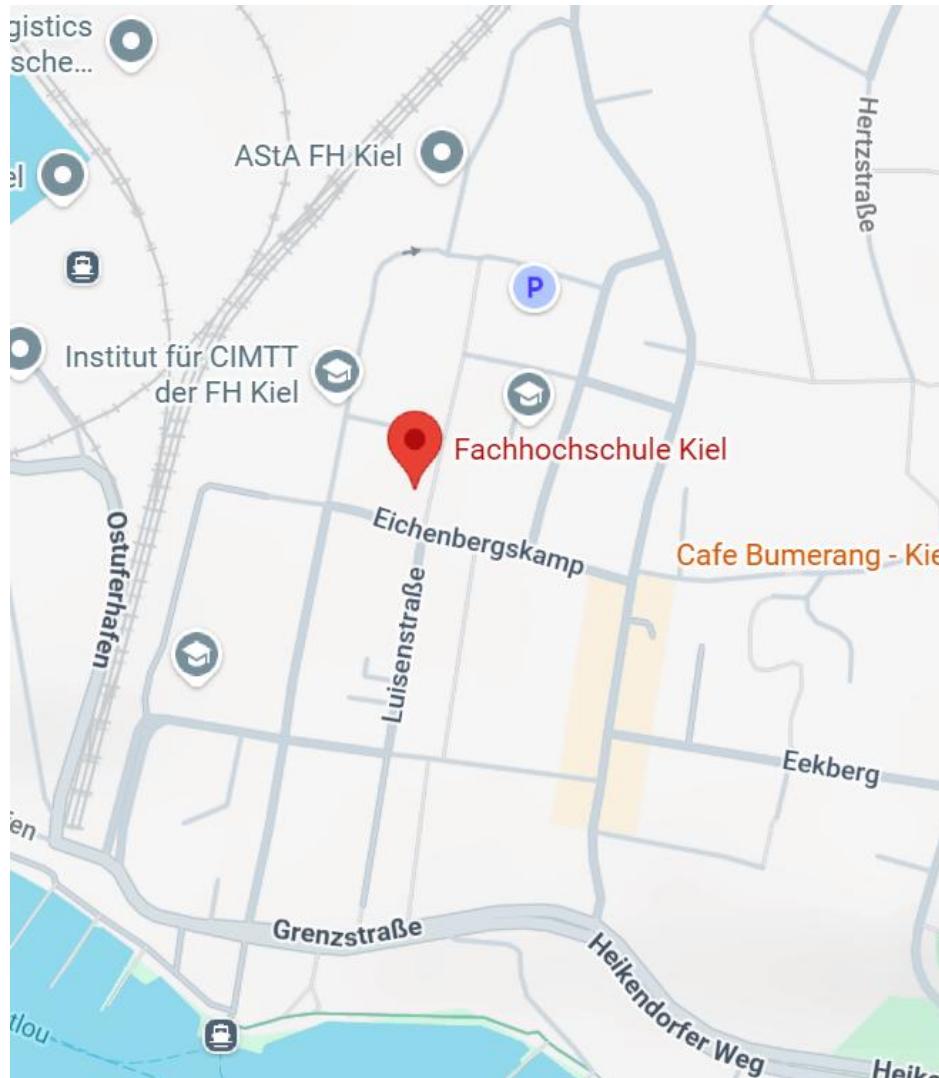
# Mercator distorts areas

Mercator's  
Greenland



See: [www.thetruesize.com](http://www.thetruesize.com)

# Web maps use Web Mercator Projection



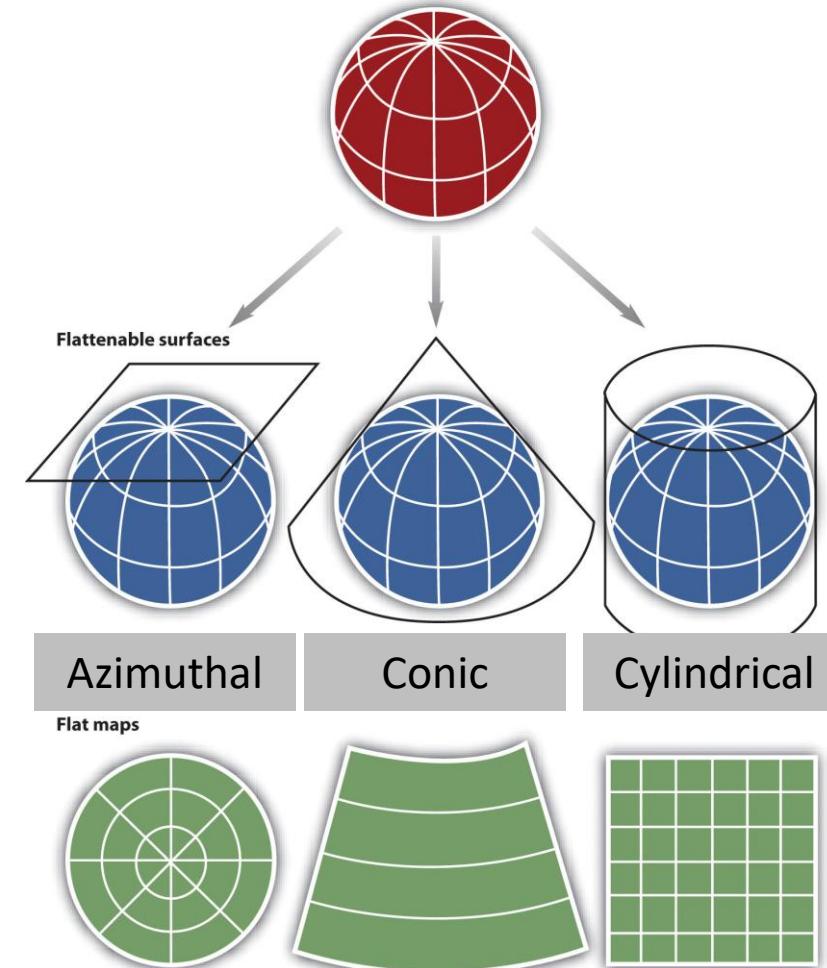
- ▶ **Google Maps, Open Street Maps and Tableau** use a close variant of the classic Mercator projection: Web Mercator (EPSG:3857)
- ▶ Preserves local shapes and angles → street intersections look the same as in real life
- ▶ Ideal for computers: the Earth can be divided into square tiles that can be loaded, shifted, and zoomed very efficiently  
(see also: [How zoomable maps work](#))

# Distortions are inevitable

We want to represent the 3-dimensional earth on 2 dimensions

No matter how we try to do this, it will lead to **distortions in at least one of:**

- ◆ area
- ◆ distance
- ◆ local shapes



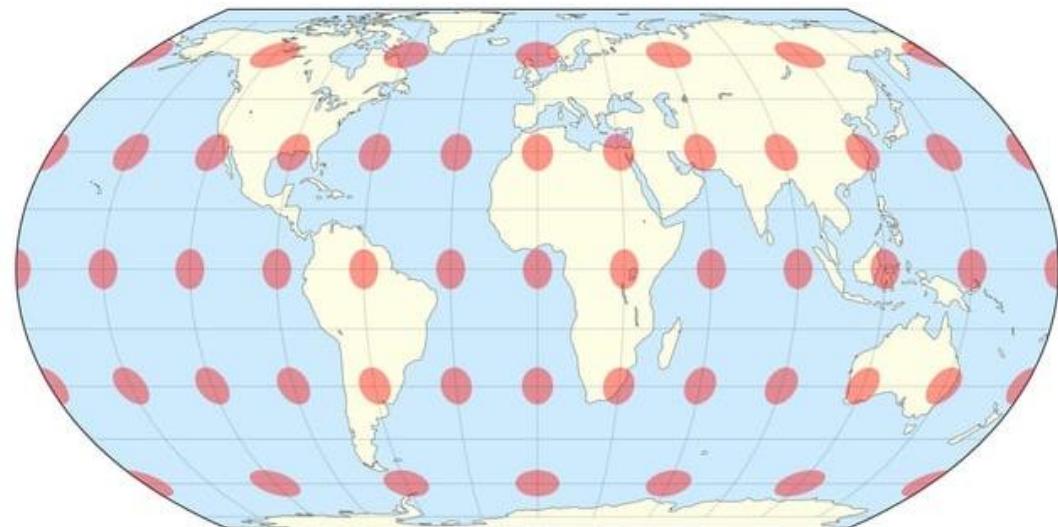
→ Video: Why all maps are false

# Recommended projections for the entire world



**Mollweide**  
EPSG:54009

Projections should represent areas faithfully  
(→ equal area projections)



**Equal Earth**  
EPSG:8857

# Recommended projection for Europe



**LAEA Europe**  
EPSG:3035

LAEA Europe is used by Eurostat, and other official agencies

- ▶ Preserves areas perfectly
- ▶ Minimal distortions of shape (towards outer regions)

# Recommended projection for Germany



**EPSG:25832**

Given these perceptual problems of map visualizations –  
what can we take away?

# Take away messages

## Map or no map?

- Use maps if the data shows interesting geographic patterns
- Don't use maps for absolute values (that correlate with population or size) → normalize your data
- Maps can show high-level patterns, but for details consider complementary visualizations

## Projection

- There are tradeoffs, so we have to make compromises
- Choose projection where area proportions are represented faithfully
- For a map that zooms into a small region, local shapes should be correct and look familiar

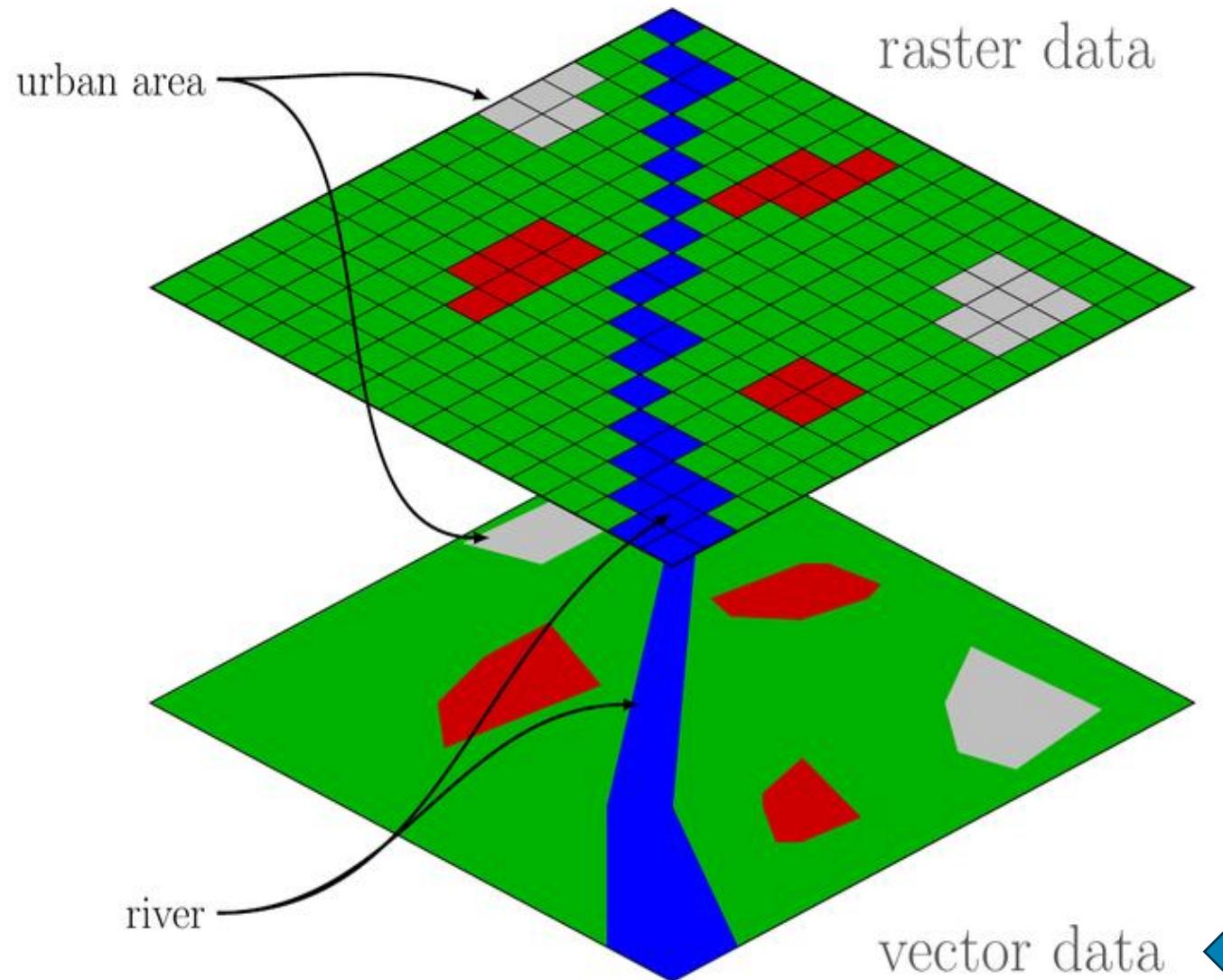
# Take away messages

## Colors

- Choose a color scale that makes differences visible
- Be aware of the perceptual biases due to color scaling → use complementary visualizations to give viewers also an accurate impression of data values
- **Useful tool:** <https://colorbrewer2.org/>



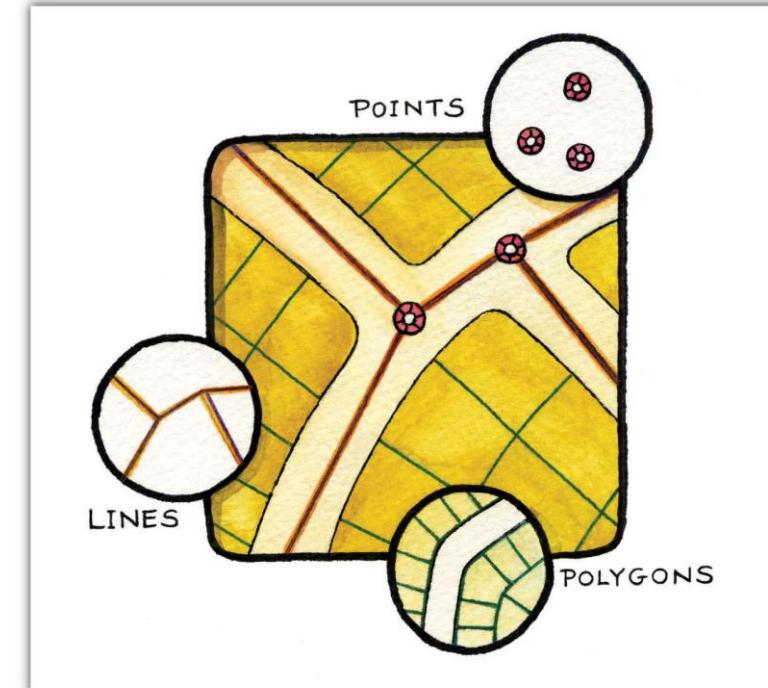
# Geographic data models



# Vector data

- ▶ Vector: discrete geometric entity described by their coordinates
- ▶ Typical use cases: thematic maps

Features	Geometry	Attributes
Bus stop	Point	
Amazonas	Line	Length, Temperature
Kiel	Polygon	Population
UK	Multipolygon	Area, GDP

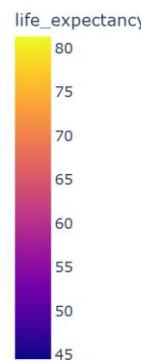
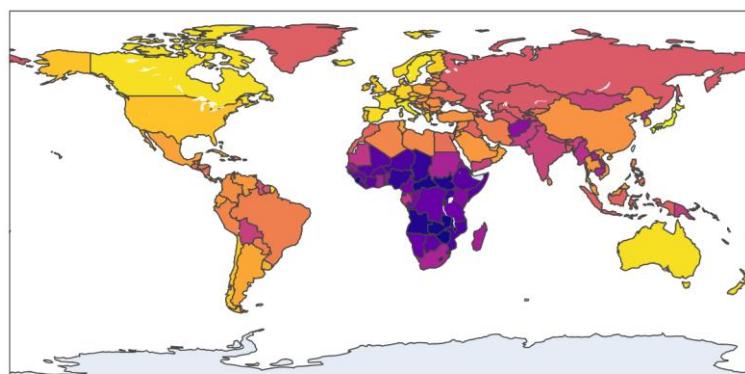


# Simple choropleth maps with Plotly

iso3	country	life_expectancy
FRA	France	79.056098
CHN	China	71.881000
DEU	Germany	77.926829
USA	United States	76.636585
ITA	Italy	79.778049

- ▶ Plotly has built-in vector data for countries
- ▶ Your data must have ISO3 country codes

```
px.choropleth(df, locations="iso3", color="life_expectancy")
```



# Other situations?

1. **For all other use cases, we need to find and integrate suitable geographic vector data ourselves!**
2. **Plotly is an option – but GeoPandas + Matplotlib is often more powerful**

# Typical workflow in other cases

1. Find suitable vector data  
for your entities



2. Represent as GeoDataFrame (GeoPandas)

iso3	country	life_expectancy
FRA	France	79.056098
CHN	China	71.881000
DEU	Germany	77.926829
USA	United States	76.636585
ITA	Italy	79.778049

iso3	geometry
CHN	MULTIPOLYGON (((78.91769 33.38626, 78.91595 33...
FRA	MULTIPOLYGON ((((-54.11153 2.11427, -54.13491 2...
DEU	MULTIPOLYGON (((13.81572 48.76643, 13.78586 48...
ITA	MULTIPOLYGON (((7.02208 45.92526, 7.06694 45.8...
USA	MULTIPOLYGON ((((-122.75302 48.99251, -122.6532...

3. Merge with your DataFrame



4. Visualize

# Vector data for world

- ▶ Naturalearthdata: cultural and physical vector data of the entire world



- 10 50 110 **Coastline** – ocean coastline, including major islands. Coastline is matched to land and water polygons.
- 10 50 110 **Land** – Land polygons including major islands
- 10 50 110 **Ocean** – Ocean polygon split into contiguous pieces.
- 10 **Minor Islands** – additional small ocean islands ranked to two levels of relative importance.
- 10 **Reefs** – major coral reefs from WDB2.
- 10 50 110 **Physical region features** – polygon and point labels of major physical features.
- 10 50 110 **Rivers and Lake Centerlines** – ranked by relative importance. Includes name and line width attributes. Don't want minor lakes? Turn on their centerlines to avoid unseemly data gaps.

# Vector data for Europe

## Eurostat Vector Data

Level	Name	Example
NUTS 0	Country	Germany
NUTS 1	State	Schleswig-Holstein
NUTS 2	Region	-
NUTS 3	District	Kiel

Datasets available for download

NUTS year \*

NUTS 2024

File format \*

SHP

Geometry type \*

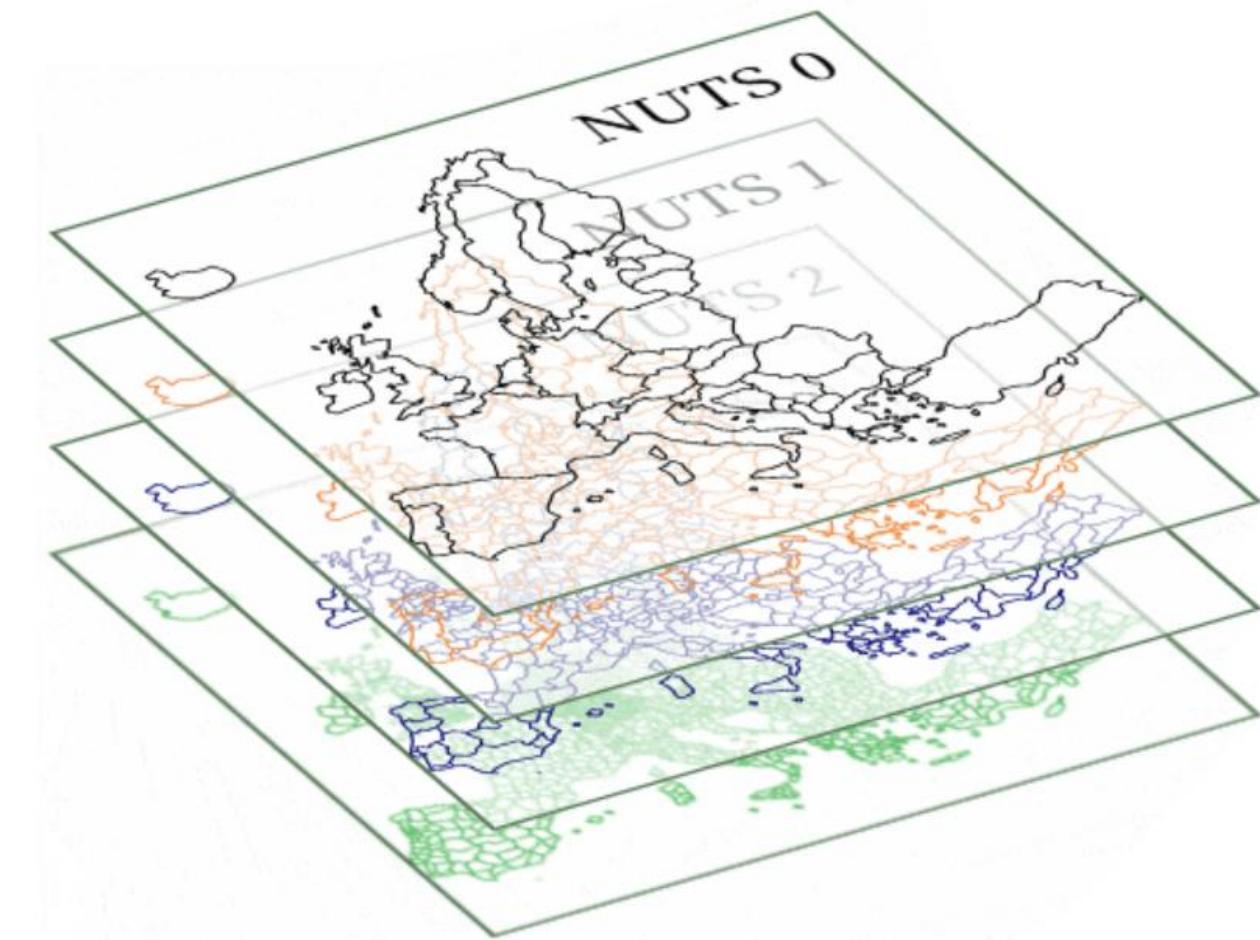
Polygons (RG)

Scale \*

20M

Coordinate reference system \*

EPSG: 3035



[Download](#)

# Vector data for Schleswig-Holstein

- ▶ Schleswig-Holstein vector data
- ▶ Shapefiles on various topics at state, region, or city level

ab 10.08.2022 Stadt Elmshorn

Stadt Elmshorn

E-Scooter Standorte und Parkverbotszonen  
im Bereich der Stadt Elmshorn

Kategorie:  Verkehr

Veröffentlicht: 10.08.2022

08.05.2022 Bundesland Schleswig-Holstein

Ministerium für Inneres, ländliche Räume, Integration und Gleichstellung

Wahlkreise der Landtagswahl 2022

Kategorien:  Regierung und öffentlicher Sektor  
 Regionen und Städte

Veröffentlicht: 19.10.2021

26.09.2021 Bundesland Schleswig-Holstein

Statistisches Amt für Hamburg und Schleswig-Holstein A.ö.R. (Statistikamt Nord)

Wahlkreise in Schleswig-Holstein zur  
Bundestagswahl 2021

Kategorie:  Regierung und öffentlicher Sektor

Veröffentlicht: 21.09.2022

# Vectors from OpenStreetMap



- ▶ **Tailored download via Overpass API**
  - ◆ Python Package: osmnx
  - ◆ [https://wiki.openstreetmap.org/wiki/Overpass\\_API](https://wiki.openstreetmap.org/wiki/Overpass_API)
  - ◆ <https://overpass-turbo.eu/>
  
- ▶ **Bulk download**
  - ◆ Python package: pyrosm
  - ◆ Continents, countries, regions, cities:  
<https://download.geofabrik.de/>

# Vector data file formats

## Shapefile:

Collection of multiple files

- ▶ .shp: shape
- ▶ .shx: shape index for fast search
- ▶ .dbf: attributes
- ▶ .prj: projection
- ▶ ...

## Geojson and Topojson

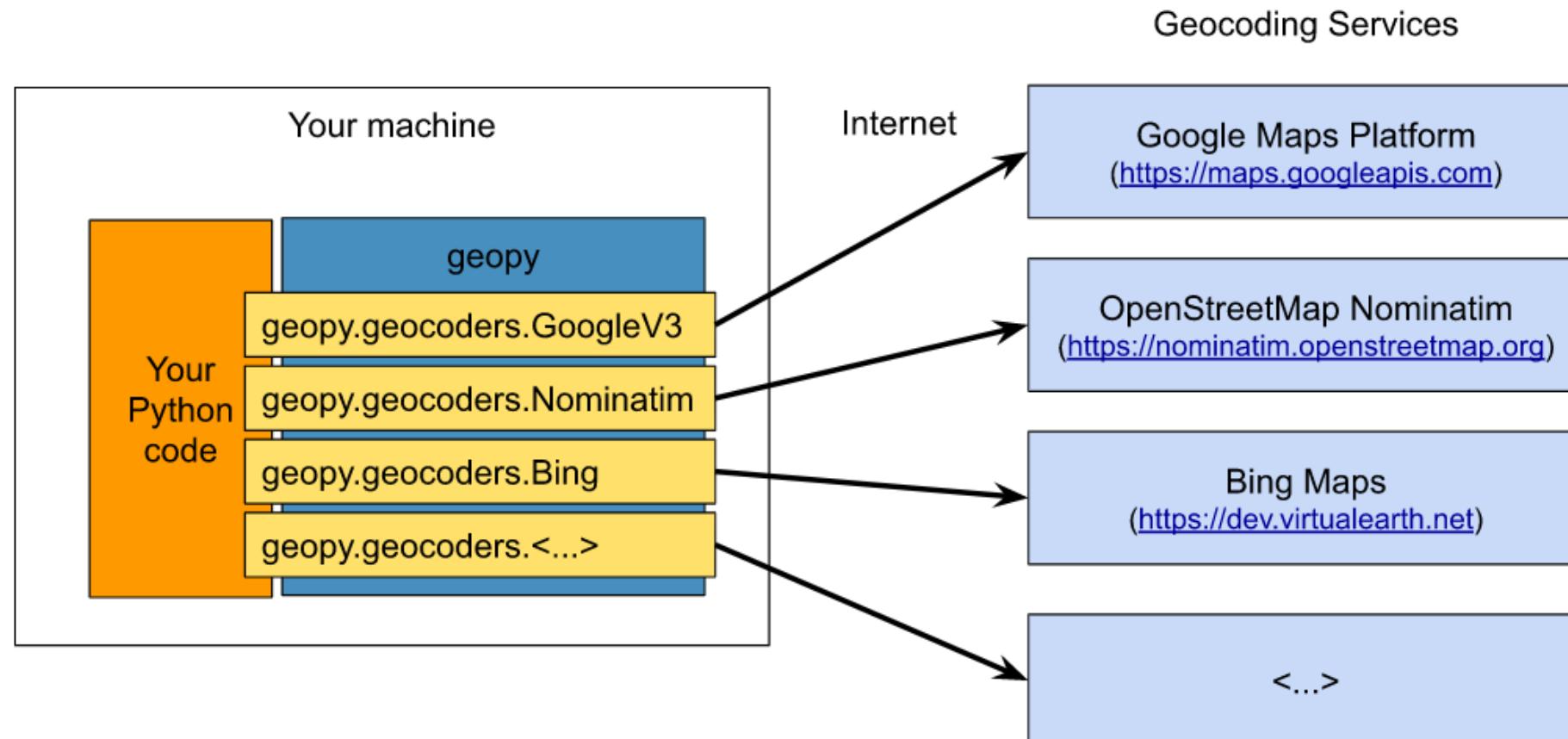
```
{  
  "type": "Feature",  
  "geometry": {  
    "type": "Point",  
    "coordinates": [125.6, 10.1]  
  },  
  "properties": {  
    "name": "Dinagat Islands"  
  }  
}
```



# Data Source: Geocoding

**Geocoding:** Place name or address → coordinates

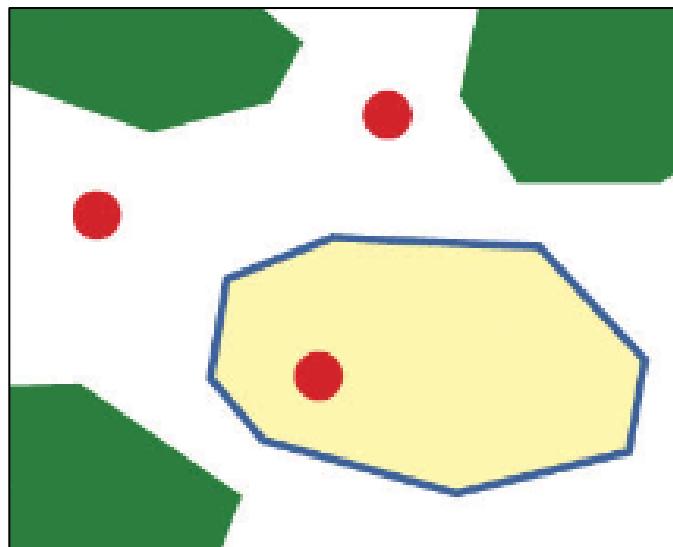
**Reverse geocoding:** coordinates: → address or place name



# More spatial operations

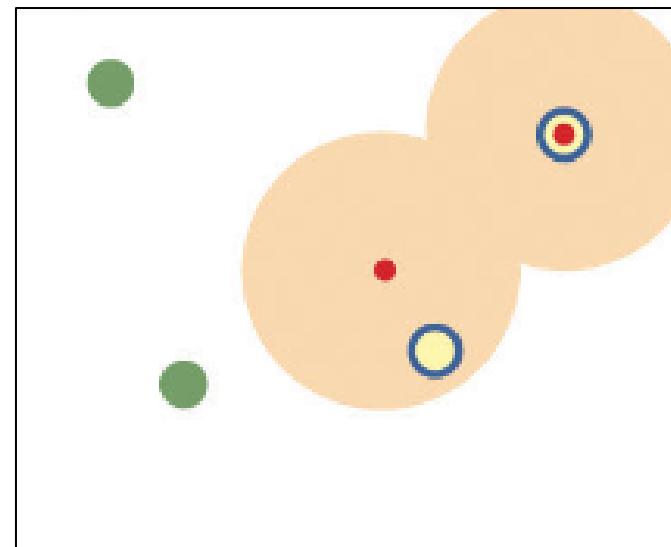
- ▶ Calculate:
  - ◆ Distance
  - ◆ Length
  - ◆ Area
  - ◆ Shortes route
  - ◆ Location of Centroid
  - ◆ ...

# Topological relations



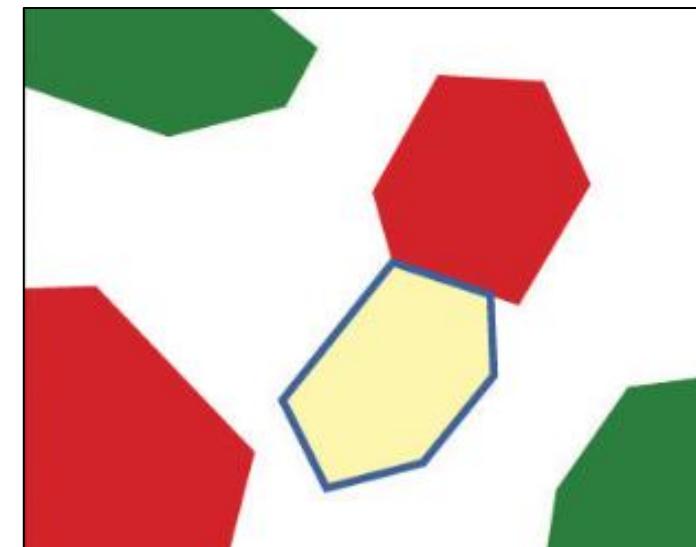
## Contain

Which of the given bus stops are located within Kiel?



## Within distance of

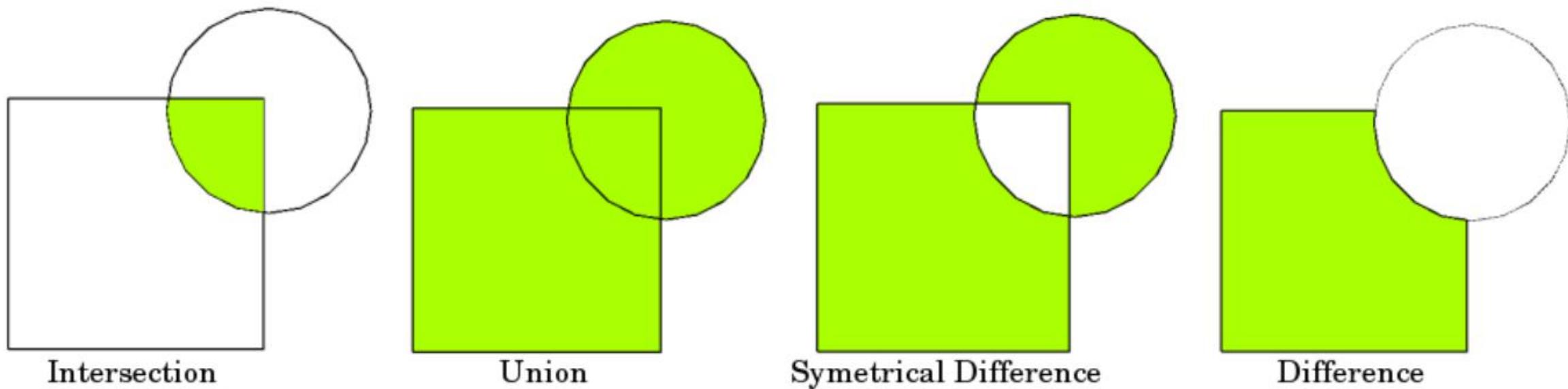
Which schools are within 10km radius to my home?



## Touch the boundary of

Which country shares a border with Germany?

# Set / Overlay Operations



Intersection

Union

Symmetrical Difference

Difference