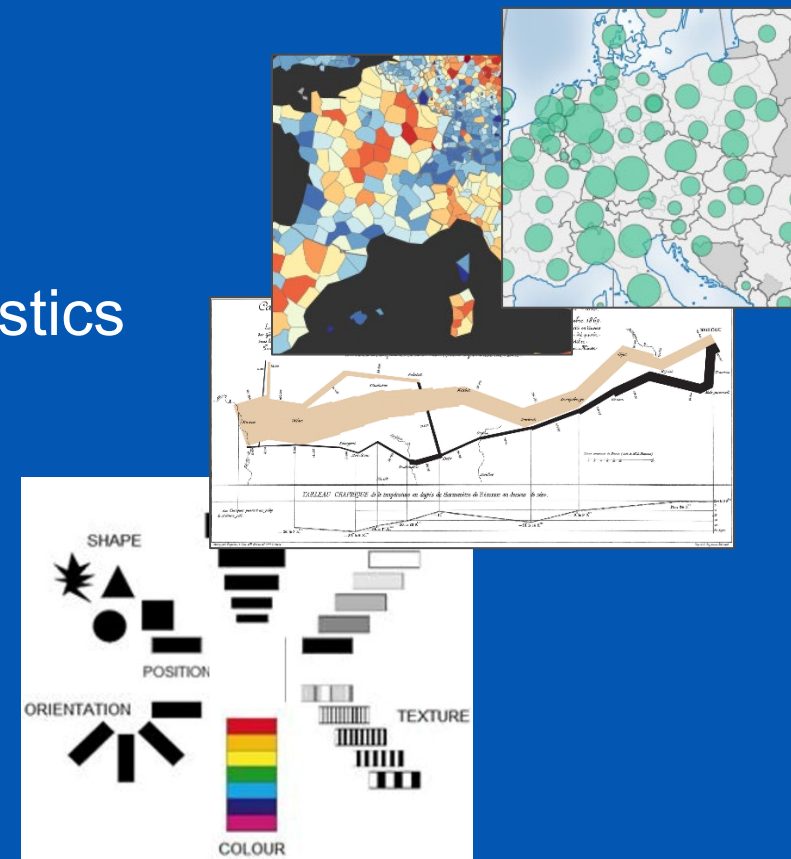


Statistical cartography

A short introduction for mapmaking from official statistics

EMOS webinar – 30th March 2021

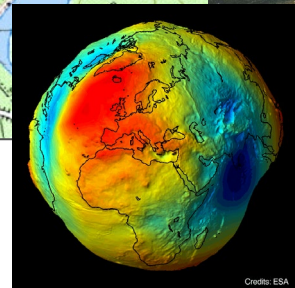
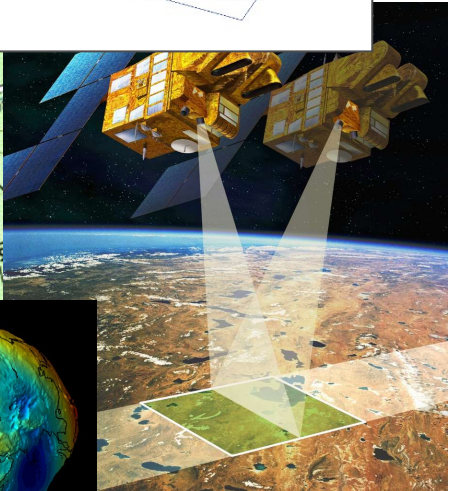
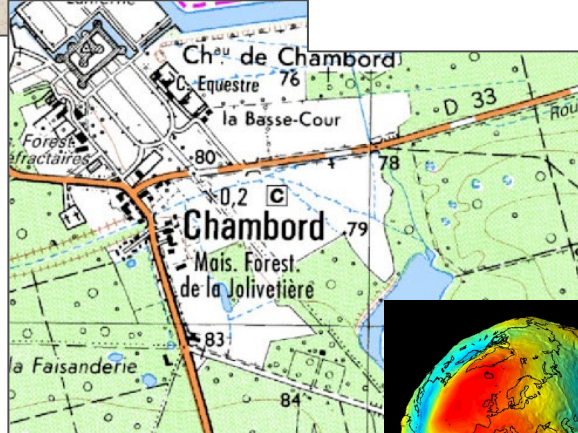
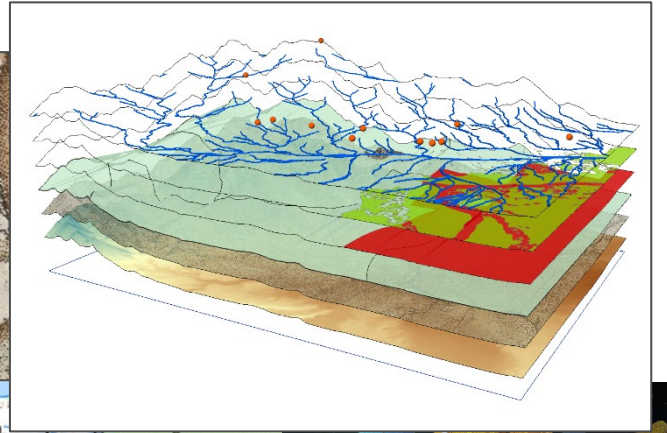
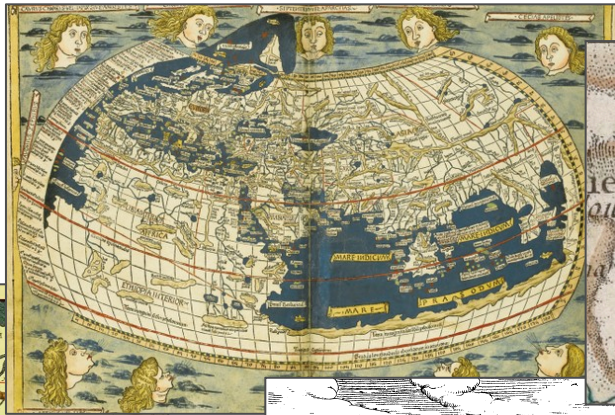
Julien Gaffuri – Eurostat-GISCO



Objective

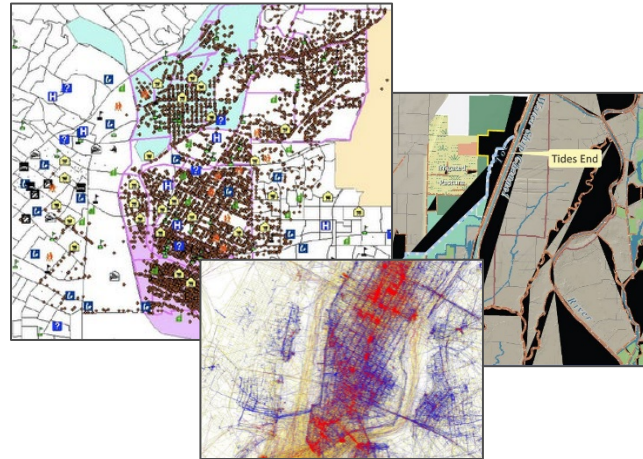
- Introduce base cartographic design principles for statistical maps.
- “Dos and don’ts” for correct and efficient map making.
- Examples of maps.

Cartography, GIS, spatial analysis

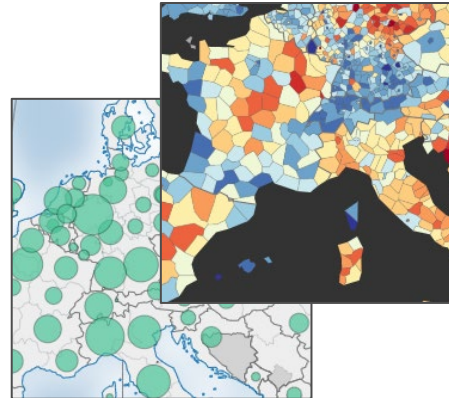


The cartographic language

From meaningless gibberish...

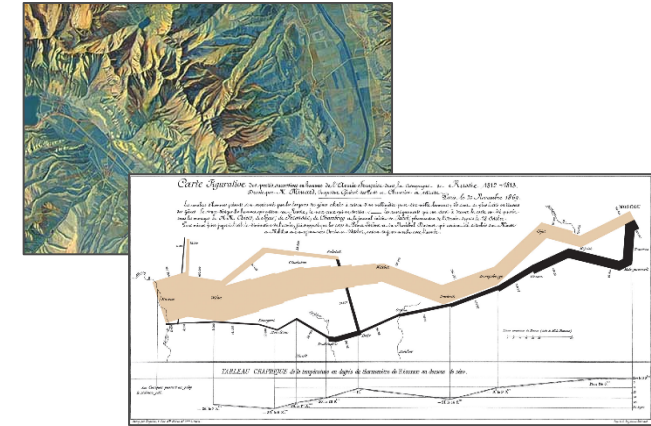


... to efficient message...



The dog is in the garden.

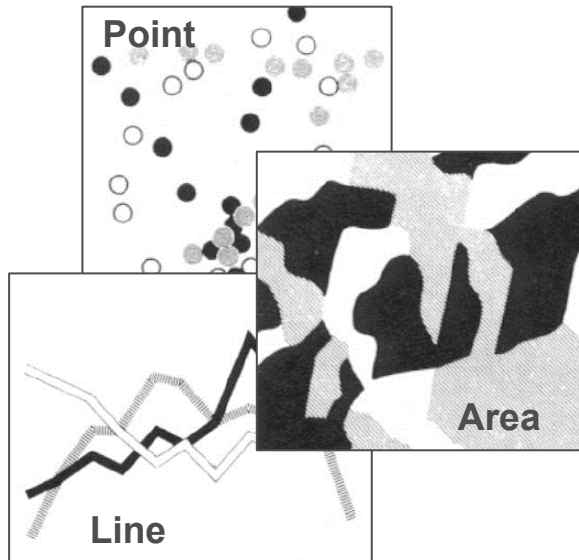
... to masterpiece



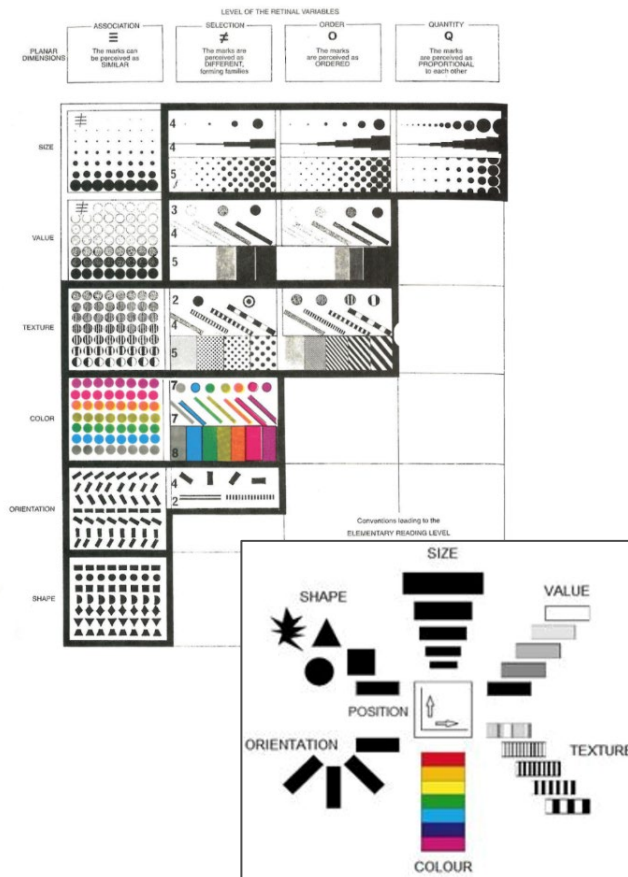
To be, or not to be.

The cartographic language

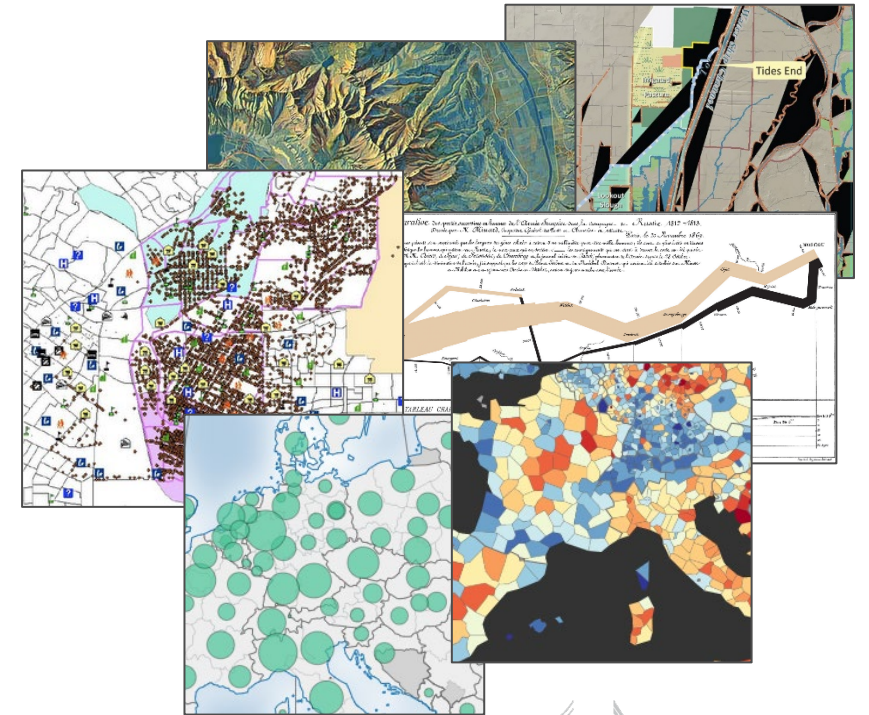
Words



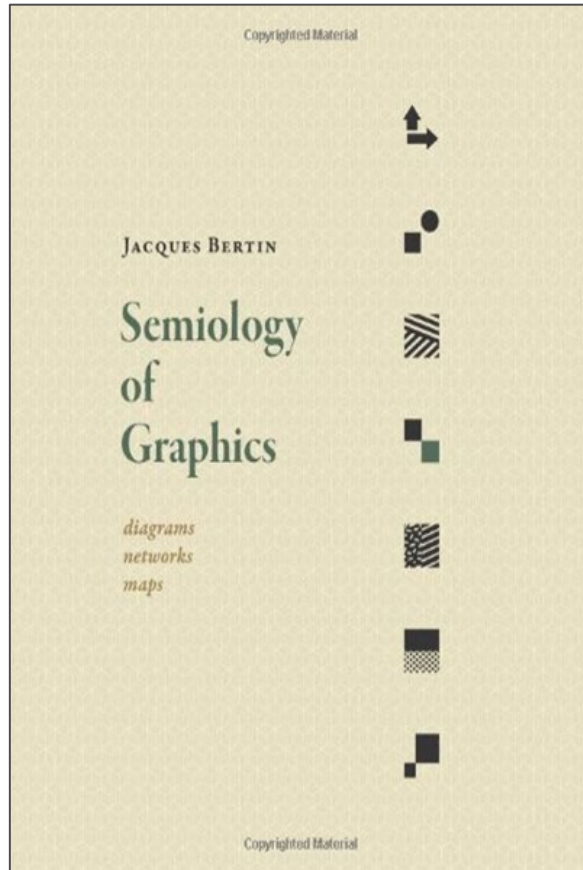
Grammar, rules



Litterature



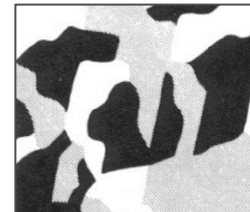
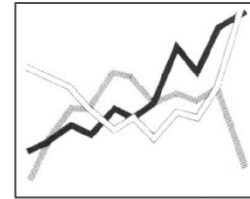
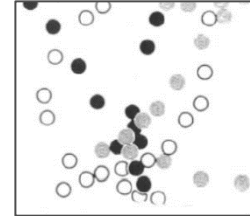
Semiology of graphics



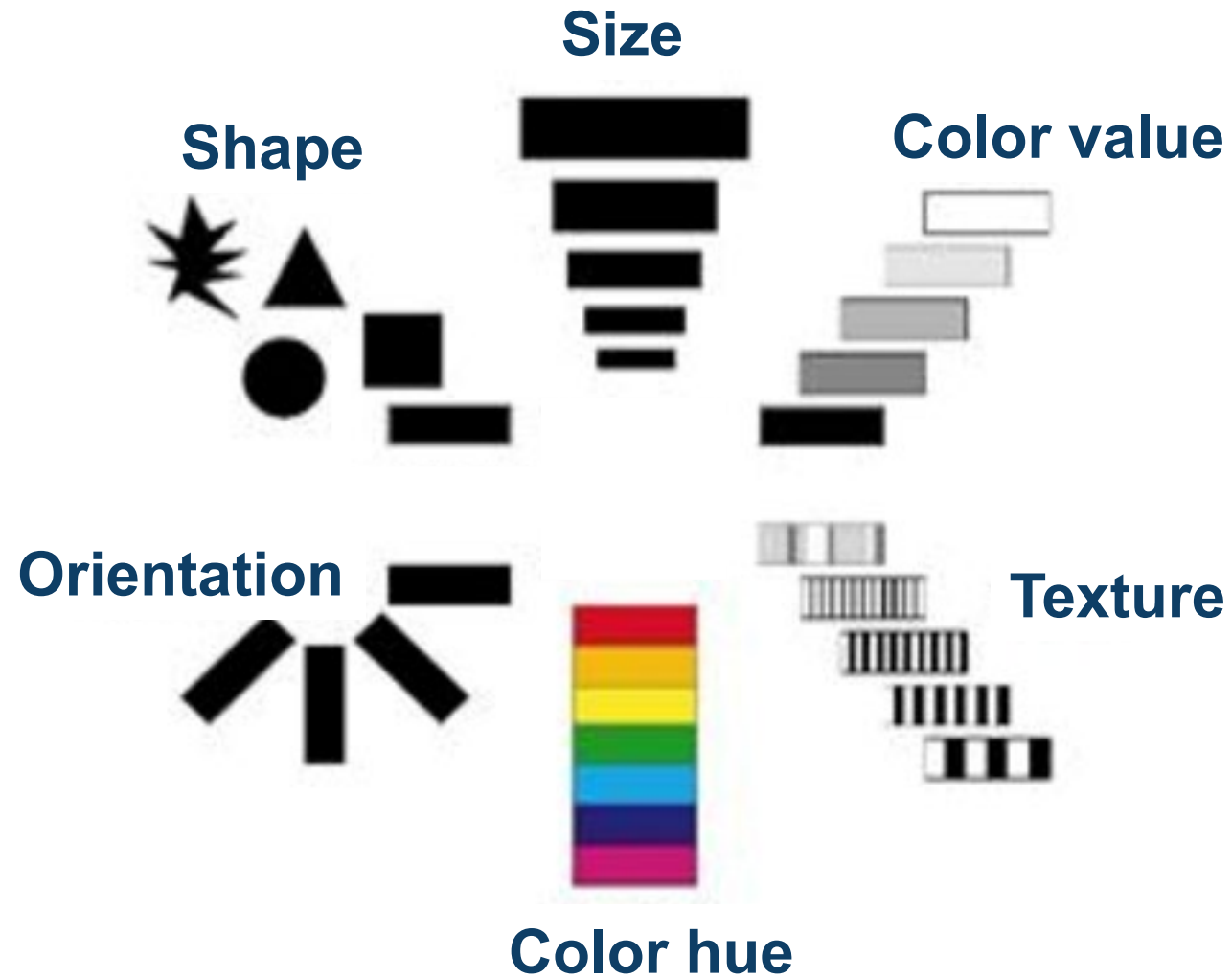
Bertin, J. (1968). *Semiology of Graphics: Diagrams, Networks, Maps*, Esri Press books, ISBN: 9781589482616.

Visual implantations

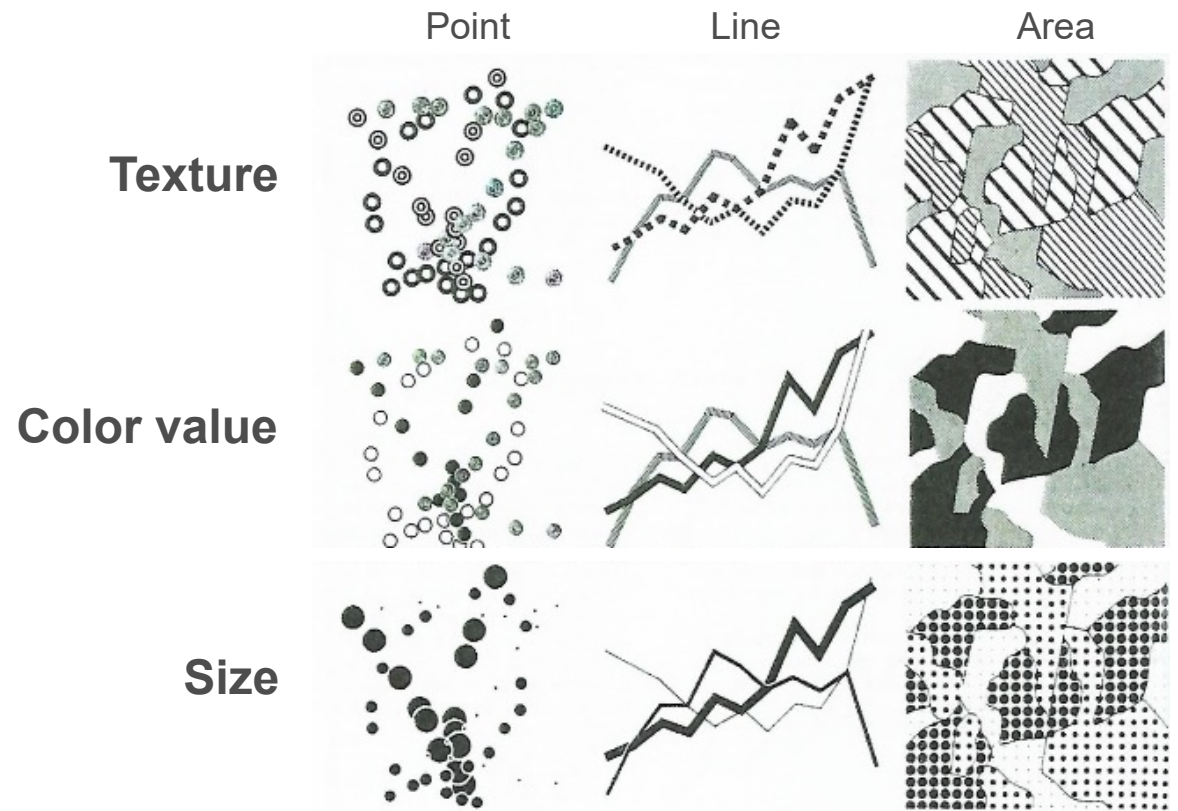
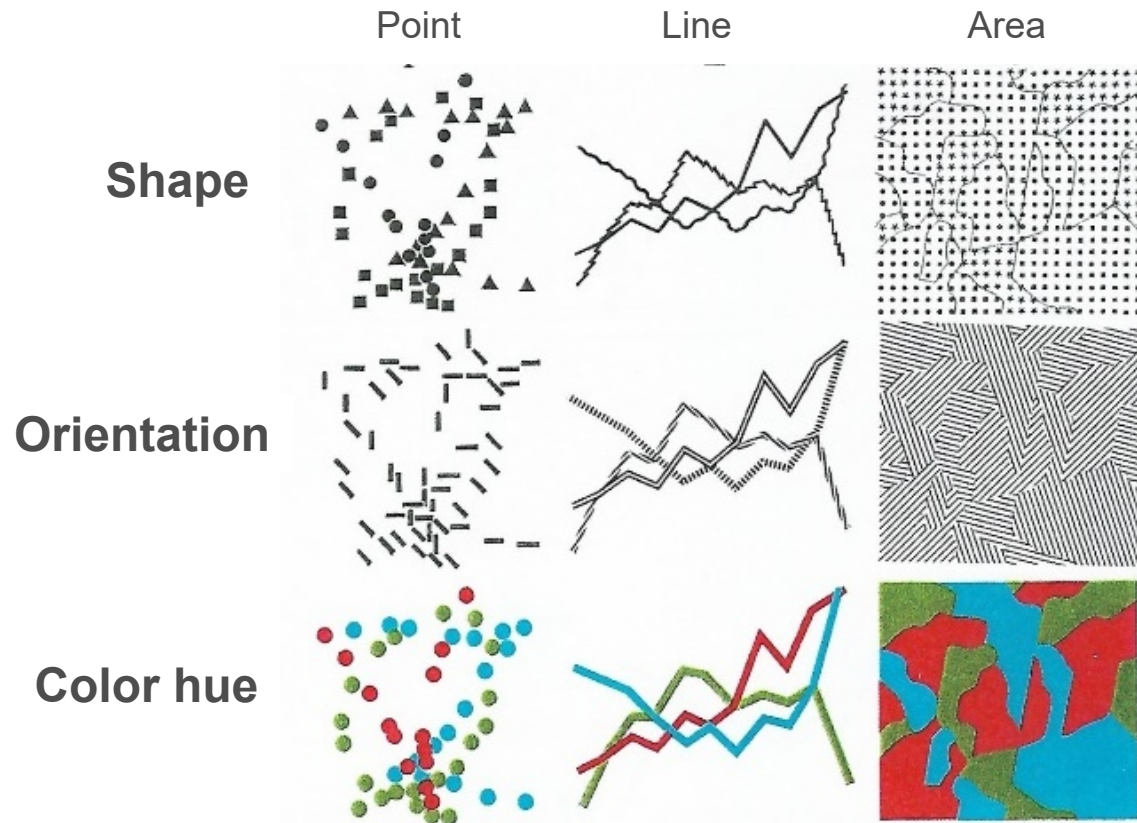
- Point
 - Show location
- Line
 - Show a limit, a trajectory, a connection
- Area
 - Show a portion of the plan



Visual variables



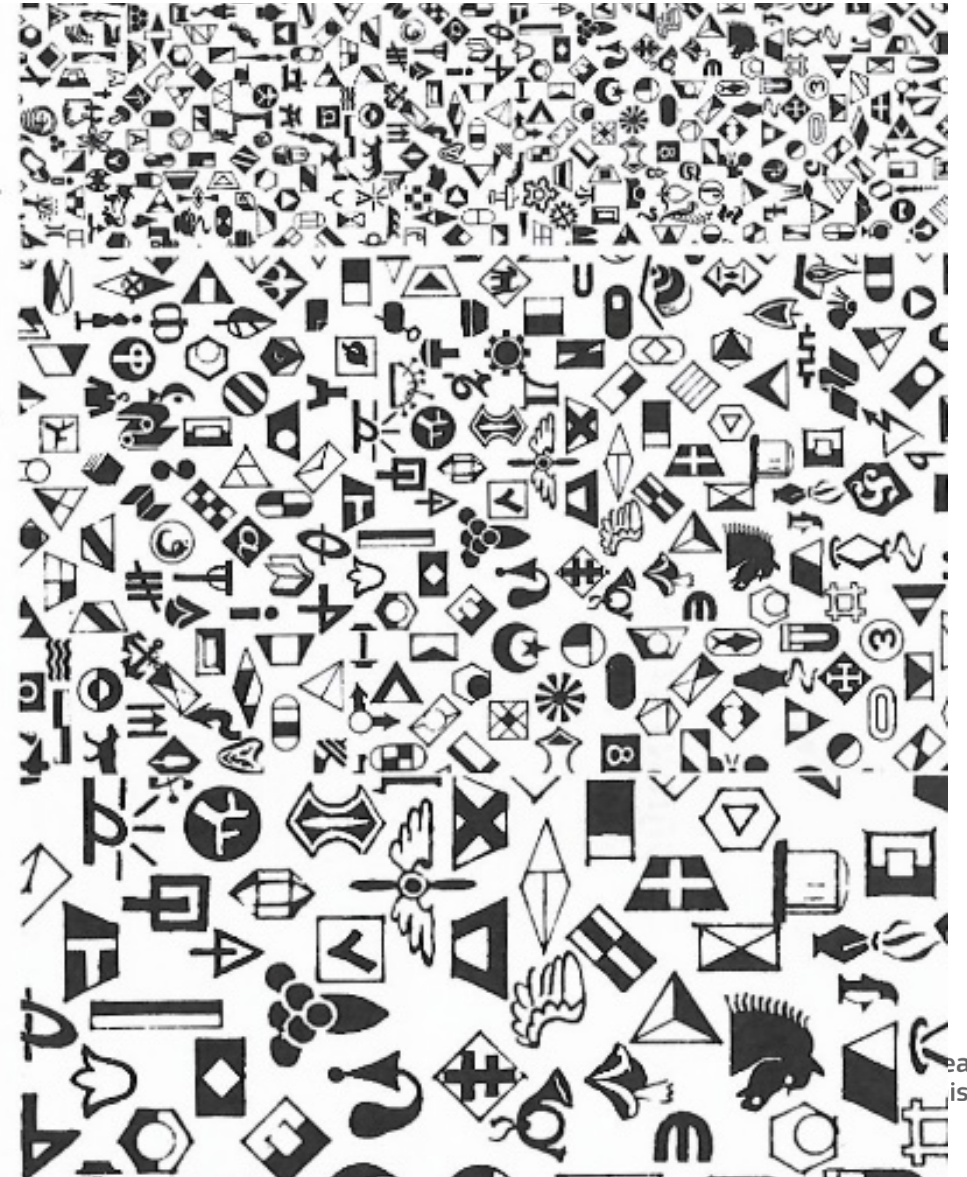
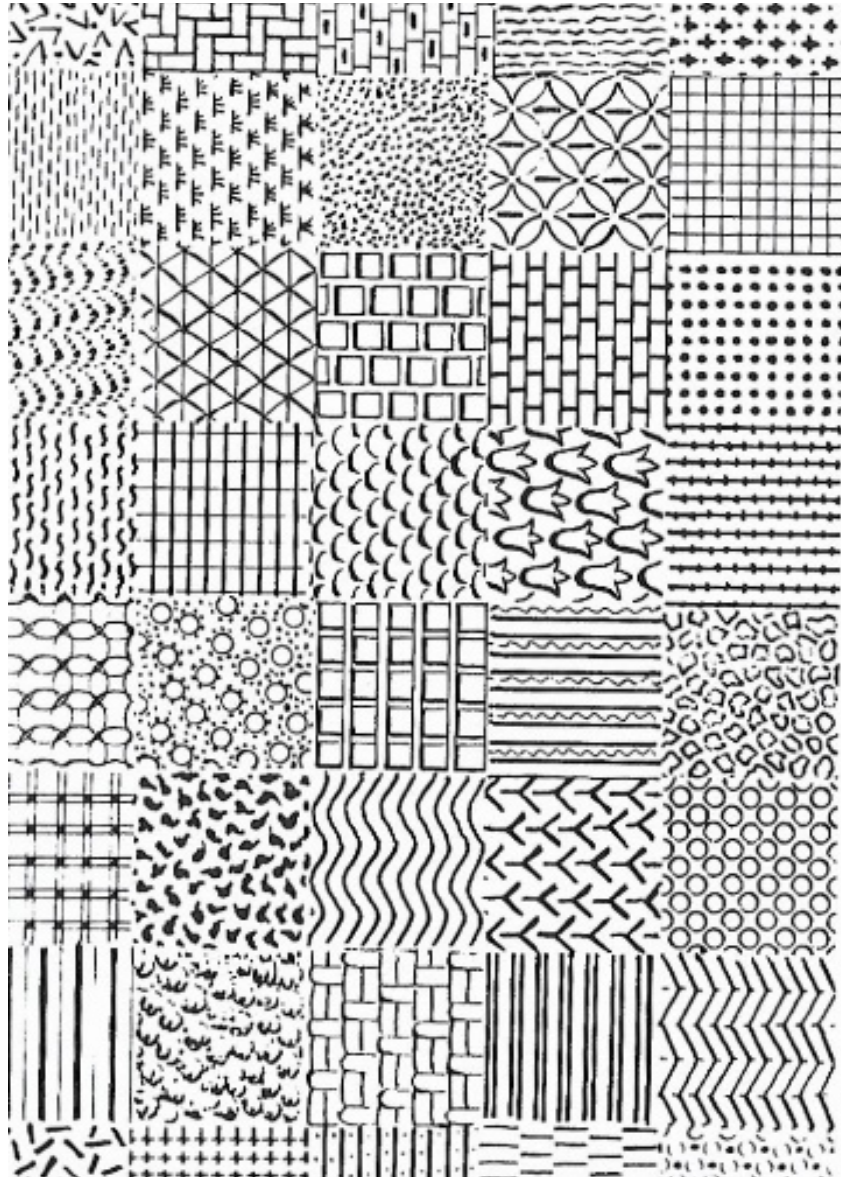
Visual variables



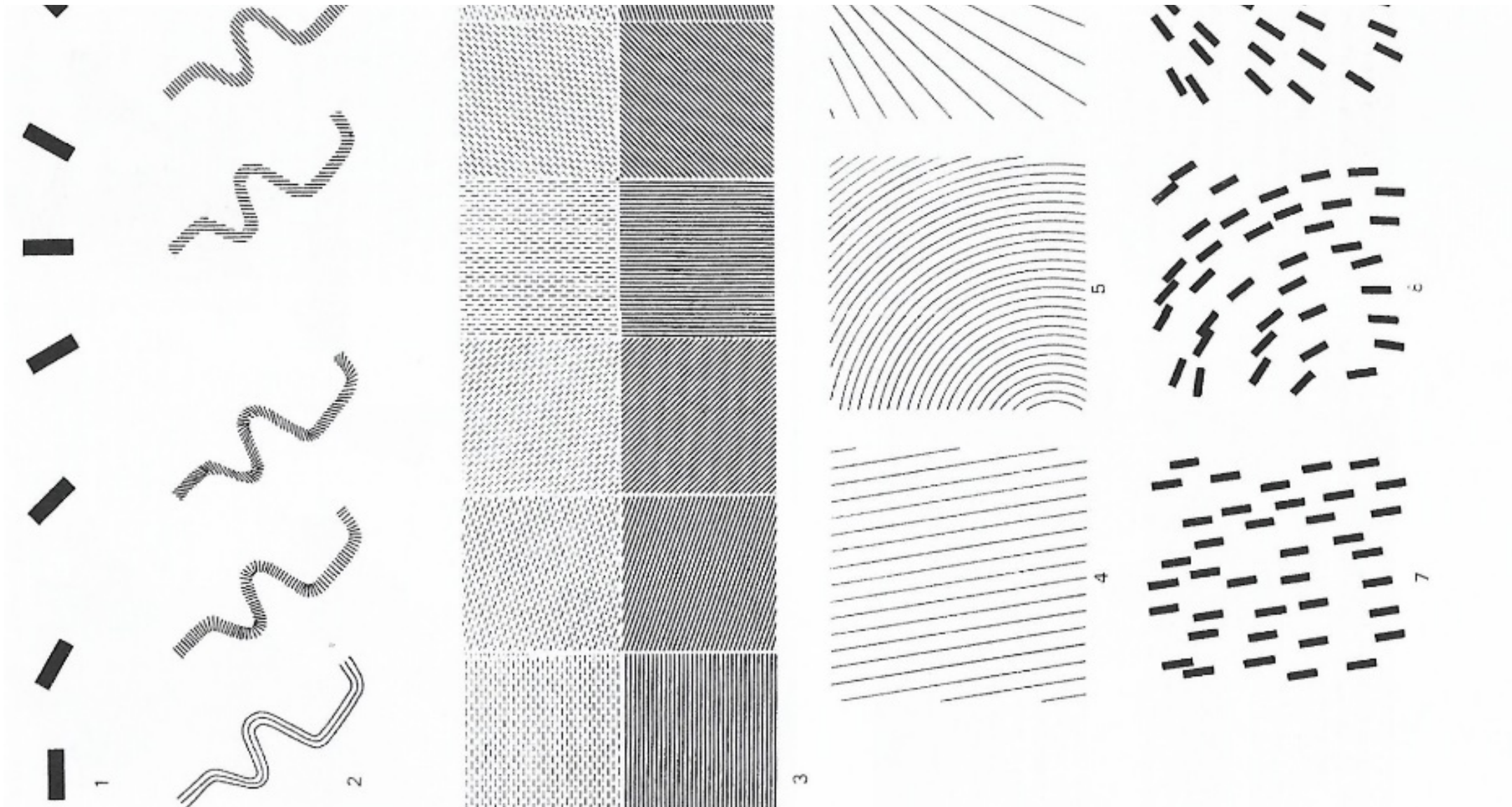
Visual variables – levels and lengths

- Levels
 - **Association** – Elements can be perceived as similar.
 - **Selection** – Elements are perceived as different, forming families.
 - **Order** – Elements are perceived as ordered.
 - **Quantity** – Elements are perceived as proportional to each other.
- Length
 - Number of differentiable categories which can be represented.
 - Depends on the implantation and visual variable.

Visual variables - Shape

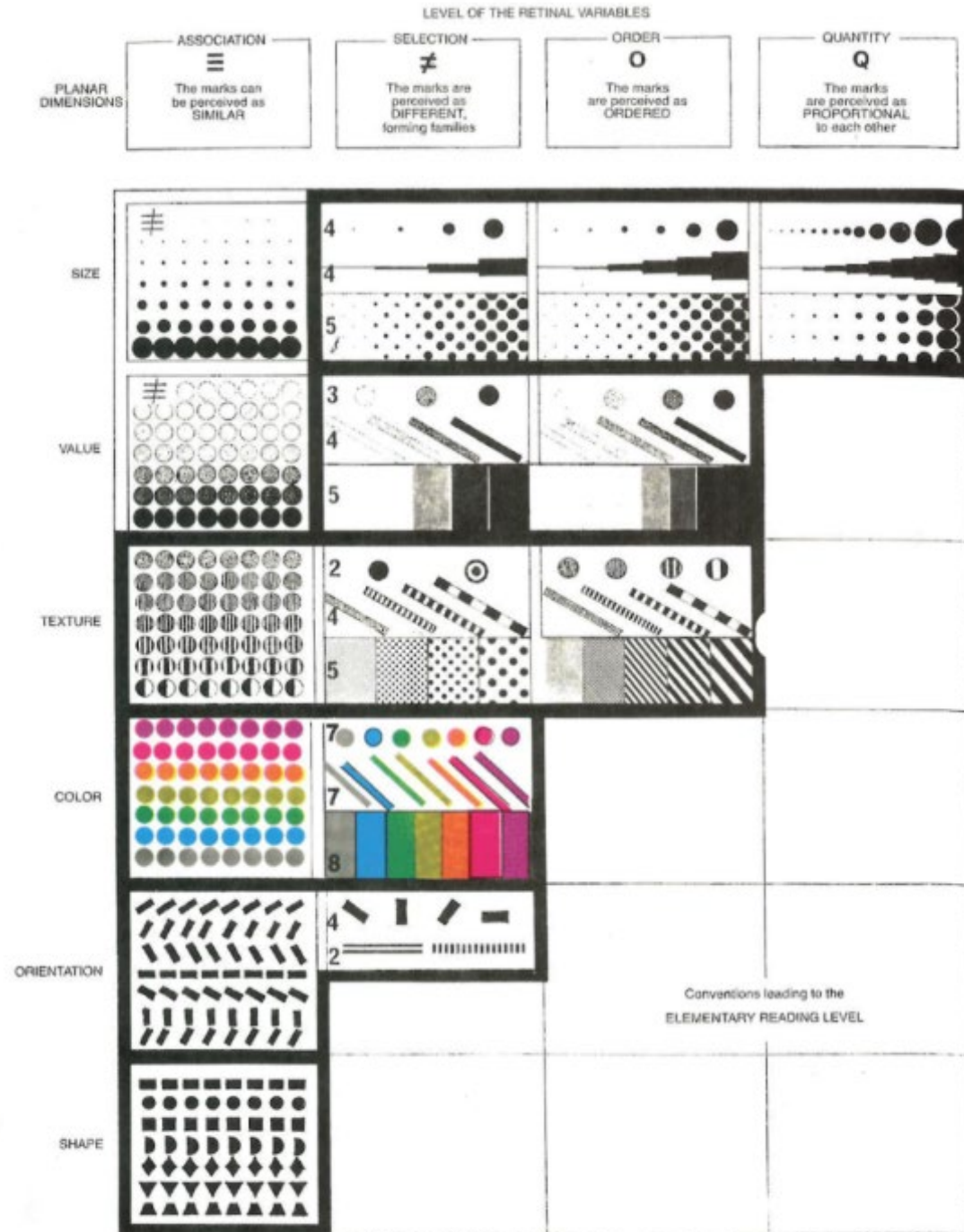


Visual variables - Orientation



Synthesis

A grammar for mapmaking



Focus on official statistics

- Types of variables: Nominal, ordinal, numeric (absolute / relative)
- Organised into a hypercube structure, X dimensions.
- Implantation:
 - Aggregates, usually on areal statistical units.
 - Sometimes micro data, on point unit records.
 - More rarely, on linear statistical units (network).



Focus on official statistics - Eurostat

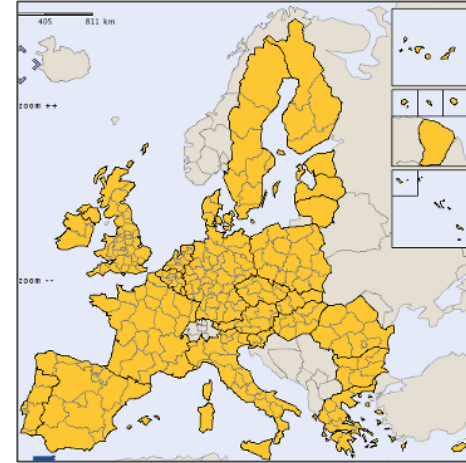
eurostat Important legal notice
v3.7.0-20201106-5867-ESTAT_LINUX_PROD
DATAEXPLORER_PRDwls31
Explanatory texts (me)

Population on 1 January by age group, sex and NUTS 2 region
[demo_r_pjangroup]

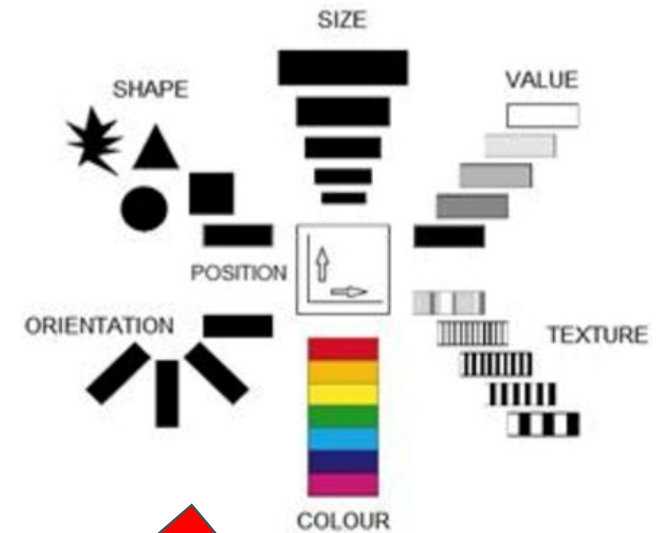
Last update: 11-03-2021
Table Customization [show](#)

TIME + GEO + Total +
+ Age class + Unit of measure
Total + Number +

	2016	2017	2018
Norway	5,210,721	5,258,317	5,295,619
Norge	5,210,721	5,258,317	5,295,619
Oslo og Akershus (statistical region)	1,251,687	1,271,127	1,287,495
Innlandet	384,221	385,669	386,836
Sør-Østlandet (statistical region)	981,761	997,967	1,000,670



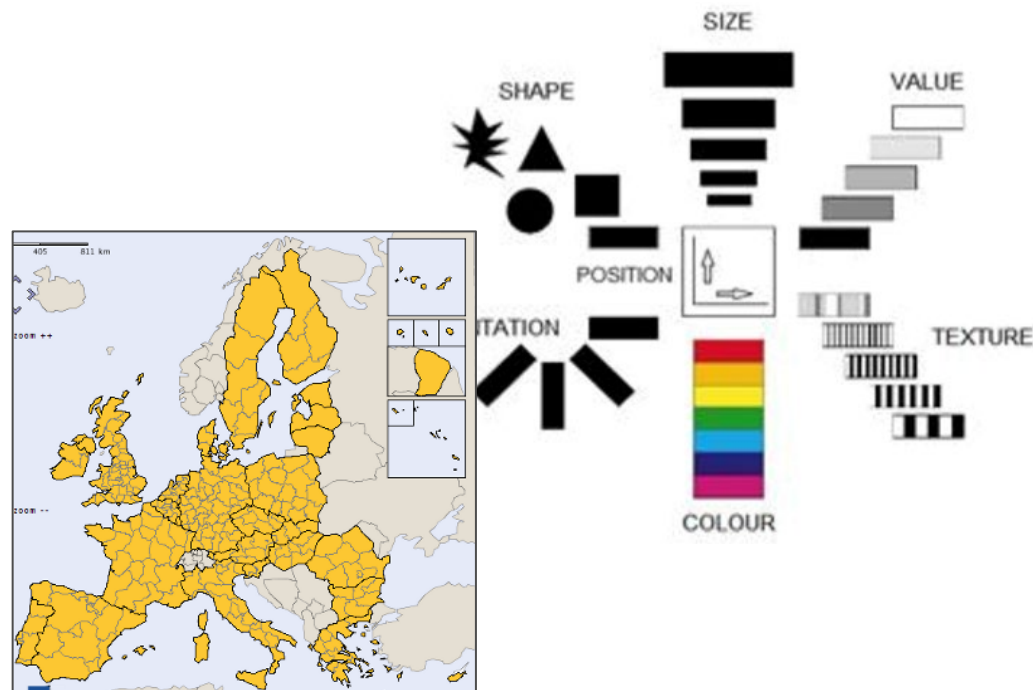
Hypercube dimensions



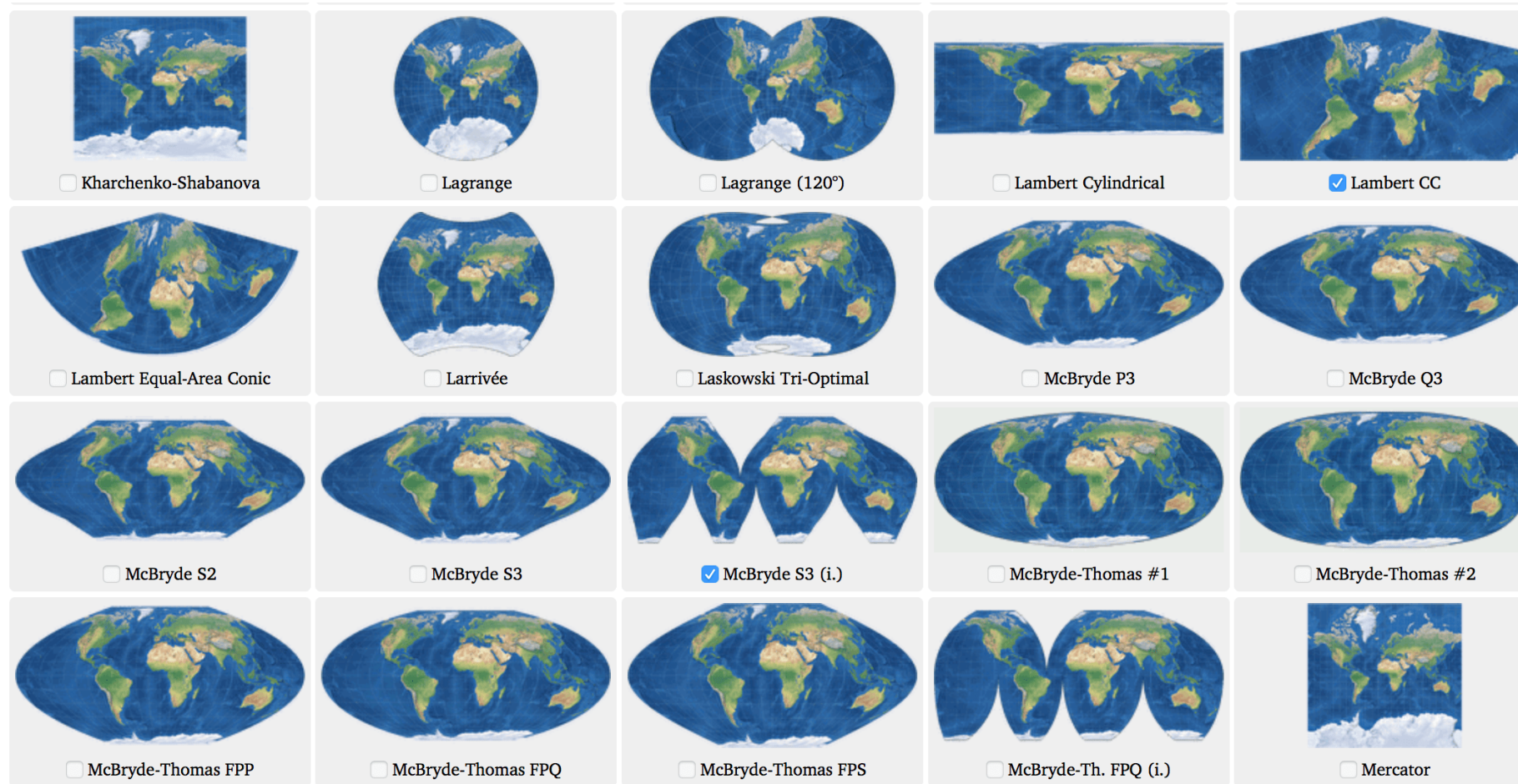
How ?

Some rules for statistical map template

- Cartographic projections
- Generalisation – aggregation
- MAUP



Cartographic projections



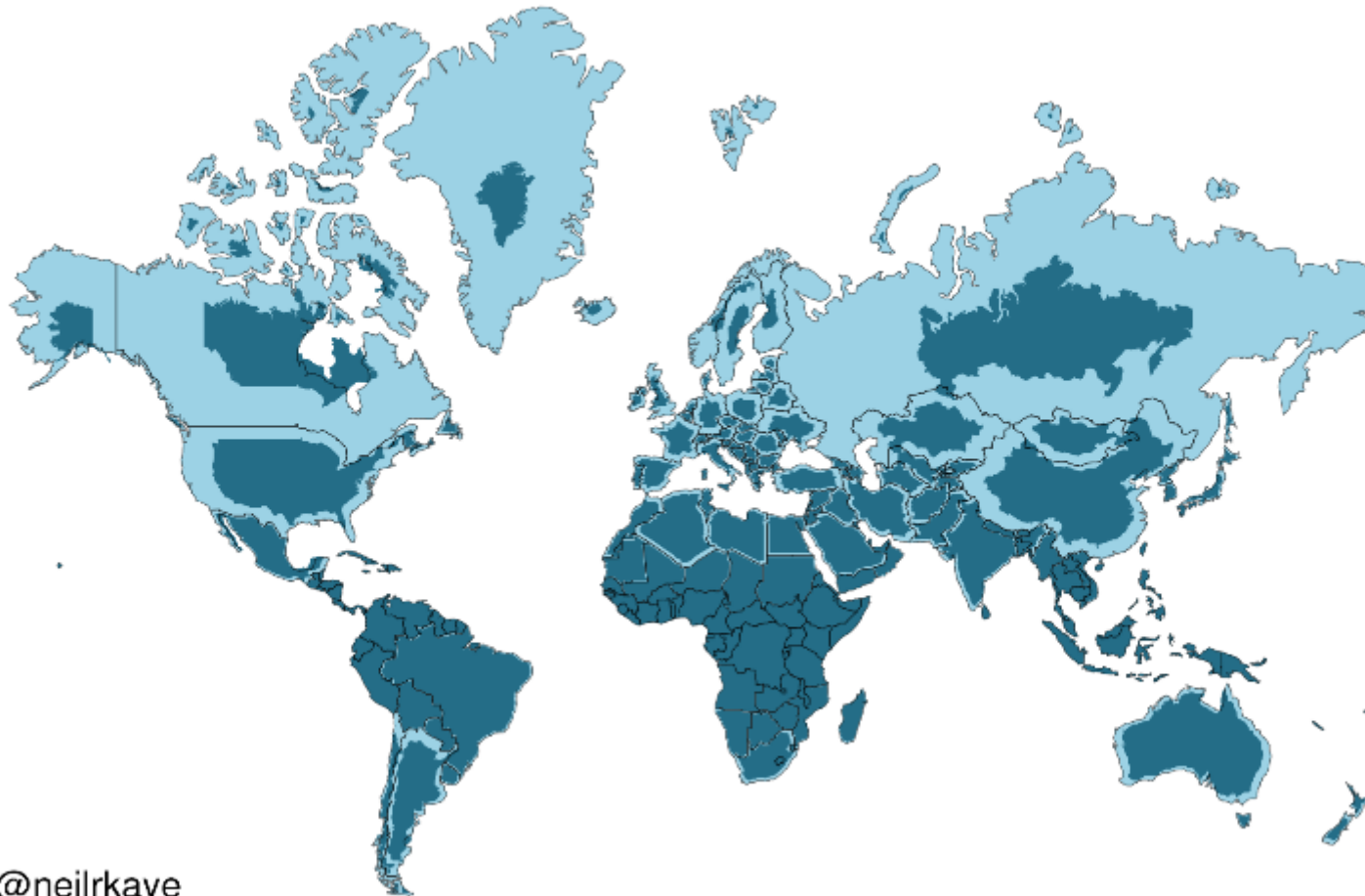
Cartographic projections

- Projection introduce distortion in size, shape or both.
 - Equal area projections preserve size.
 - Conformal projections preserve shape/angle.
 - Compromise projections
- Illustration with Tissot's indicatrix



Cartographic projections

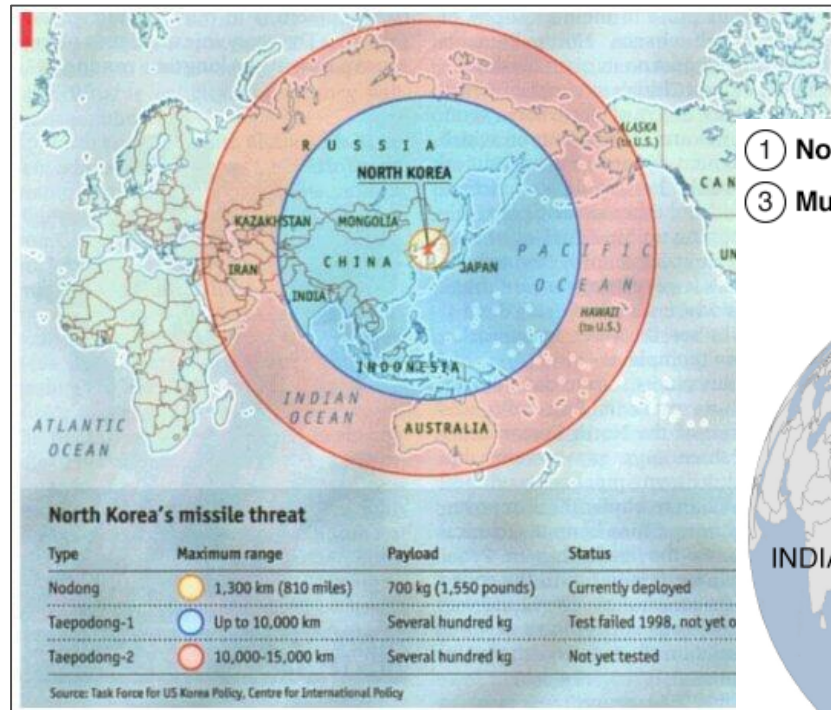
World Mercator projection with true country size added



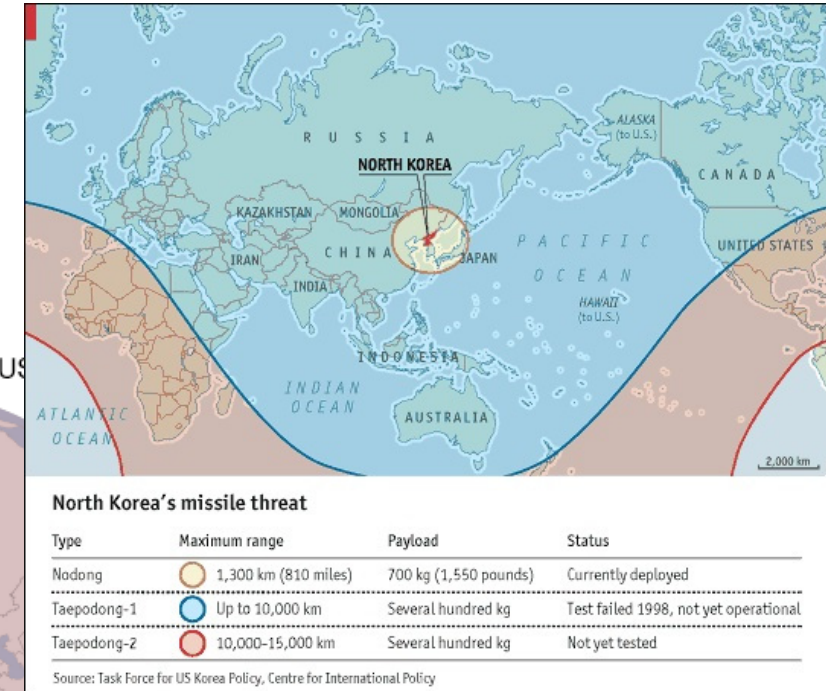
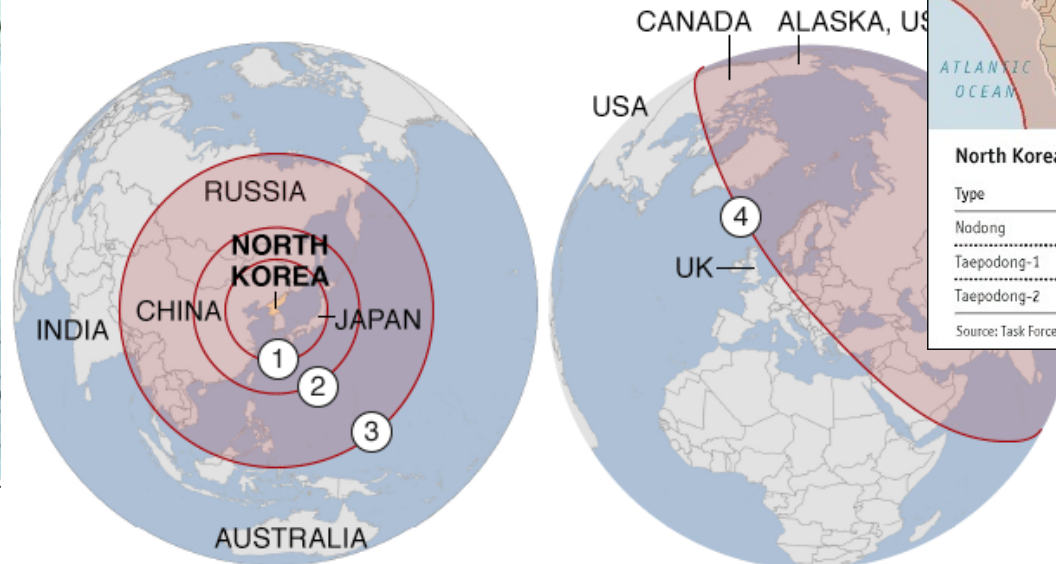
@neilrkaye

Cartographic projections

North Korea's missiles range, the Economist, 2003



- ① Nodong 1,300km ② Taepodong 1 2,000km
 ③ Musudan 4,000km ④ Taepodong 2 8,000km



Source: George C. Marshall Institute

BBC

Cartographic projections

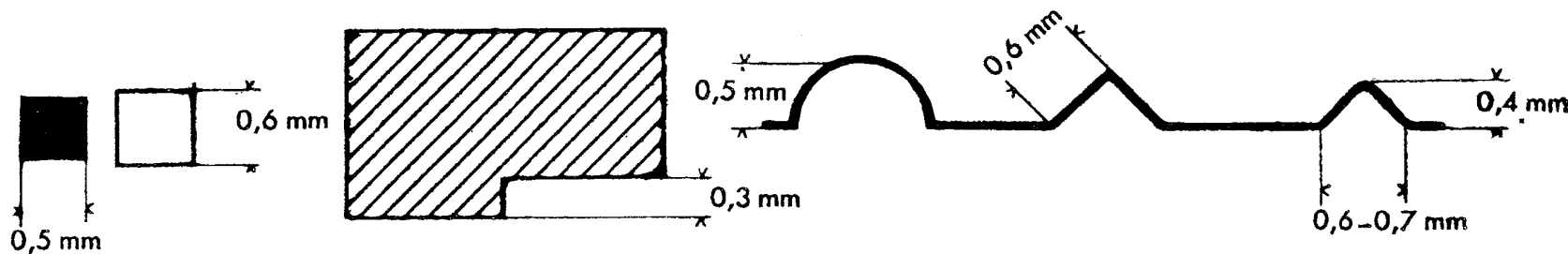
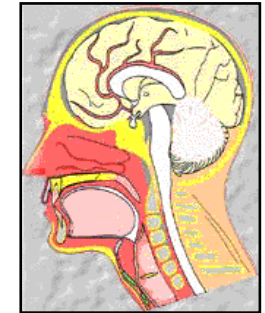
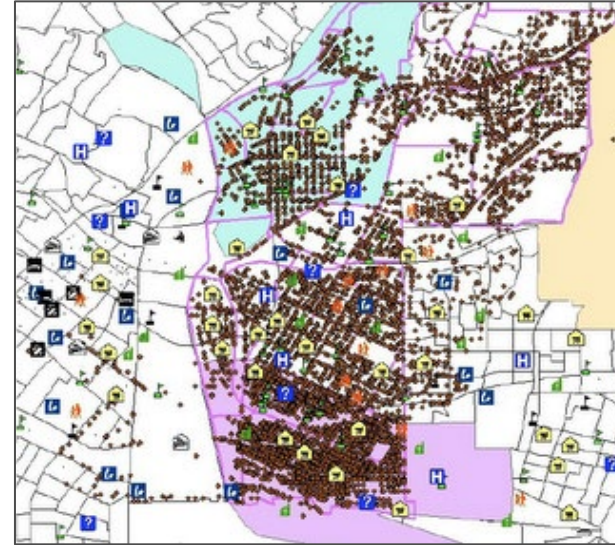
- Spilhaus projection



Spilhaus, A. (1942). "Maps of the whole world ocean." *Geographical Review*, 32 (3), p. 431–5.
doi: [10.2307/210385](https://doi.org/10.2307/210385)

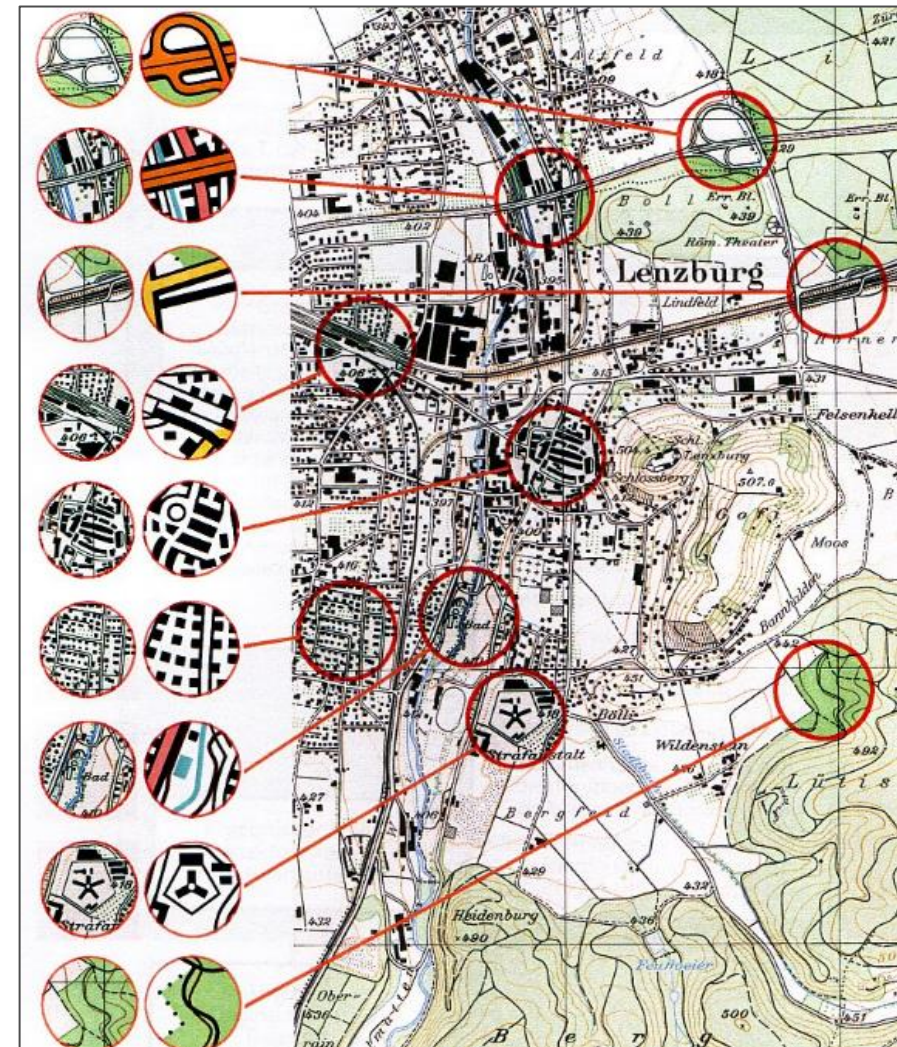
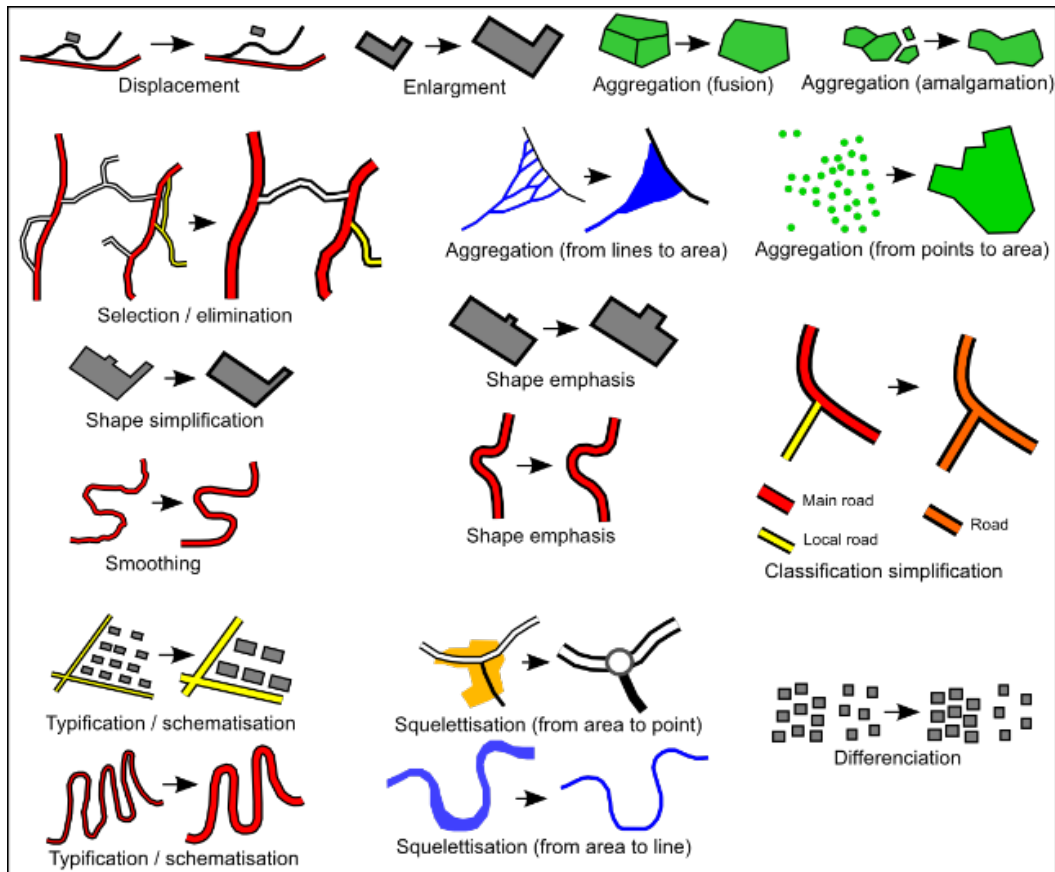
Simplification – generalisation

- Need to keep information simple
- Keep suitable information density, depending on the scale
- Improve legibility

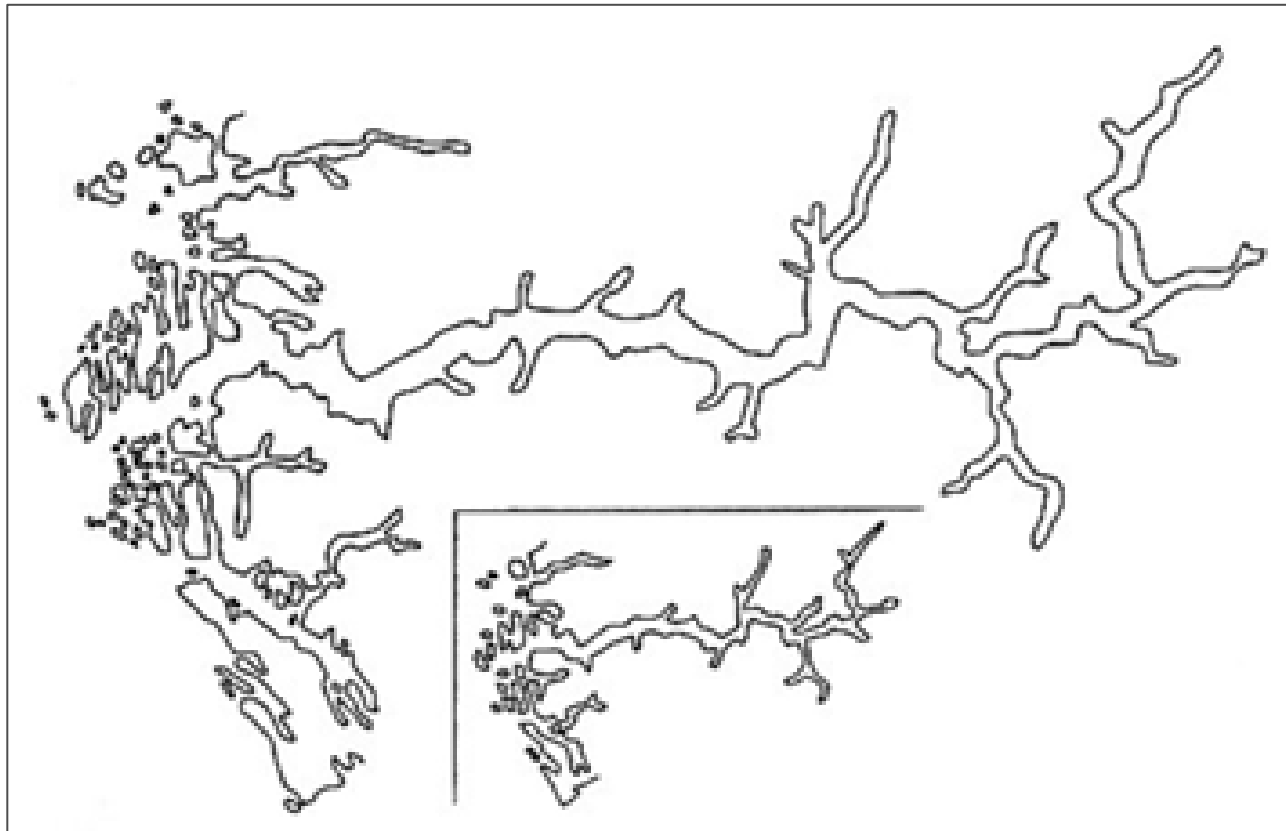
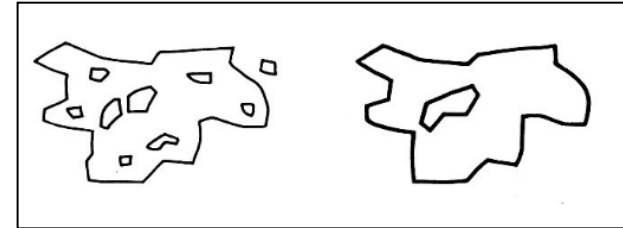
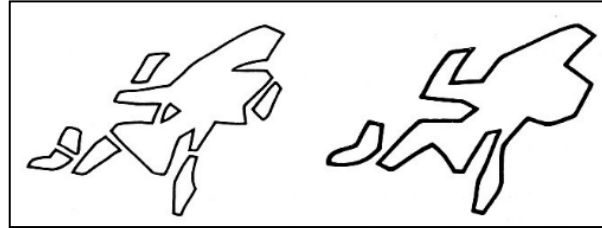
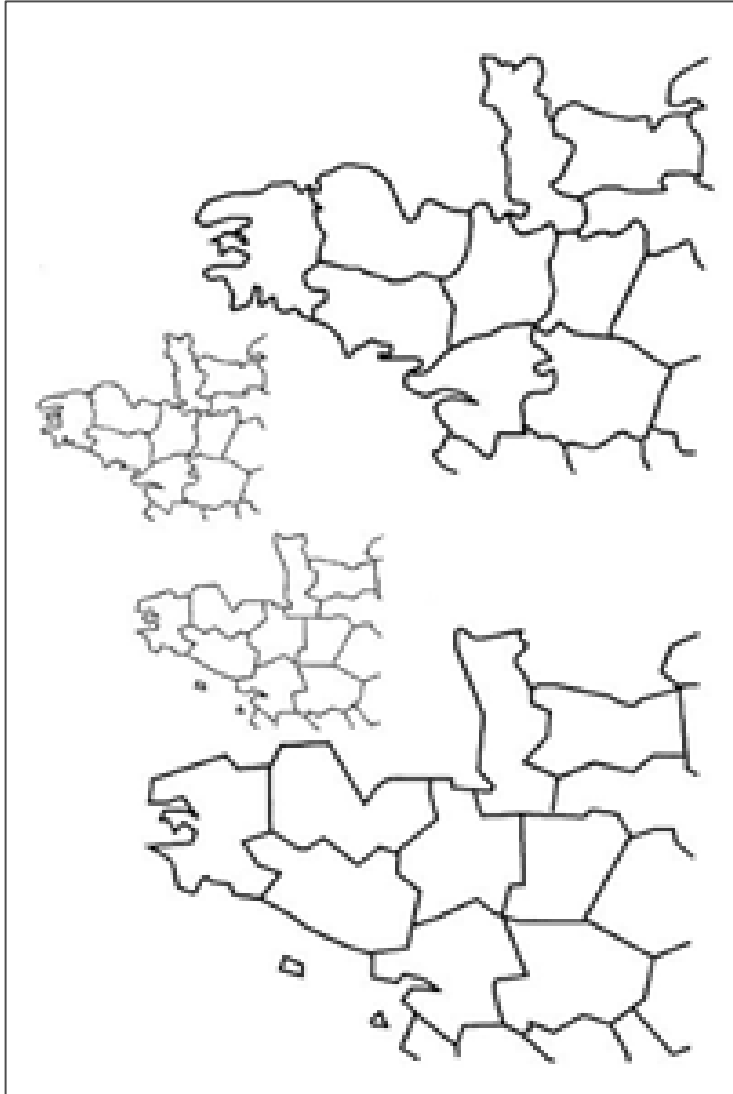


[Salichtchev 1967; Cuenin 1972]

- The case of topographic maps.

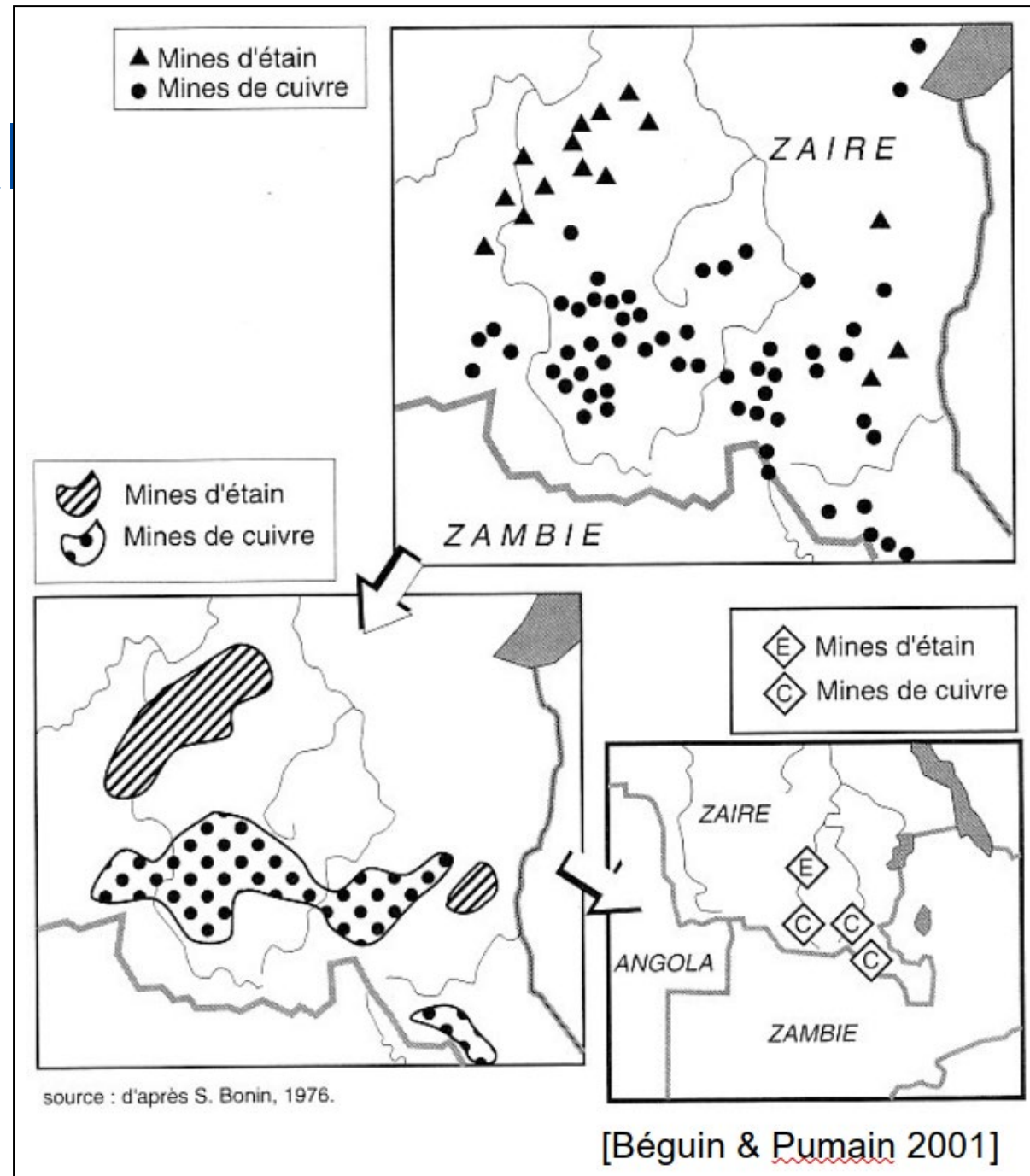


Simplification – generalisation



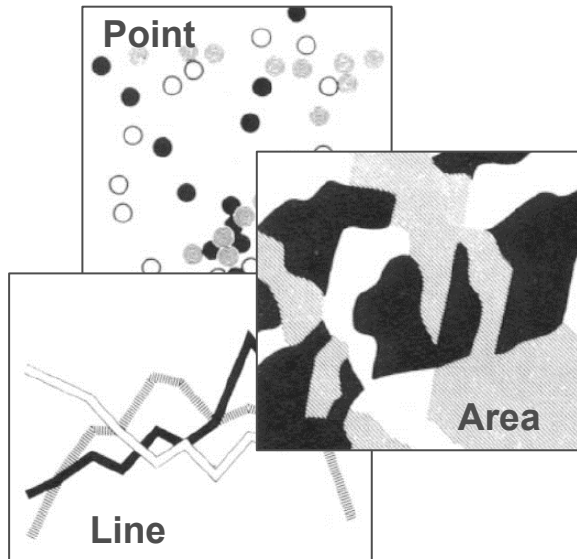
Simplification – general

- For thematic maps, need to adapt implantation to the scale.
- Aggregation units.
- Show clusters – as proportional symbols.
- Show as isoline – kernel density.

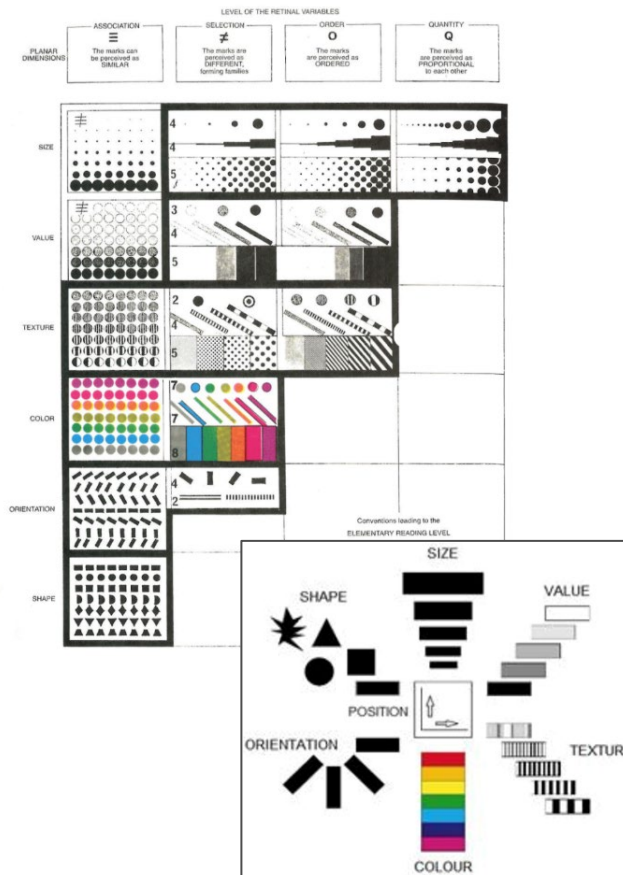


The cartographic language

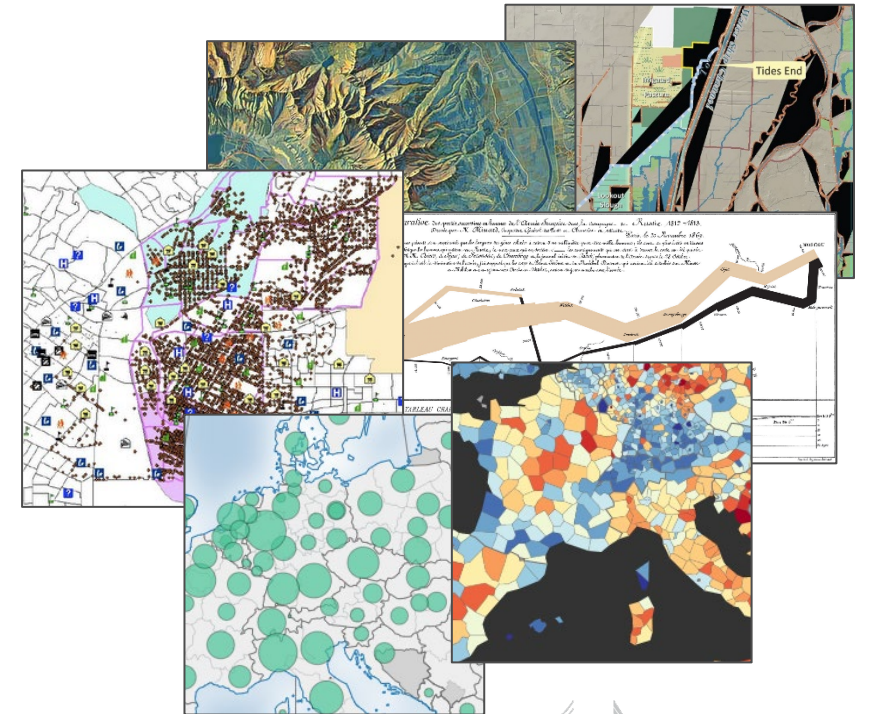
Words



Grammar, rules

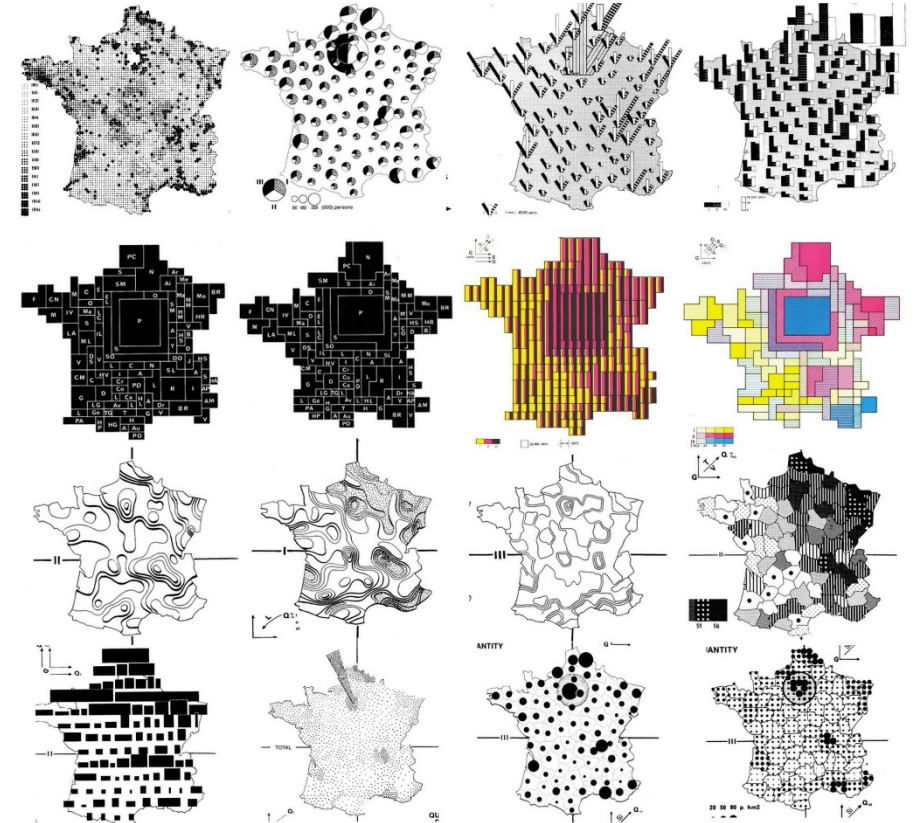


Litterature



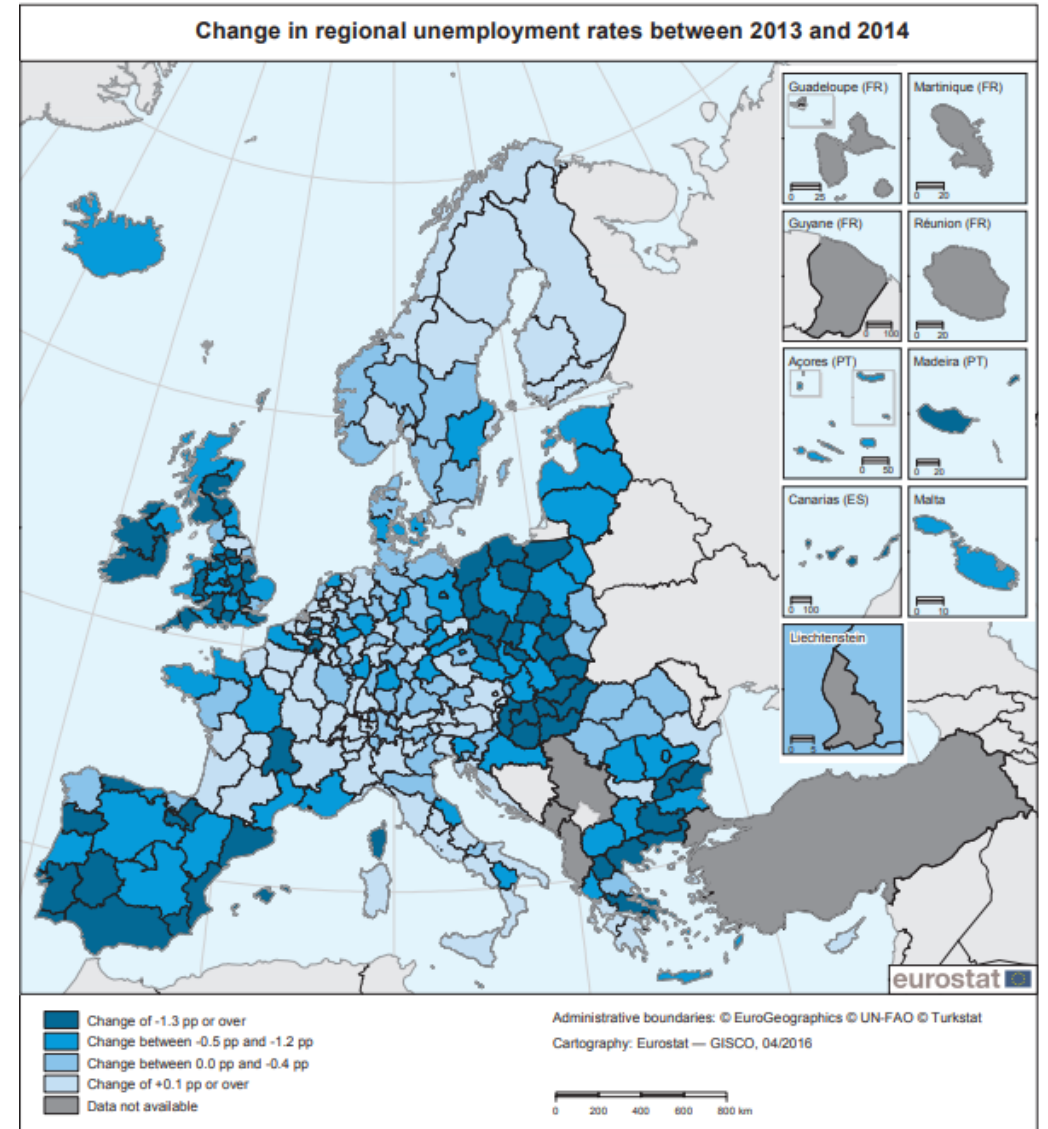
Gallery of statistical maps

Choropleth, proportional symbols, isopleth/isoline, dot density, dasymetric, proportional composition, proportional shades, small multiple, cartograms, flow maps, multivariate, time series, Chernoff faces, etc.



Choropleth

- From greek: **choros** (space) and **plethus** (quantity).
- Use color value (or ordered texture) to show the variation of a statistical variable.
- To show relative values (rates, percentages, densities, etc.).



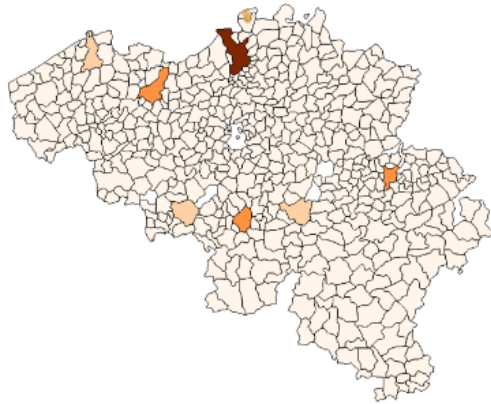
Choropleth – classification

- How many classes?
 - Depends on the number of values and their spatial distribution.
 - Keep colors ordered and differentiable. Usually, around 7.
 - Continuous colors also possible
- More usual methods offered by GIS:
 - Equal intervals, Quantile, Natural breaks (Jenks optimized), Standard deviation, ...
- What is the most suitable classification method ?

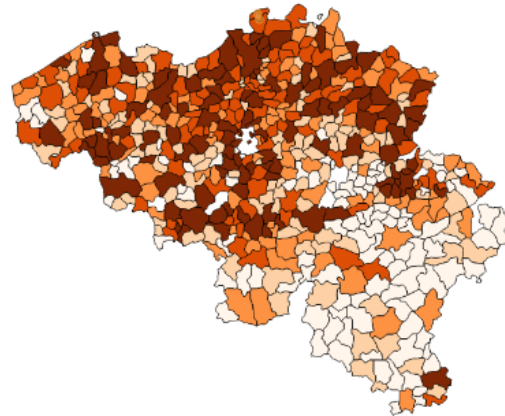


Choropleth – classification

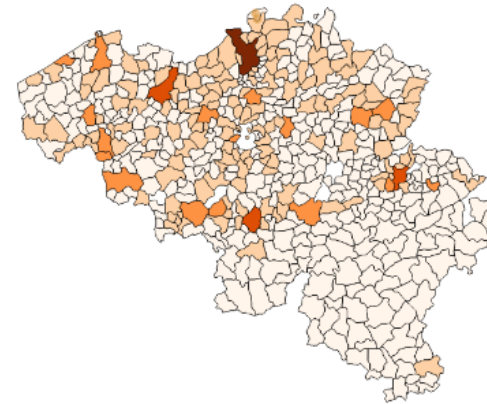
Equal intervals



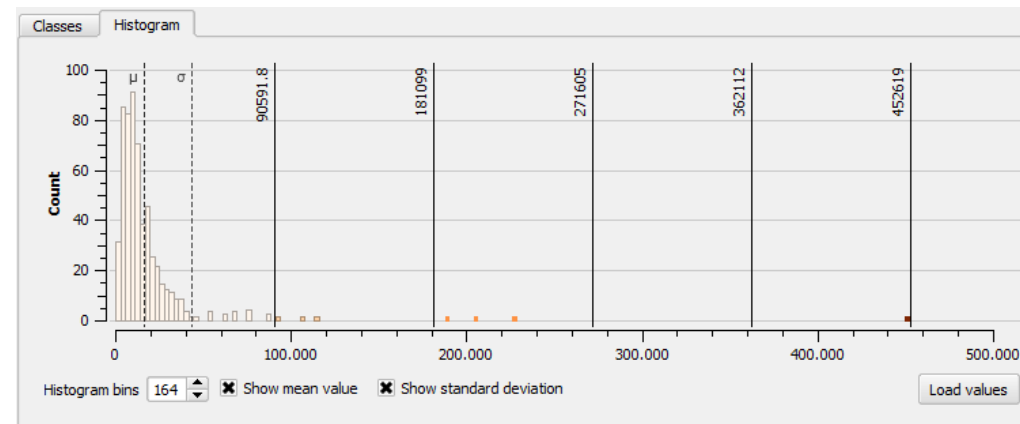
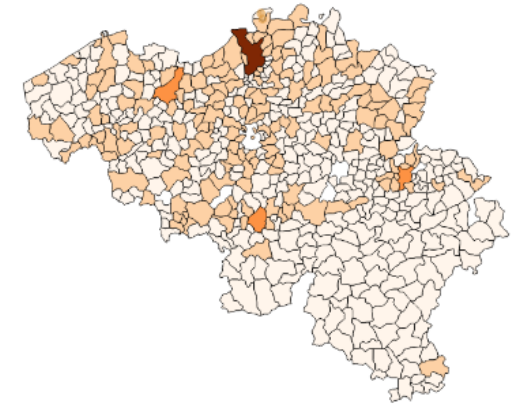
Quantiles



Natural breaks (Jenks)

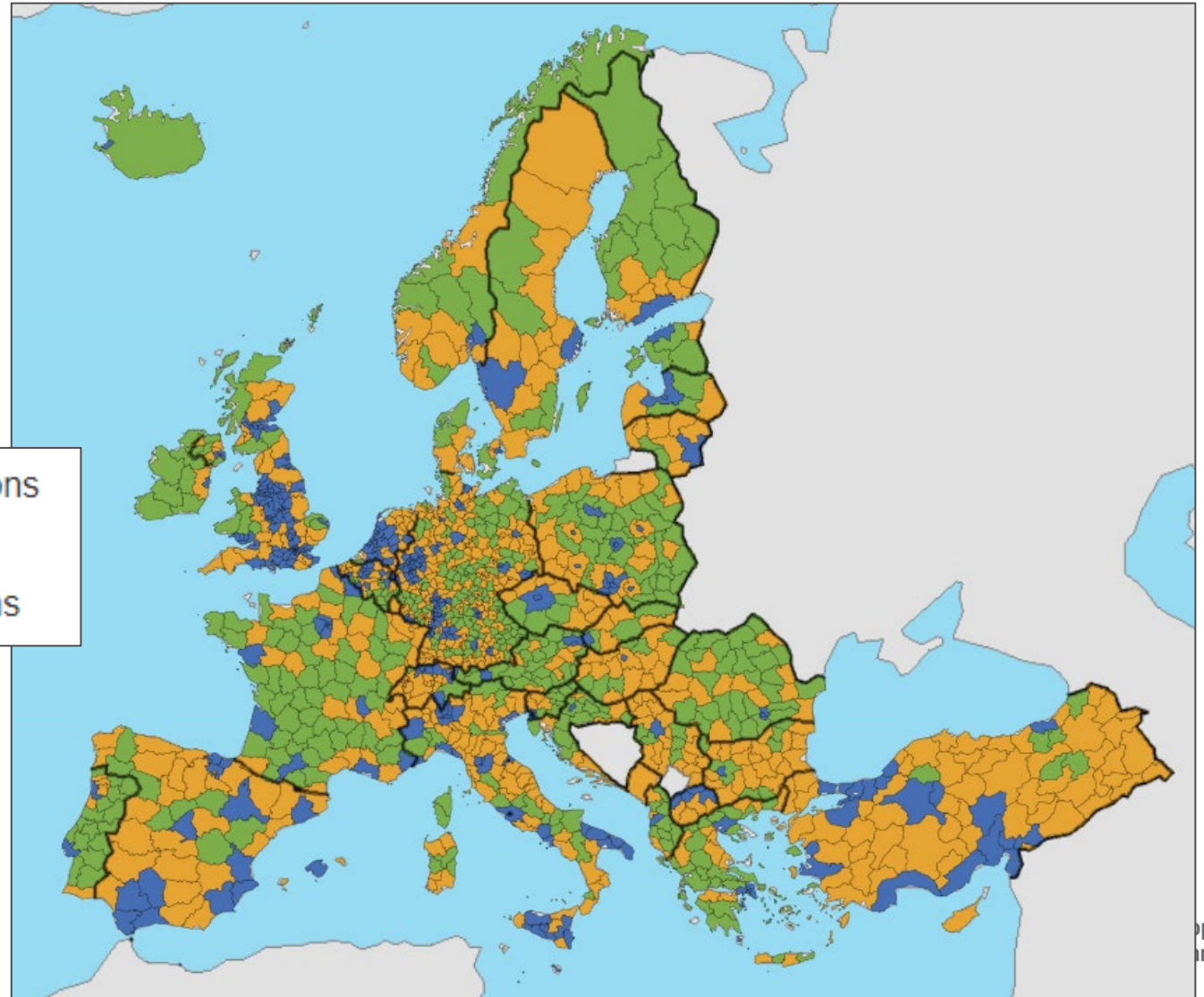
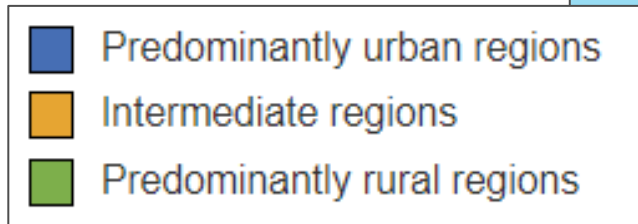


Standard deviation



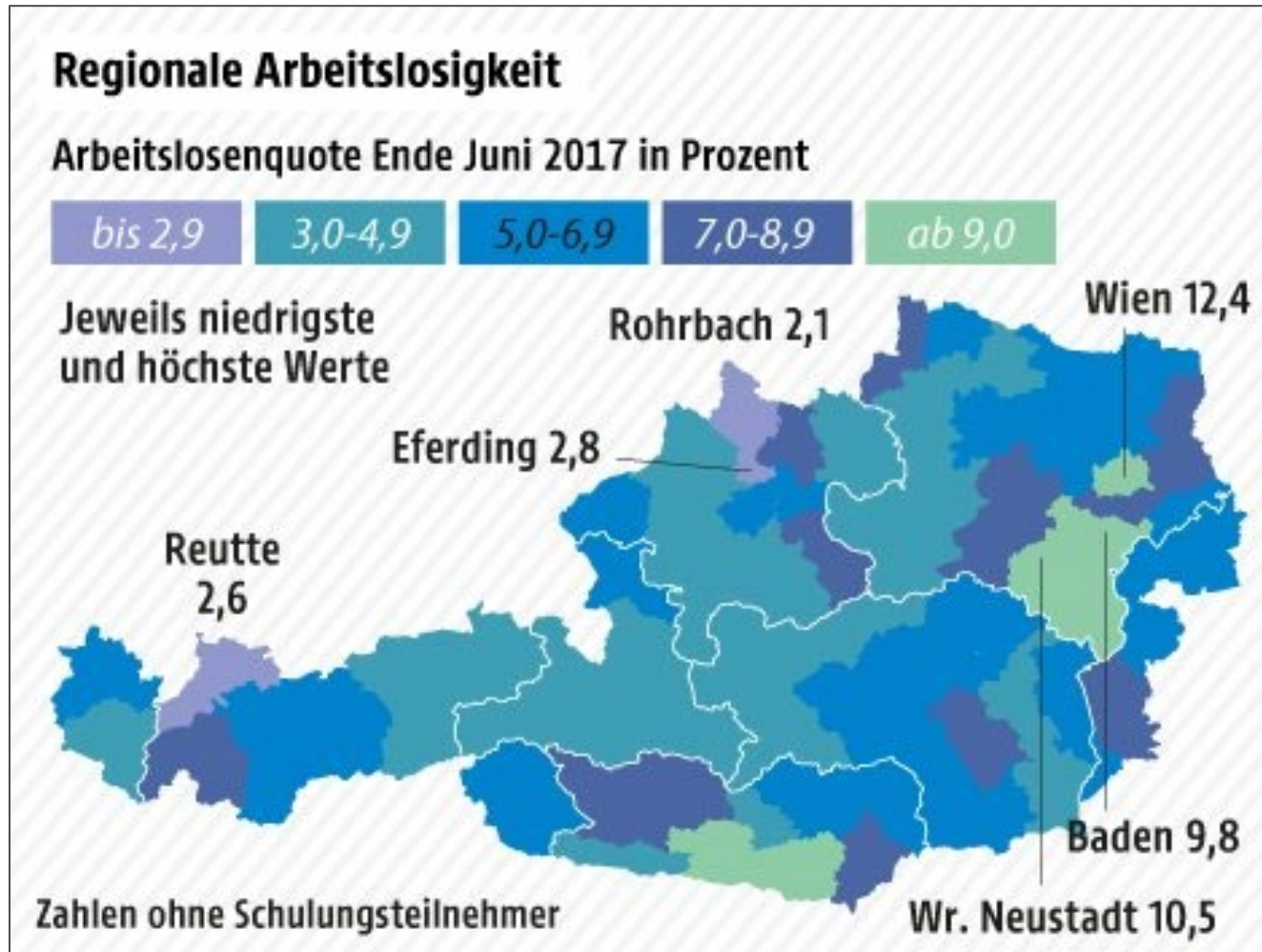
Choropleth – categorical

- For nominal data
- Use color hue (or differentiated texture)



<https://ec.europa.eu/eurostat/statistical-atlas/gis/viewer/?mids=BKGCNT,C99M01,CNTOV&o=1,1,0.7&ch=C01,TRC,TYP¢er=53.04282,20.92576,3&lcis=C99M01&>

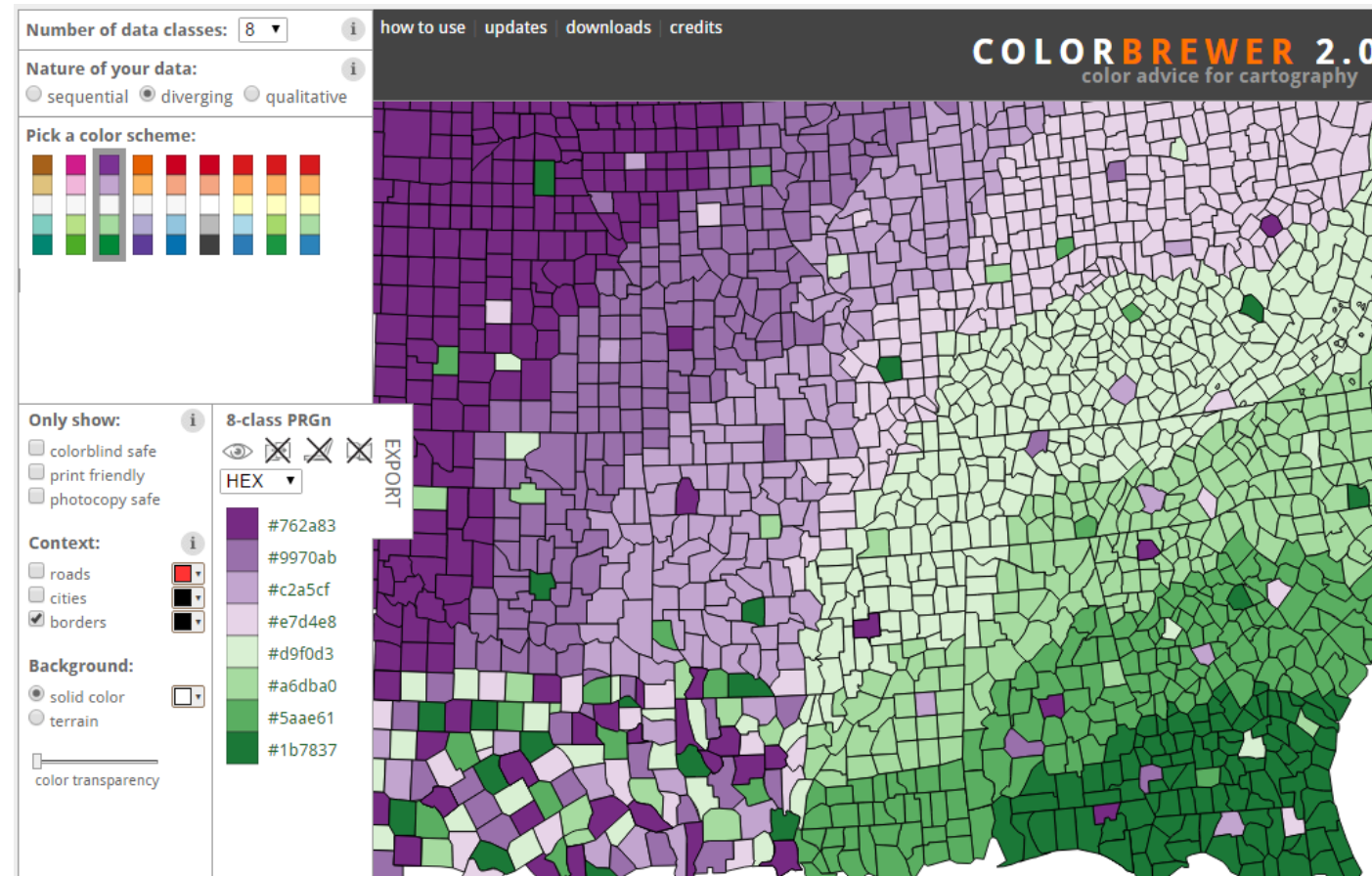
Choropleth – Color



Color value: order
Color hue: selection

Choropleth – Color palettes

- ColorBrewer

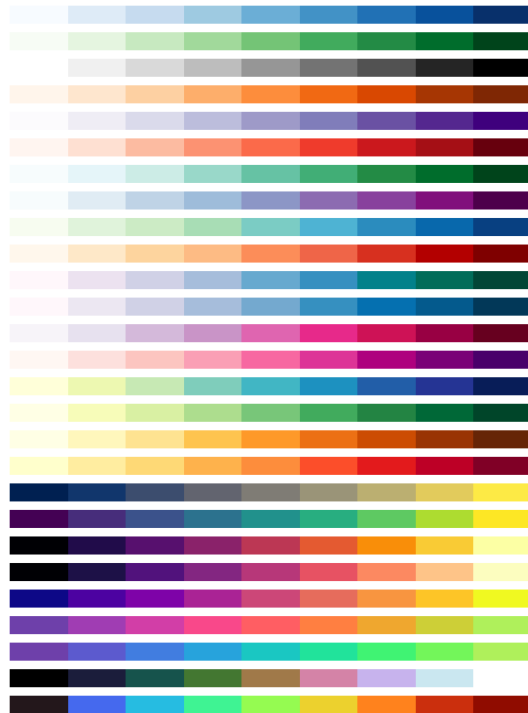


<https://colorbrewer2.org>

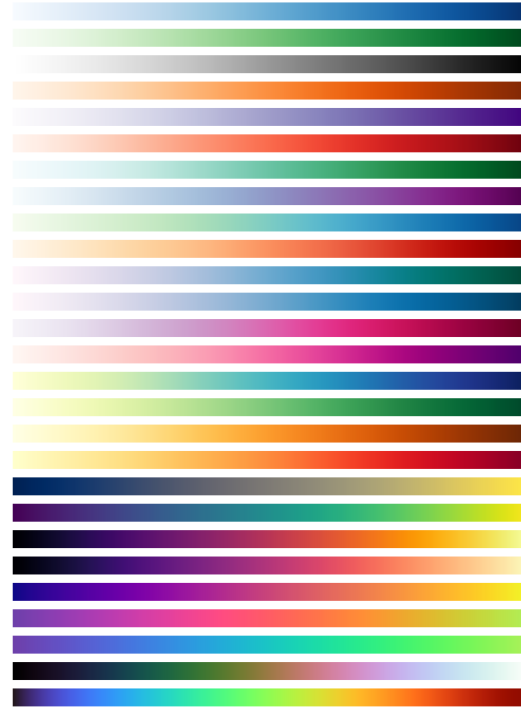
Choropleth – Color palettes

- Exemple from [d3-scale-chromatic](#) library.
 - **Sequential palettes** (ordered color values)

Discrete
(9 classes)

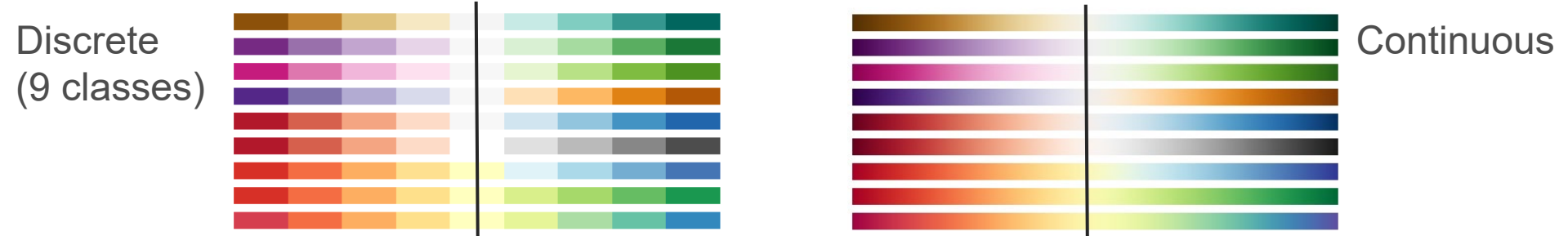


Continuous



Choropleth – Color palettes

- **Diverging palettes** (ordered color values, with 2 color hues for differentiation around a central value)

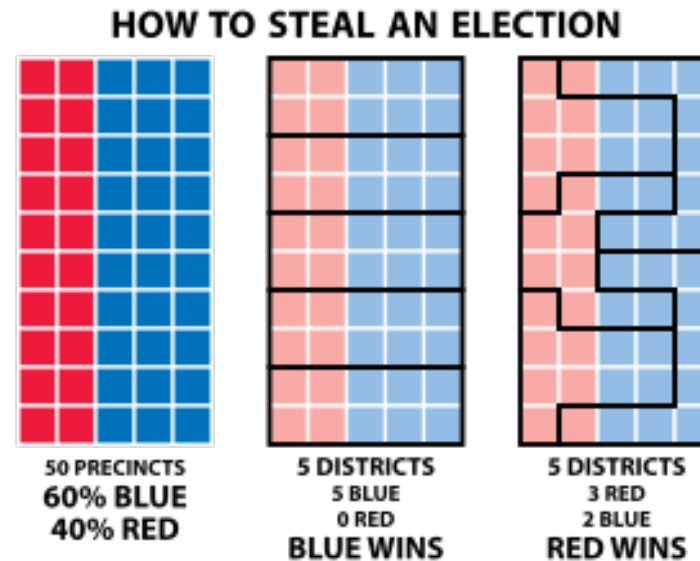
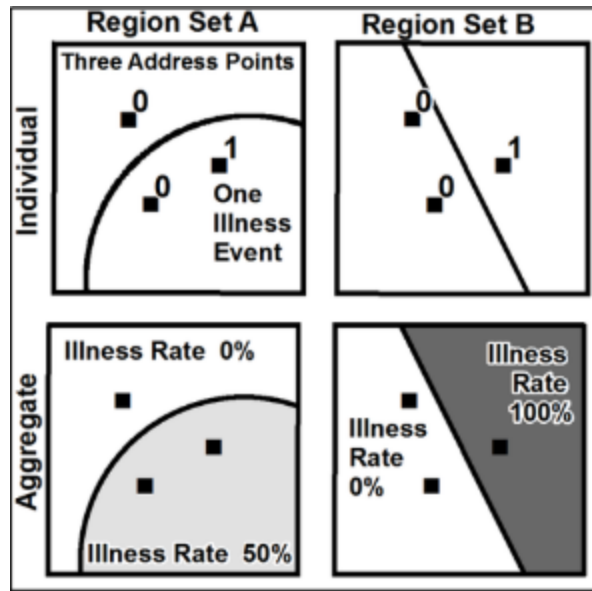


- **Categorical palettes** (differentiable color hues)

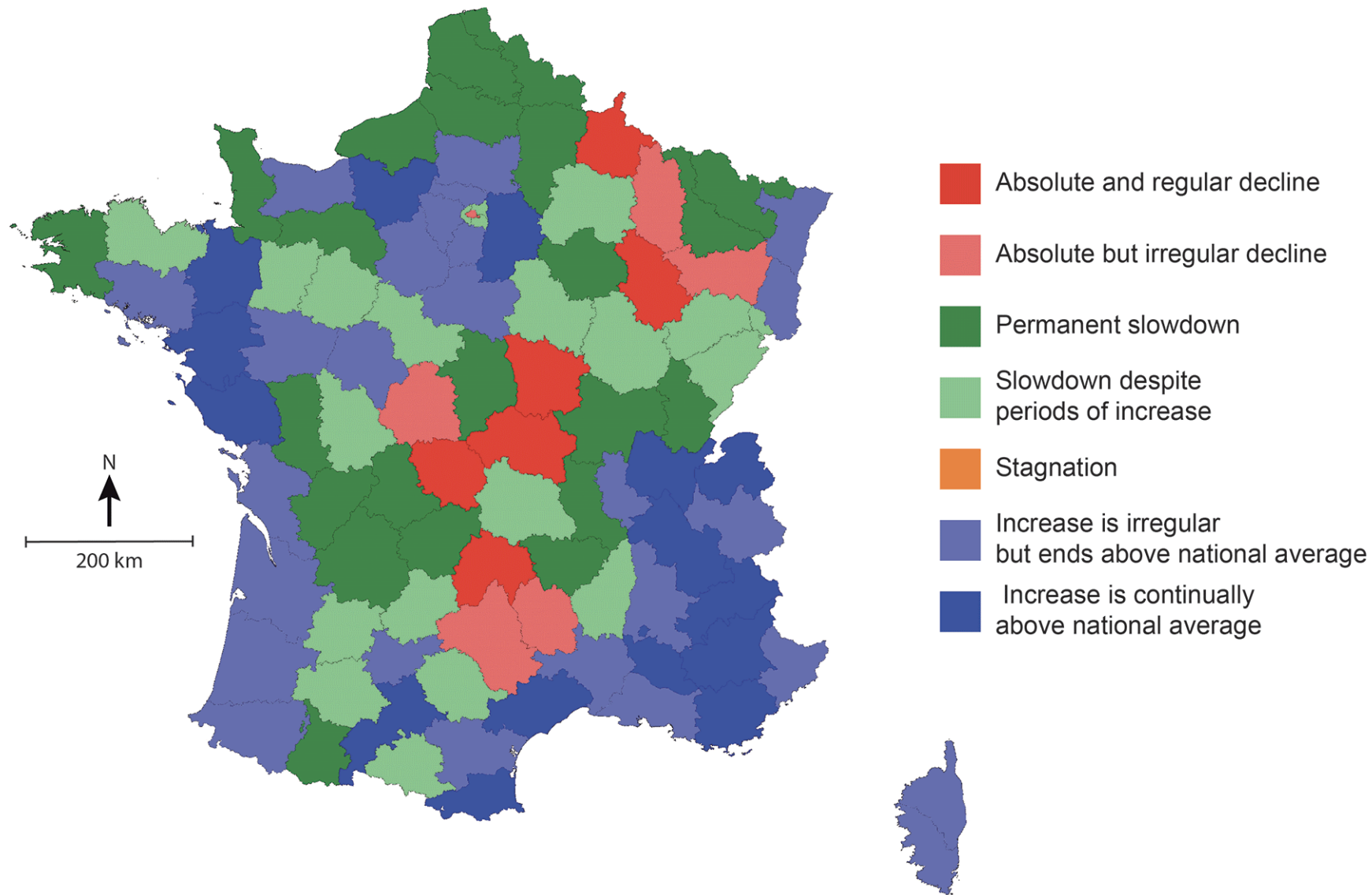


The modifiable areal unit problem (MAUP)

- Influence of the size and shape of the statistical unit on the aggregated statistical figure.



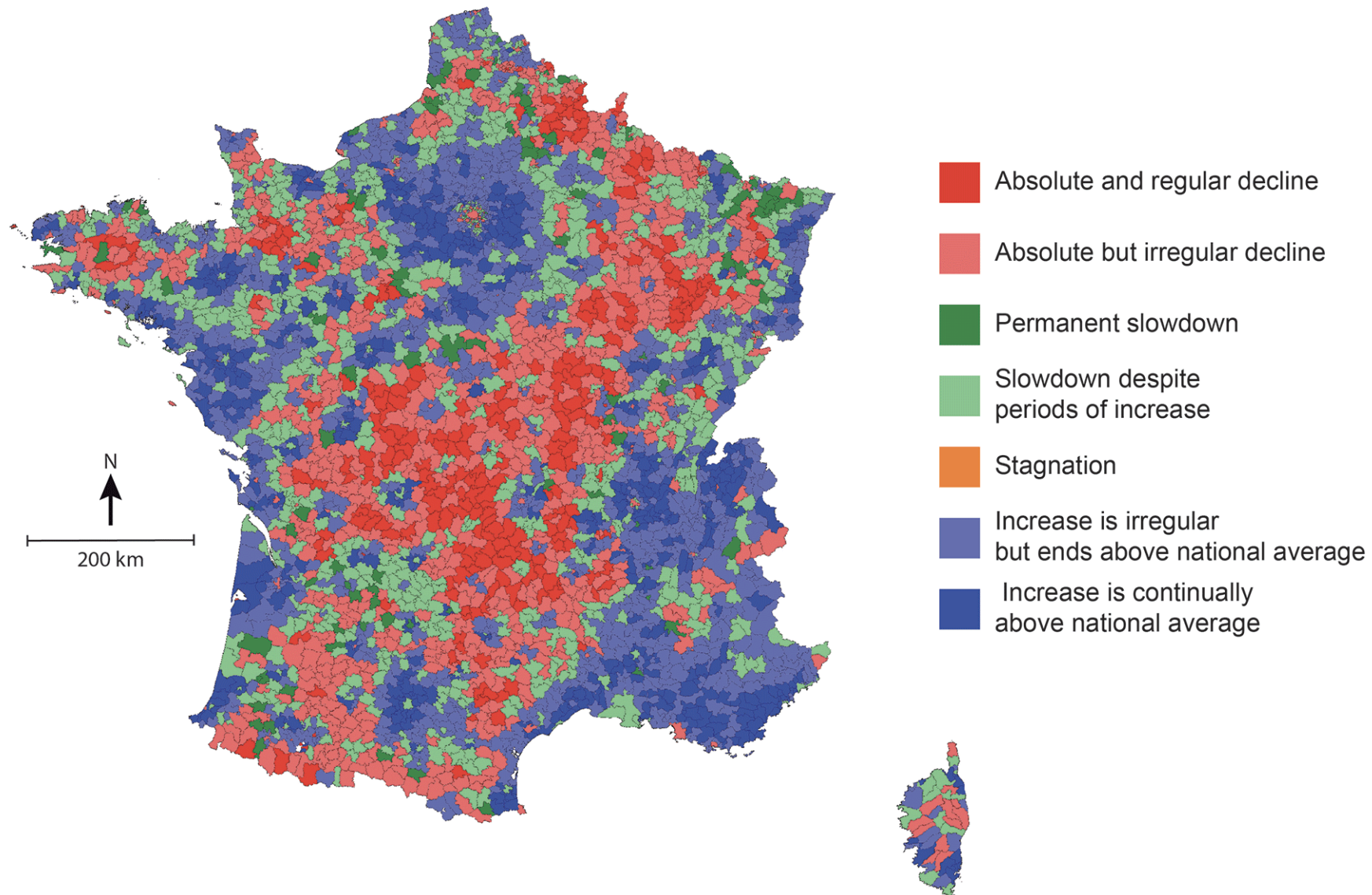
Typology of population growth trajectories of the French counties ("départements") between 1968 and 2009



Source: INSEE, RP1968, RP1975, RP1982, RP1990, RP1999, RP2009

Authors: Doignon Y., Oliveau S. (2016)

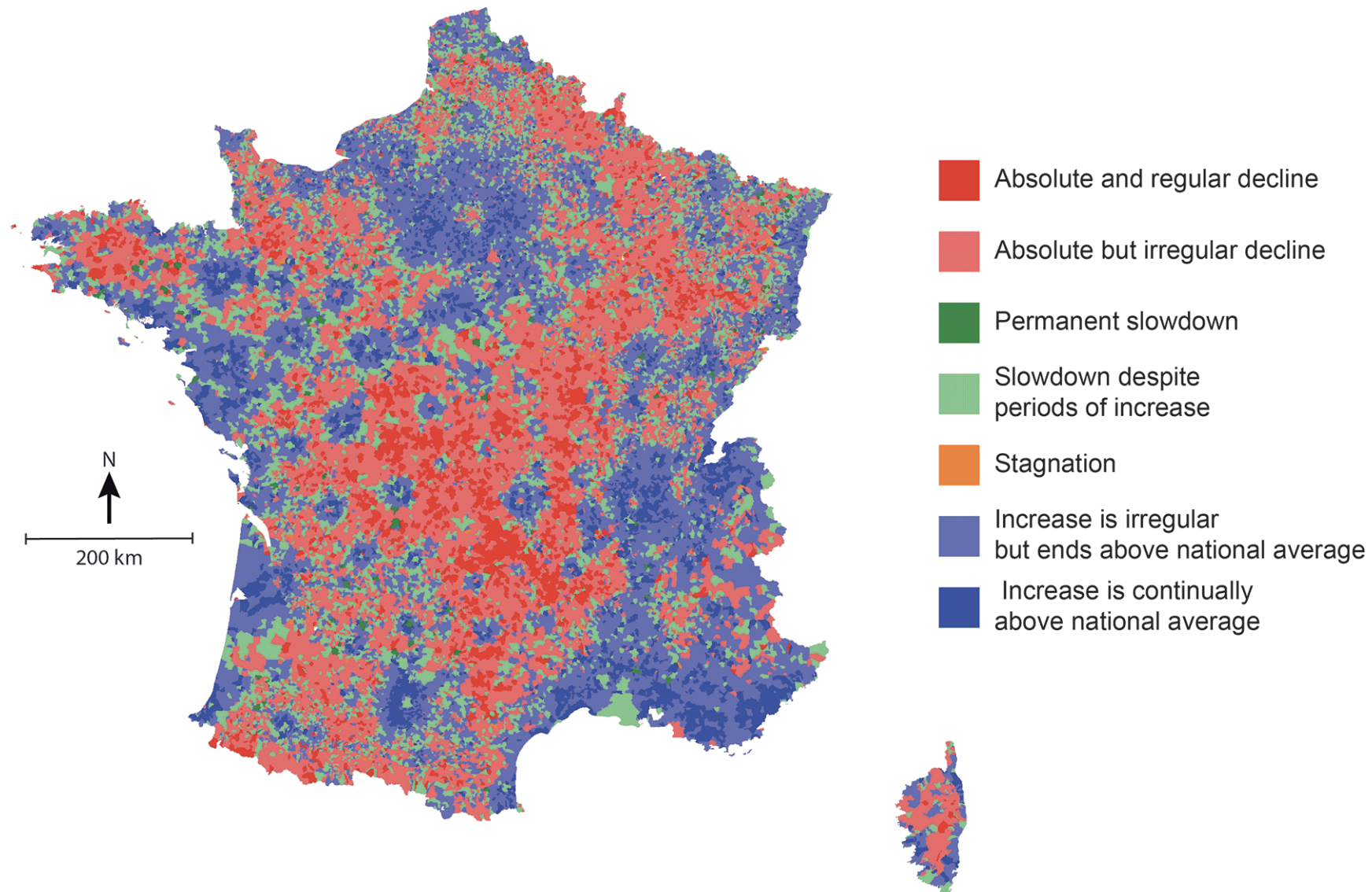
Typology of population growth trajectories of the French districts ("cantons") between 1968 and 2009



Source: INSEE, RP1968, RP1975, RP1982, RP1990, RP1999, RP2009

Authors: Doignon Y., Oliveau S. (2016)

Typology of population growth trajectories of the French municipalities ("communes") between 1968 and 2009

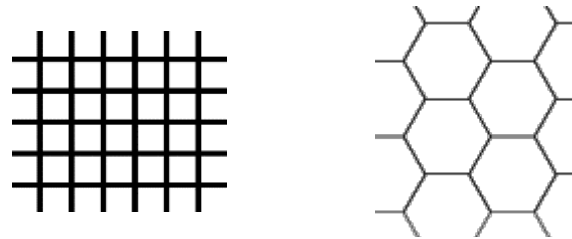


Source: INSEE, RP1968, RP1975, RP1982, RP1990, RP1999, RP2009

Authors: Doignon Y., Oliveau S. (2016)

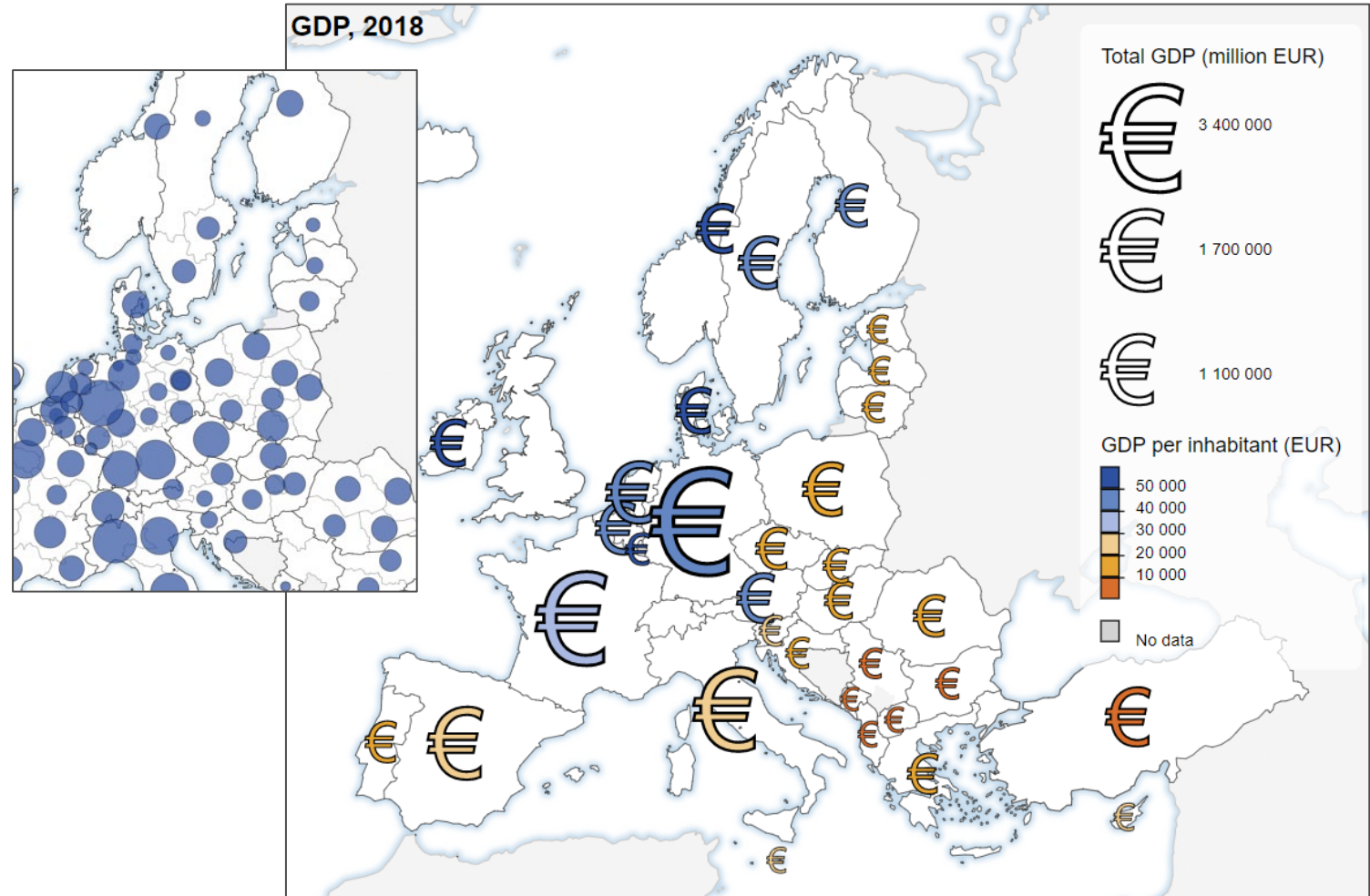
The modifiable areal unit problem (MAUP)

- Recommendations:
 - Use pertinent spatial level: Inter-region disparities should be higher than intra-region disparities
 - Use regions with comparable sizes and shapes
 - Best solution: Regular tessellations - Grids



Proportional symbols

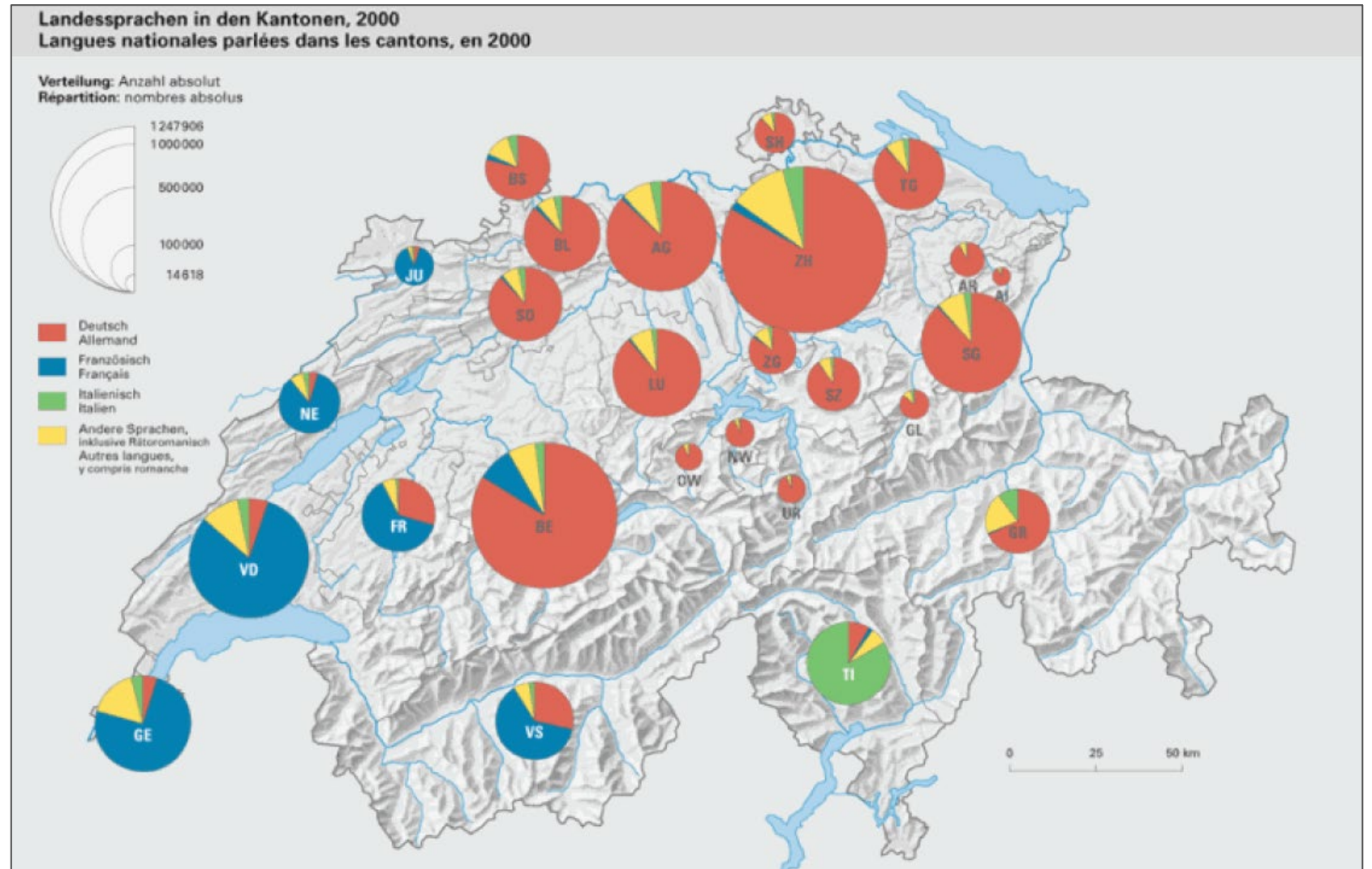
- Size visual variable.
- To show absolute values (quantities, numbers, etc.).
- Can be used in combination with color, to show a second variable.



Proportional compositions

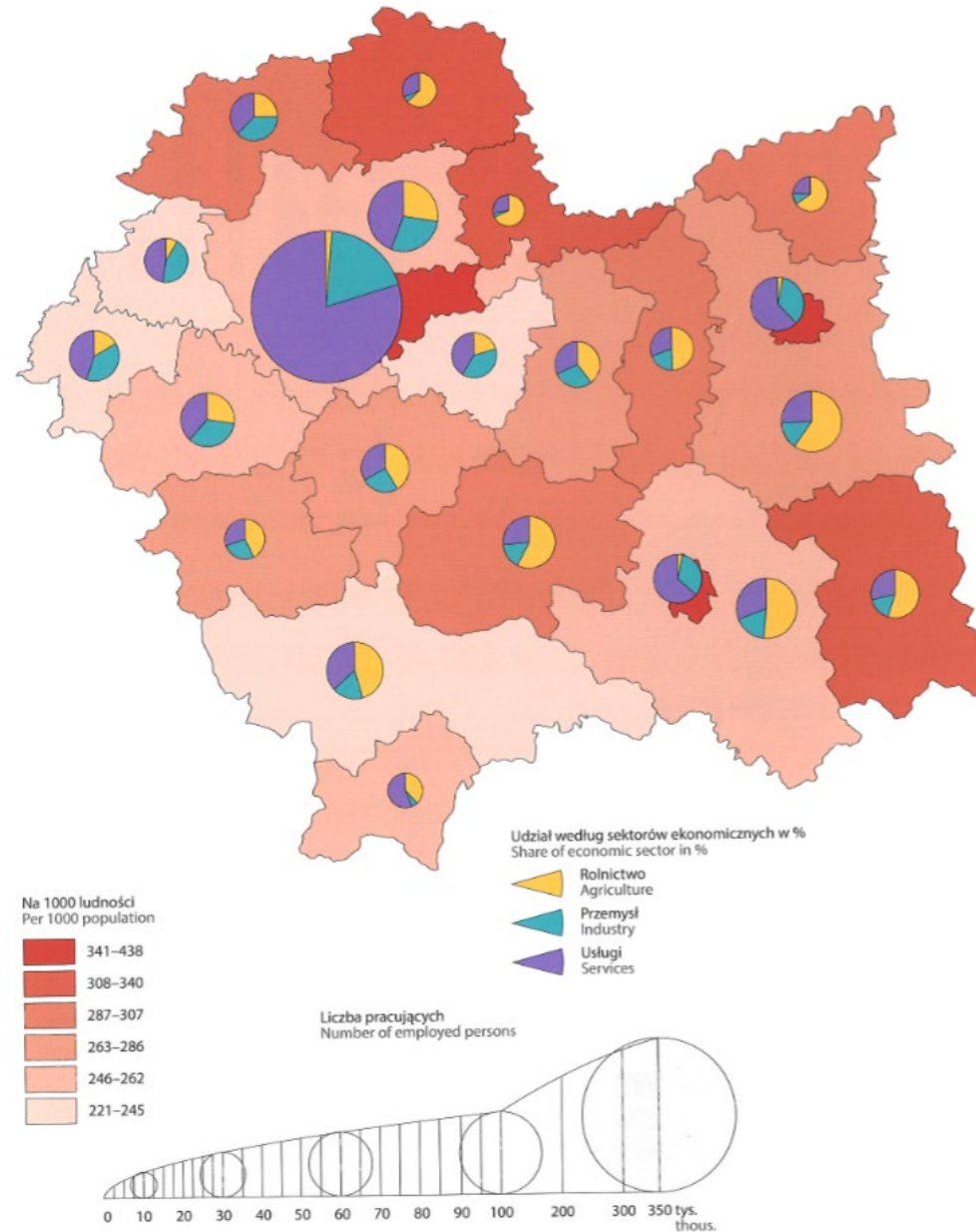
Langages of
Switzerland

(as proportional
pie chart map)

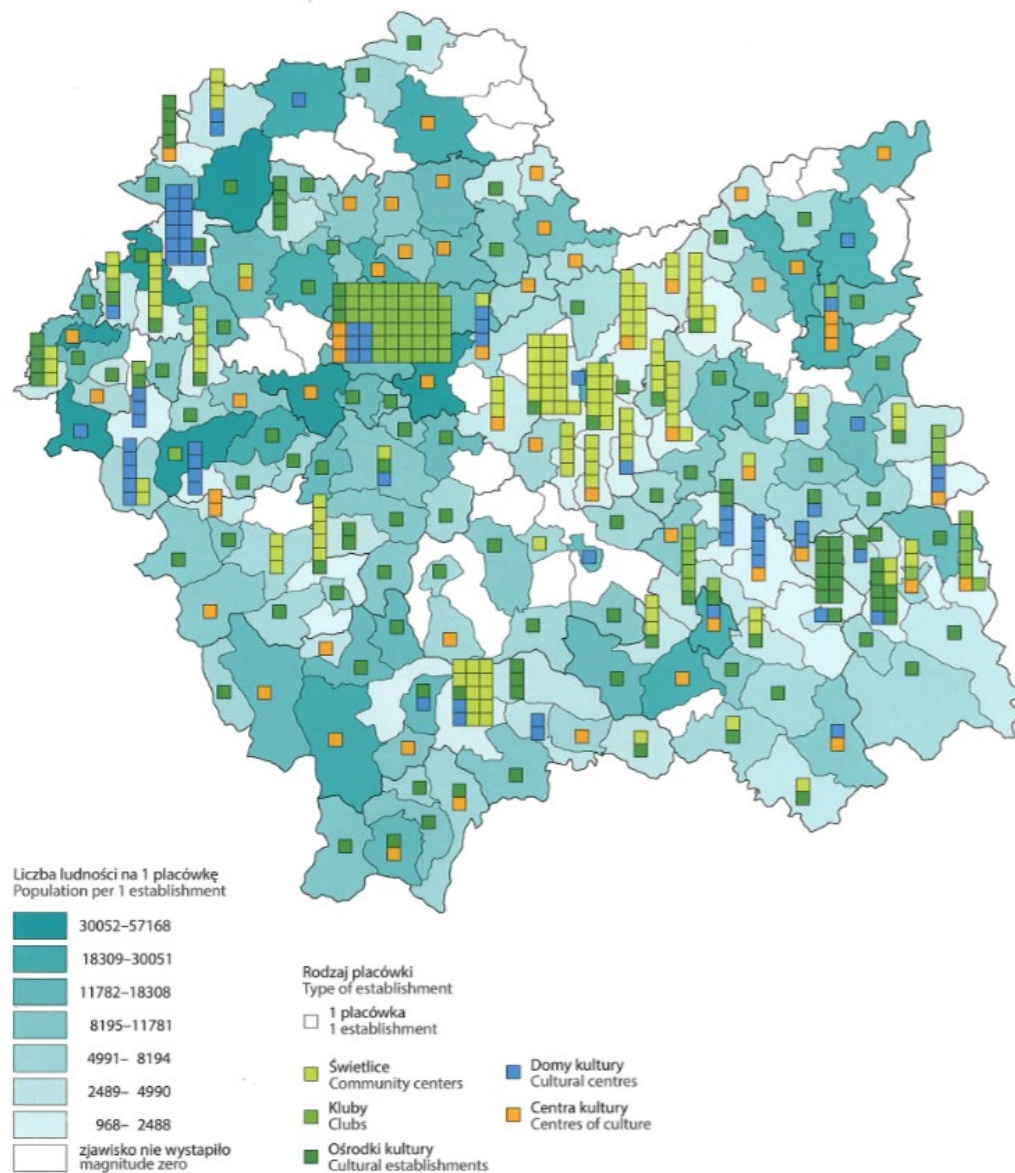


Combinations

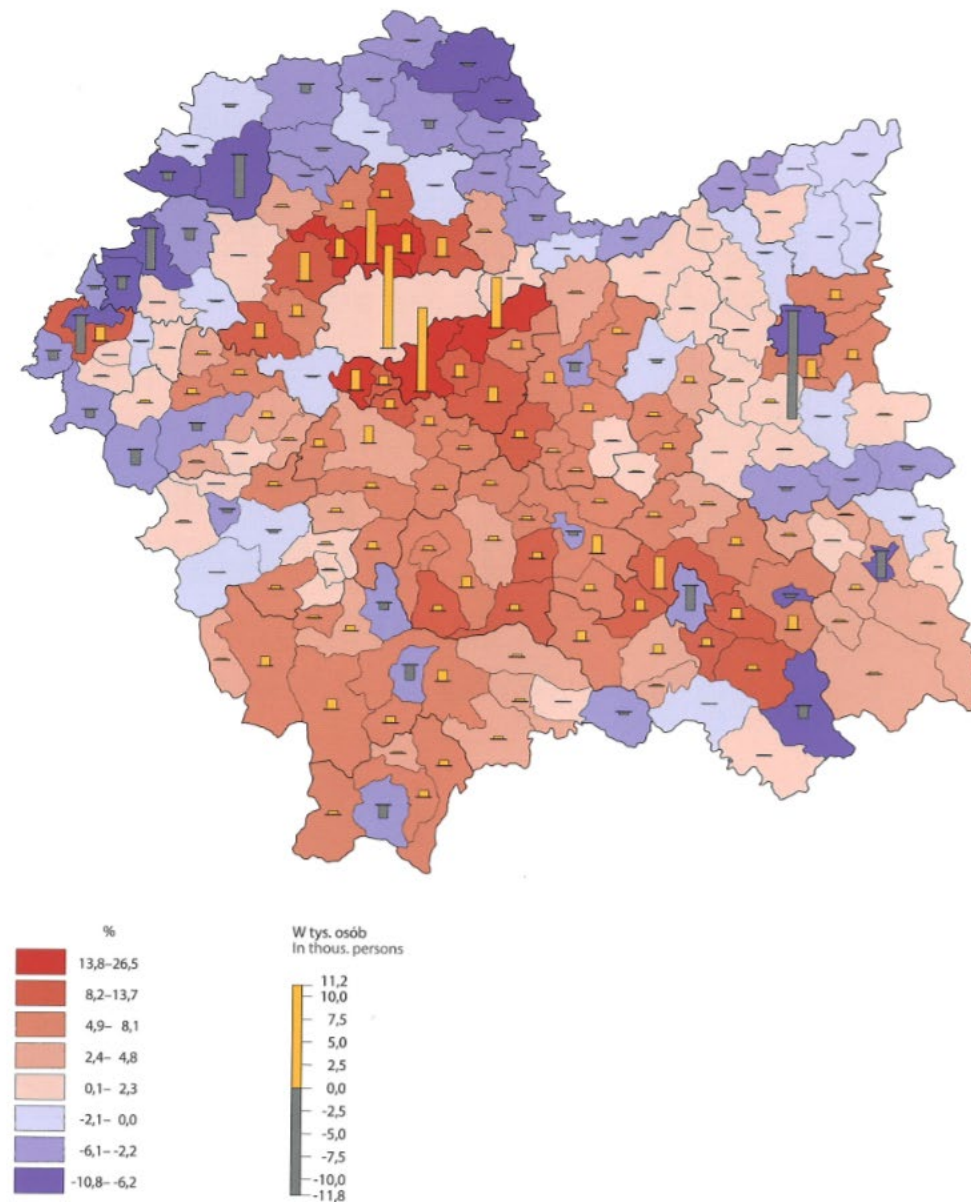
- Employment in 2016
 - Rate (choropleth)
 - Number (circle size)
 - By sector (circle color hue)



Culture centres in 2016

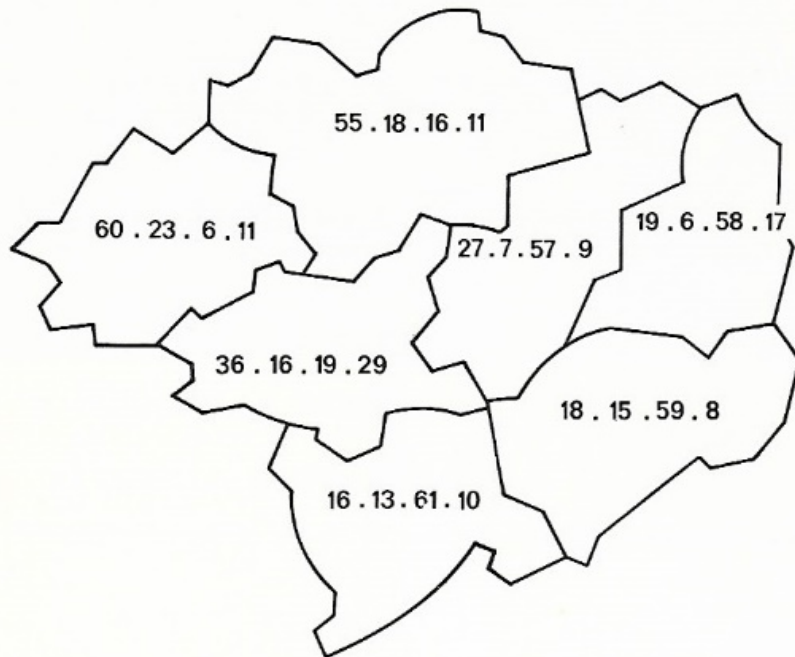


Population change, 2017-2030

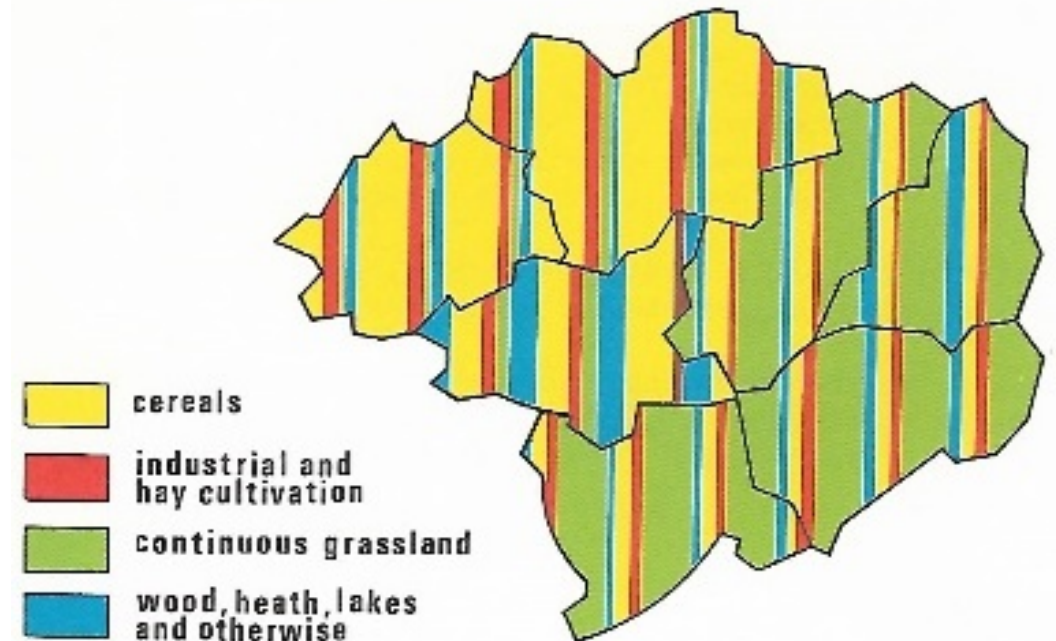
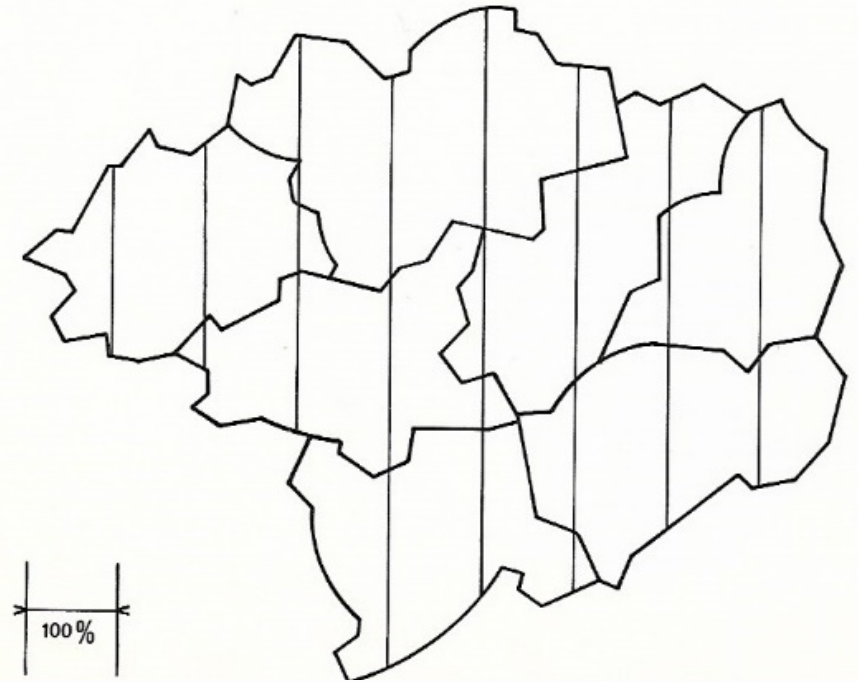


Proportional shading

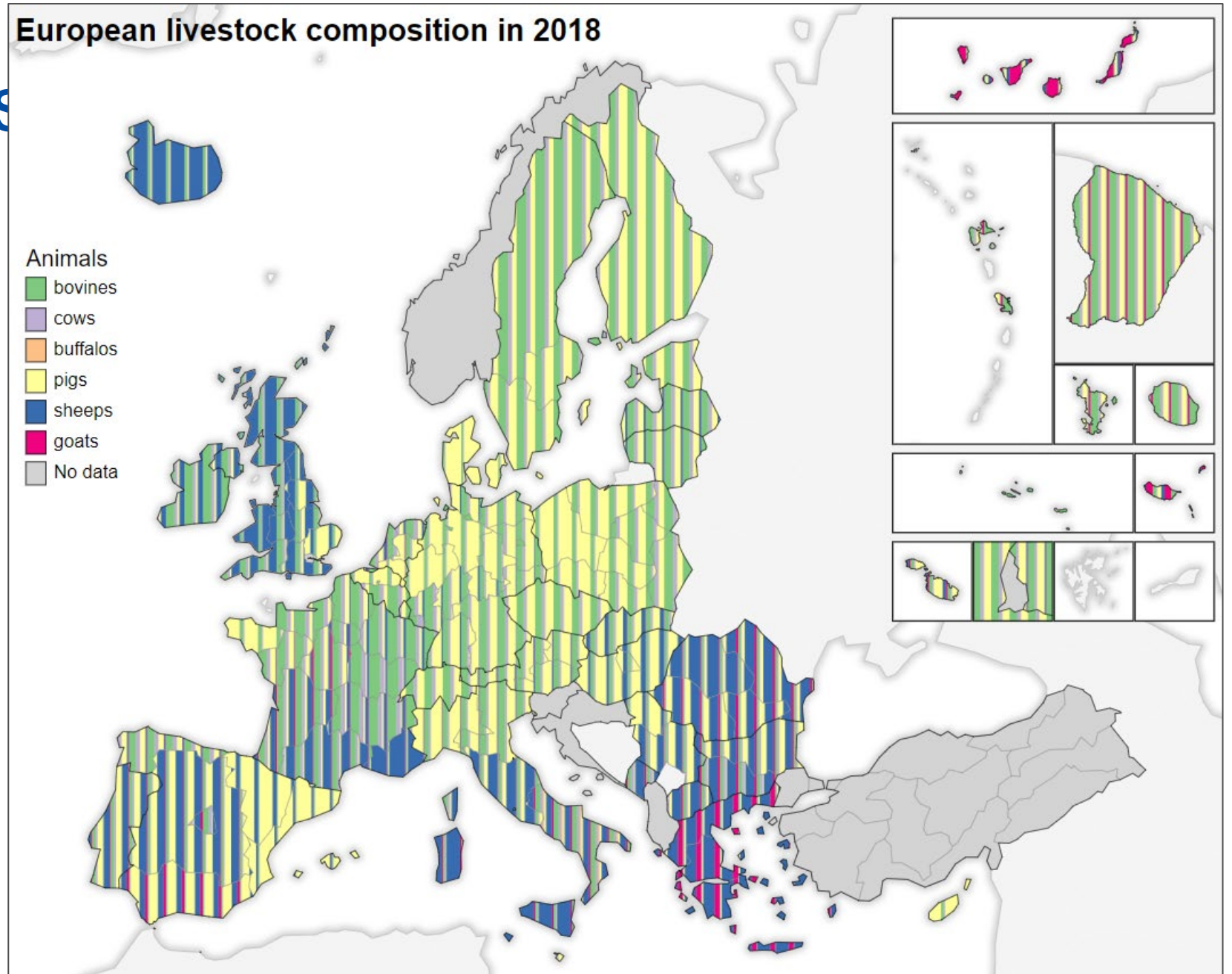
- Area texture representing a composition



1. Cereals
2. Industrial crops and hay cultivation
3. Continuous grassland
4. Woods, heath, lakes, and other



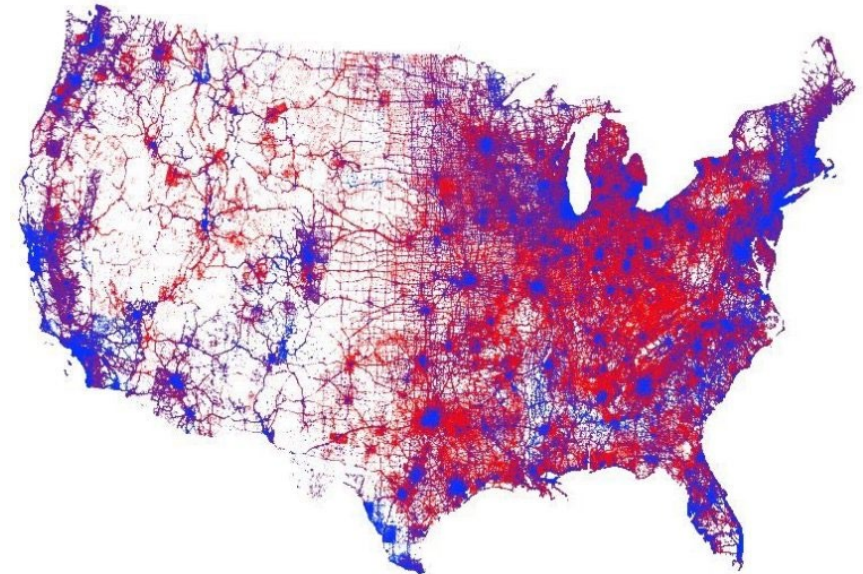
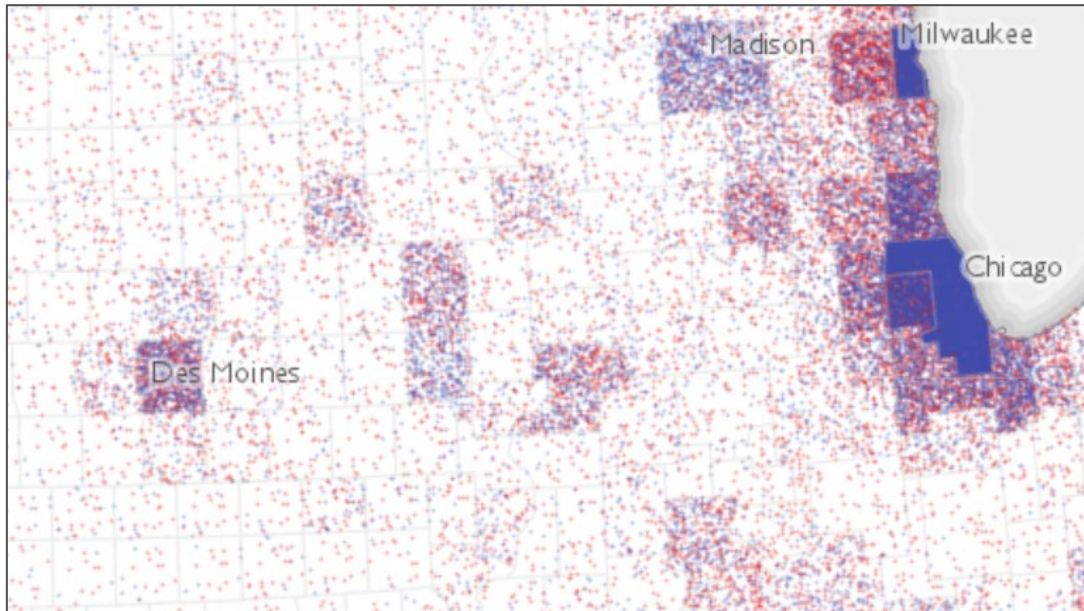
Proportional s



https://eurostat.github.io/eurostat-map.js/examples/livestock_composition.html

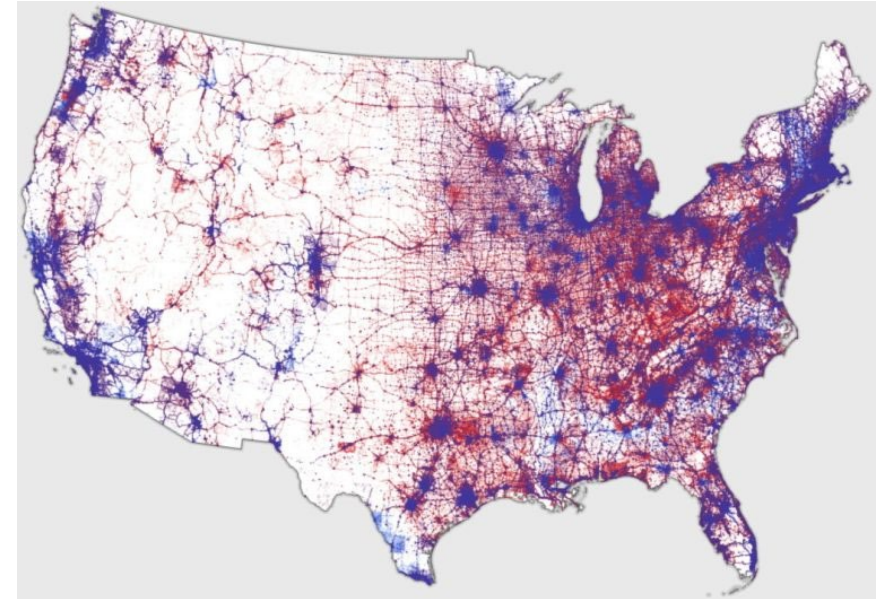
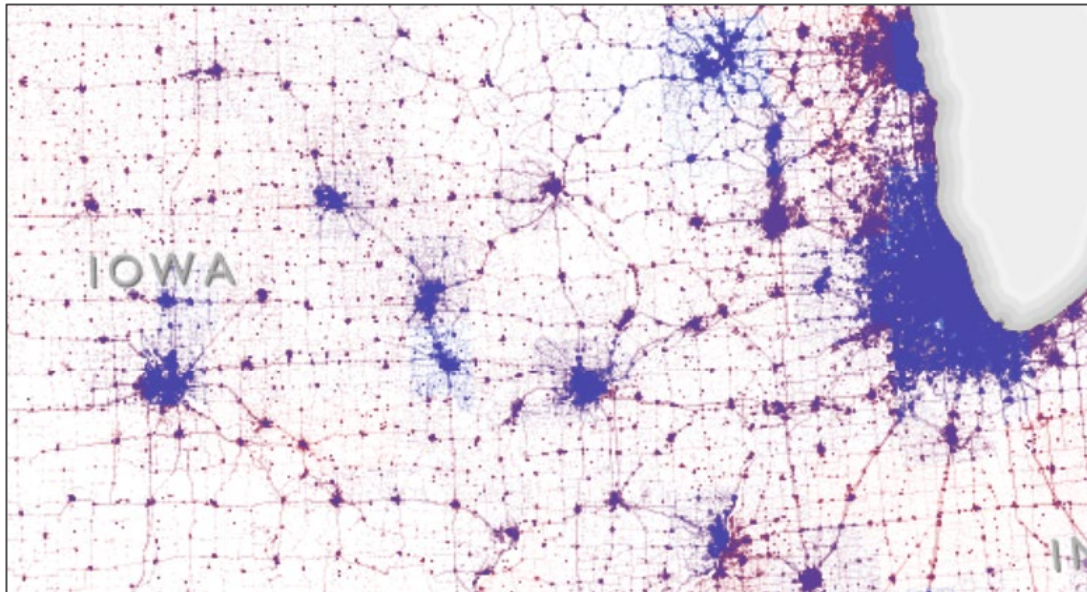
Dot density

- Use a pattern of pseudo-random point symbols to represent intensity of a phenomena.
- Example: 1 dot = 1'000 votes



Dasymetric dot density

- Utilisation of auxiliary geographical data to reapportion from one location to another.
- Example: 1 dot = 1'000 votes



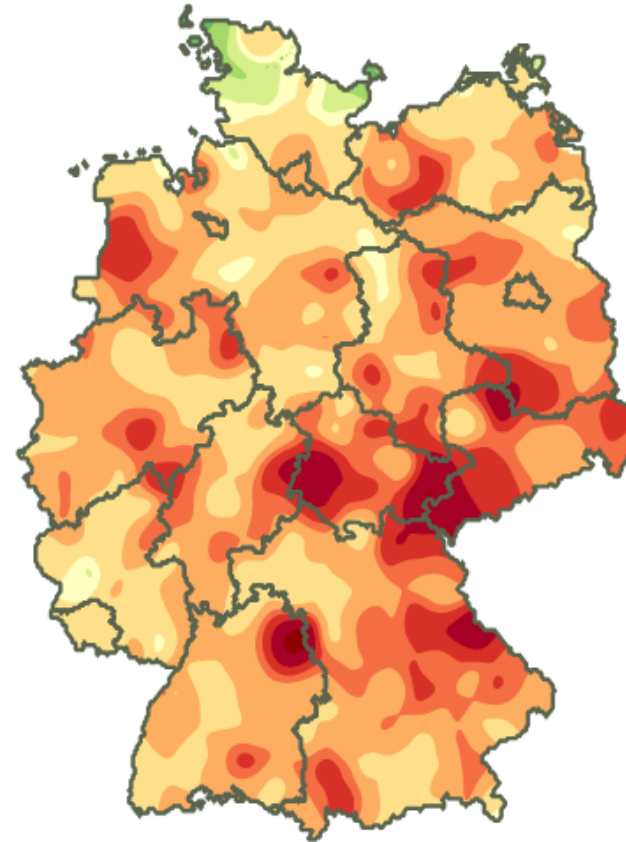
Isopleth – isoline

- Show lines of equal values
- Show smoothed continuous variations accross space

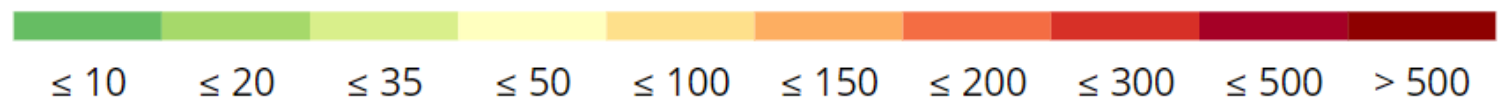
https://www.inwt-statistics.com/read-blog/covid-19_heat-map_of-local_7-day_incidences_over_time.html

Local 7-Day-Incidence

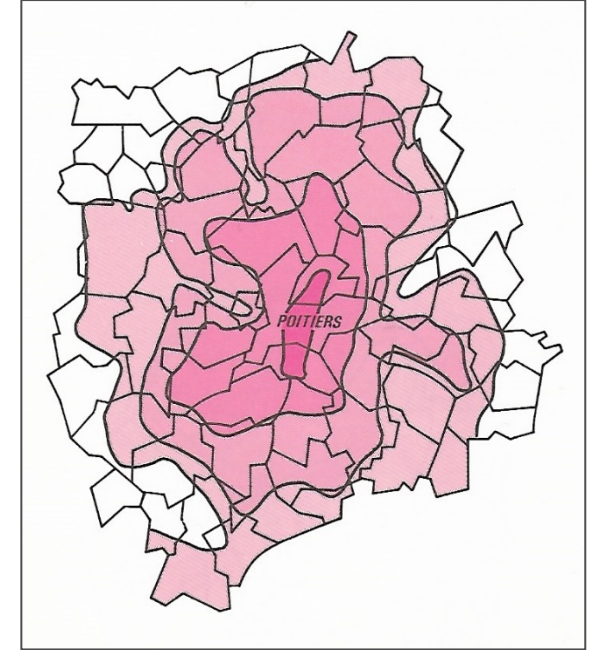
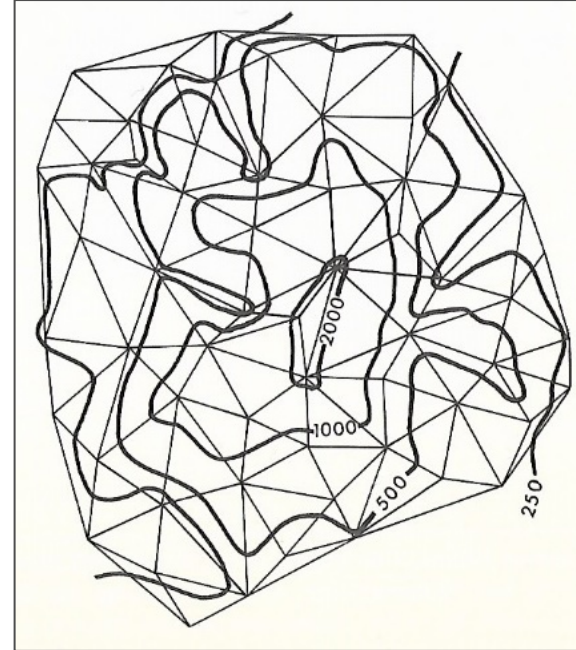
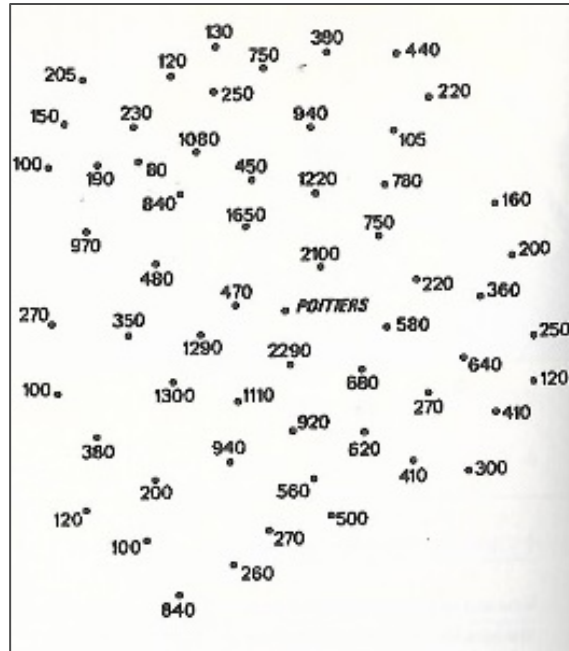
March 27, 2021



Incidence (cases per 100.000 population)

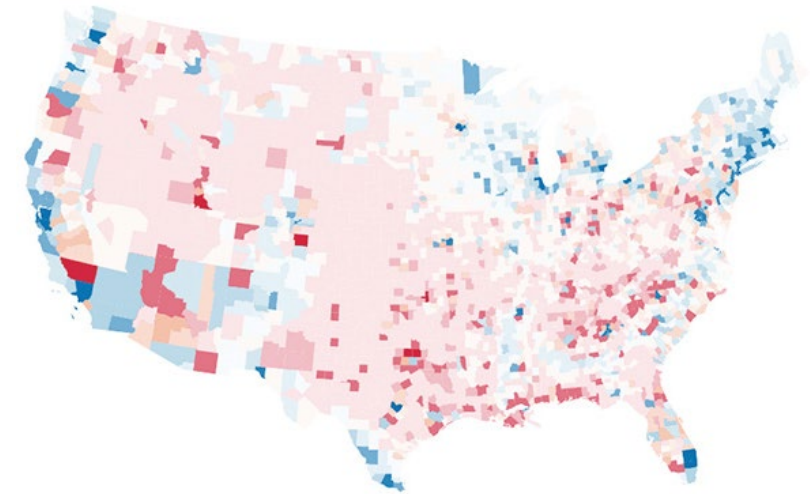
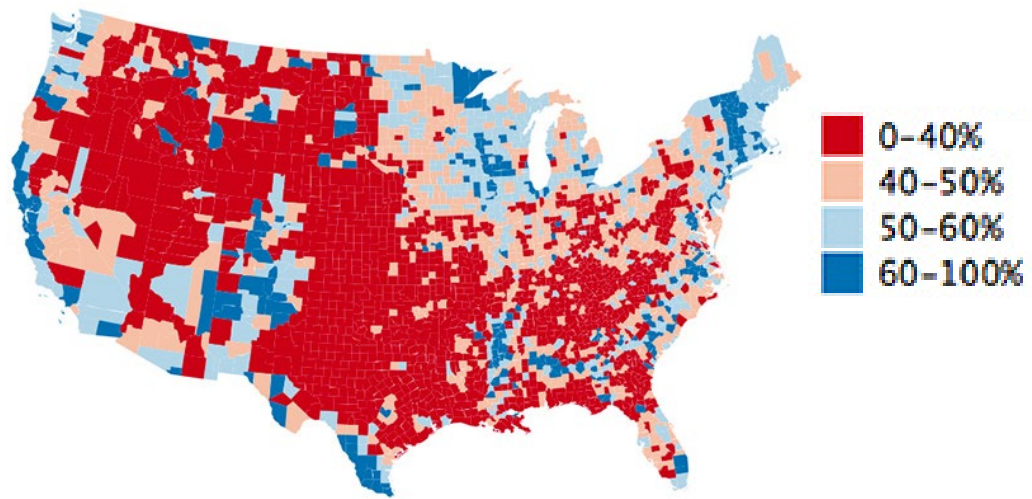


Isopleth – isoline



Value-by-alpha choropleth

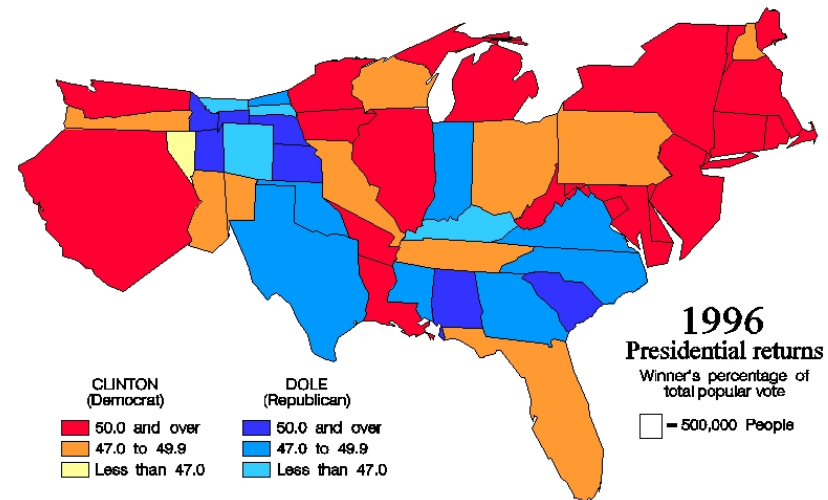
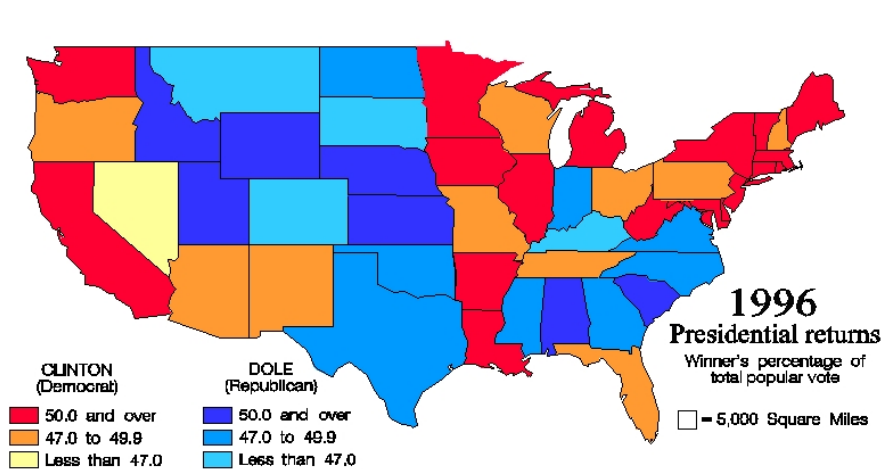
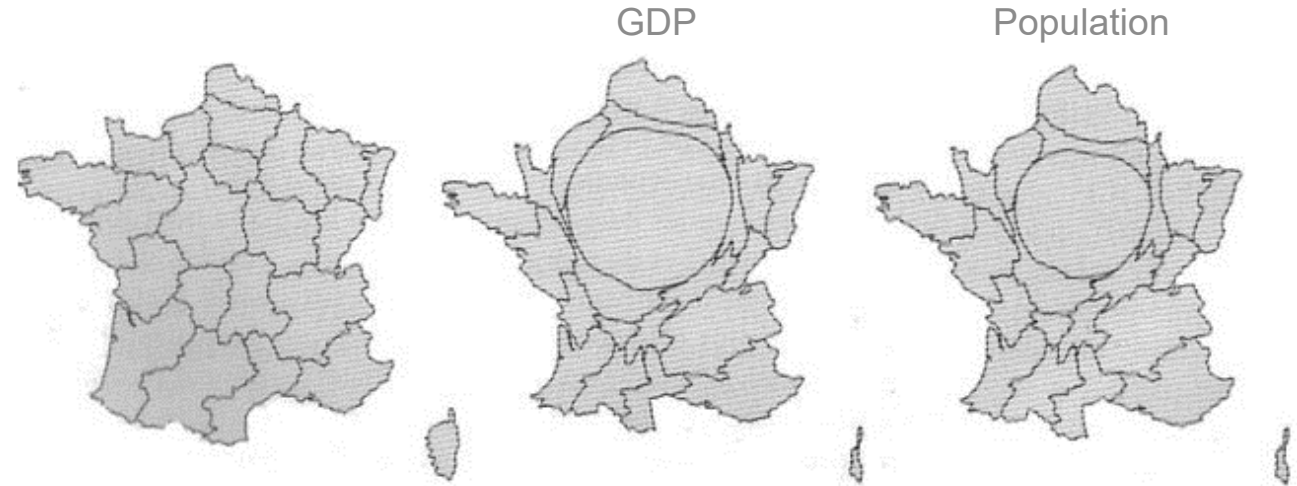
- Make less important regions transparent



The less voters, the more transparent

Cartogram

- Deformation of space to change the relative importance of map regions.



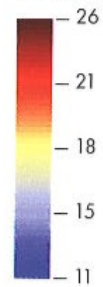
<https://github.com/shawnbot/topogram>

Cartogram

LA GÉOGRAPHIE DE LA VIEILLESSE

SOLIDARITÉS : L'ANCIENNETÉ DES LIENS • 51

Personnes âgées
de 65 ans ou plus en 2010
en pourcentage
de la population totale

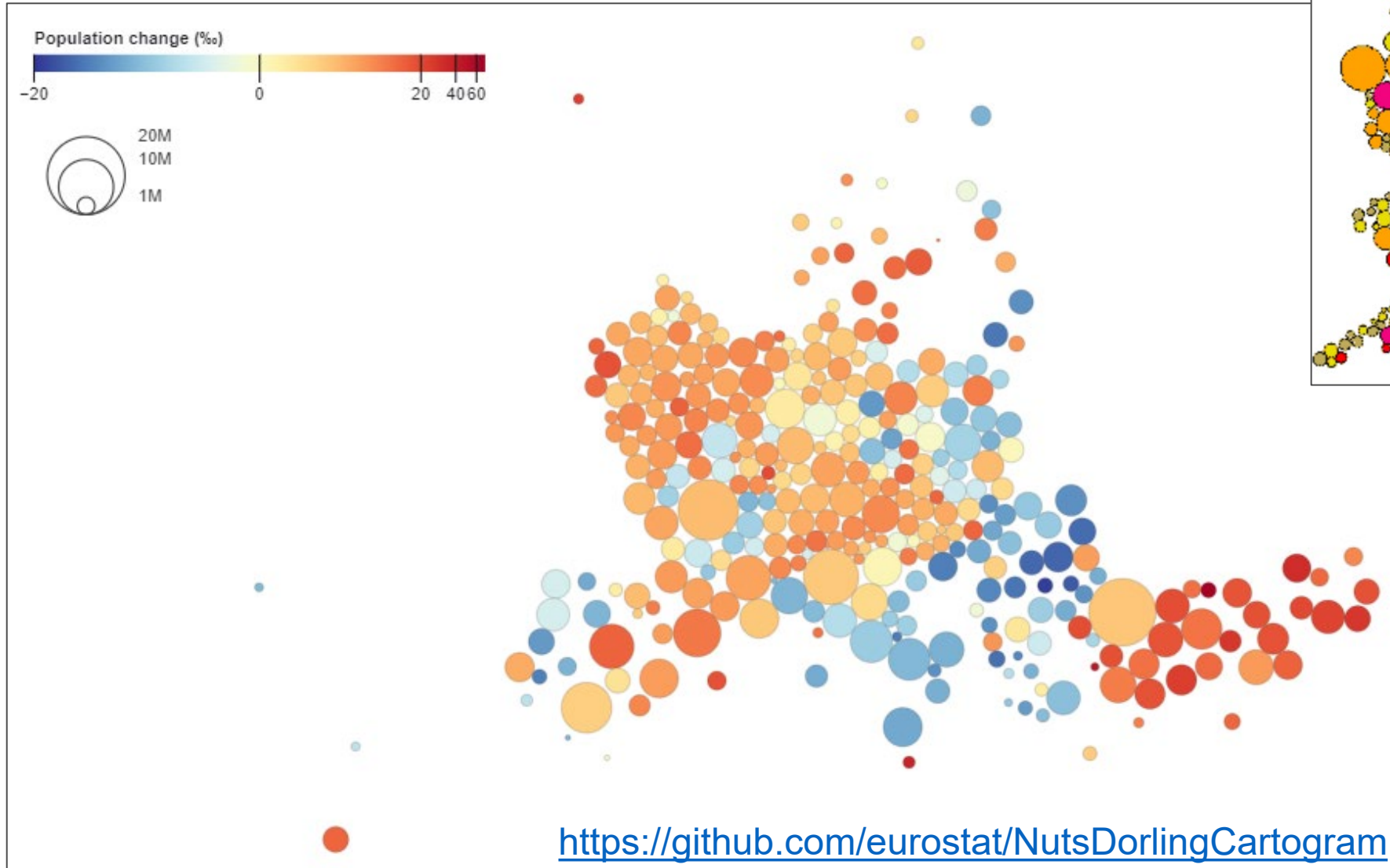


contraste entre l'ouest bourgeois, vieilli, et le nord-est encore populaire (et déjà bobo) jeune, puis, au-delà du périphérique, une alternance de zones un peu plus âgées et un peu plus jeunes, traces de l'extension urbaine, comme les cernes annuelles d'un tronc d'arbre; enfin un fort vieillissement aux frontières des départements limitrophes, là où cesse la péri-urbanisation.

Les surfaces sont déformées proportionnellement à l'effectif de personnes de 65 ans et plus.

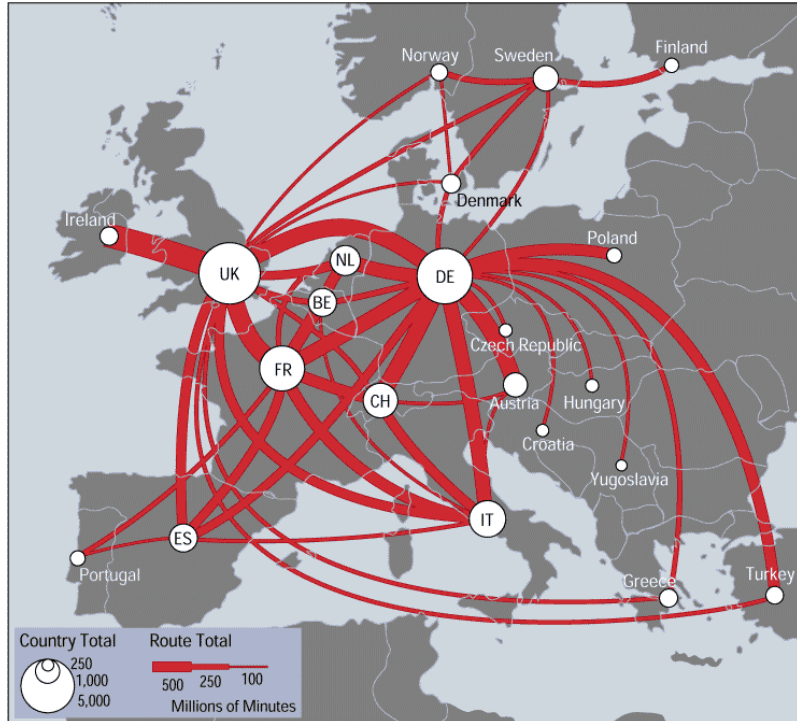


Cartogram - Dorling

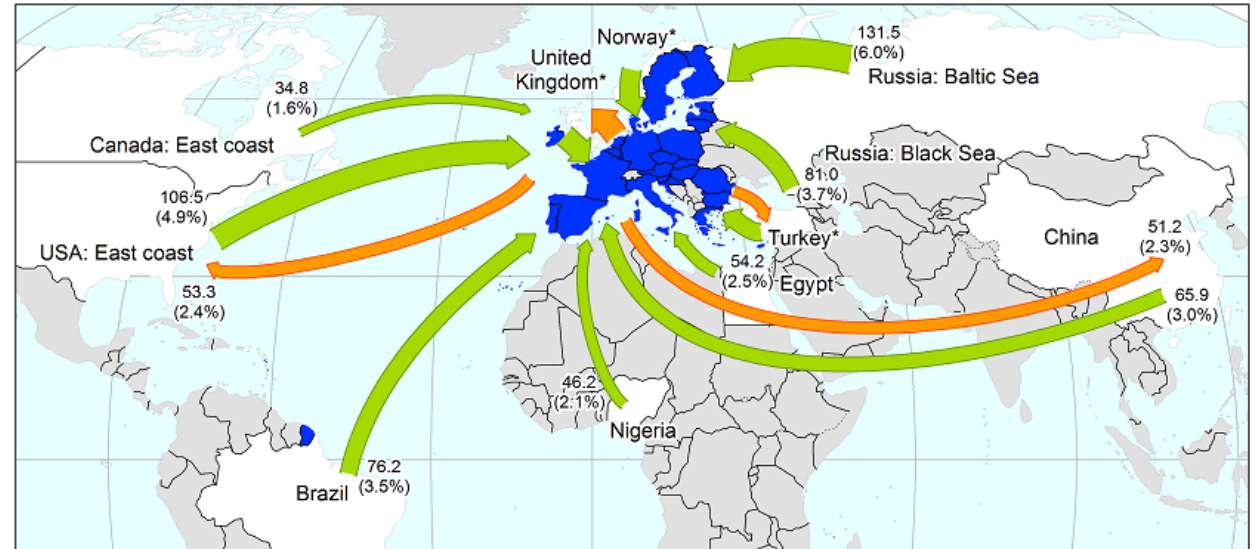


Flows

- Origin/destination matrix

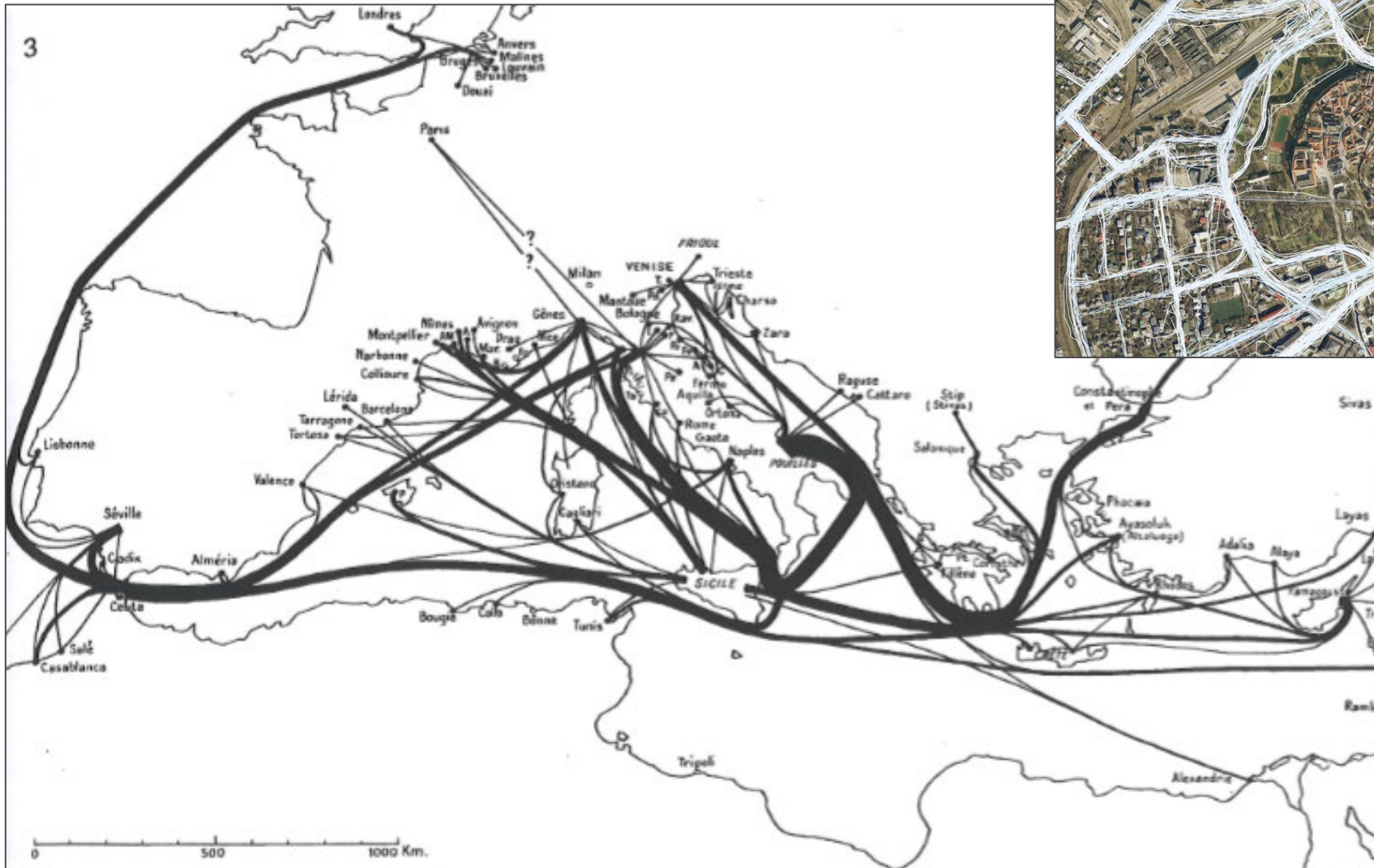


https://mappa.mundi.net/maps/maps_014/telegeography.html



[https://ec.europa.eu/eurostat/statistics-explained/index.php?title=Maritime freight and vessels statistics#Seaborne freight handled in European ports](https://ec.europa.eu/eurostat/statistics-explained/index.php?title=Maritime_freight_and_vessels_statistics#Seaborne_freight_handled_in_European_ports)

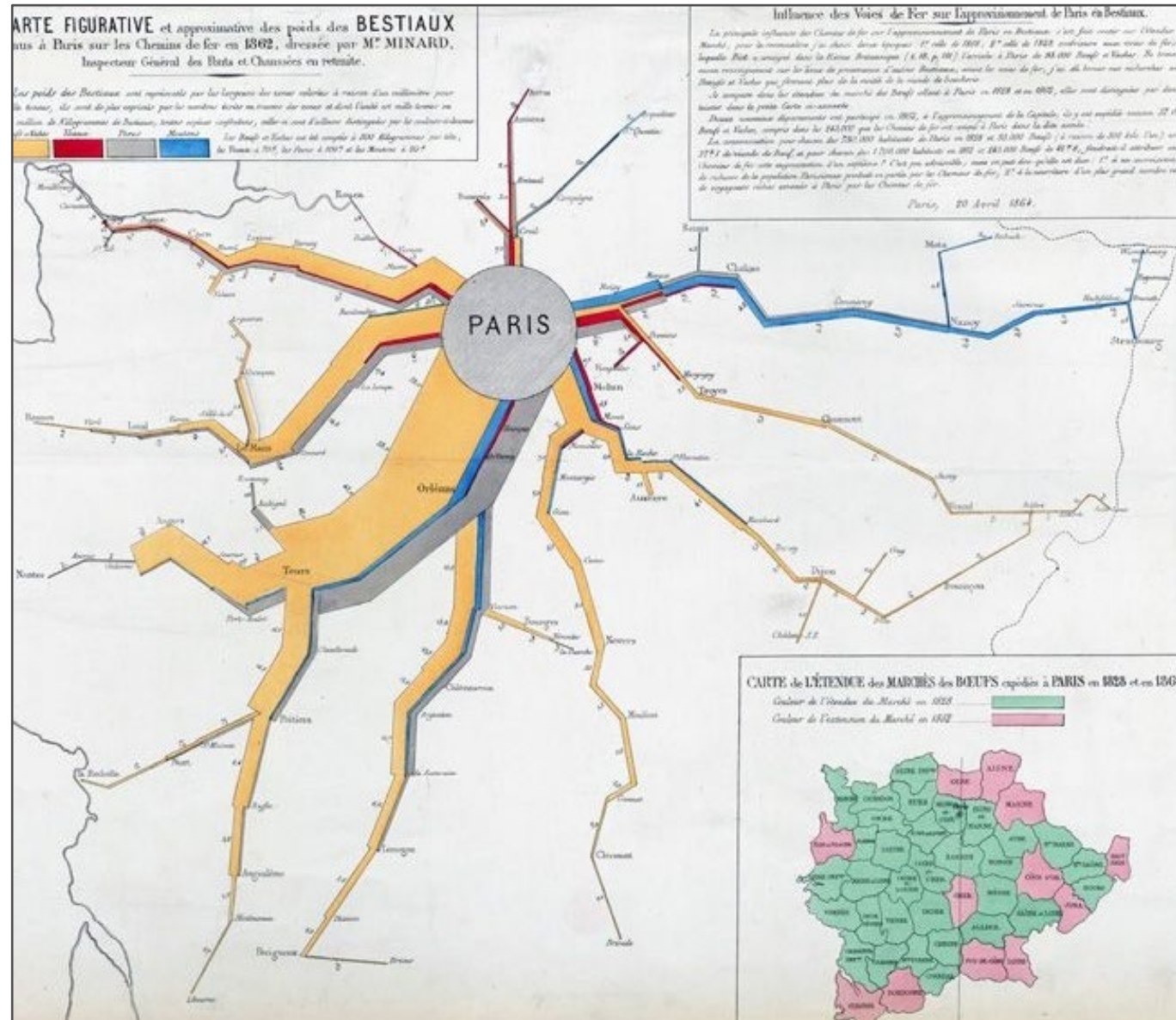
Flows



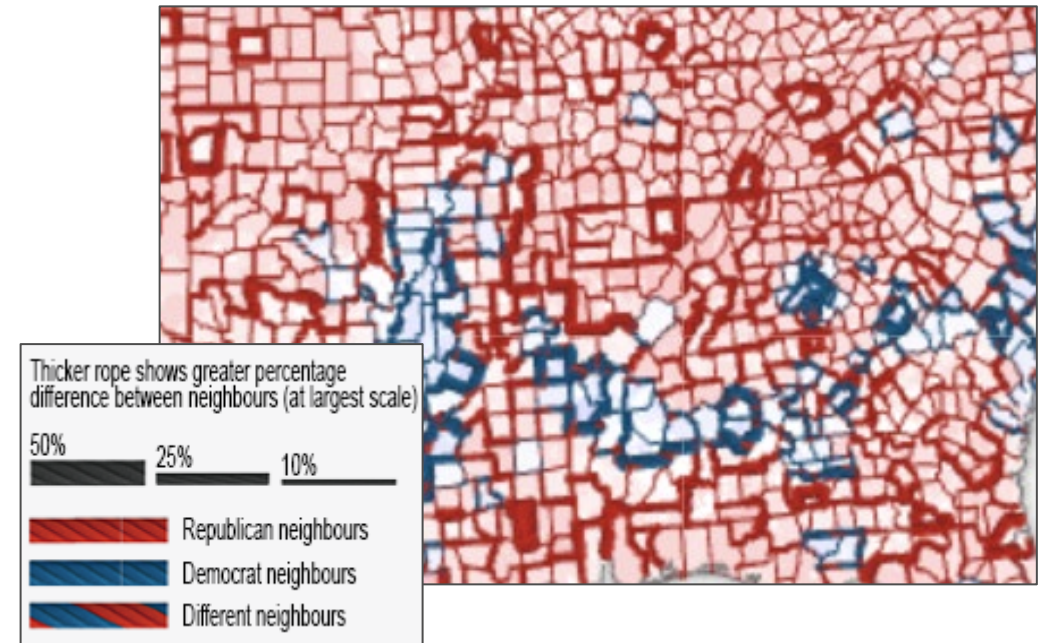
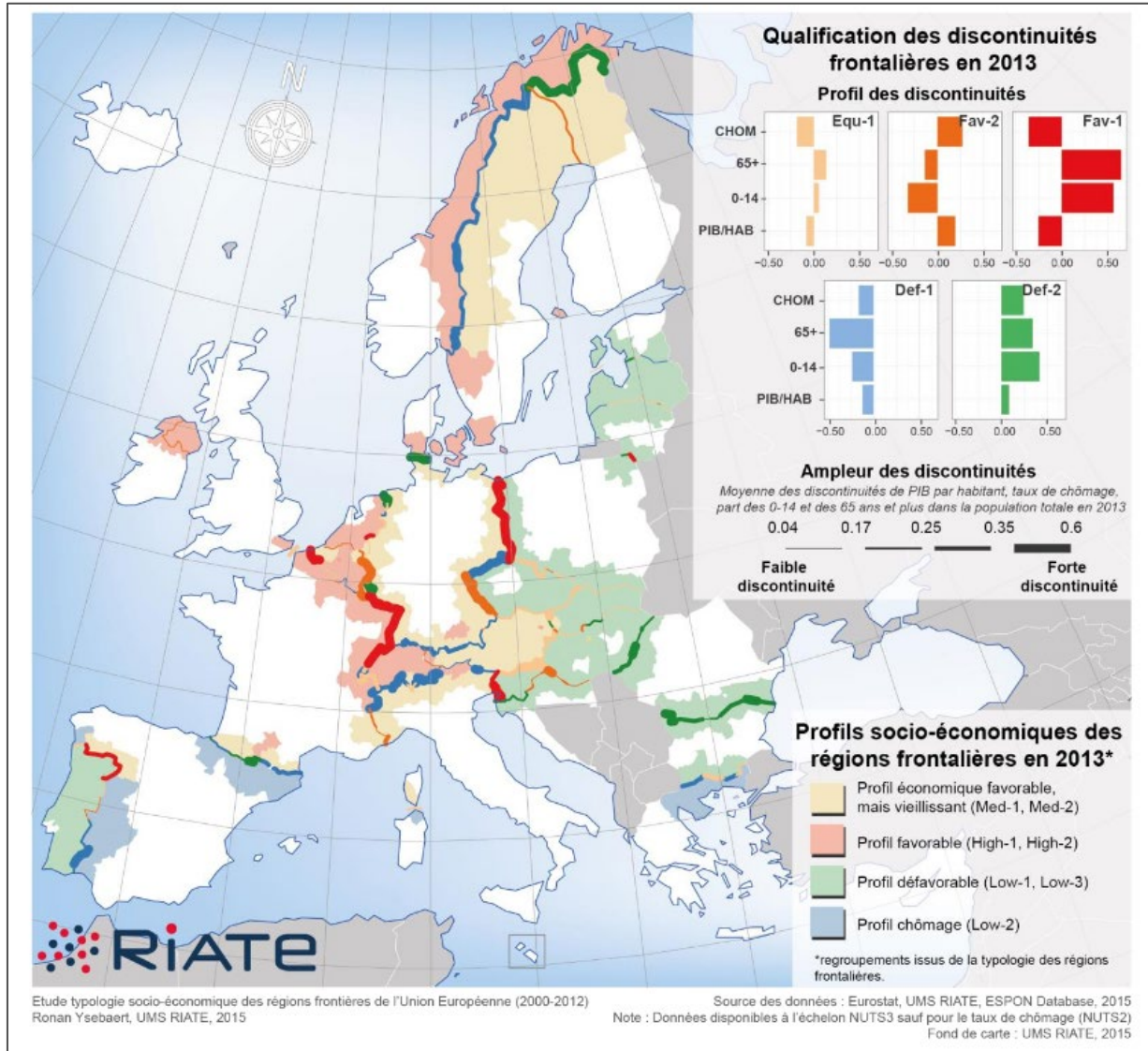
**Flow lines
bundling**

Flows

Flow composition



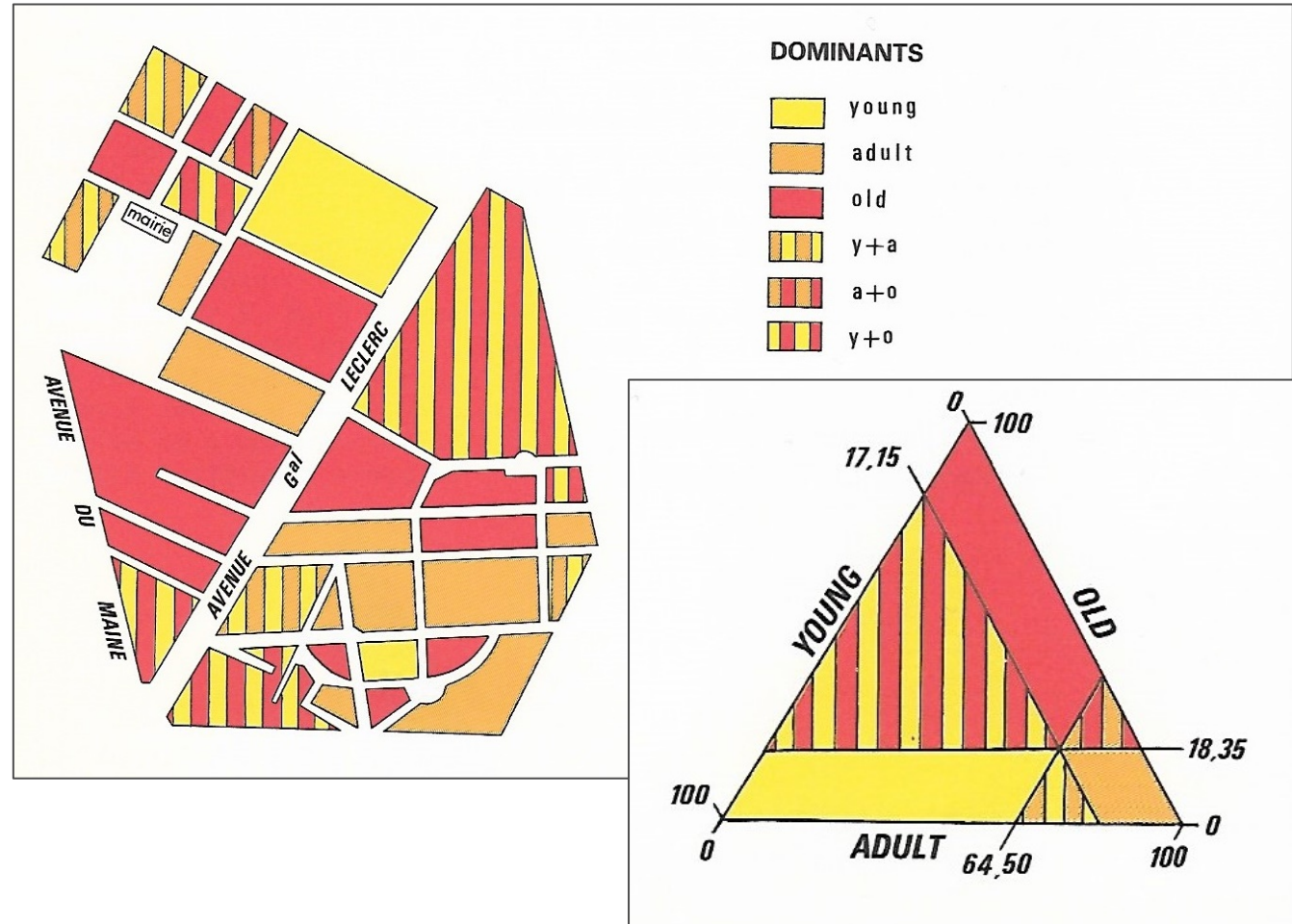
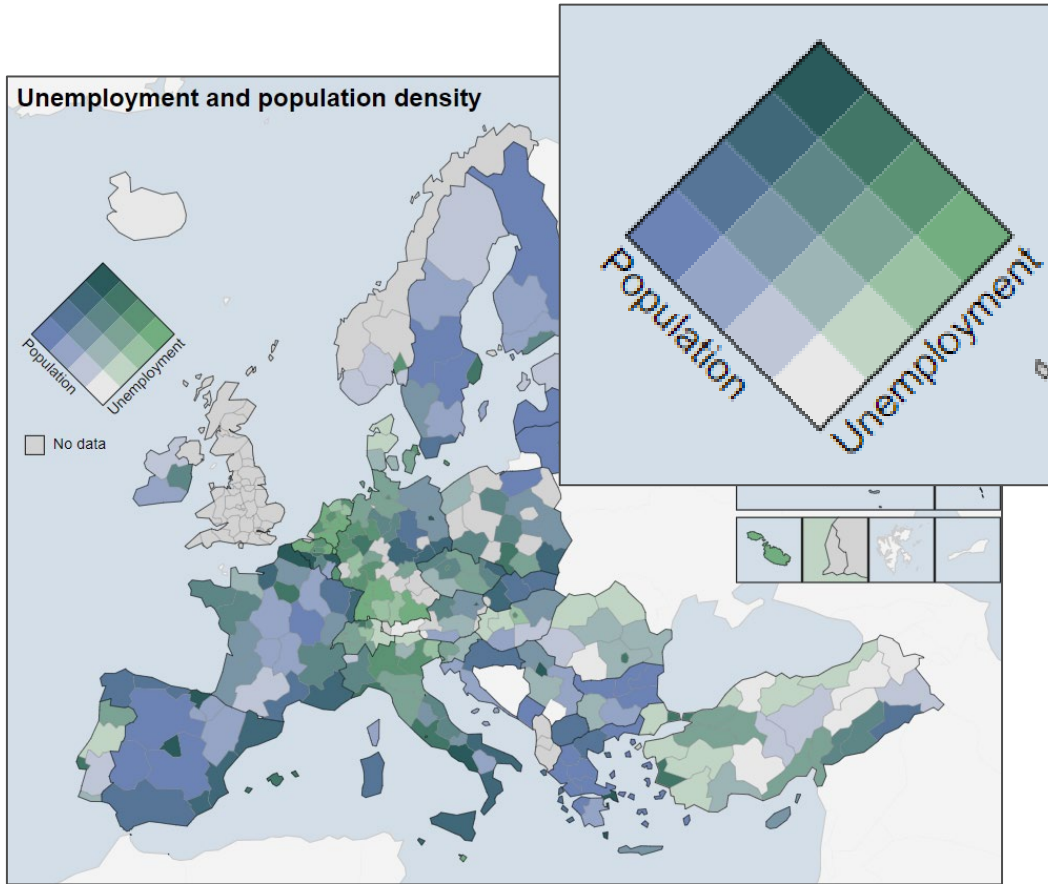
Discontinuities



<https://carto.maps.arcgis.com/apps/webappviewer/index.html?id=92c66b6d241c4542b1e5afe2bb3b7beb>

Multivariate

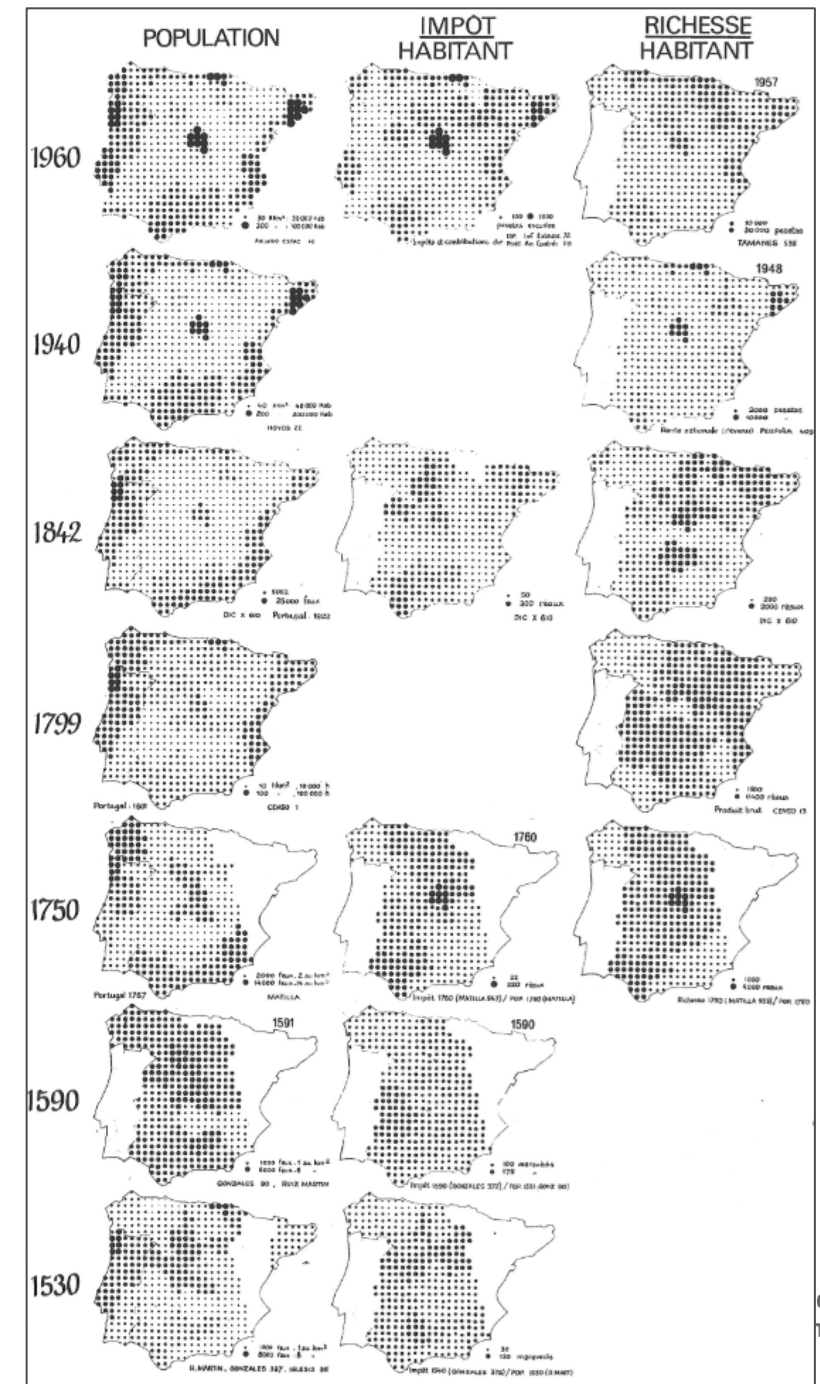
Bivariate / trivariate choropleth



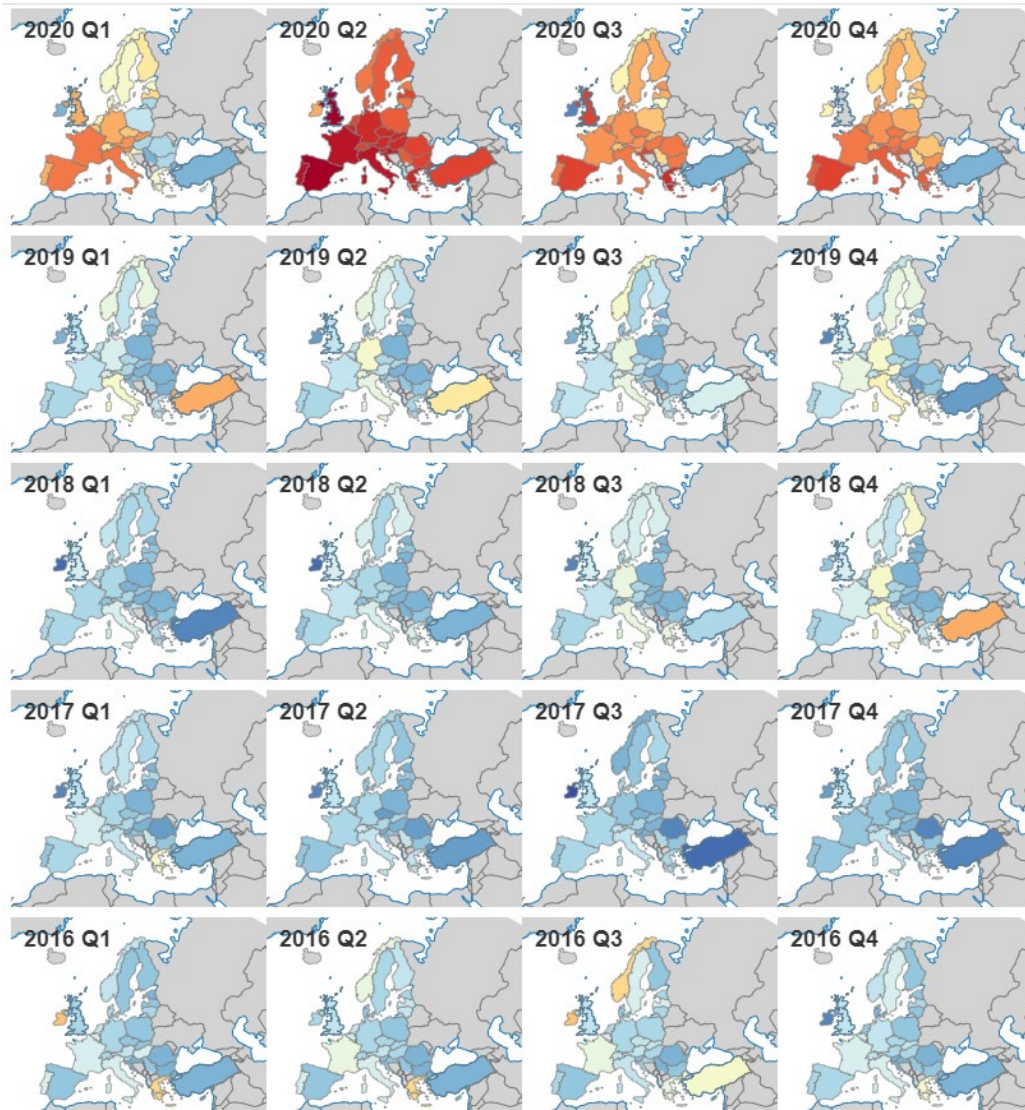
<https://eurostat.github.io/eurostat-map.js/examples/pop-unemploy-bivariate.html>

Small multiples

- One or several maps ?
- Multivariate maps VS small multiples
- For maps with low spatial granularity



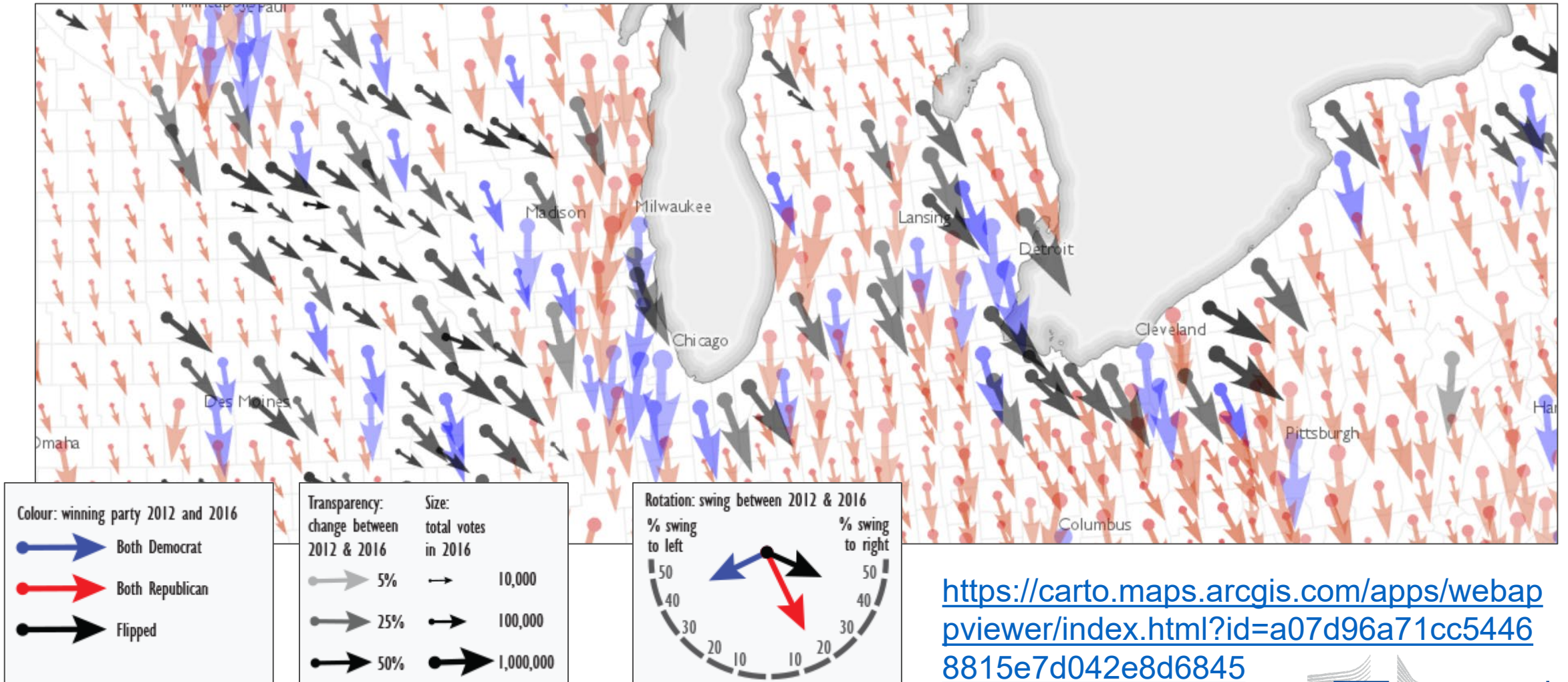
Small multiples



20 years of GDP change in Europe

<https://observablehq.com/@jgaffuri/20-years-of-gdp-change-in-europe>

Multivariate

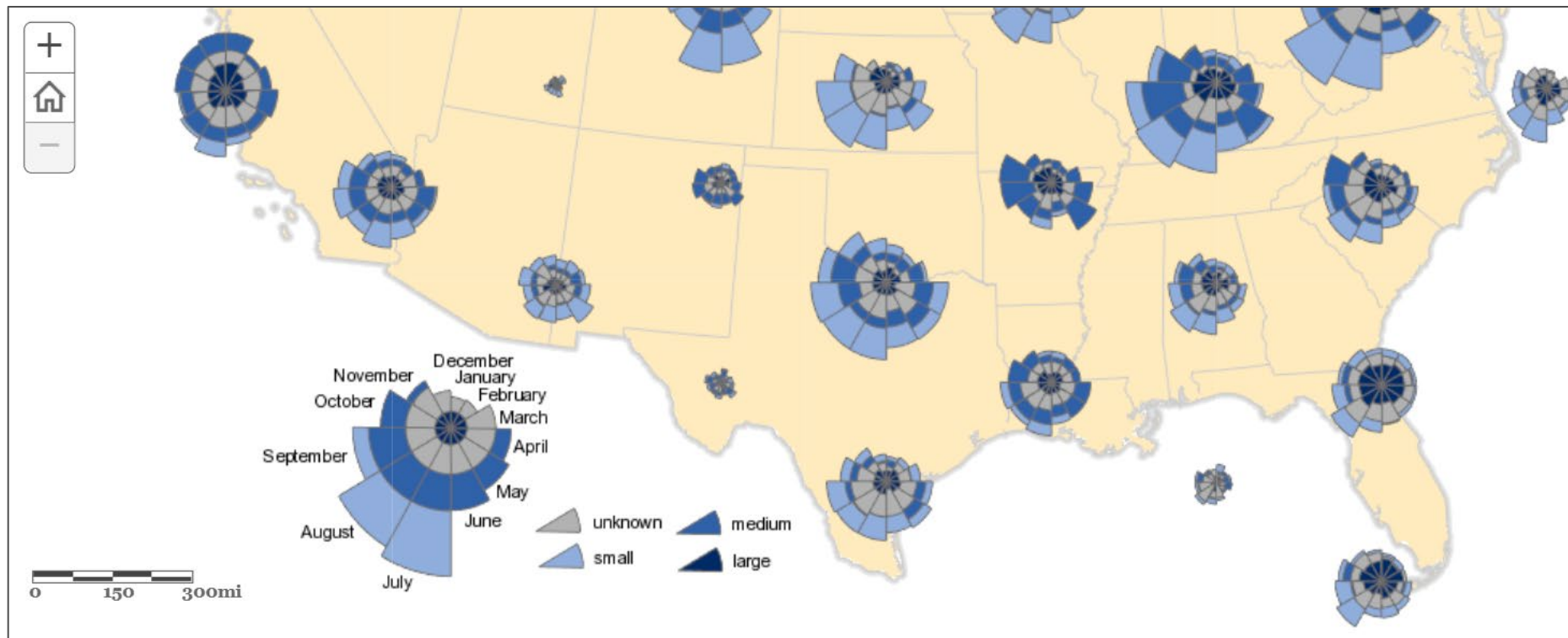


<https://carto.maps.arcgis.com/apps/webapviewer/index.html?id=a07d96a71cc54468815e7d042e8d6845>

Coxcomb

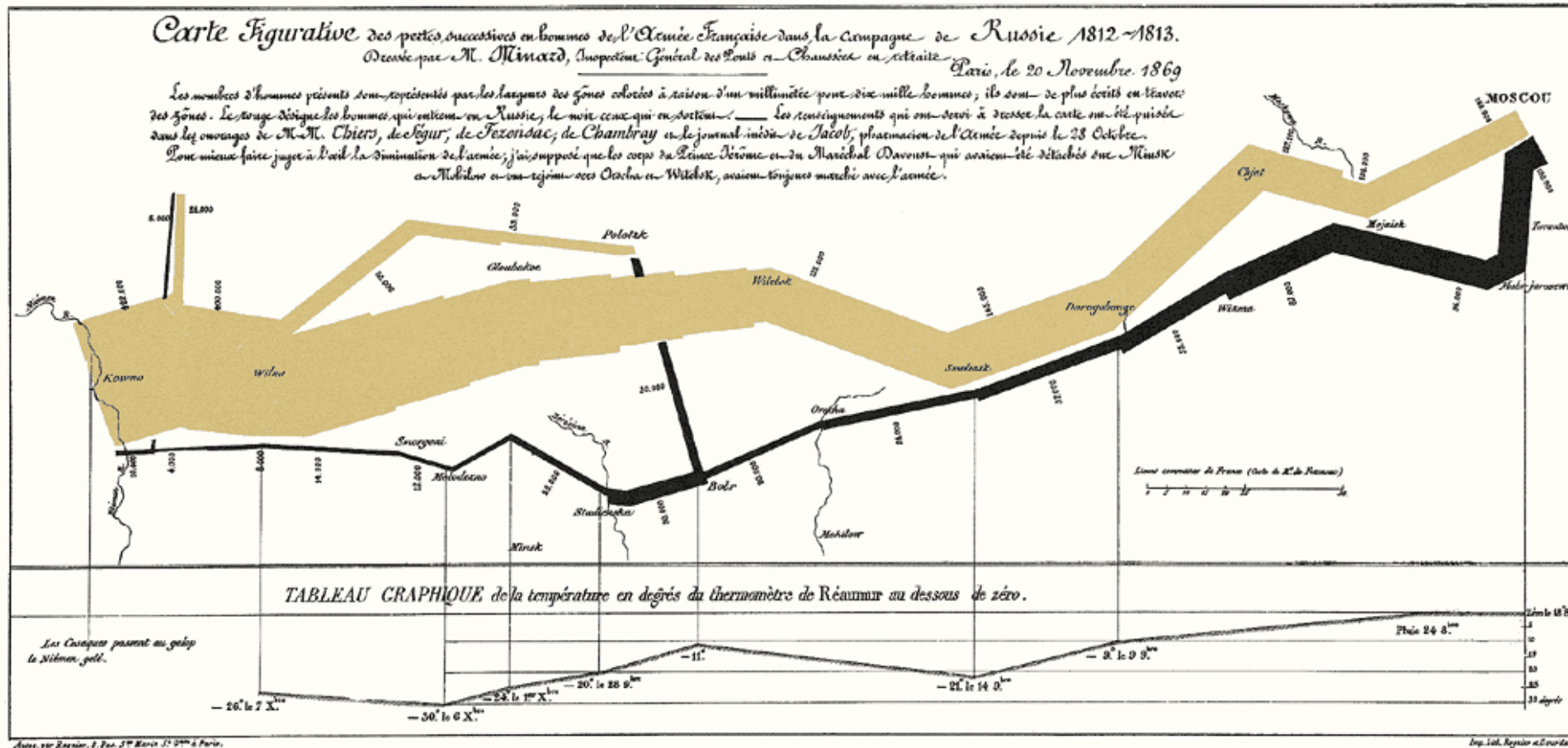
Wildlife Strikes by month

Aviation-related wildlife strikes by month and size



<https://carto.maps.arcgis.com/apps/MinimalGallery/index.html?appid=218a0e2e4c2540e39b793efeb34c4685#viewer=30066075caa947178f6c2ae438e7efa4>

- # The (famous) Minard's map of Napoleon's 1812 Russian campaign



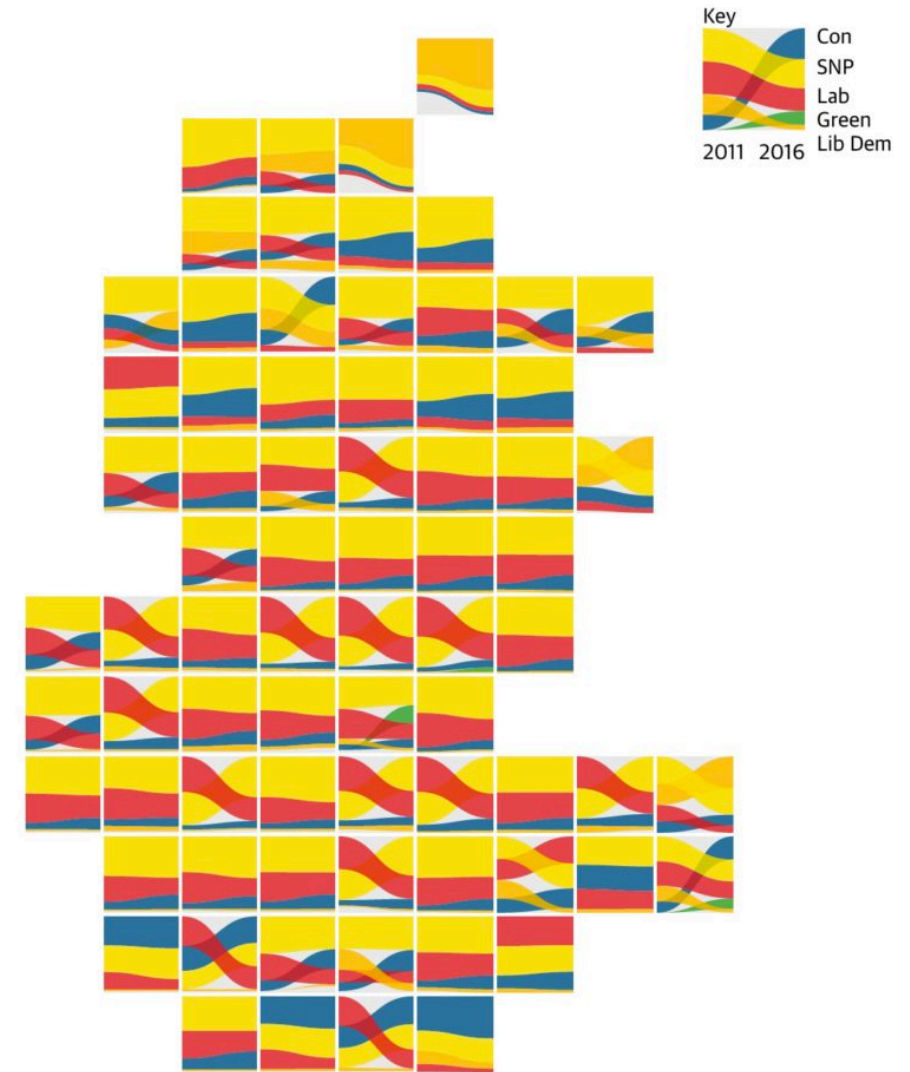
Time series

A “sparkline” map of COVID 19



@datagistips
<https://datagistips.hypotheses.org/488>

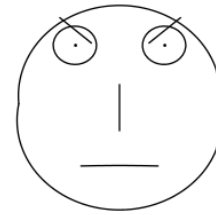
How Scotland's political geography changed, seat by seat



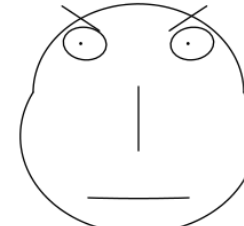
<https://www.theguardian.com/politics/2016/may/06/holyrood-elections-see-rise-of-team-ruth-and-demise-of-labour-vision>

Chernoff faces

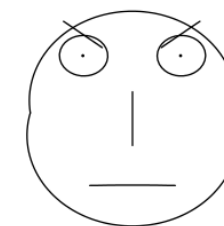
- High capability of the human brain to read emotions on human faces.



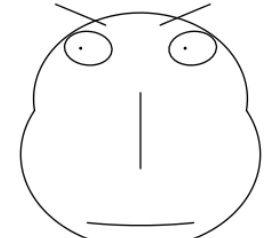
AARONSON, L.H.



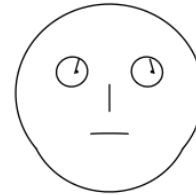
ALEXANDER, J.M.



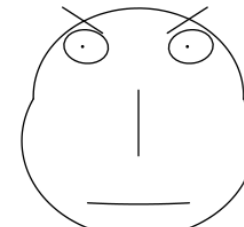
ARMENTANO, A.J.



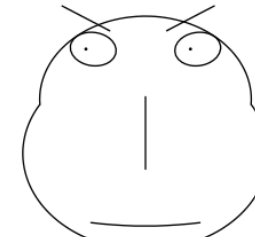
BERDON, R.I.



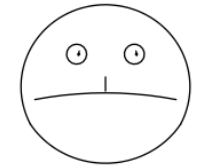
BRACKEN, J.J.



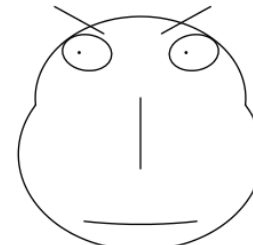
BURNS, E.B.



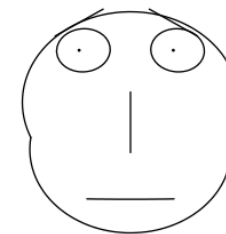
CALLAHAN, R.J.



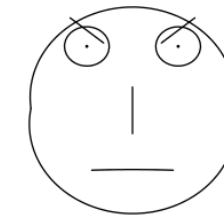
COHEN, S.S.



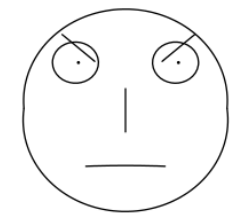
DALY, J.J.



DANNEHY, J.F.

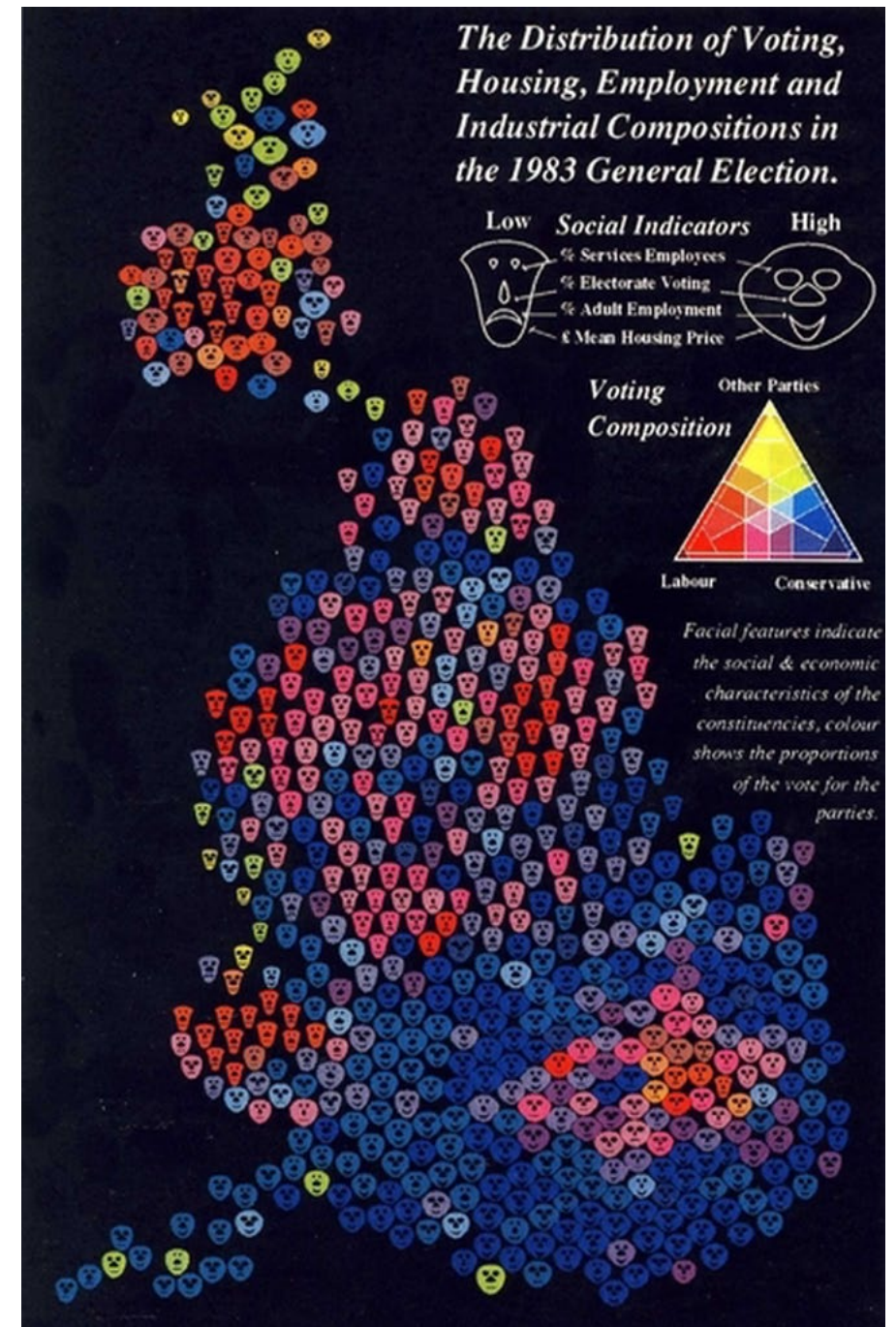
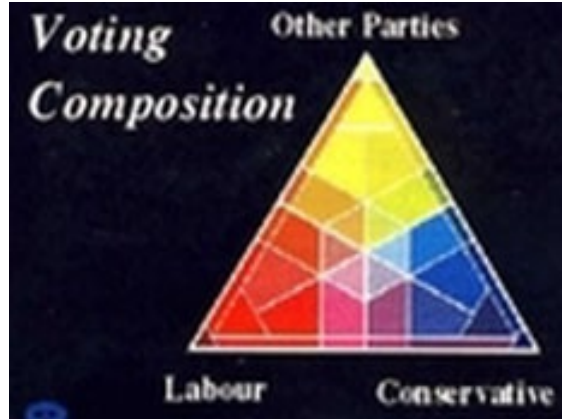


DEAN, H.H.



DEVITA, H.J.

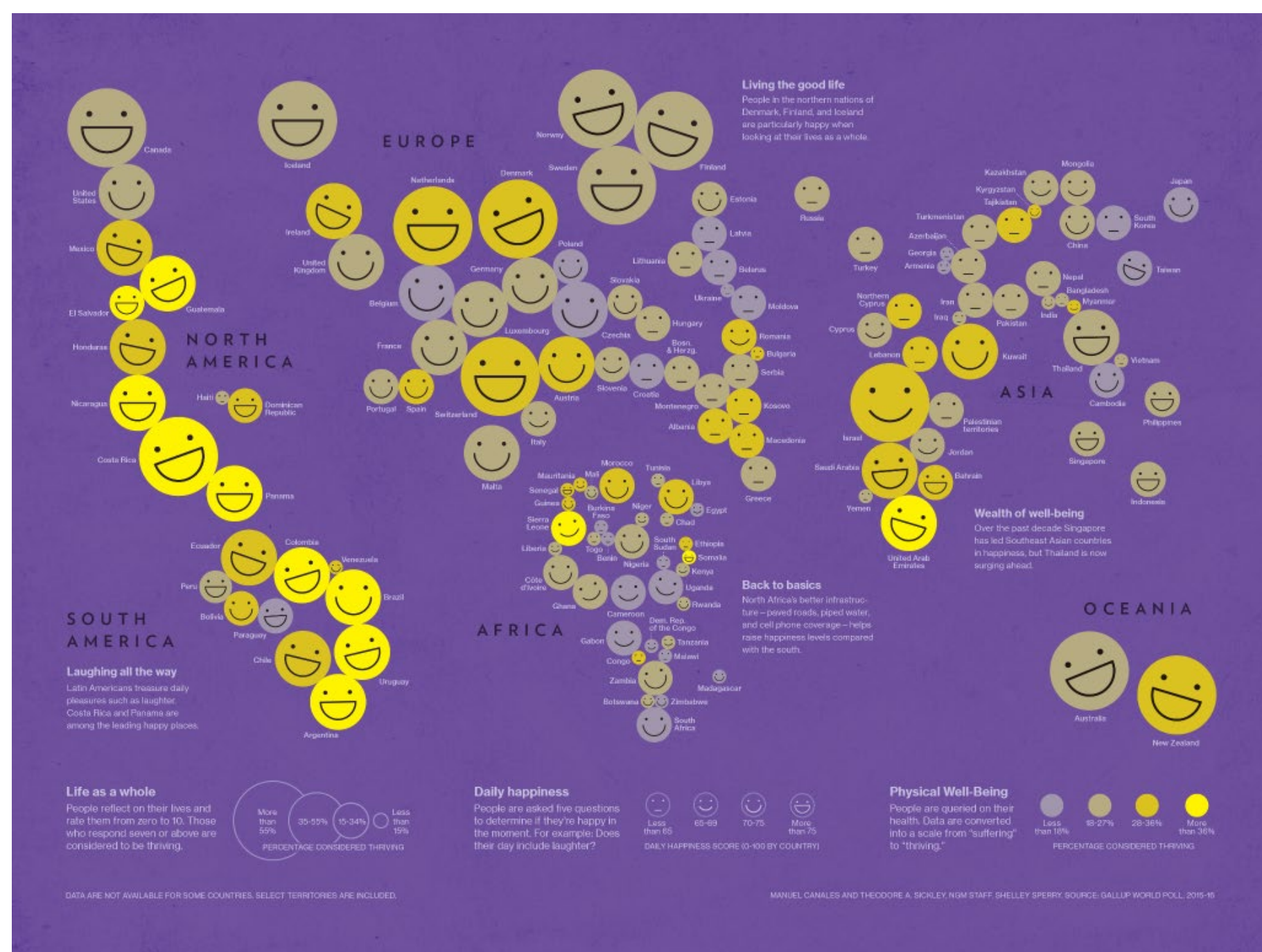
Chernoff faces



Danny Dorling, 1991
<http://www.dannydorling.org/>

Atlas of happiness

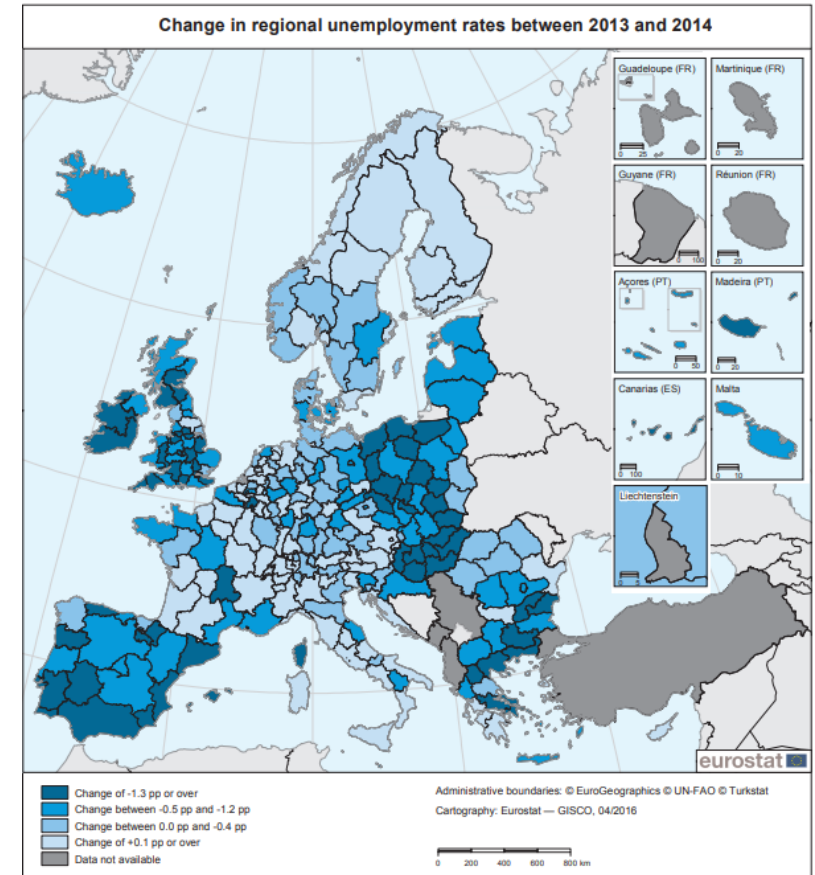
by national geographic magazine



<https://www.nationalgeographic.org/media/atlas-happiness/>

Map components, layout

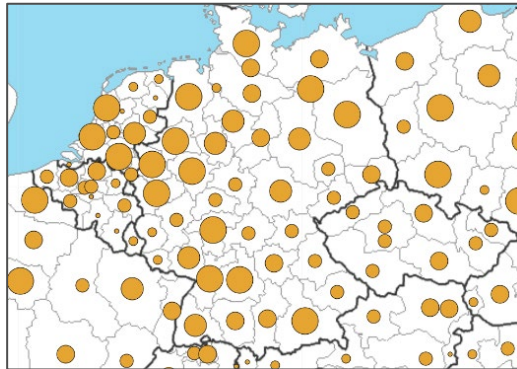
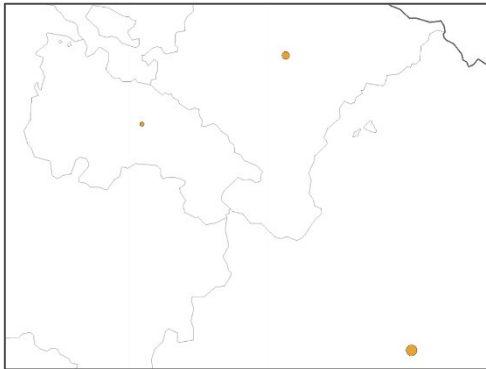
- **Map components** - Frame, title, legend, source, copyright, scale bar, north arrow or compass rose, insets, graticule, logo, disclaimers, etc.
- **Layout** – Balance, along grid.
- Map lettering and fonts.





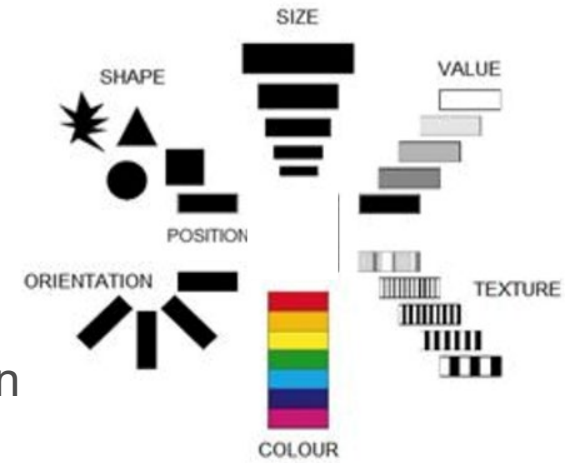
Interactivity and exploration

- Maps for communication – to maps for exploration
- Present – synthesise – analyse – explore
- **Zooming:** Only when necessary. Show multi-scale versions of the map. Case with clutter (too much zoom out), and no data (too much zoom in)



Dos and don'ts

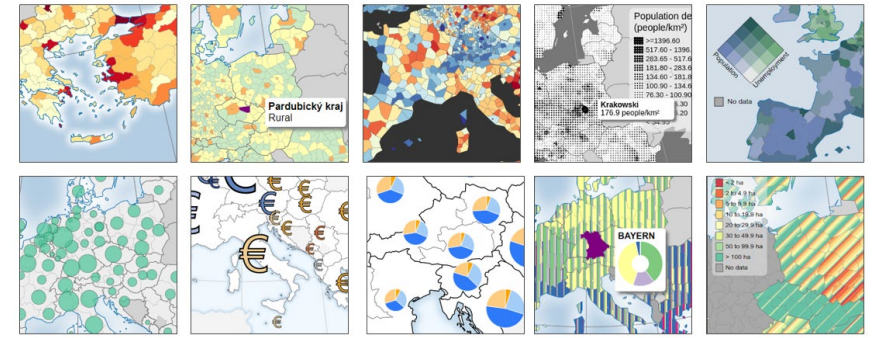
- Properly map the visual variables to the statistical dimensions
- Use only one single visual variable per statistical variable, to avoid confusion
- Use an equal-area map projection
- Simplify the geometries, aggregate the data to fit the scale/zoom levels
- Do not use diverging color palette in the absence of central value
- Do not show quantities/numbers on a choropleth map
- Be aware of the MAUP
- Adapt to the media: Printed? Screen? Dimensions ?
- Do not show a map background with transparency below choropleth map.
- Etc.



Dos and don'ts

- Specify your map independently from the technology. Take a pen !
Choose the technology based on your need, and not the opposite.
- Choose whatever tool and technology you need.
(almost) everything is possible.
- Start coding, share your code, interact with developers, experiment.
 - Github - <https://github.com/eurostat>
 - ObservableHQ - <https://observablehq.com>

Resources and tools



- ColorBrewer: Color Advice for Maps, <https://colorbrewer2.org/>
- <https://riccardoscalco.it/textures/>
- R (Package cartography, see also http://riatelab.github.io/cartography/vignettes/cheatsheet/cartography_cheatsheet.pdf)
- By Eurostat
 - <https://github.com/eurostat/eurostat-map.js>
 - <https://github.com/eurostat/GridViz>
 - <https://github.com/eurostat/RegionSimplify>



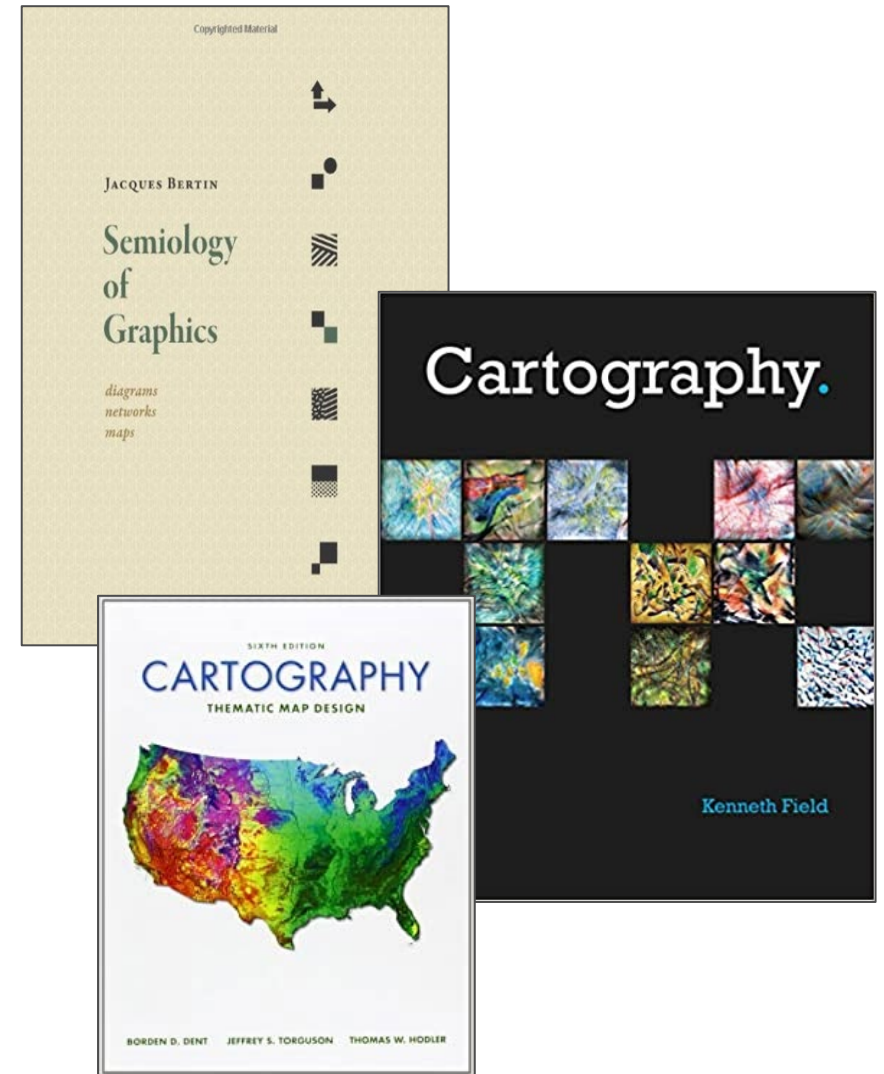
Bibliography

Bertin, J. (1968). *Semiology of Graphics: Diagrams, Networks, Maps*, Esri Press books, ISBN: 9781589482616.

Field, K. (2018). *Cartography: a compendium of design thinking for mapmakers*, International Cartographic Association, Esri Press books, ISBN: 9781589484399.

Dent, B. D., Torguson, J. S., & Hodler, T. W. (2008). *Cartography: Thematic Map Design*, 6th Edition. McGraw-Hill.

Robinson, A. H., Morrison, J. L., Muehrcke, P. C., Kimerling, A. J., & Guptill, S. C. (1995). *Elements of Cartography*, 6th ed. New York: John Wiley and Sons.



Thank you !

julien.gaffuri@ec.europa.eu