

# Data(set) Types and Semantics

Torsten Möller

# Schedule

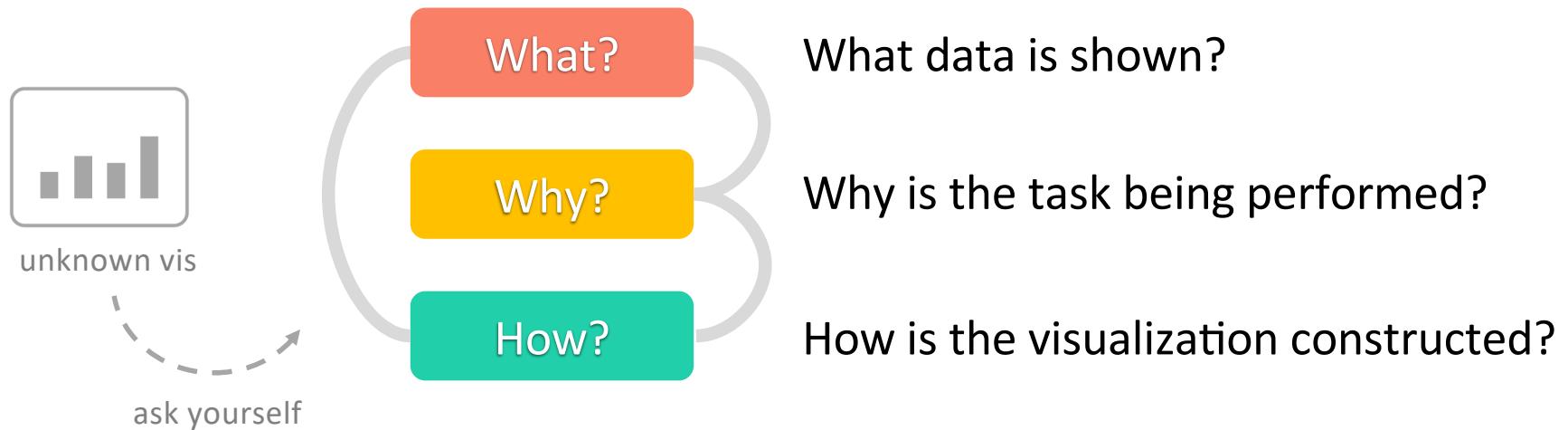
- Last week: Design Principles
  - Graphical Integrity
  - Design Principles
  - Design Elements
- Today: Data(set) Types and Semantics
  - Semantics vs. Types
  - Data(set) & Attribute Types
  - Attribute + Dataset Semantics
  - Derived Data
- Follow-up:
  - Visual Encoding
  - Tasks

Week	Date	Tuesday	Friday
1	Mar 05/08	No Lecture	Introduction (TM) <a href="#">pdf</a> [Munzner Ch. 1] Rosling at <a href="#">TED 2006</a> ; Krulwich at <a href="#">RadioLab</a>
2	Mar 12/15	Rекторstag	Tableau Q&A-A1 (Y.J) <a href="#">Tutorial</a>
3	Mar 19/22	Design Principles (TM) <a href="#">pdf</a>	Data(set) Types and Semantics (TM) <a href="#">pdf</a> Task Typology
	Mar 19		Due: A1 (23:55)
4	Mar 26/29	Easter	Easter
	Mar 31		Due: A2 (23:55)
5	Apr 02/05	Easter	Easter
6	Apr 09/12	Tasks (FW) <a href="#">pdf</a> [Munzner Ch. 2+3] <a href="#">Task Typology</a>	No Lecture
7	Apr 16/19	Visual Encoding Principles (TM) <a href="#">pdf</a> [Munzner Ch. 5+10] <a href="#">Learning perceptual kernels for vis design</a> Livingstone: <a href="#">What Art can tell us about the brain</a> (Vis 2008 keynote);	Tableau Tutorial (Y.J)

# Reading

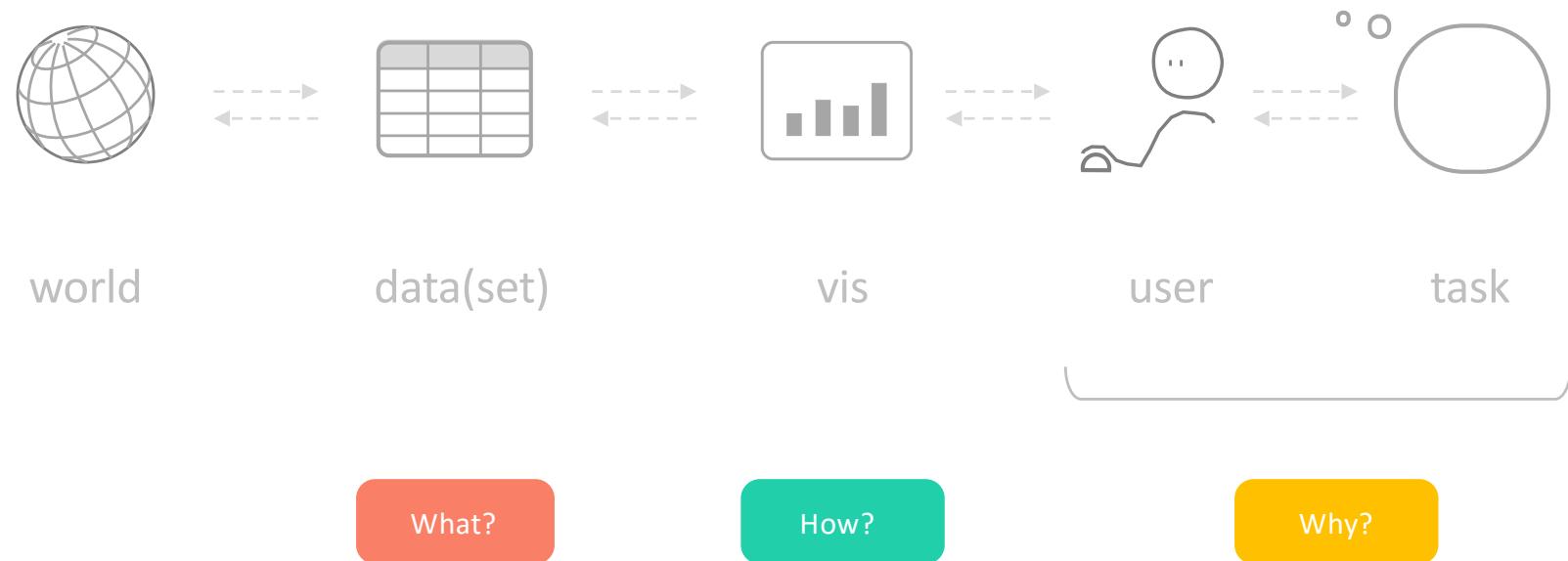
- Munzner, “Visualization Analysis and Design”: Chapter 2 (What: Data Abstraction)
- Shneiderman, “The Eyes Have It: A Task by Data Type Taxonomy for Information Visualizations,” IEEE Symposium on Visual Languages, 1996
- Heer+Shneiderman, “Interactive Dynamics for Visual Analysis,” Communications of the ACM 2012.
- Amar et al., “Low-level components of analytic activity in information visualization,” InfoVis 2005.
- Brehmer+Munzer, “A Multi-Level Typology of Abstract Visualization Tasks,” InfoVis 2013.

# Three-part analysis framework to analyze any existing visualization



Munzner, Visualization Analysis and Design, 2014, p. 17 ff.

# Three-part analysis framework to analyze any existing visualization



Munzner, Visualization Analysis and Design, 2014, p. 17 ff.

Semantics vs.  
Types

Data Types

Dataset Types  
Attribute Types  
Data Types  
Dataset Types  
Dataset Availability

Attribute & Data  
Semantics  
Data vs. Conceptual  
Model  
Spatial vs. Non-Spatial  
Key vs. Value  
(Non-)Temporal  
Continuous vs.  
Discrete  
Topology vs.  
Geometry

Derived Data

# Semantics vs. Types

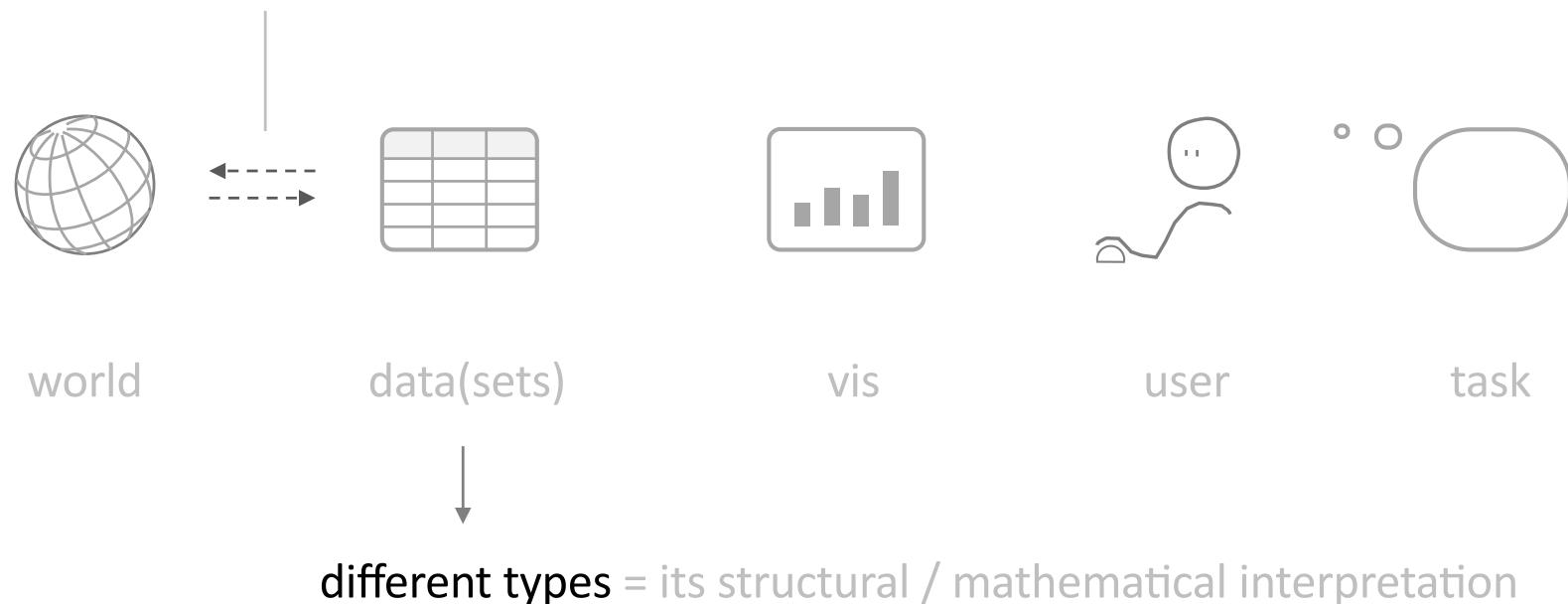
# Semantics vs. Type

- Semantics: real-world meaning of data
- Type: abstract classification with implications on
  - mathematical operations
  - data structure (how to store)
- Given semantics – type will follow

# Semantics vs. Type

Munzner, Visualization  
Analysis and Design,  
2014, p. 17 ff.

**semantics of data** = its real-world meaning



Semantics vs.  
Types

Data Types

Dataset Types  
Attribute Types  
Data Types  
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Dataset Availability

Attribute & Data  
Semantics  
Data vs. Conceptual  
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Derived Data

# Data (attribute) Types

# Data Types



Twitter User  
ScaredOfTheDark(net)  
@RetweetableN14

# Data Types

- Items  
Individual entity
- Attributes  
Property that is measured, observed
- Links  
Express relationship between items
- Positions  
Spatial data location (2D, 3D)
- Grids  
Sampling strategy for continuous data

# Data (Attribute) Types

- Ordered

- Quantitative

- 10 inches, 23 cm, etc.



- Ordinal

- Small, medium, large



- Categorical (Nominal, Qualitative)

- Apples, Oranges, Bananas,...



→ Ordering Direction

→ Sequential



→ Diverging



→ Cyclic



	32	7/16/07	2-High	Medium Box	0.65	7/18/07
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A	B	C	S	T	U
Order ID	Order Date	Order Priority	Product Container	Product Base Margin	Ship Date
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Record / Item

Dimension / Attribute

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# Example Dataset: „World Happiness“

Description : Composed from multiple sources ([summary](#))

- The **World Happiness Report** is a landmark survey of the state of global happiness, covering 155 countries in 2017. [...] The scores are based on answers to a life evaluation question asked in the poll, where respondents rate the quality of their current lives on a scale from 1 to 10. ([kaggle](#))
- The **CIA World Factbook** contains almanac-style information about the countries of the world, such as population, GDP, family income, internet access, cell phone subscriptions, etc. ([link](#))
- The **Human Development Index (HDI)** ([link](#))
- The **Inequality-adjusted Human Development Index (INA)** ([link](#))

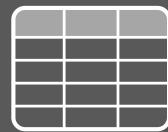
Semantics vs.  
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Topology vs.  
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Derived Data



# Dataset types

# Dataset types

„A **dataset** is any collection of information that is the target of analysis.“

Munzner, Visualization Analysis  
and Design, 2014, p. 24

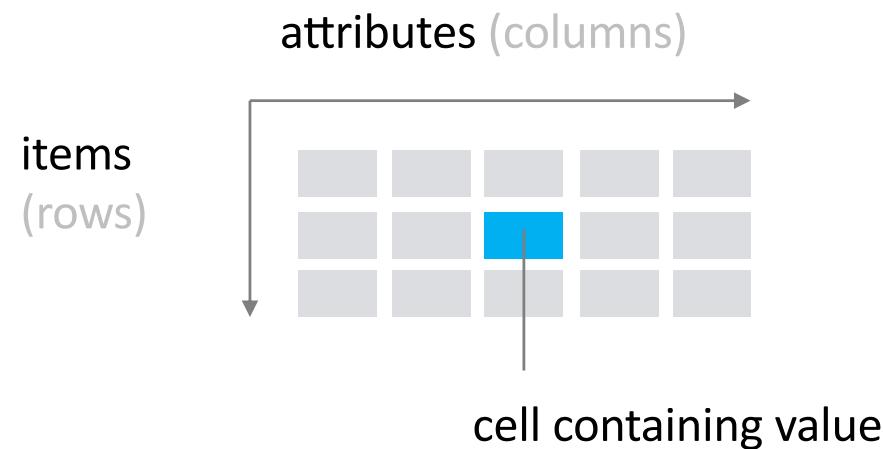
Basic types:

Tables	Networks & Trees	Fields	Geometry	Clusters, Sets, Lists
Items	Items (nodes)	Grids	Items	Items
Attributes	Links	Positions	Positions	

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(+ e.g. Text + Log Files, ...)

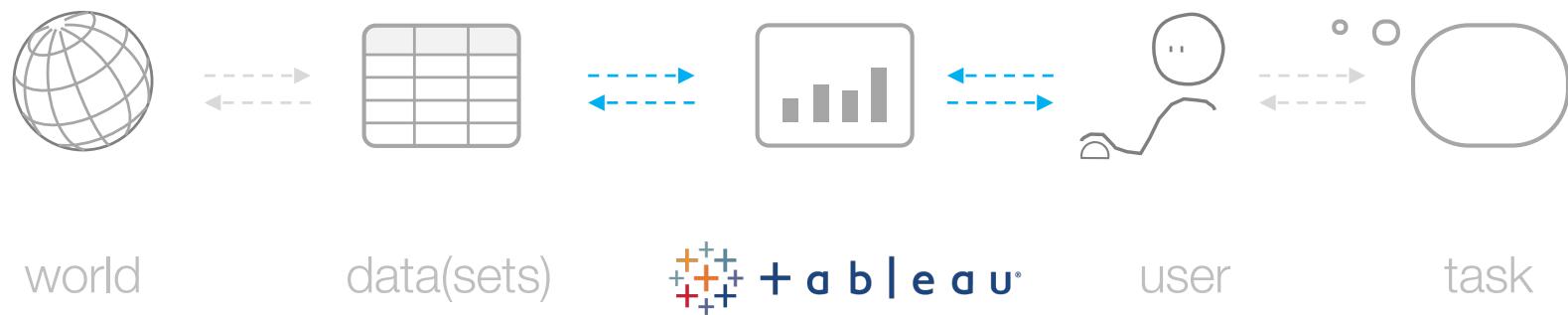
# Tables



- Each data **item** in a new row
- Each column contains an **attribute**

# Tableau Example

► Let's build our first visualization!



# Tableau Example

- Dimensions - **Categorical**
- Measures - **Quantitative**

## Tables

Abc biggest\_official\_language  
🌐 country  
Abc map\_reference  
Abc *Measure Names*

---

# cellular\_subscriptions  
# corruption  
# dystopia\_residual  
# economy  
# familiy\_income\_gini\_coeff  
# family  
# freedom  
# GDP\_per\_capita(\$)  
# generosity  
# happiness\_rank  
# happiness\_score  
# health  
# inflation\_rate(%)  
# internet\_access\_populati...  
# military\_expenditures(%)  
# population  
# surplus\_deficit\_GDP(%)  
# *happiness\_2017.csv (Cou...*  
🌐 *Latitude (generated)*  
🌐 *Longitude (generated)*  
# *Measure Values*

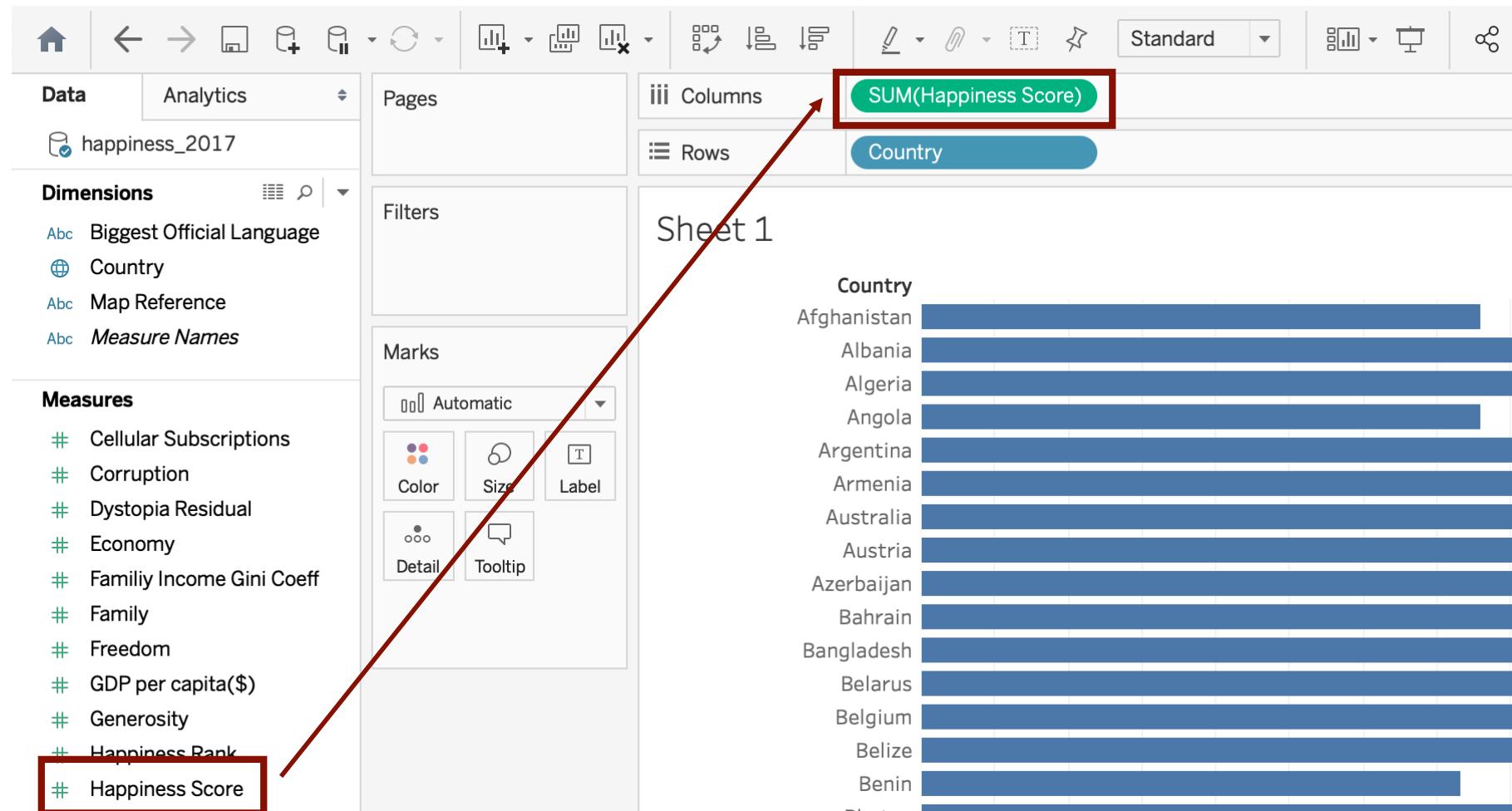
# Tableau Example

The screenshot shows the Tableau interface with the following components:

- Top Bar:** Includes icons for Home, Back, Forward, Data, Analytics, Refresh, and various document and chart types.
- Data Section:** Shows a project named "happiness\_2017".
- Dimensions Section:** Lists "Bigest Official Language", "Country" (which is highlighted with a red box), "Map Reference", and "Measure Names".
- Measures Section:** Lists "Cellular Subscriptions", "Corruption", "Dystopia Residual", "Economy", "Family Income Gini Coeff", "Family", "Freedom", and "GDP per capita(\$)".
- Marks Section:** Set to "Automatic" with options for Color, Size, Text, Detail, and Tooltip.
- Rows Section:** Contains a red arrow pointing from the "Country" dimension in the Dimensions section to the "Country" field in the Rows section.
- Sheet 1:** Displays a list of countries with three-letter codes next to them. The list is:

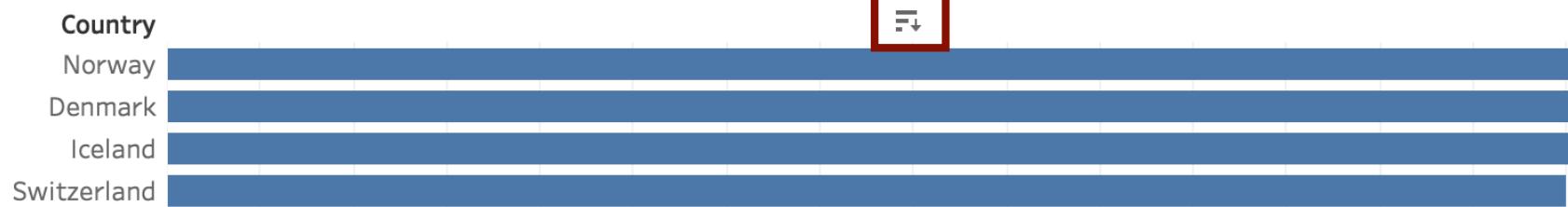
Country	
Afghanistan	Abc
Albania	Abc
Algeria	Abc
Angola	Abc
Argentina	Abc
Armenia	Abc
Australia	Abc
Austria	Abc
Azerbaijan	Abc
Bahrain	Abc
Bangladesh	Abc
Belarus	Abc

# Tableau Example

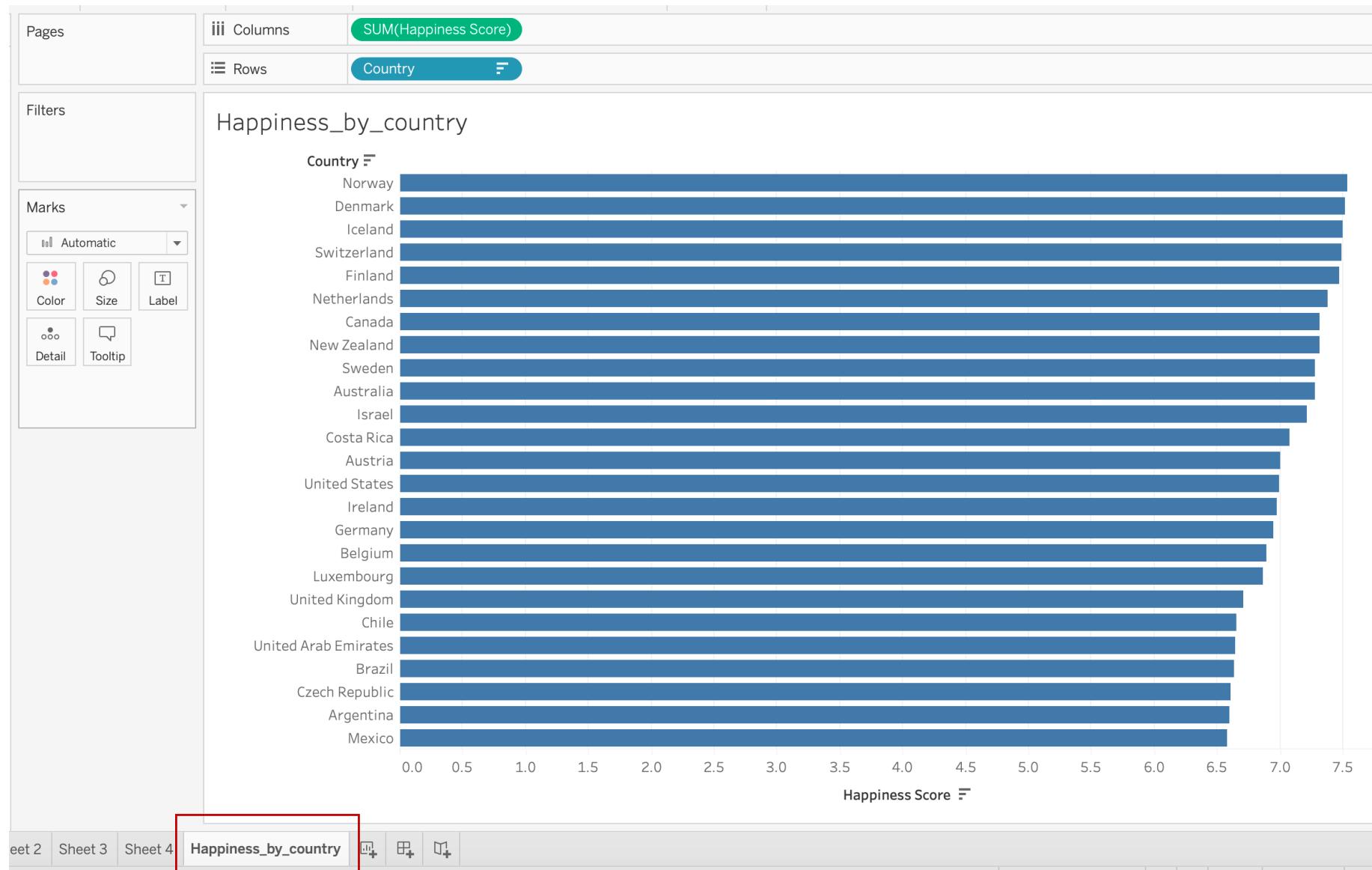


# Tableau Example

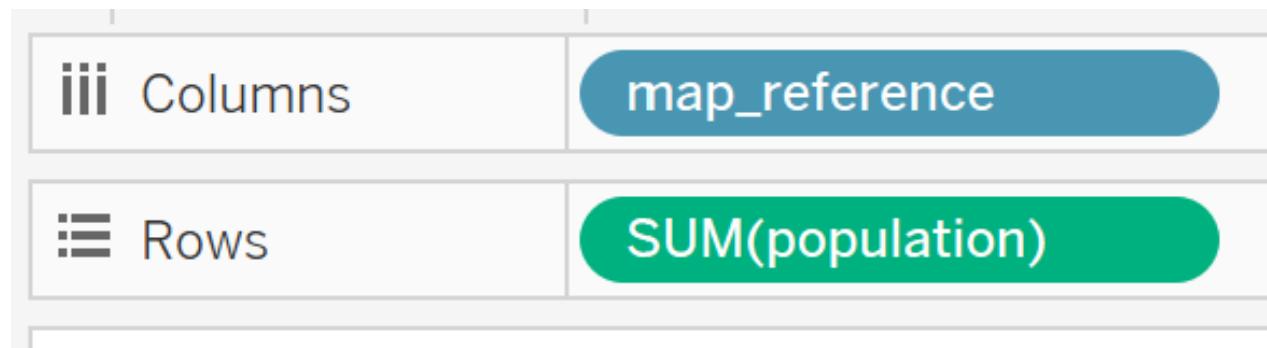
Sheet 1



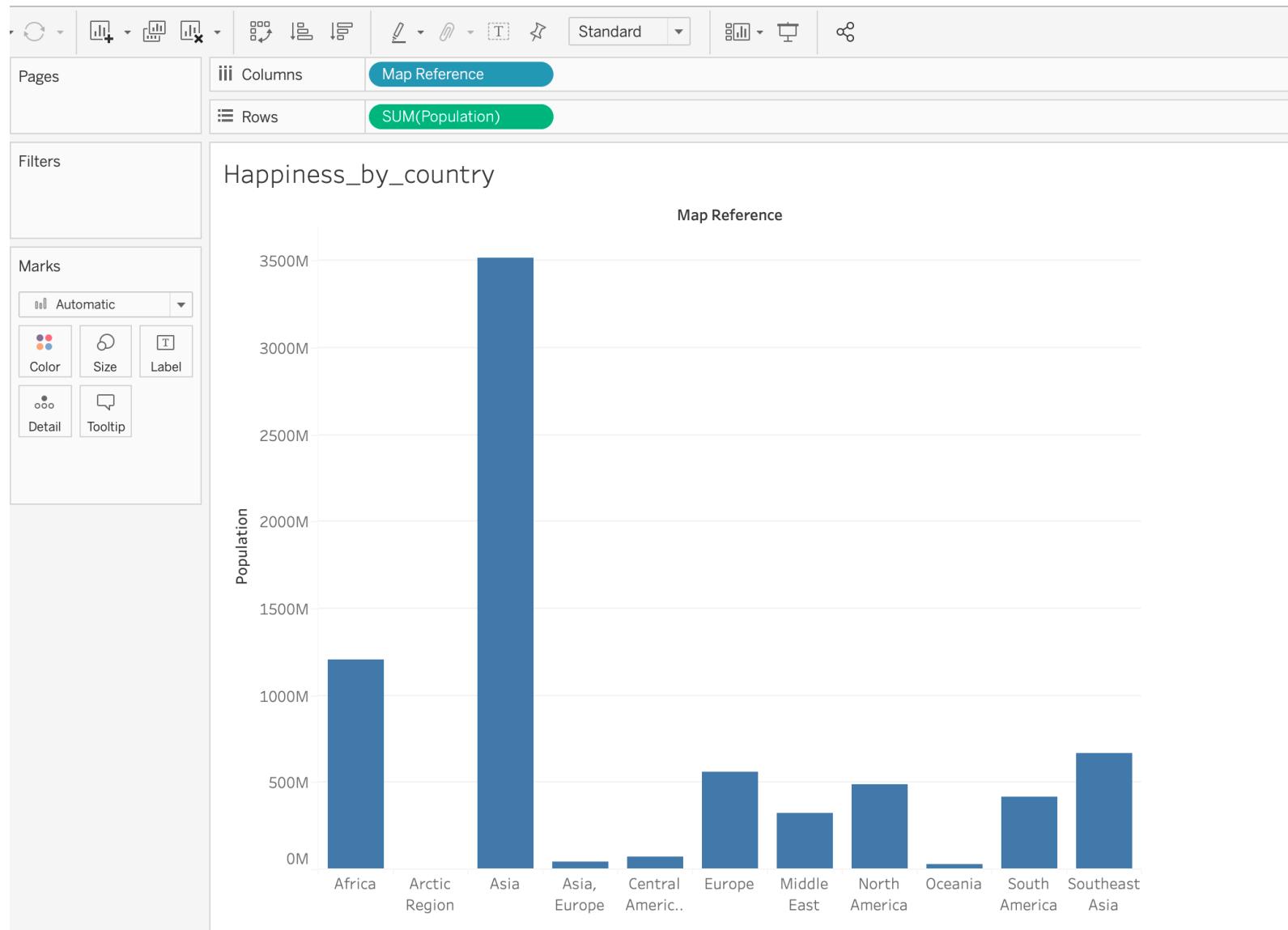
# Tableau Example



# Tableau Example



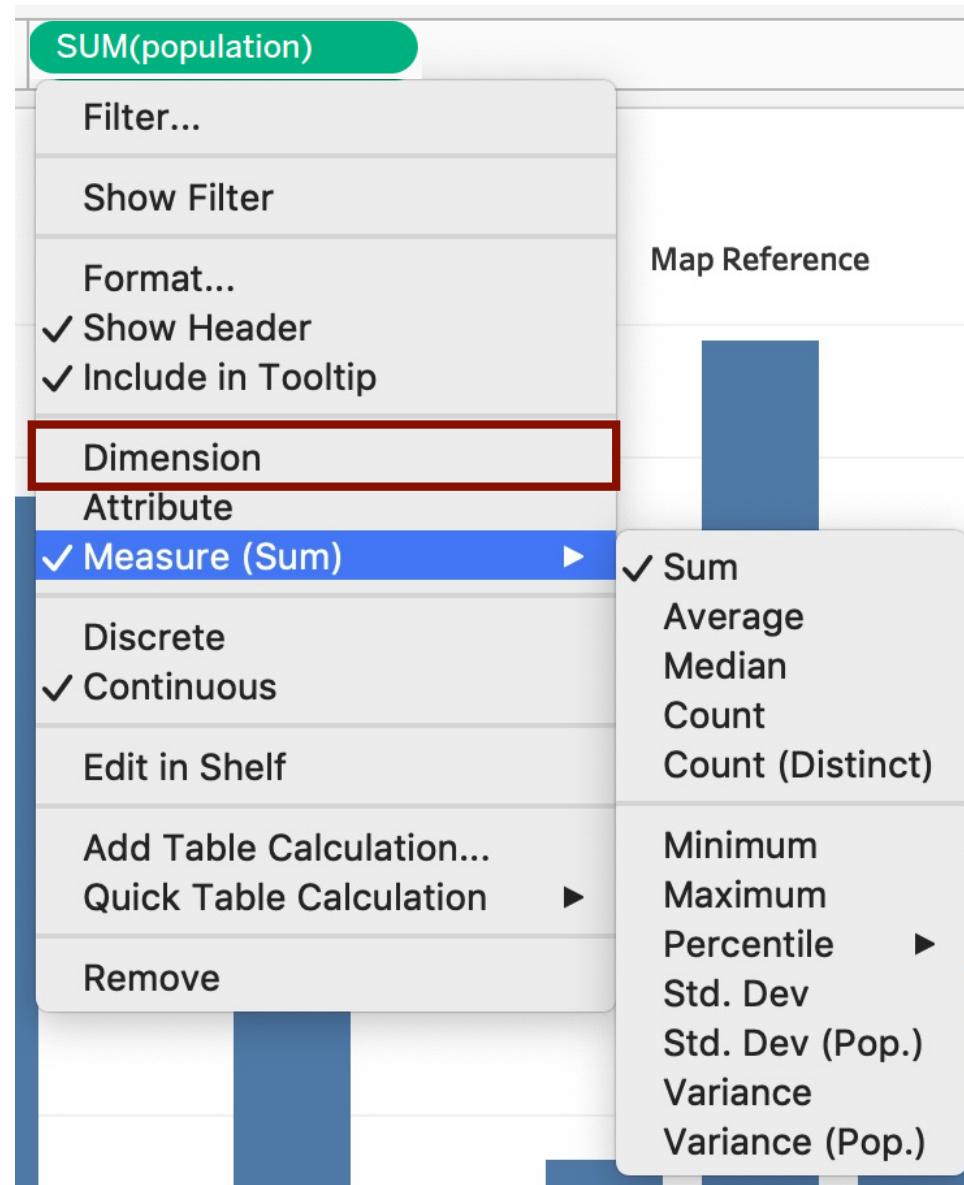
# Tableau Example



# Tableau Example

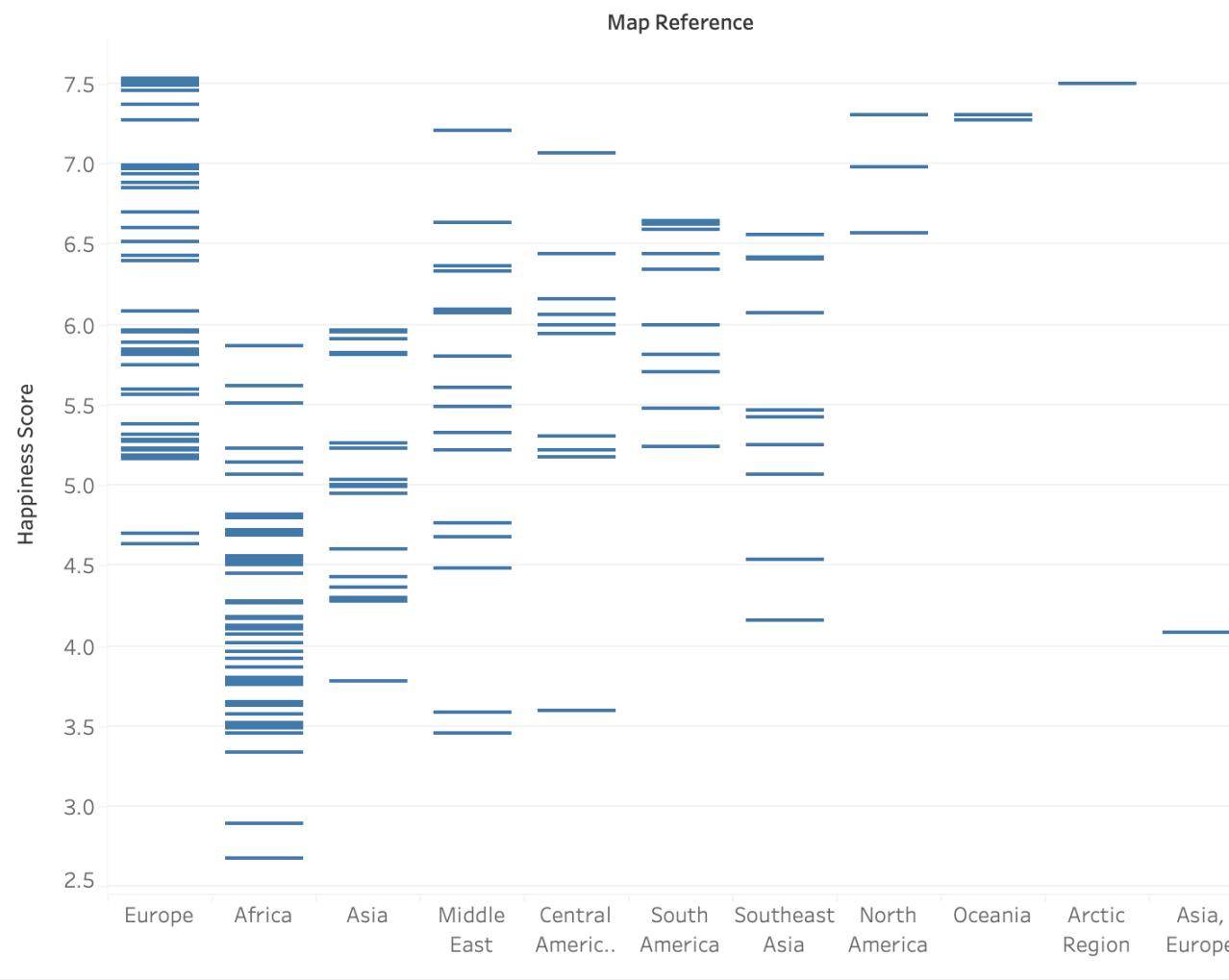
What happens when we set  
**Population** as a *Dimension*?

# Tableau Example



# Tableau Example

Each bar is one country

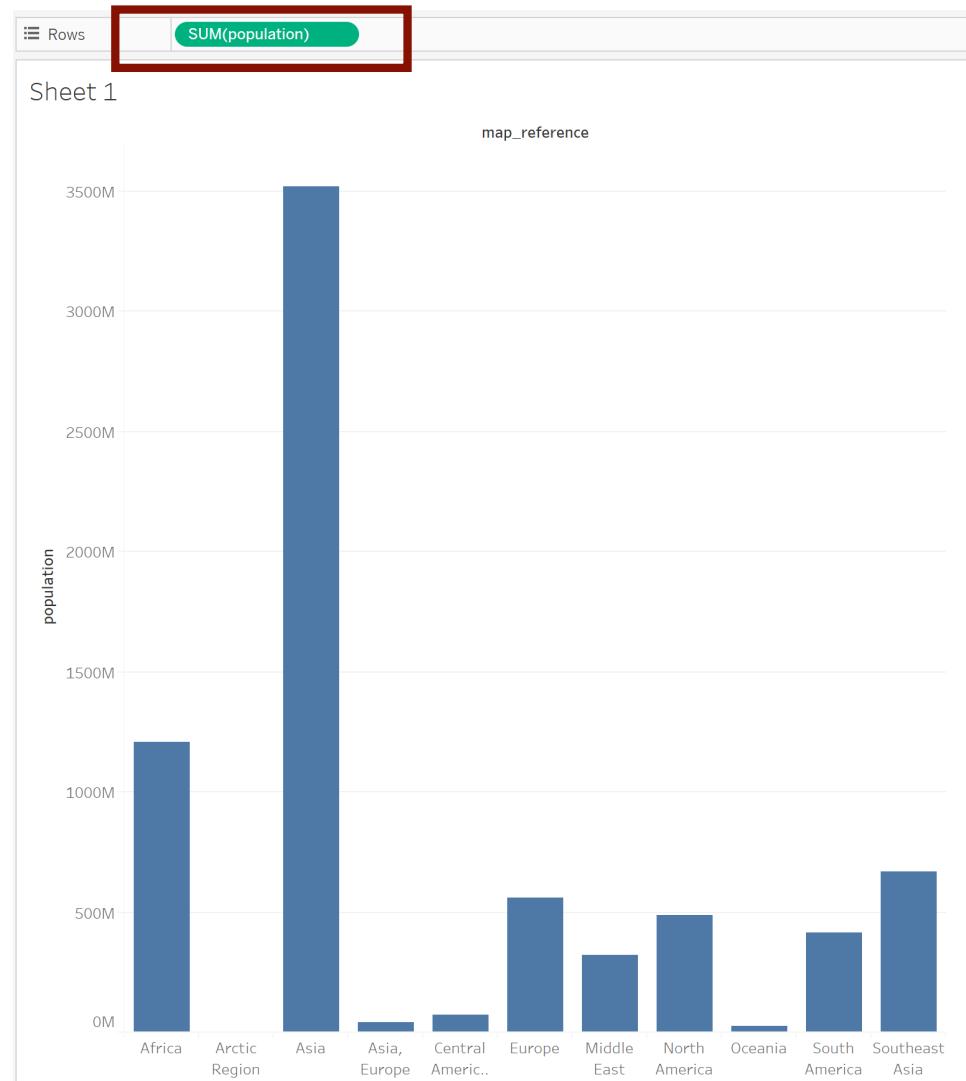


# Tableau Example

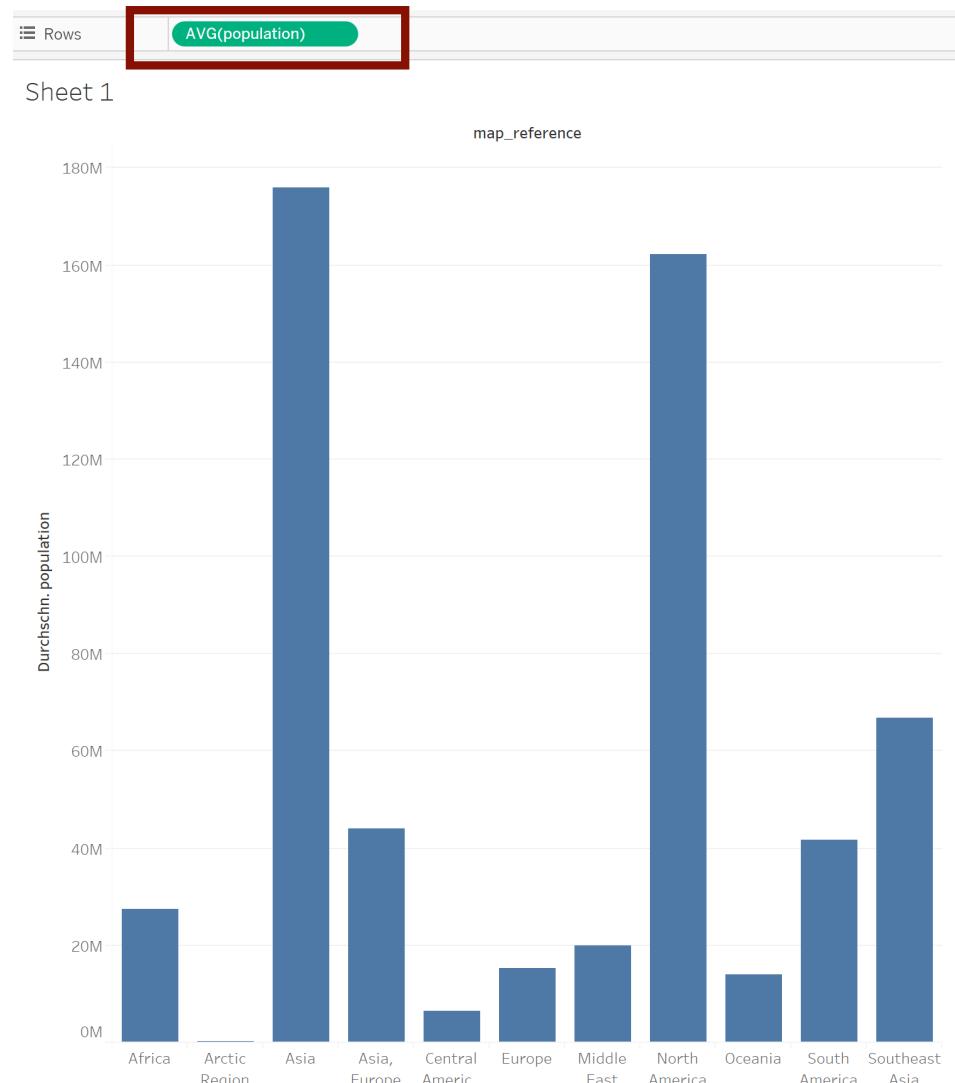
Now tell me:

- Which Continent has the highest **total** Population?
- Which one has the highest **average** (per country)?

# Tableau Example



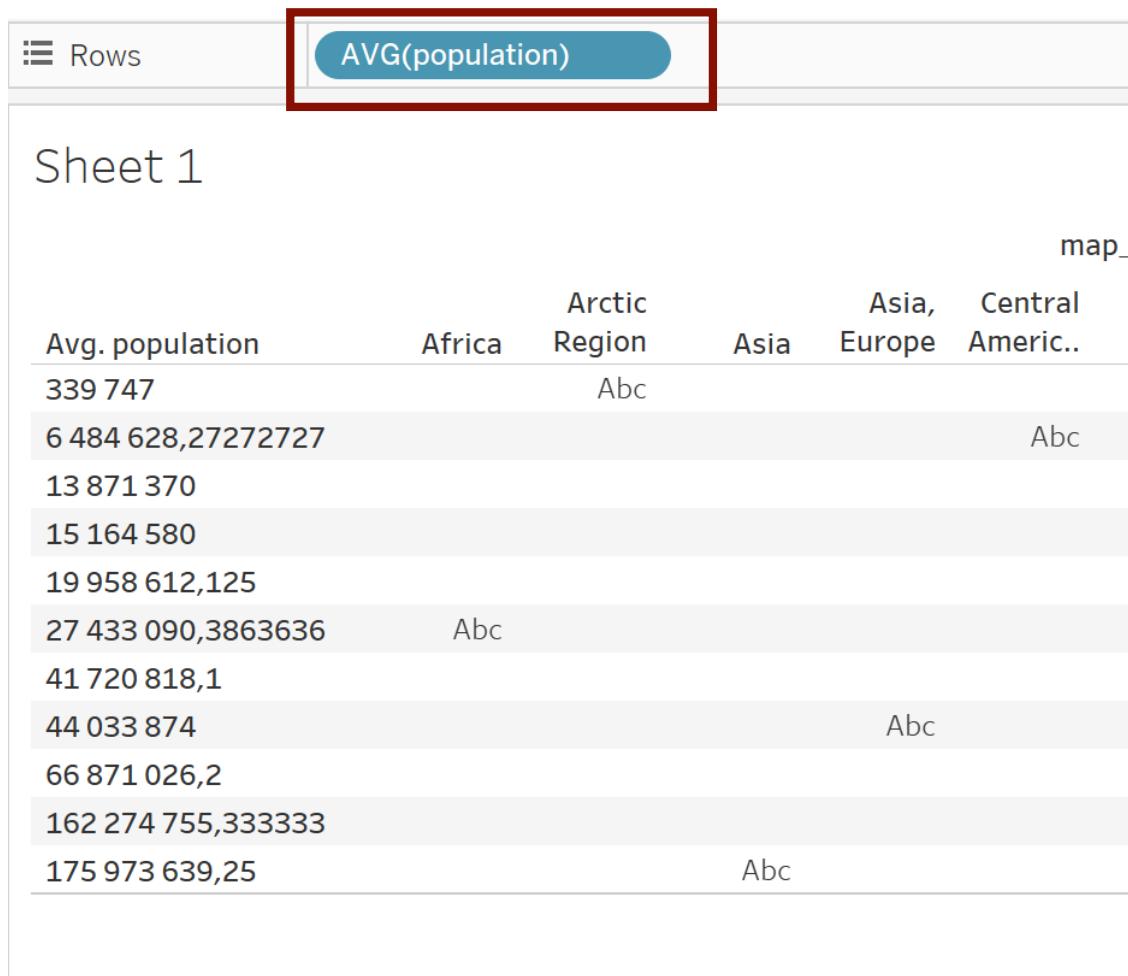
# Tableau Example



# Tableau Example

What happens when we convert  
the **Population** to *Discrete*?

# Tableau Example



- 11 values are shown
- One for each Continent

# Tableau Example

What happens when we convert **Population** to *Discrete* and to a *Dimension*?

# Tableau Example

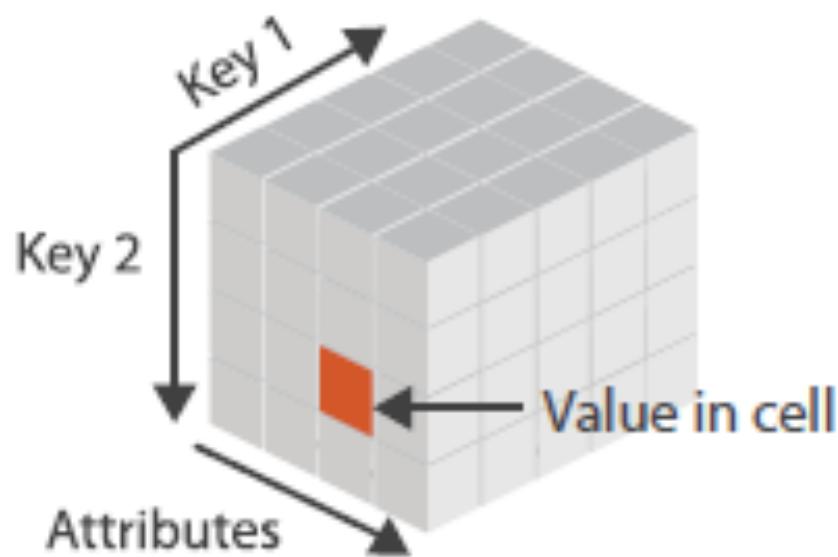
The values are shown at Country level

The screenshot shows a Tableau interface. At the top, there is a header bar with a 'Rows' button and a blue button labeled 'Cellular Subscriptions'. Below this is a title 'Sheet 2'. The main area contains a table with the following data:

Cellular Sub..	Africa	Arctic R..	Asia	Asia, Eu..
12		Abc		
22		Abc		
31				
35		Abc		
40		Abc		
42		Abc		
45		Abc		
46		Abc		
52		Abc		
59		Abc		
60		Abc		

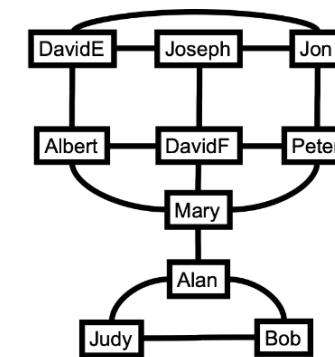
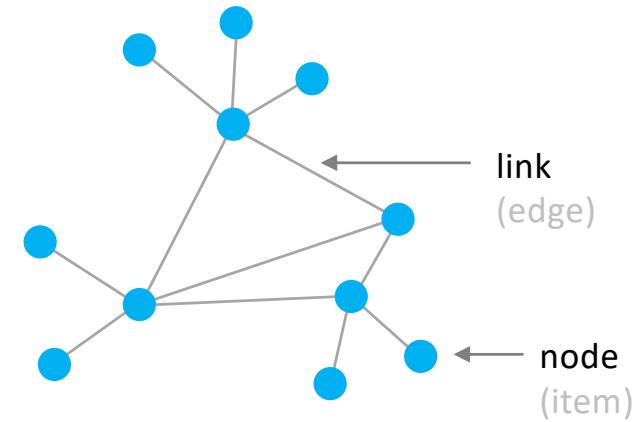
→ Lecture on Apr 23<sup>rd</sup> – Arrange  
Tables + Spatial Data

# Multi-dimensional tables



# Networks / Graphs

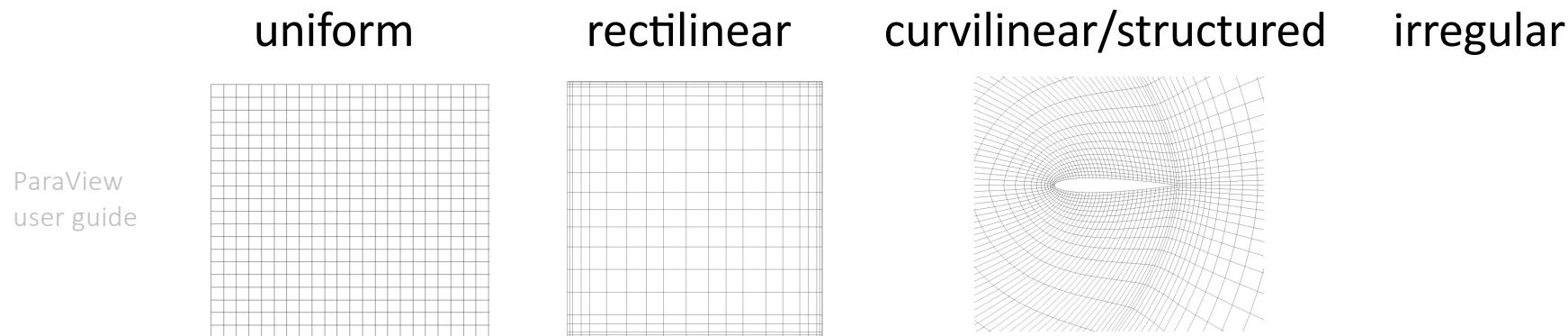
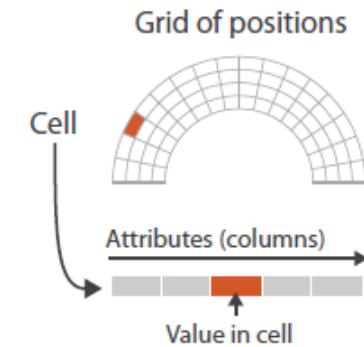
- Item = **node**
- **Link** between items = **edge**
- For example, social network:  
people + friendship ties
- Both links and nodes  
can have attributes
- Graphs can be represented by  
2 tables (node & edge list/table)
- **Trees** are strictly hierarchical graphs



→ Lecture on May 7th/14th – Arrange Networks/Trees

# Spatial data

- Continuous dataset
- Specified through grids (connectivity) where data is sampled:



- Geometry

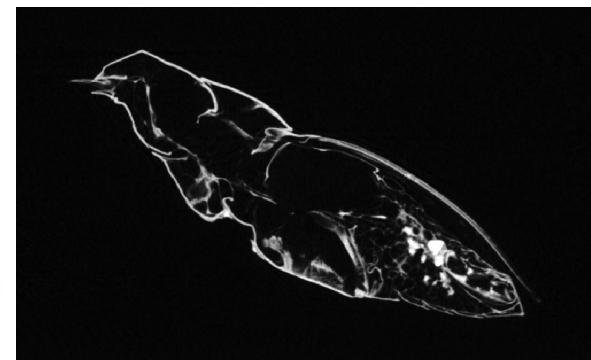
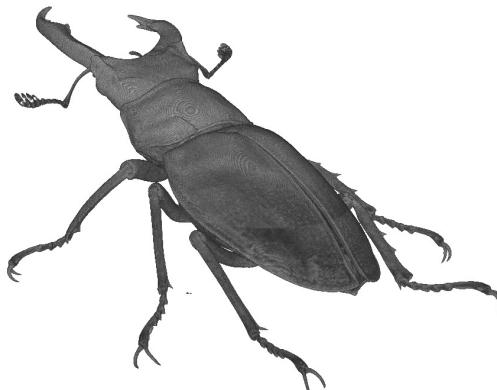
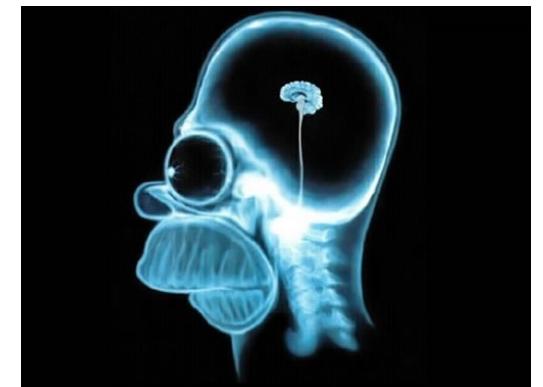


# Spatial dimensions

- 1D: refers to a single ‘length’ scale (e.g. height)
- 2D: geographical information
- 3D: medical / physics
- Time-varying:
  - 1D+time
  - 2D+time
  - 3D+time

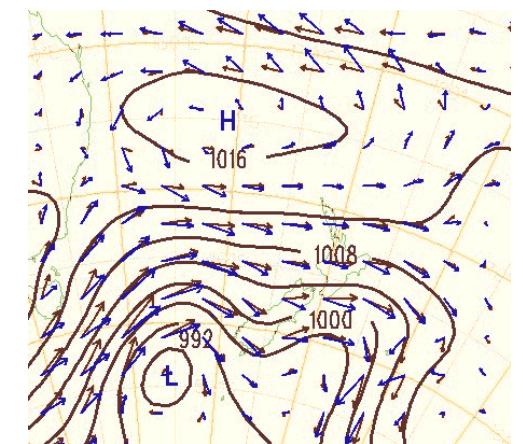
# Spatial values: Scalar data

- Mapping  $f: \mathbb{R}^n \rightarrow \mathbb{R}, (x_1, \dots, x_n) \rightarrow y$
- $n$  independent variables (keys)  $x_i$  (1D, 2D, or 3D, +time)
- Value  $y$  is just univariate
- Example:
  - 2D(/3D) grey-scale image data
  - MRI, CT,



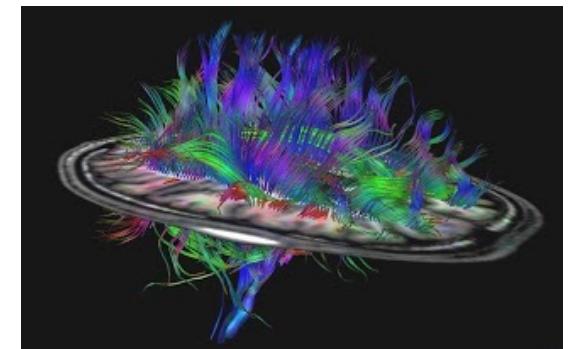
# Spatial values: Vector data

- Mapping  $f: \mathbb{R}^n \rightarrow \mathbb{R}^m, (x_1, \dots, x_n) \rightarrow (y_1, \dots, y_m)$
- Vector at each position represents direction and magnitude
- Usually,  $m=n$
- Exceptions, e.g., due to projection
- Example:
  - Weather map (wind direction + speed)
  - Flow around airplane wings



# Spatial values: Tensor data

- Mapping  $f: \mathbb{R}^n \rightarrow \mathbb{R}^m, (x_1, \dots, x_n) \rightarrow y_{i1, i2, \dots, ik}$
- Tensor of level  $k$ 
  - Tensor of level 1 is a vector
  - Tensor of level 2 is a matrix
  - ...
- Example:
  - Diffusion-tensor MRI
  - Stress-tensor (9 numbers representing forces acting in 3 orthogonal directions)



# Collections: Clusters, Sets, Lists

How we group items

- Sets

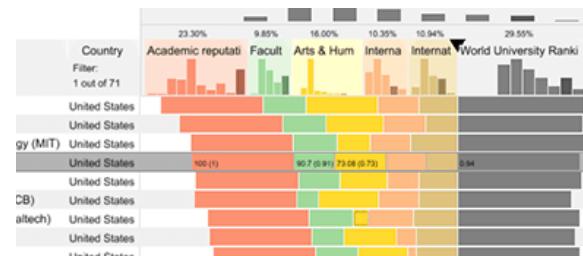
Unique items, unordered

- Lists

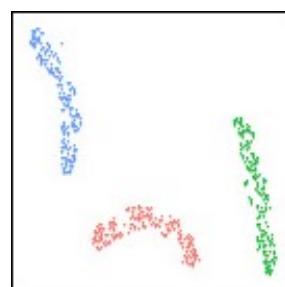
Ordered, duplicates possible

- Clusters

Groups of similar items



Gratzl et al., LineUp:  
Visual Analysis of  
Multi-Attribute  
Rankings, 2013



Abbas et al., ClustMe: A Visual  
Quality Measure for Ranking  
Monochrome Scatterplots based  
on Cluster Patterns, 2019

# Text + Logs

- Text document: ordered set of words
- Document collection
- „Bag of words“: unordered set of words
- Log files: designed for machine readability

→ Lecture on May 28<sup>th</sup> + 31<sup>st</sup> – TextVis

# Dataset Availability

- Standard: **static files**



- Challenge today: **dynamic streams**



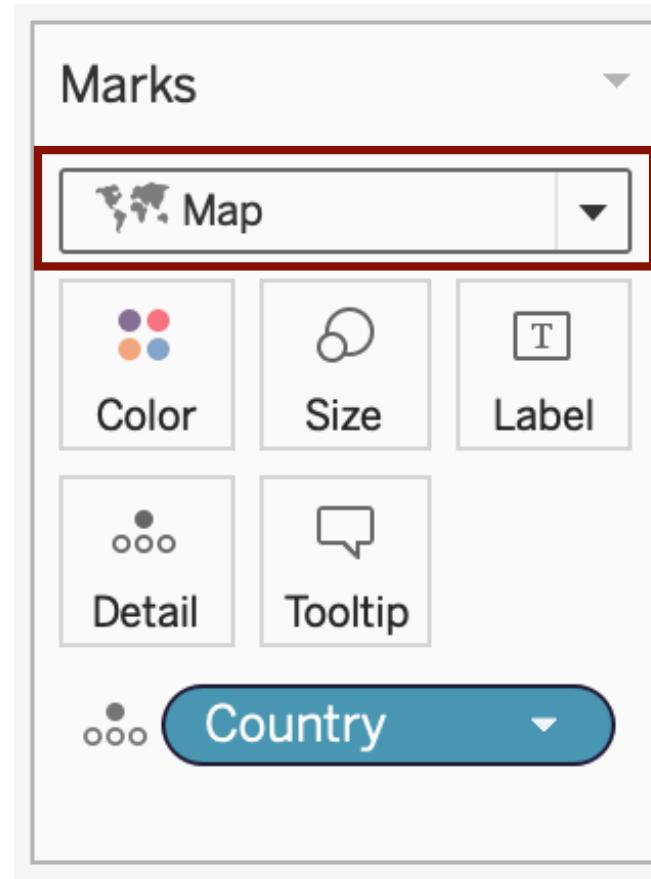
# Tableau Example

- Let's create a map as example for spatial semantics
- Drag and drop the Country dimension into the center of a new sheet

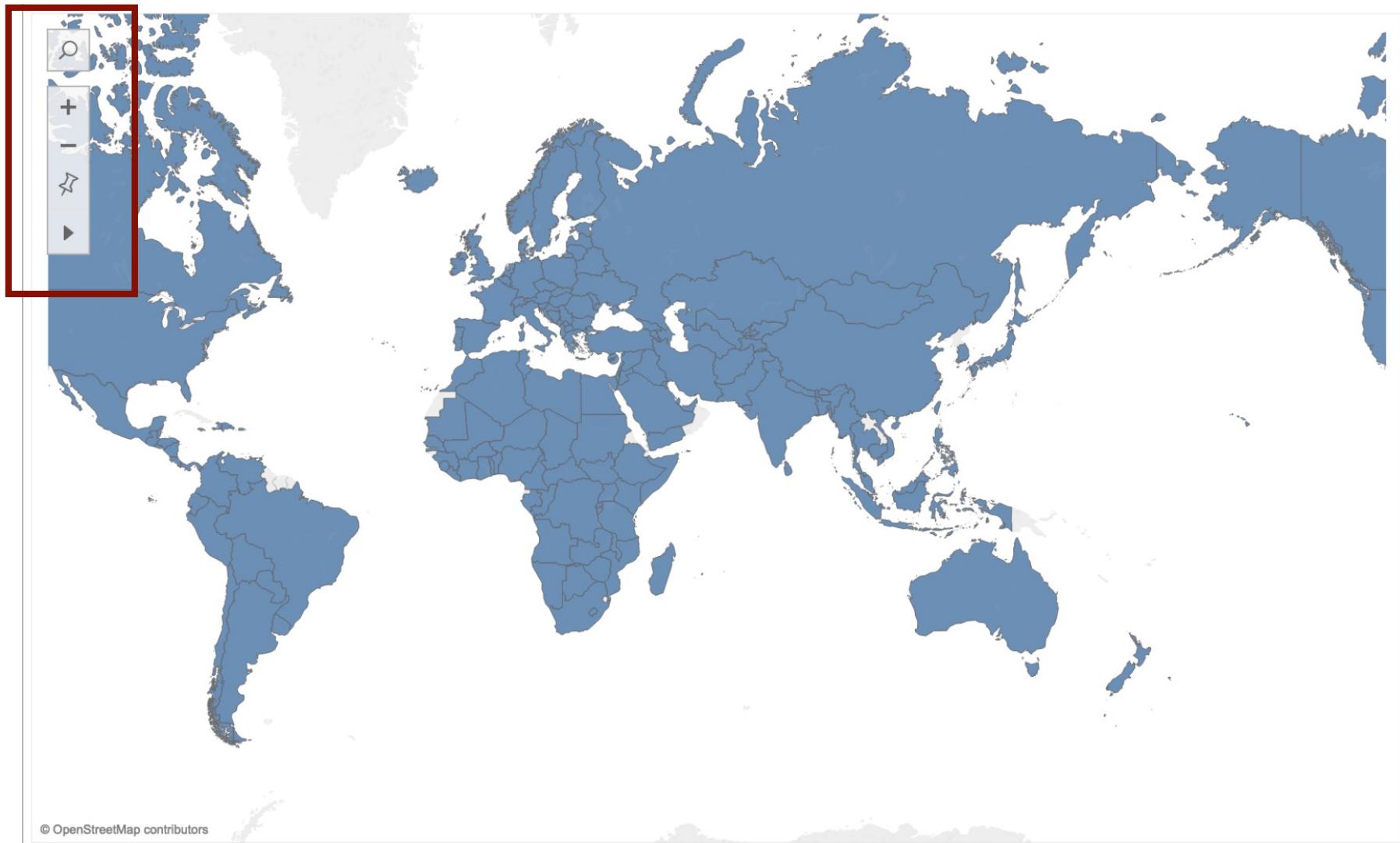
# Tableau Example



# Tableau Example

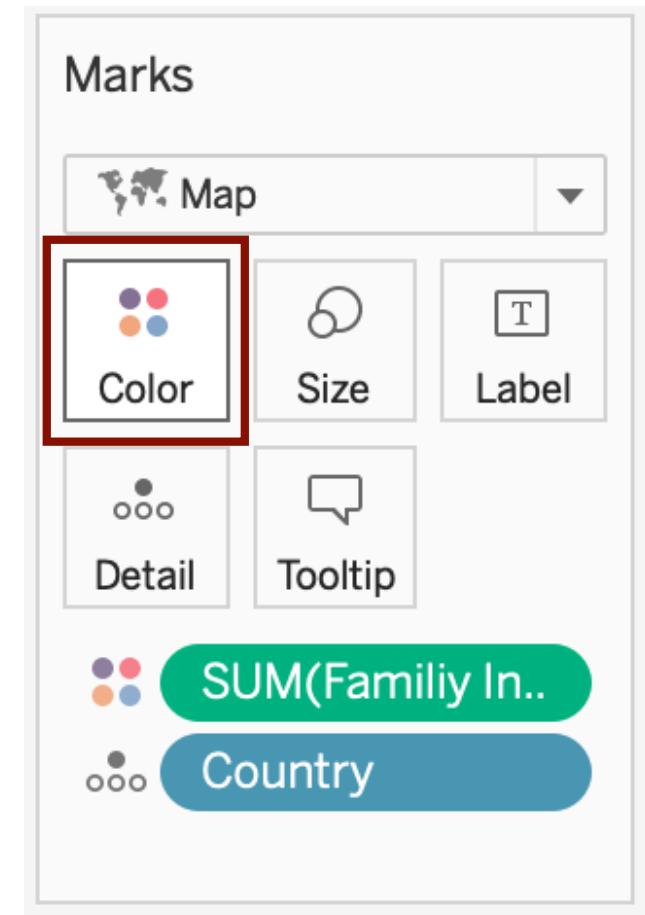


# Tableau Example

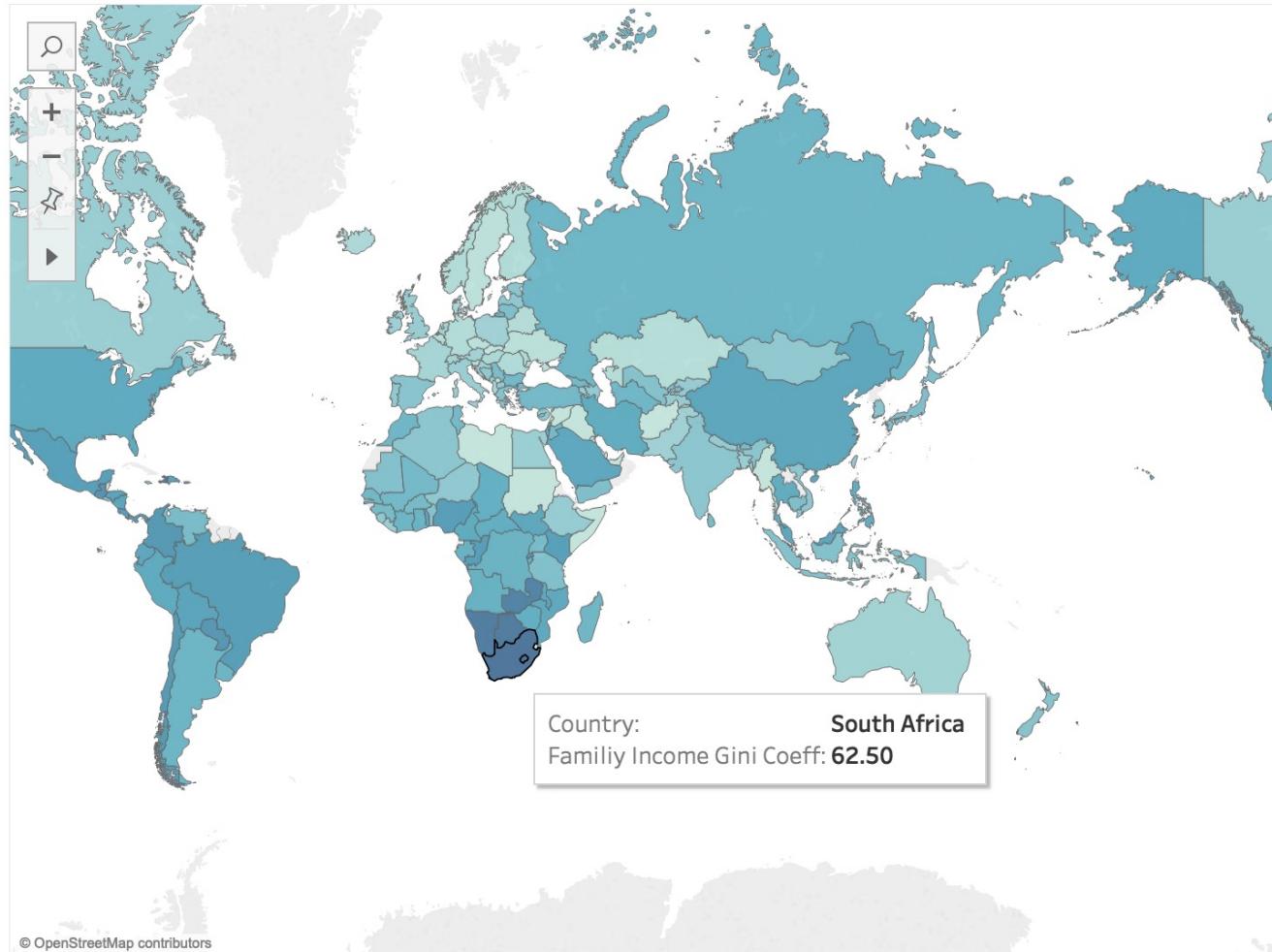


# Tableau Example

- We can use this map now to explore different aspects of the dataset
- Let us drag the **Family Income Gini Coeff** field onto *Color*



# Tableau Example



Semantics vs.  
Types

Data Types

Dataset Types  
Attribute Types  
Data Types  
Dataset Types  
Dataset Availability

Attribute & Data  
Semantics  
Data vs. Conceptual  
Model  
Spatial vs. Non-Spatial  
Key vs. Value  
(Non-)Temporal  
Continuous vs.  
Discrete  
Topology vs.  
Geometry

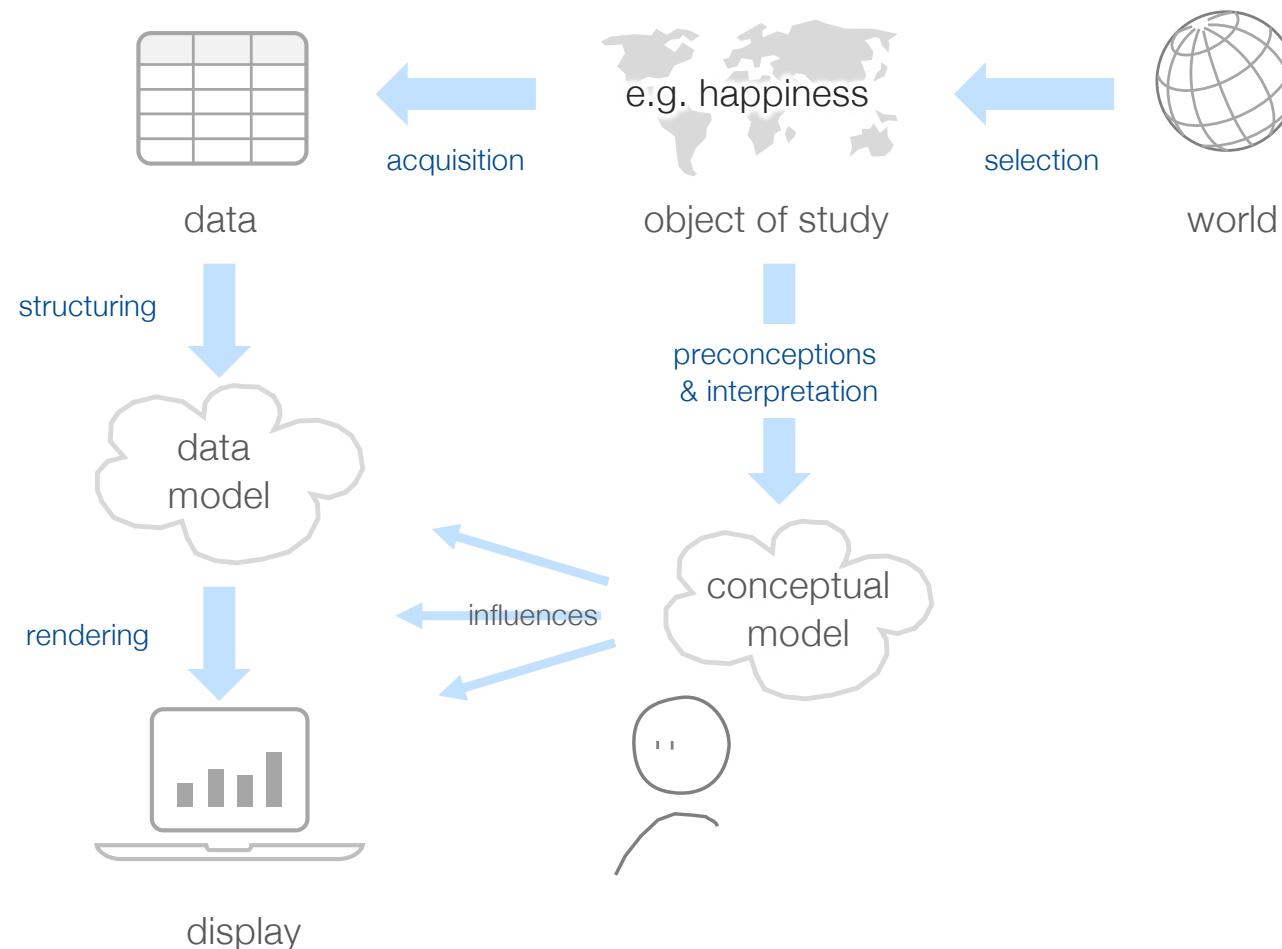
Derived Data

# Attribute + Dataset Semantics

# Attribute + Dataset Semantics

- Data vs. Concept
- Key vs. Value
  - High-dimensional, multi-dimensional, multi-variate
- Spatial vs. Non-spatial
- Temporal vs. Non-temporal
- Continuous vs. Discrete
- Topology vs. Geometry

# Data vs. Conceptual Models



# Data vs. Conceptual Models

- **Data Model:** Low-level description of the data
  - Set with operations, e.g., floats with +, -, /, \*
- **Conceptual Model:** Mental construction
  - Includes semantics, supports reasoning

Physical Type	Conceptual
1D floats	temperature
3D vector of floats	space

# Key vs. Value

**Key** = Index used to look up **value** attributes

- In “flat” table:
  - Implicit (row)
  - Explicit: contained within table as attribute
    - There must not be duplicates!
    - Keys may be categorical or ordinal (quantitative unsuitable)
- In multidimensional table:
  - Multiple keys required for item lookup
- In fields:
  - Spatial position acts as key
  - Characterized in terms of number of keys vs. values:
    - multi-variate structure depends on number of values
    - multi-dimensional structure depends on number of keys

# High-dimensional vs. multi-dimensional vs. multi-variate

- Multi-dimensional:  
Two to tens of dimensions
- High-dimensional:  
No constraint, can be thousands of dimensions and possibly more dimensions than samples
- Multi-variate:  
Multiple values per sample

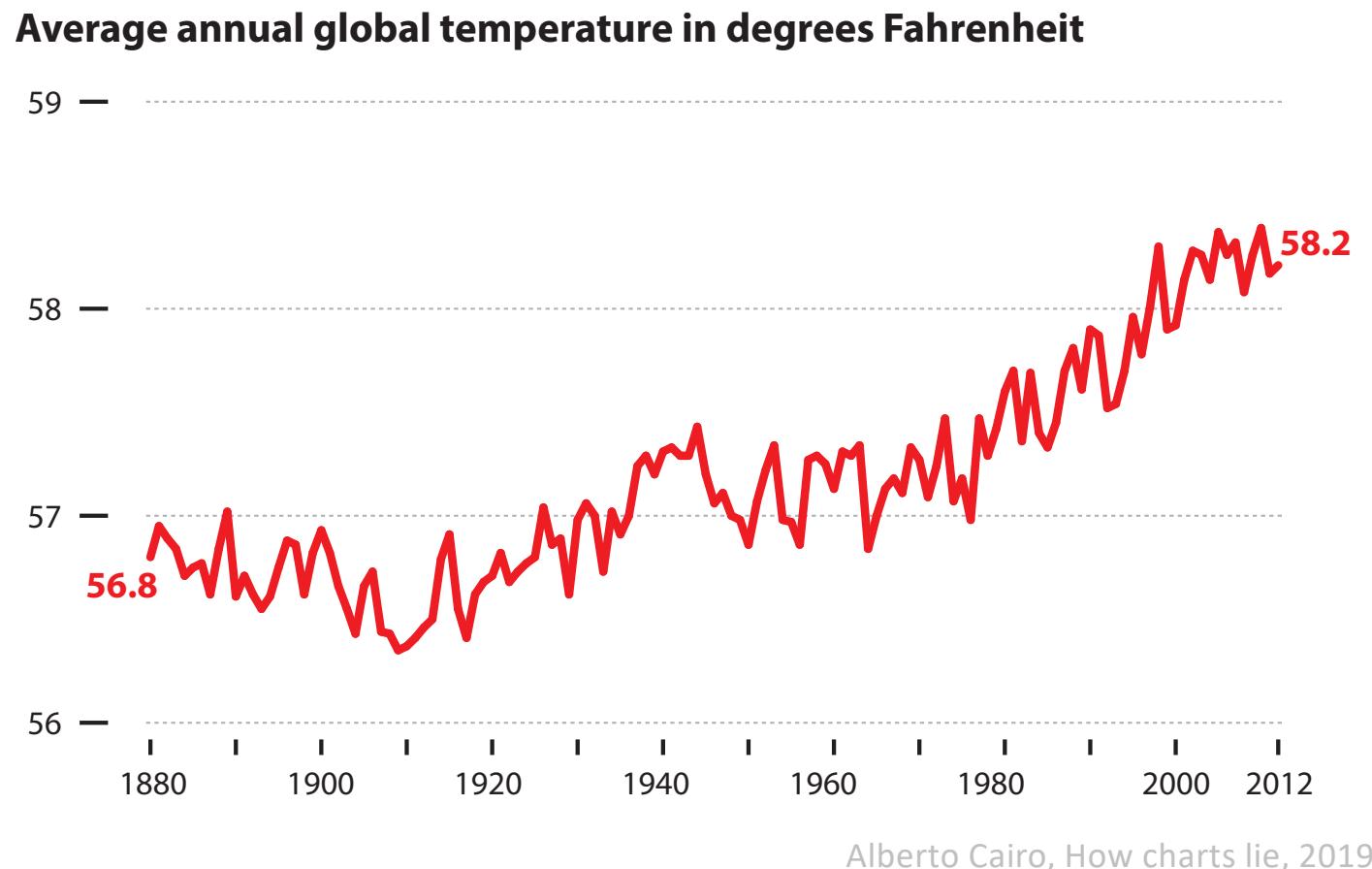
# Spatial vs. Non-spatial / Abstract

- Implications on visual encoding
- Spatial
  - Geographic information
  - Physical simulation
  - Medical data (MRI, CT scan etc.)
  - Strong constraints on visual layout
- Non-spatial / abstract
  - Network data
  - Financial transactions
  - Up to the visualization expert to choose a visual layout

# Temporal / Time-varying vs. Non-temporal / Static

- Time has a strong meaning to us as humans
- Special consideration for visual encoding
- Time is multi-scale and has a hierarchy  
(... minutes - hours - days - weeks ...)
- Time periods/cycles very important
- Can have either value or key semantics
- Time series dataset
  - Special case of table where time is key
  - Time-value pairs often at uniform temporal intervals
  - Typical tasks: Find trends, correlations and variations at multiple time scales

# Time Series: Example



# Continuous vs. discrete

- Data is almost always discrete – we need to store it in discrete memory cells
- It's really how we think about the data
- Categorical is always discrete
- Quantitative is continuous
- Care must be taken when making discrete measurements continuous

# Continuous vs. discrete: Example

- From data model...
  - 32.5, 54.0, -17.3, ... (floats)
- Using conceptual model...
  - Temperature
- To data type
  - Continuous to 4 significant digits (Q)
  - Hot, warm, cold (O)
  - Burned vs. Not burned (N)

# Topology vs. Geometry

- **Topology**  
specifies the structure (**connectivity**) of the data
- **Geometry**  
specifies the **position** of the data

# Topology vs. Geometry

- In **topology**, qualitative questions about geometrical structures are the main concern
  - Does it have any holes in it?
  - Is it all connected together?
  - Can it be separated into parts?
- Underground maps do not show how far one station is from the other, but rather how they are connected (=topological map)



Semantics vs.  
Types

Data Types

Dataset Types  
Attribute Types  
Data Types  
Dataset Types  
Dataset Availability

Attribute & Data  
Semantics  
Data vs. Conceptual  
Model  
Spatial vs. Non-Spatial  
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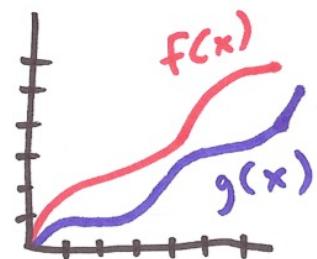
Derived Data

# Derived Data

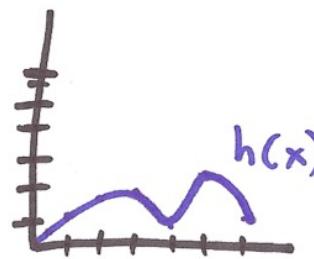
# Derived Attributes

- The norm, not the exception
- Necessary for some of the tasks
- Simple transformations
- Statistical summaries of (lots of) data

→ Lecture on June 11<sup>th</sup> –  
Reduce Items & Attributes



original data

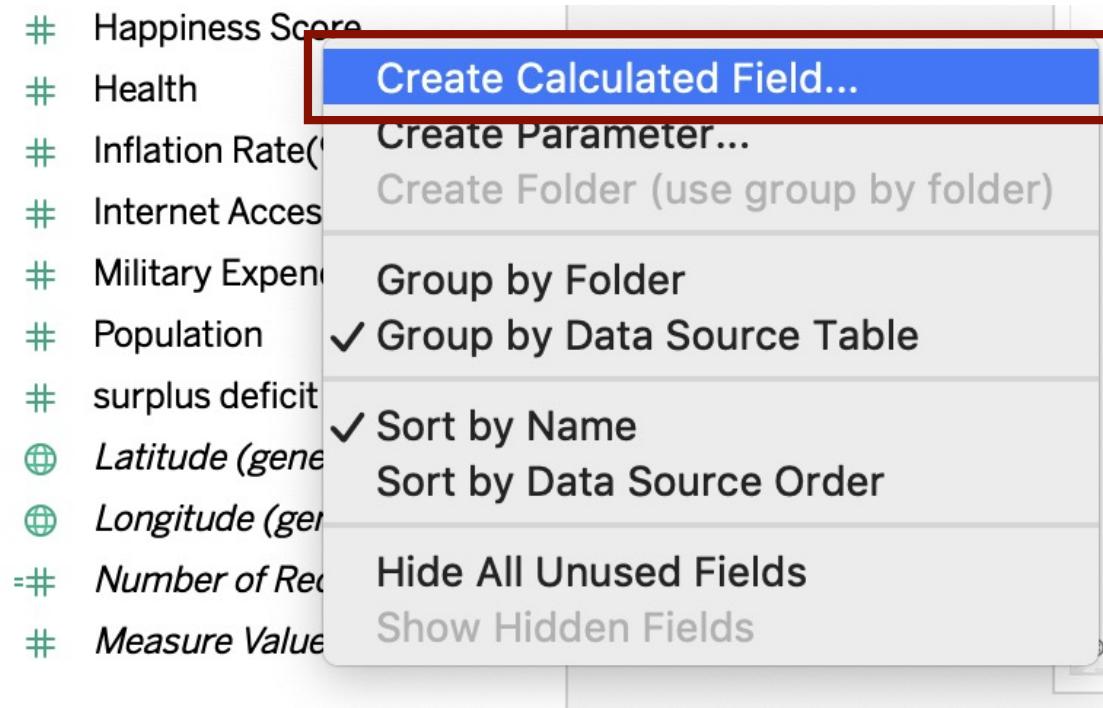


$h(x) = f(x) - g(x)$   
derived data

# Tableau Example

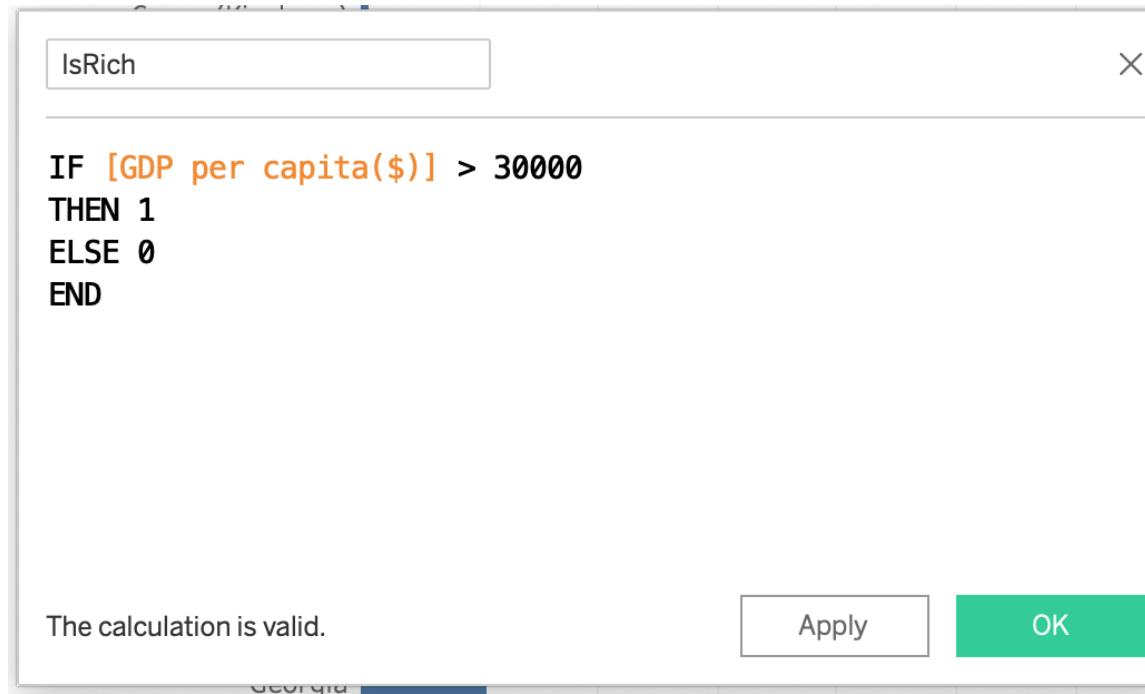
An easy way to create your own derived attributes are Calculated Fields in Tableau

# Tableau Example



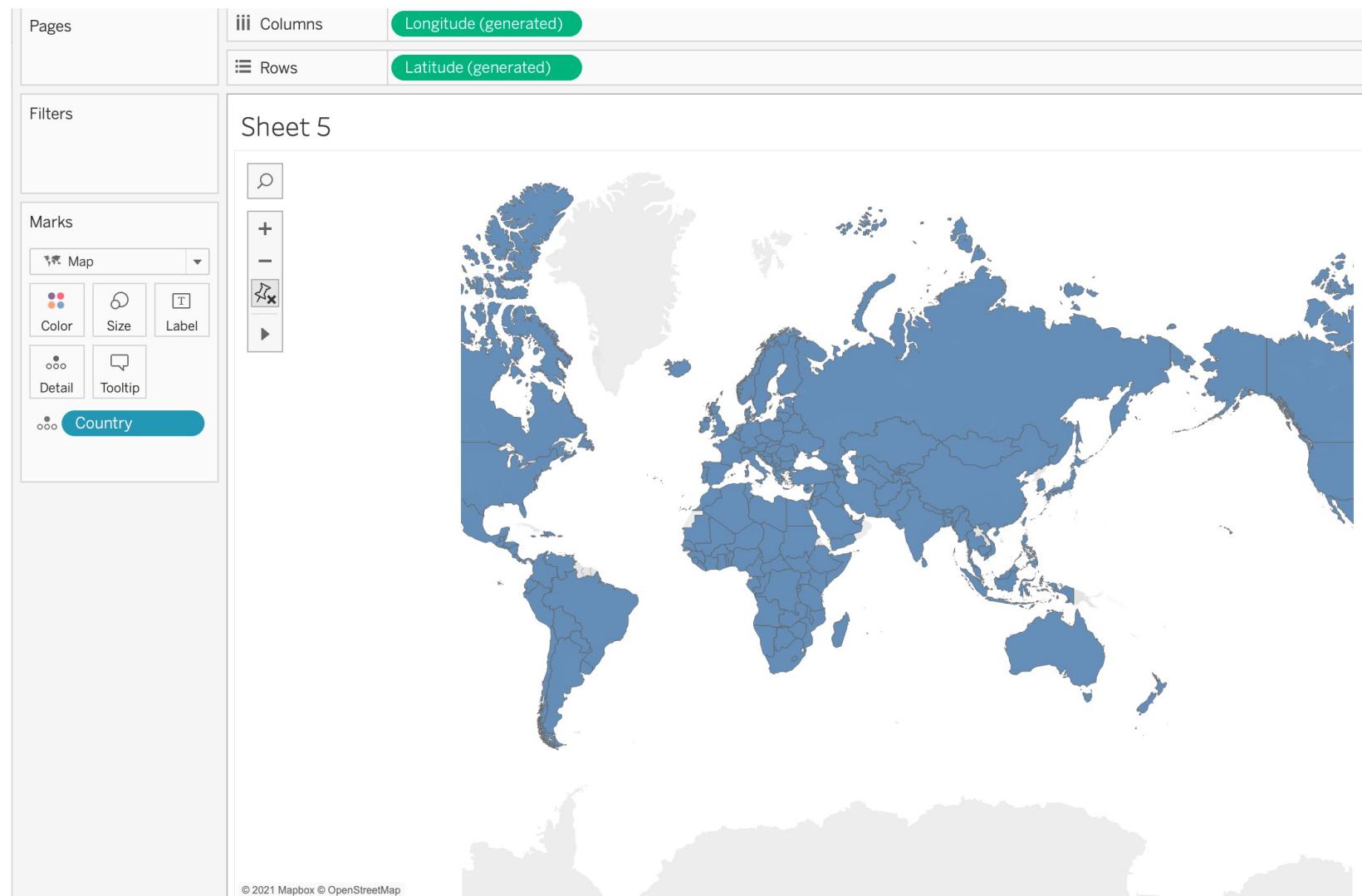
Right-Click somewhere in the white space below the *Measures* and create a Calculated Field

# Tableau Example

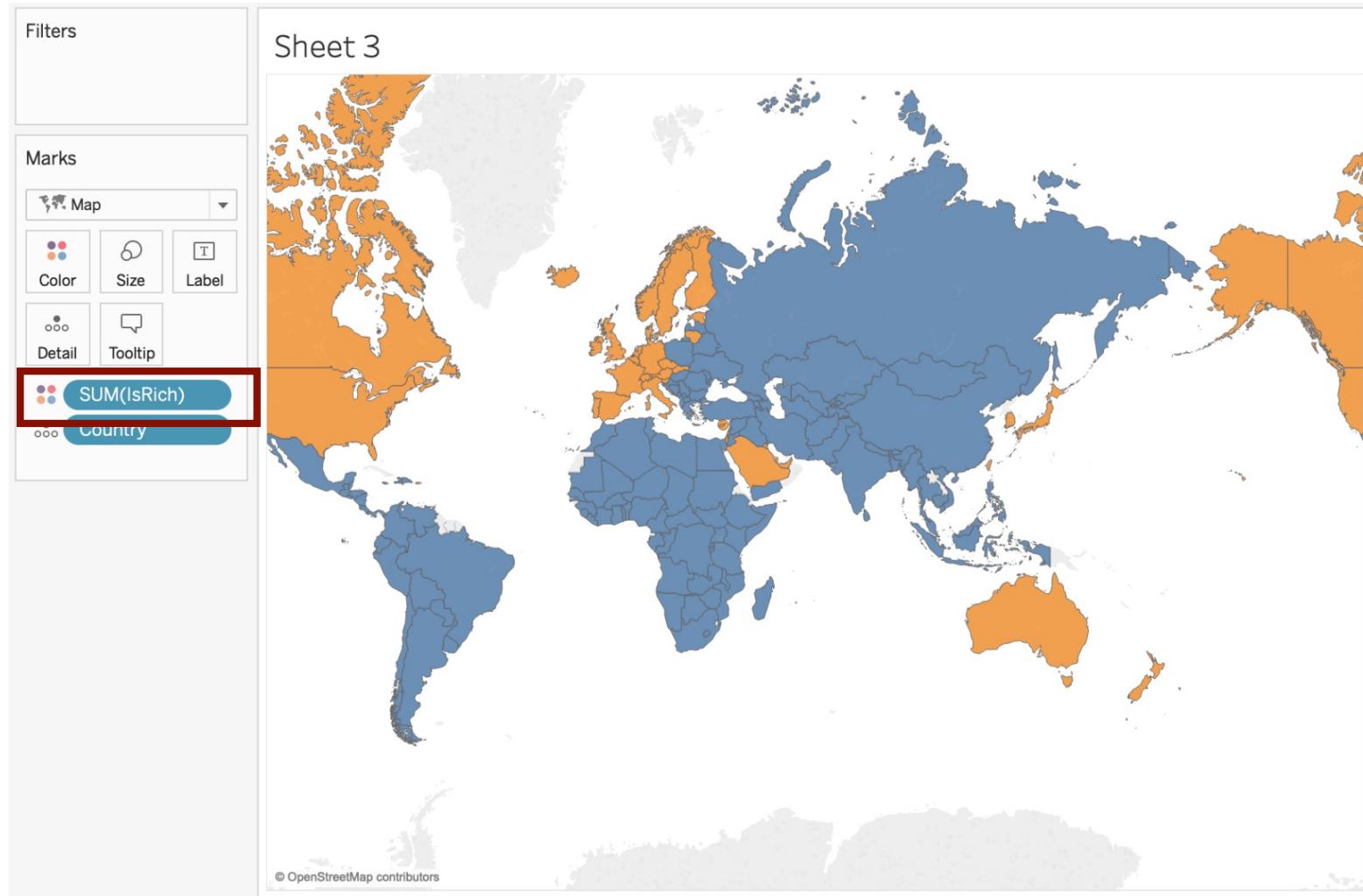


Lets drag that new Measure **IsRich**  
onto *Color* in the Map Sheet

# Tableau Example



# Tableau Example



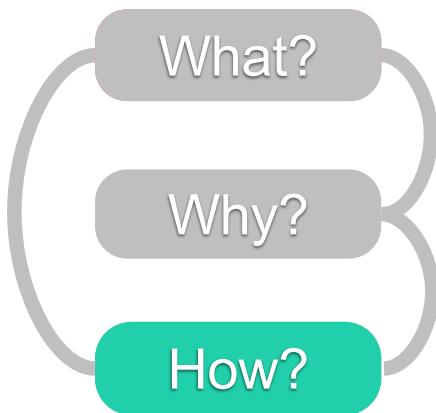
# Summary

Data abstraction helps in thinking which visualization to choose / how tasks can be solved!

- Semantics vs. Data(set) types
- Attribute Types
- Data Types
- Dataset Types
- Attribute and Dataset Semantics



# Outlook



What data is shown?

Why is the task being performed?

How is the visualization constructed?