

# Connecting The Dots - Showing Relationships in Data and Beyond

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VisWeek Tutorial 2012



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3. Harvard School of Engineering and Applied Sciences, Cambridge, MA, USA

# PART II: HOW TO LINK?

Speaker: Alexander Lex

# Schedule

3:15 – 3:40	First half
3:40 – 4:15	Coffe break
4:15 – 4:50	Second half
4:50 – 5:50	When to link? By Marc Streit

# Contents

1. Discussion of objectives, definitions
2. Establishing quality criteria
3. Brief introduction to most linking techniques
4. Detailed discussion of selected linking techniques
5. Details on techniques that employ connectedness

# Linking Objective

Express a relationship between  $n$  entities, which is  
**not obvious from the visual encoding.**

Supplementary relationships, e.g., based on

brushing

clustering

derived relationship

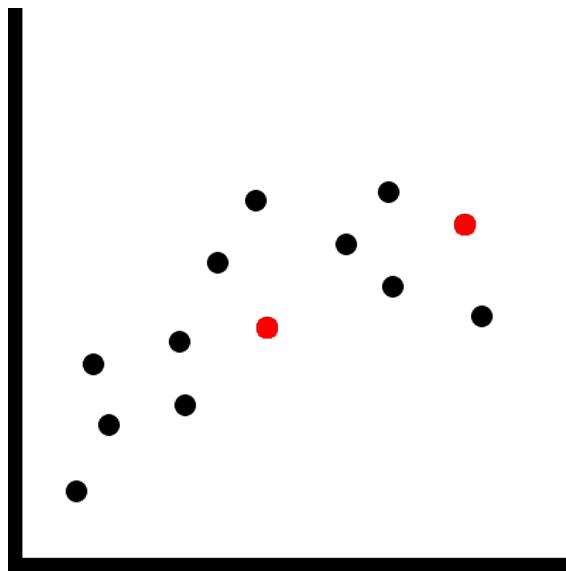
Consequence:

must work in **supplement** to the primary visual  
encoding, the **base representation (BR)**.

# Base Representation (BR)...

... is a visualization or an image which is meaningful by itself

... may be adapted to enable linking



Base Representation  
with supplemented links

# How To Link?

Linking of information based on **perceptual grouping** principles.

Gestalt principles [Wertheimer, 1923] and recent extensions

Good resource for grouping principles and other issues of perception:

<http://www.csc.ncsu.edu/faculty/healey/PP/index.html>

By Christopher G. Healey

# Quality Attributes for Links (1/2)

Scalability for # items

How many items can be linked for one relation?

Scalability for # relations

How many relationships can be shown at the same time?

Perception issues

Can the links be perceived easily or “preattentively”?

Can all entities belonging to a relationship be easily identified?

# Quality Attributes for Links (2/2)

Occlusion issues

Is the base representation preserved?

Compatibility to base representation?

Is the choice of visual encoding for a link suitable for the encoding of the base representation?

Practical/Implementation issues?

Easy to implement?

Efficient to implement?

# Quality Attributes Online

<http://connecting-the-dots.caleydo.org>

# Critique: Visual Encoding Conventions



**Good**, suitable, feature inherent!



**Limiting**, but good technique  
might address the problem.



**Limiting**, but may work under  
certain circumstances.



**Severely limiting**, no (known)  
solution.

# Three Major Classes of Links

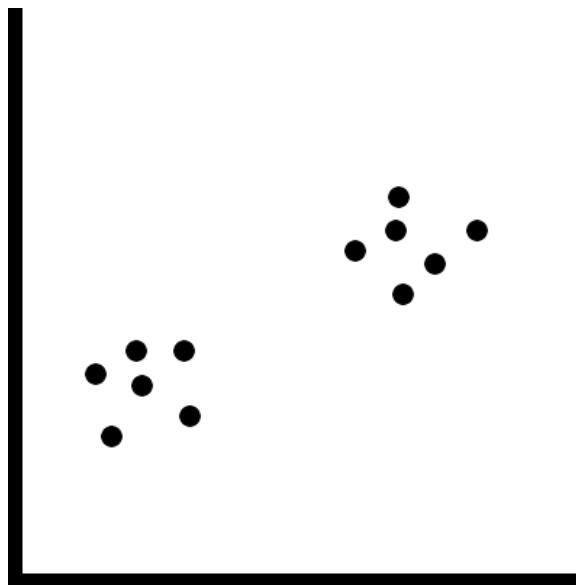
Proximity

Similarity

Connectedness

# Proximity

Grouping/linking by placing entities in close proximity

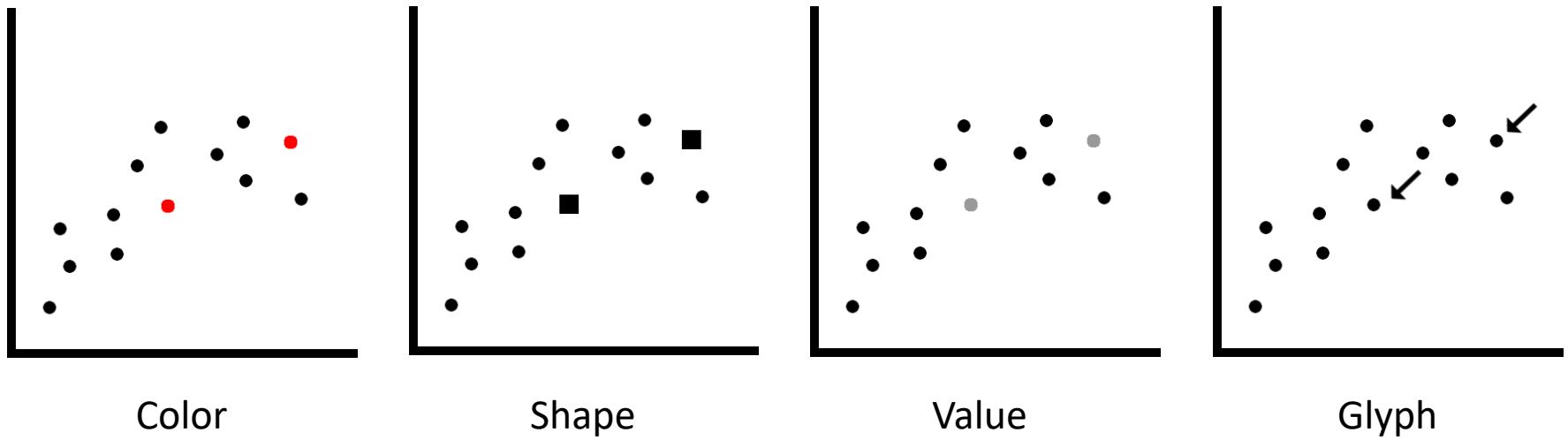


# Similarity

Co-modulation of a **visual-variable** [Bertin 1974]

color, shape, size, value, orientation, texture, ...

Adding a glyph, label, frame, background



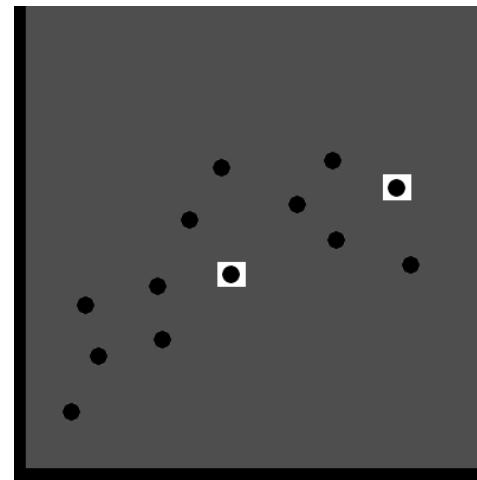
# Similarity

Modulate everything else

Blurring, darkening, desaturating, etc.



Blur



Darkening

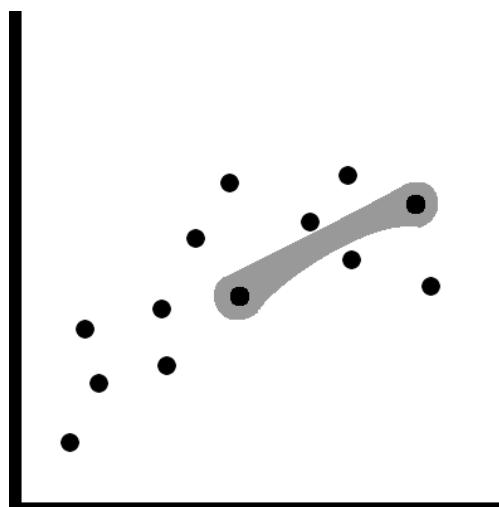
# Connectedness and Common Region

Connected items with a line or curve

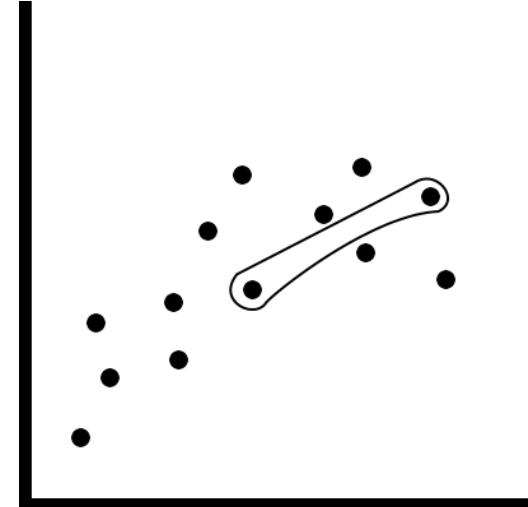
Surround items with a outline, surface, volume



Connectedness



Surface



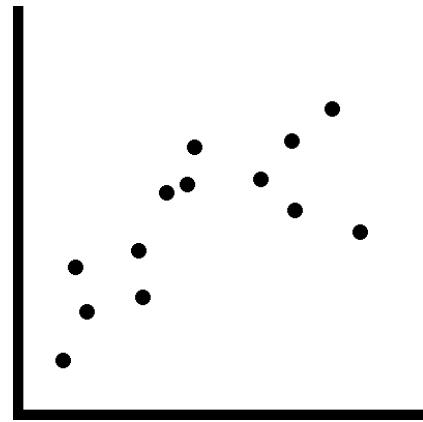
Common Region

# The “obscure” grouping principles

“Obscure” in terms of **applicability for linking**

Common fate

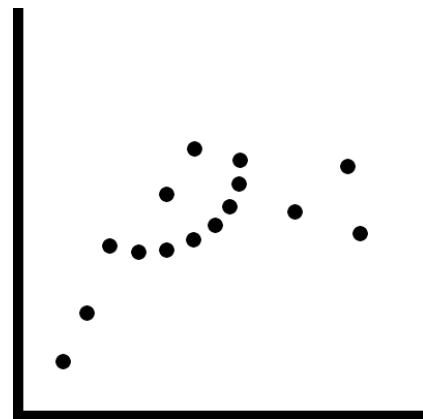
motion in the same direction



Good Continuation

arrange items on a line / curve

in consequences similar to position  
but more limited



# The “obscure” grouping principles

Flicker

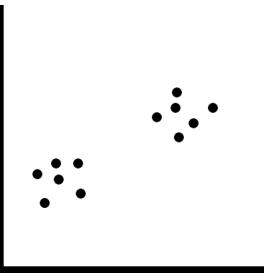
Works well for a few items

Grabs your attention

Often perceived annoying



# PROXIMITY



# Proximity

Scalability for # items: **very good**

Scalability for # relations: **very good**

Perception: **very good**

Occlusion issues: **not really**

Practical/implementation issues: **not really**

# Proximity: Compatibility to BR

Problematic because:

position is „the best“ visual variable →  
in very many cases used as a primary encoding  
adding relationships (e.g. by brushing) triggers  
significant rearrangement  
difficult to keep up mental map

# Proximity Uses

Is used only when position is variable

e.g., in graphs using a node-link layout

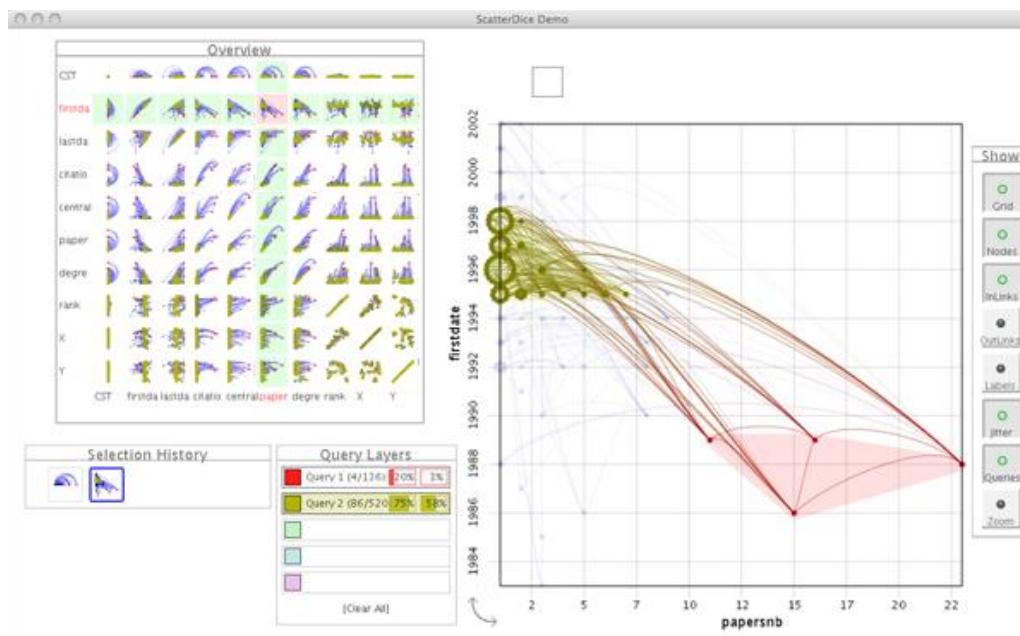
e.g., when using projection/MDS methods: to emphasize individual dimensions

e.g., sorting in a table

# Proximity in Graphs

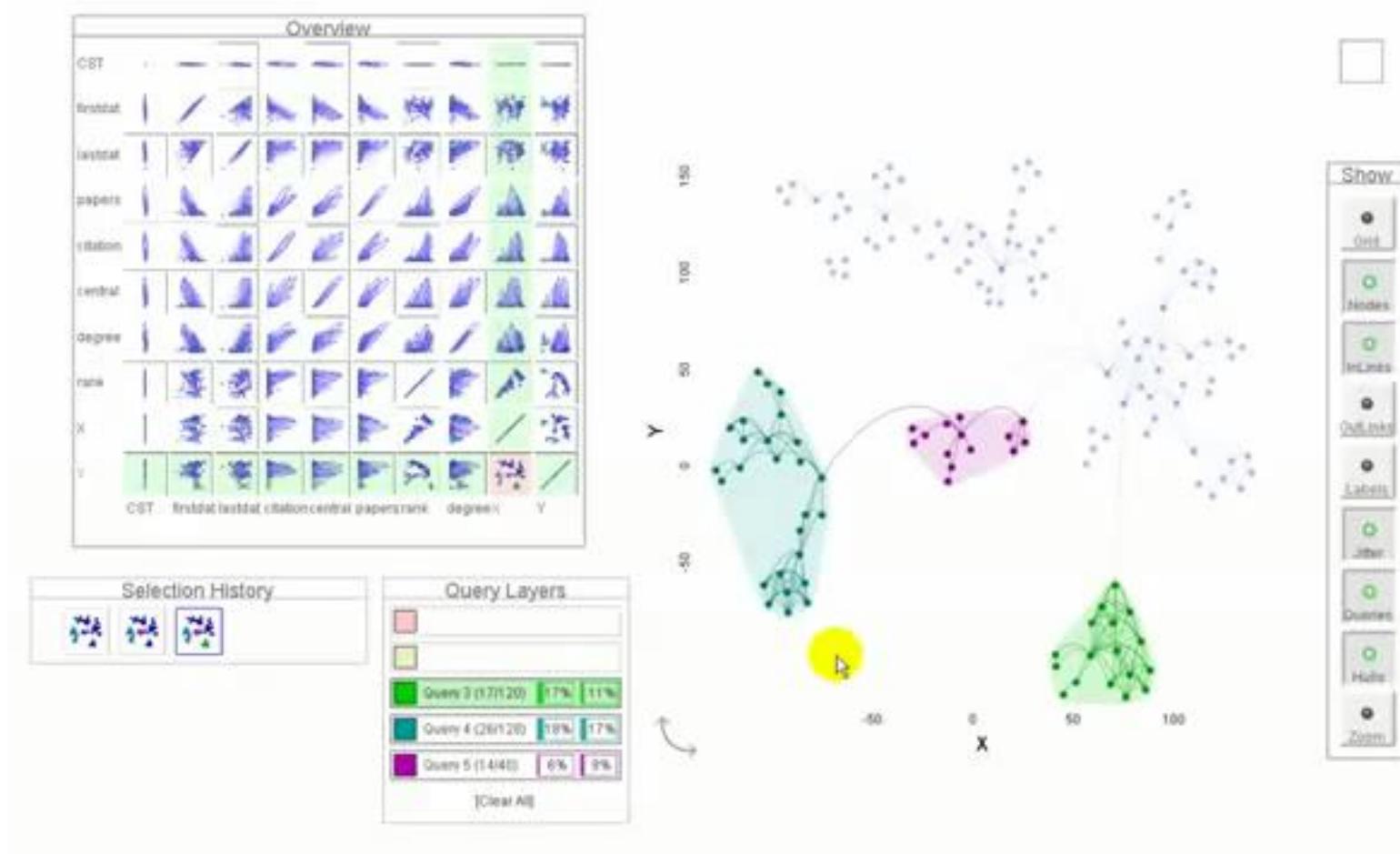
## GraphDice

System to see relationships between large quantities of node attributes in graphs



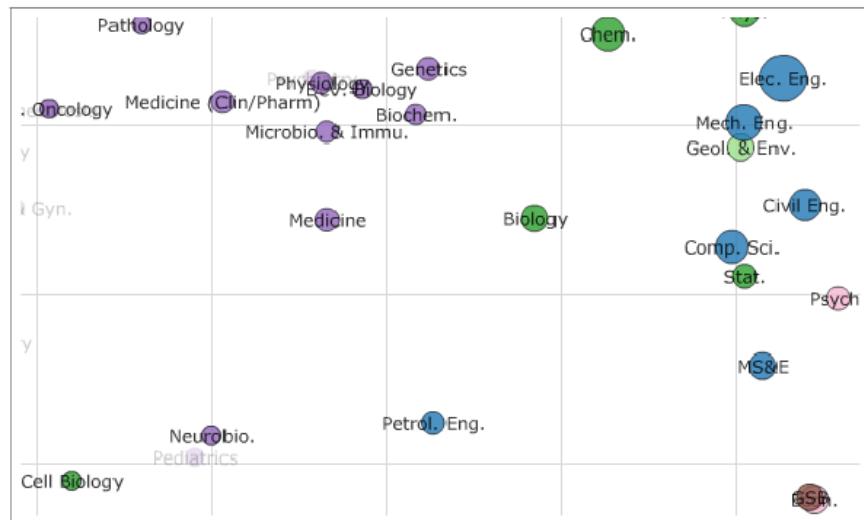
[Brezerianos et al., 2010]

# Proximity - Graph Dice

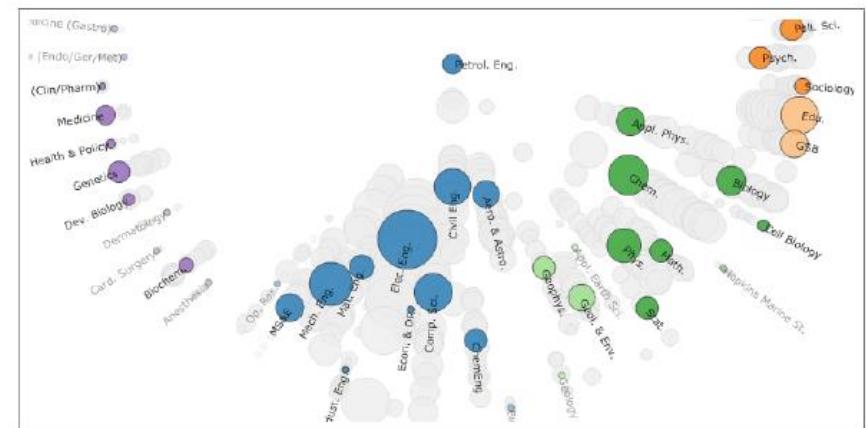


# Proximity - MDS

Topical distances between departments in a 2D projection



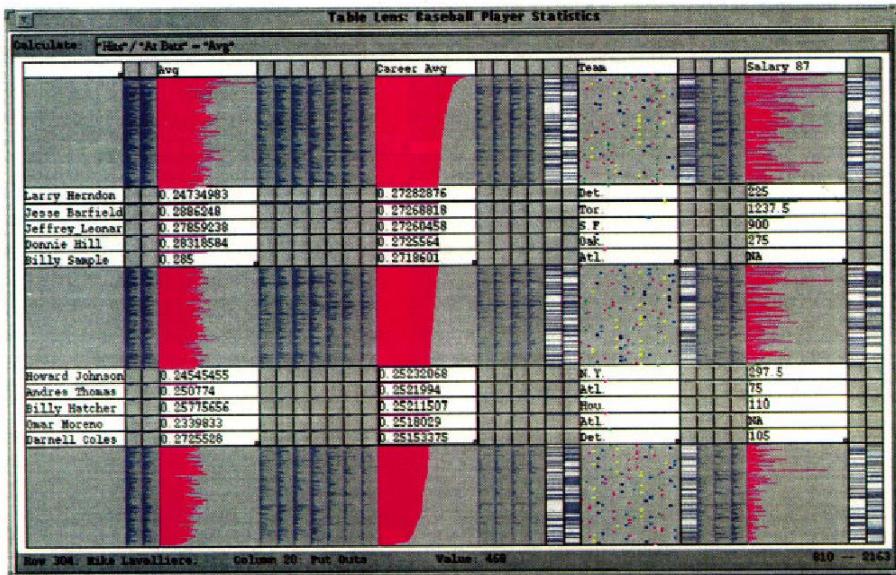
Topical distances between the selected Petroleum Engineering and the others.



[Chuang et al., 2012]

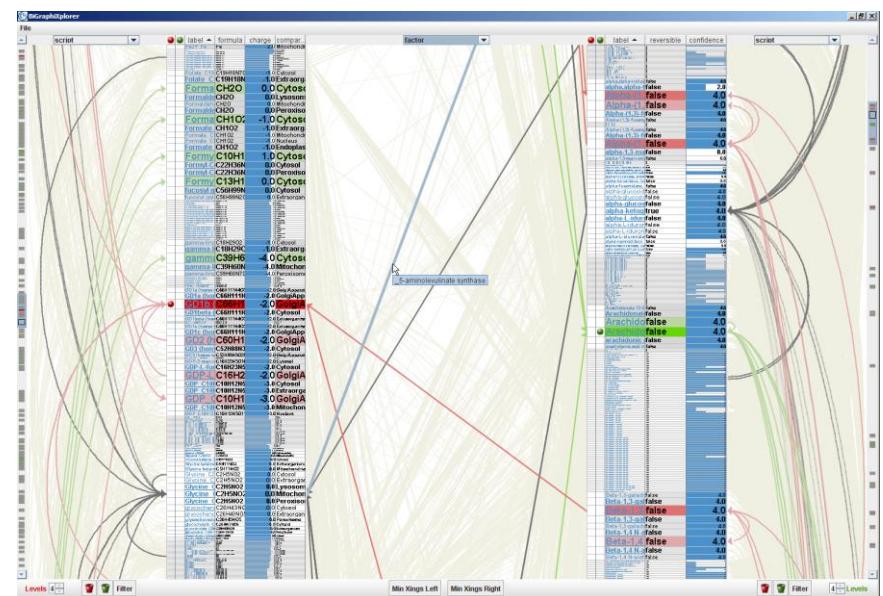
# Proximity - Sorting

Table-Lens sorted according to one dimension.



[Rao and Card, 1994]

Bi-partite graph with tabular display for node attributes.



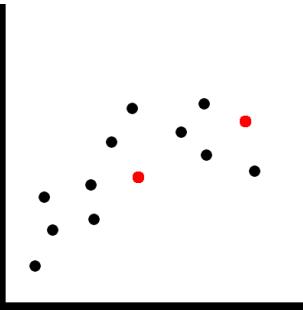
[Schulz et al., 2008]

# Proximity Reccomendation

Use proximity if your primary visual encoding doesn't use position.

Proximity is also often combined with other visual encodings for links.

# SIMILARITY



# Similarity - Color

Scalability for # items: **very good**

Scalability for # relations: **limited** (7-8 colors can be easily distinguished)

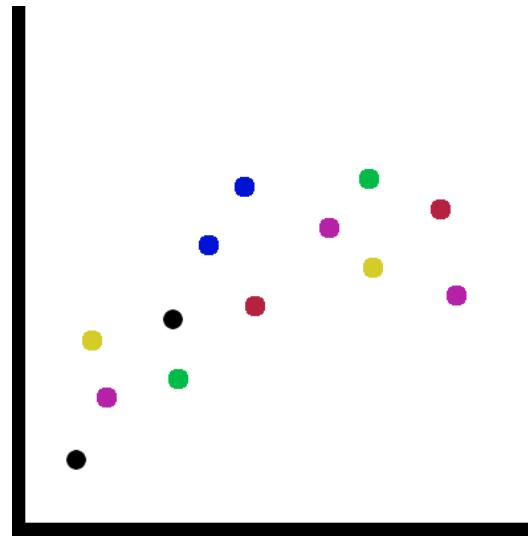
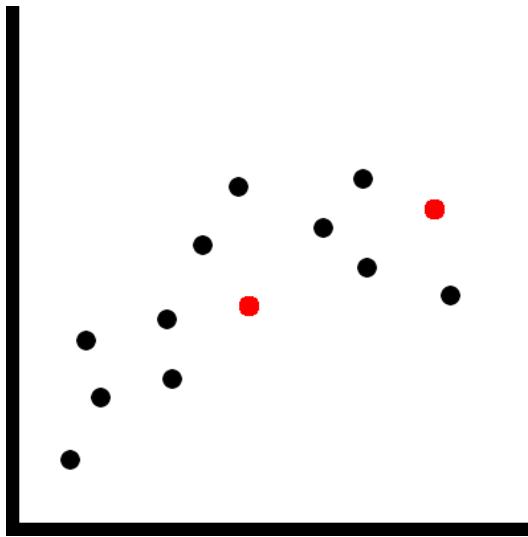
Occlusion issues: **not really**

Compatibility to BR: **good if color is „free“**

Practical/implementation issues: **not really**

# Color – Perception Issues (1/2)

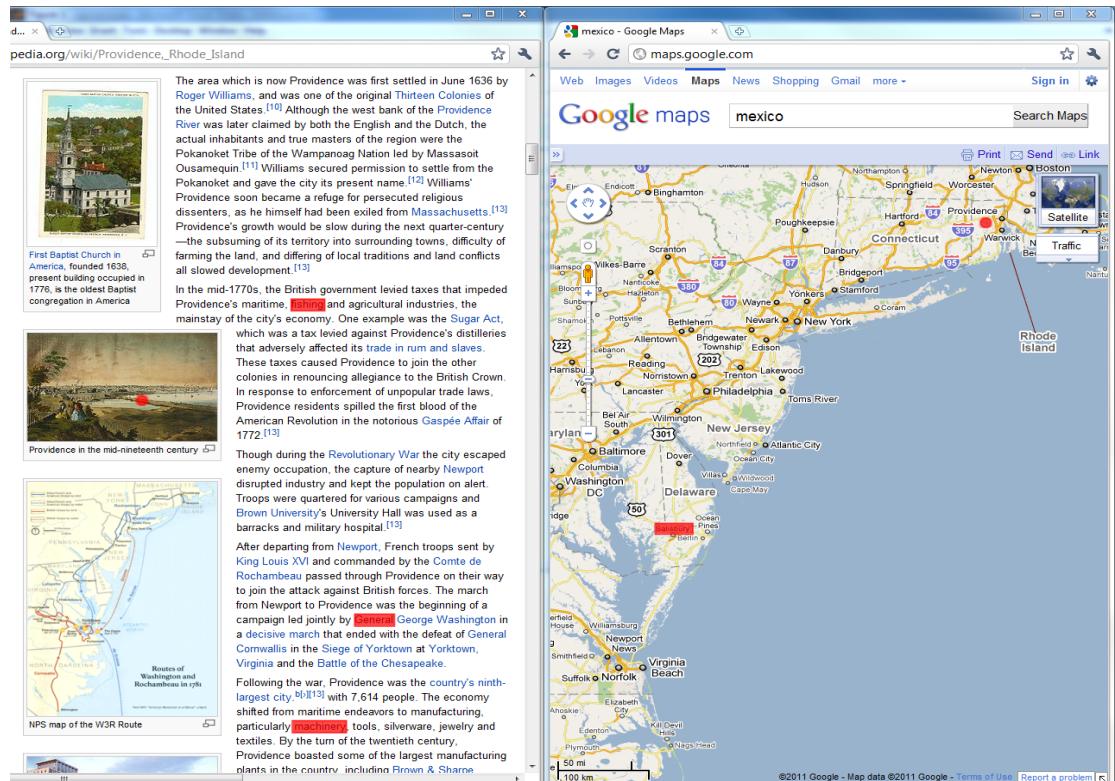
Preattentive properties: Very good for 1-2 simultaneous, **serial search for more**



# Color – Perception Issues (2/2)

Slower in a cluttered environment

Size of colored object relevant.



# Color Recommendation

Use color if

position is already used

you expect **large numbers of elements**

you expect a **limited number** of simultaneous  
relationships

Be careful if

the **BR** is cluttered

its important that **no entity** is overlooked

# Value / Saturation / Transparency

Value / Saturation / Transparency

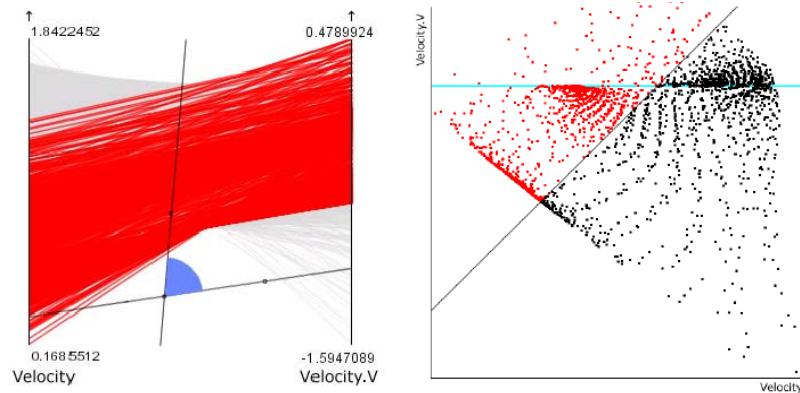
Similar to color

Lower # of relations

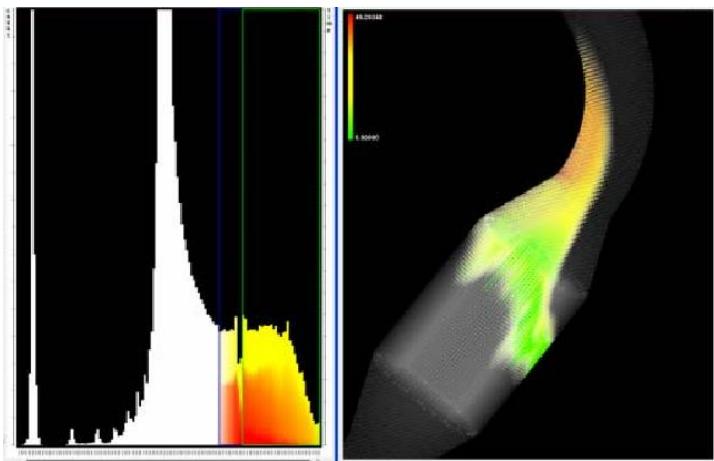
Influences visibility

Often used for binary selections/filters

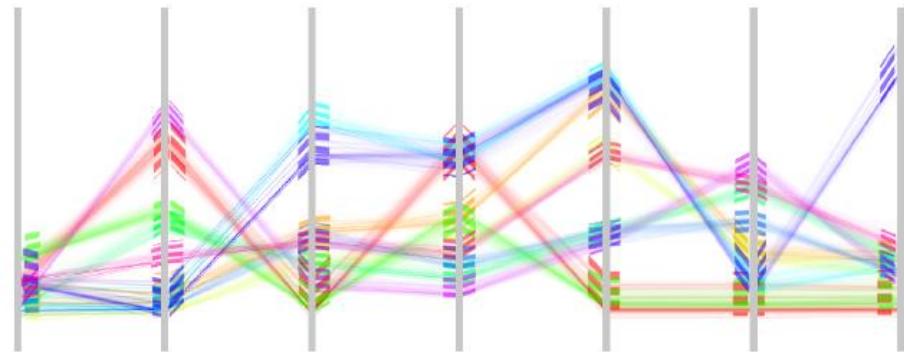
# Color/Value Modulation Examples



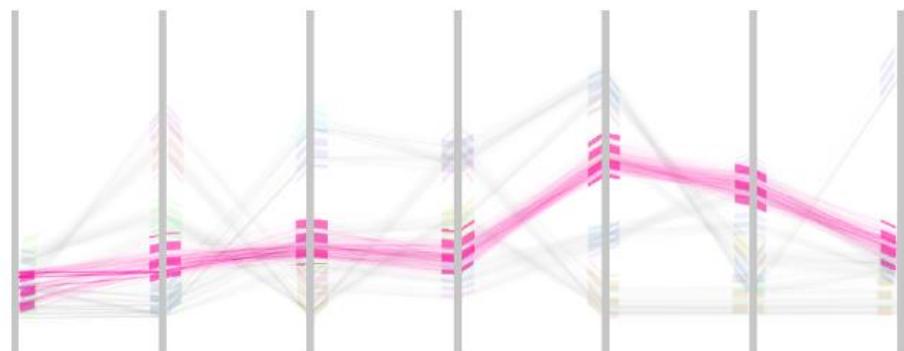
[Hauser et al., 2002]



[Doleisch , 2007]



(a)



(b)

[Johansson et al. , 2007]

# Other Modulation-Based Similarity

## Shape

Less easily perceived than color.

Better for larger # of relations, but doesn't work preattentively.

Less flexible – requires a scatterplot-like setup

e.g.: exchange symbol used in a scatterplot

Requires a minimum size of a mark

## Size

Problematic for larger # of relations.

May lead to occlusions.

e.g.: make line in PC plot thicker

# Other Modulation-Based Similarity

## Orientation

Special requirements on the mark and on the BR

-> limitations of shape apply

## Texture

Special requirements on the mark

Minimum size of mark

# Similarity based on Supplementation

## Glyph, label

Same problems as for shape

Scalability for # relations: **very good**

Scalability for # items: **bad**, introduces additional clutter

## Frame & background

Often combined with color to counter-balance small/thin features of mark  
otherwise **binary only**

# Similarity based on Modulating Everything Else

**Blurring, darkening the surrounding**

Perception: **good**

Scalability # items: **very good**

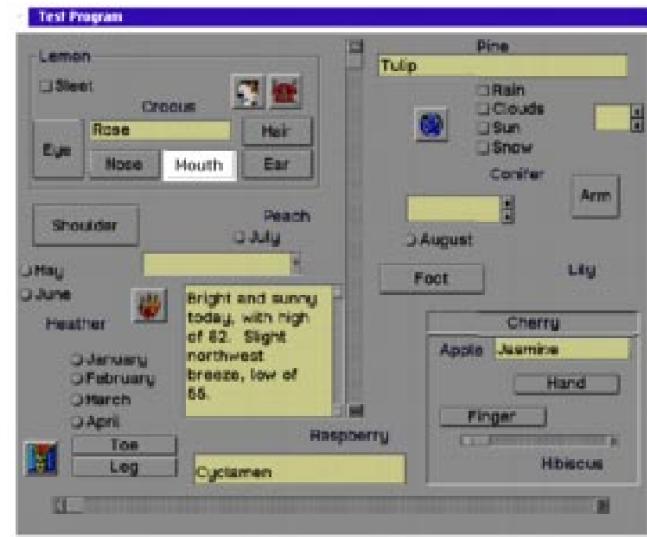
Scalability # relations: **practically only 1 possible**

Compatibility to BR: **BR may become hard/impossible to read**

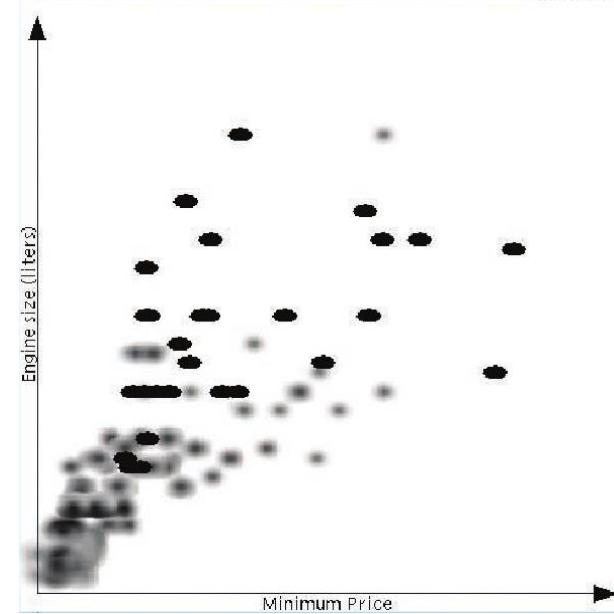
Practical issues: blur sometimes difficult to implement

# Modulating Everything Else: Reccomendation, Example

Don't use unless the sole objective is to guide attention toward one (set of) items

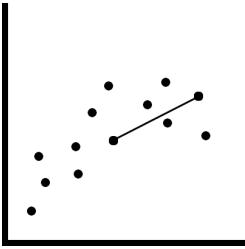


[Zhai et al., 1997]



[Kosara et al., 2002]

# **CONNECTEDNESS AND COMMON REGION**



# Connectedness

Scalability for # items: **ok**, special measures for many

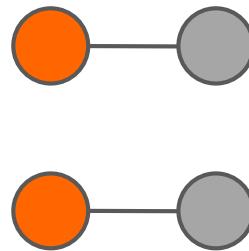
Scalability for # relations: **difficult** if # items is non-trivial

Occlusion issues: **problematic** if no special measures are taken

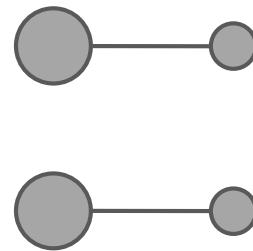
# A Little Experiment...



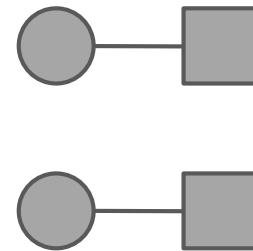
Proximity



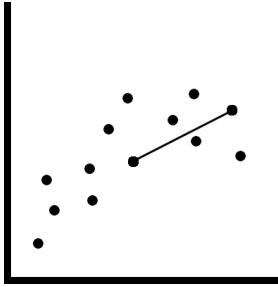
Color



Size



Shape



# Connectedness

Perception issues:

Connections can be perceived **preattentively**

Very **strong grouping principle**

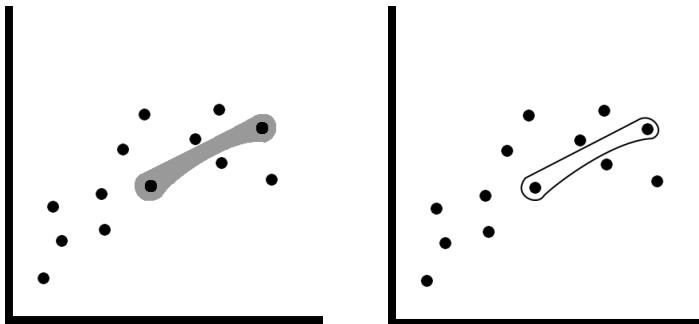
Good at **pointing at outliers**



Practical Issues:

Basic implementation trivial & fast

Counter-balancing for the mentioned issues comes at a cost



# Common Region

Very similar to Connectedness

At what point is a line an area?

More „ink“ necessary

Reduces possible # items and # relations

Increases saliency

Alternative if edges already used

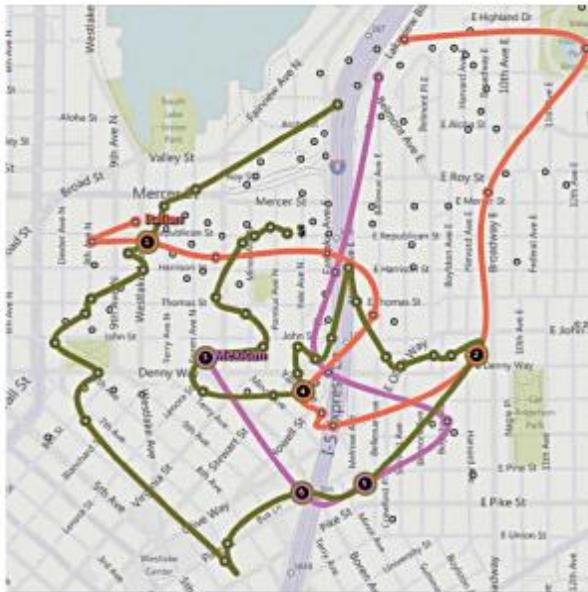
Can be used with transparency to preserve BR

# Connectedness Varieties

## Bubble Sets



## Line Sets



## Kelp Diagrams

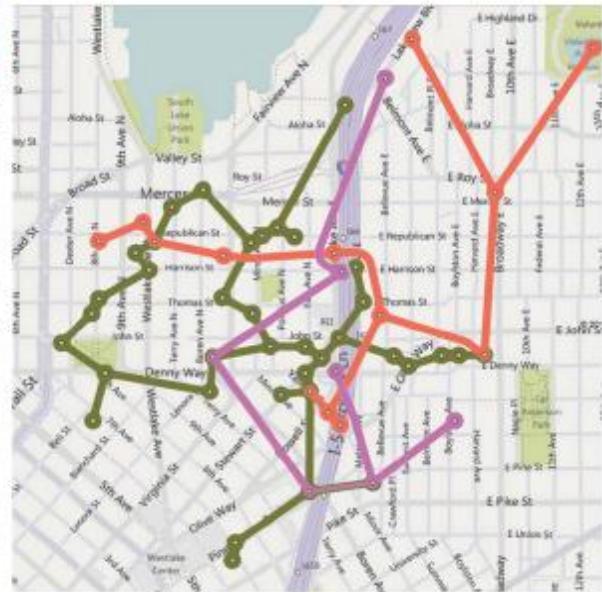
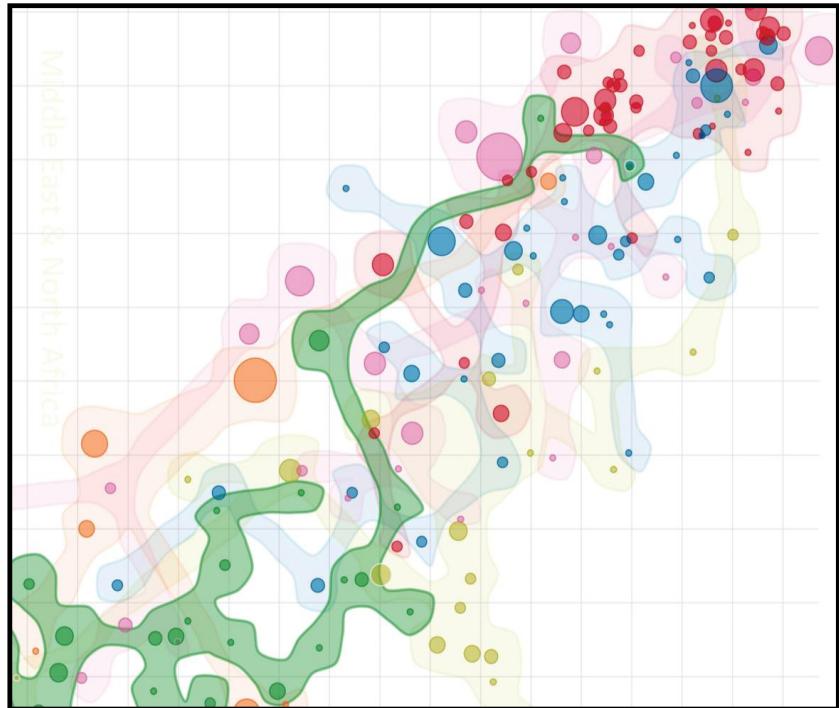


Image by [Dinkla et al., 2011]  
Technique by [Collins et al., 2009]

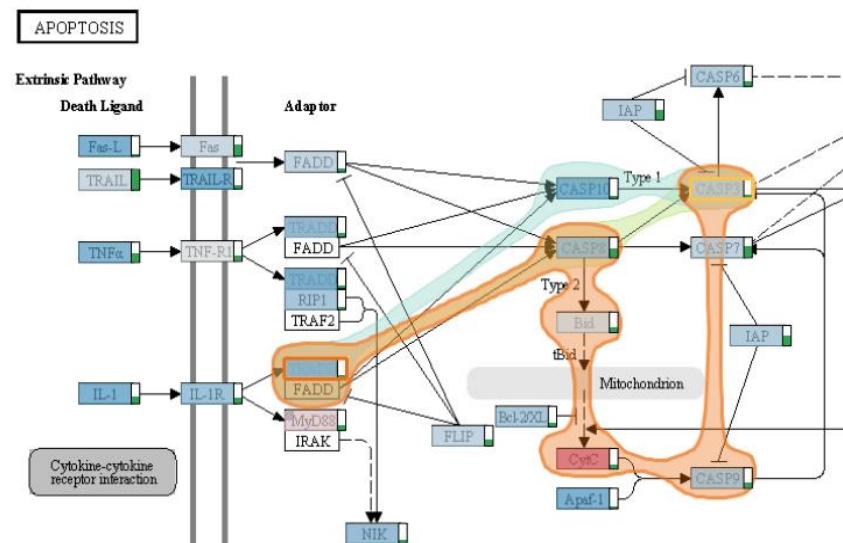
[Alper et al., 2011]

[Dinkla et al., 2012]

# Bubble Sets



[Collins et al., 2009]

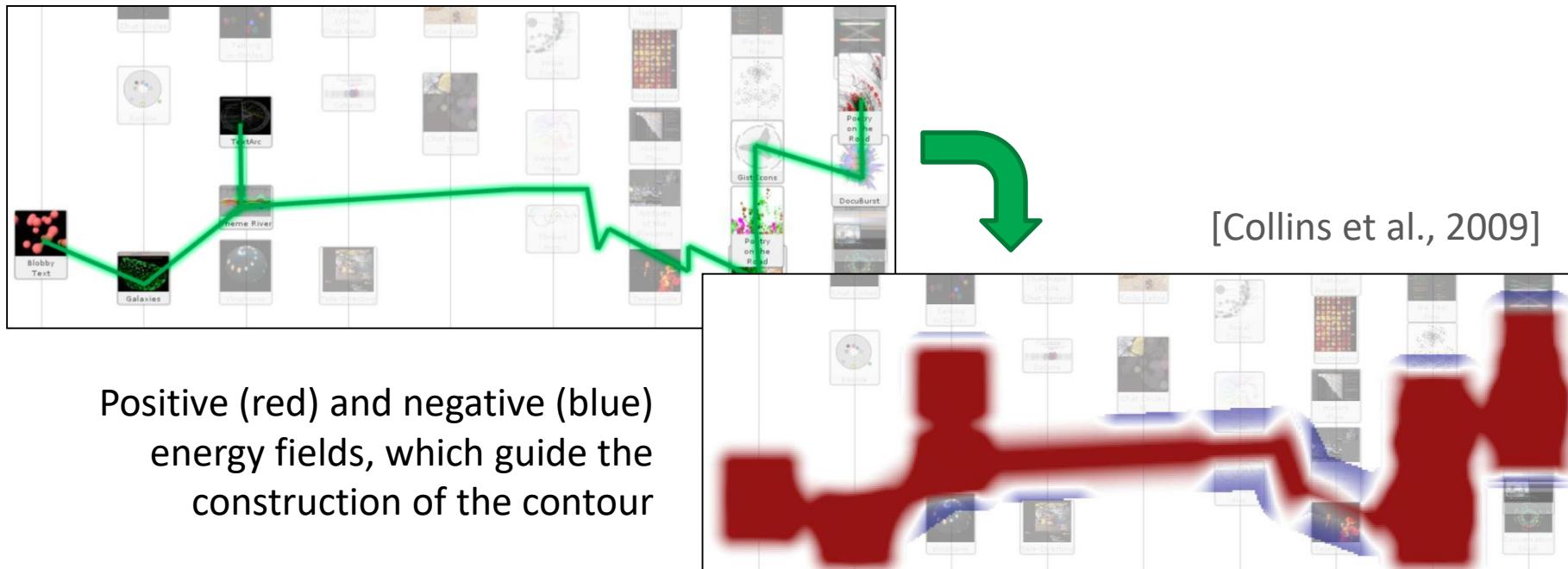


[Partl et al., 2012]

# Bubble Sets

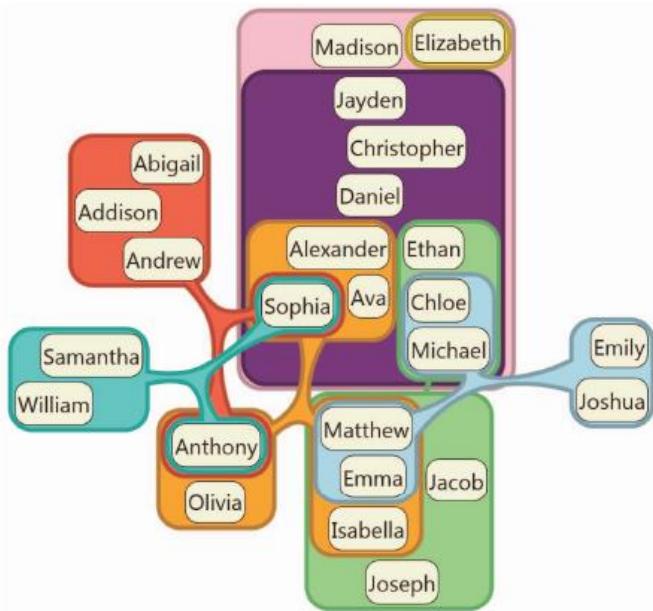
How it works:

**Approach:** connect nodes through virtual edges (route around obstacles) and compute a contour from this initial polyline

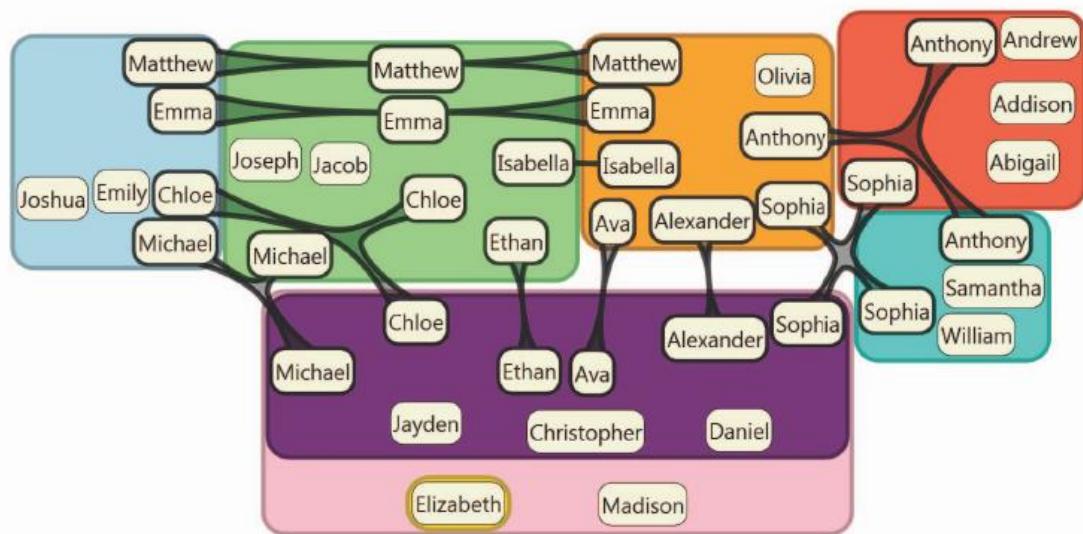


# “Advanced” Euler Diagrams

Compact Rectangular Euler Diagrams



Euler Diagrams  
with Duplicates

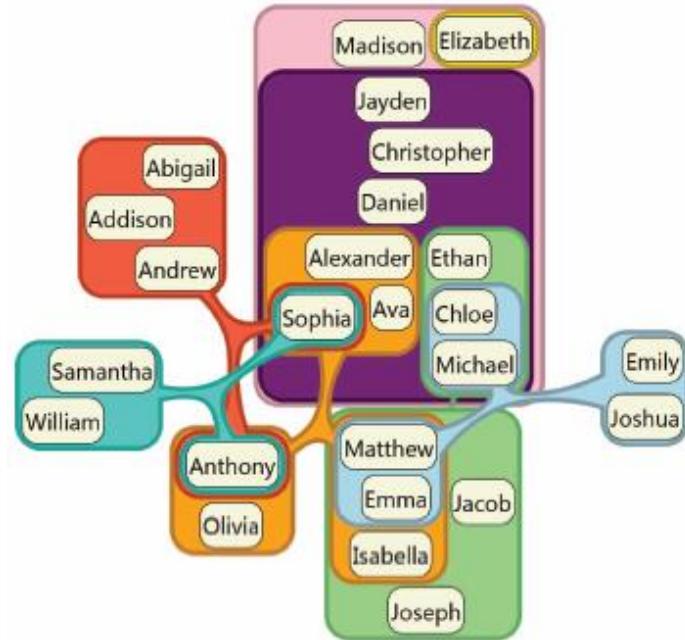
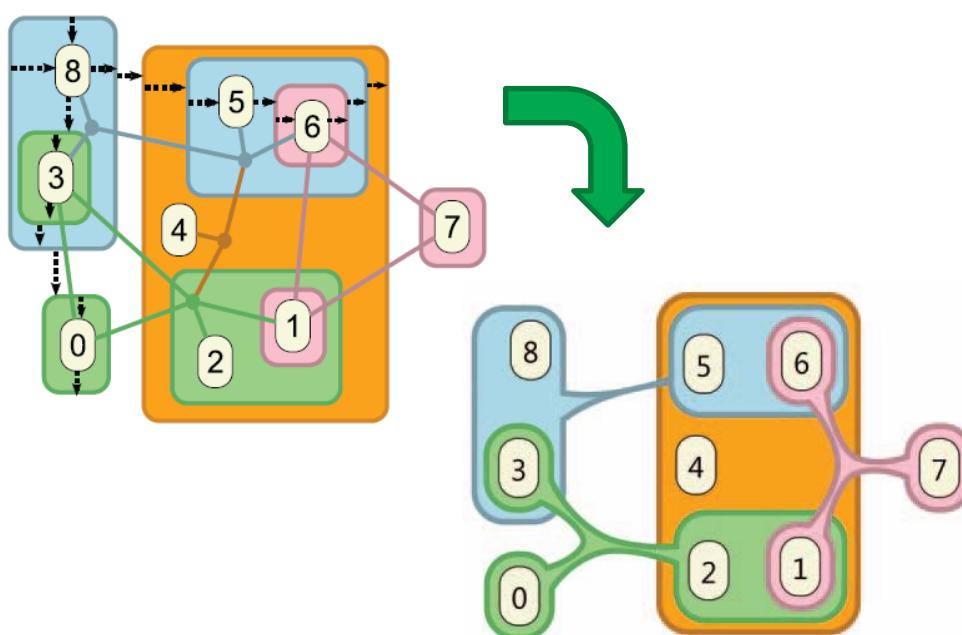


[Riche & Dwyer, 2010]

# Compact Rectangular Euler Diagrams

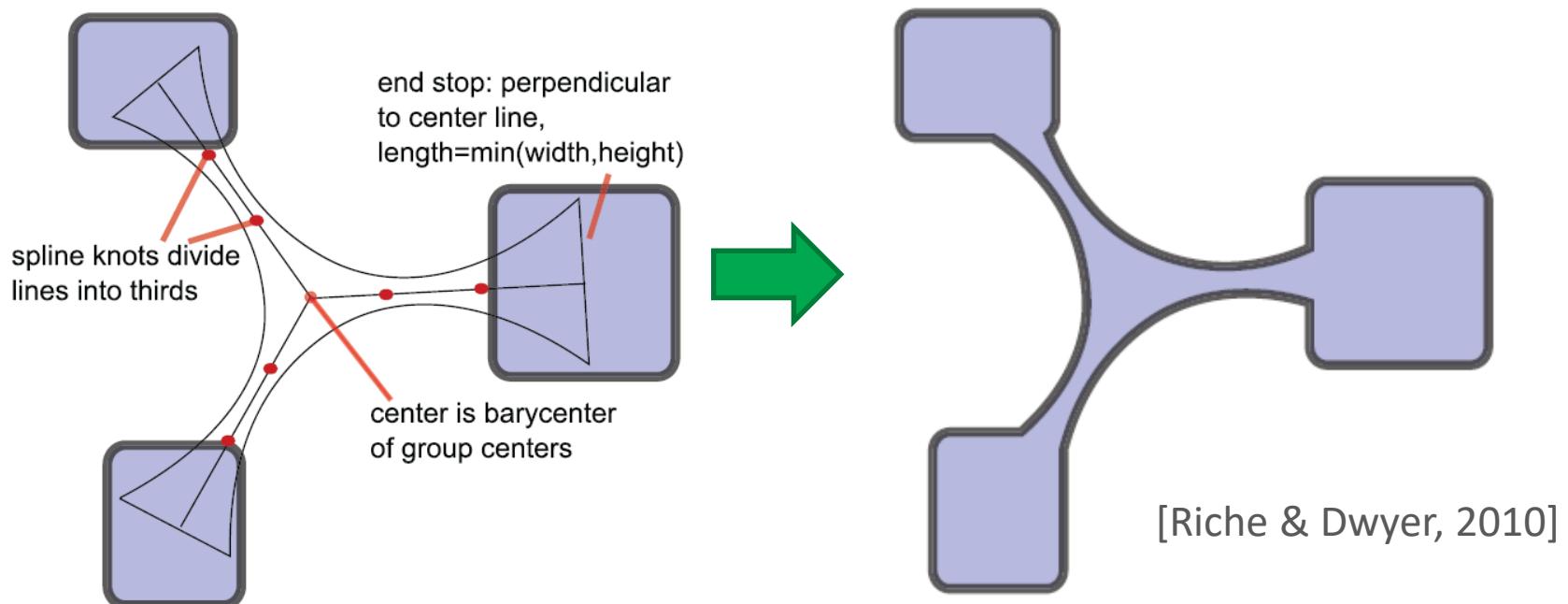
How it works:

start with an edge representation, use a force directed layout  
and transform from edges to shapes



# Compact Rectangular Euler Diagrams

How it works:



# Addressing Scalability, Occlusion Issues

Scalability:

- Using abstraction

- Bundling

Occlusion

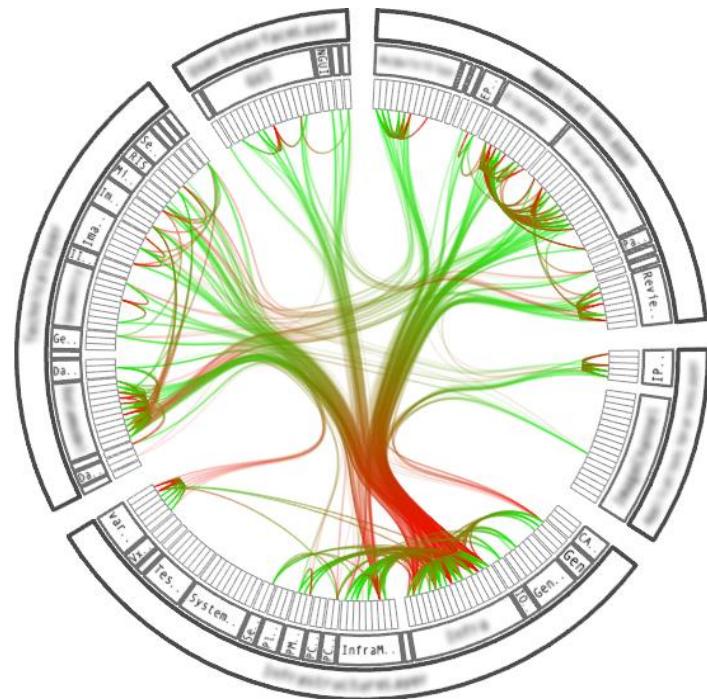
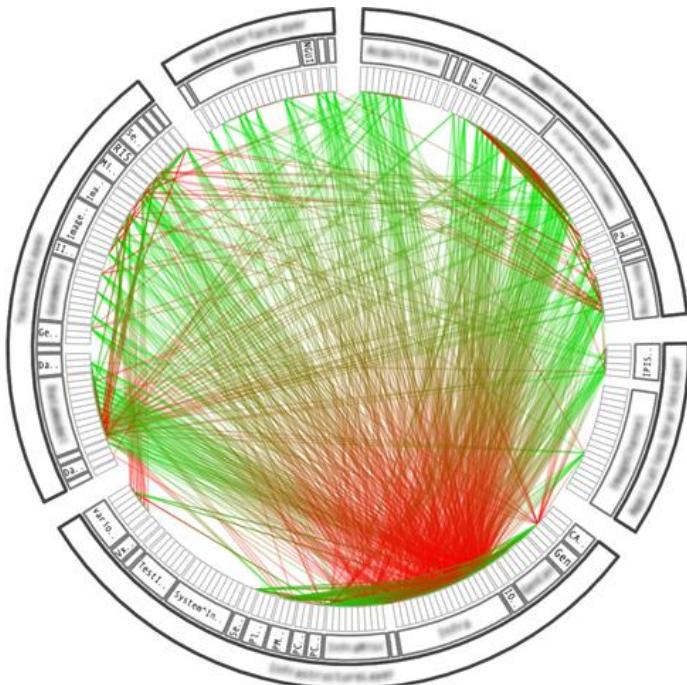
- Modifying the BR

- Routing

# Bundling - HEB

## Hierarchical Edge Bundling (HEB)

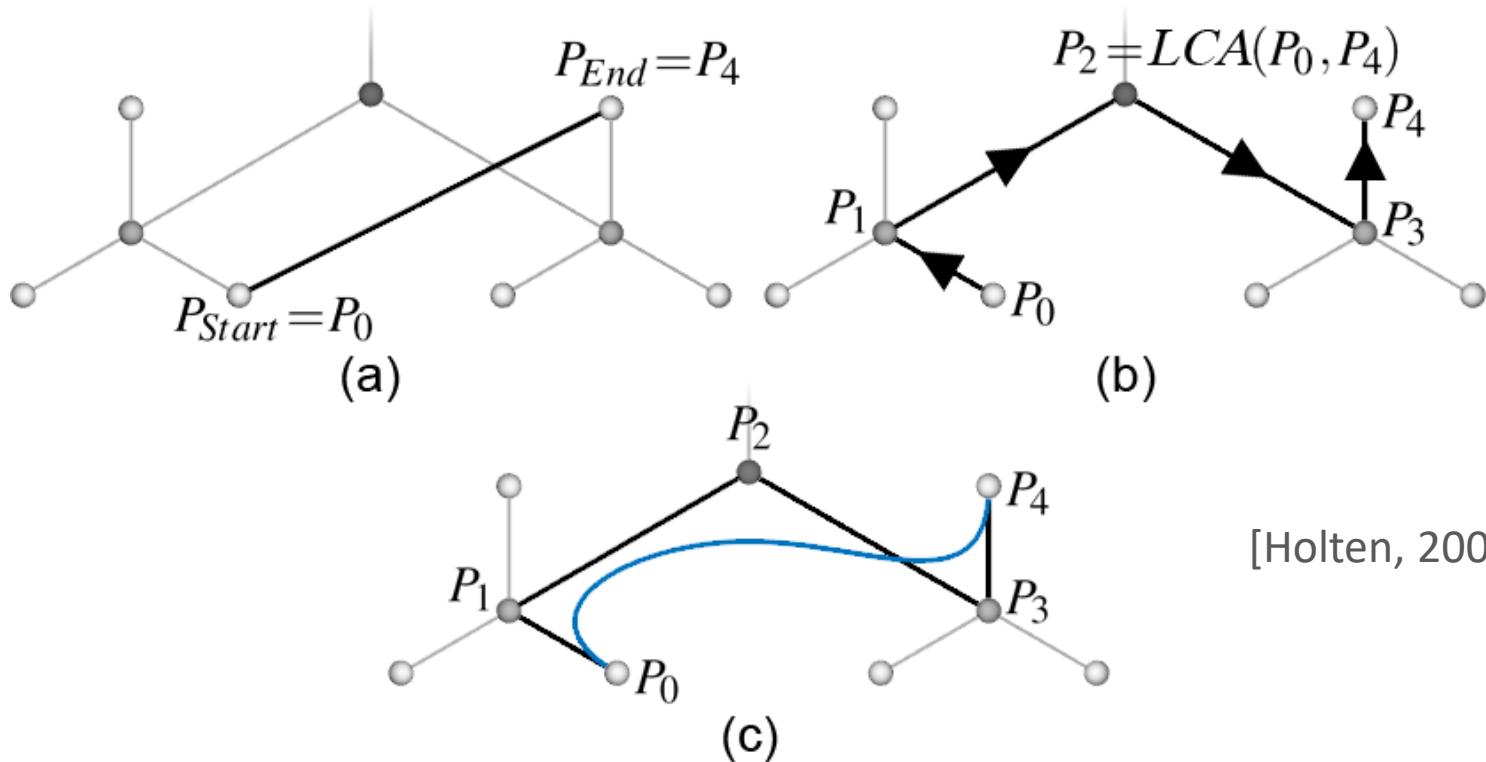
Can be used for links within a tree.



[Holten, 2006]

# Bundling - HEB

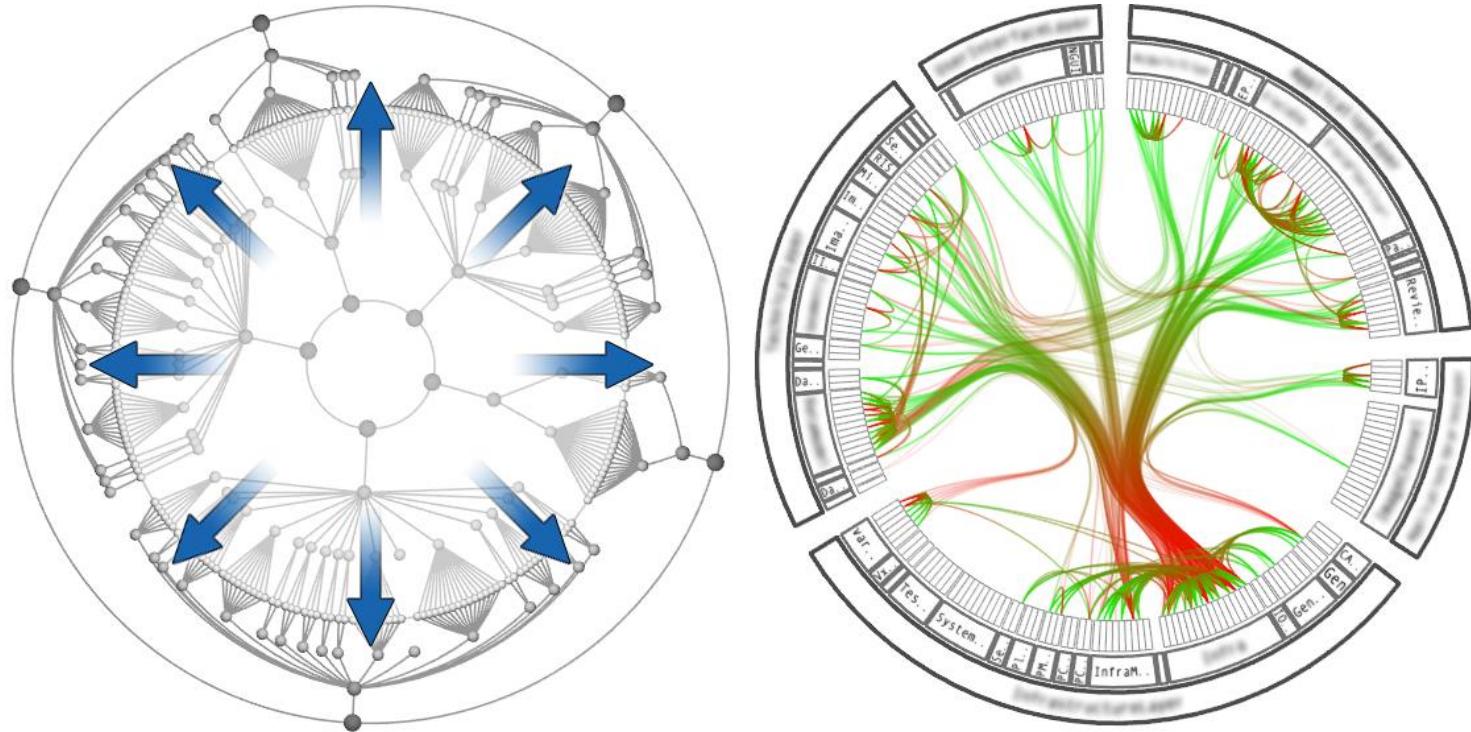
How it works:



[Holten, 2006]

# Bundling - HEB

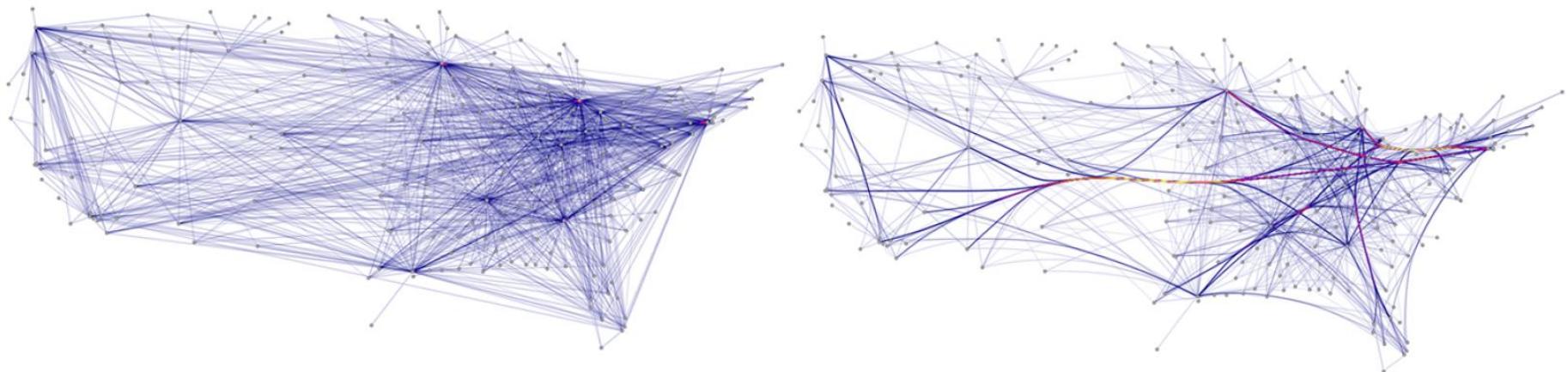
## The underlying structure



[Holten, 2006]

# Bundling - FEB

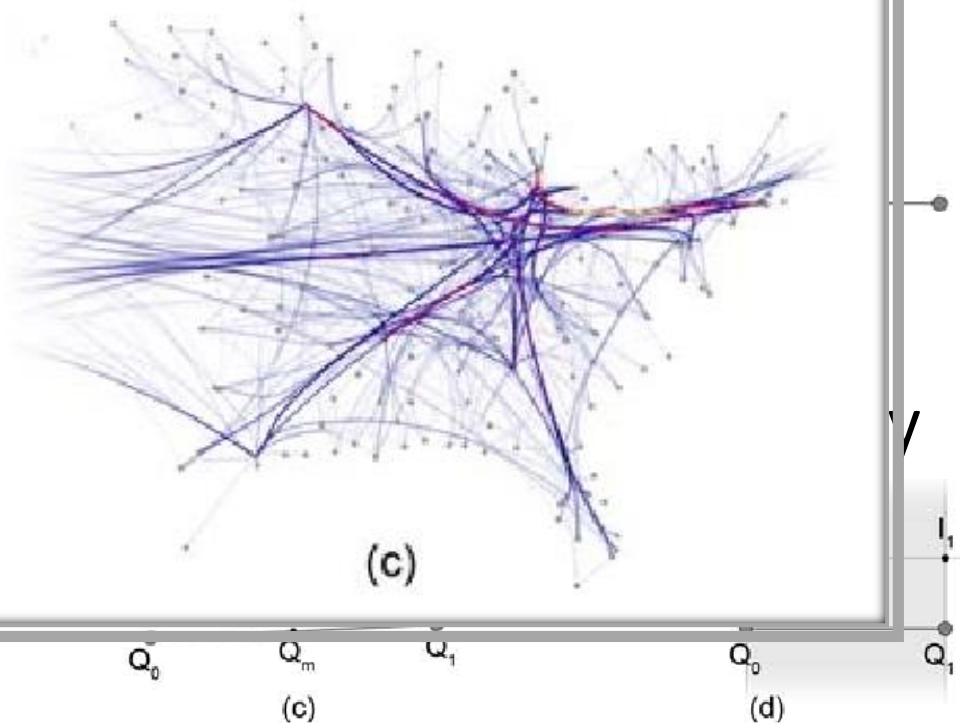
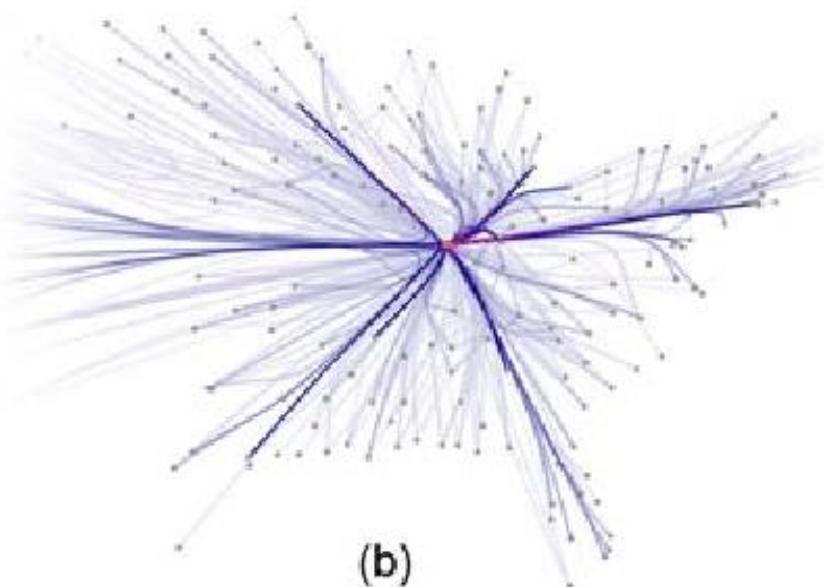
## Force-Directed Edge Bundling



# Bundling - FEB

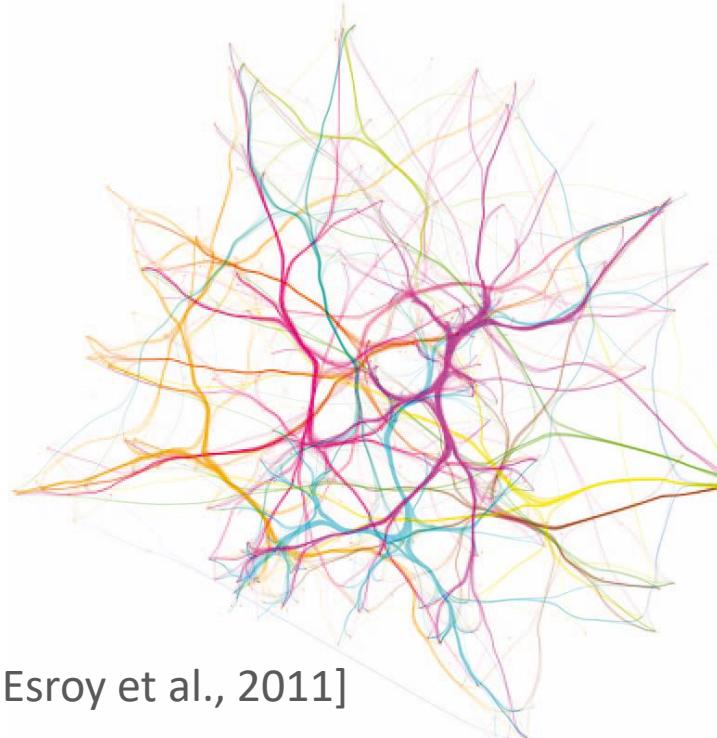
How it works:

Edge Comaptibility



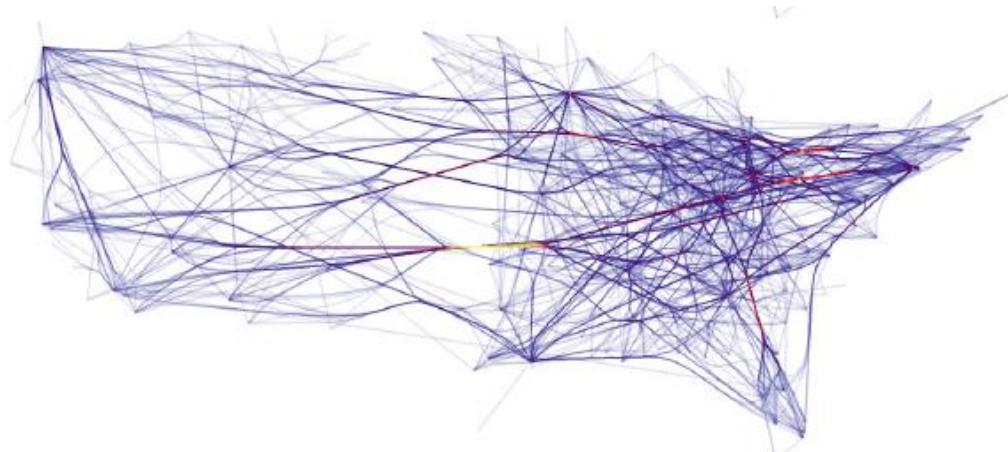
# Other Bundling Approaches

Skeleton-based edge  
bundling  
based on Clustering



[Esroy et al., 2011]

Agglomerative bundling  
minimizing ink (collapsing  
edges in proximity)



[Gansner et al., 2011]

Case Study Context-Preserving Visual Links

# ROUTING

Material based on InfoVis 2011 Talk by Markus Steinberger

Again a little experiment ;) ...

d... 

The area which is now Providence was first settled in June 1636 by Roger Williams, and was one of the original Thirteen Colonies of the United States.<sup>[10]</sup> Although the west bank of the Providence River was later claimed by both the English and the Dutch, the actual inhabitants and true masters of the region were the Pokanoket Tribe of the Wampanoag Nation led by Massasoit Ousamequin.<sup>[11]</sup> Williams secured permission to settle from the Pokanoket and gave the city its present name.<sup>[12]</sup> Williams' Providence soon became a refuge for persecuted religious dissenters, as he himself had been exiled from Massachusetts.<sup>[13]</sup> Providence's growth would be slow during the next quarter-century — the subsuming of its territory into surrounding towns, difficulty of farming the land, and differing of local traditions and land conflicts all slowed development.<sup>[13]</sup>

In the mid-1770s, the British government levied taxes that impeded Providence's maritime, fishing and agricultural industries, the mainstay of the city's economy. One example was the Sugar Act, which was a tax levied against Providence's distilleries that adversely affected its trade in rum and slaves. These taxes caused Providence to join the other colonies in renouncing allegiance to the British Crown. In response to enforcement of unpopular trade laws, Providence residents spilled the first blood of the American Revolution in the notorious Gaspée Affair of 1772.<sup>[13]</sup>

Though during the Revolutionary War the city escaped enemy occupation, the capture of nearby Newport disrupted industry and kept the population on alert. Troops were quartered for various campaigns and Brown University's University Hall was used as a barracks and military hospital.<sup>[13]</sup>

After departing from Newport, French troops sent by King Louis XVI and commanded by the Comte de Rochambeau passed through Providence on their way to join the attack against British forces. The march from Newport to Providence was the beginning of a campaign led jointly by General George Washington in a decisive march that ended with the defeat of General Cornwallis in the Siege of Yorktown at Yorktown, Virginia and the Battle of the Chesapeake.

Following the war, Providence was the country's ninth-largest city.<sup>b6][13]</sup> with 7,614 people. The economy shifted from maritime endeavors to manufacturing, particularly machinery, tools, silverware, jewelry and textiles. By the turn of the twentieth century, Providence boasted some of the largest manufacturing plants in the country, including Brown & Sharpe.





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[http://en.wikipedia.org/wik...vidence,\\_Rhode\\_Island](http://en.wikipedia.org/wik...vidence,_Rhode_Island)



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Following the war, Providence was the country's ninth-largest city<sup>[17][18]</sup> with 7,614 people. The economy shifted from maritime endeavors to manufacturing, particularly machinery, tools, silverware, jewelry and textiles. By the turn of the twentieth century, Providence boasted some of the largest manufacturing plants in the country, including Brown & Sharpe.

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First Baptist Church in America, founded 1638, present building occupied in 1776, is the oldest Baptist congregation in America



Providence in the mid-nineteenth century

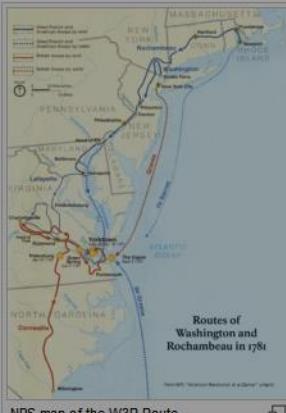
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NPS map of the W3R Route

## Google maps

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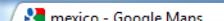
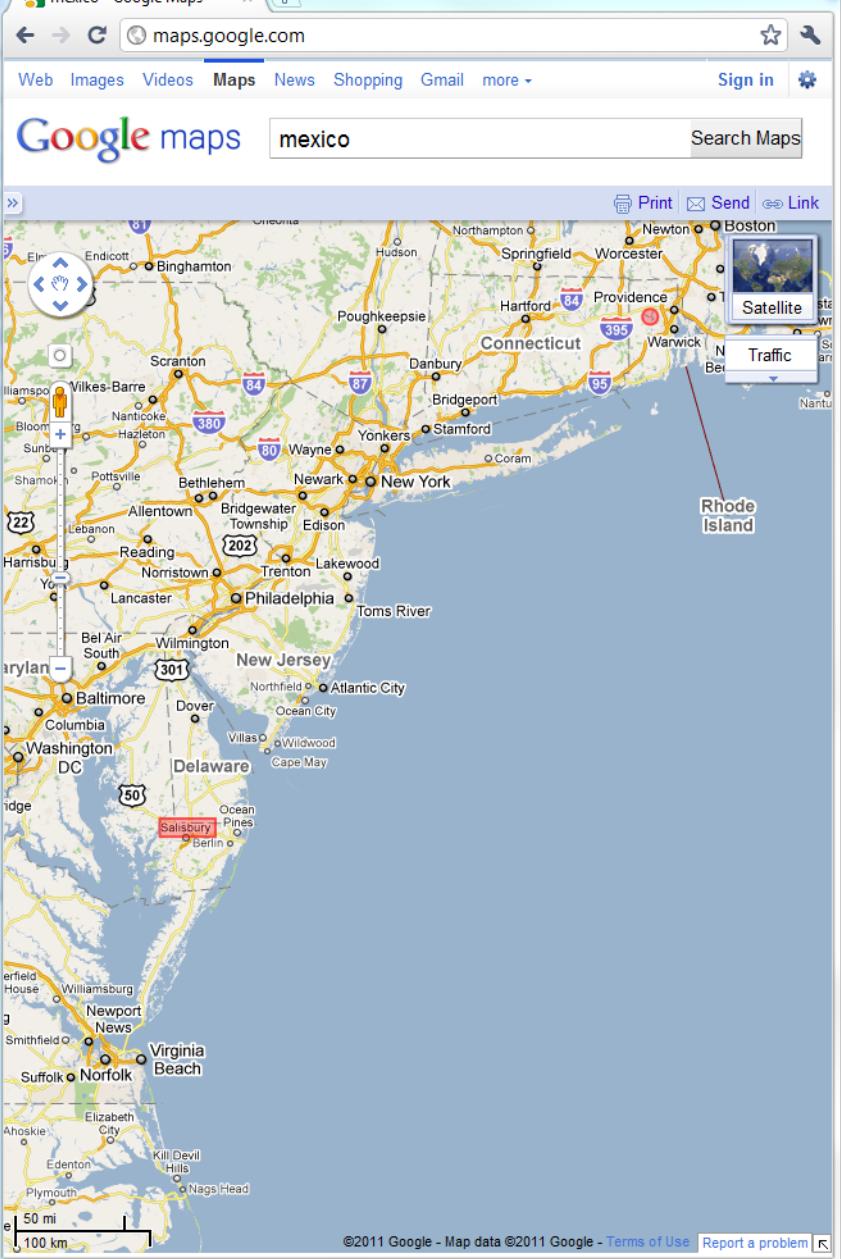
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[pedia.org/wiki/Providence,\\_Rhode\\_Island](http://pedia.org/wiki/Providence,_Rhode_Island)



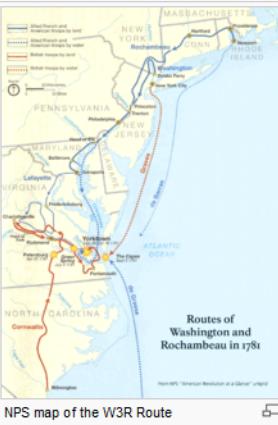
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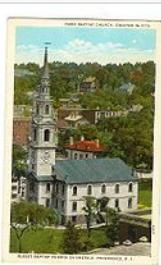
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NPS map of the W3R Route

d... [+/-](#)

[pedia.org/wiki/Providence,\\_Rhode\\_Island](http://pedia.org/wiki/Providence,_Rhode_Island)



The area which is now Providence was first settled in June 1636 by [Roger Williams](#), and was one of the original [Thirteen Colonies](#) of the United States.<sup>[10]</sup> Although the west bank of the [Providence River](#) was later claimed by both the English and the Dutch, the actual inhabitants and true masters of the region were the [Pocumtuck Tribe](#) of the Wampanoag Nation led by Massasoit Ousamequin.<sup>[11]</sup> Williams secured permission to settle from the Pocumtuck and gave the city its present name.<sup>[12]</sup> Williams' Providence soon became a refuge for persecuted religious dissenters, as he himself had been exiled from [Massachusetts](#).<sup>[13]</sup> Providence's growth would be slow during the next quarter-century — the subsuming of its territory into surrounding towns, difficulty of farming the land, and differing of local traditions and land conflicts all slowed development.<sup>[13]</sup>

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NPS map of the W3R Route

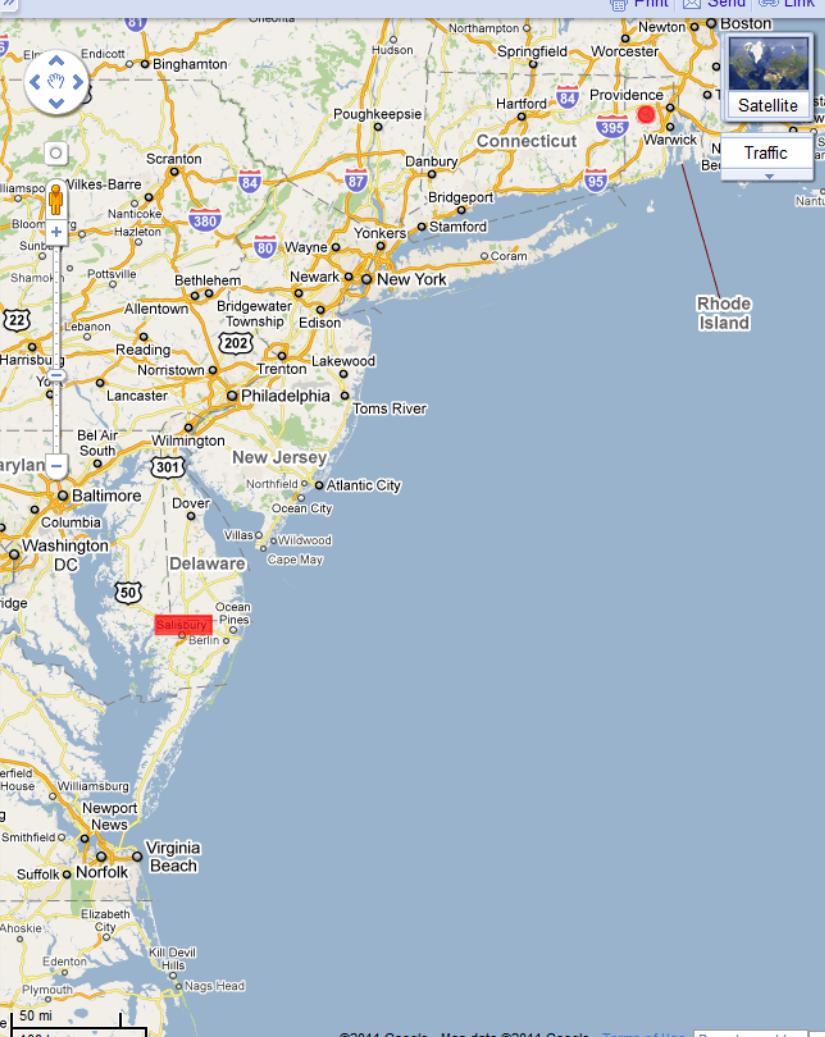


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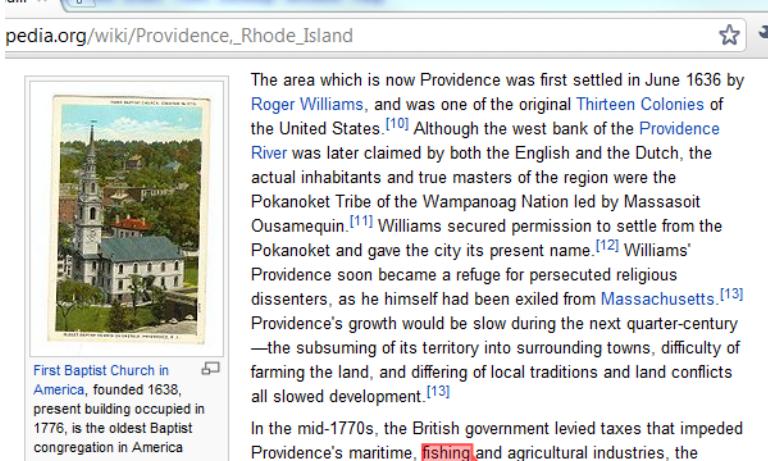
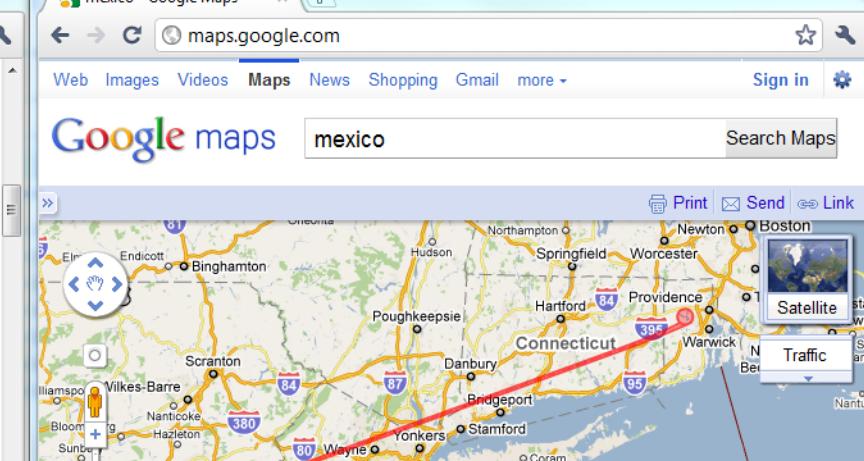
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# What is the problem?

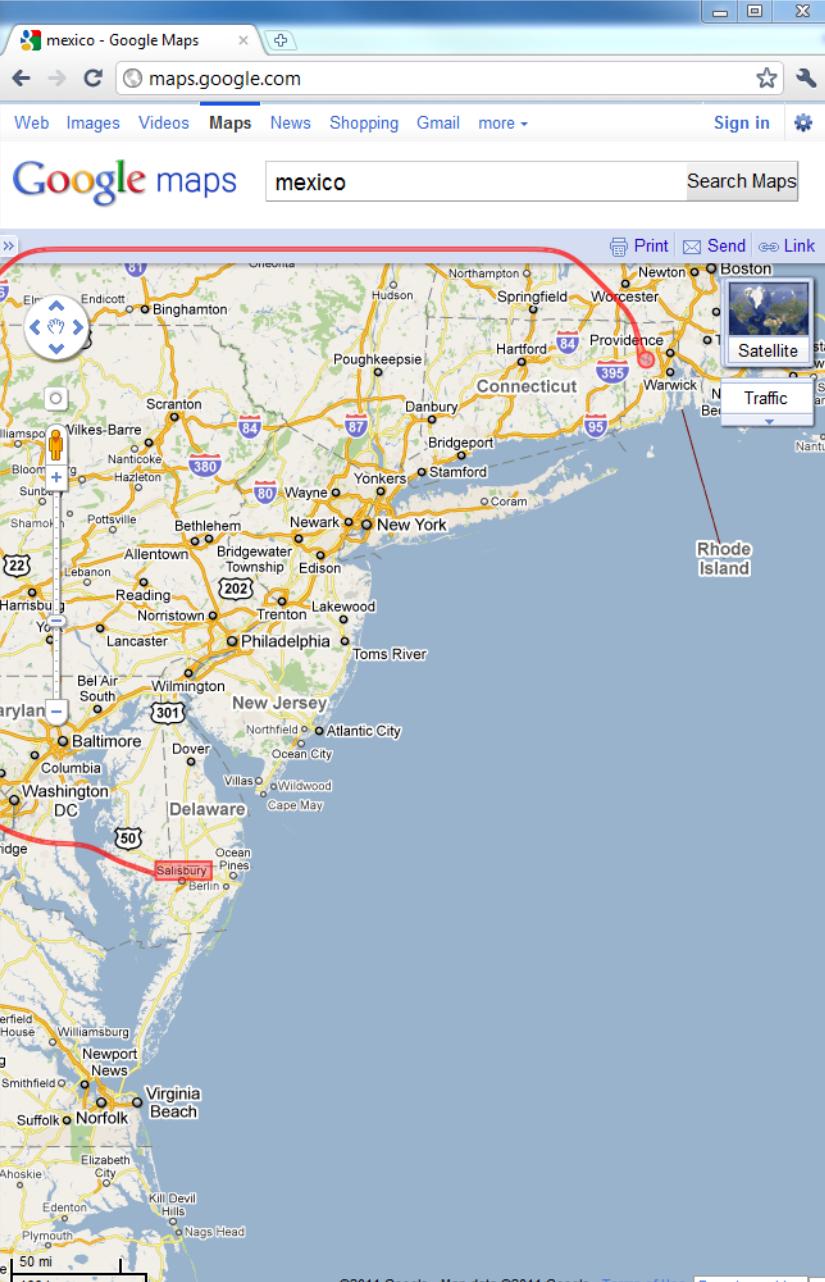
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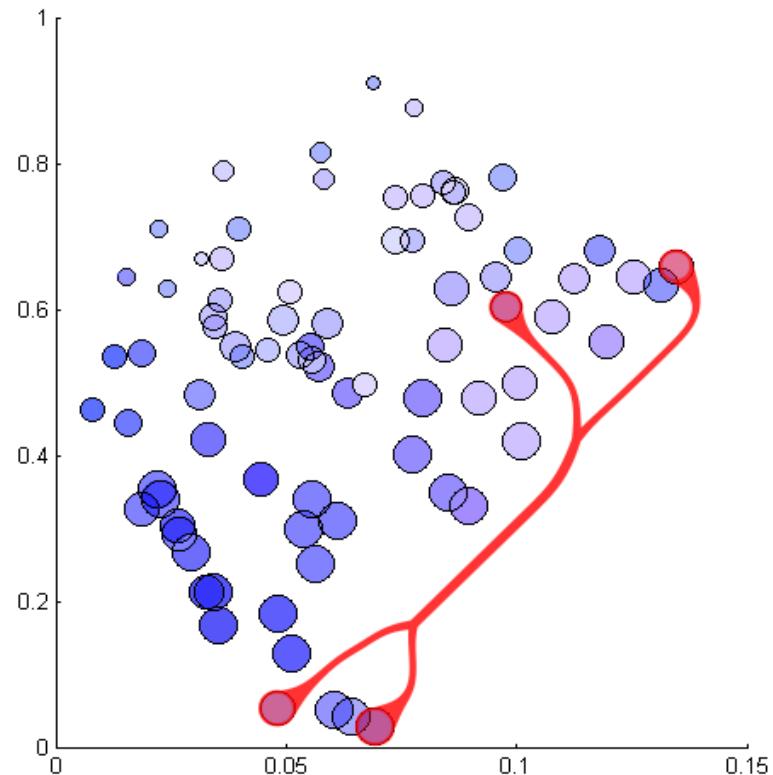
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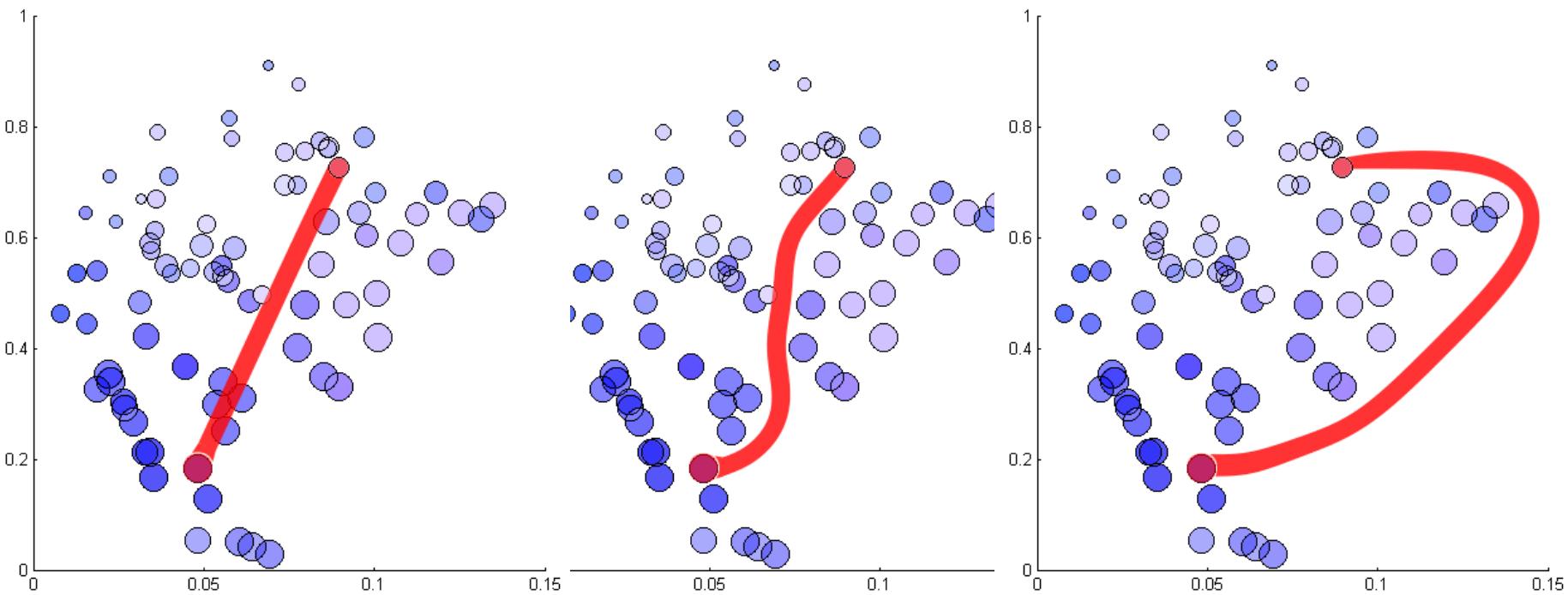
# Context-Preserving Visual Links

# Design Goals: Optimal link routes...

1. minimal length
2. minimal occluded information
3. visually distinguishable
4. unnecessary link-segments are avoided (bundling)



# Tradeoff



# System Overview



# Important Content

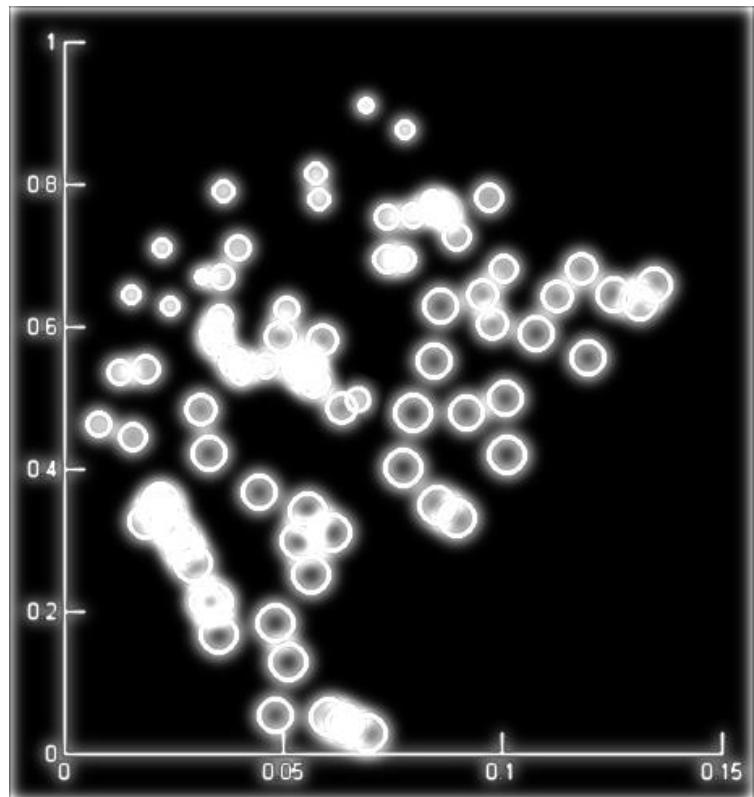
## Bottom-Up Visual Saliency

[Itti 98]

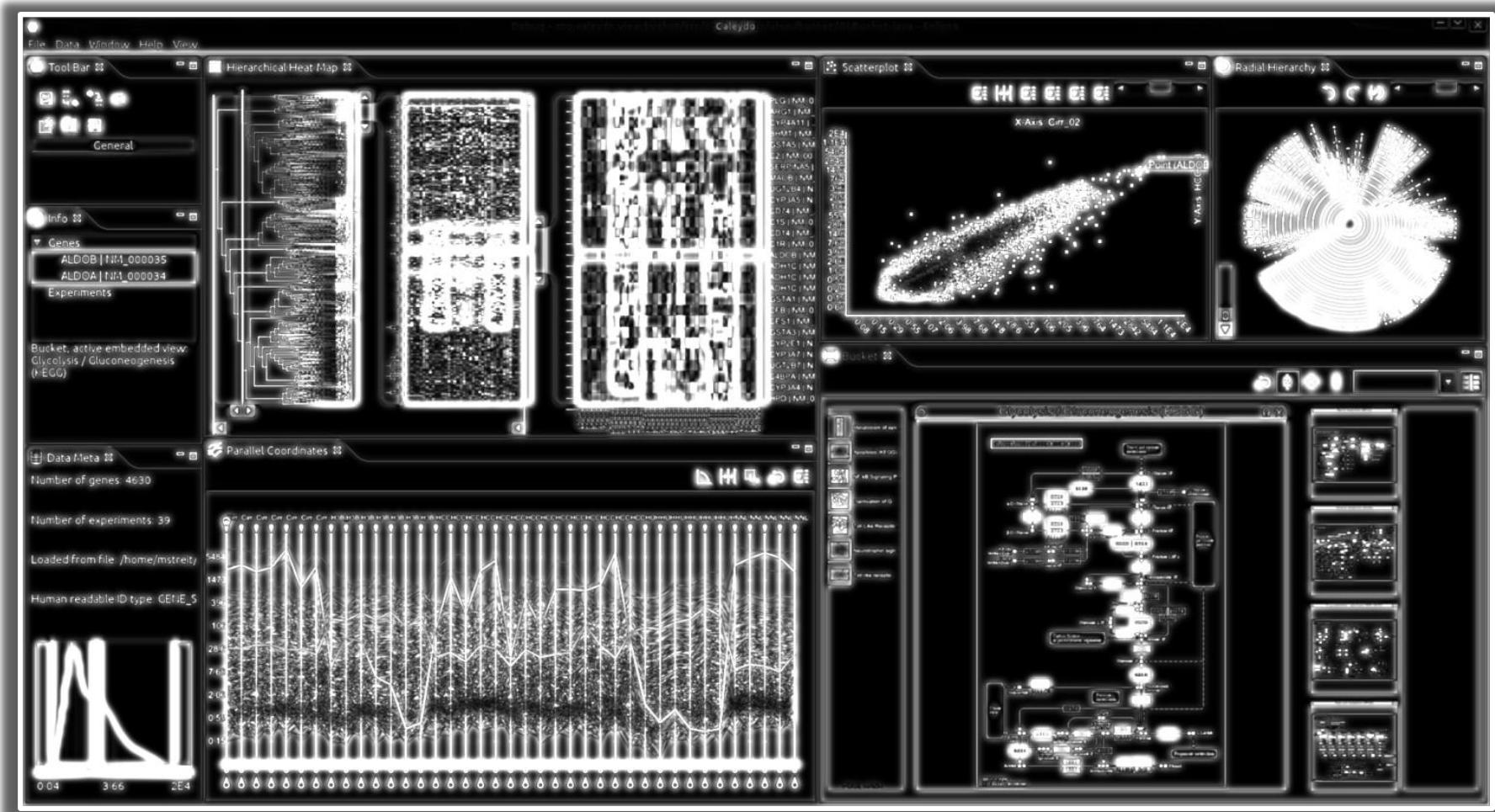
Based on human visual system

What stands out in images

Ignores high-level cognitive system



# Saliency for a complex scene

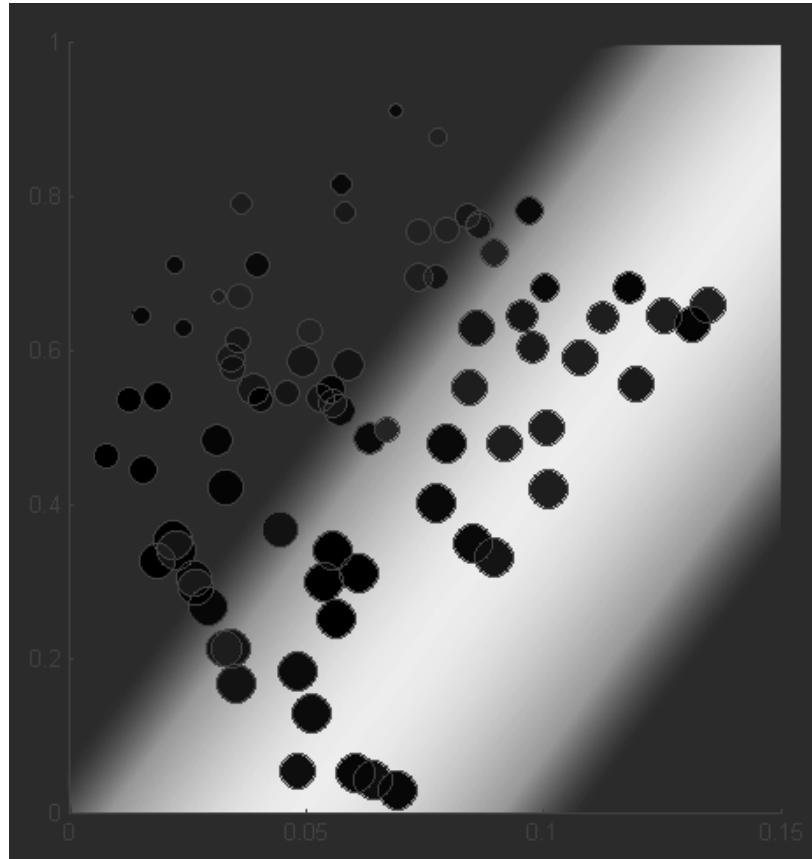


# Color Similarity

Non-fixed link color:  
choose distinguishable color

Otherwise: compute color  
similarity for every region

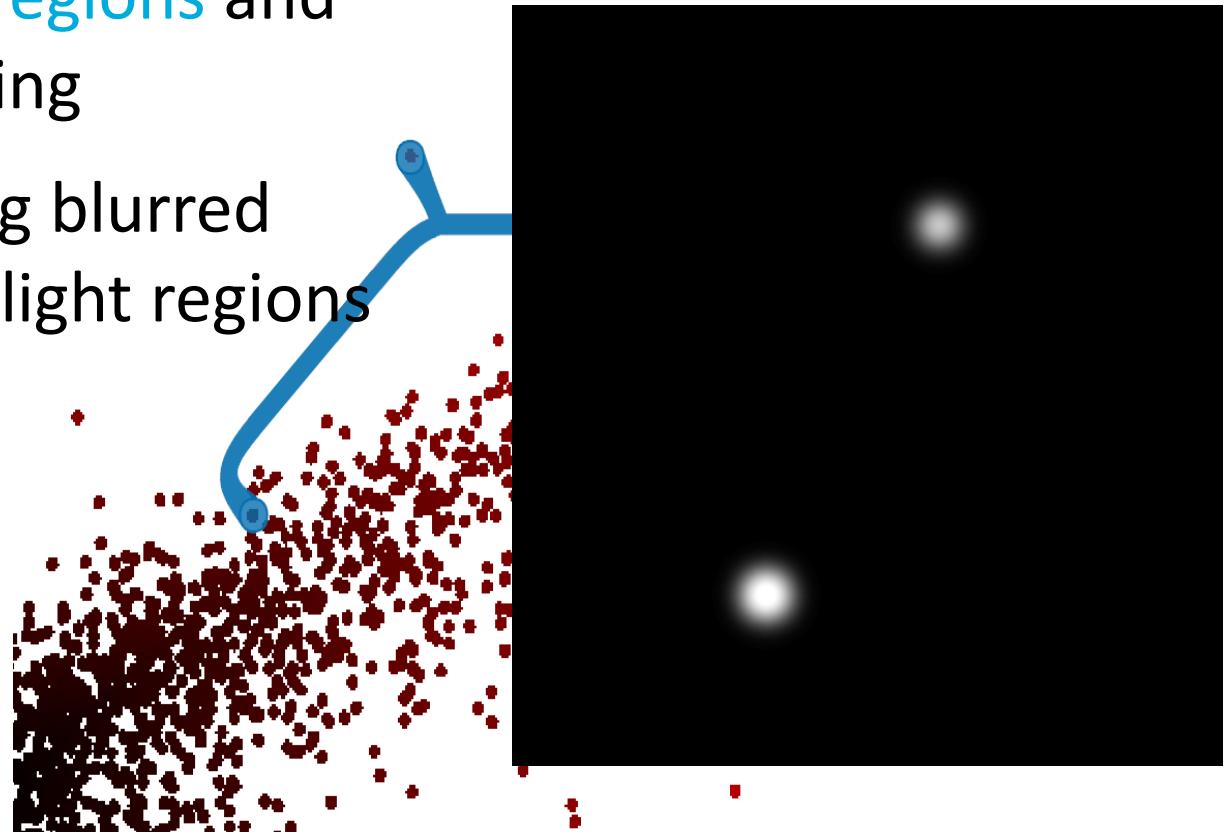
Requires base representation  
as image



# Highlight Regions

Avoid highlight regions and  
their surrounding

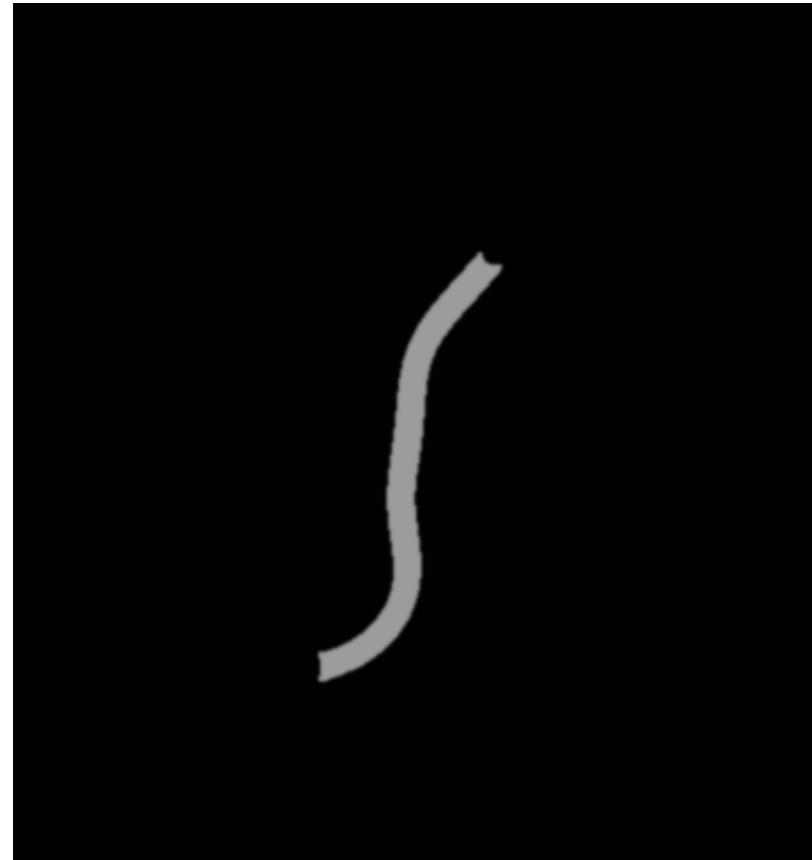
Realized by using blurred  
version of highlight regions



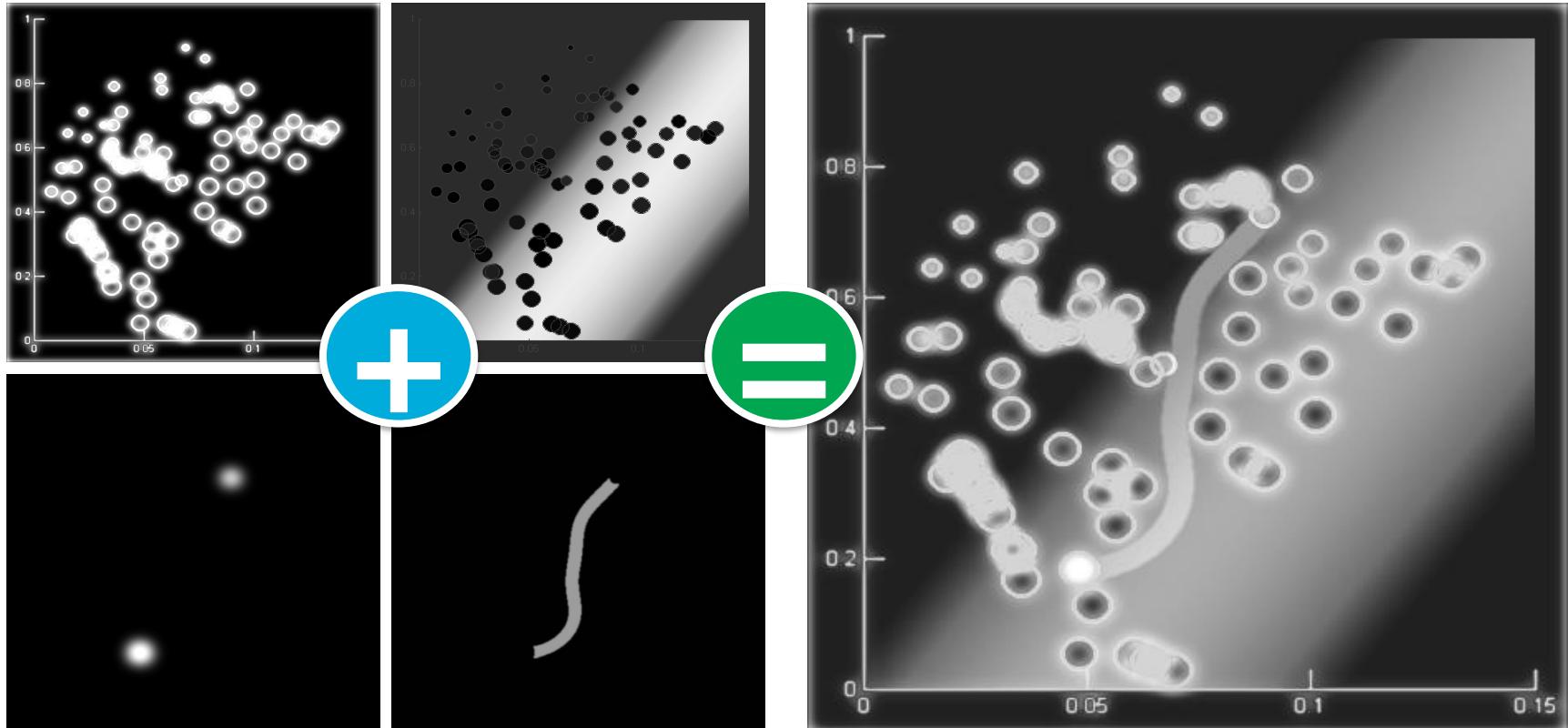
# Other Link Sets

To support **multiple linksets**,  
we require a fixed priority  
among the linksets

Add high priority links as  
regions to avoid



# Combined Penalties



# System Overview



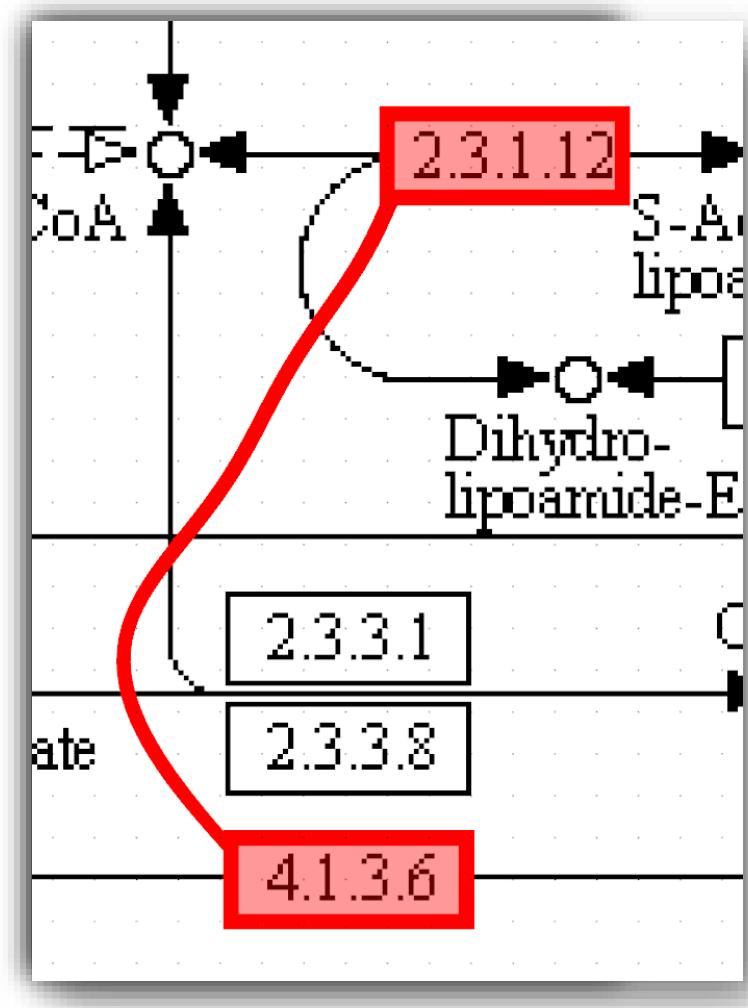
# Routing

Multiple source shortest path problem

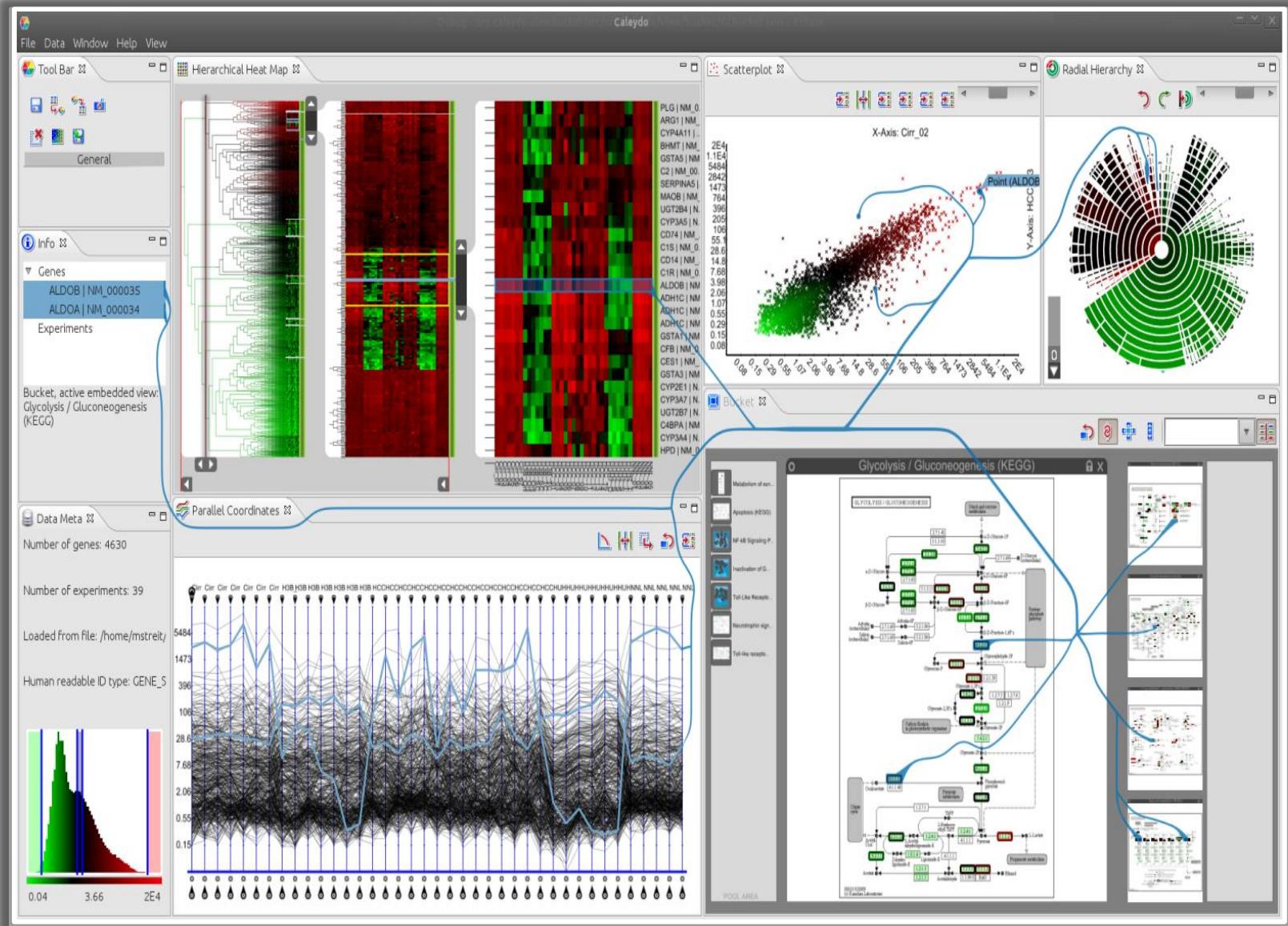
Penalty map for crossing different regions

Discretized version

Modified version of Dijkstra's Algorithm



# Technique applied to Caleydo



# Evaluation: Hypothesis

Visual links lead to a better performance than conventional highlights.

Context-preserving visual links do not have a negative impact on performance.

Context-preserving visual links have a positive impact on user satisfaction.

# Task: Visual Search

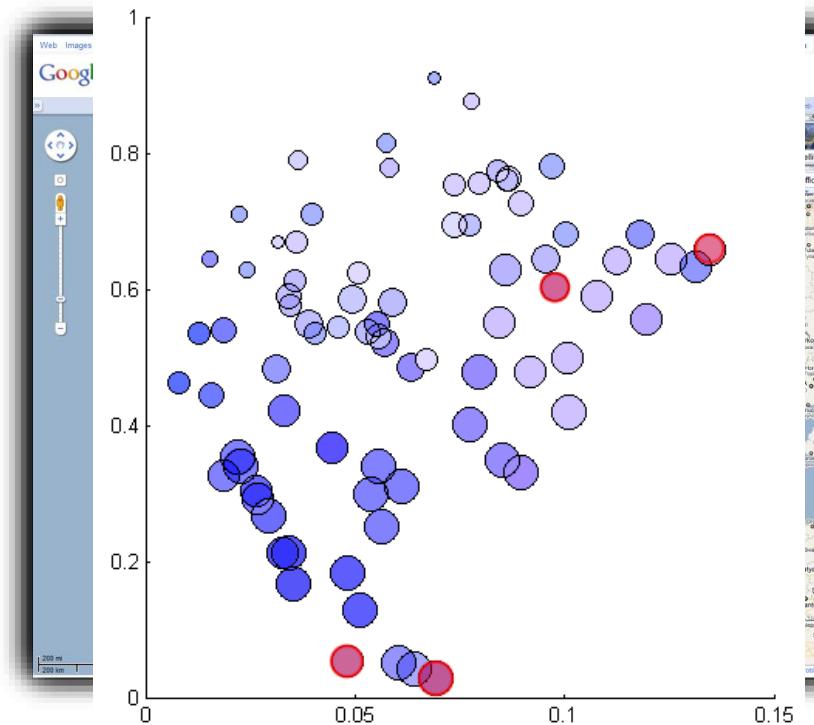
Count number of highlight regions (5 to 12)

Correctness and speed

Variety of visualizations

Eye-Tracker

Context information not required for task

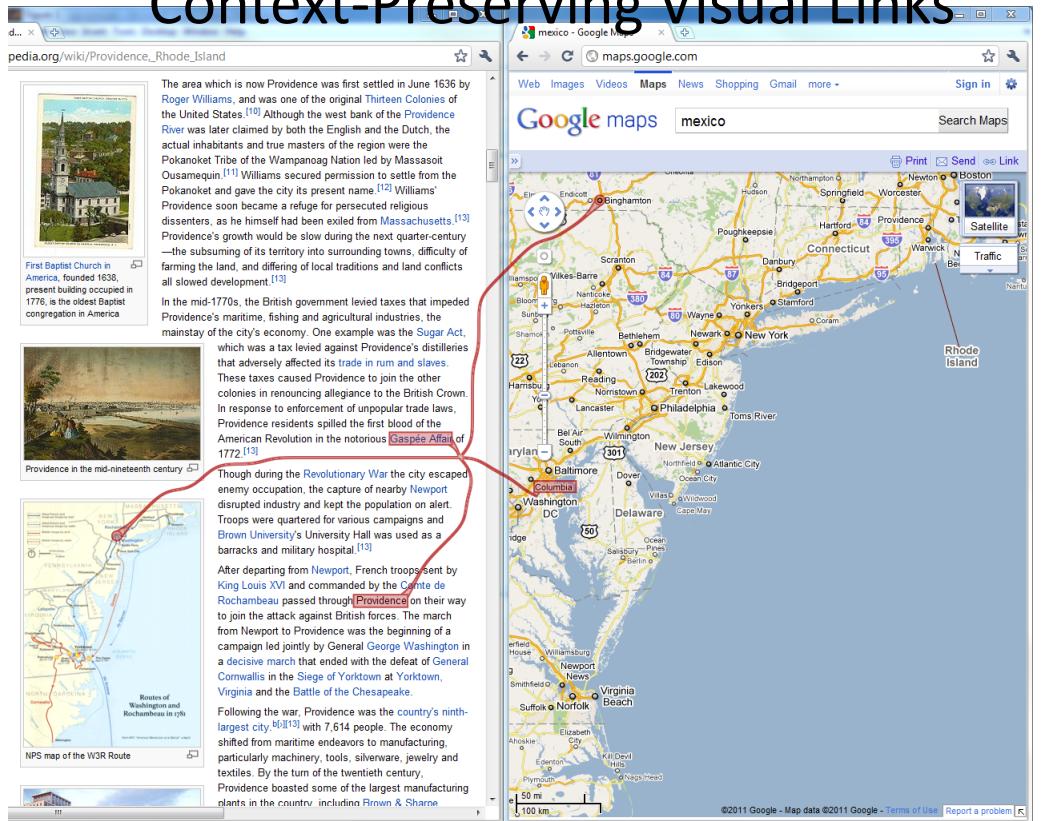


# Three Techniques

Frame/color based highlighting

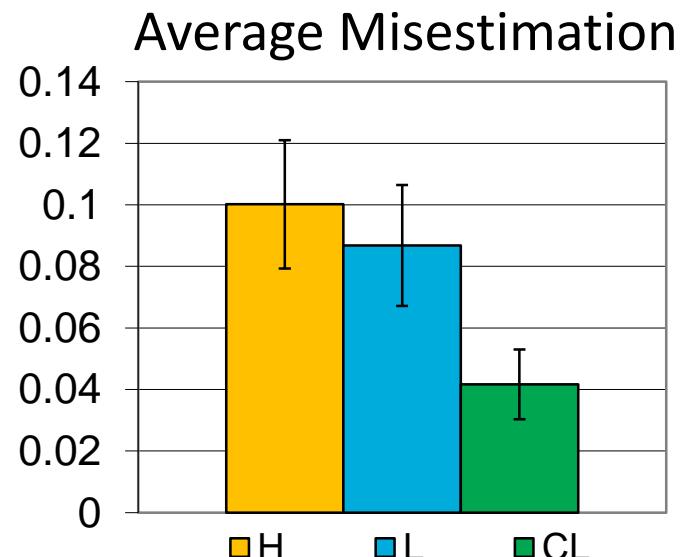
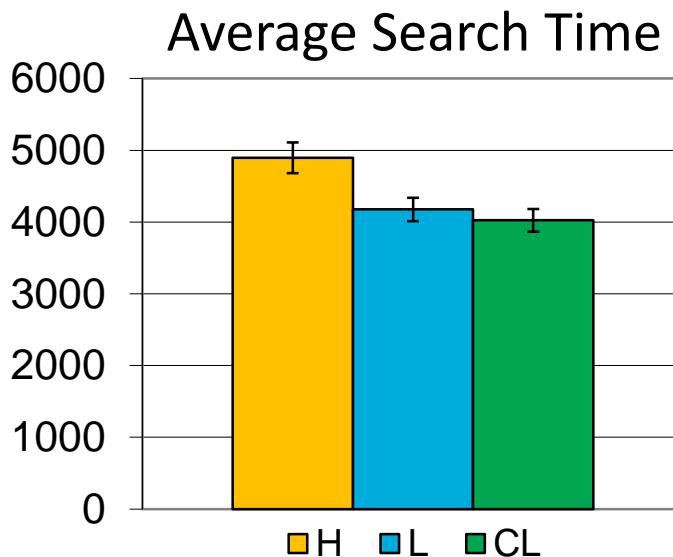
Straight Visual Links

Context-Preserving Visual Links



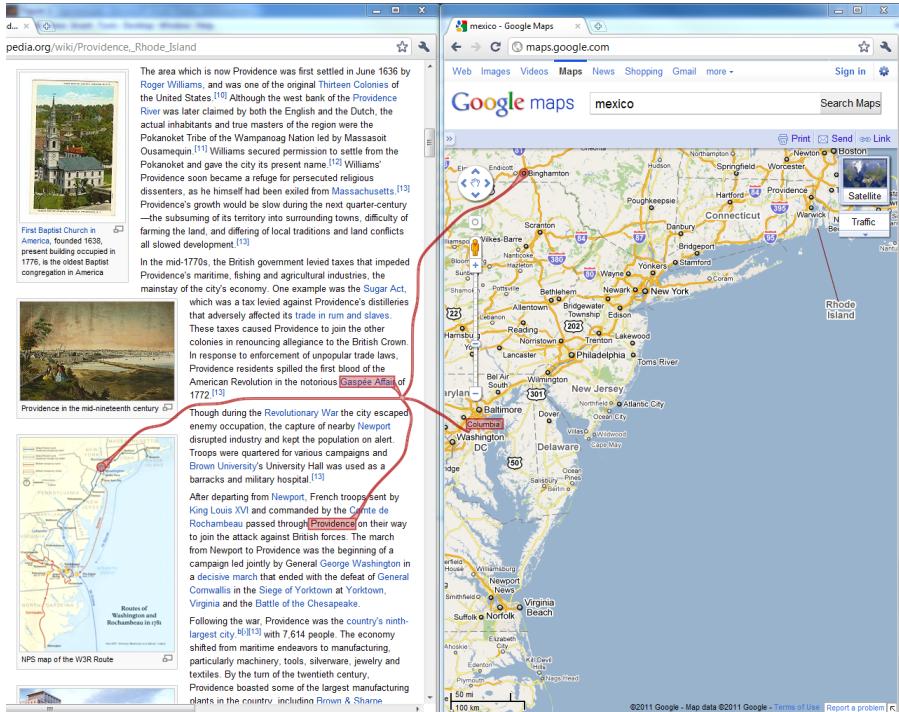
# Results

- Contextual highlights leading to better link performance than conventional highlights.

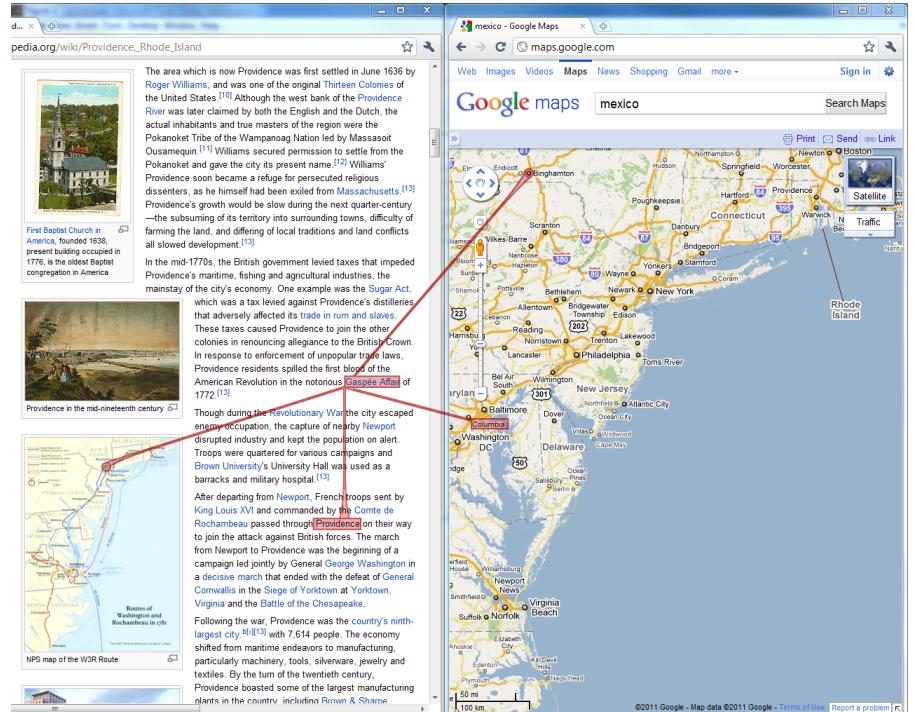


# Gaze Plots

## Context Based highlighting

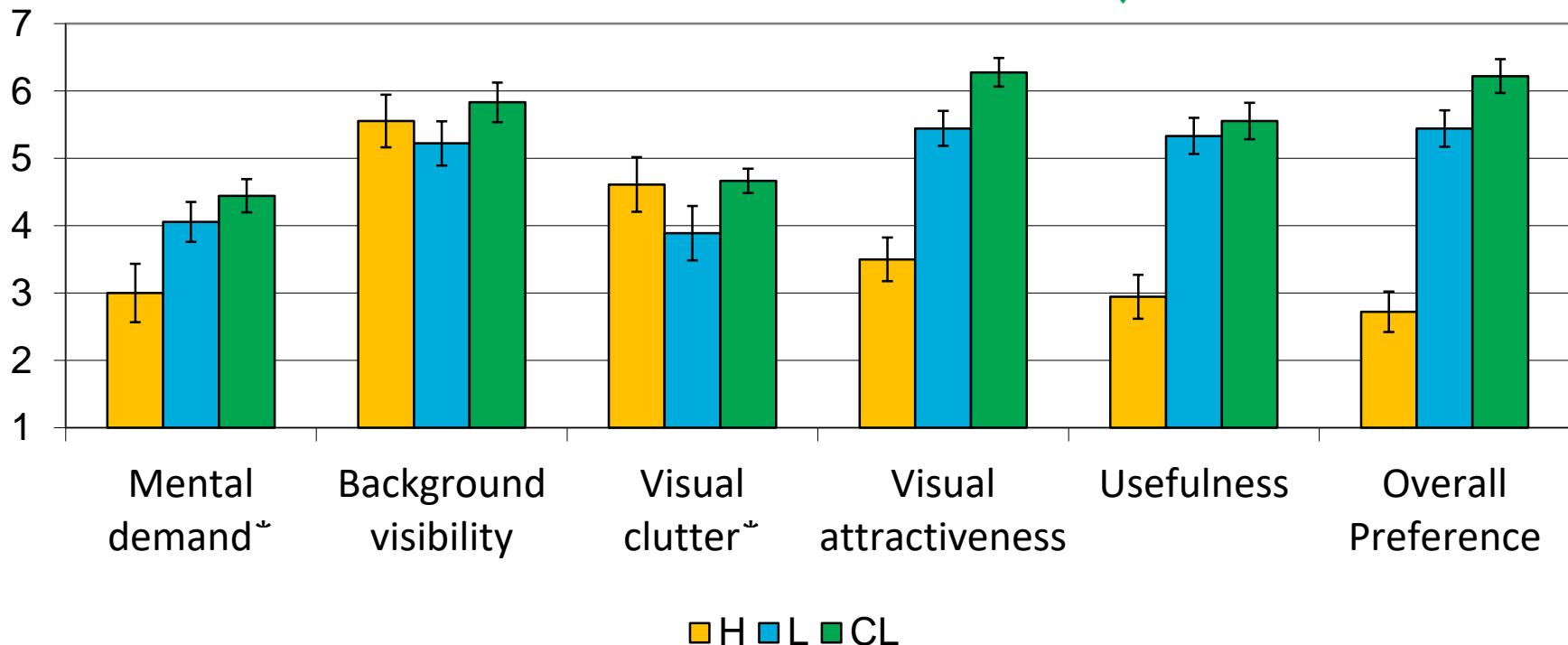


## Straight Visual Links



# Results

- Context-preserving visual links have a positive impact on user satisfaction.



# Context-Preserving Visual Links

## Summary

Context-preserving visual links ...

...avoid occlusion of important content in the BR

...can be adjusted to visually stand out from the  
BR

...do not harm performance when compared to  
non-routed visual links

# Connectedness Reccomendation

Use connectedness if:

You need the additional ink to make the links **stand out from the BR**

You want to show **many different relationships** (e.g. as in a graph)

You **can not** easily **modulate** the visual rep of the items

You want to make sure that **nothing** is **overlooked**

# Connectedness Reccomendation

Be careful if:

You only have a handful of classes but a high # items

You need a very fast implementation

Making connectedness run efficiently is often not trivial!

# **WHAT'S NEXT: WHEN TO LINK? BY MARC**