Urban Computing

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Universiteit Leiden The Netherlands

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Third Session: Urban Computing - Data visualization

Agenda for this session

Part 1: Data visualization fundamentals

- Perception
- Data types
- Visual mapping
- Part 2: Visualizing spatio-temporal data
 - Visualizing geo-spatial data
 - Visualizing spatio-temporal data

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Part 1: Data visualization fundamentals

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What is data visualization?

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"Data graphics visually display measured quantities by means of the combined use of points, lines, a coordinate system, numbers, symbols, words, shading and color" Edward R. Tufte

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What is visualization

 We define visualization as the communication of information using graphical representations.

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- Goals
 - Effective communications
 - Clarity
 - Integrity
 - Allowing engagement

Who do you visualize for?

Depends on the purpose:

- Exploratory data visualization
- Explanatory data visualization

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Perception in Visualization

Perception is the process of recognizing, organizing, and interpreting sensory information.

- Attentive (controlled)
- Pre-attentive (uncontrolled)

Example: in the picture to be shown, count the number of threes and raise your hand when done.

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How many numbers of 3 you see in this picture?

 $18374806380364294148944327065225658875347787454\\14889032707545480172808753871247432245672375231\\02355321789986322457900888231806234358759923682\\45642329893423508912127456534589964580473325868\\97452419894123124560077650975322346873202423891$

How many numbers of 3 you see in this picture?

 $18374806380364294148944327065225658875347787454 \\14889032707545480172808753871247432245672375231 \\02355321789986322457900888231806234358759923682 \\45642329893423508912127456534589964580473325868 \\97452419894123124560077650975322346873202423891 \\$

How many numbers of 3 you see in this picture?

Answer: 28

Sometimes perception issues are more complicated than that...

Example two: Try to guess the ratio between the bigger picture and the smaller shape ...

What is the ratio between the bigger and the smaller circle?



What is the ratio between the bigger and the smaller rectangle?



What is the ratio between the bigger and the smaller circle?



What is the ratio between the bigger and the smaller rectangle?

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Visualization basics: Data

- Visualizing is about mapping data to the right visual attribute
- Data
 - Nominal
 - Ordinal
 - Quantitative
- What matters a lot is the operations we can apply on data. A good visual attribute helps us keep those operations.

Nominal

- Categories
- Names

Mary John Jack



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Ordinal

Categorical data type where the variables have natural, ordered categories and the distances between the categories is not known





Freshman Sophomore Junior Senior

Quantitative

- Discrete $\{i \in \mathbb{N}\}$
- Continuous $\{i \in \mathbb{R}\}$

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Quantitative continued

- Some distance metric can be defined
- You cannot divide them, ratios don't mean anything

| March 2019 | | | | | | < Today > | |
|------------|-----|-----|-----|-----|-------|-----------|--|
| Sun | Mon | Tue | Wed | Thu | Fri | Sat | |
| | 18 | 19 | | | | | |
| 24 | 25 | 26 | | 28 | Mar 1 | 2 | |
| 3 | 4 | 5 | 6 | 7 | 8 | 9 | |
| 10 | 11 | 12 | 13 | 14 | 15 | 16 | |
| 17 | 18 | 19 | 20 | 21 | 22 | 23 | |
| 24 | 25 | 26 | 27 | 28 | 29 | 30 | |



52.2231959,6.7284655

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Visual mapping

How to map data to visual attributes such that operations are perceived visually ...

Visual mapping

How to map data to visual attributes such that operations are perceived visually ...

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What visual attributes you know?

Jacque Bertin

- Bertin presents the fundamentals of information encoding via graphic representations as a semiology (sign systems)
- Visual encoding is the process of mapping data into visual structures
- Bertin's graphical vocabulary:

| Marks | Points, lines, areas |
|------------|---|
| Positional | Two planar dimensions |
| Retinal | Size, value, texture, color, orientation, shape |

Jock MacKinlay



Quantitative data

Jock MacKinlay

Quantitative data **Ordinal data** Nominal data Position Position Position Color saturation Length Color hue Ĺ Color hue Angle Texture Color saturation Slope Texture Area Length Shape Length Volume Angle Angle Color saturation Slope Slope Color hue Area Texture Area Volume Shape Volume Shape

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Visual mapping



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Visual mapping



Not only useful for visual designers but also for designing automatic visualization algorithms

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Example



Which one is more efficient?



Example

January 600 lanuary -600 February February March March 500 500 April April May May -400 June June July July 300 300 August August September September October October 200 200 November November December December 1954 1955 1956 1957 1958 1959 1960 1949 1950 1953 1954 1949 1950 1951 1952 953 1951 1952 1955 1956 957 1958 959 0961 year year 600 600 January January February February March March - 500 - 500 April April May May 400 400 lune lune July July 300 August 300 August September September October October - 200 200 November November December December 1949 1950 1951 1952 1953 1954 1955 1956 1957 1958 1959 1960 1949 1950 1951 1952 1953 1954 1955 1956 1957 1958 1959 1960 year year

Which one is more efficient?

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Part 2: Visualizing spatio-temporal data

Visualizing spatio-temporal data (closely related to cartography)

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- Spatial data
- Temporal data
Visualizing geo-spatial data \rightarrow Making maps (Cartography)

A bit of history



- Original map made by John Snow in 1854.
- Map of the deaths from cholera in London in 1663.
- Each bar represents one deceased person

¹https://nl.wikipedia.org/wiki/John_Snow

A bit of history

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Figure: The map of Napoleon's Russian campaign

²source: https://en.wikipedia.org/wiki/Charles_Joseph_Minard $\mathbb{R} \to \mathbb{R} = \mathbb{R} \to \mathbb{R}$

Visualization technique for geo-spatial data

What is so difficult about making maps?

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The orange effect



³Image source: www.profdrikageografia.blogspot.com/2010_12_01_archive.html $\langle z \rangle \langle z \rangle = 0$ a.e.

Projections



Figure: Methods of projection: Cylindrical, Circular, Cone

Map projection techniques



Figure: A number of pseudo-cylindrical map projection techniques

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⁴https://en.wikipedia.org/wiki/Map_projection

⁵image credit Copyright ©[2011] [Daniel R. Strebe].

Attributes we would like to save in a projection

Attributes we would like to save in a projection

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- Shape
- Area
- Angles
- Distance
- Direction

Attributes we would like to save in a projection

- Shape
- Area
- Angles
- Distance
- Direction

A projection can preserve one or two of these properties \rightarrow At least three attributes will be sacrificed.

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Mercator projection is the de facto standard for Web mapping applications (Open street maps, Google maps, etc.)



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Mercator projection is the de facto standard for Web mapping applications (Open street maps, Google maps, etc.)



Everything near the equator is in the right size, the rest are not!

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Which projection should you use?

[Cai16]

- Continental areas: Asia and North America
 - Albers equal-area
 - Lambert azimuthal
- Countries in mid-latitude
 - Albers equal-area
 - Lambert azimuthal
 - Cylindrical equal-area
- Continental areas: Europe and Australia
 - Albers equal-area
 - Lambert azimuthal

- Polar regions
 - Lambert azimuthal
- Continental areas: Africa and South America
 - Lambert azimuthal
 - Mollweide
 - Sinosoidal
- Small countries
 - Lambert equal area
 - Cylindrical equal area

Example

Given a dataset with phone call instances, how will you show it on a map?

| Longitude | Latitude |
|-----------|----------|
| 52.168141 | 4.470163 |
| 52.168341 | 4.470133 |
| 52.168335 | 4.470236 |
| 52.168828 | 4.471694 |

Example



Problem with dotmaps: if we draw a dot for every instance there will a large degree of overlap. $^{6\ 7}$

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 $^{^{6}} https://en.wikipedia.org/wiki/Dot_distribution_map$

⁷image credit Copyright ©[2014] [Ziegenf2].

Visualizing area data

Thematic maps:



Figure: A choropleth map, colors mapped to numbers



Figure: An isarithmic map showing the density of a variable

Choropleth maps (Area data)

A map which uses differences in shading, coloring, or the placing of symbols within predefined areas to indicate the average values of a particular quantity in those area

Choropleth maps (problems)



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Problems with Choropleth maps

Most interesting values are often concentrated in densely populated areas with small polygons. Less interesting values are spread over sparsely populated areas with large polygons.

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Choropleth maps tend to highlight patterns in large areas, which may be of lower importance.

Cartograms

Cartograms are generalizations of ordinary thematic maps that avoid the problems of choropleth maps by **distorting the geography** according to the displayed statistical value.

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World map of organic agriculture (hectares)



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⁸image source: https://en.wikipedia.org/wiki/Cartogram ⁹mage credit Copyright ©[2016] [John Paull and Benjamin Hennig] _≥

Comparing areas of different size requires normalization



 Same data will yield different visualization when normalized considering population densities

 Normalize data before visualizing! Points to consider in maps (perception problems)



Figure: Ebbinghaus illusion

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Points to consider in maps



Figure: Overlapping points on maps, try to prevent the left image using normalization or transparent circles

Spatio-temporal data



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How do you visualize spatio-temporal data?



- How do you visualize spatio-temporal data?
- You can create a movie out of data with time! It is important to use techniques to allow focus on a specific phenomena in visualization

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• Example of technique for visualizing temporal data:

- How do you visualize spatio-temporal data?
- You can create a movie out of data with time! It is important to use techniques to allow focus on a specific phenomena in visualization

- Example of technique for visualizing temporal data:
 - Glyphs
 - Ribbons
 - Streaklines

Glyphs



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Glyphs can have a direction and strength.

Ribbons



Flow data visualized using ribbons, vorticity can be mapped to twist. $10_{\text{image source:http://hplgit.github.io/scitools/doc/easyviz/easyviz.html}$

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Streaklines



Points from a number of timestamps can be joined to form streaklines.

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Visualizing flows on maps

How to deal with so many lines?

- ► Flow maps
- Arc maps



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End of theory!

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References I

- Alberto Cairo, *The truthful art: Data, charts, and maps for communication*, New Riders, 2016.
- Matthew O Ward, Georges Grinstein, and Daniel Keim, Interactive data visualization: foundations, techniques, and applications, AK Peters/CRC Press, 2011.