

# Data Visualization (CSCI 490/680)

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## Multiple Views & Filtering

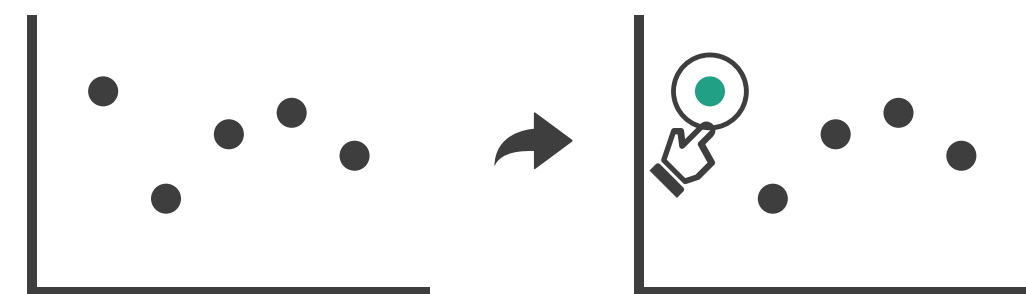
Dr. David Koop

# Interaction Overview

## ➔ Change over Time



## ➔ Select

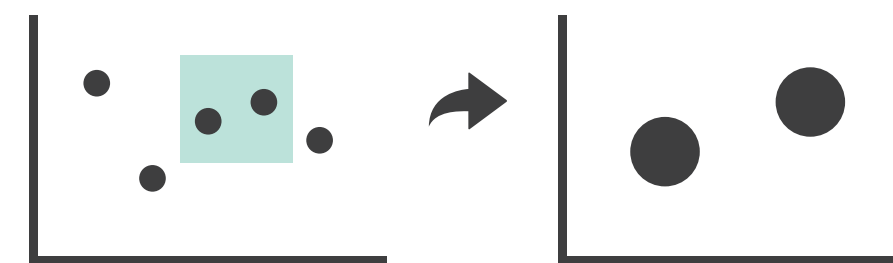


## ➔ Navigate

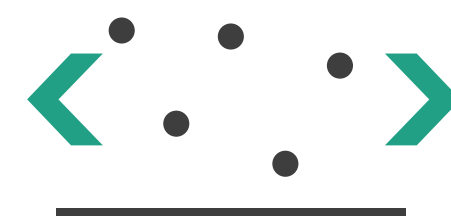
### ➔ Item Reduction

#### ➔ Zoom

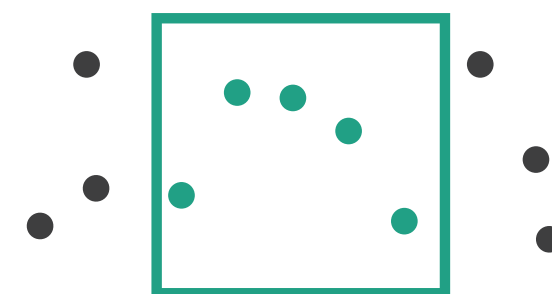
*Geometric* or *Semantic*



#### ➔ Pan/Translate

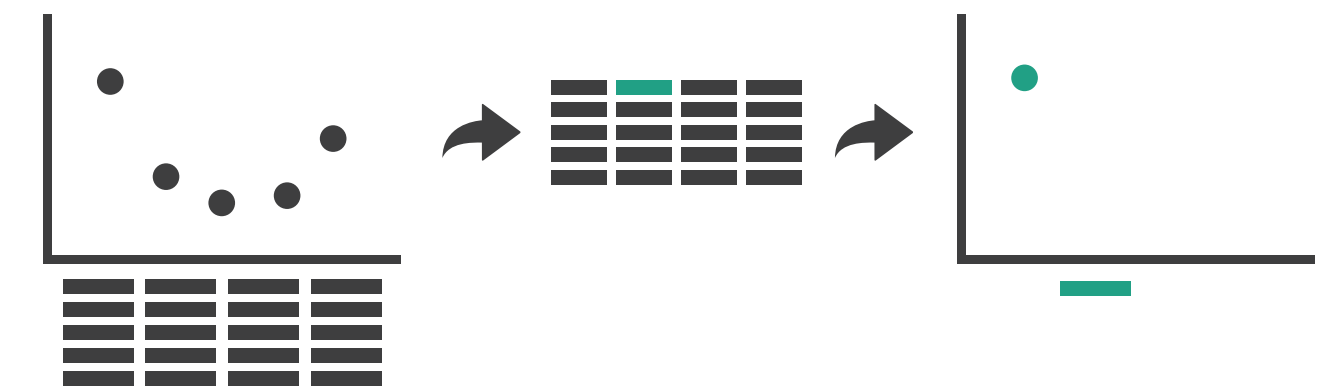


#### ➔ Constrained

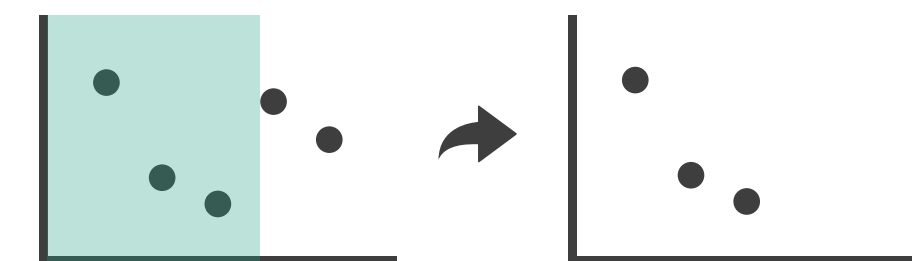


### ➔ Attribute Reduction

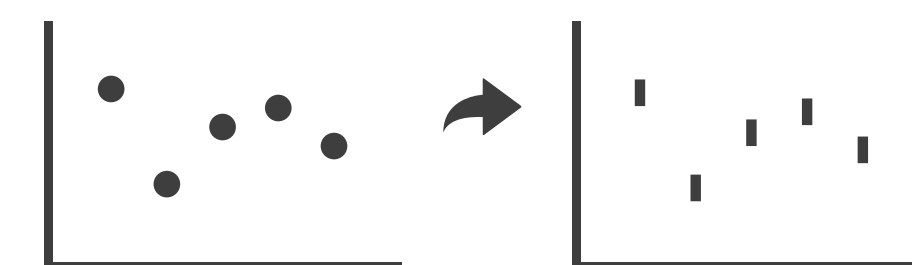
#### ➔ Slice



#### ➔ Cut

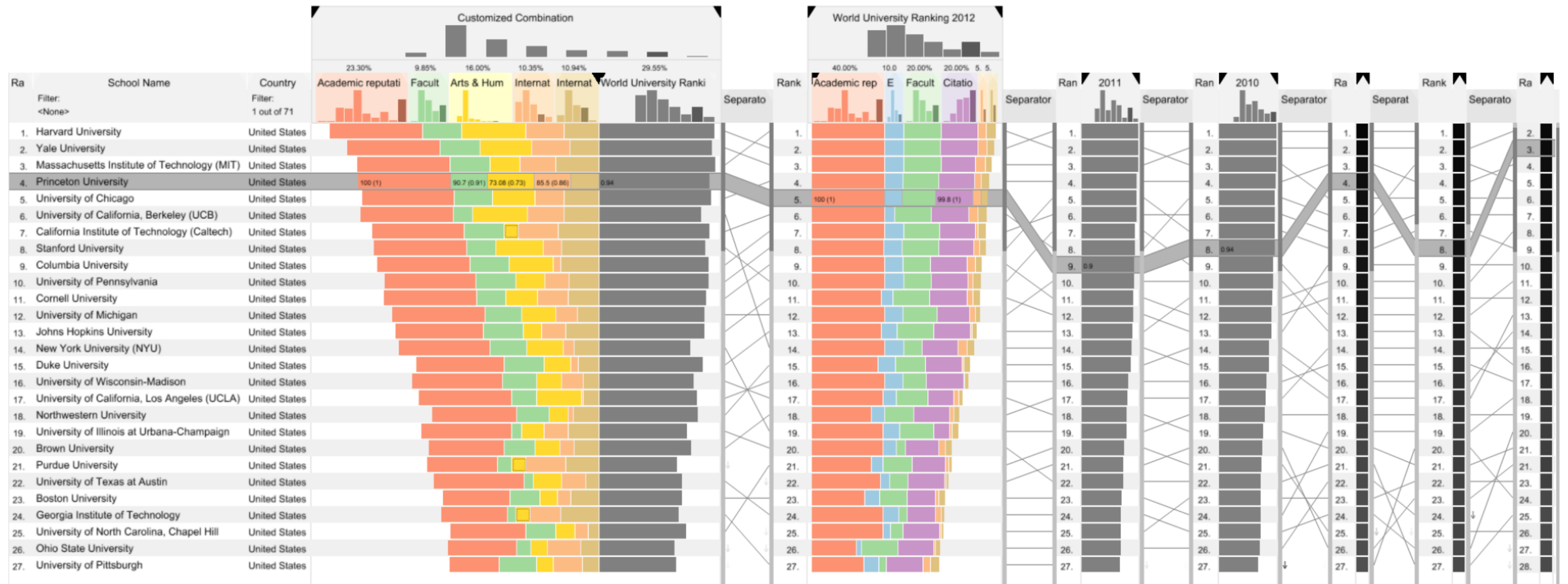


#### ➔ Project



[Munzner (ill. Maguire), 2014]

# Sorting & Slope Graphs: LineUp



[Gratzl et al., 2013]



# Animation: Jump Cut vs. Animated Transitions

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# Animation: Jump Cut vs. Animated Transitions

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# Animation: Jump Cut vs. Animated Transitions

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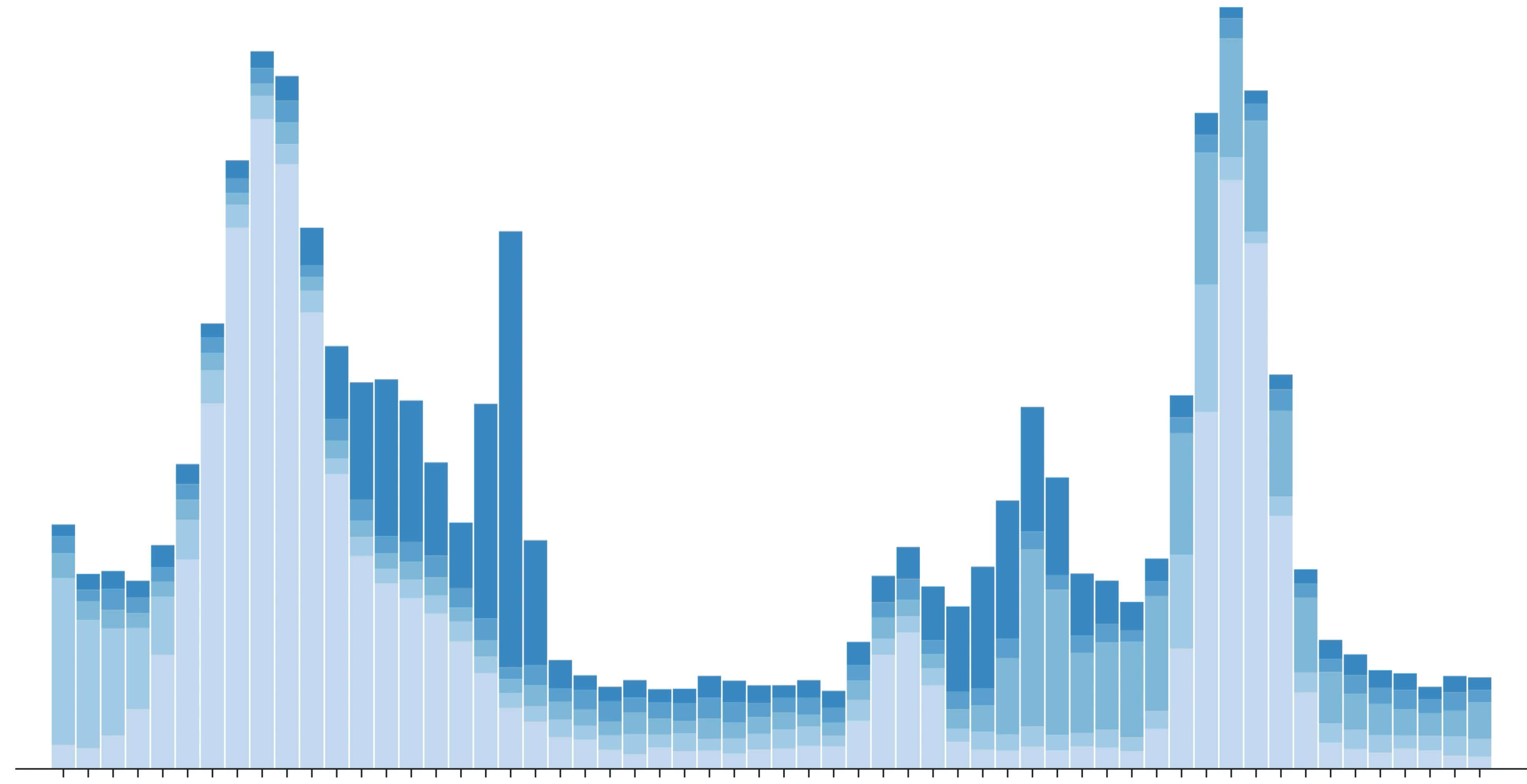
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# Animated Transitions

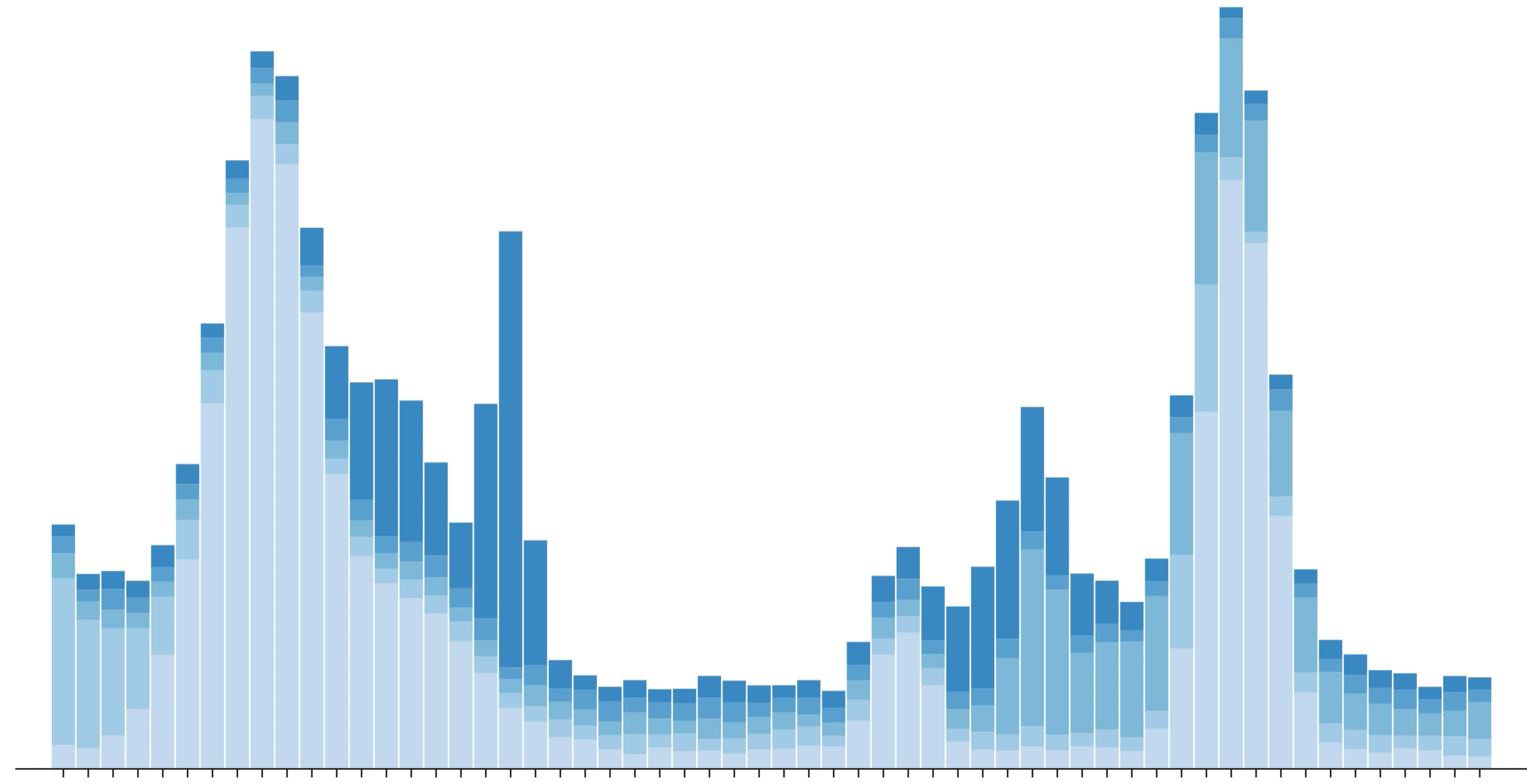
☐ Stacked ☒ Grouped



[M. Bostock]

# Animated Transitions

☐ Stacked ☒ Grouped

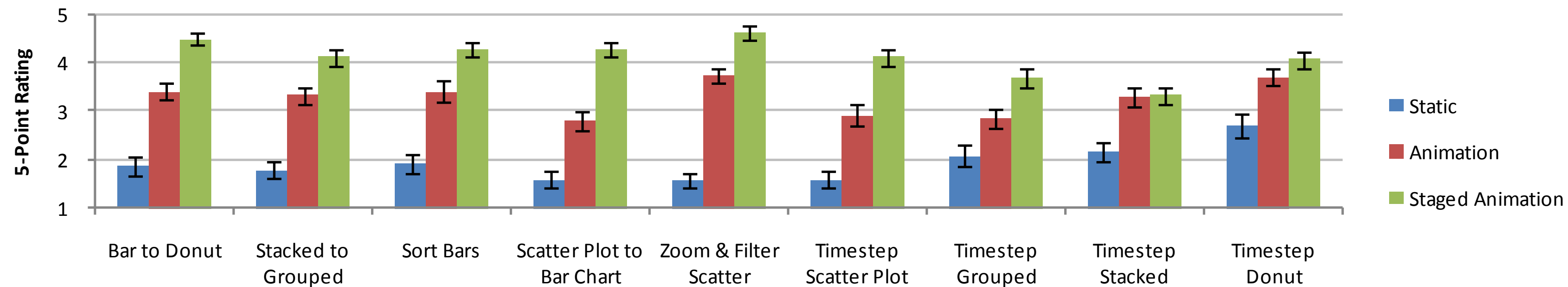


[M. Bostock]



# Heer and Robertson Study

- User Preferences: Staged animation > animation > static transitions



- Animation improves graphical perception
- Staging is better (do axis rescaling before value changes)
- Avoid axis rescaling when possible

[Heer and Robertson, 2007]

# Selection

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- Selection is often used to initiate other changes
- User needs to select something to drive the next change
- What can be a selection target?
  - Items, links, attributes, (views)
- How?
  - mouse click, mouse hover, touch
  - keyboard modifiers, right/left mouse click, force
- Selection modes:
  - Single, multiple
  - Contiguous?

# Highlighting

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- Selection is the user action
- Feedback is important!
- How? Change selected item's visual encoding
  - Change color: want to achieve visual popout
  - Add outline mark: allows original color to be preserved
  - Change size (line width)
  - Add motion: marching ants





# Highlighting

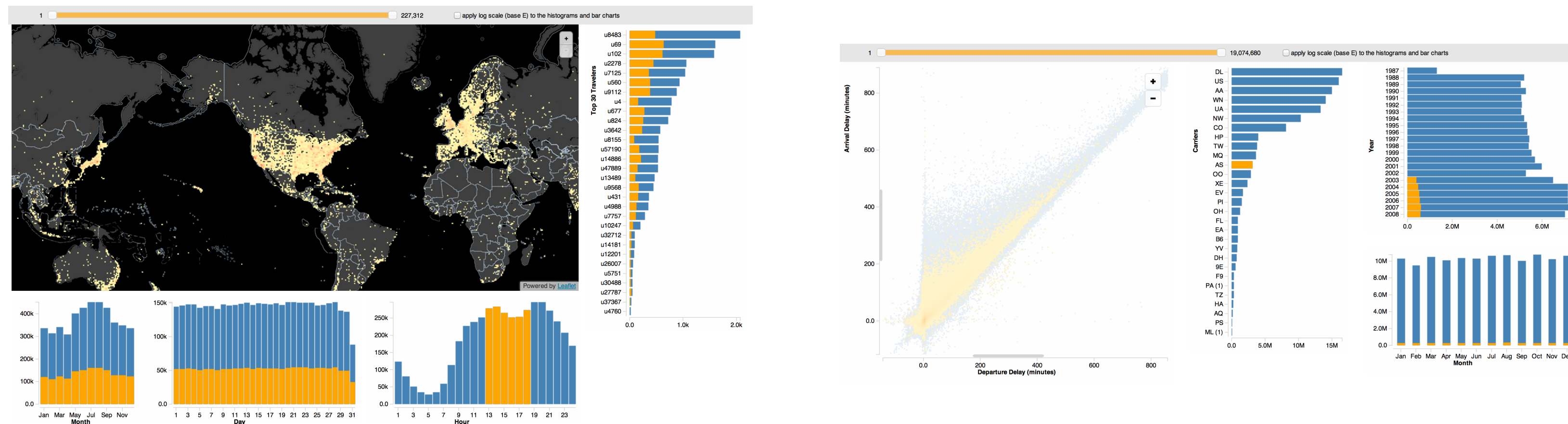
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# Interaction Latency

- The Effects of Interactive Latency on Exploratory Visual Analysis, Z. Liu and J. Heer, 2014
- Brush & link, select, pan, zoom



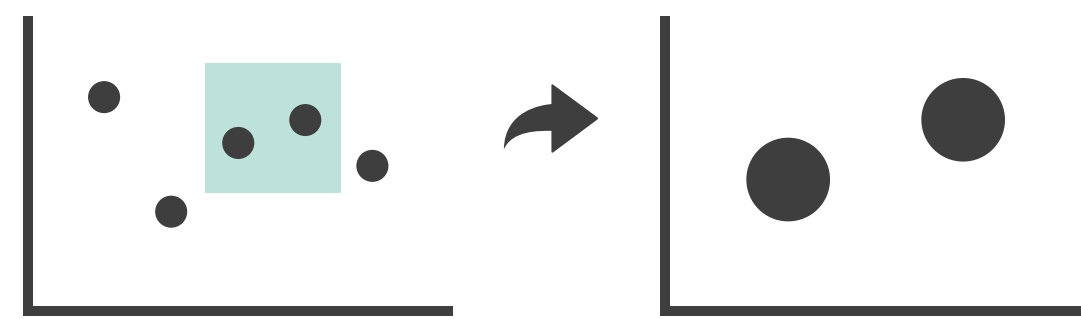
- 500ms added latency causes significant cost
  - decreases user activity and dataset coverage
  - reduces rate of observations, generalizations, and hypotheses

# Navigation

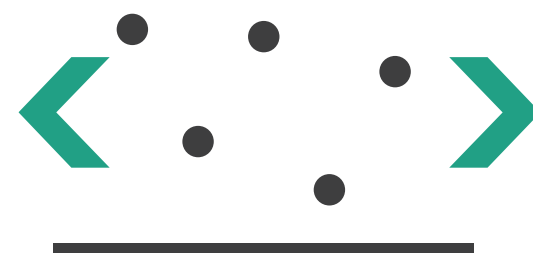
## → Item Reduction

### → Zoom

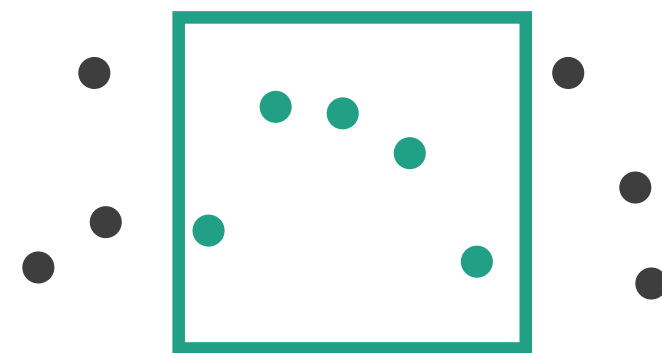
*Geometric* or *Semantic*



### → Pan/Translate



### → Constrained

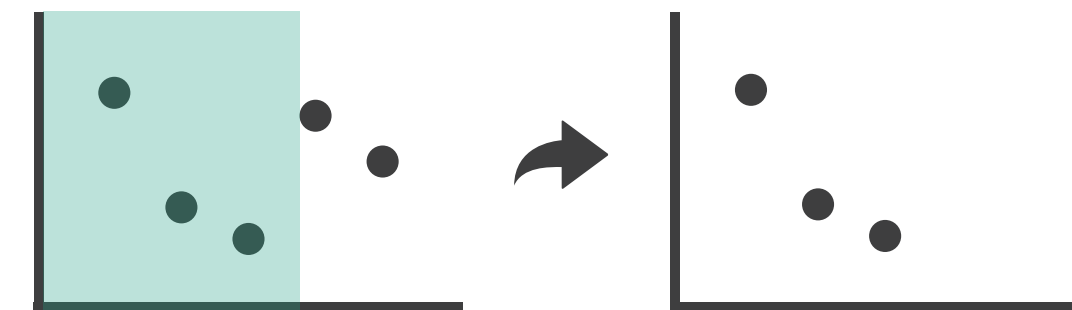


## → Attribute Reduction

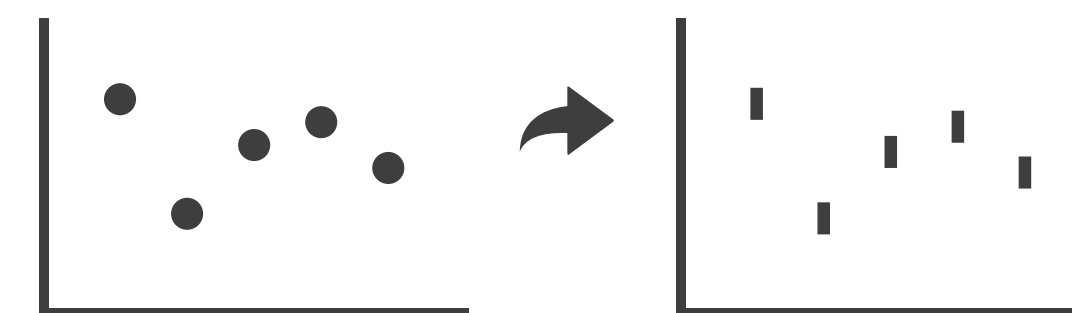
### → Slice



### → Cut



### → Project



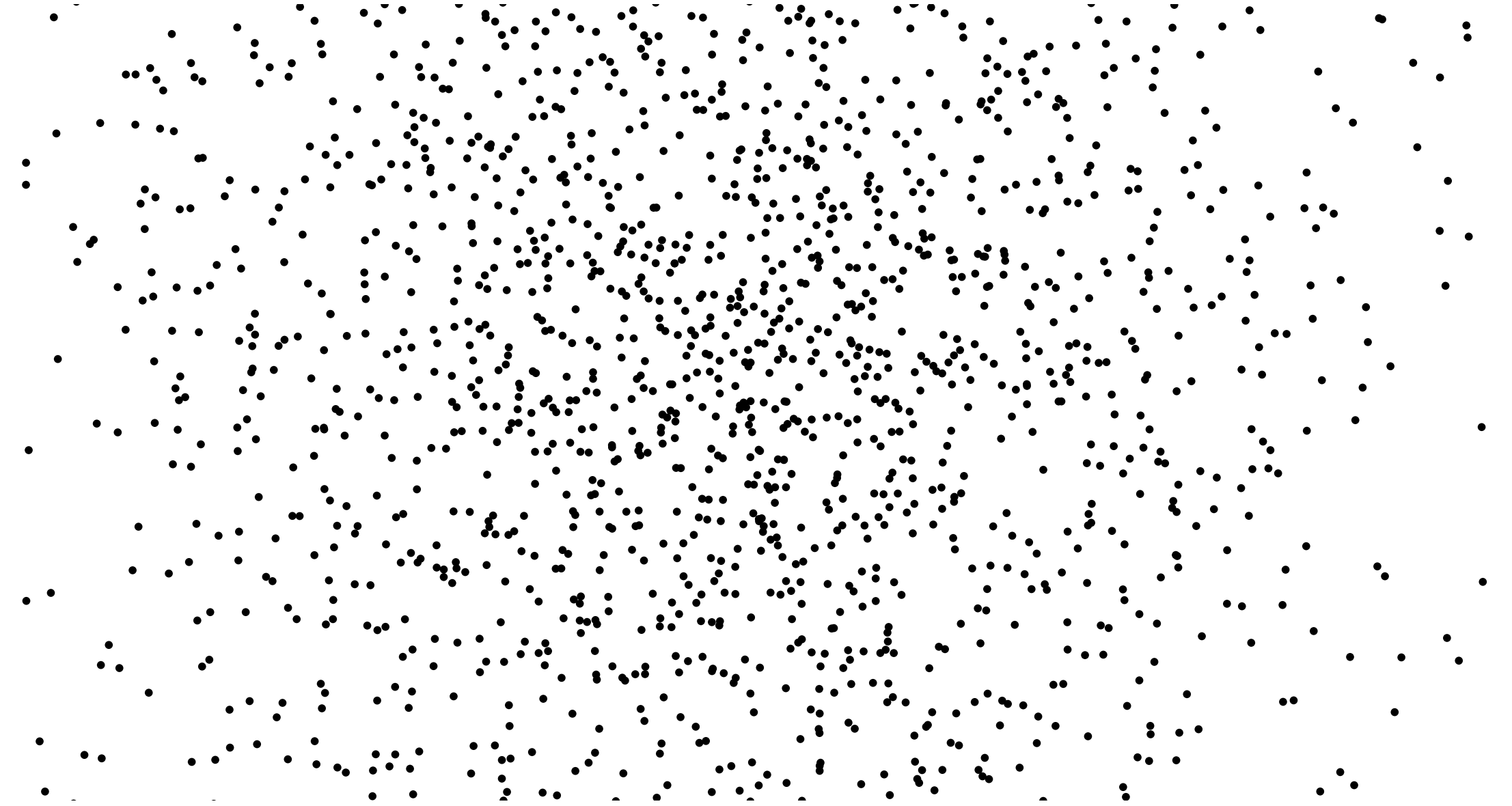
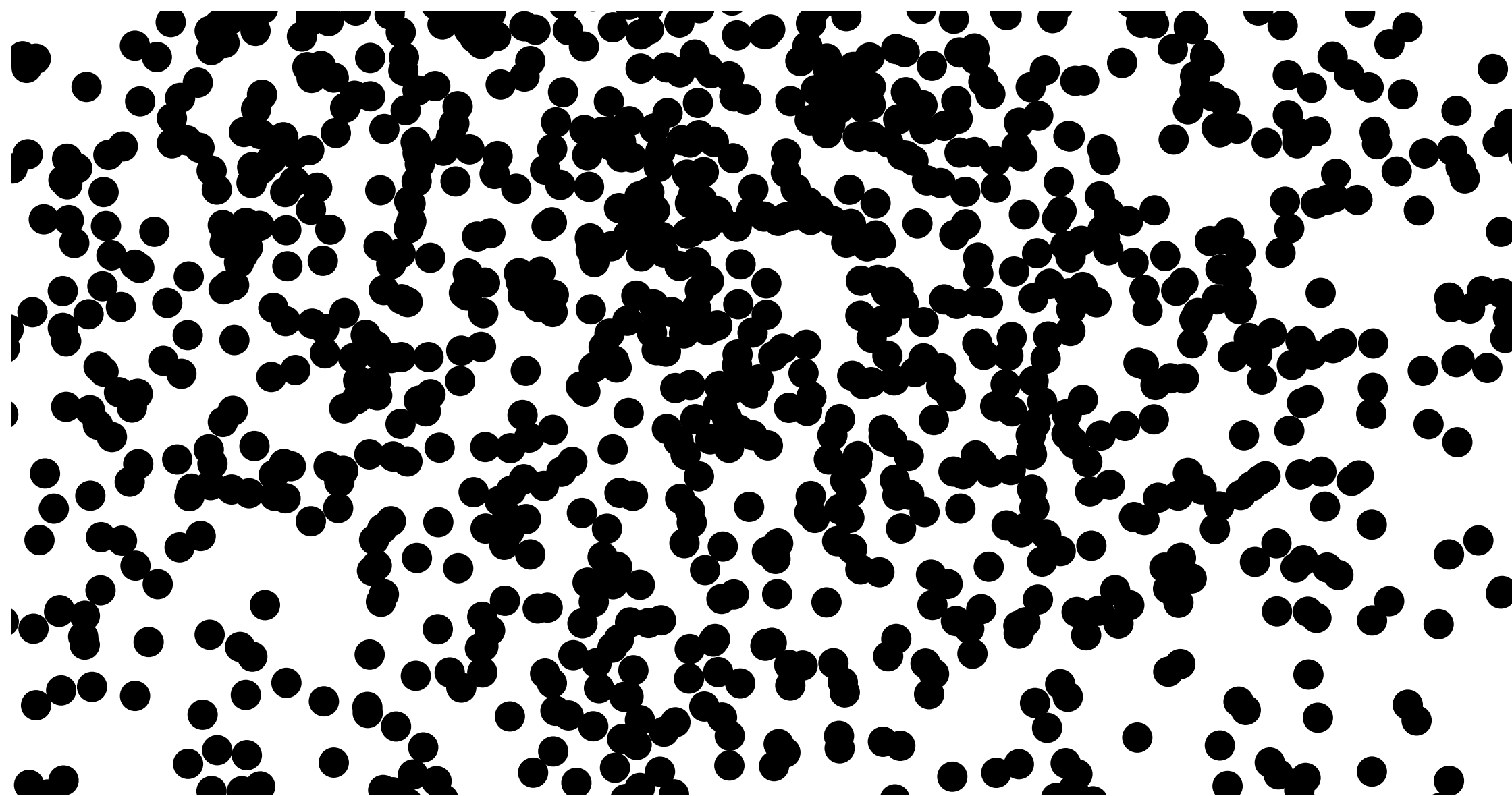
[Munzner (ill. Maguire), 2014]



# Geometric vs. Semantic Zooming

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- Geometric zoom: like a camera
- Semantic zoom: visual appearance of objects can change at different scales



[M. Bostock]



# Project Design

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- Work on turning your visualization ideas into designs
- Turn in:
  - Three Designs Sketches
  - Progress on Implementation
- Options:
  - Try vastly different options
  - Refine an initial idea
- Due Monday, Nov. 11

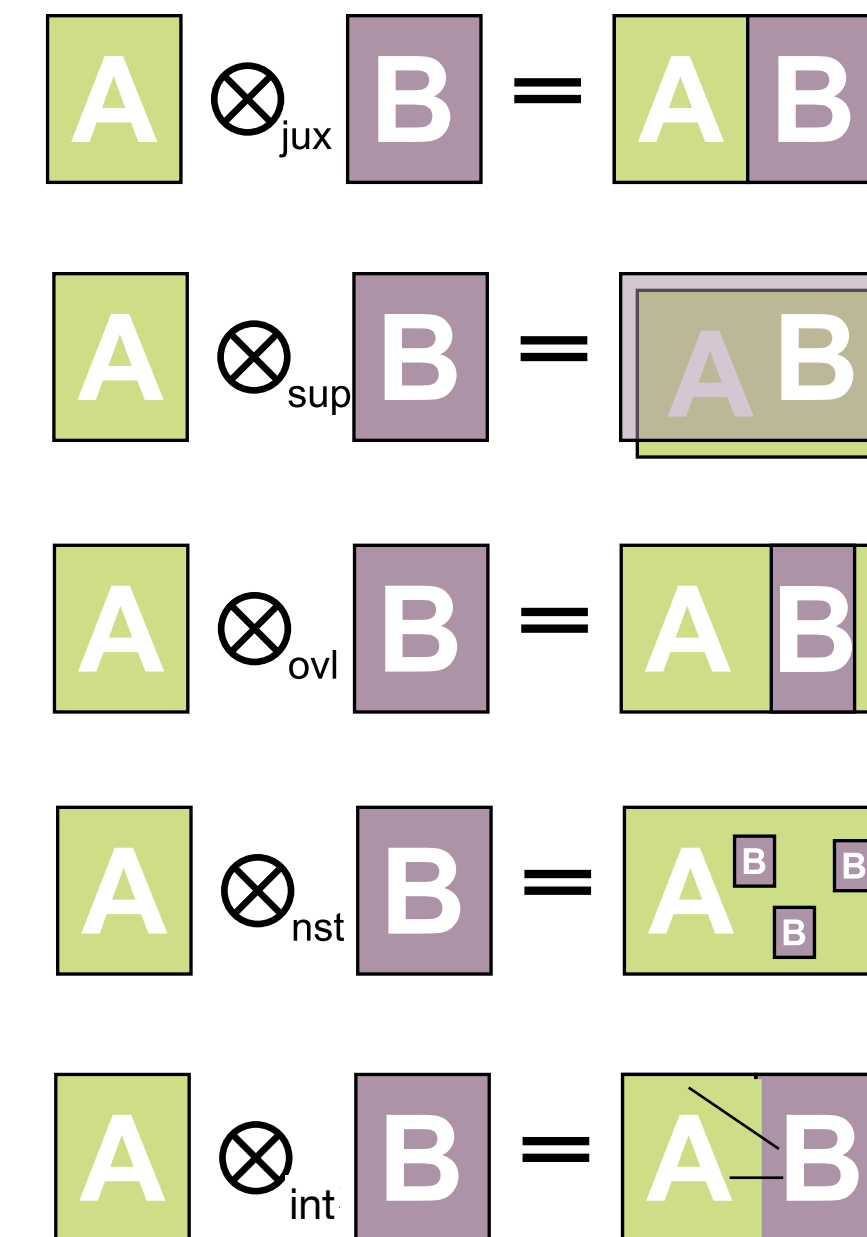
# Assignment 5

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- Farming data with multiple views & interaction
- Add Crop Sales Information

# Design Space of Composite Visualization

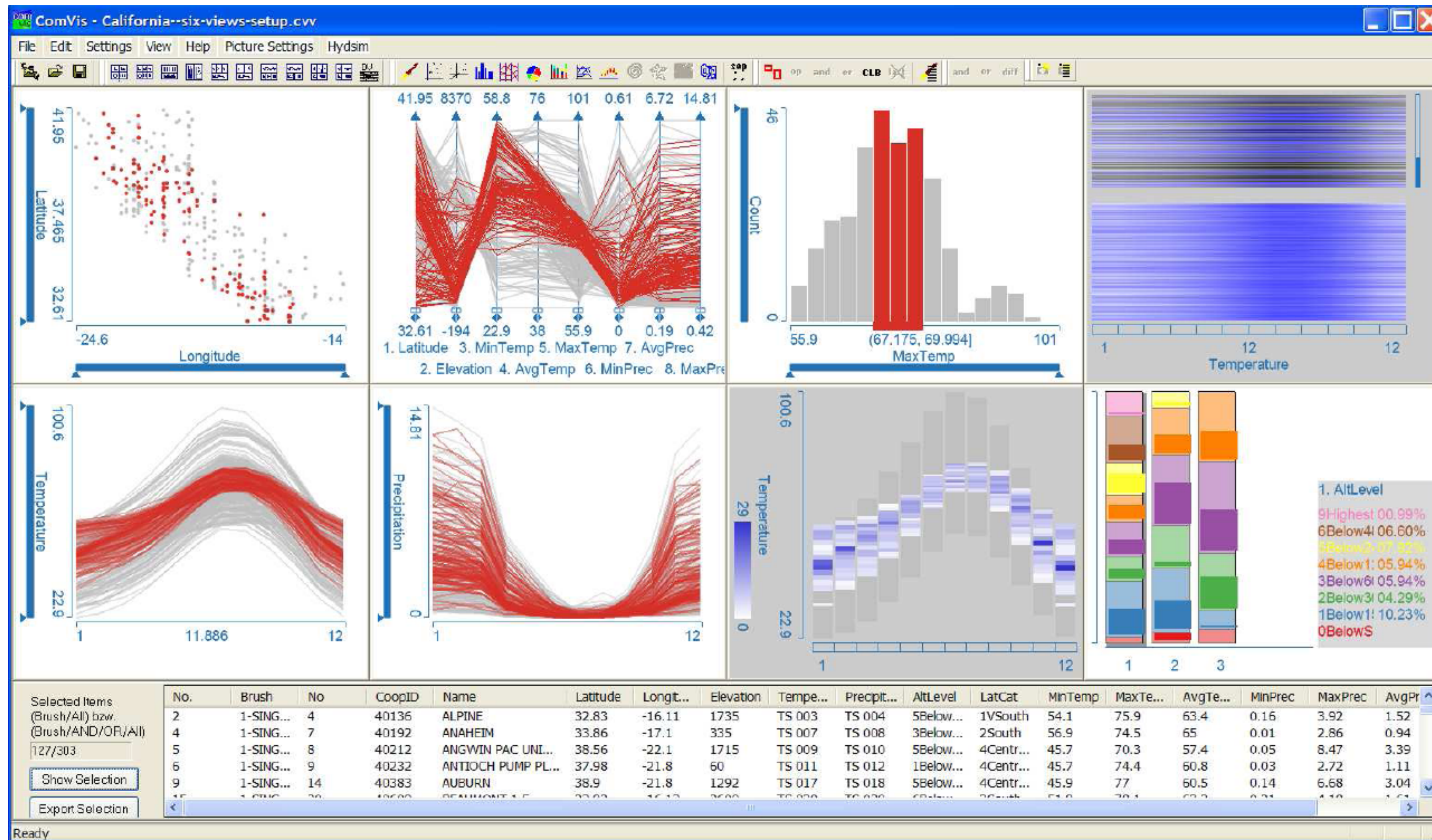
- Composite visualization views (CVVs)
  - Includes Coordinated multiple views (CMV)
  - + More!
- Design Patterns:
  - Juxtaposition: side-by-side
  - Superimposition: layers
  - Overloading: vis meshed with another
  - Nesting: vis inside a vis (recursive vis)
  - Integration: "merge" views + links



[W. Javed and N. Elmqvist, 2012]



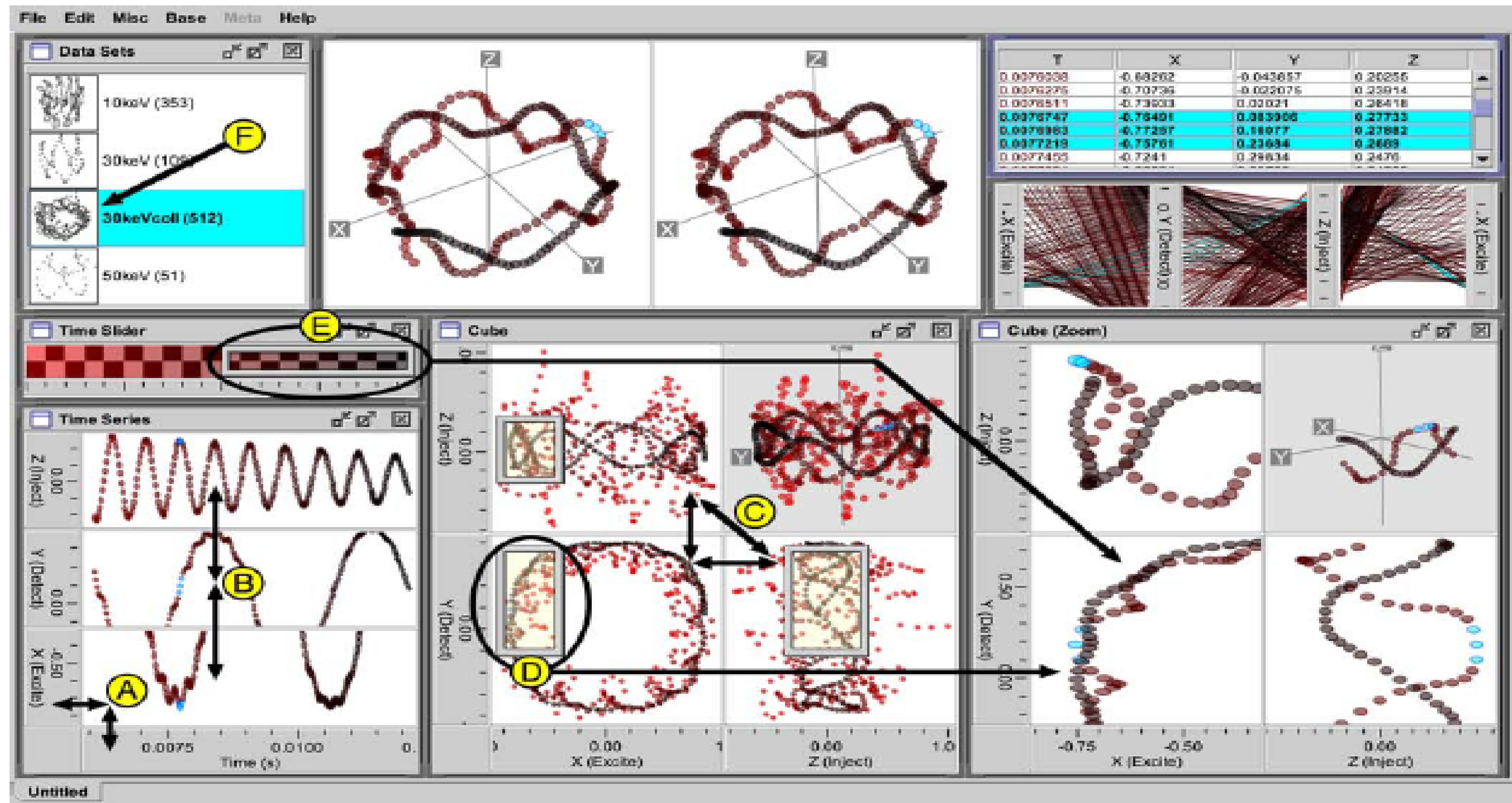
# Juxtaposition



[ComVis, K. Matkovic et al., 2008]



# Juxtaposition



[Improvise, C. Weaver, 2004]

# Juxtaposition Guidelines

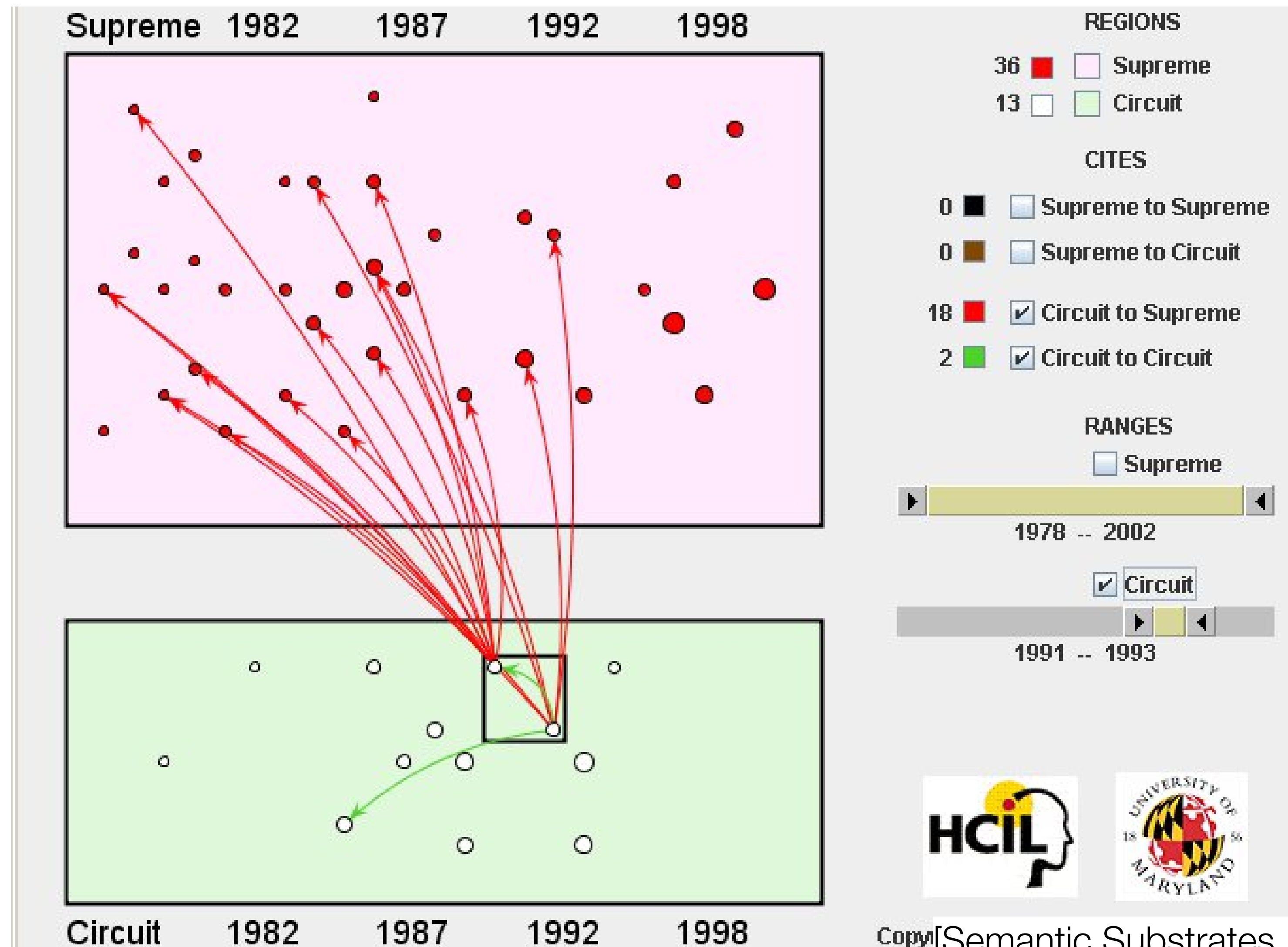
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- Benefits:
  - The component visualizations are independent and can be composed without interference
  - Easy to implement
- Drawbacks:
  - Implicit visual linking is not always easy to see, particularly when multiple objects are selected
  - Space is divided between the views, yielding less space for each view
- Applications: Use for heterogeneous datasets consisting of many different types of data, or for where different independent visualizations need to be combined.

[W. Javed and N. Elmqvist, 2012]

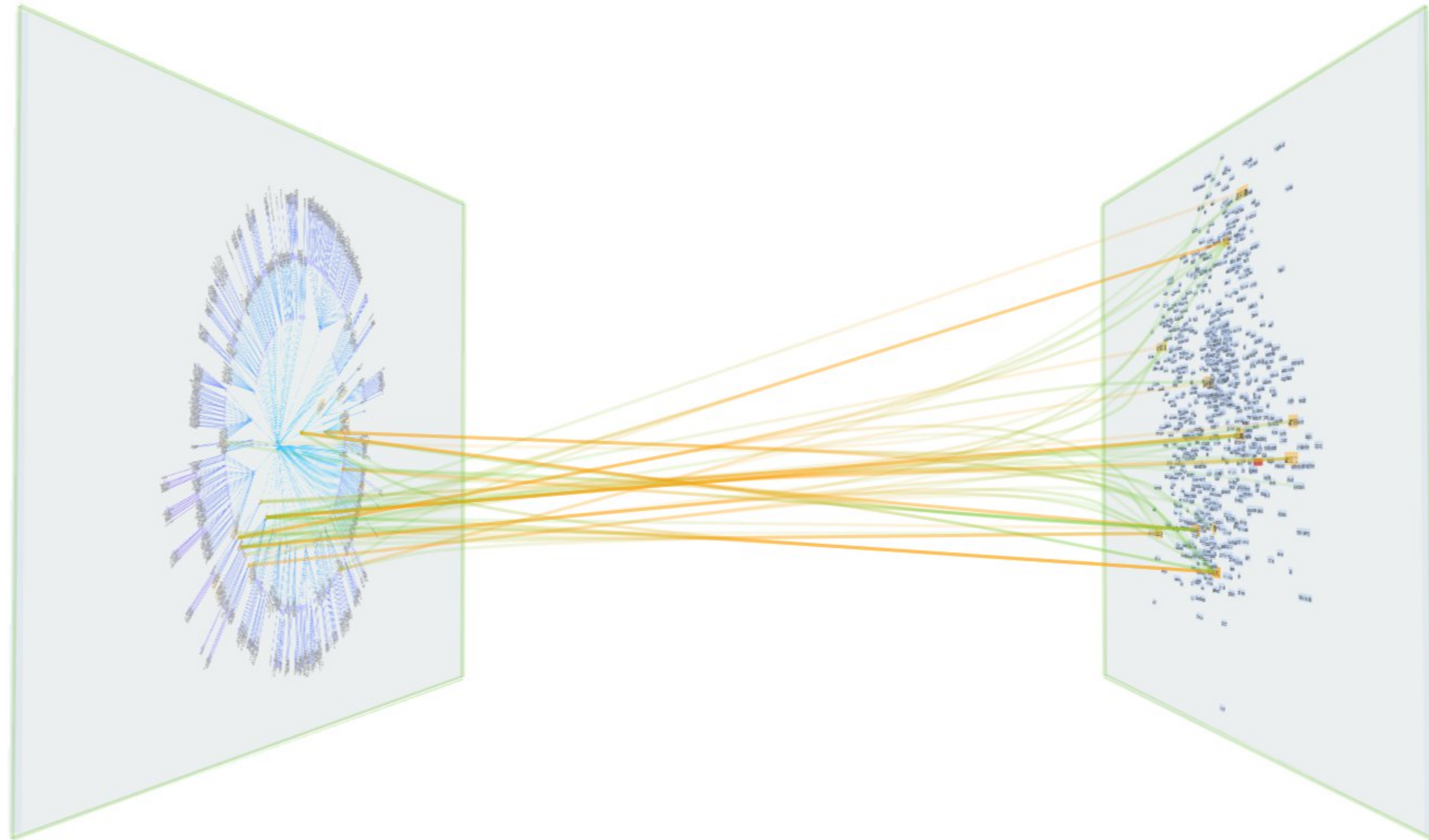


# Integration



Copy [Semantic Substrates, Schneiderin and Aris, 2006]

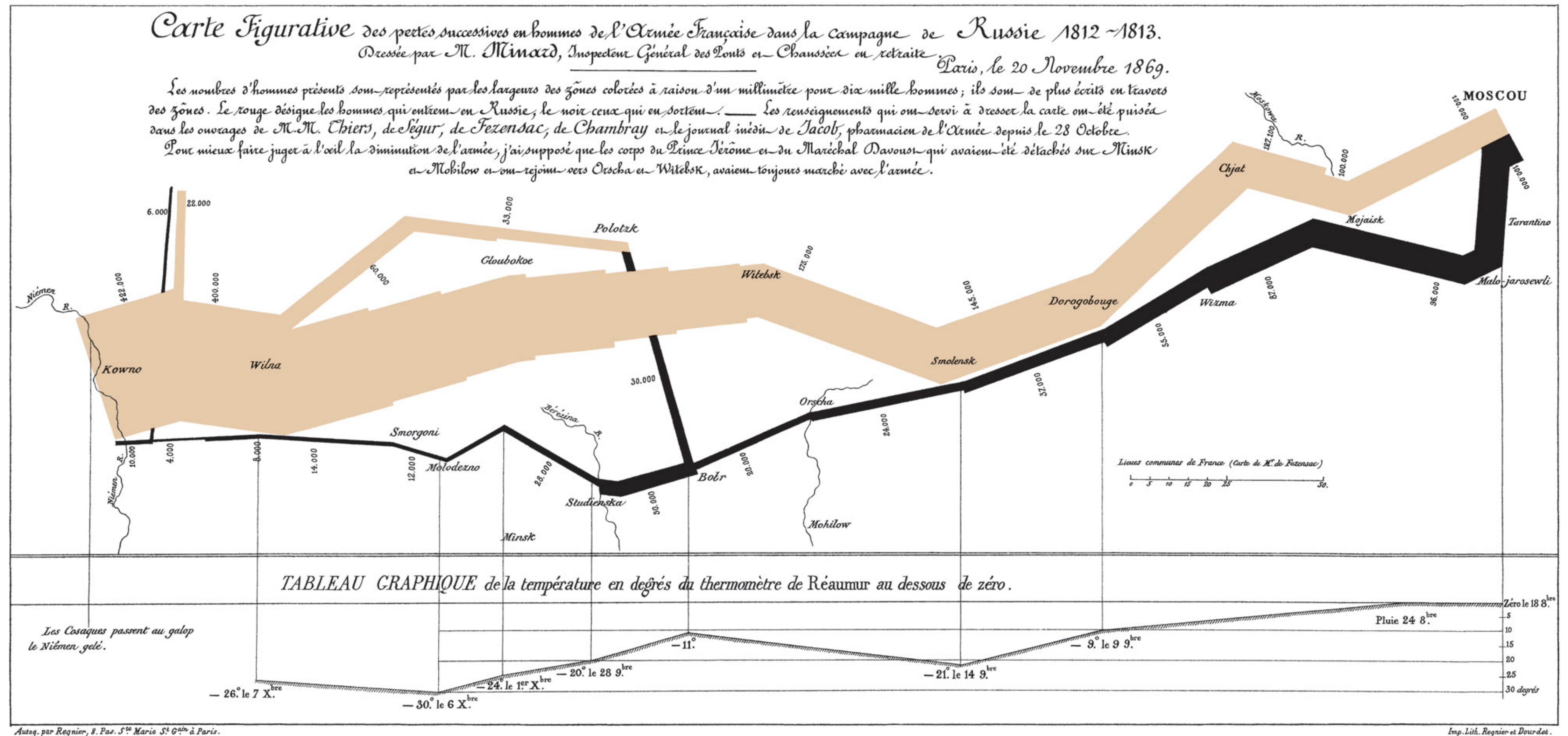
# Integration



[VisLink, Collins and Carpendale, 2007]



# Integration



[Napoleon's March to Moscow, C. J. Minard, 1869]

# Integration Guidelines

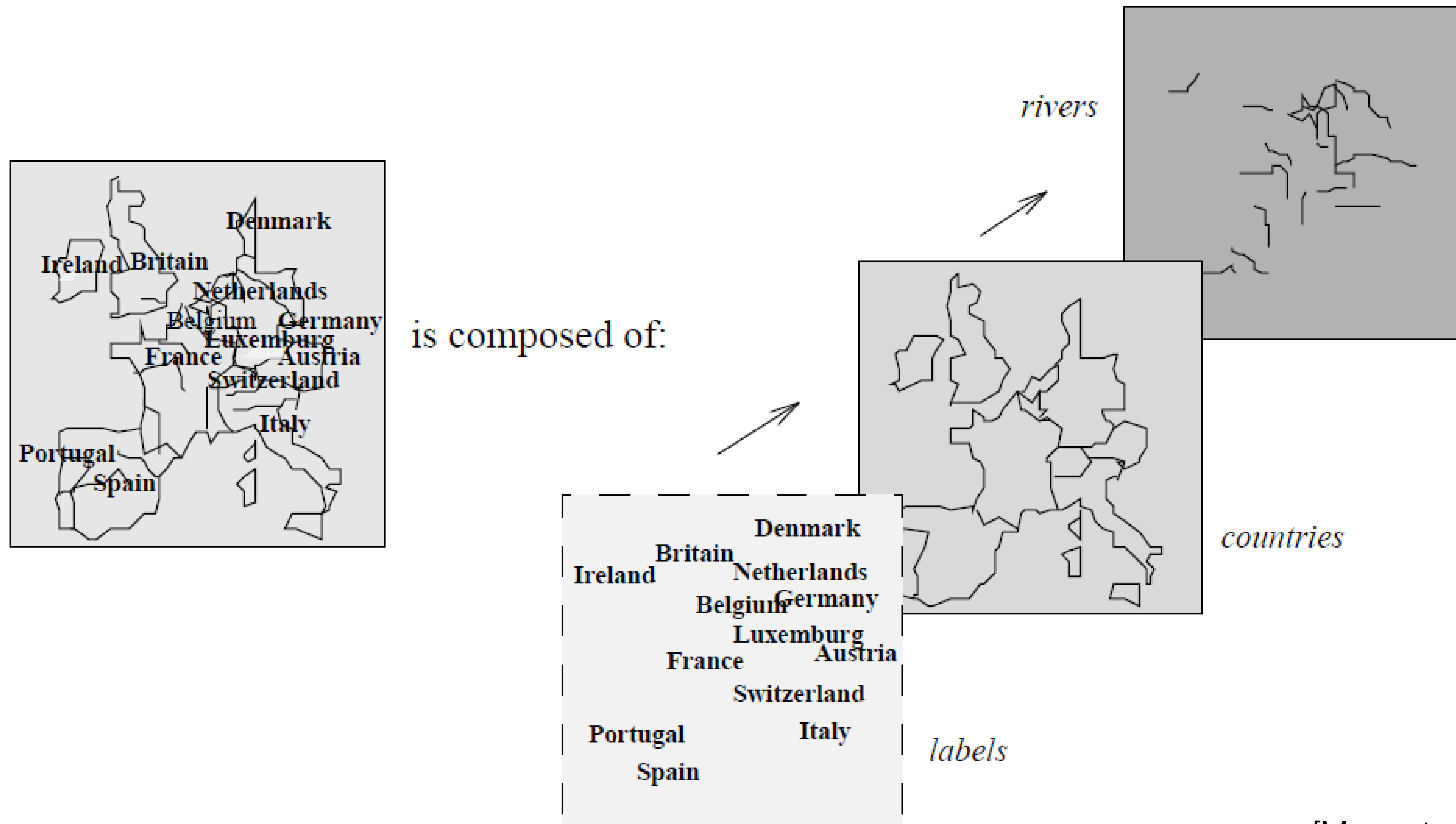
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- Benefits:
  - Easy to perceive one-to-one and one-to-many relations between items in components
  - Visualizations are less independent compared to juxtaposed views, but still separate
- Drawbacks:
  - Extra visual clutter added to the overall view
  - Display space is split between the views
  - Some dependencies exist between views to allow for the visual linking
- Applications: Use for heterogeneous datasets where correlation and comparisons between views is particularly important.

[W. Javed and N. Elmqvist, 2012]



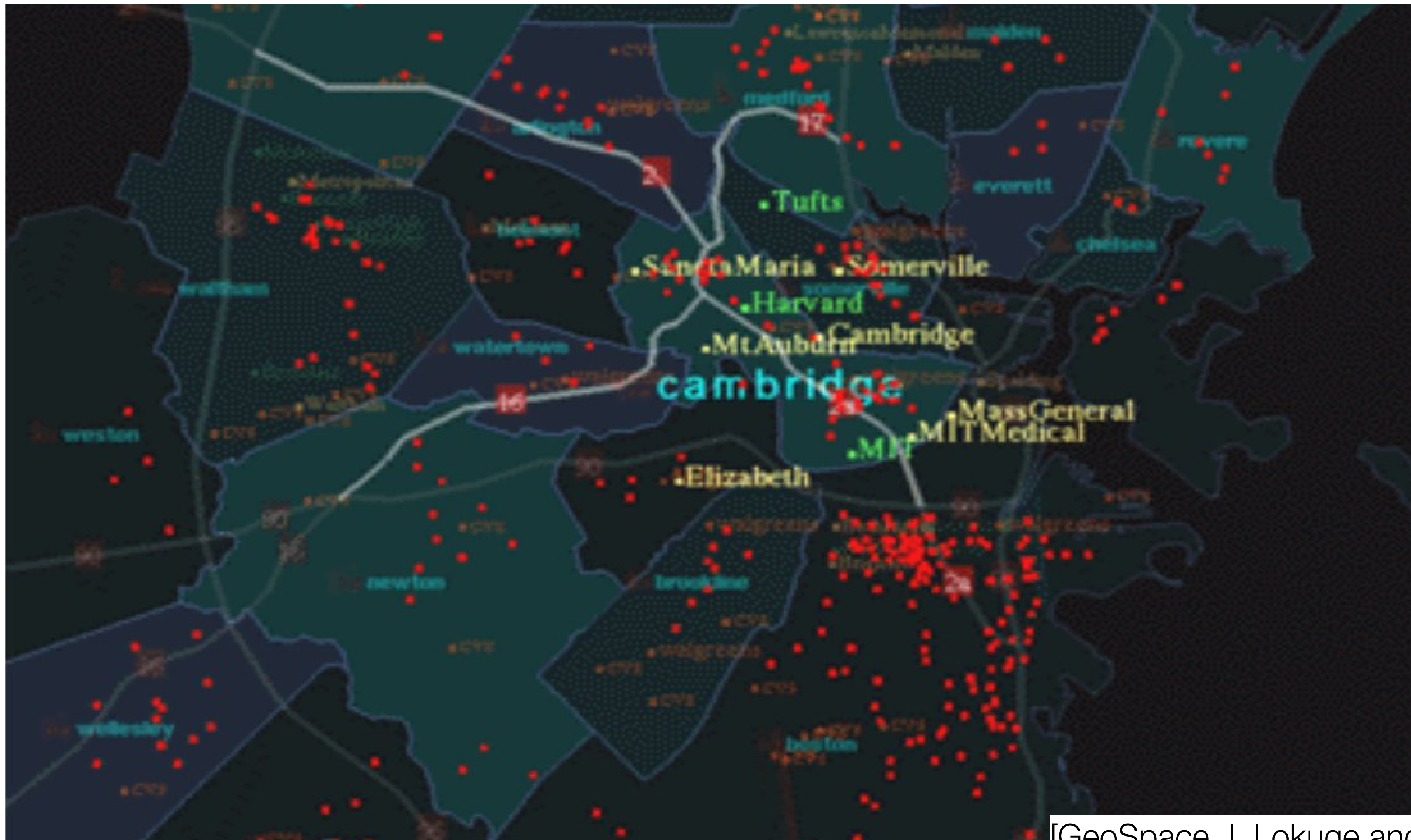
# Superimposition



[Mapgets, A. Voisard, 1995]



# Superimposition



[GeoSpace, I. Lokuge and S. Ishizaki, 1995]

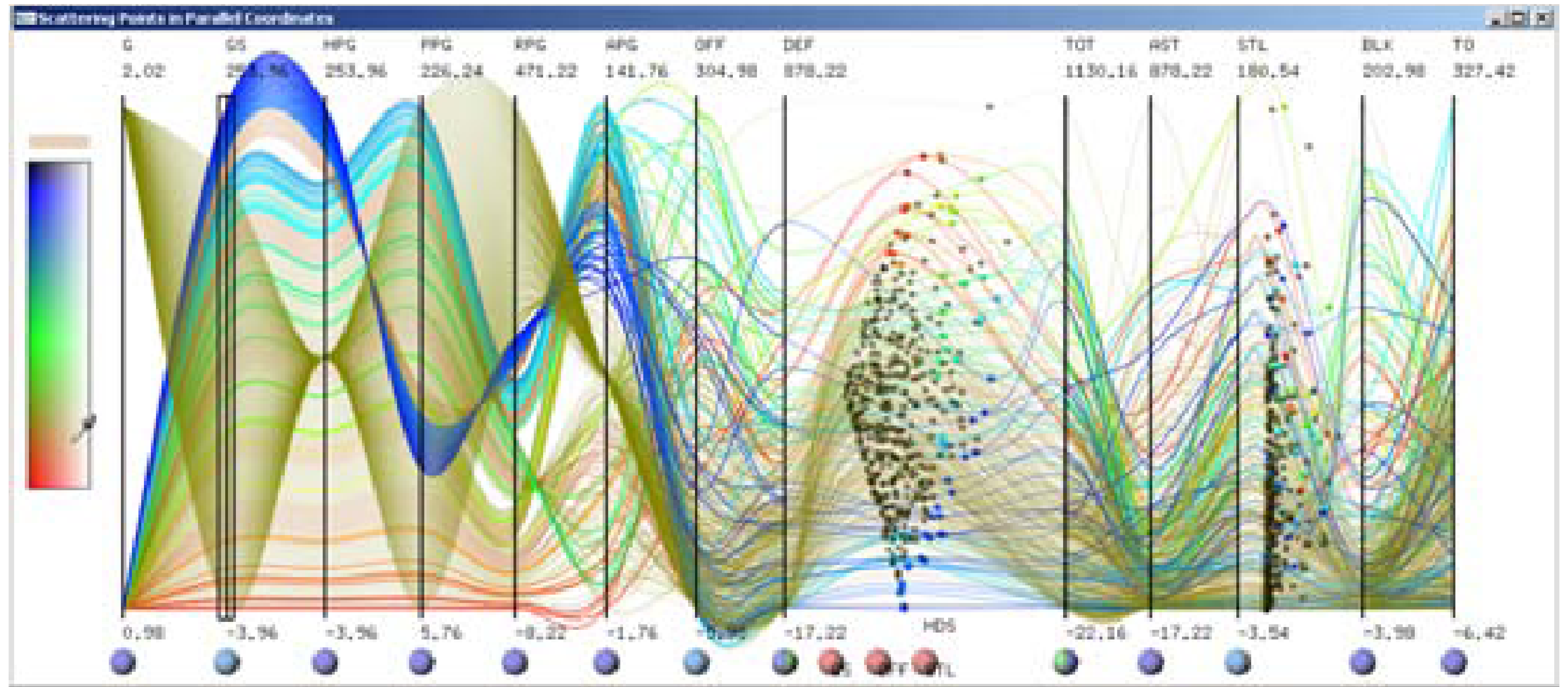
# Superimposition Guidelines

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- Benefits:
  - Allows direct comparison in the same visual space.
- Drawbacks:
  - May cause occlusion and high visual clutter.
  - The client visualization must share the same spatial mapping as the host visualization.
- Applications: In settings where comparison is common, or where the component visualization views need to be as large as possible (potentially the entire available space).

[W. Javed and N. Elmqvist, 2012]

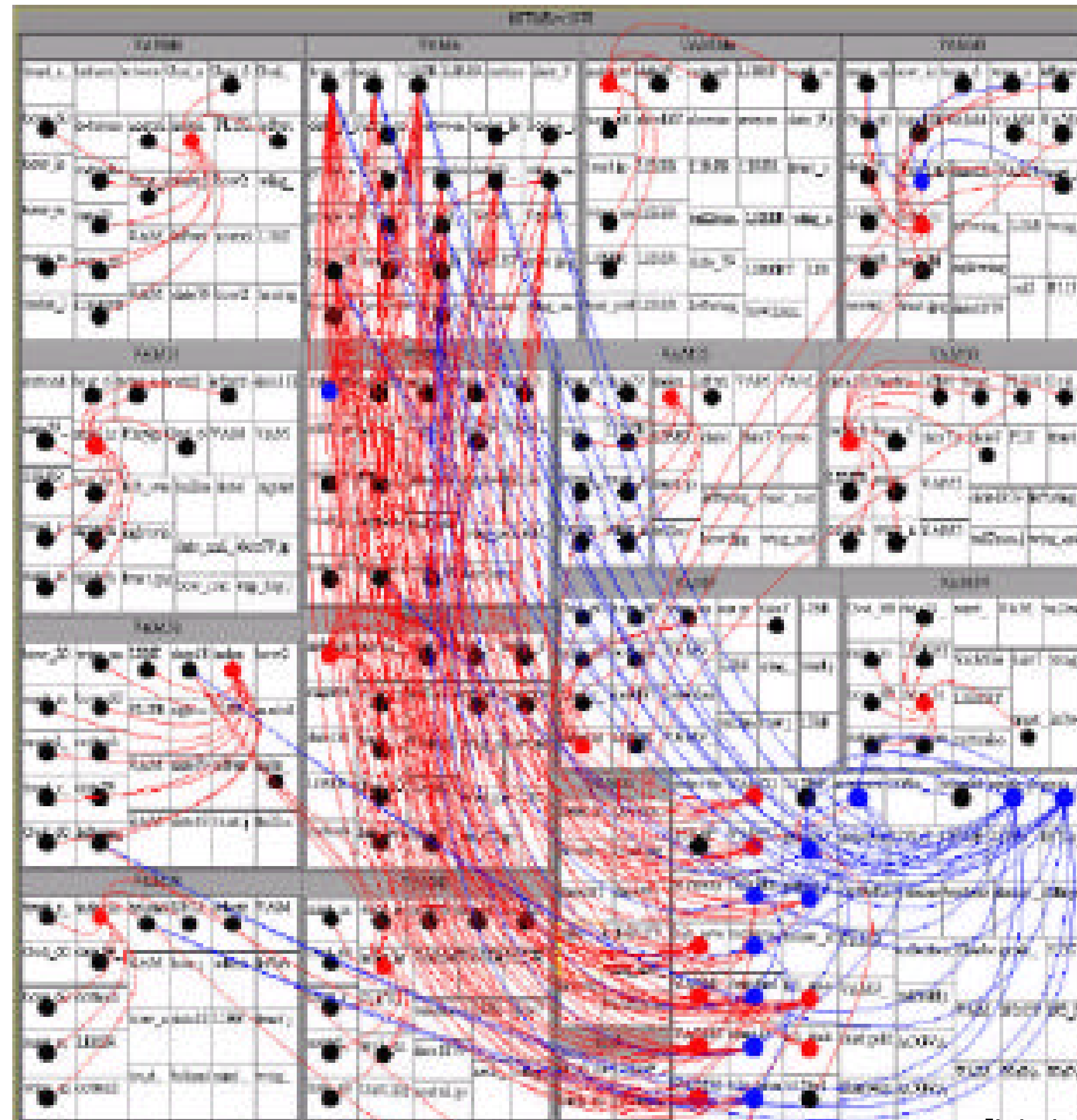
# Overloading



[SPCC, X. Yuan et al., 2009]



# Overloading



[Links on Treemaps, J.-D. Fekete et al., 2003]



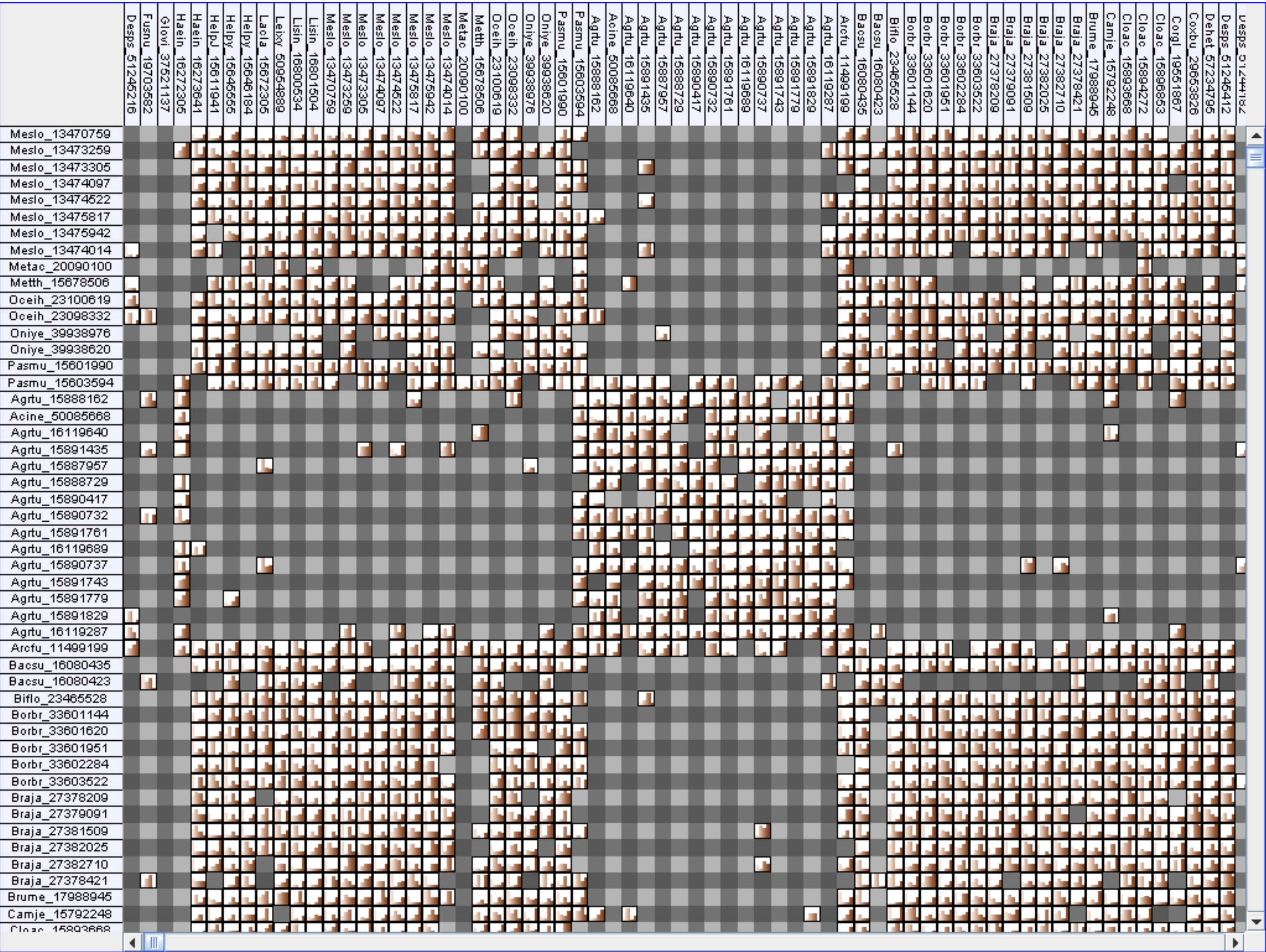
# Overloading Guidelines

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- Benefits:
  - The client visualization does not have to share the same coordinate space as the host visualization
  - This also yield more flexibility and control over visual clutter
- Drawbacks:
  - Visual clutter is increased
  - Visual design dependencies between components are significant
- Applications: Situations where one visualization can be folded into another to yield a compact (and complex) result.

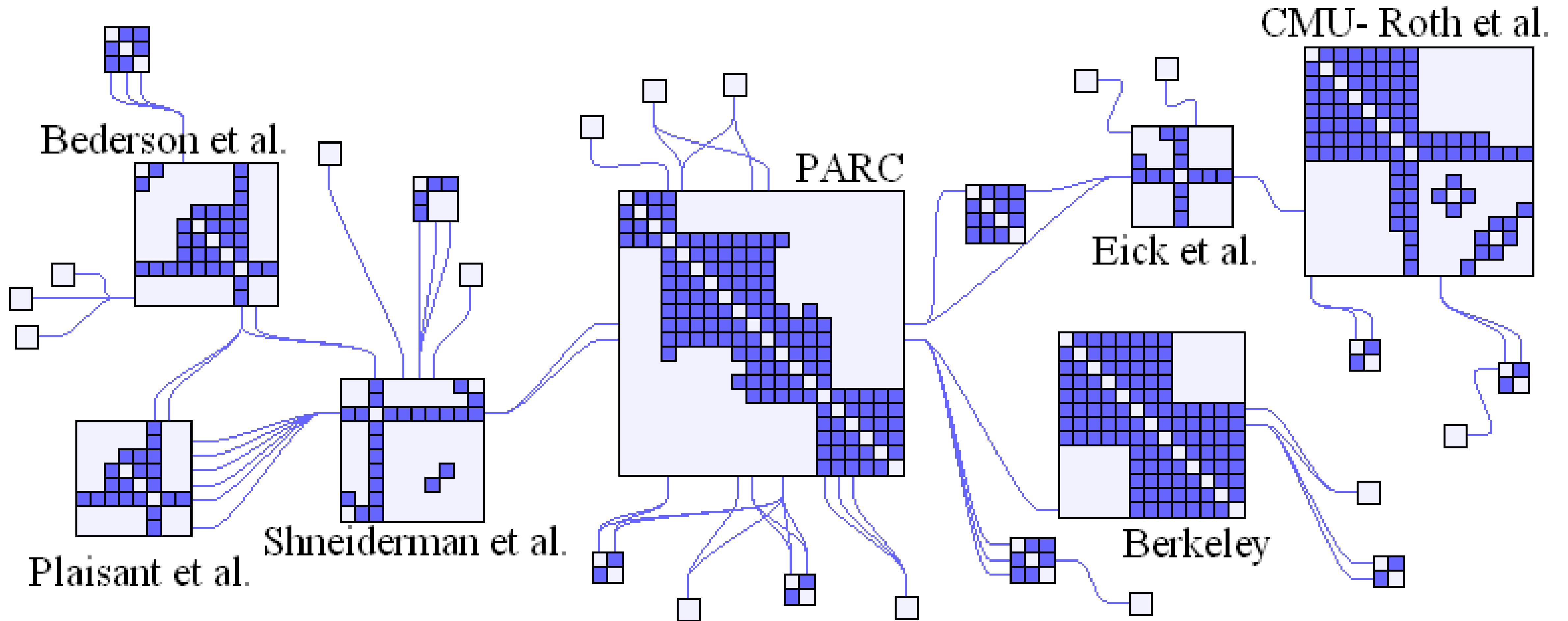
[W. Javed and N. Elmqvist, 2012]

# Nesting



[ZAME, N. Elmqvist et al., 2008]

# Nesting



[NodeTrix, N. Henry et al., 2007]



# Nesting Guidelines

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- Benefits:
  - Very compact representation
  - Easy correlation
- Drawbacks:
  - Limited space for the client visualizations
  - Clutter is high
  - Visual design dependencies are high
- Applications: Situations that call for augmenting a particular visual representation with additional mapping

[W. Javed and N. Elmqvist, 2012]



# Design Space

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- Visualizations: the techniques or idioms used
- Spatial relation: relationship between visual structures in display space
- Data relation: visual relationship between items in different views
  - None: No relation
  - Item-item: One-to-one
  - Item-group: One-to-many
  - Item-dimension: Item in one view is a **scale** in another

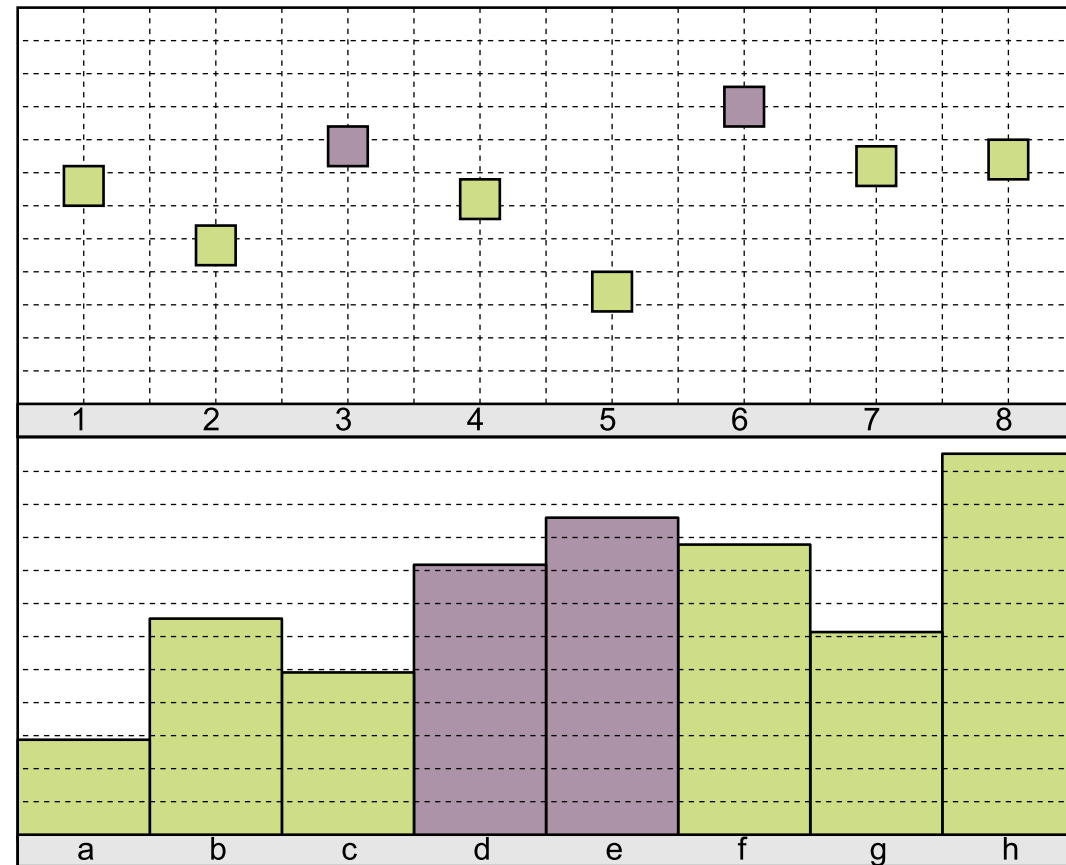
[W. Javed and N. Elmqvist, 2012]

# Summary

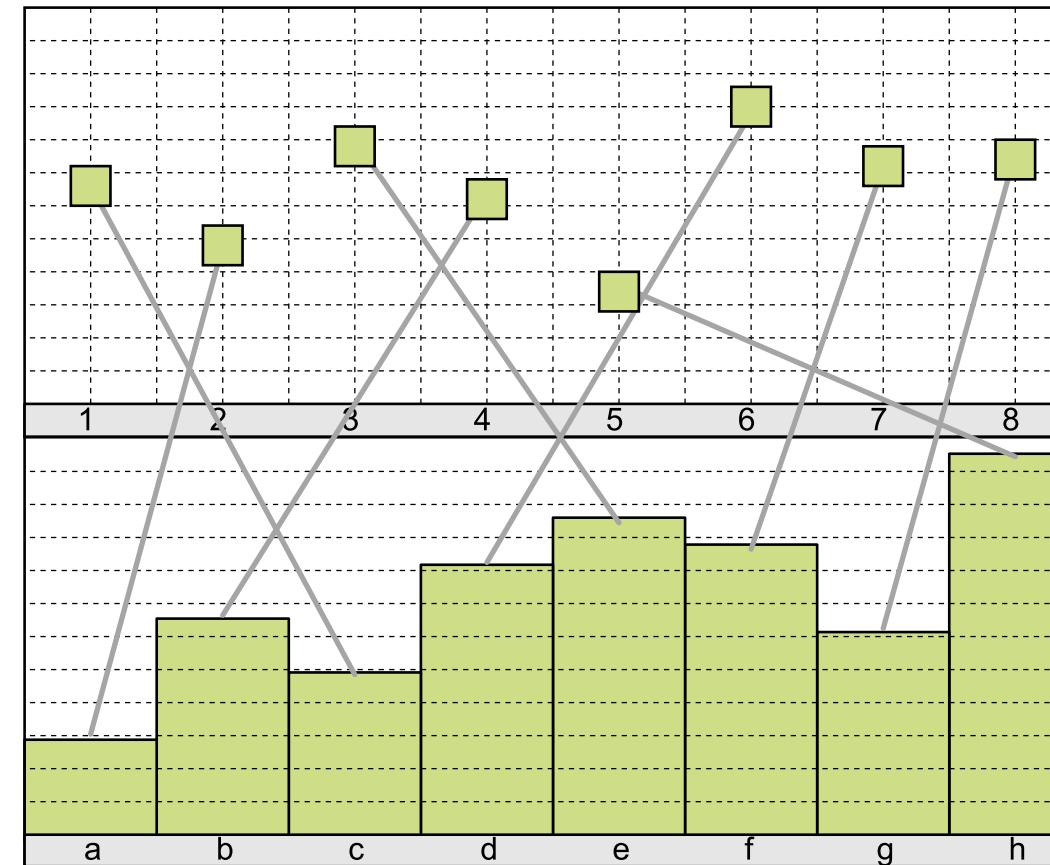
| Technique                                             | Visualization A     | Visualization B    | Spatial Relation | Data Relation  |
|-------------------------------------------------------|---------------------|--------------------|------------------|----------------|
| ComVis [24] (Figure 2)                                | any                 | any                | juxtapose        | none           |
| Improvise [39] (Figure 3)                             | any                 | any                | juxtapose        | none           |
| Jigsaw [36]                                           | any                 | any                | juxtapose        | none           |
| Snap-Together [30]                                    | any                 | any                | juxtapose        | none           |
| semantic substrates [34] (Figure 4)                   | node-link           | node-link          | juxtapose        | item-item      |
| VisLink [11] (Figure 5)                               | radial graph        | node-link          | juxtapose        | item-item      |
| Napoleon's March on Moscow [37]                       | time line view      | area visualization | juxtapose        | item-item      |
| Mapgets [38] (Figure 6)                               | map                 | text               | superimpose      | item-item      |
| GeoSpace [22] (Figure 7)                              | map                 | bar graph          | superimpose      | item-item      |
| 3D GIS [8]                                            | map                 | glyphs             | superimpose      | item-item      |
| Scatter Plots in Parallel Coordinates [45] (Figure 8) | parallel coordinate | scatterplot        | overload         | item-dimension |
| Graph links on treemaps [14] (Figure 9)               | treemap             | node-link          | overload         | item-item      |
| SparkClouds [21]                                      | tag cloud           | line graph         | overload         | item-item      |
| ZAME [13] (Figure 10)                                 | matrix              | glyphs             | nested           | item-group     |
| NodeTrix [17] (Figure 11)                             | node-link           | matrix             | nested           | item-group     |
| TimeMatrix [44]                                       | matrix              | glyphs             | nested           | item-group     |
| GPUVis [25]                                           | Scatterplot         | glyphs             | nested           | item-group     |

[W. Javed and N. Elmqvist, 2012]

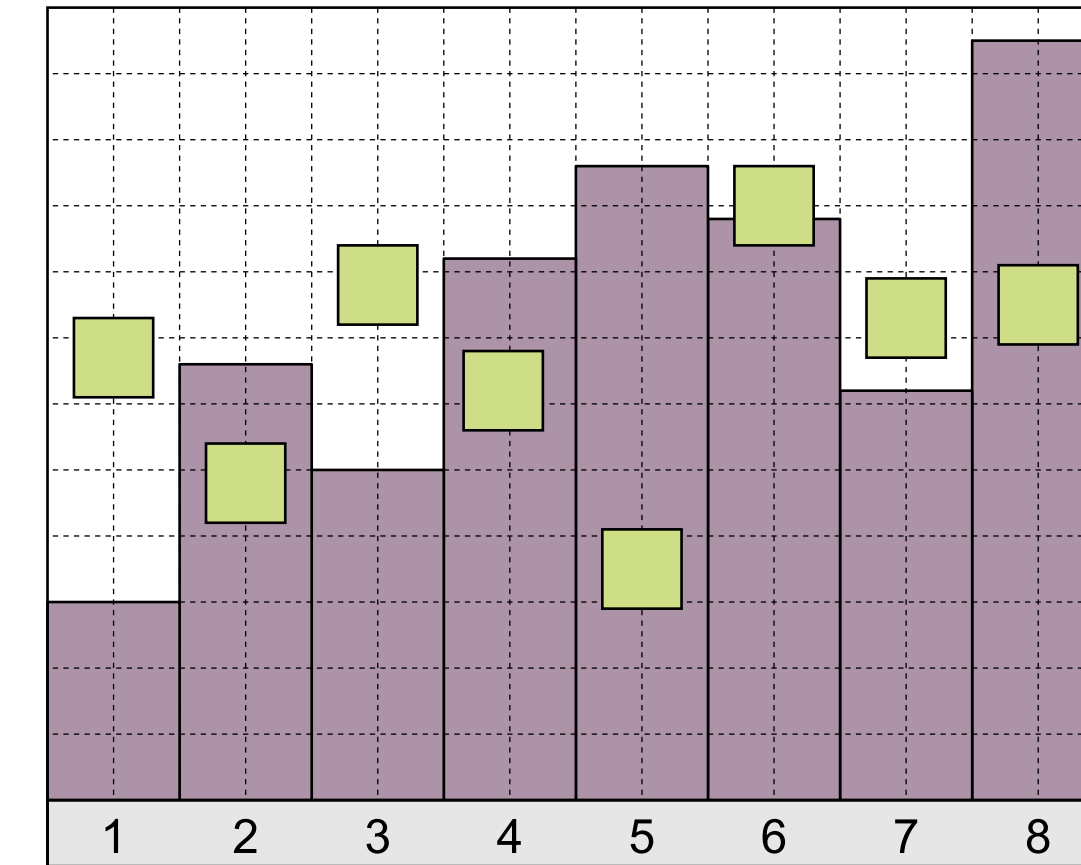
# Summary (Scatterplot + Bar Chart)



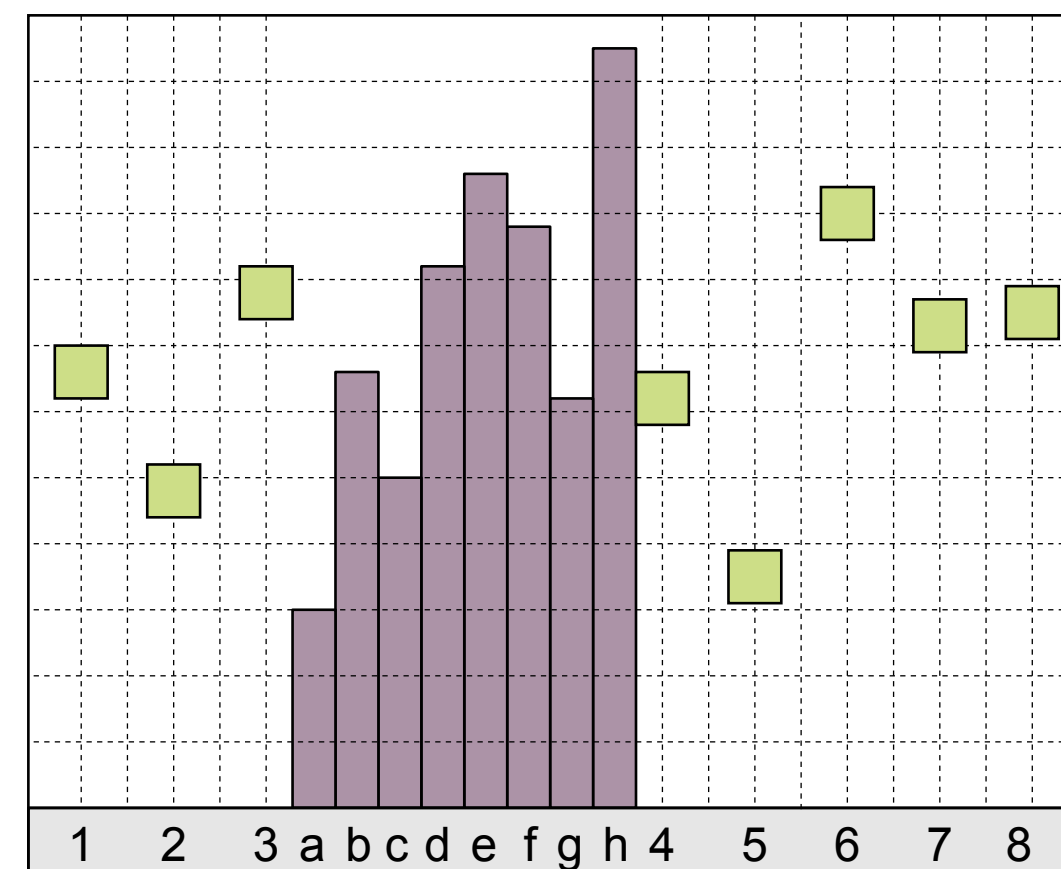
(a) Juxtaposed views.



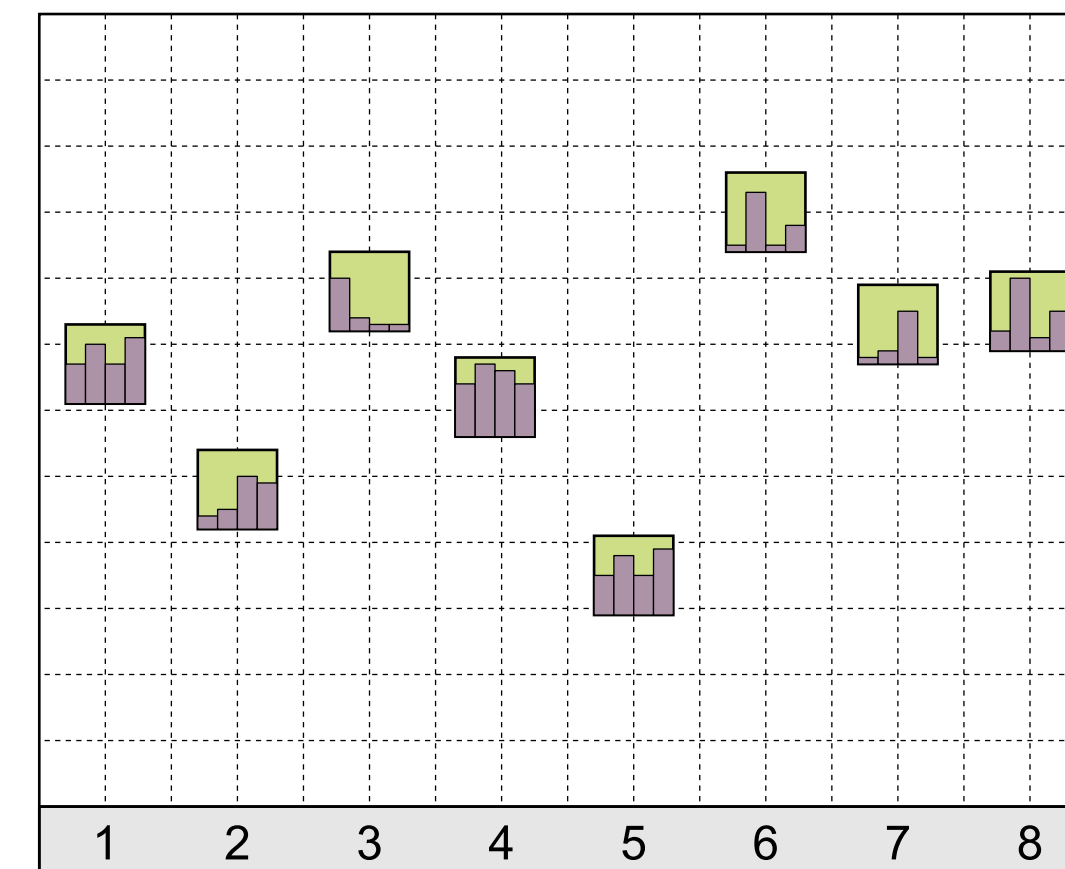
(b) Integrated views.



(c) Superimposed views.



(d) Overloaded views.



(e) Nested views.

[W. Javed and N. Elmqvist, 2012]



# Multiple Views

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- Facet (noun and verb)
  - particular aspect or feature of something
  - to split
- Partition visualization into views/layers
  - Either juxtapose (side-by-side), superimpose (layer), nest, etc.
  - Depends on data and encoding
  - Generally, superimposing does not scale as well
  - Multiple views eats display space (either large screens or small visualizations)



# Multiple Views

→ Share Encoding: Same/Different

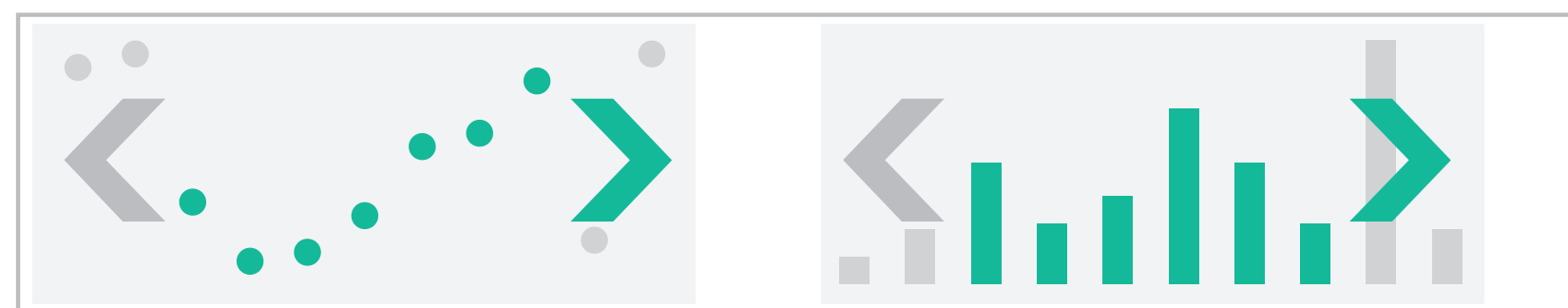
→ *Linked Highlighting*



→ Share Data: All/Subset/None

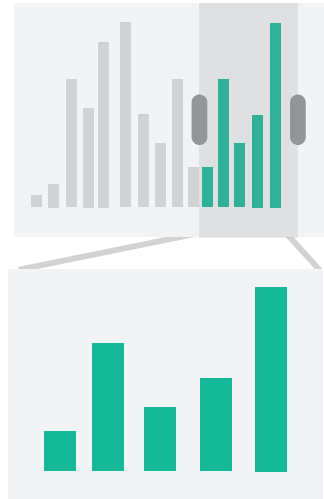
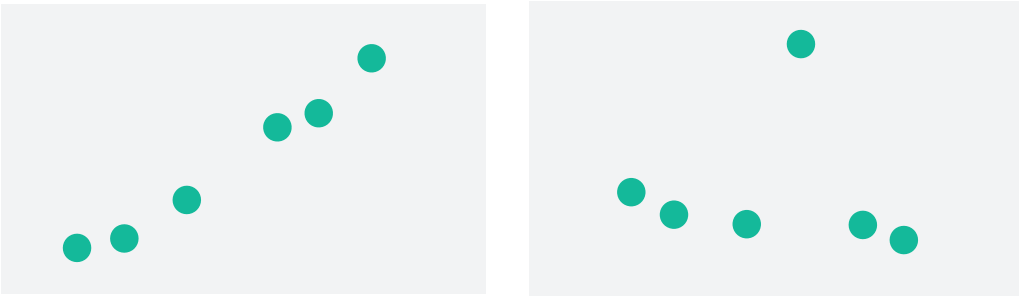
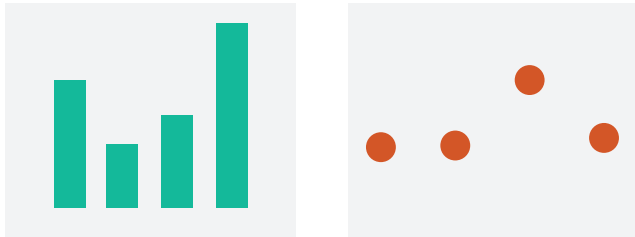


→ Share Navigation



[Munzner (ill. Maguire), 2014]

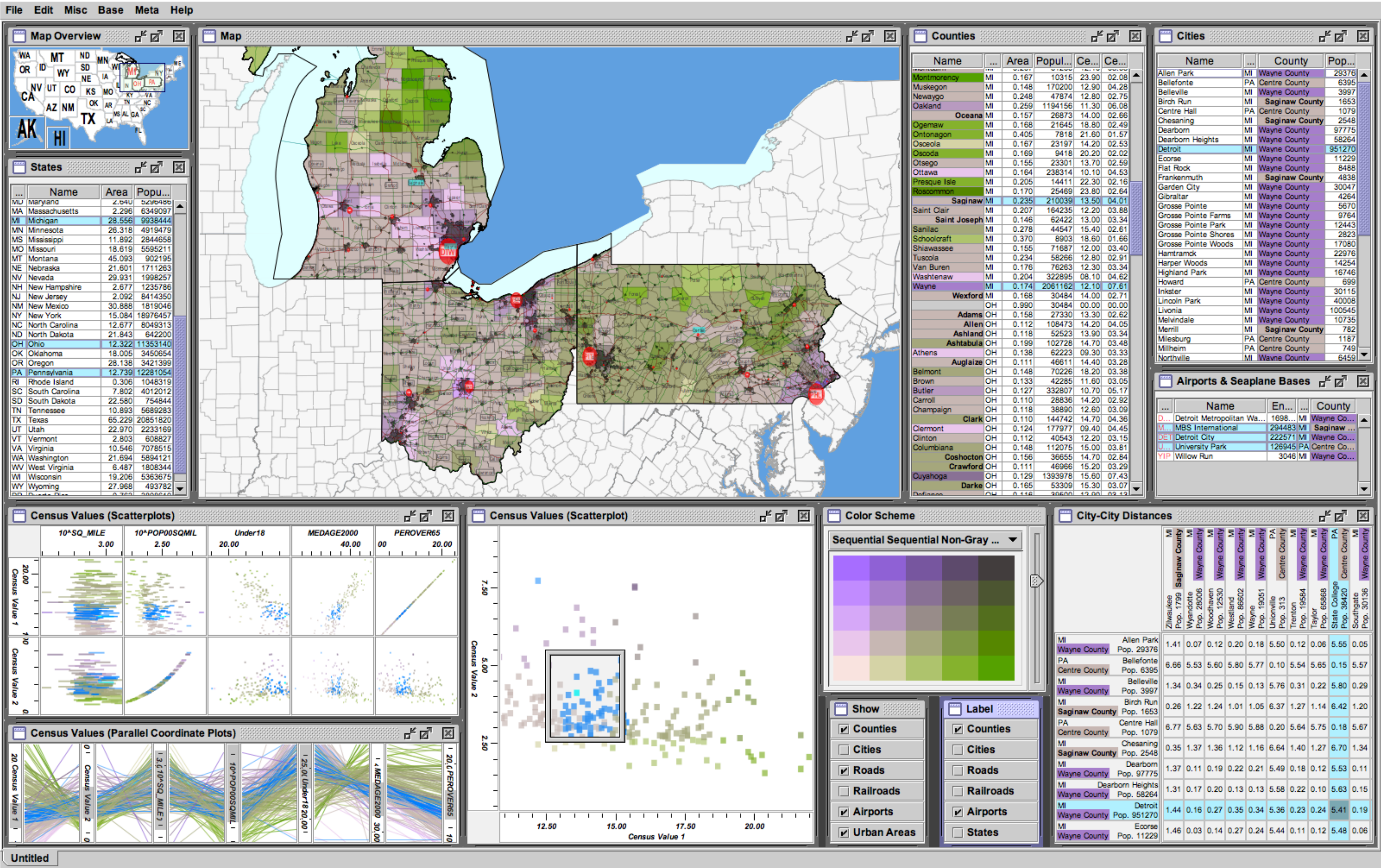
# Multiple Views

|          |           | Data                                                                                                   |                                                                                                                                  |                                                                                                             |
|----------|-----------|--------------------------------------------------------------------------------------------------------|----------------------------------------------------------------------------------------------------------------------------------|-------------------------------------------------------------------------------------------------------------|
|          |           | All                                                                                                    | Subset                                                                                                                           | None                                                                                                        |
| Encoding | Same      |  <p>Redundant</p>  |  <p>Overview/<br/>Detail</p>                 |  <p>Small Multiples</p> |
|          | Different |  <p>Multiform</p> |  <p>Multiform,<br/>Overview/<br/>Detail</p> |  <p>No Linkage</p>     |

[Munzner (ill. Maguire), 2014]



# Multiform



[Improvise, Weaver, 2004]



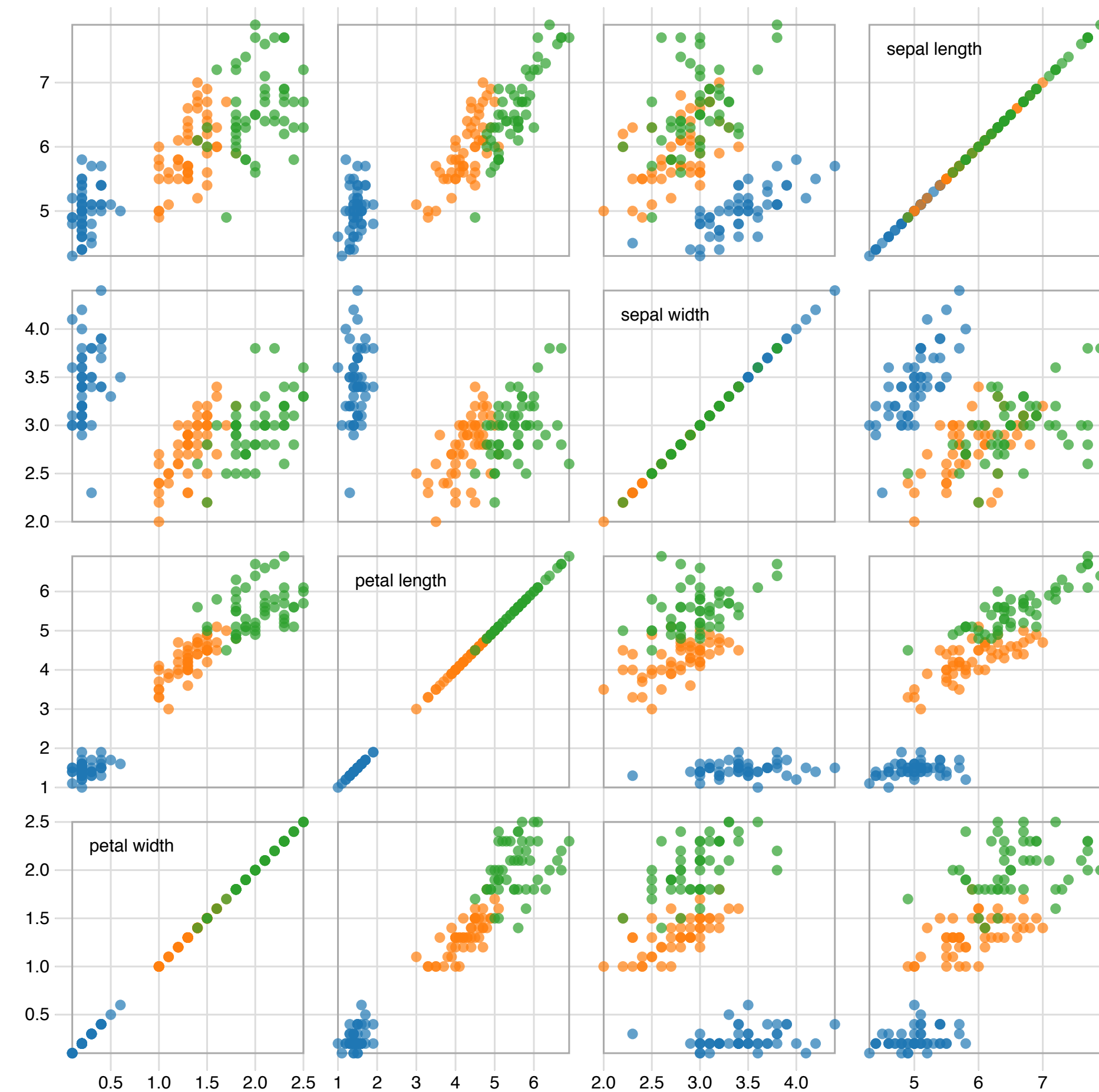
# Multiform Views

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- The same data visualized in different ways
- Does not need to be a totally different encoding (all choices need not be disjoint), e.g. horizontal positions could be the same
- One view becomes cluttered with too many attributes
- Consumes more screen space
- Allows greater separability between channels

# Small Multiples

- Same encoding, but different data in each view (e.g. SPLOM)



[M. Bostock]

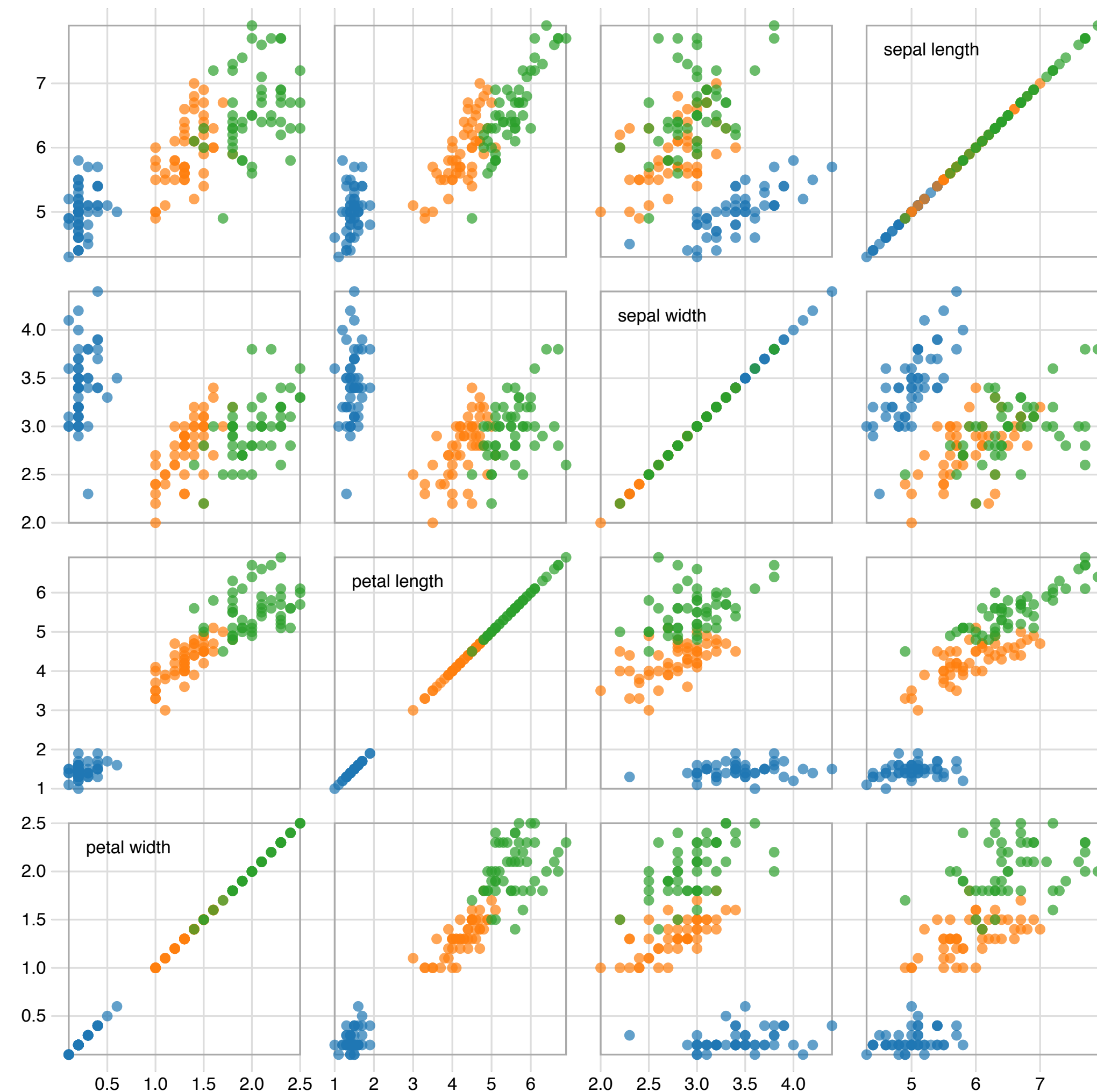


# Interaction with Multiform & Small Multiples

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- Key interaction with multiform and small multiples: **brushing**
  - also called linked highlighting
- Want to understand correspondences between representation in the different views

# Brushing



[M. Bostock]

# Schneiderman's Mantra

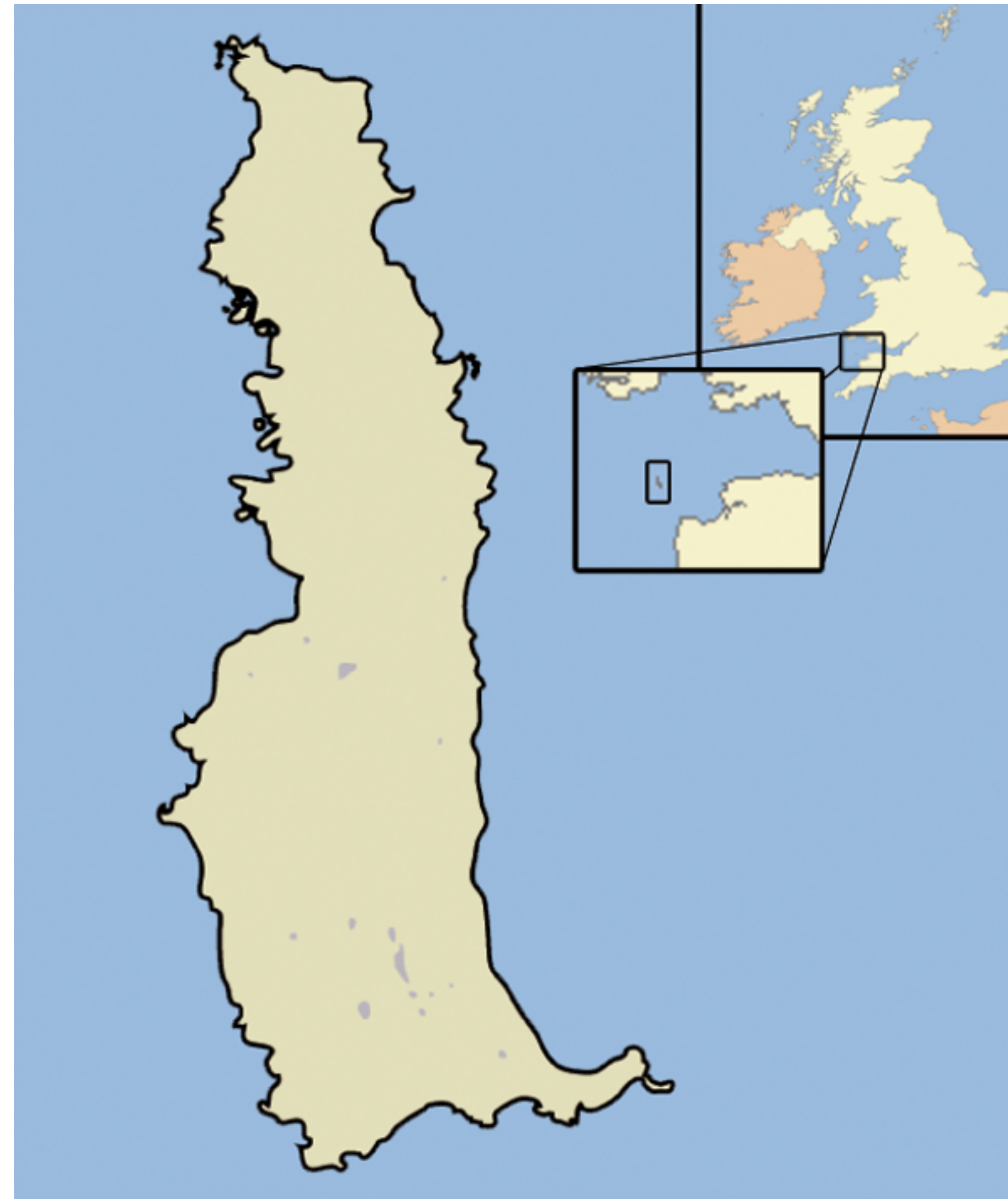
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- Visual Information-Seeking Mantra [B. Schneiderman, 1996]:
  - Overview first
  - Zoom and filter (Chapter 13)
  - Details on demand
- Goal of the overview is to **summarize** all of the data
- Want specific **details** about some aspect(s) of the data, need another view/layer
  - May be permanent: side-by-side
  - May be a popup layer: often opaque or separated
- (see textbook Ch. 6.7)



# Overview-Detail View

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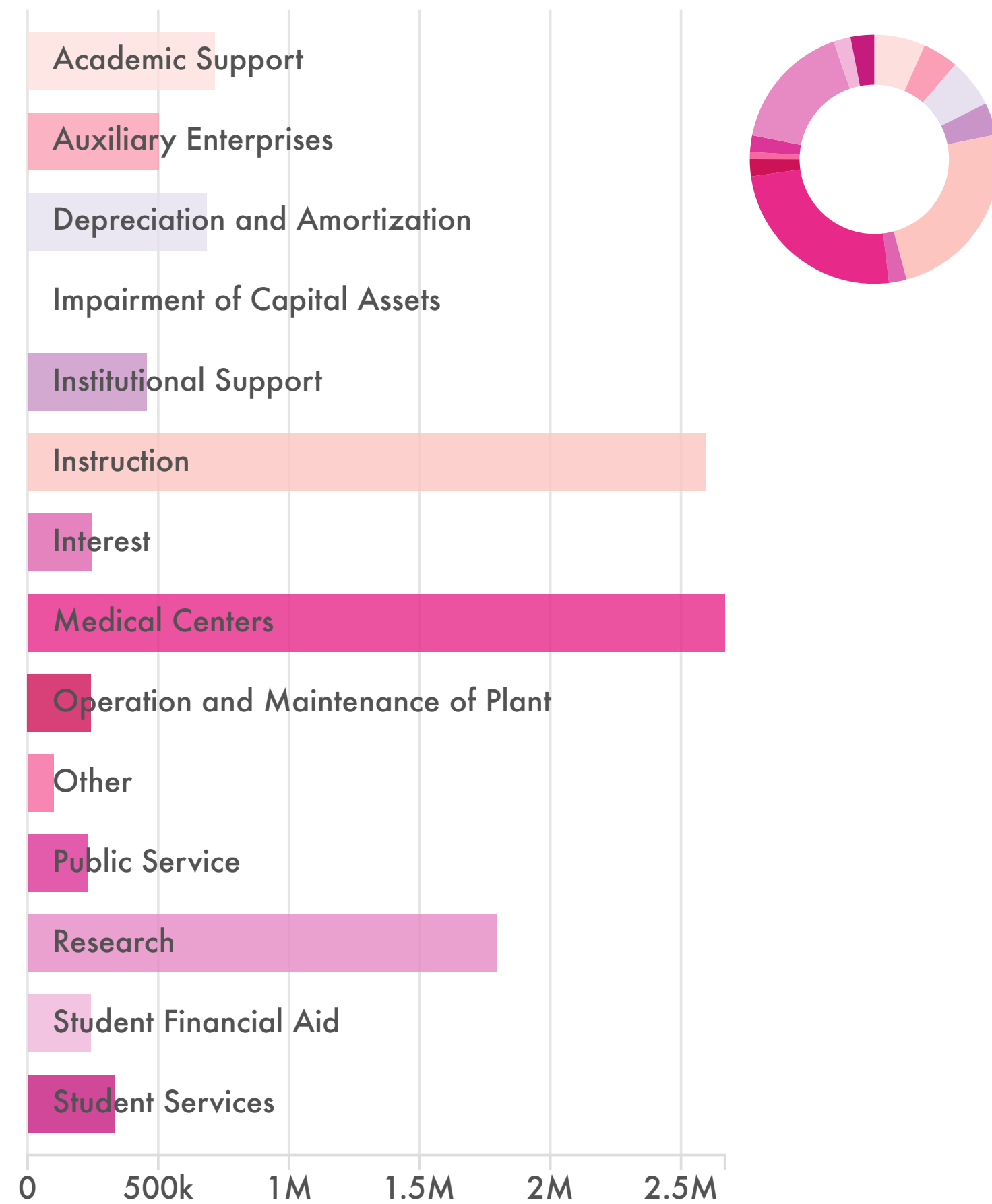


[Wikipedia]

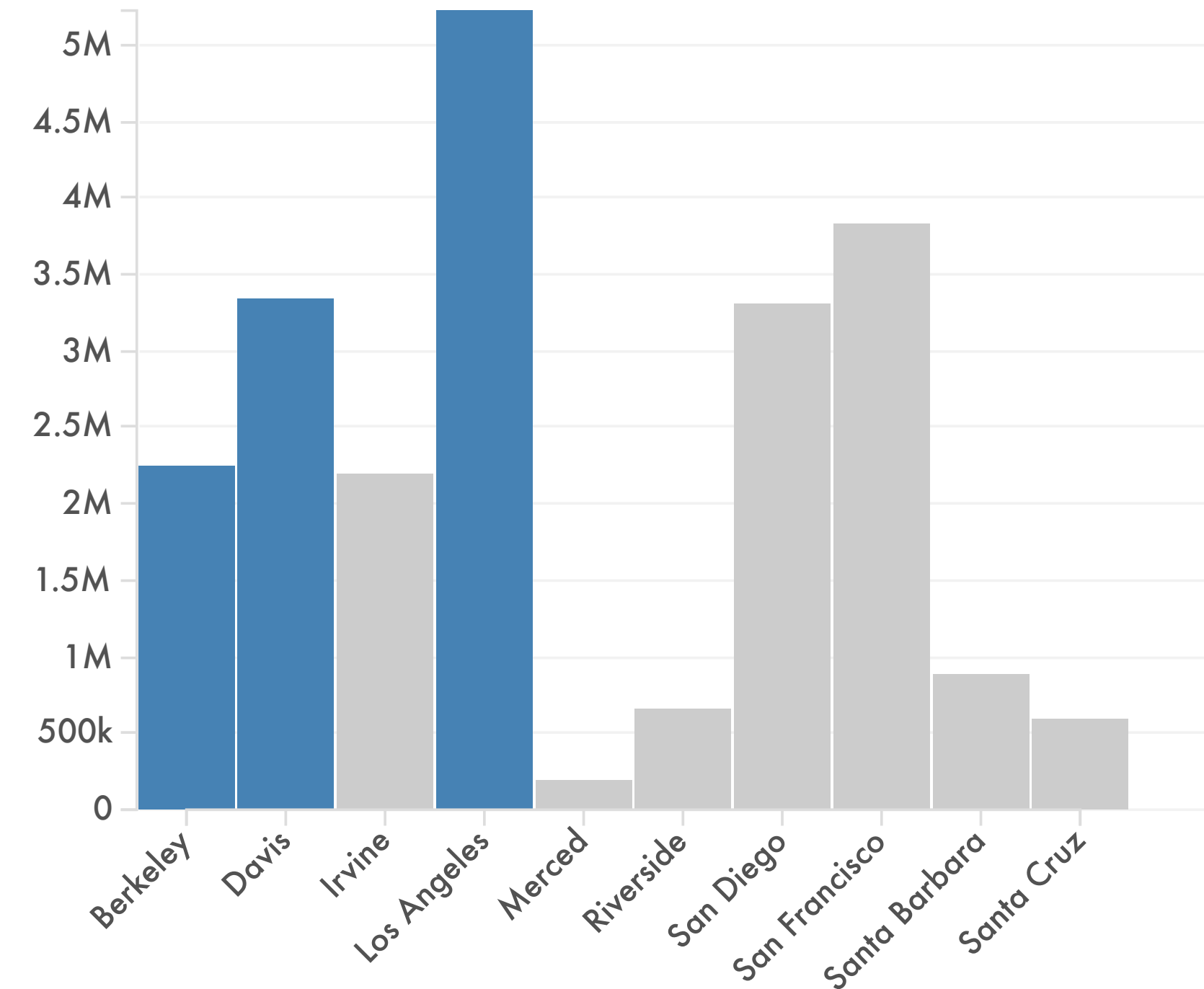


# Overview-Detail (Different Encoding)

EXPENDITURES BY FUNCTION  
(BAR & DONUT)



EXPENDITURES BY CAMPUS  
FY 2012 reset



FIVE-YEAR TREND



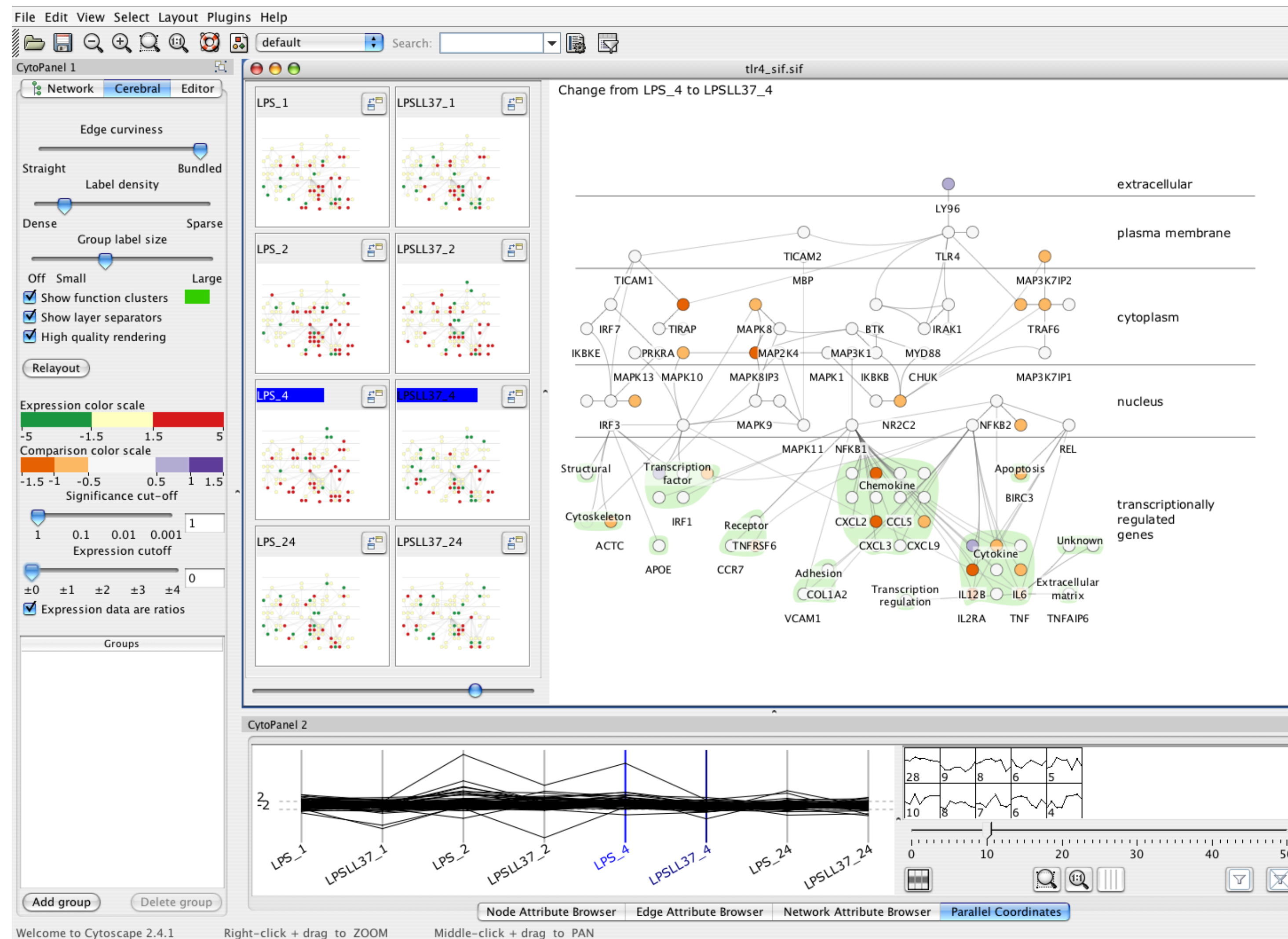
[S. Quigley]

# Overview-Detail (with Zoom-Filter)

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- Detail involves some subset of the full dataset
- Involves user selection or filtering of some type
- How question: includes facet
- Examples:
  - Maps: partition into two views with same encoding, overview-detail
  - UC Trends: partition into multiple views, coordinated with linked highlighting, overview+detail of expenditures

# Multiform & Small Multiples (Cerebral)



[Barsky et al., 2008]



# Navigation across multiple views

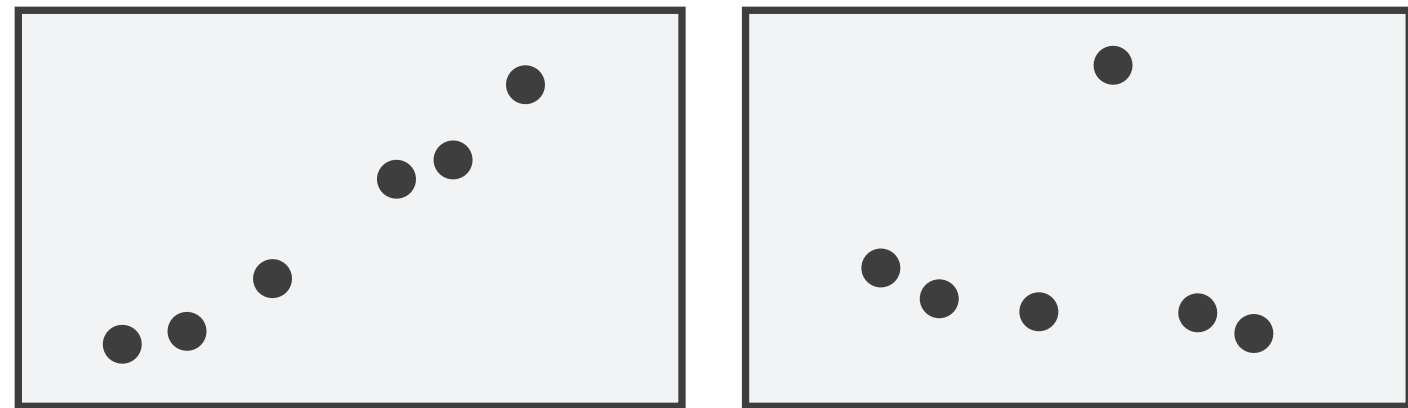
---

- Often navigation in one view updates navigation in another
- Example: Maps: overview shifts as you move around in detail view
- Selections in one view may trigger selections in another

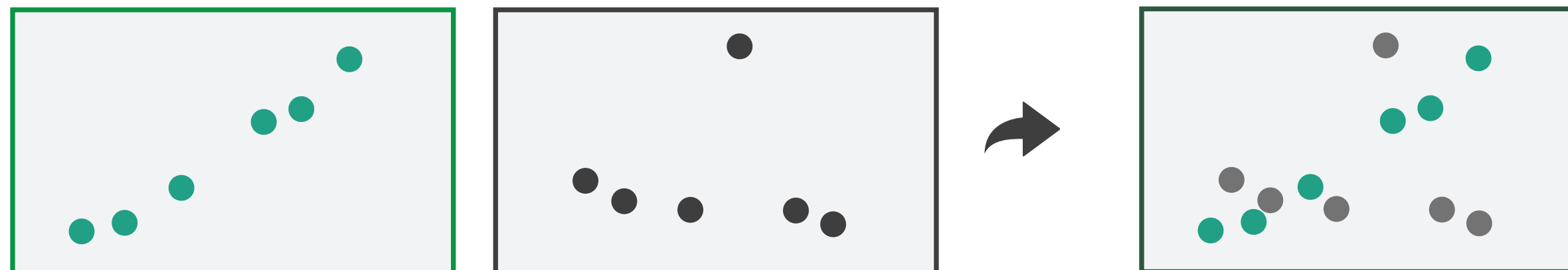


# Multiple Views

## ➔ Partition into Side-by-Side Views



## ➔ Superimpose Layers



[Munzner (ill. Maguire), 2014]

# Partitioned Views

---

- Split dataset into groups and visualize each group
- Extremes: one item per group, one group for all items
- Can be a hierarchy
  - Order: which splits are more "related"?
  - Which attributes are used to split? usually categorical

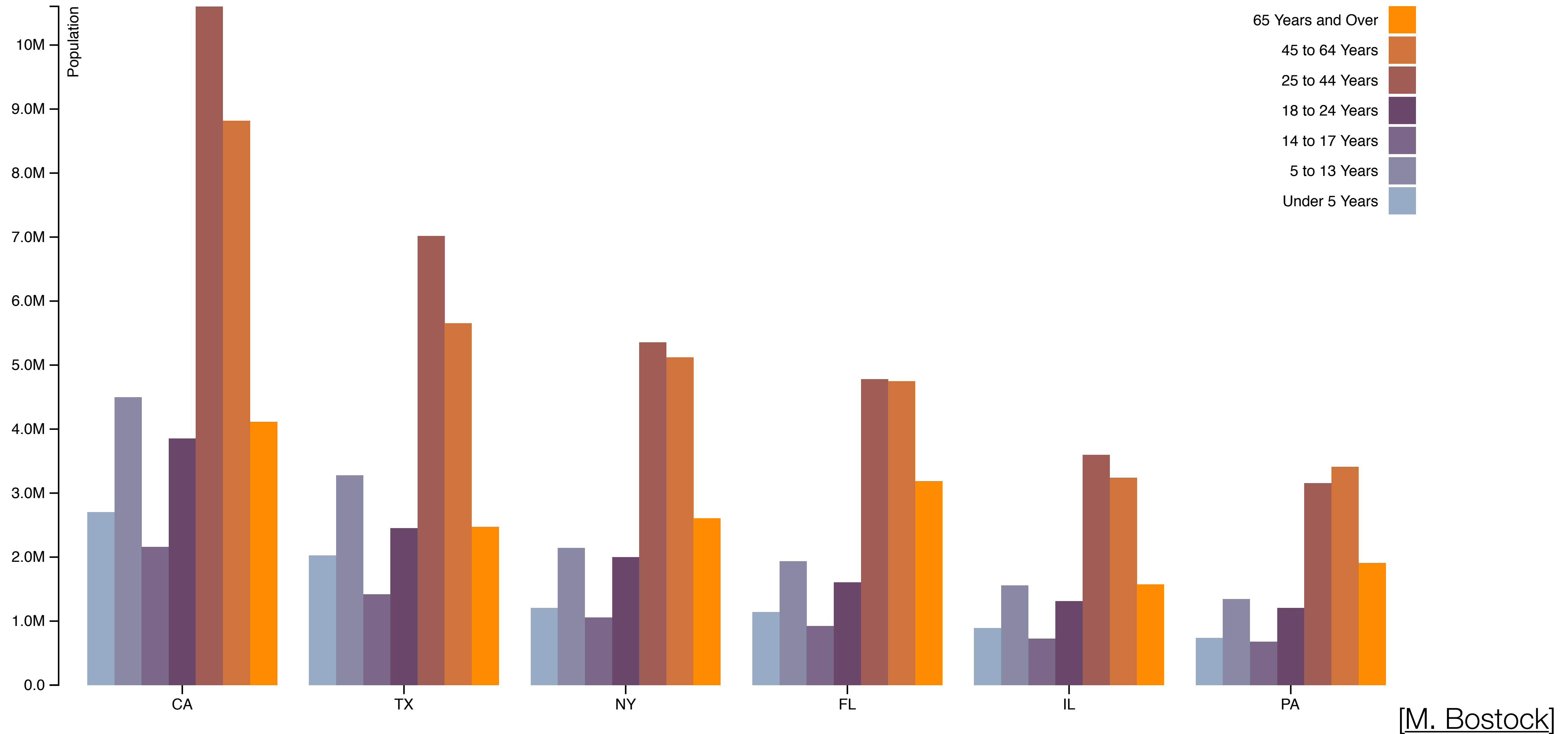
# Glyphs, Views, and Regions

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- Glyphs are composed of multiple marks
- Views are a contiguous region of space
- A region is usually associated with a group of data
- Blurry lines of distinction between them

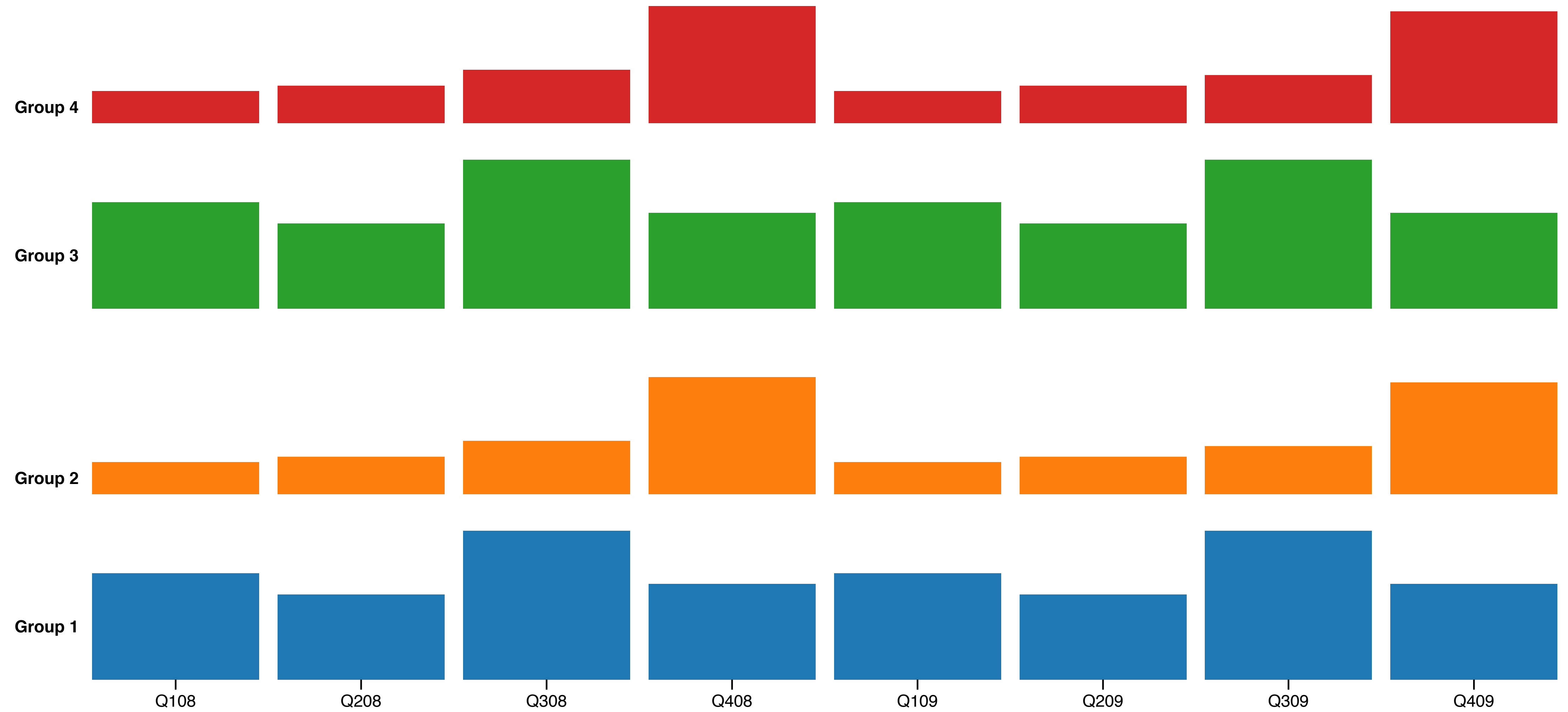


# Example: Grouped Bar Chart





# Example: Small Multiples Bar Chart



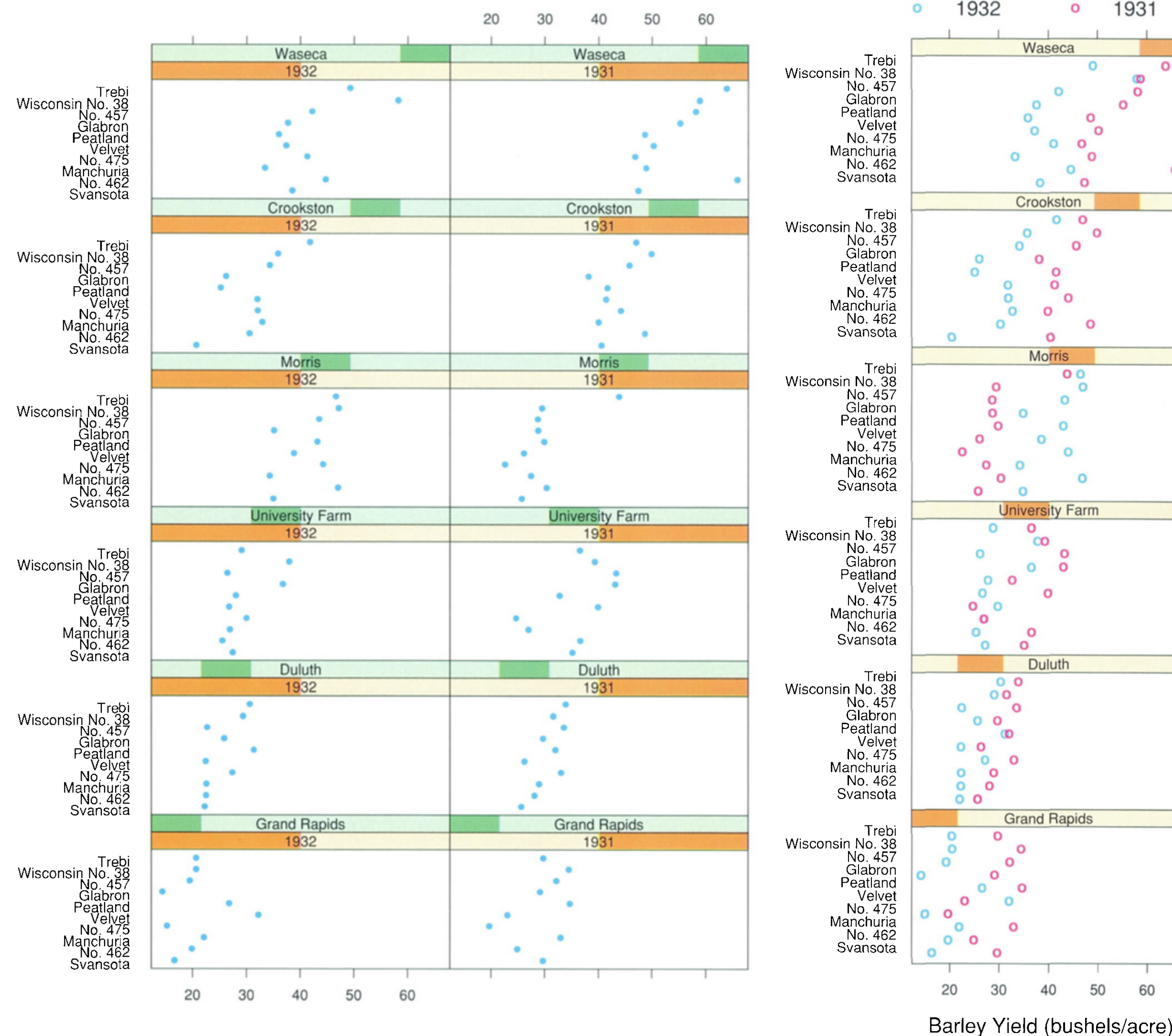
[M. Bostock]

# Matrix Alignment & Recursive Subdivision

---

- Matrix Alignment:
  - regions are placed in a matrix alignment
  - splits go to rows and columns
  - main-effects ordering: use summary statistic to determine order of categorical attribute
- Recursive subdivision:
  - Designed for exploration
  - Involves hierarchy
  - User drives the ways data is broken down in recursive manner

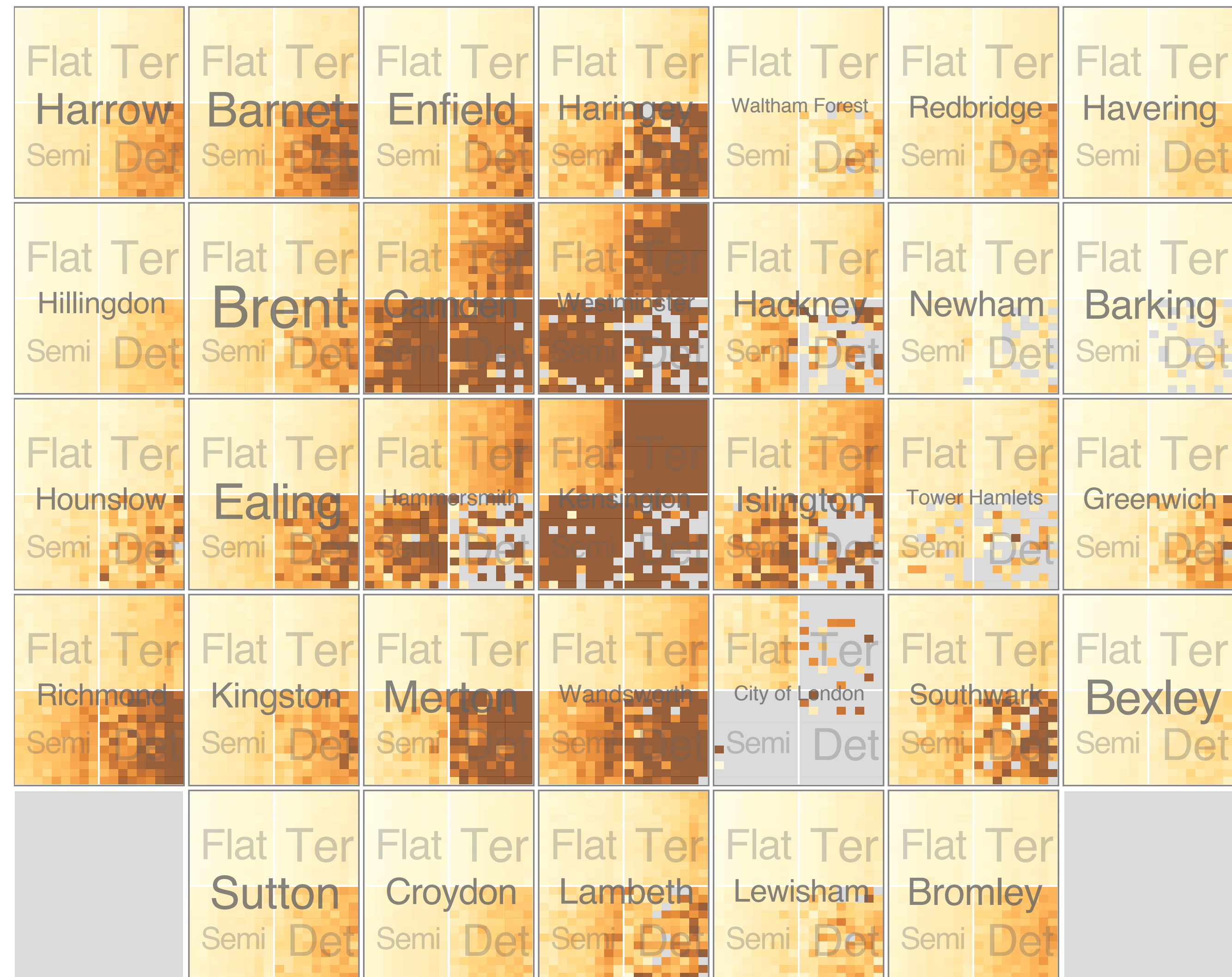
# Example: Trellis Matrix Alignment



[Becker et al., 1996]



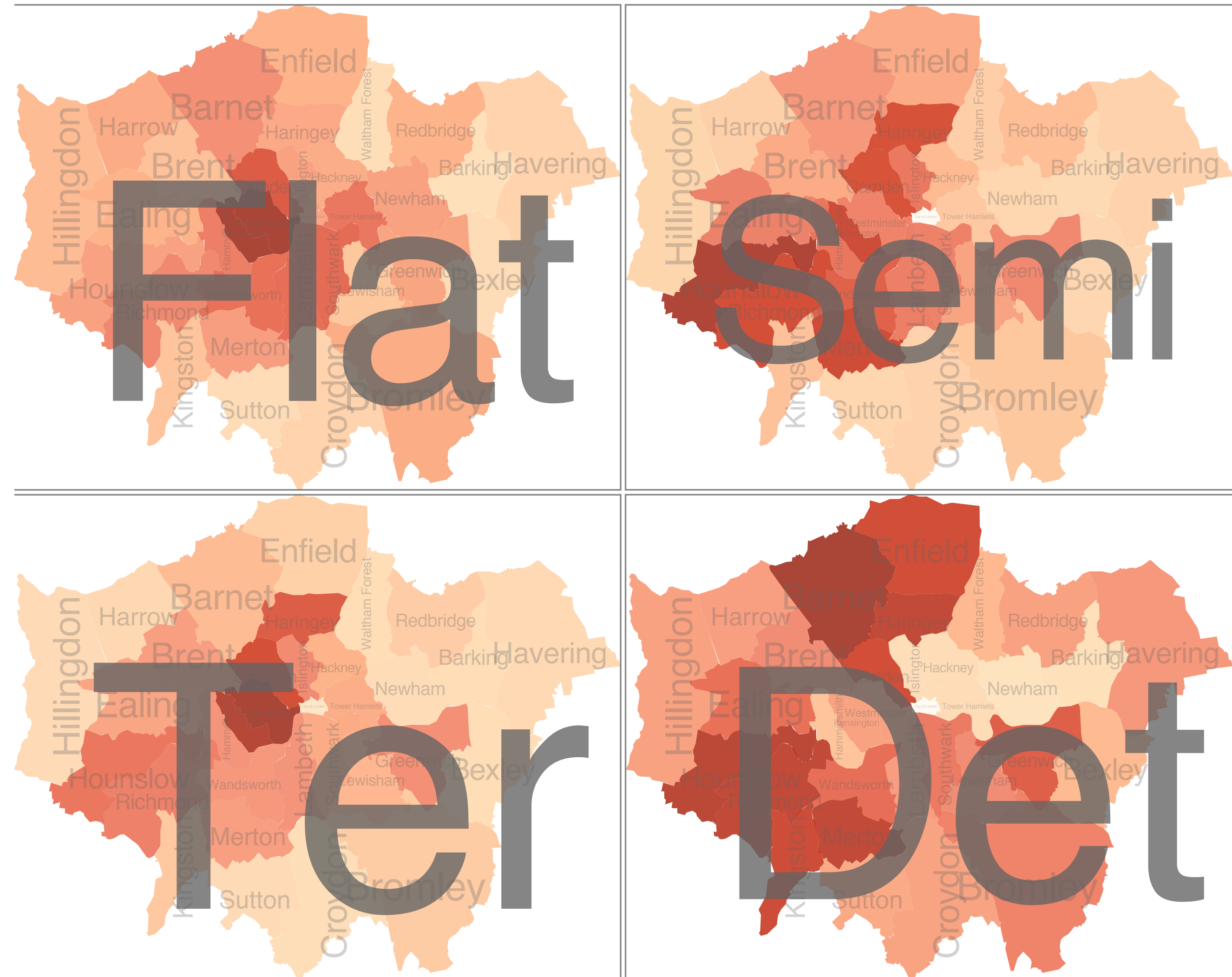
# Example: HiVE System



[Slingsby et al., 2009]



# Example: HiVE System



[Slingsby et al., 2009]



# Reducing Complexity

# Reducing Complexity

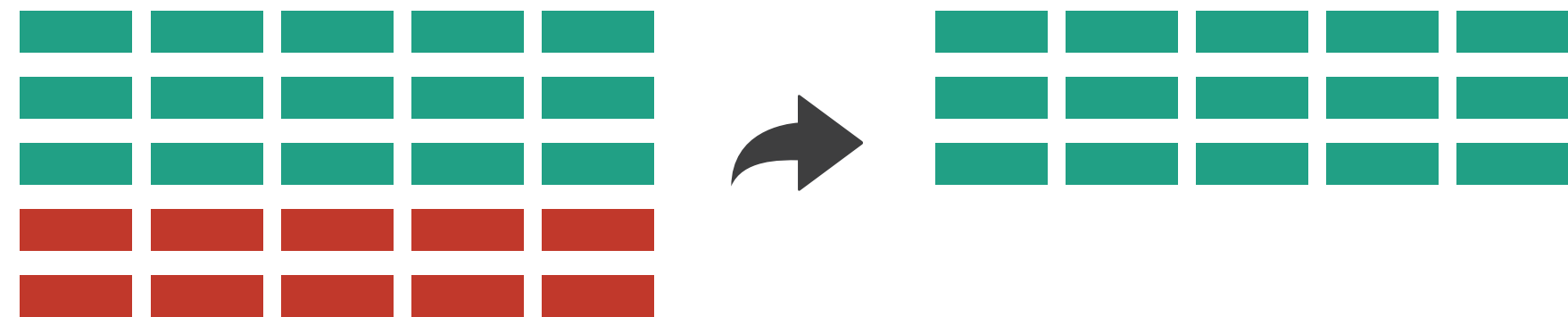
---

- Too many items or attributes lead to visual clutter
- Interaction and Multiple Views can help, but often lose the ability to start understanding an entire dataset at first glance
- **Reduction** techniques show less data to reduce complexity
- Can reduce items or attributes (both are **elements**)
- **Filtering**: eliminate elements from the current view
  - "out of sight, out of mind"
- **Aggregation**: replace elements with a new element that represents the replaced elements
  - summarization is often challenging to design
- Another method is **focus+context**: show details in the context of an overview

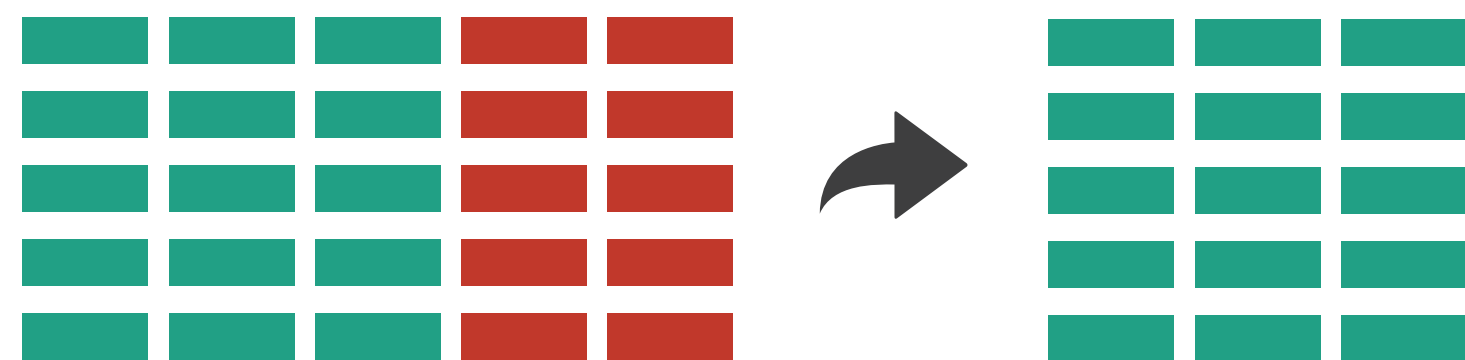
# Overview: Reducing Items & Attributes

## ➔ Filter

➔ Items

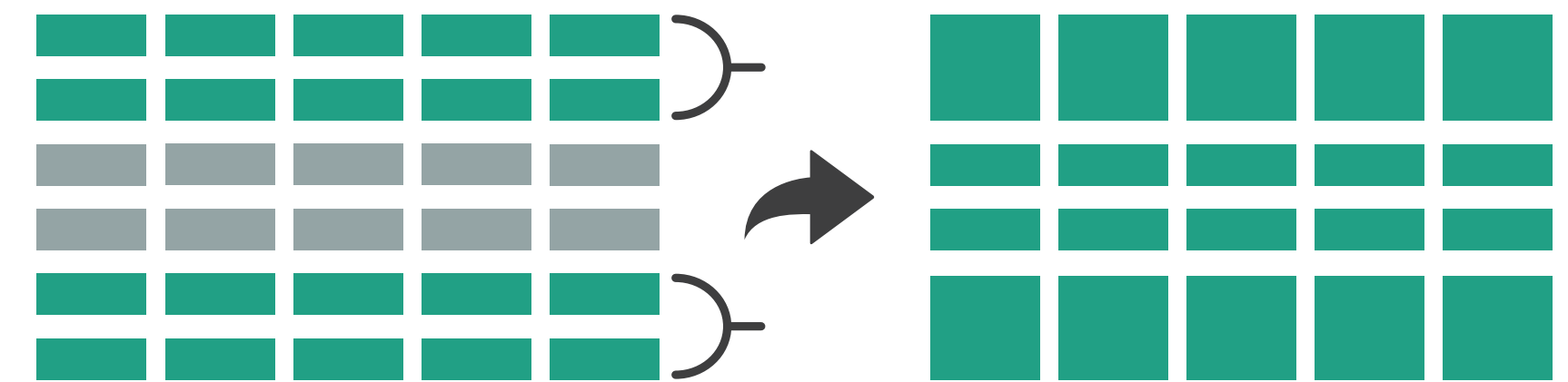


➔ Attributes

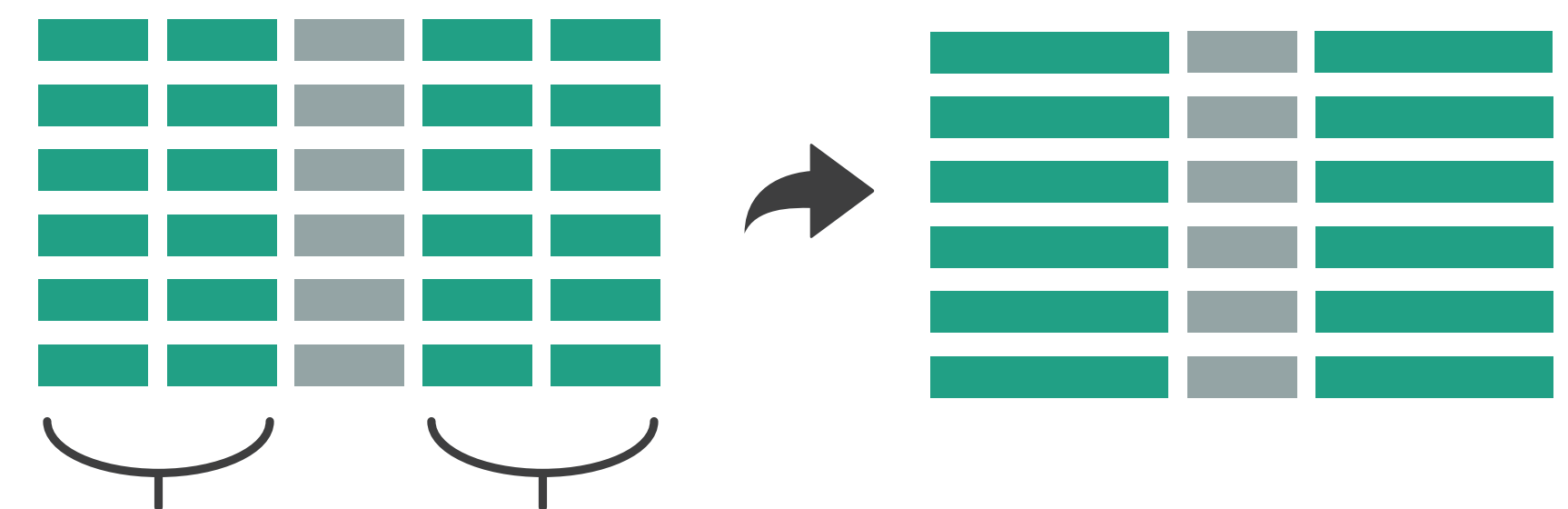


## ➔ Aggregate

➔ Items



➔ Attributes



[Munzner (ill. Maguire), 2014]



# Filtering

---

- Just don't show certain elements
- Item filtering: most common, eliminate marks for filtered items
- Attribute filtering:
  - attributes often mapped to different channels
  - if mapped to same channel, allows many attributes (e.g. parallel coordinates, star plots), can filter
- How to specify which elements?
  - Pre-defined rules
  - User selection

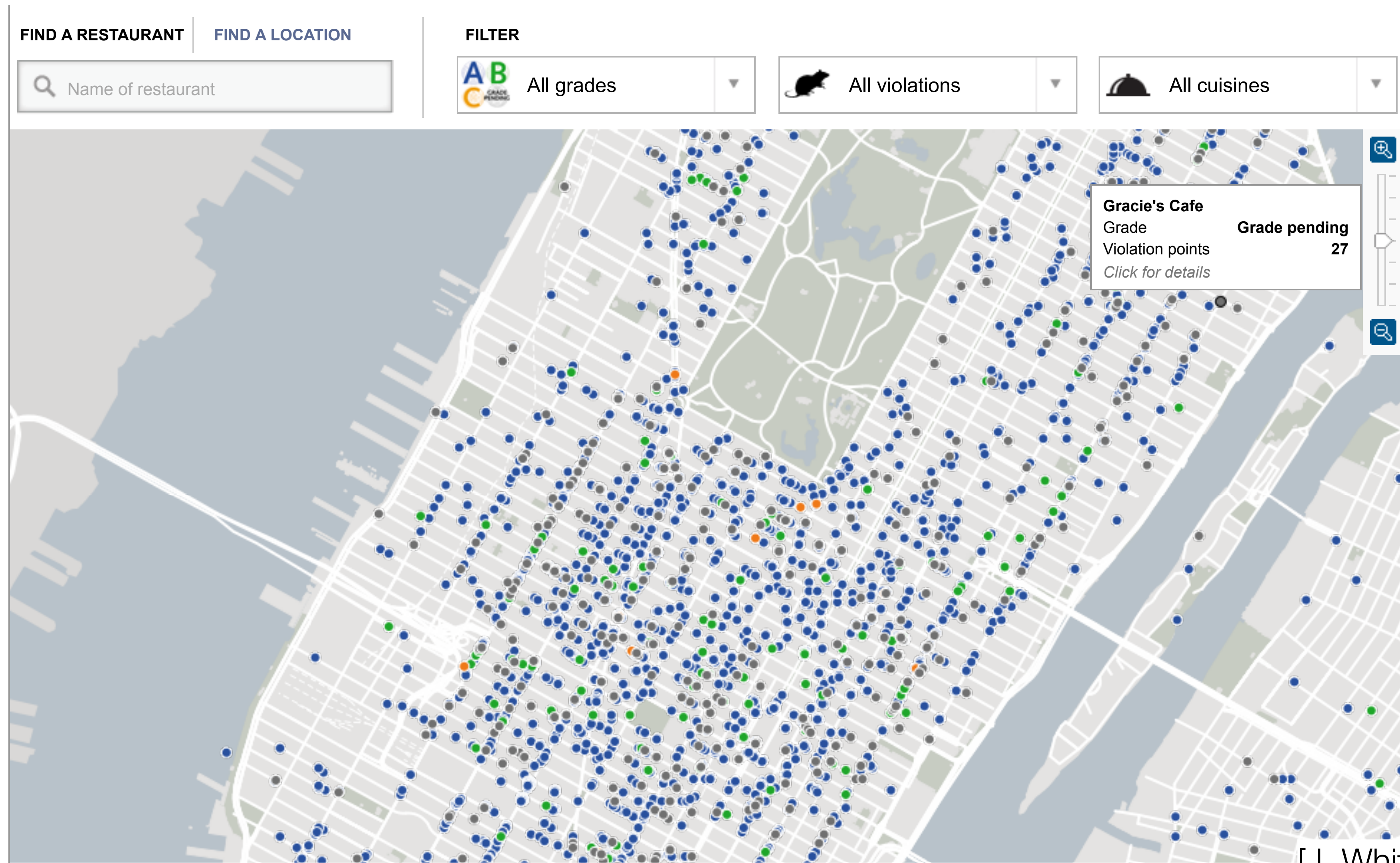
# Filter vs. Query

---

- Queries start with an empty set of items and **add** items
- Filters start with all items and **remove** items



# Example: NYC Health Dept. Restaurant Ratings



[J. White, New York Times]

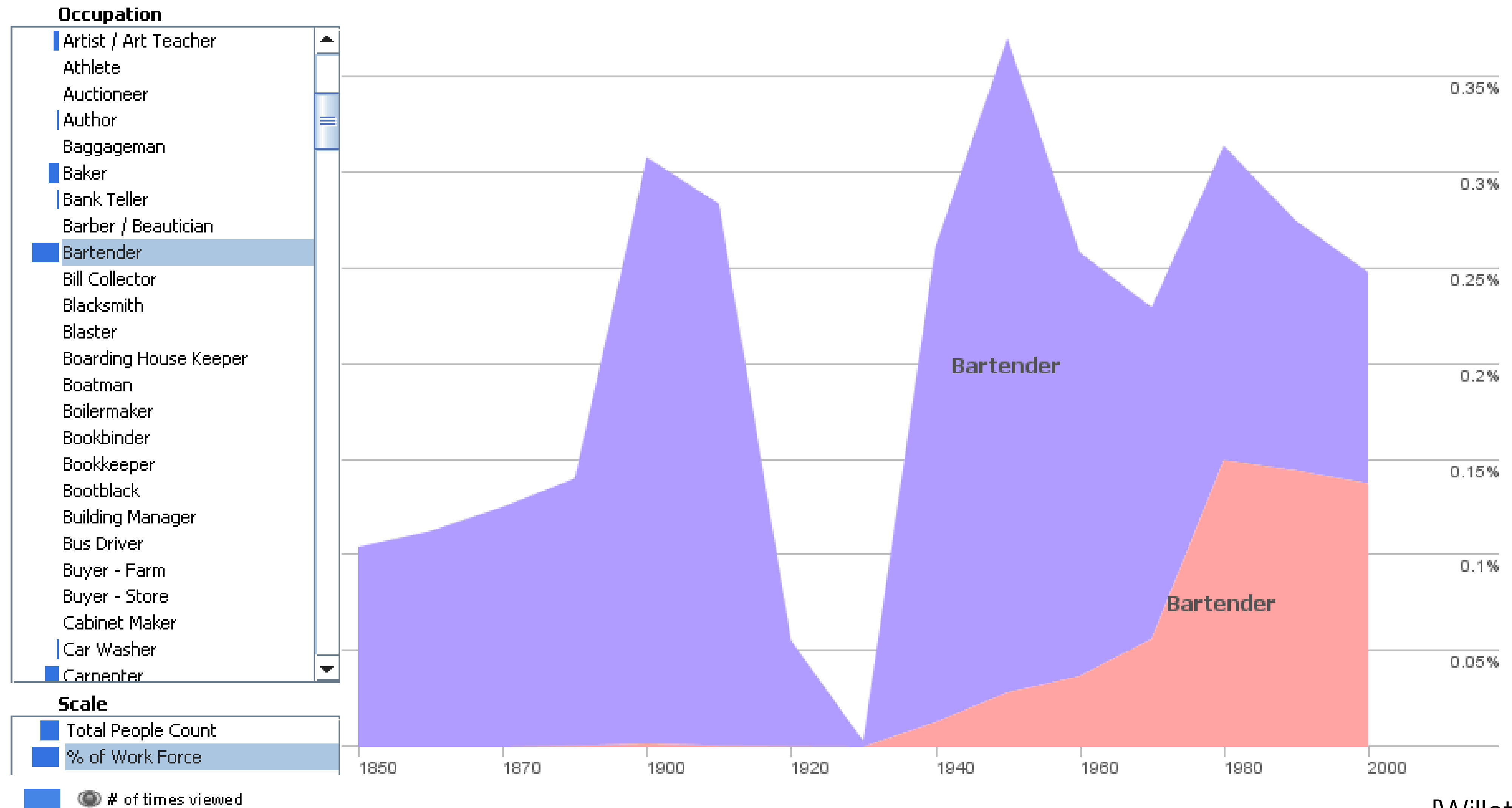
# Dynamic Filters

---

- Interaction need not be with the visualization itself
- Users interact with **widgets** that control which items are shown
  - Sliders, Combo boxes, Text Fields
- Often tied to attribute values
- Examples:
  - All restaurants with an "A" Grade
  - All pizza places
  - All pizza places with an "A" Grade

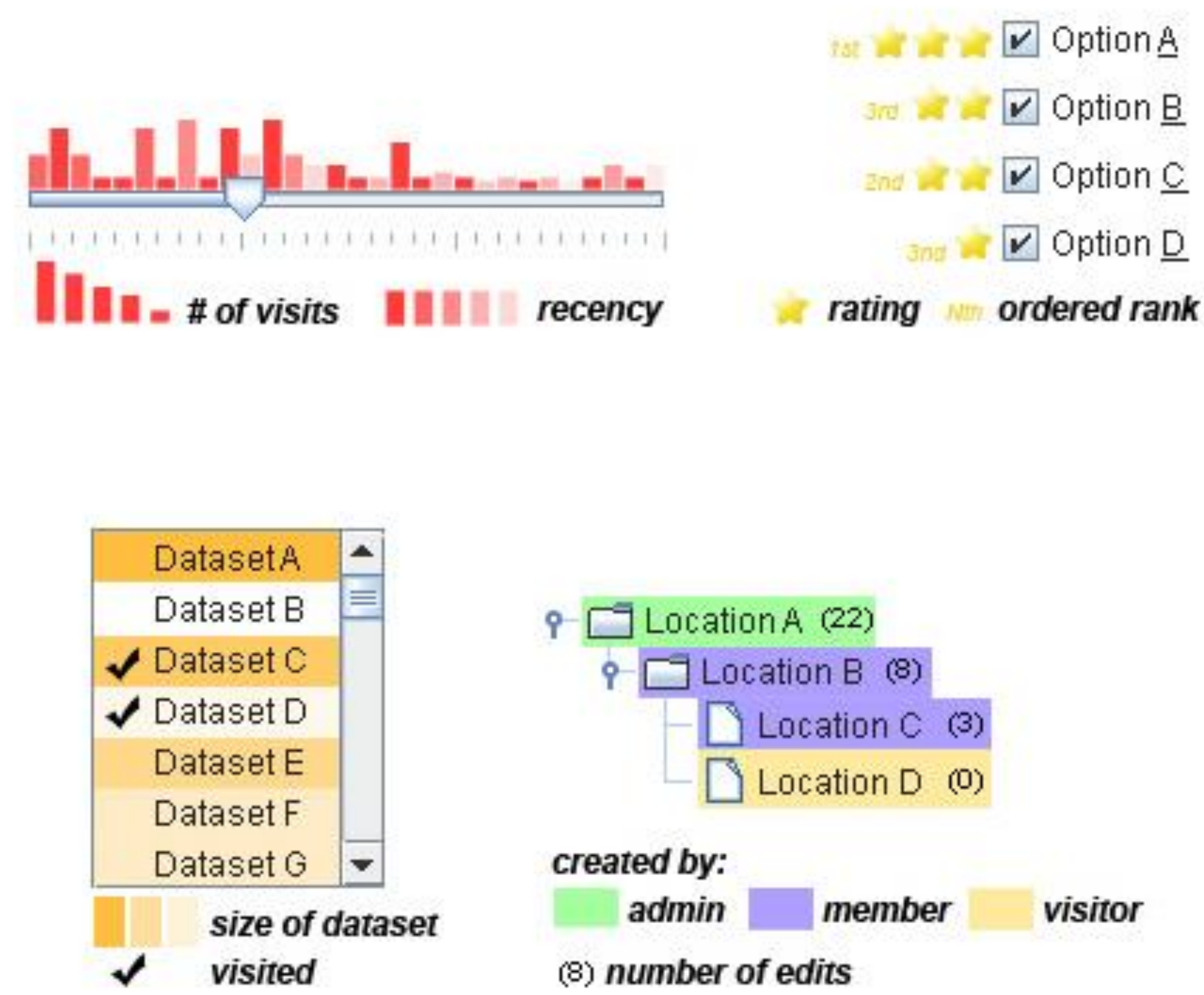


# Scented Widgets



[Willett et al., 2007]

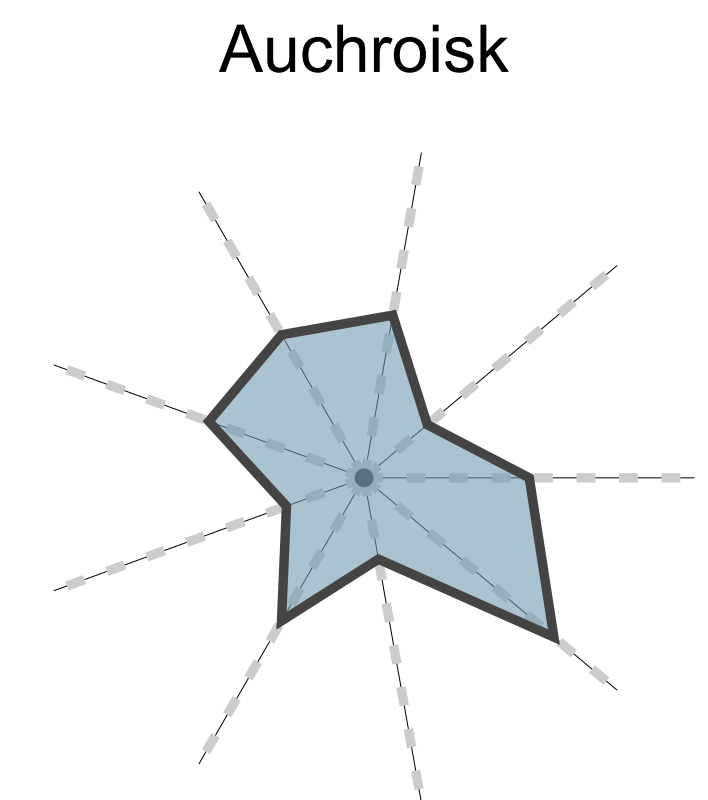
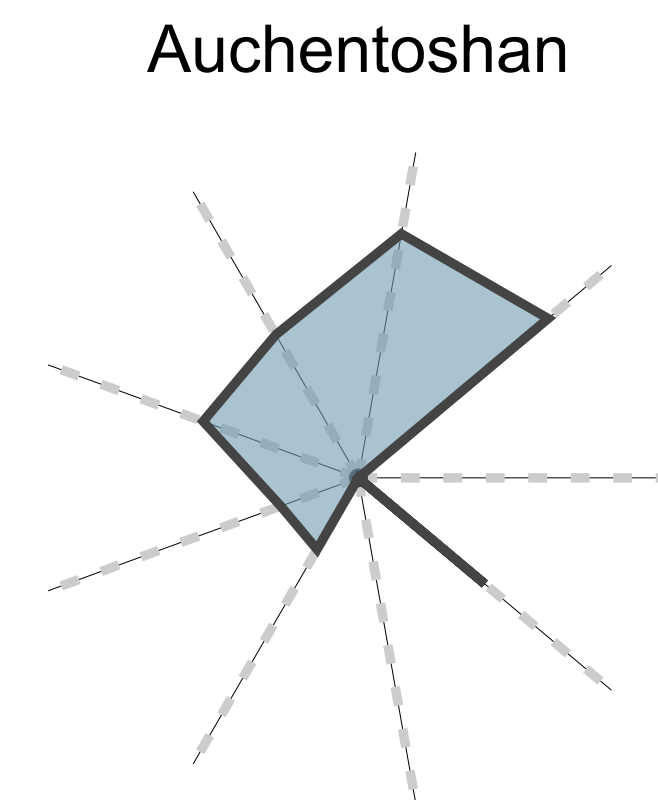
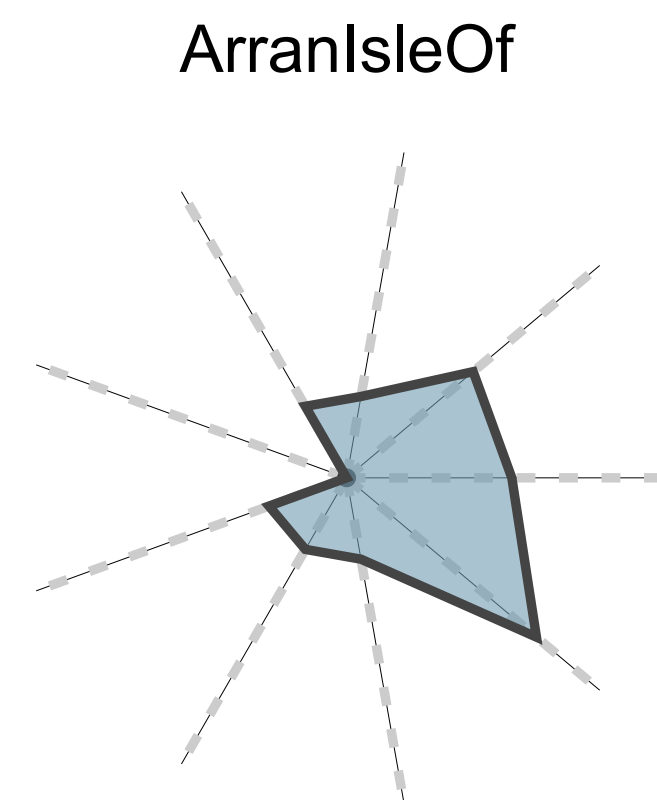
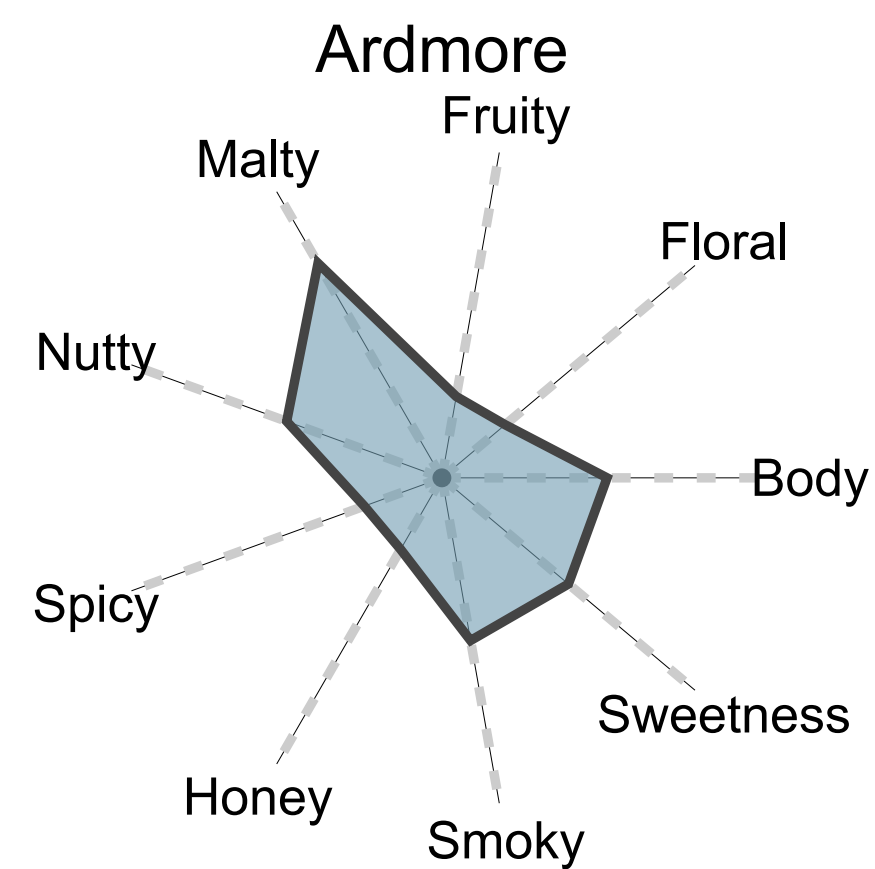
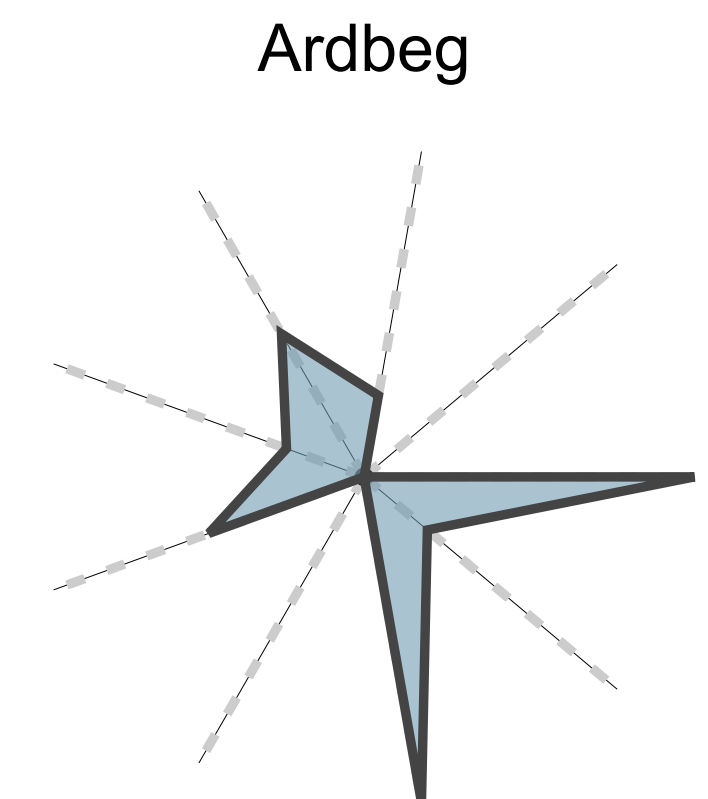
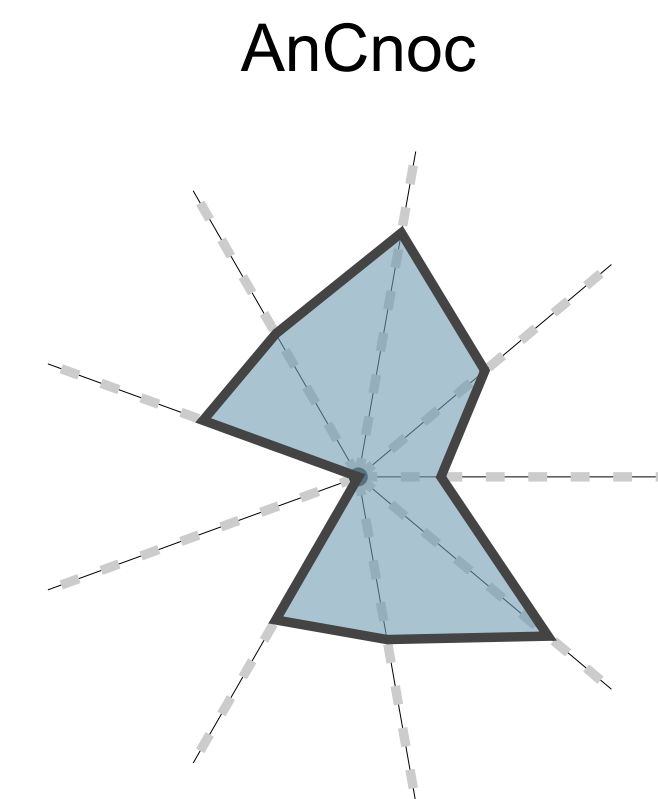
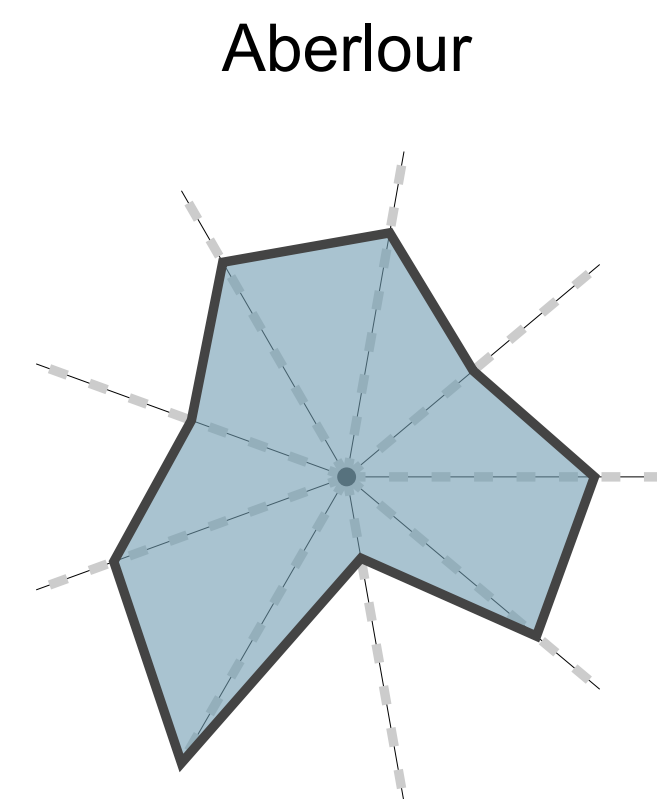
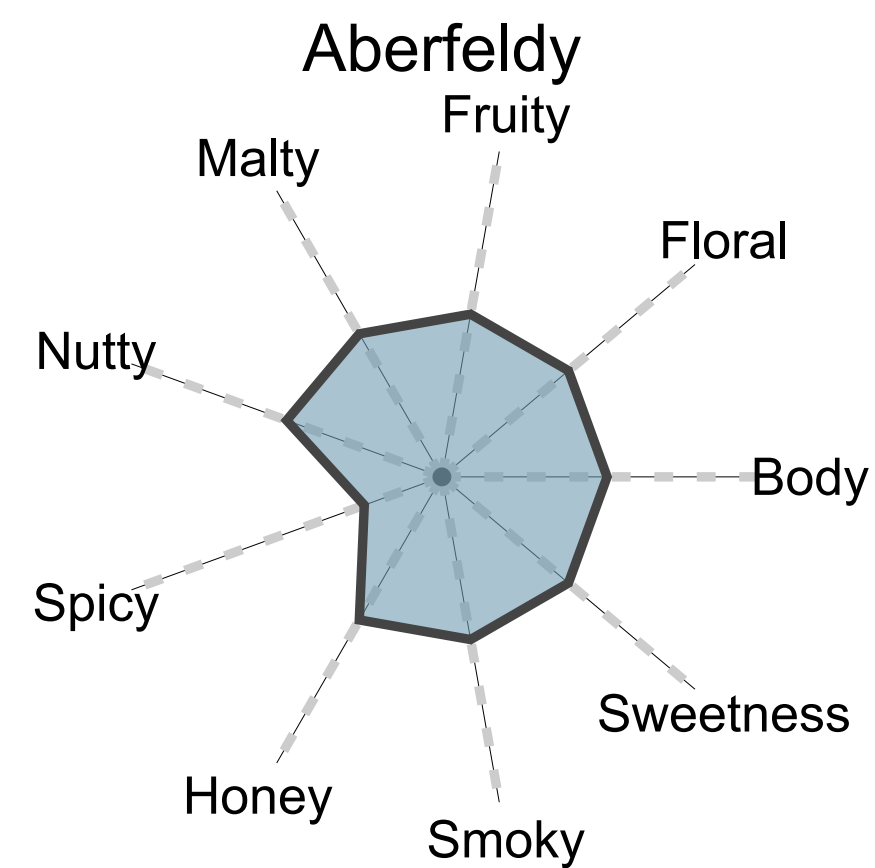
# Scented Widgets



| Name       | Description                                                                | Example |
|------------|----------------------------------------------------------------------------|---------|
| Hue        | Varies the hue of the widget (or of a visualization embedded in it)        |         |
| Saturation | Varies the saturation of the widget (or of a visualization embedded in it) |         |
| Opacity    | Varies the saturation of the widget (or of a visualization embedded in it) |         |
| Text       | Inserts one or more small text figures into the widget                     |         |
| Icon       | Inserts one or more small icons into the widget.                           |         |
| Bar Chart  | Inserts one or more small bar chart visualizations into the widget         |         |
| Line Chart | Inserts one or more small line chart visualizations into the widget        |         |

[Willett et al., 2007]

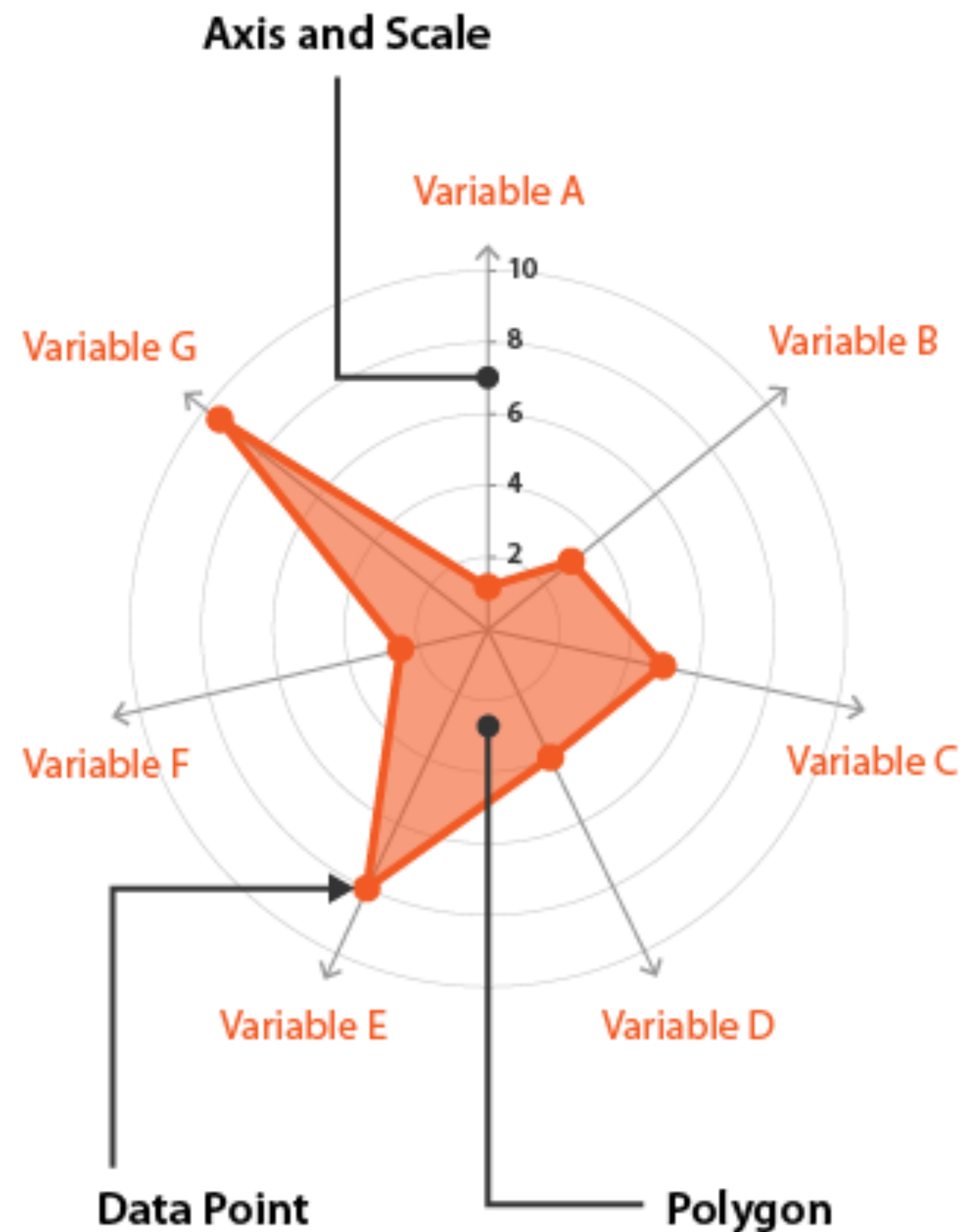
# Star Plots (aka Radar Charts)



[K. Schaul]



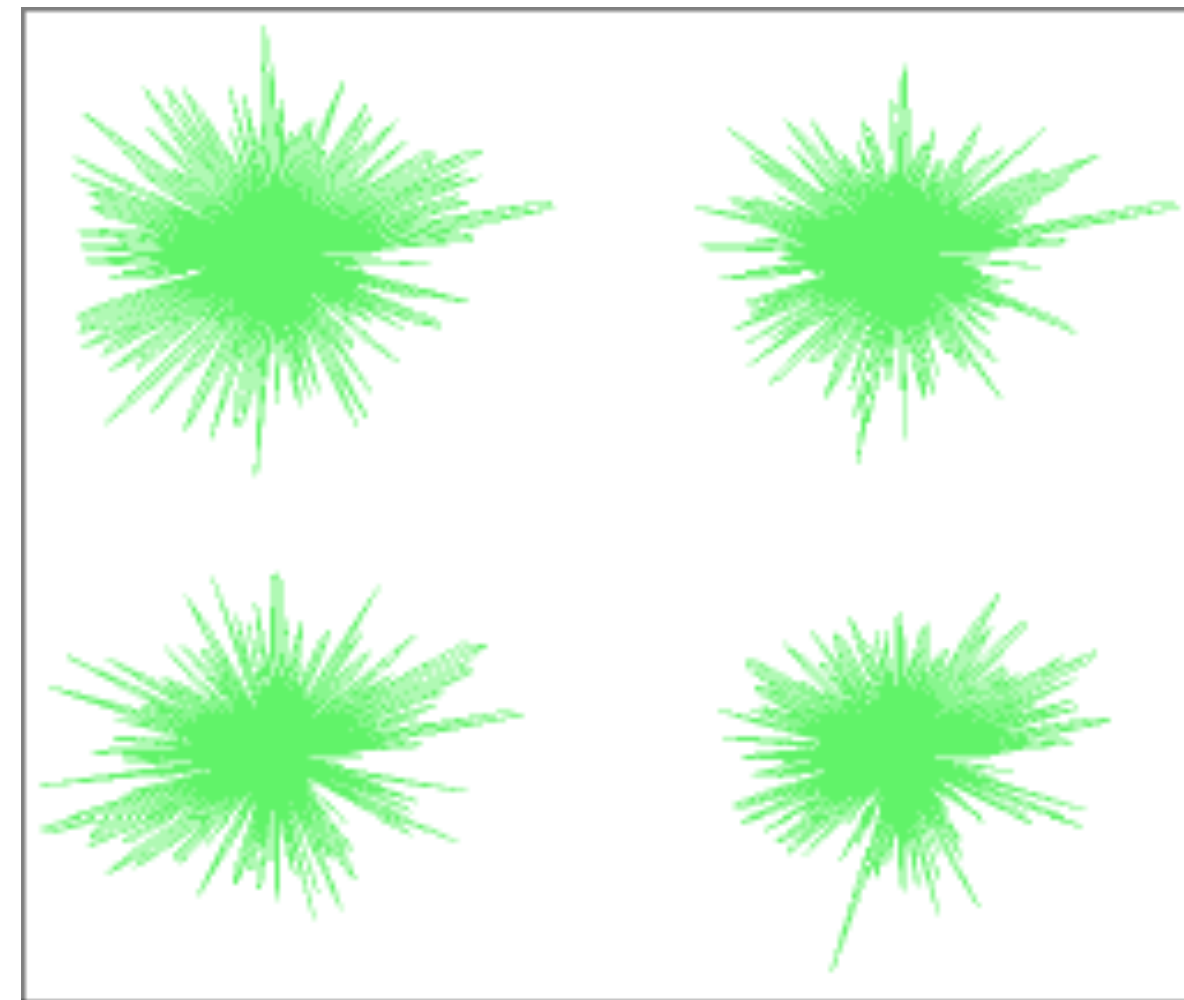
# Star Plot / Radar Chart



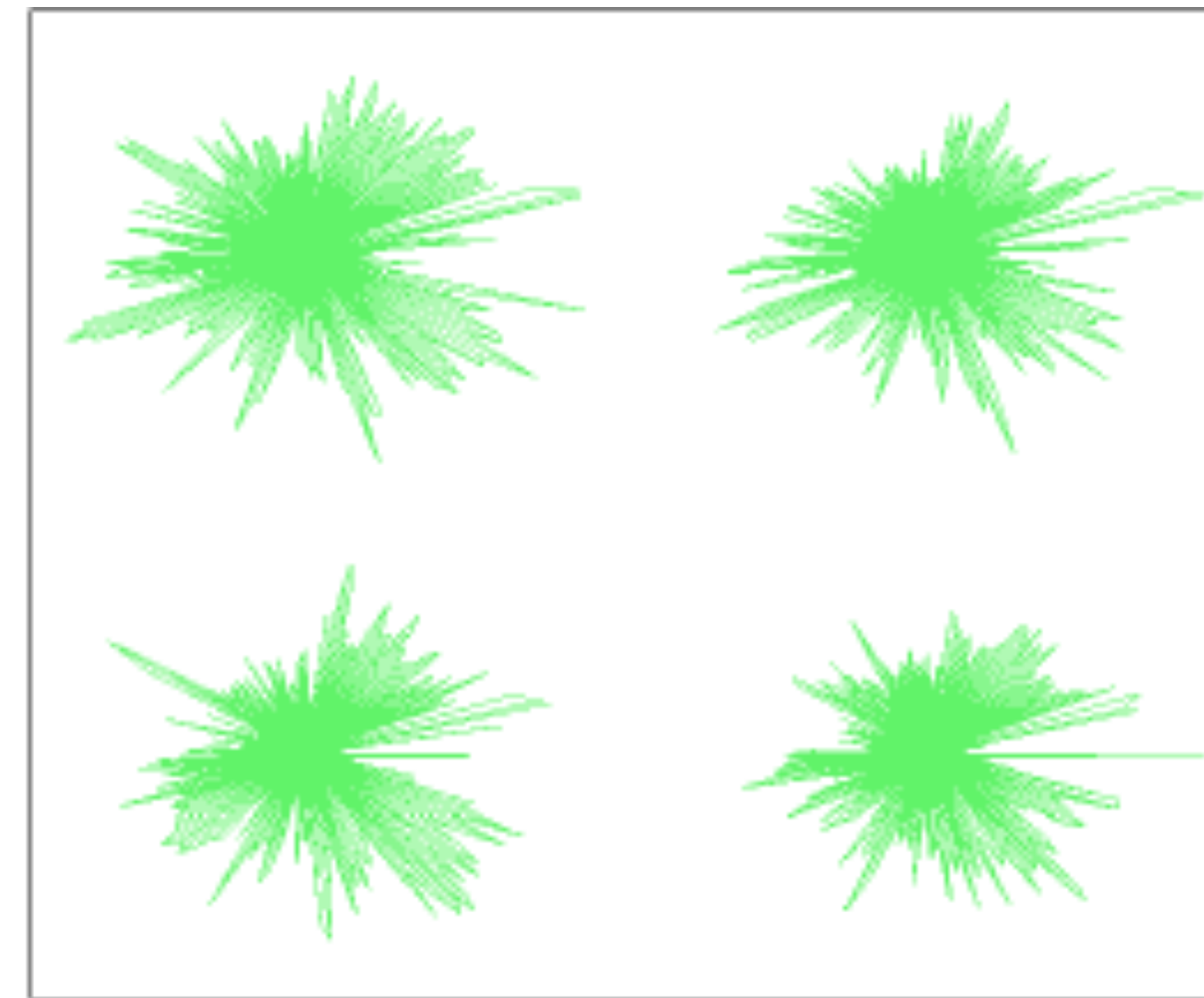
- Use:
  - Compare variables
  - Similarities/differences of items
  - Locate outliers
- Considerations:
  - Order of axes
  - Too many axes cause problems

[S. Ribecca]

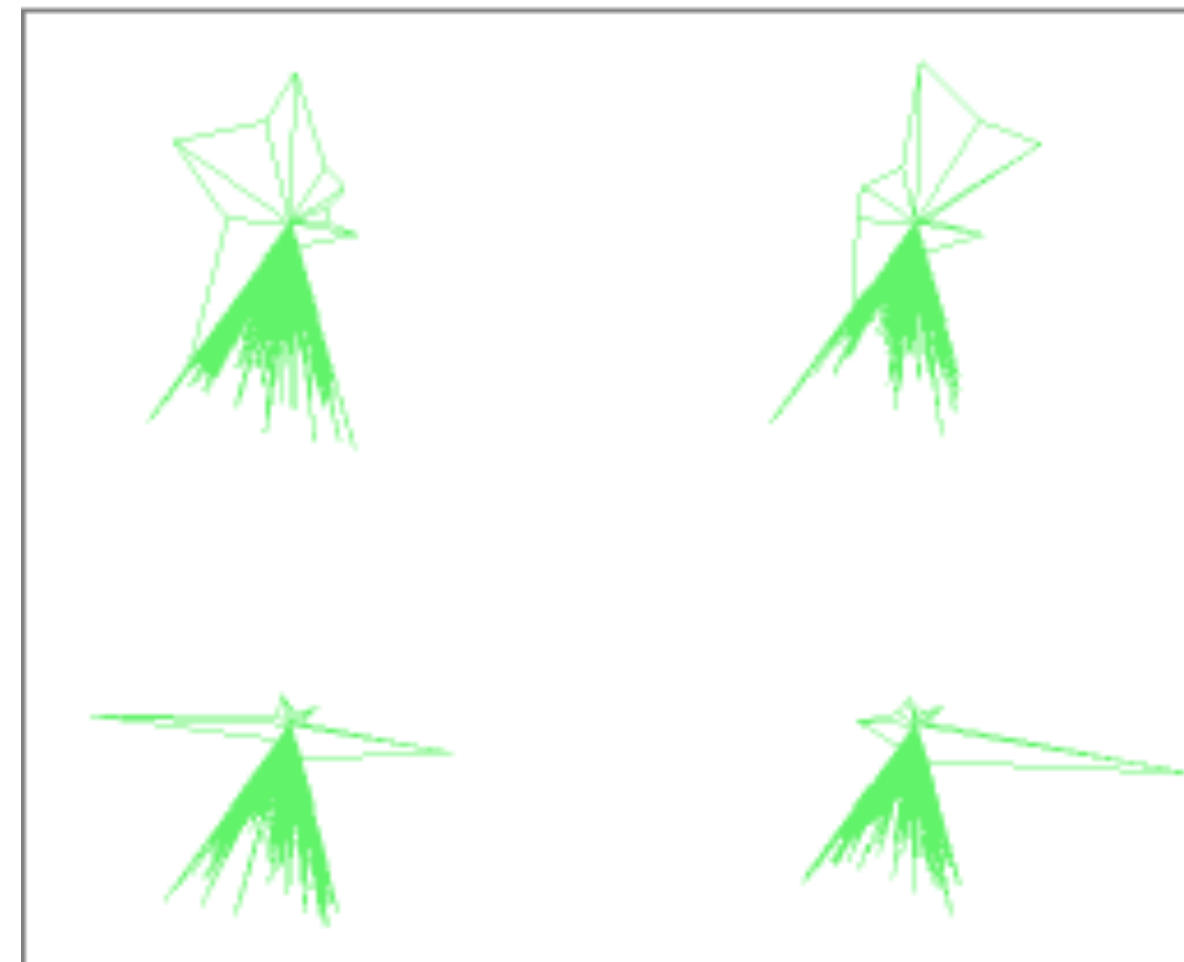
# Attribute Filtering on Star Plots



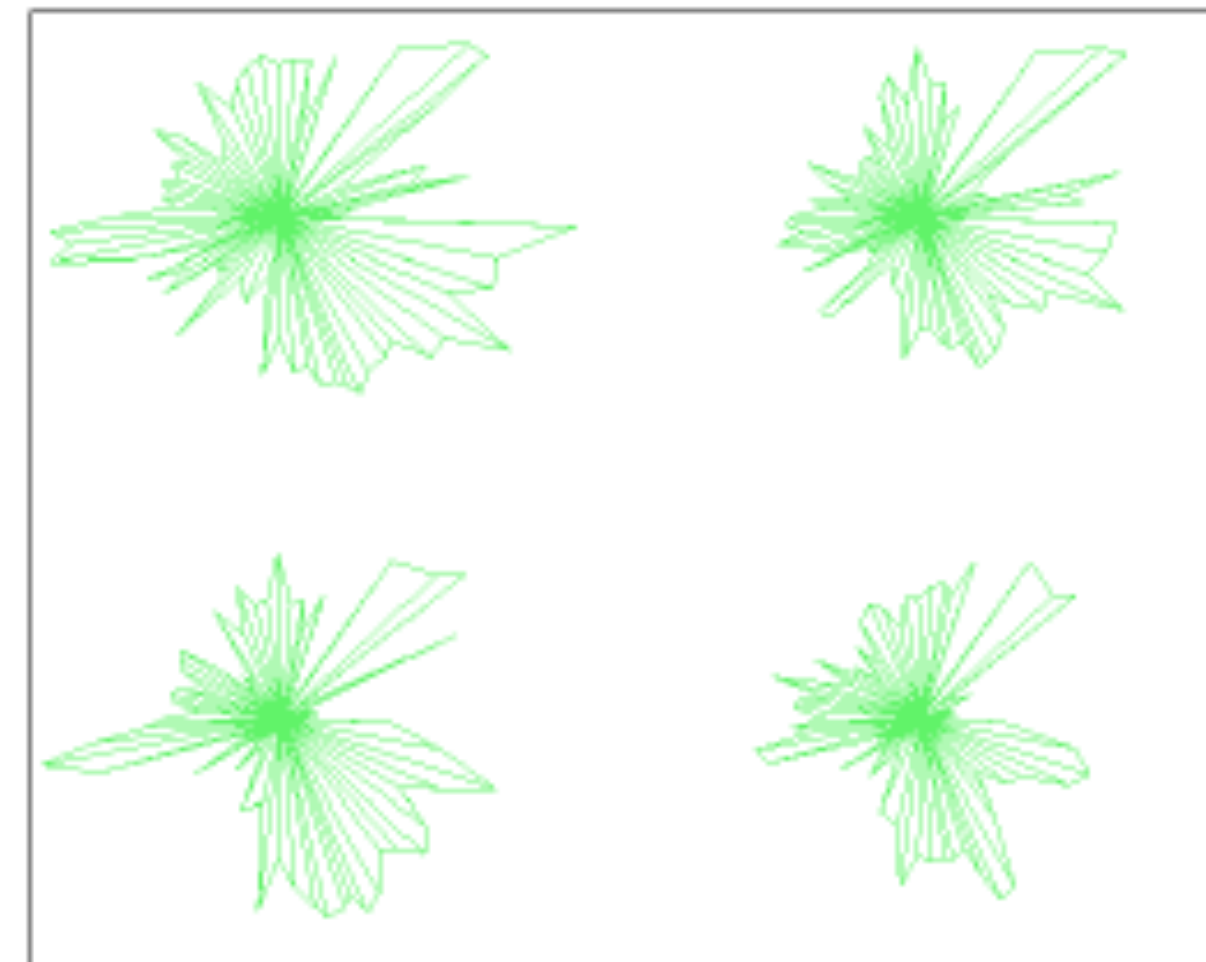
(a)



(b)



(c)



(d)

[Yang et al., 2003]

# Attribute Filtering

---

- How to choose which attributes should be filtered?
  - User selection?
  - Statistics: similarity measures, attributes with low variance are not as interesting when comparing items
- Can be combined with item filtering



# Aggregation

- Usually involves **derived** attributes
- Examples: mean, median, mode, min, max, count, sum
- Remember expressiveness principle: still want to avoid implying trends or similarities based on aggregation

| I    |       | II   |      | III  |       | IV   |       |
|------|-------|------|------|------|-------|------|-------|
| x    | y     | x    | y    | x    | y     | x    | y     |
| 10.0 | 8.04  | 10.0 | 9.14 | 10.0 | 7.46  | 8.0  | 6.58  |
| 8.0  | 6.95  | 8.0  | 8.14 | 8.0  | 6.77  | 8.0  | 5.76  |
| 13.0 | 7.58  | 13.0 | 8.74 | 13.0 | 12.74 | 8.0  | 7.71  |
| 9.0  | 8.81  | 9.0  | 8.77 | 9.0  | 7.11  | 8.0  | 8.84  |
| 11.0 | 8.33  | 11.0 | 9.26 | 11.0 | 7.81  | 8.0  | 8.47  |
| 14.0 | 9.96  | 14.0 | 8.10 | 14.0 | 8.84  | 8.0  | 7.04  |
| 6.0  | 7.24  | 6.0  | 6.13 | 6.0  | 6.08  | 8.0  | 5.25  |
| 4.0  | 4.26  | 4.0  | 3.10 | 4.0  | 5.39  | 19.0 | 12.50 |
| 12.0 | 10.84 | 12.0 | 9.13 | 12.0 | 8.15  | 8.0  | 5.56  |
| 7.0  | 4.82  | 7.0  | 7.26 | 7.0  | 6.42  | 8.0  | 7.91  |
| 5.0  | 5.68  | 5.0  | 4.74 | 5.0  | 5.73  | 8.0  | 6.89  |



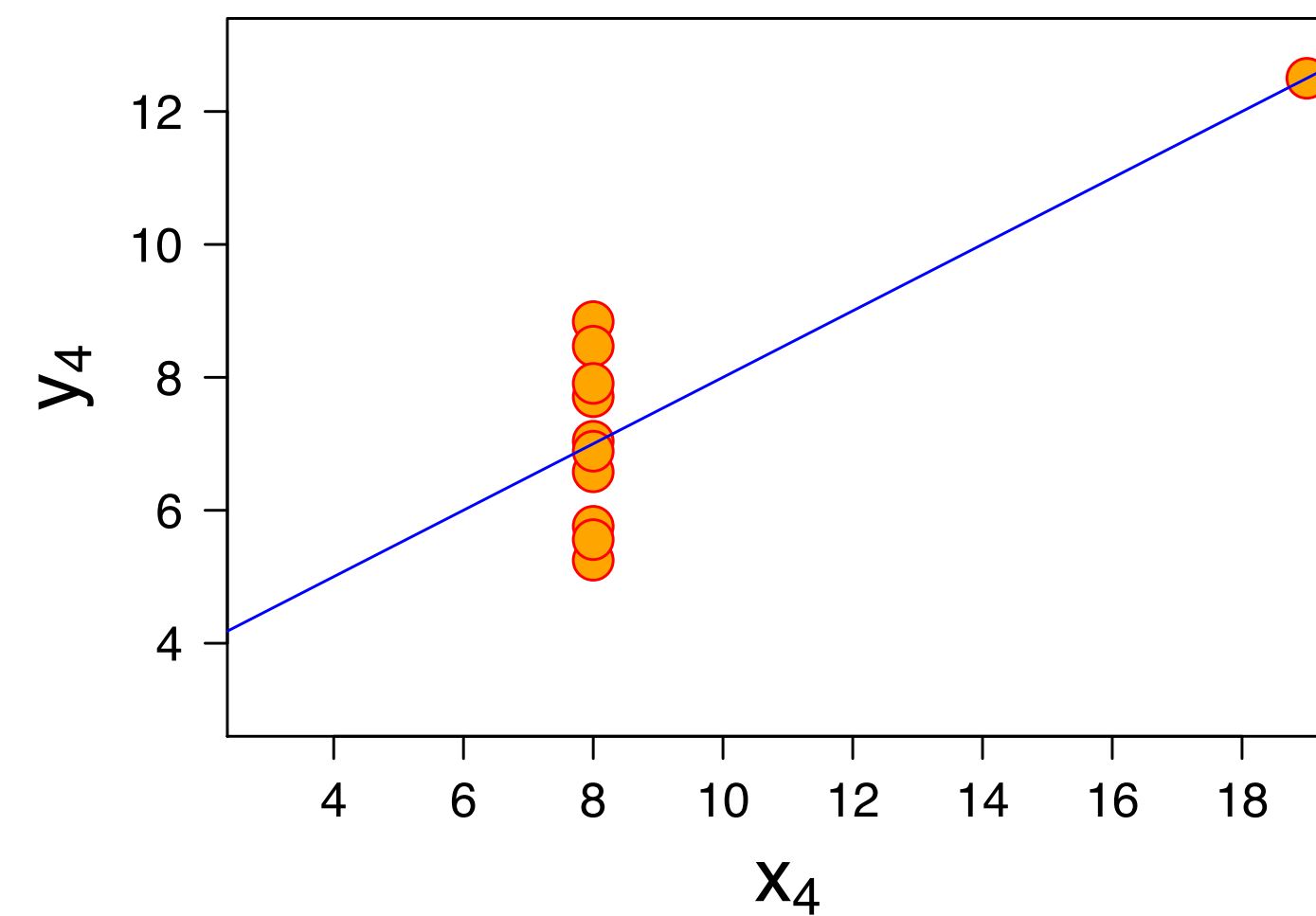
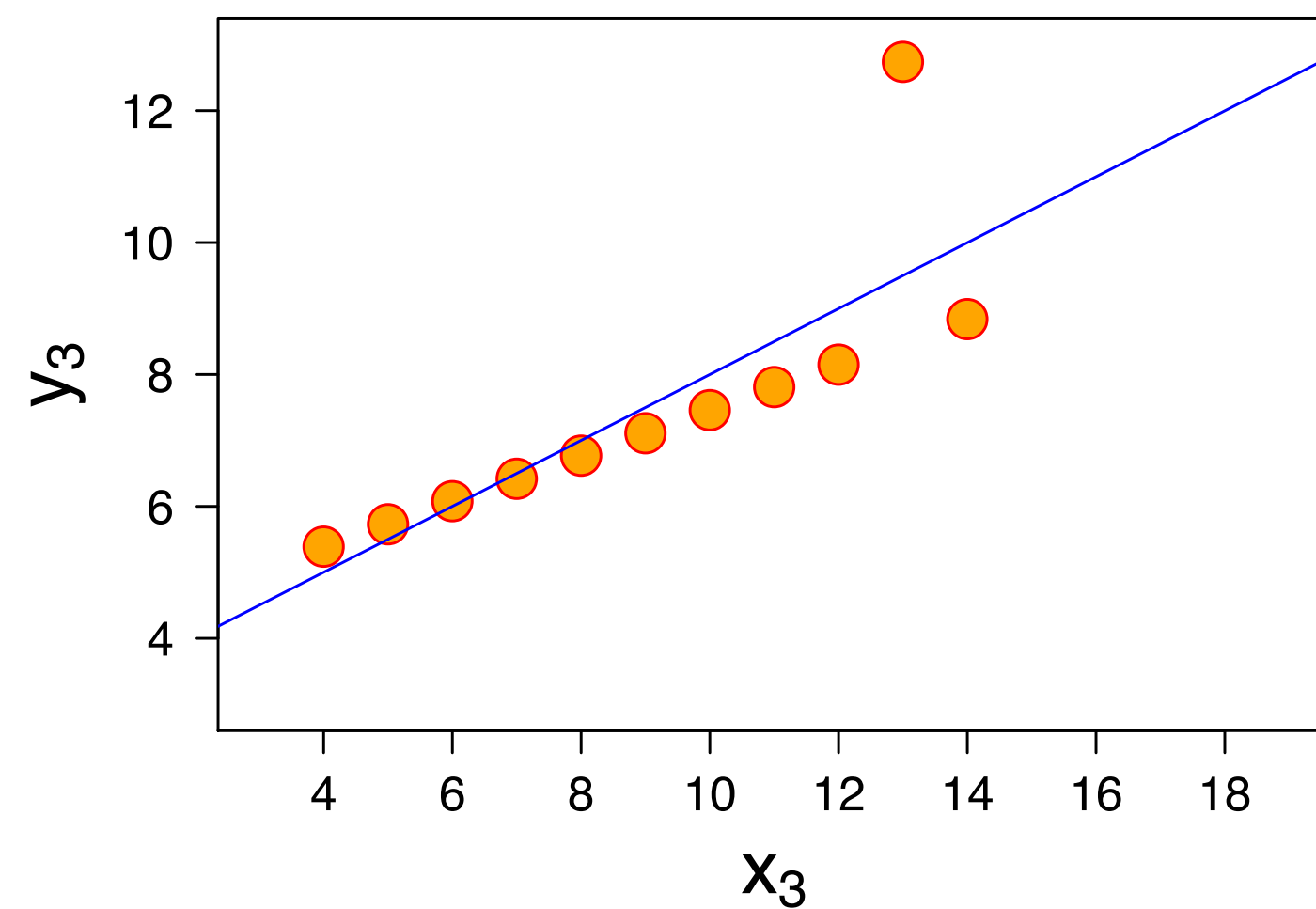
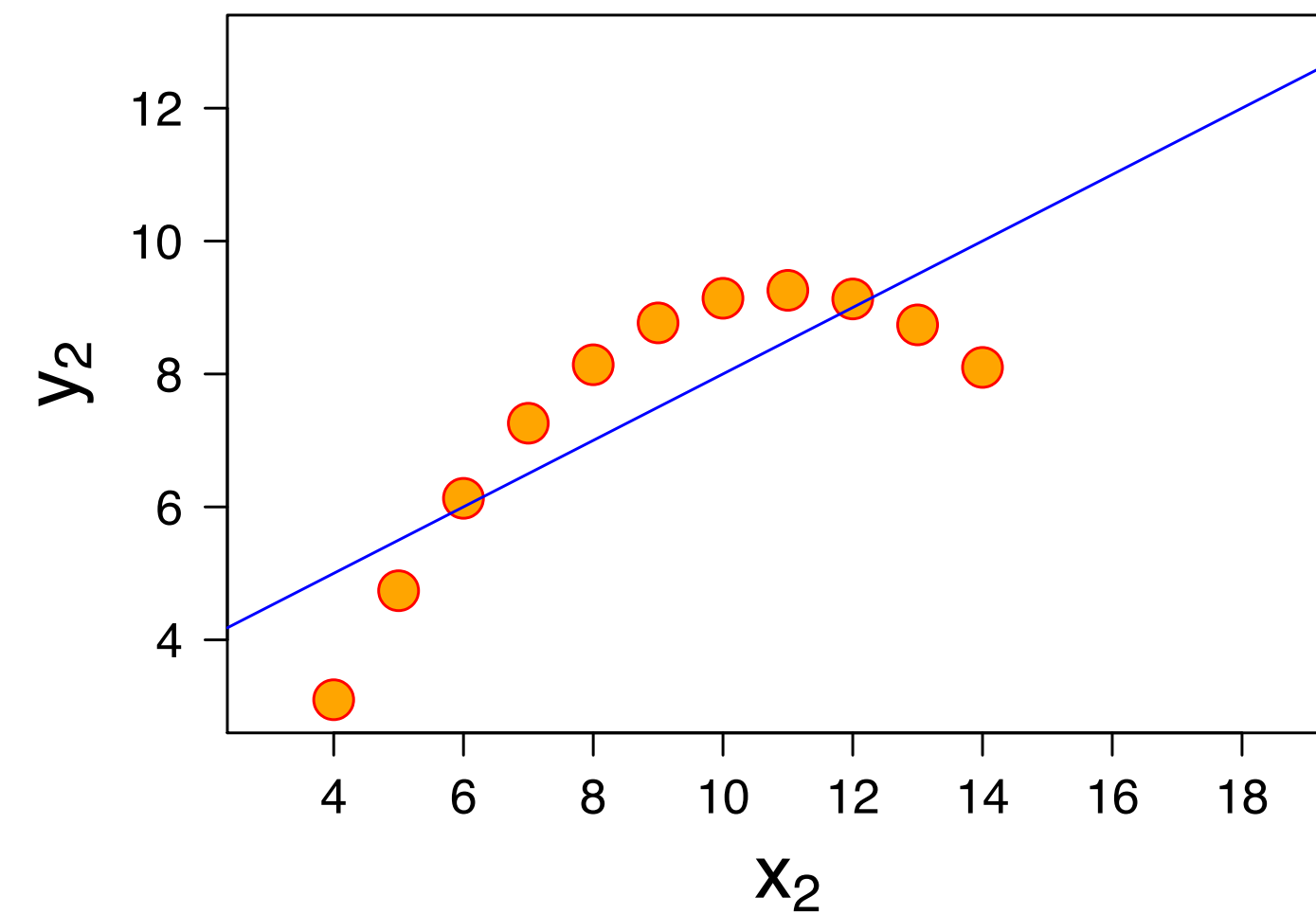
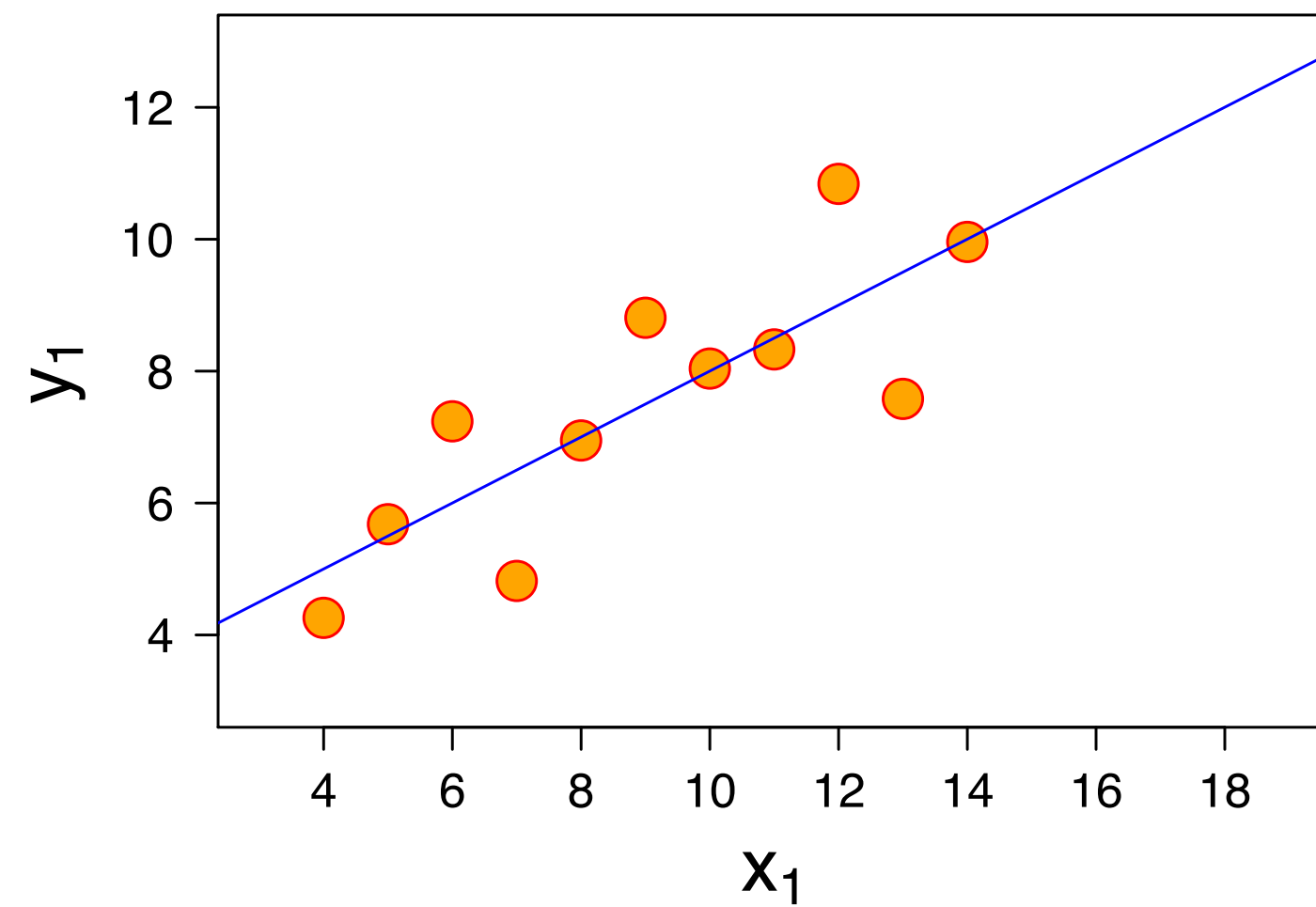
# Aggregation

- Usually involves **derived** attributes
- Examples: mean, median, mode, min, max, count, sum
- Remember expressiveness principle: still want to avoid implying trends or similarities based on aggregation

|               |       |
|---------------|-------|
| Mean of x     | 9     |
| Variance of x | 11    |
| Mean of y     | 7.50  |
| Variance of y | 4.122 |
| Correlation   | 0.816 |

| I    |       | II   |      | III  |       | IV   |       |
|------|-------|------|------|------|-------|------|-------|
| x    | y     | x    | y    | x    | y     | x    | y     |
| 10.0 | 8.04  | 10.0 | 9.14 | 10.0 | 7.46  | 8.0  | 6.58  |
| 8.0  | 6.95  | 8.0  | 8.14 | 8.0  | 6.77  | 8.0  | 5.76  |
| 13.0 | 7.58  | 13.0 | 8.74 | 13.0 | 12.74 | 8.0  | 7.71  |
| 9.0  | 8.81  | 9.0  | 8.77 | 9.0  | 7.11  | 8.0  | 8.84  |
| 11.0 | 8.33  | 11.0 | 9.26 | 11.0 | 7.81  | 8.0  | 8.47  |
| 14.0 | 9.96  | 14.0 | 8.10 | 14.0 | 8.84  | 8.0  | 7.04  |
| 6.0  | 7.24  | 6.0  | 6.13 | 6.0  | 6.08  | 8.0  | 5.25  |
| 4.0  | 4.26  | 4.0  | 3.10 | 4.0  | 5.39  | 19.0 | 12.50 |
| 12.0 | 10.84 | 12.0 | 9.13 | 12.0 | 8.15  | 8.0  | 5.56  |
| 7.0  | 4.82  | 7.0  | 7.26 | 7.0  | 6.42  | 8.0  | 7.91  |
| 5.0  | 5.68  | 5.0  | 4.74 | 5.0  | 5.73  | 8.0  | 6.89  |

# Anscombe's Quartet



[F. J. Anscombe]