

# Connecting The Dots

## Showing Relationships in Data and Beyond

Marc Streit<sup>1</sup>, Hans-Jörg Schulz<sup>2</sup>, Alexander Lex<sup>3</sup>

VisWeek Tutorial 2012

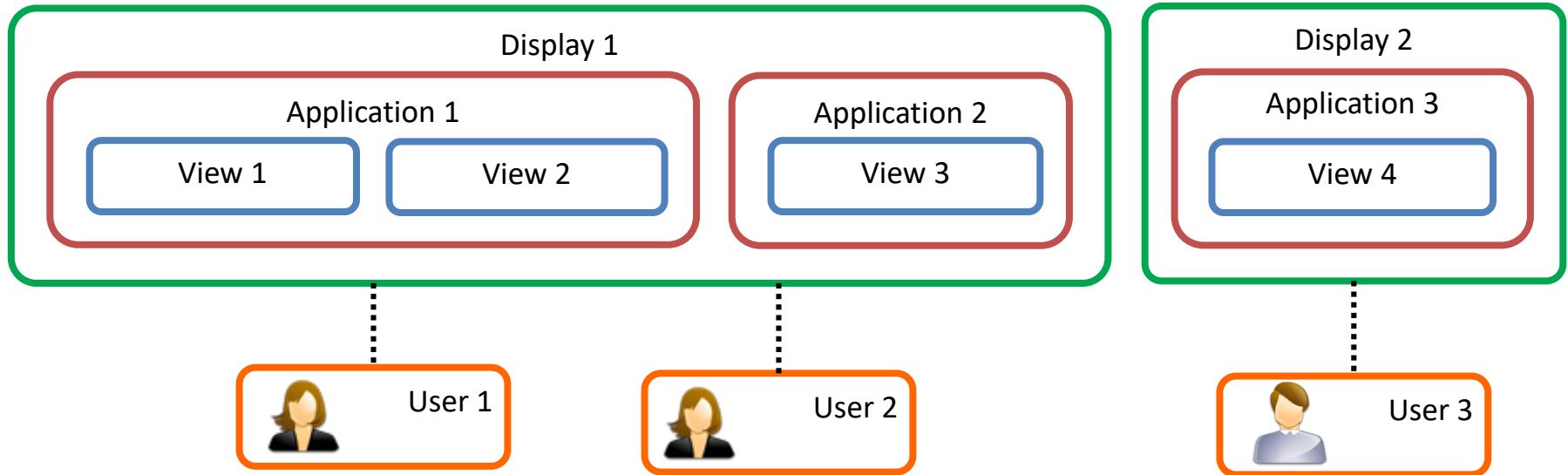


1. Johannes Kepler University Linz, Austria
2. University of Rostock, Germany
3. Harvard School of Engineering and Applied Sciences, Cambridge, MA, USA

# PART III: WHEN TO LINK?

Speaker: Marc Streit

# Heterogeneity of Linking



# Clarification

Part III orthogonal to Part I and II

Could be linking on data/view/interaction level

Could be any linking technique

# View vs. Visualization

## Visualization [Kosara 2008]

Visual representation that  
is based on (non-visual) data  
produces an image  
is readable and recognizable

## View [Card, Mackinlay and Shneiderman 1999]

Physical display space (most often 2D) where a visual structure is rendered

# Single Visualization

Showing a single relationship in the data



D3.js Line Chart Example

# Composite Visualization Views (CVV)

[Javed and Elmquist 2012]

Create new visualizations by **combining** different visualizations

$$\begin{array}{c} \text{A} \\ \otimes_{\text{jux}} \\ \text{B} \end{array} = \begin{array}{c} \text{A} \quad \text{B} \end{array}$$

Juxtaposition  
(Integrated Views)

$$\begin{array}{c} \text{A} \\ \otimes_{\text{sup}} \\ \text{B} \end{array} = \begin{array}{c} \text{A} \quad \text{B} \end{array}$$

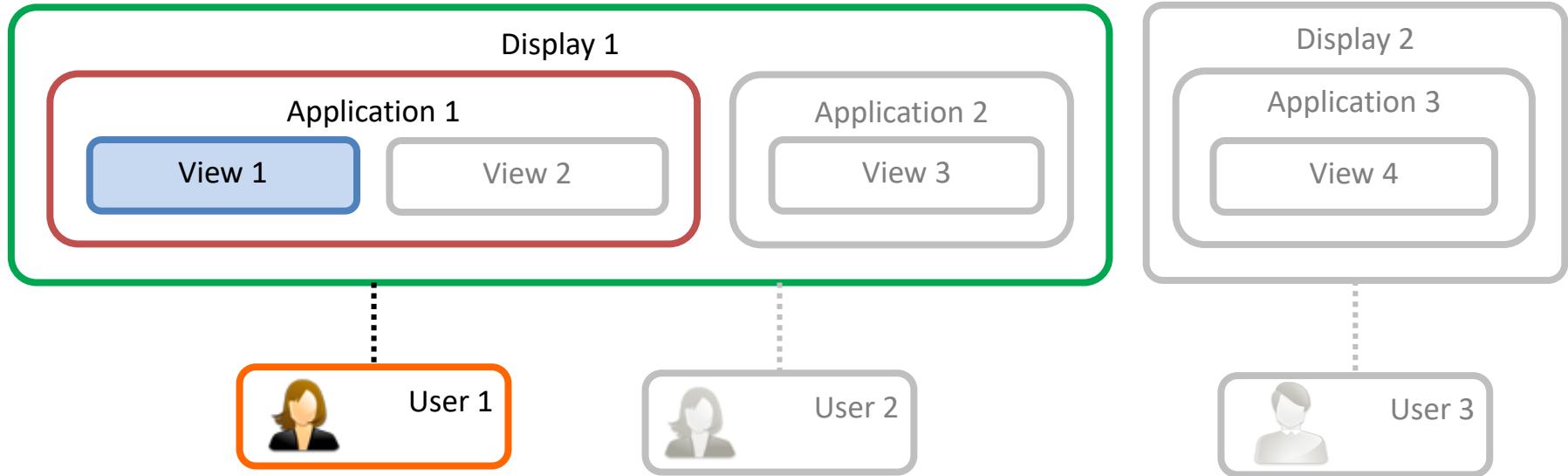
Superimposition

$$\begin{array}{c} \text{A} \\ \otimes_{\text{ovl}} \\ \text{B} \end{array} = \begin{array}{c} \text{A} \quad \text{B} \end{array}$$

Overloading

$$\begin{array}{c} \text{A} \\ \otimes_{\text{nst}} \\ \text{B} \end{array} = \begin{array}{c} \text{A} \\ \quad \text{B} \\ \quad \text{B} \\ \quad \text{B} \end{array}$$

Nesting



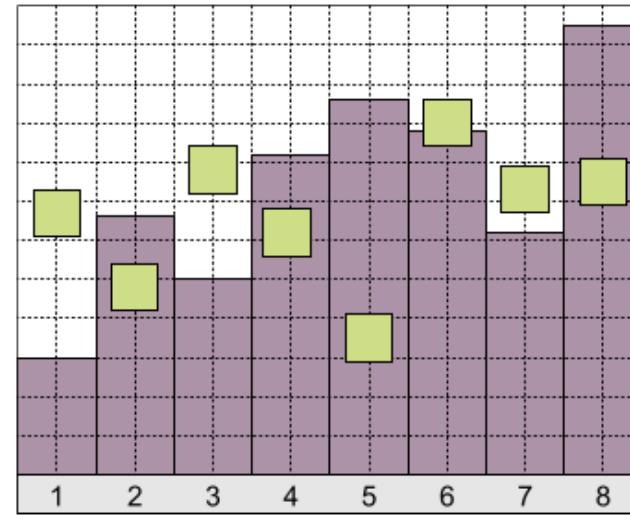
# LINKING WITHIN A SINGLE VIEW

# Composite Vis: Superimposition

Overlay of two or more visual spaces on top of each other

1:1 spatial linking

$$A \otimes_{\text{sup}} B = AB$$

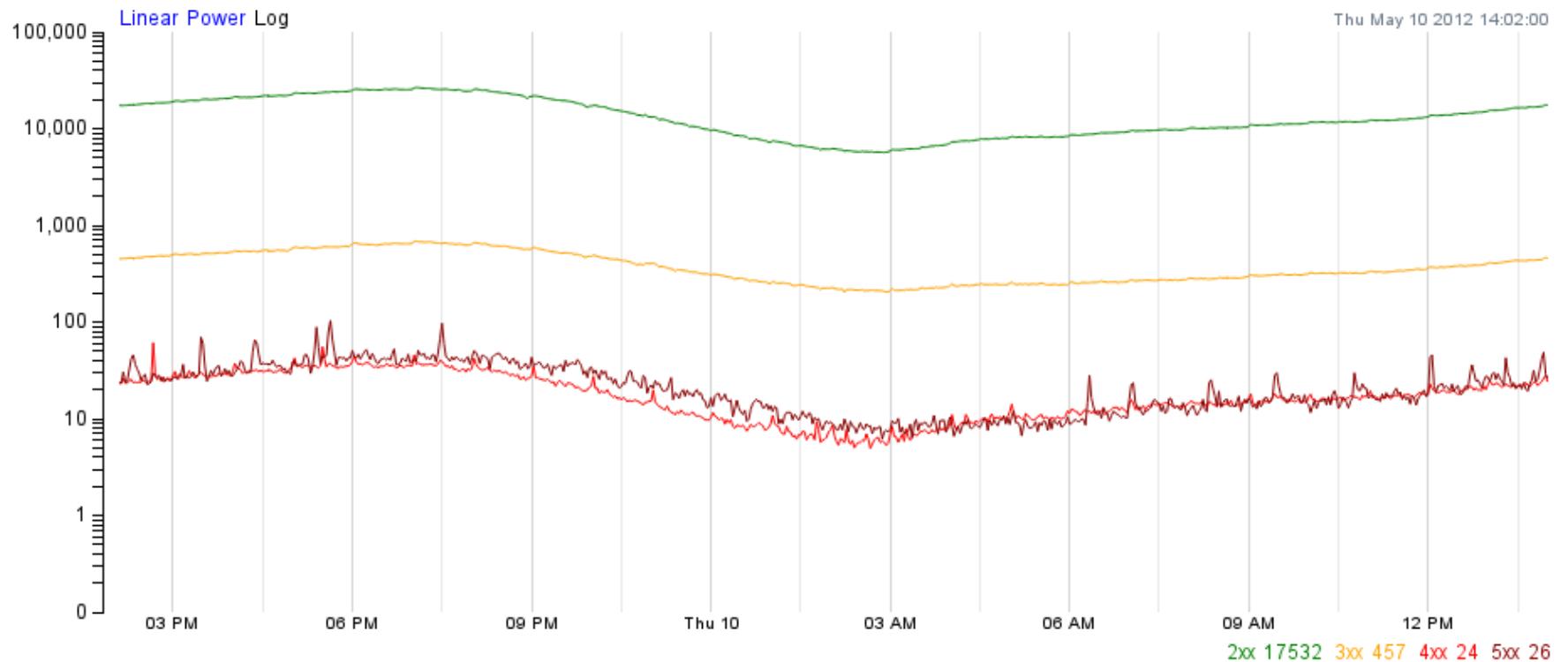


$$A \otimes_{\text{sup}} B = AB$$

Superimposition

# Superimposition Example

With several data series

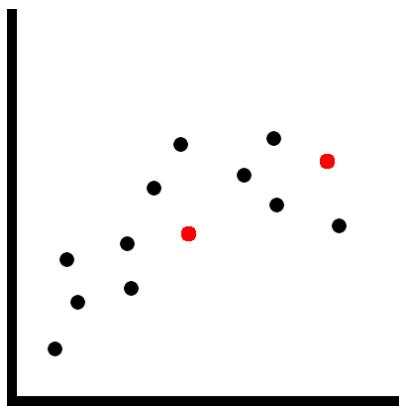


D3.js Interactive Line Graph Example

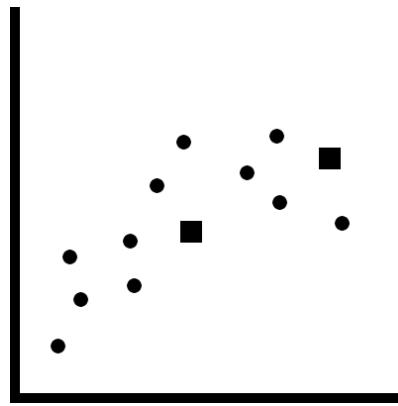
$$A \otimes_{\text{sup}} B = AB$$

Superimposition

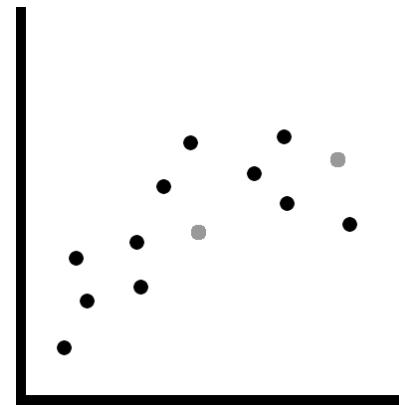
# Base Representation with Supplemented Links



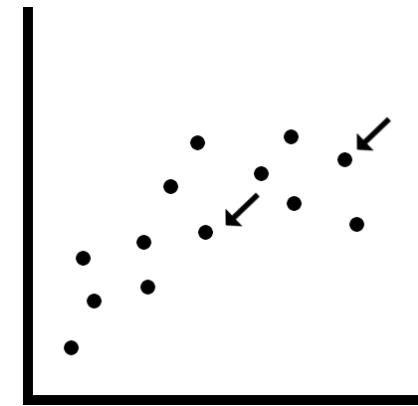
Color



Shape



Value



Glyph

$$A \otimes_{\text{sup}} B = AB$$

Superimposition

# Example: Graphical Overlays

[Kong and Agrawala 2012]

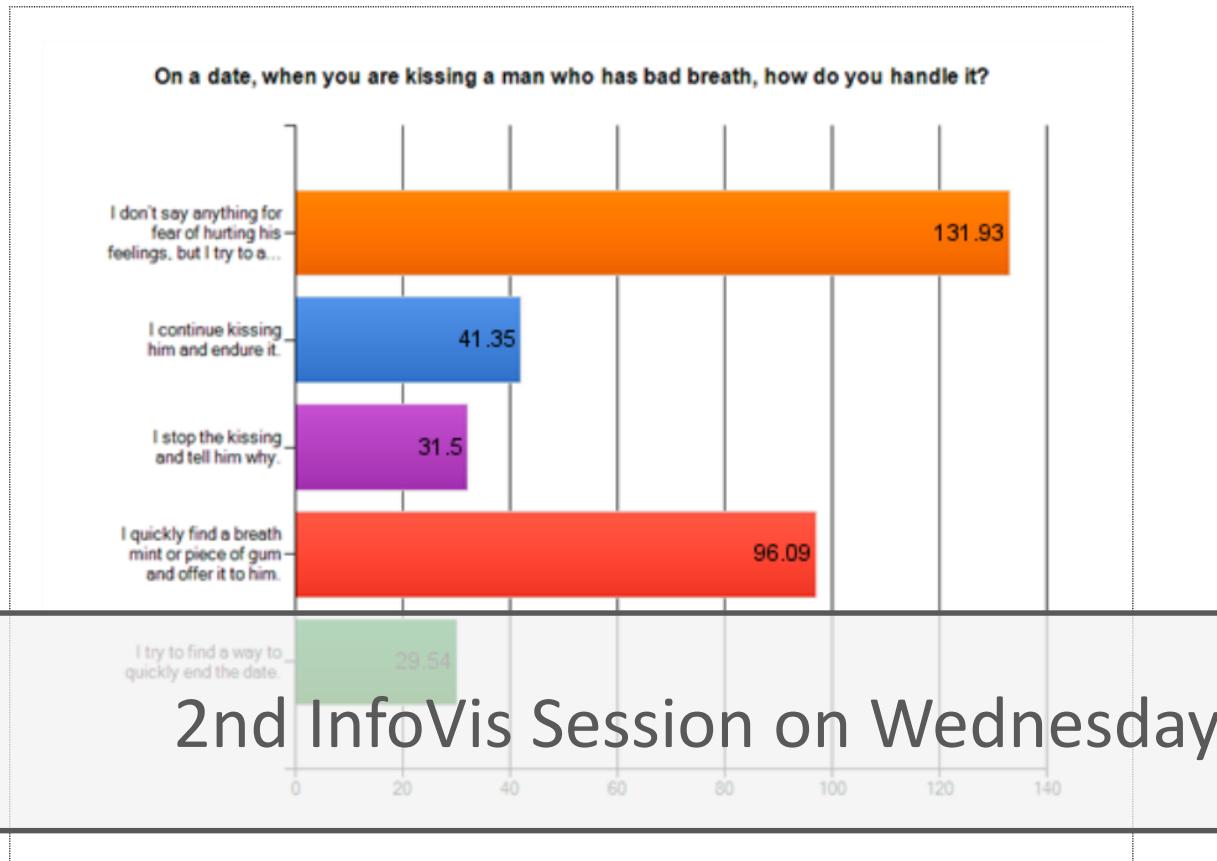


Chart type: Bar

Chart: 00193

Overlay type: Redundant encodings

- Data labels
- Line joining bars

**Parameters**

- Static  Interactive
- Inside  Outside

Font size: 8

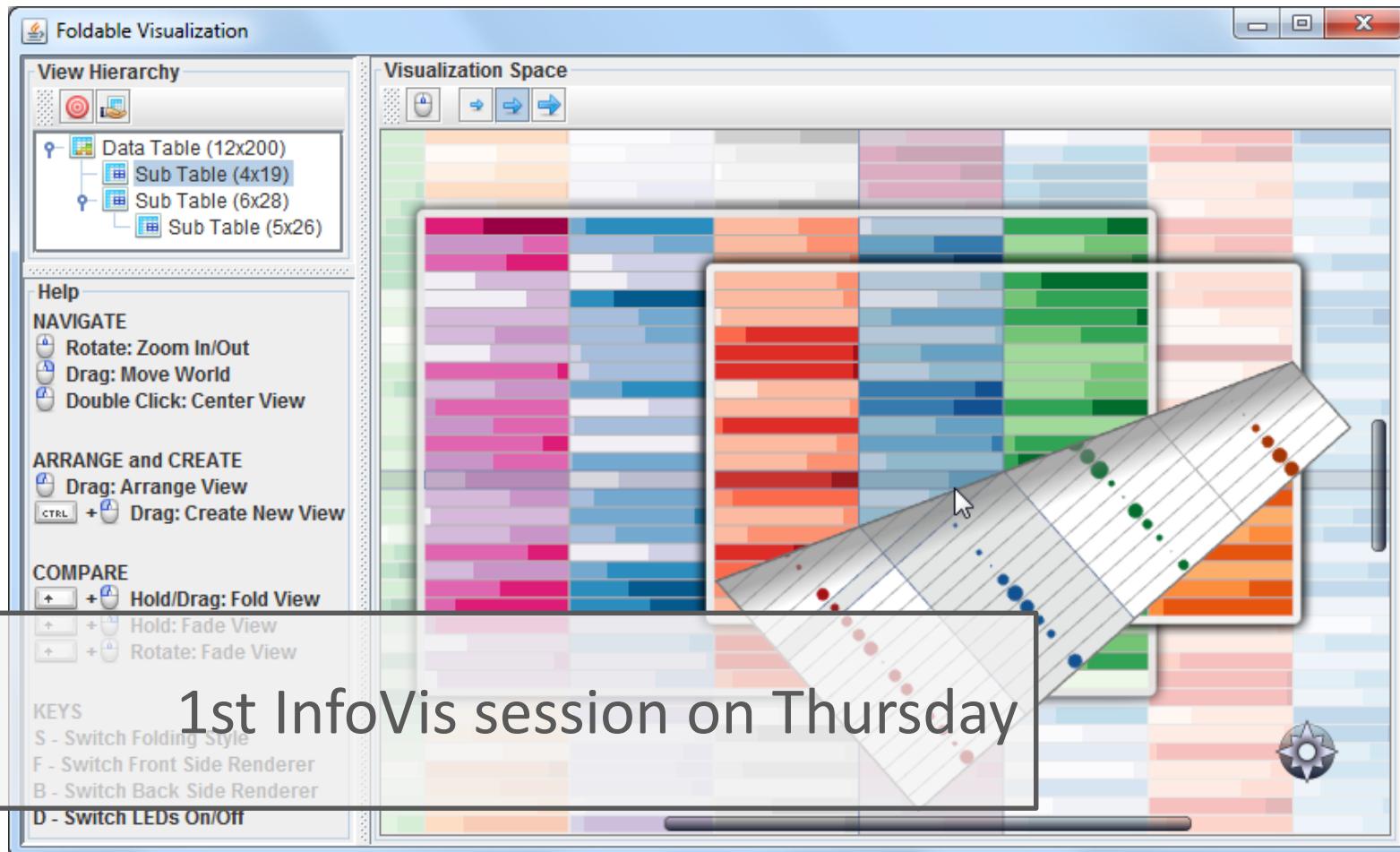
Overlays data labels inside or outside each mark.

More examples: <http://vis.berkeley.edu/papers/grover>

$$A \otimes_{\text{sup}} B = AB$$

Superimposition

# Visual Comparison Inspired by Natural Behavior



FoldableVis [Tominski et al. 2012]

# Composite Vis: Overloading

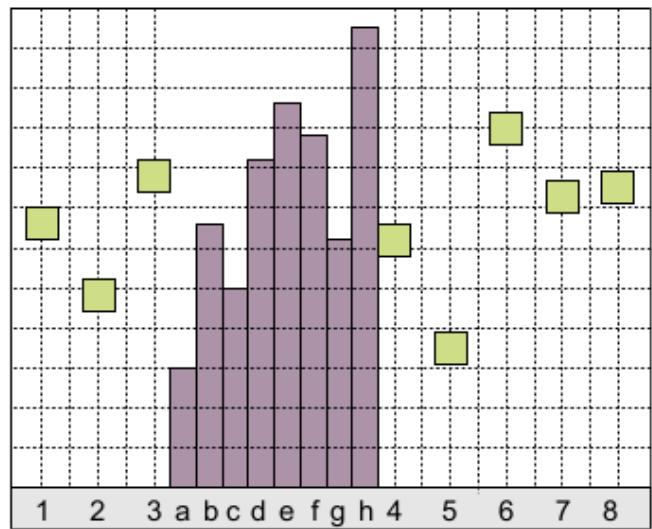
One visualization rendered inside another visualization

Host / client visualization

Same spatial mapping

No 1:1 spatial linking

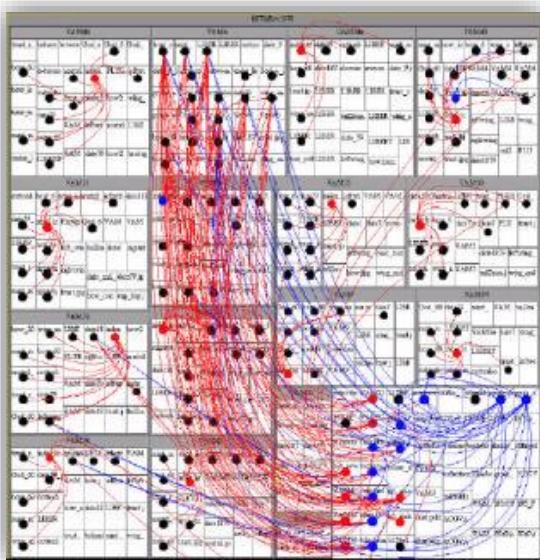
$$\boxed{A} \otimes_{\text{ovl}} \boxed{B} = \boxed{A} \boxed{B}$$



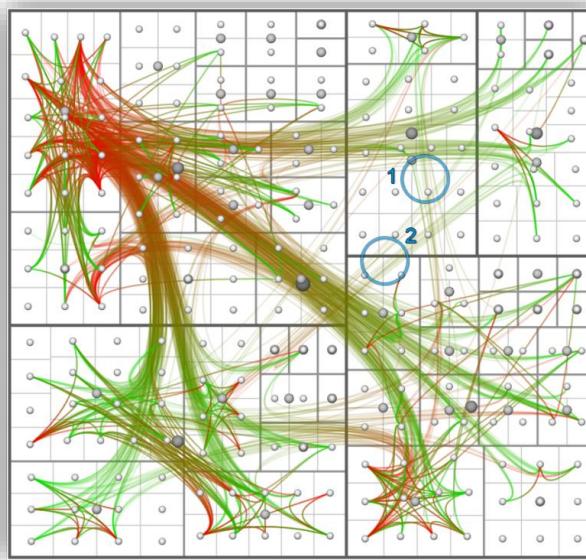
$$A \otimes_{\text{ovl}} B = AB$$

Overloading

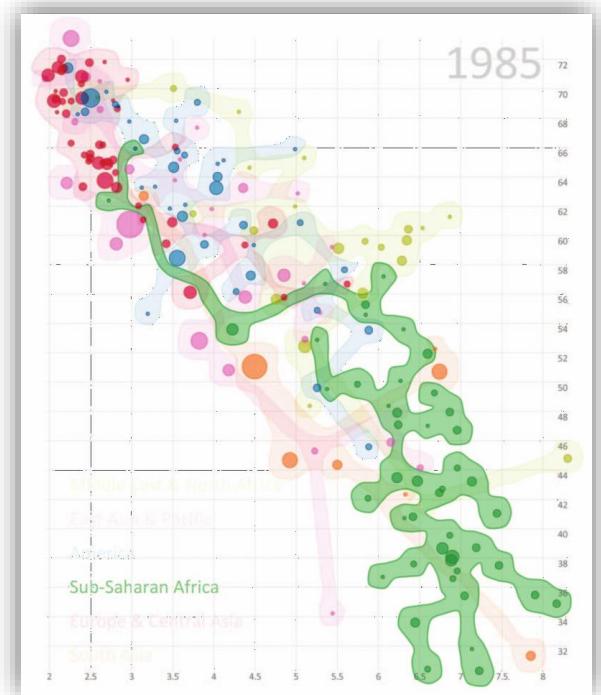
# Overloading Examples



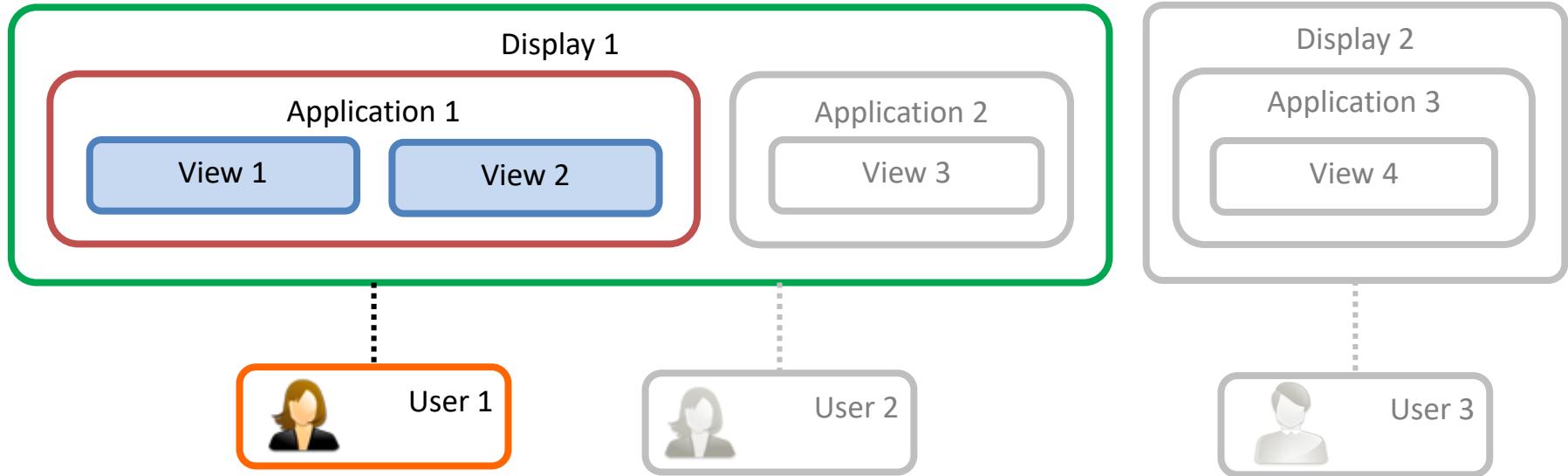
Treemap Overlay  
[Fekete et al. 2003]



HEB [Holten et al. 2006]



[Collins et al. 2009]



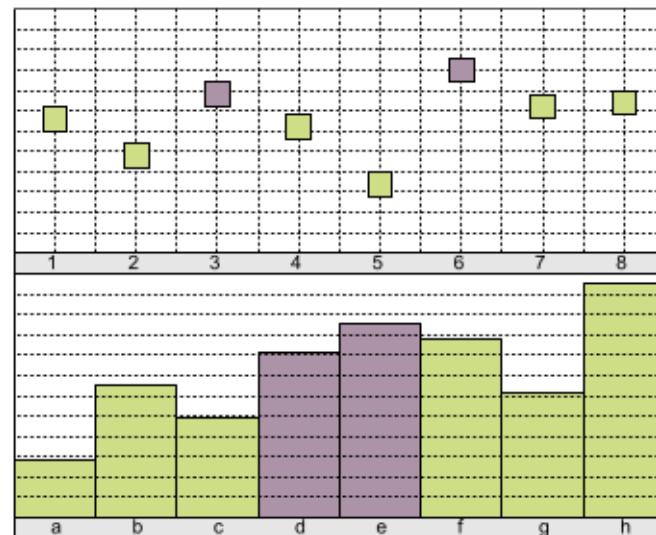
# LINKING ACROSS MULTIPLE VIEWS

# Composite Vis: Juxtaposition

Show visualizations in a side-by-side fashion

Very prominent paradigm

$$A \otimes_{\text{jux}} B = A B$$



$$A \otimes_{\text{jux}} B = AB$$

Juxtaposition

# Manual Comparison

## Cognitive work



$$A \otimes_{\text{jux}} B = AB$$

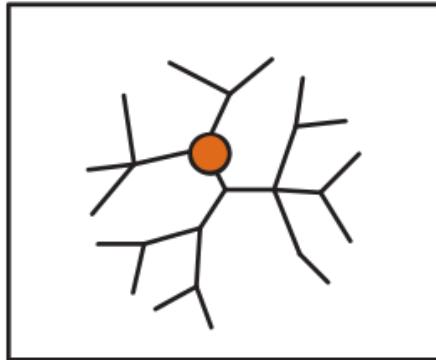
Juxtaposition

# Multiple Coordinated Views

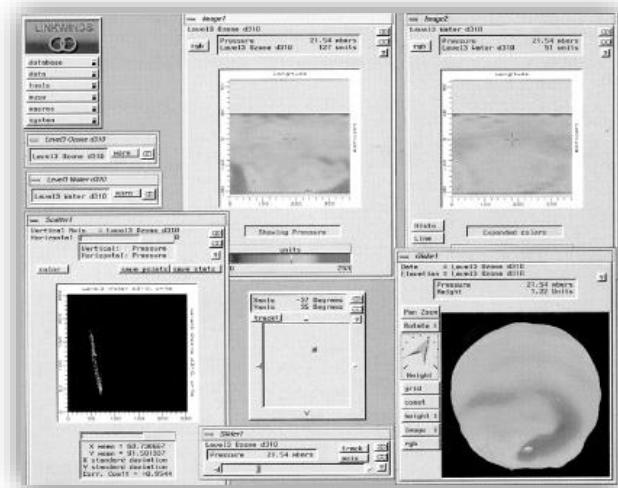
Actions in one view can be related to other view

Premise: *View and interact with data through different representations*

Coordination on diff. levels



[Colins and Carpendale 2007]



LinkWinds [Jacobson et al. 1994]

$$A \otimes_{\text{jux}} B = AB$$

Juxtaposition

# Linking & Brushing

**Linking**: Coordination between views

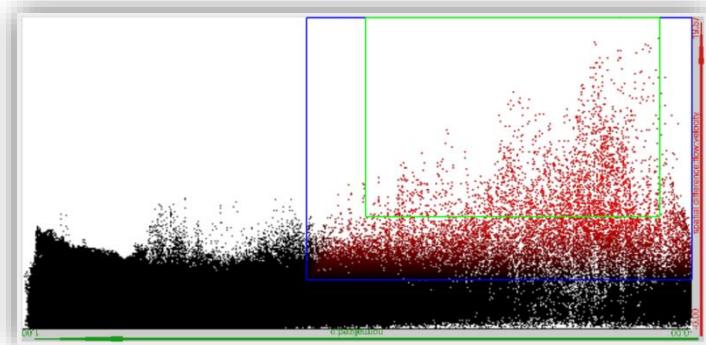
**Brushing**: Select groups of data points

Geometric functions such as:

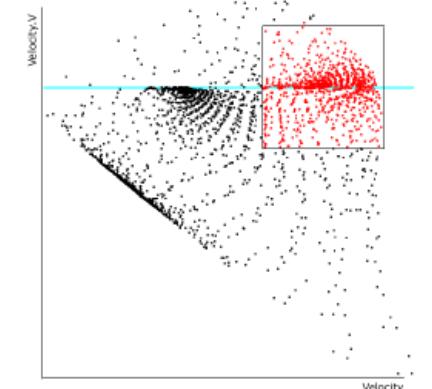
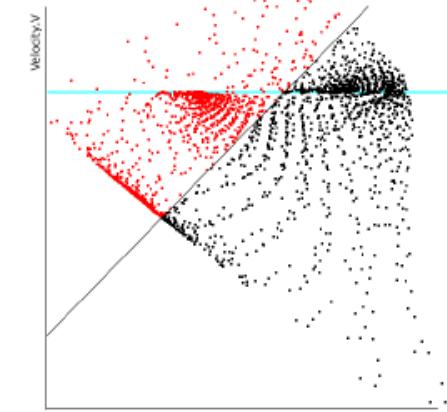
Rectangles, angles, free-form, lassos, etc.

Can be composite (AND, OR)

Can be continuous (smooth brush)



[Doleisch et al. 2004]



[Hauser et al. 2002]

$$A \otimes_{\text{jux}} B = AB$$

Juxtaposition

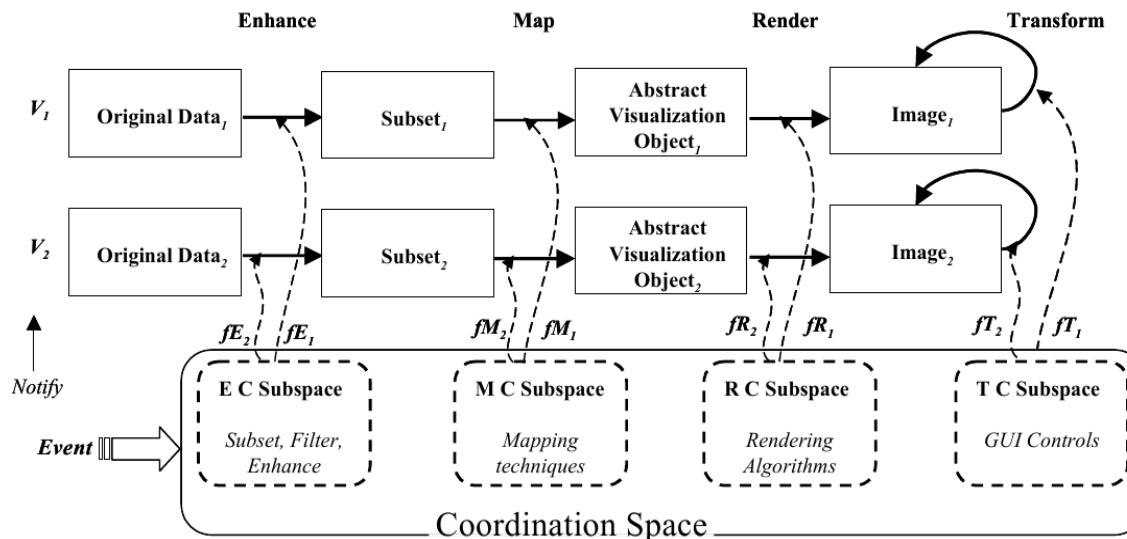
# Coordination on Different Levels

## Most Common Types

### Brushing

Navigational slaving (transformation, rotation)

Instead: coordinate on all levels of Vis Pipeline

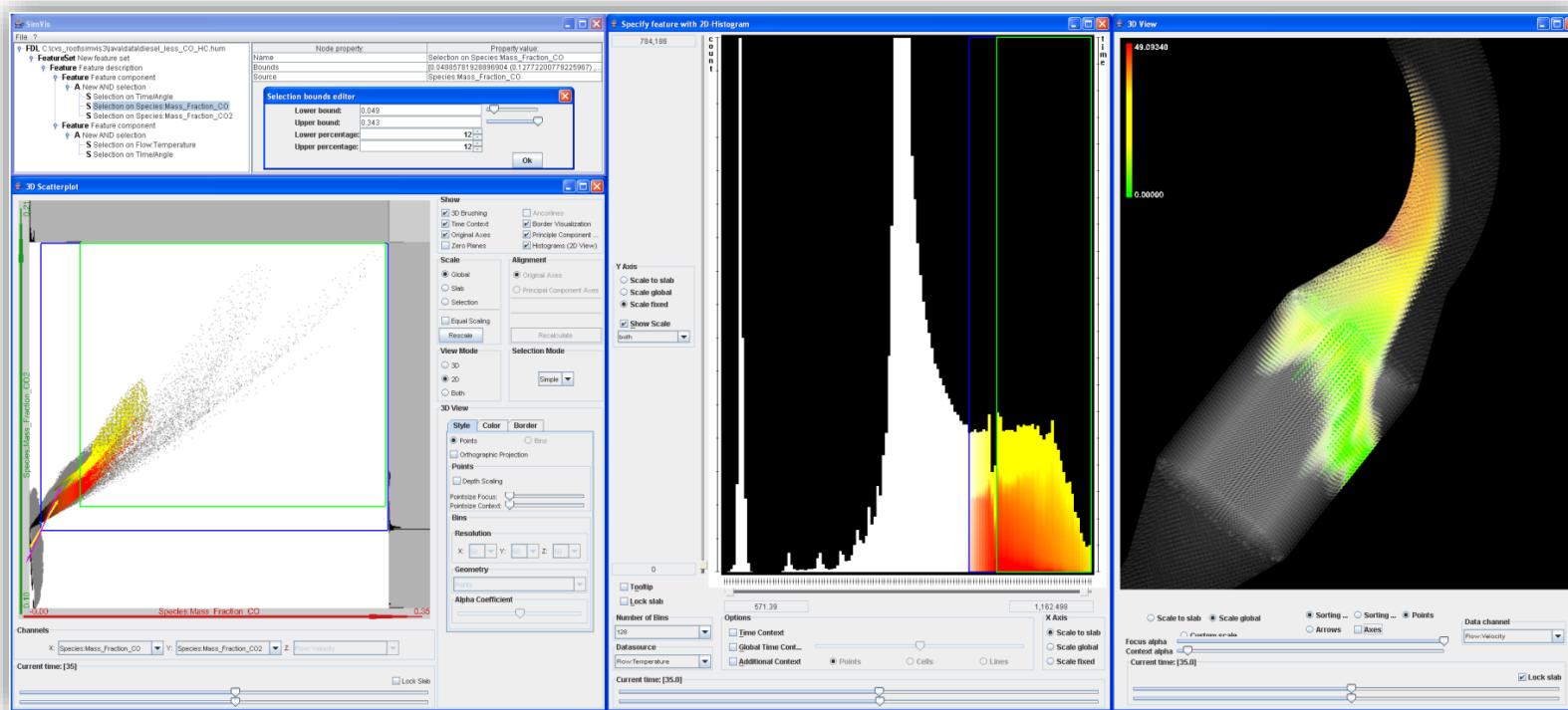


$$A \otimes_{\text{jux}} B = AB$$

Juxtaposition

# MCV Type 1

Different visualization techniques showing the same data



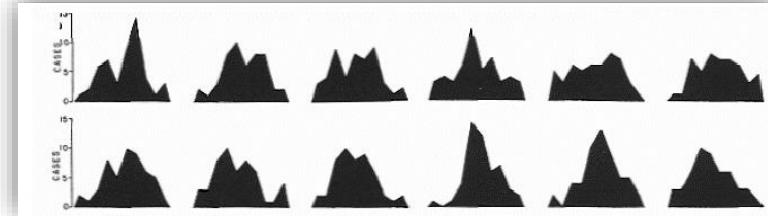
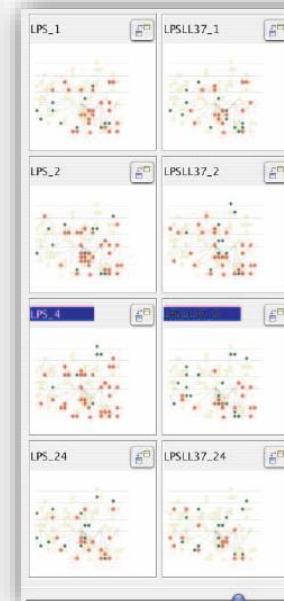
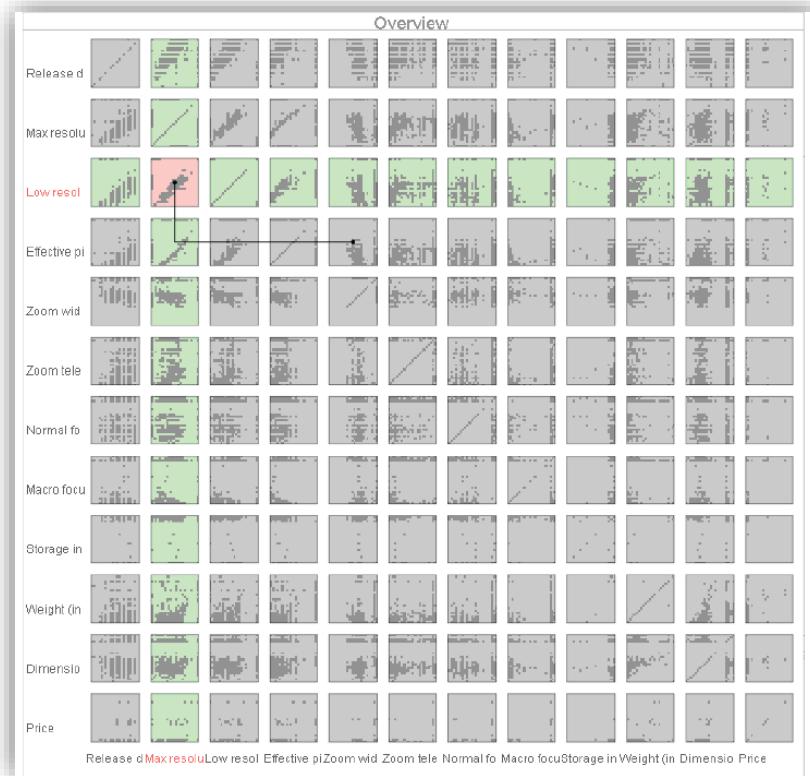
SimVis [Doleisch 2004]

$$A \otimes_{\text{jux}} B = AB$$

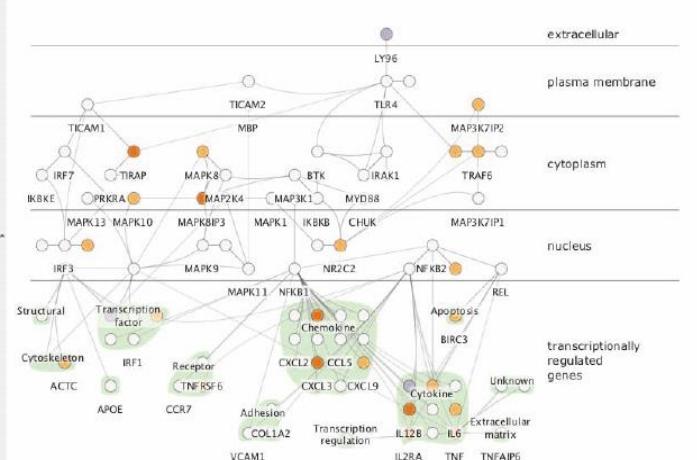
Juxtaposition

# MCV Type 2: Small Multiples

Same visualization technique  
showing different data



[Tufte 1993]



Cerebral [Barsky et al. 2008]

Rolling the Dice [Elmqvist et al. 2008]

$$\begin{array}{|c|} \hline A \\ \hline \end{array} \otimes_{\text{jux}} \begin{array}{|c|c|} \hline B & \\ \hline \end{array} = \begin{array}{|c|c|} \hline A & B \\ \hline \end{array}$$

Juxtaposition

# Guidelines for Using MCV

Rules on how to use multiple views

→ see [Baldonado et al. 2000]

## Cost-Benefit Tradeoffs

### Cognitive aspect

The time and effort required to learn the system

The load on the user's working memory

The effort required for comparison

The effort required for context switching

### System aspect

Computational requirements

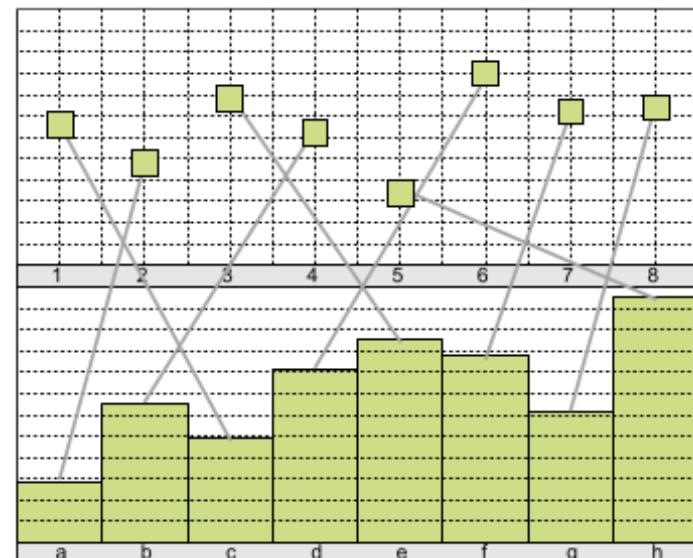
Display space requirements

# Composite Vis: Integrated Views

Visual composition is the same as for juxtaposition

Adds explicit visual links

$$\boxed{A} \otimes_{\text{jux}} \boxed{B} = \boxed{AB}$$

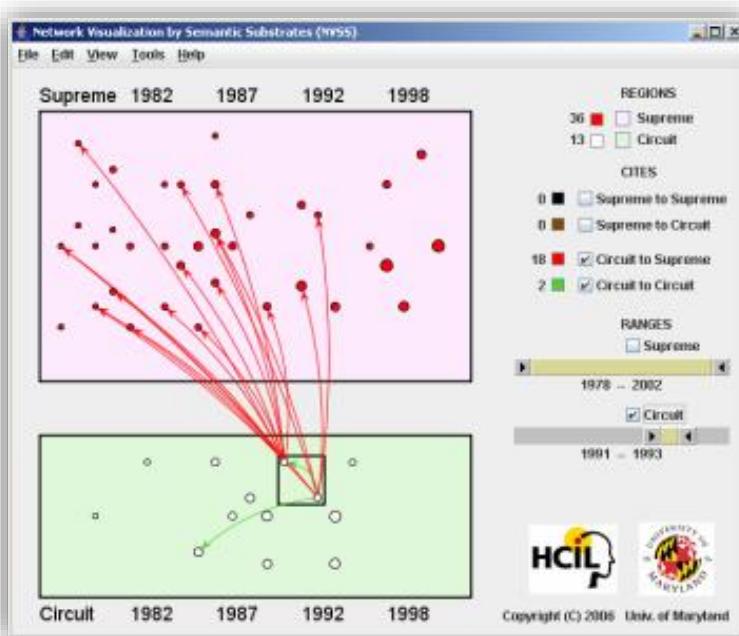


$$A \otimes_{\text{jux}} B = AB$$

Integrated Views

# Semantic Substrates

[Shneiderman and Aris, 2006]



Graph results in a too complex visualization to interpret

User-defined semantic subsets

Visual links connecting identical items across visualizations

Single visualization  
Single relationship

$$A \otimes_{\text{jux}} B = AB$$

Integrated Views

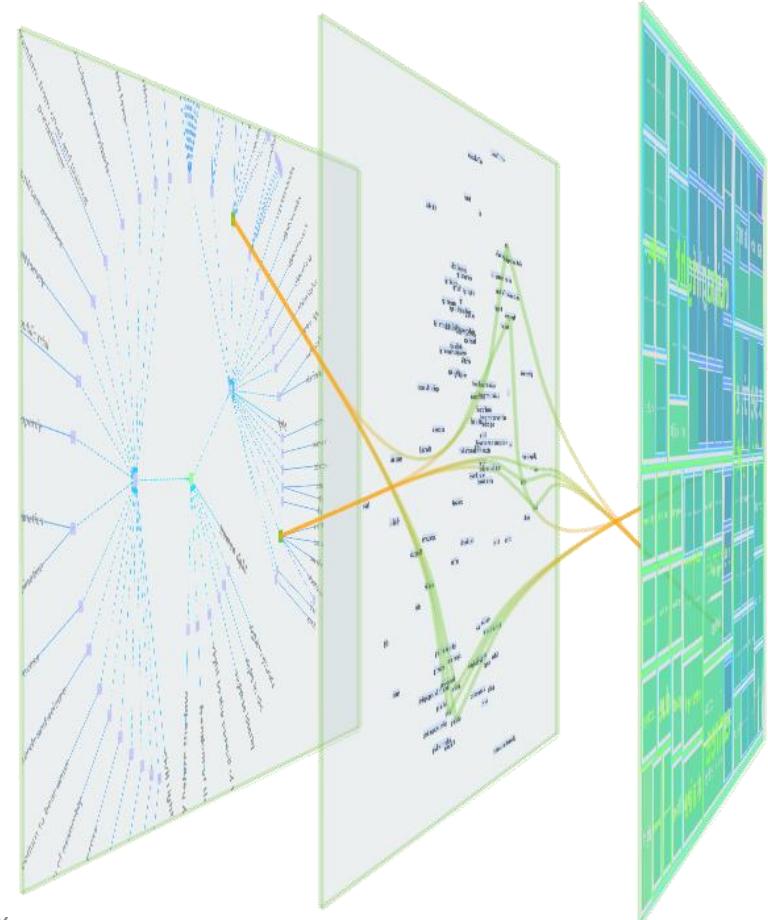
# VisLink

[Collins and Carpendale 2007]

Multiple relationships / datasets

Multiple visualizations

Inter-plane edges

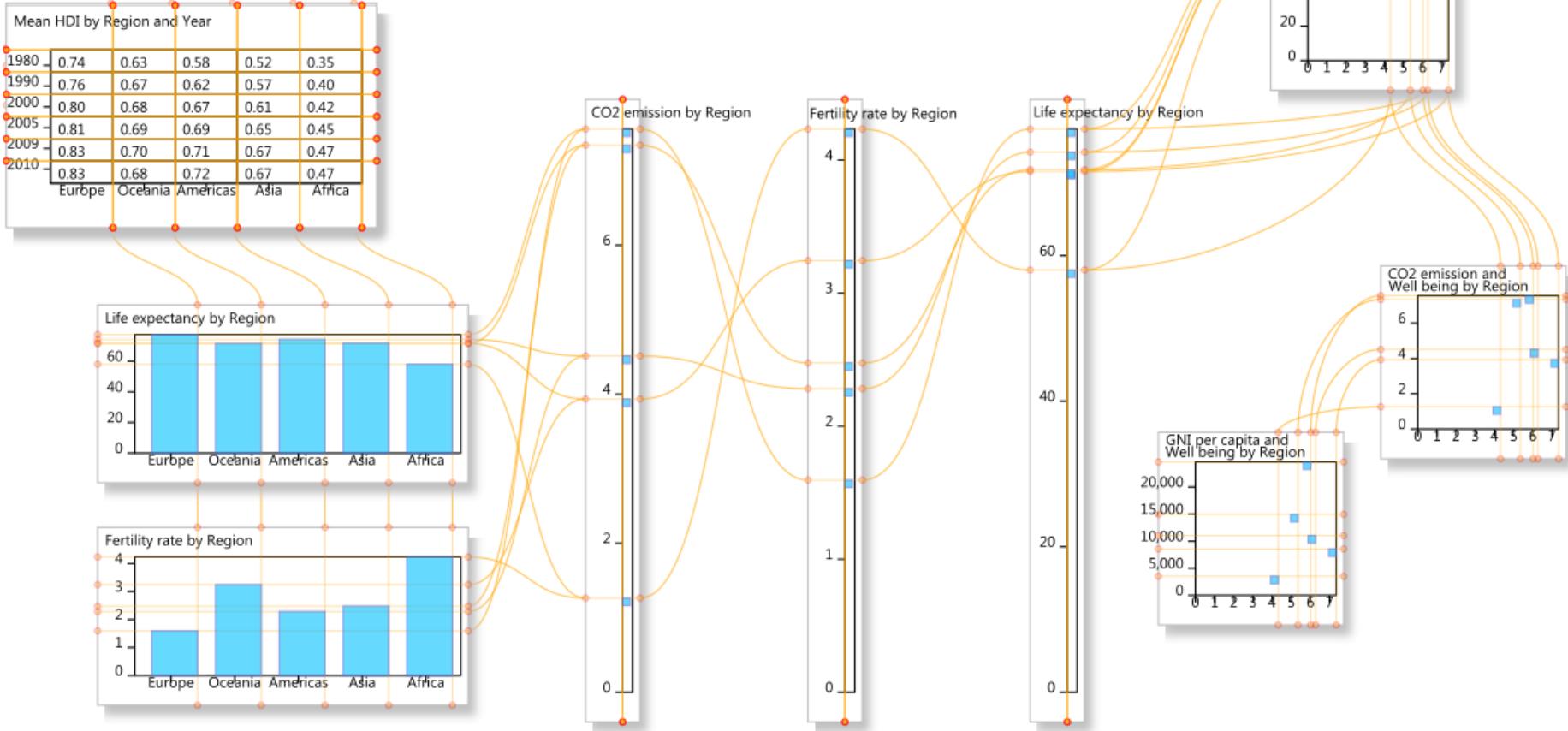


$$A \otimes_{\text{jux}} B = AB$$

Integrated Views

# Connected Charts

[Viau and McGuffin 2012]

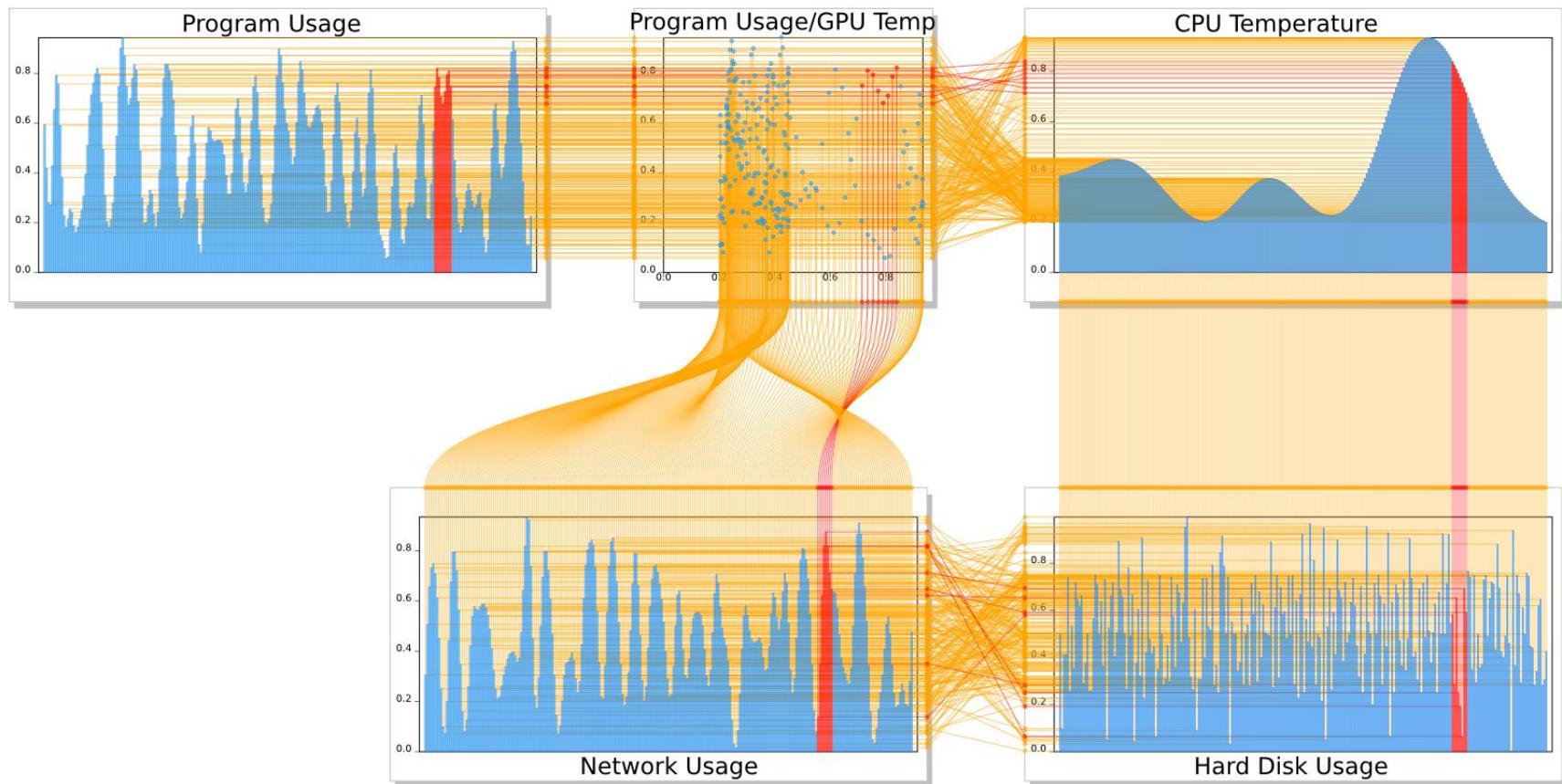


$$A \otimes_{\text{jux}} B = AB$$

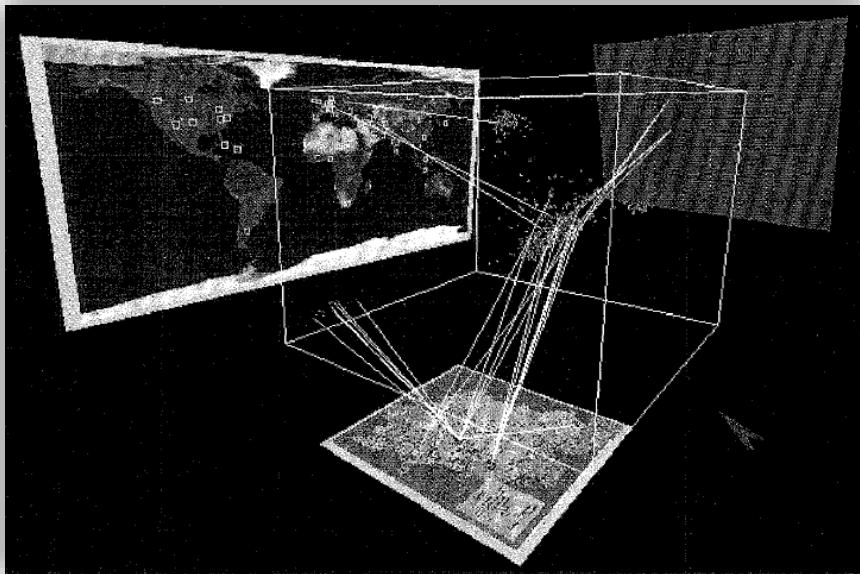
Integrated Views

# Connected Charts

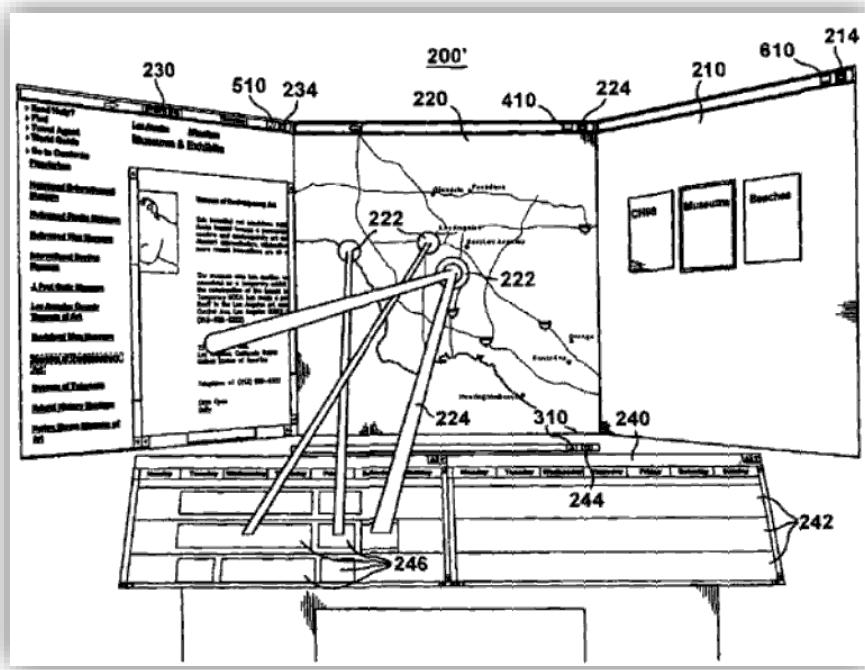
[Viau and McGuffin 2012]



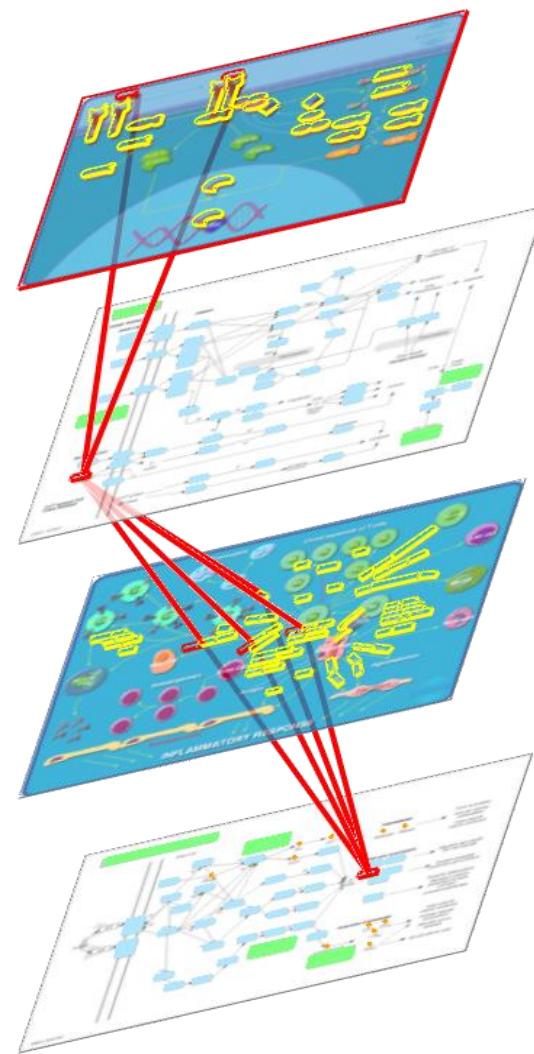
# Further Integrated View Examples



[Risch et al. 1996]



Microsoft patent [Höllerer et al. 2007]

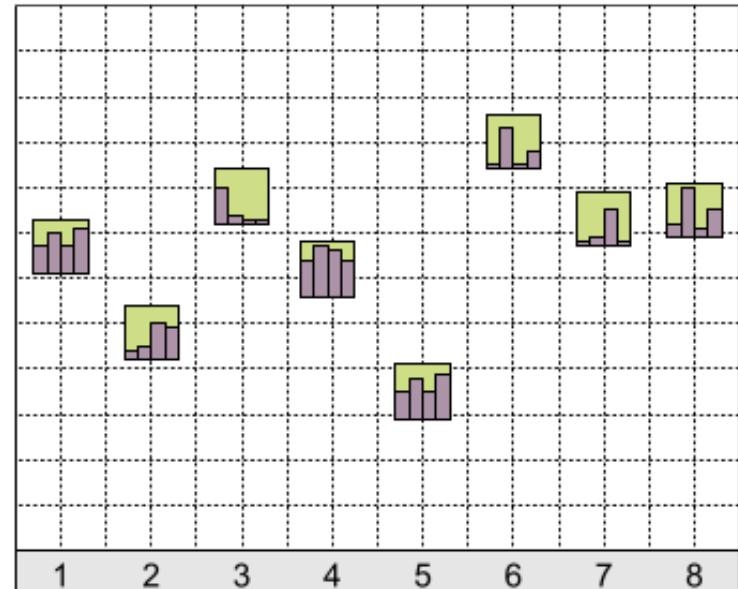


Interconnected Pathways [Streit et al. 2007]

# Combined Vis: Nesting

Client visualizations nested **inside** host visualization

$$A \otimes_{\text{nst}} B = A^B$$



Single or multi view?

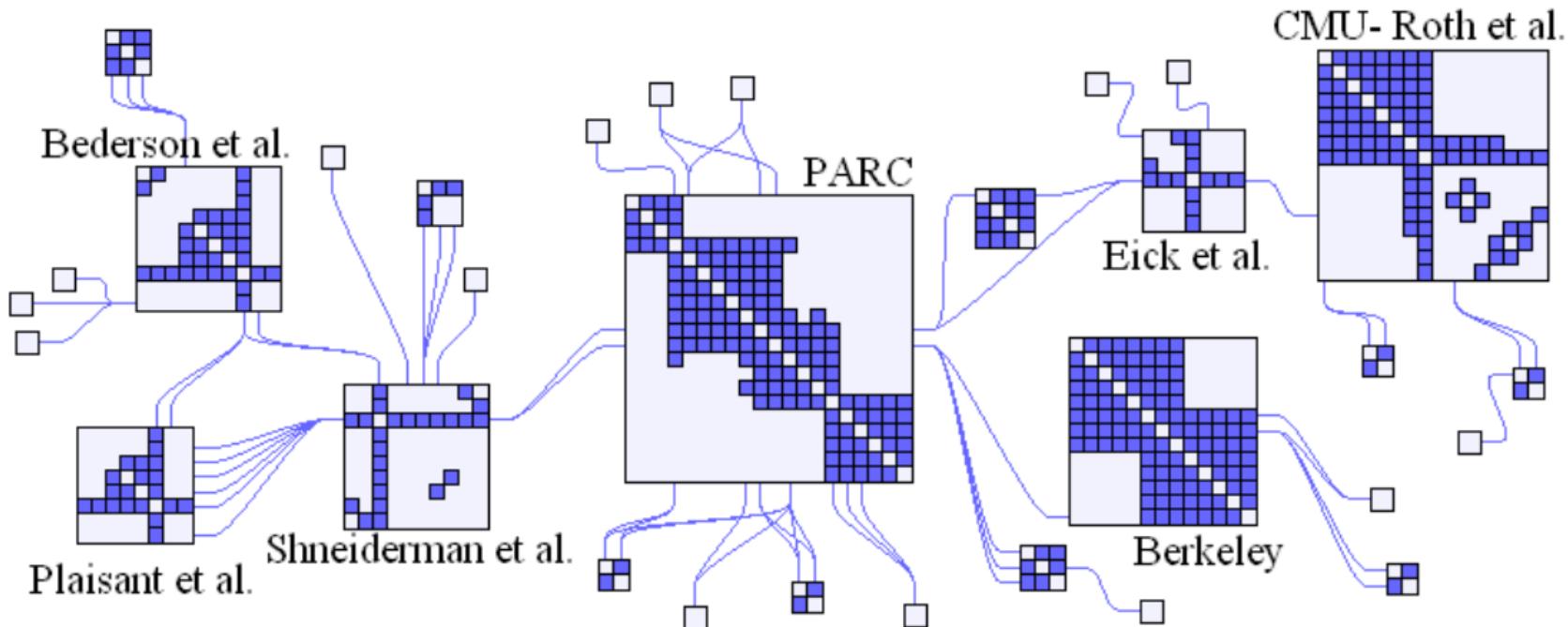
Depends on perspective

$$\mathbf{A} \otimes_{\text{nst}} \mathbf{B} = \begin{bmatrix} \mathbf{A} & \mathbf{B} \\ & \mathbf{B} \end{bmatrix}$$

Nesting

# Example 1: Nodetrix

[Henry et al. 2007]



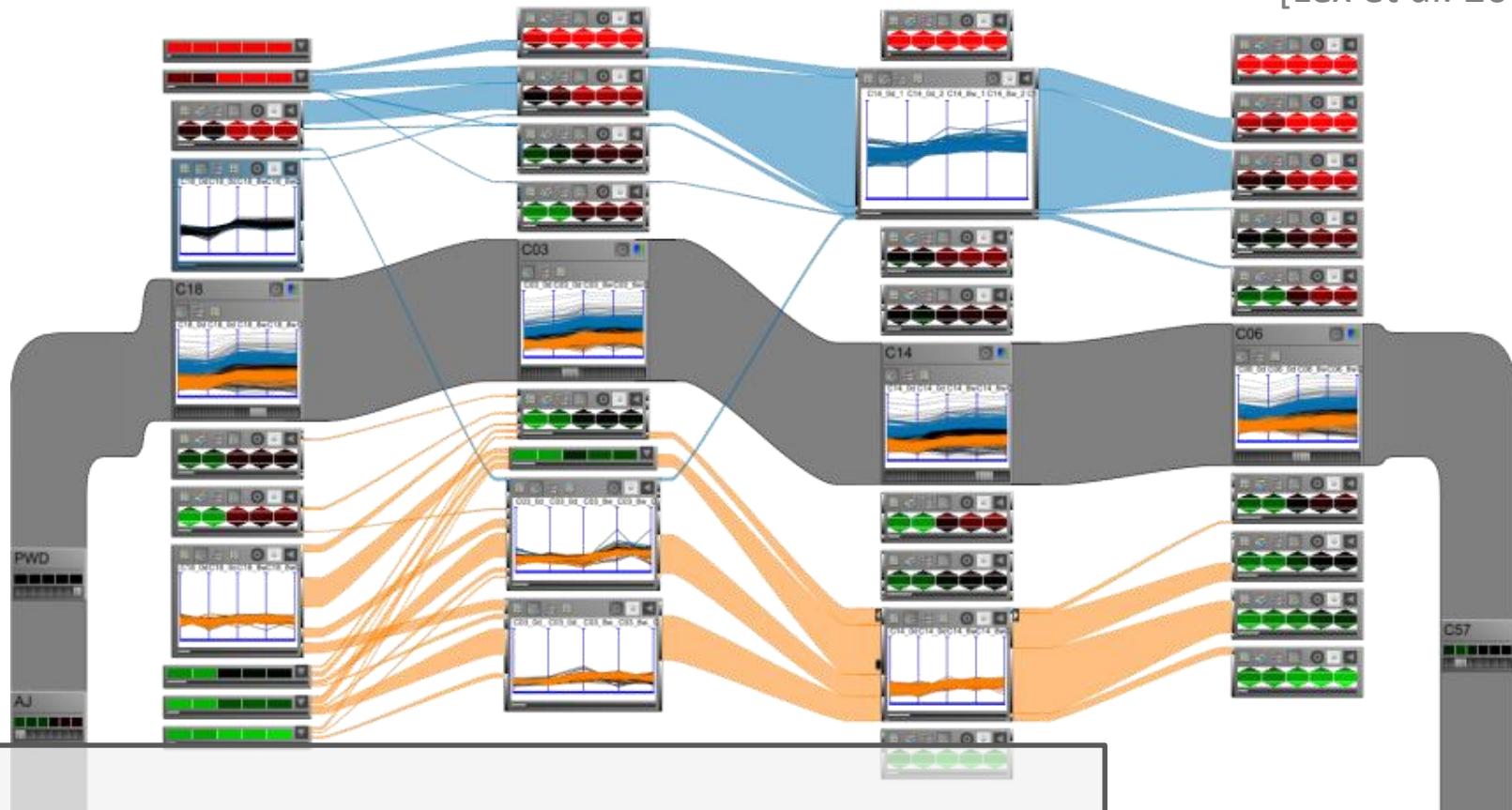
Single or composite visualization?

$$A \otimes_{\text{nst}} B = A^{\begin{smallmatrix} B & B \\ B & B \end{smallmatrix}}$$

Nesting

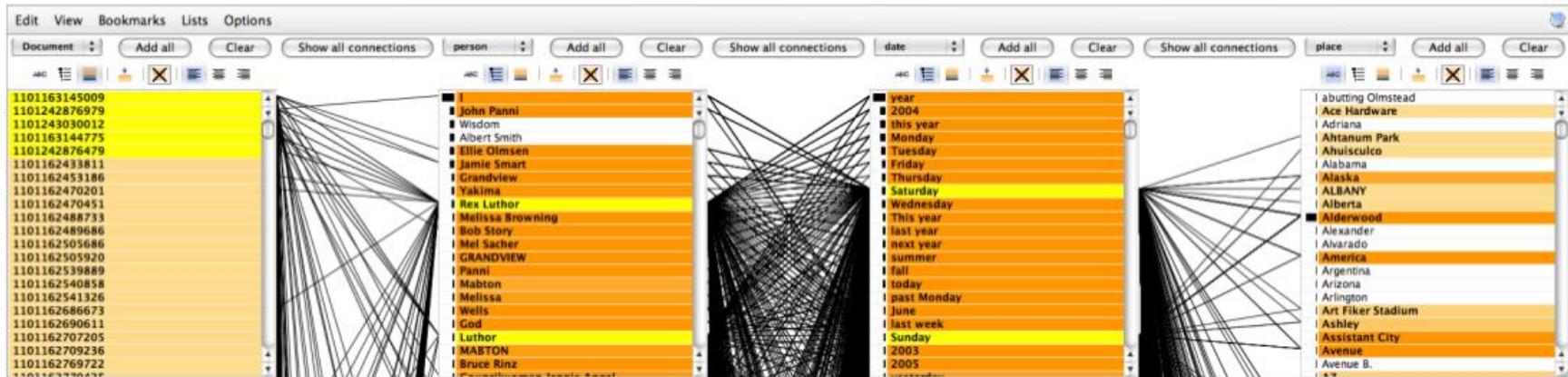
# Example 2: VisBricks

[Lex et al. 2011]



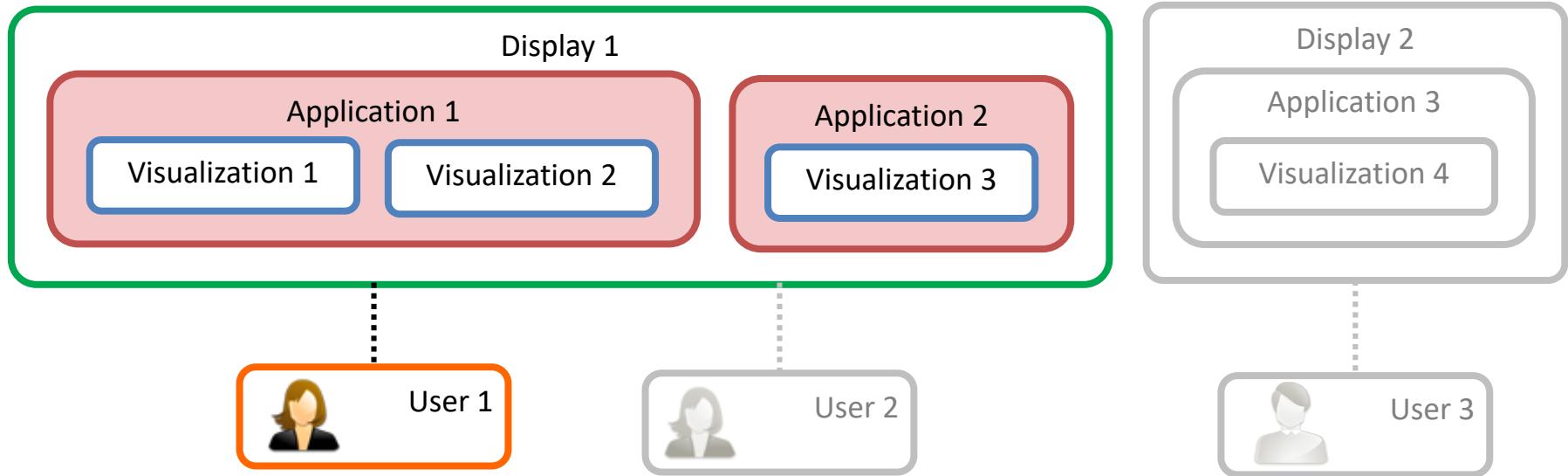
Single or composite visualization?

# Example 3: Jigsaw List View



[Stasko et al. 2008]

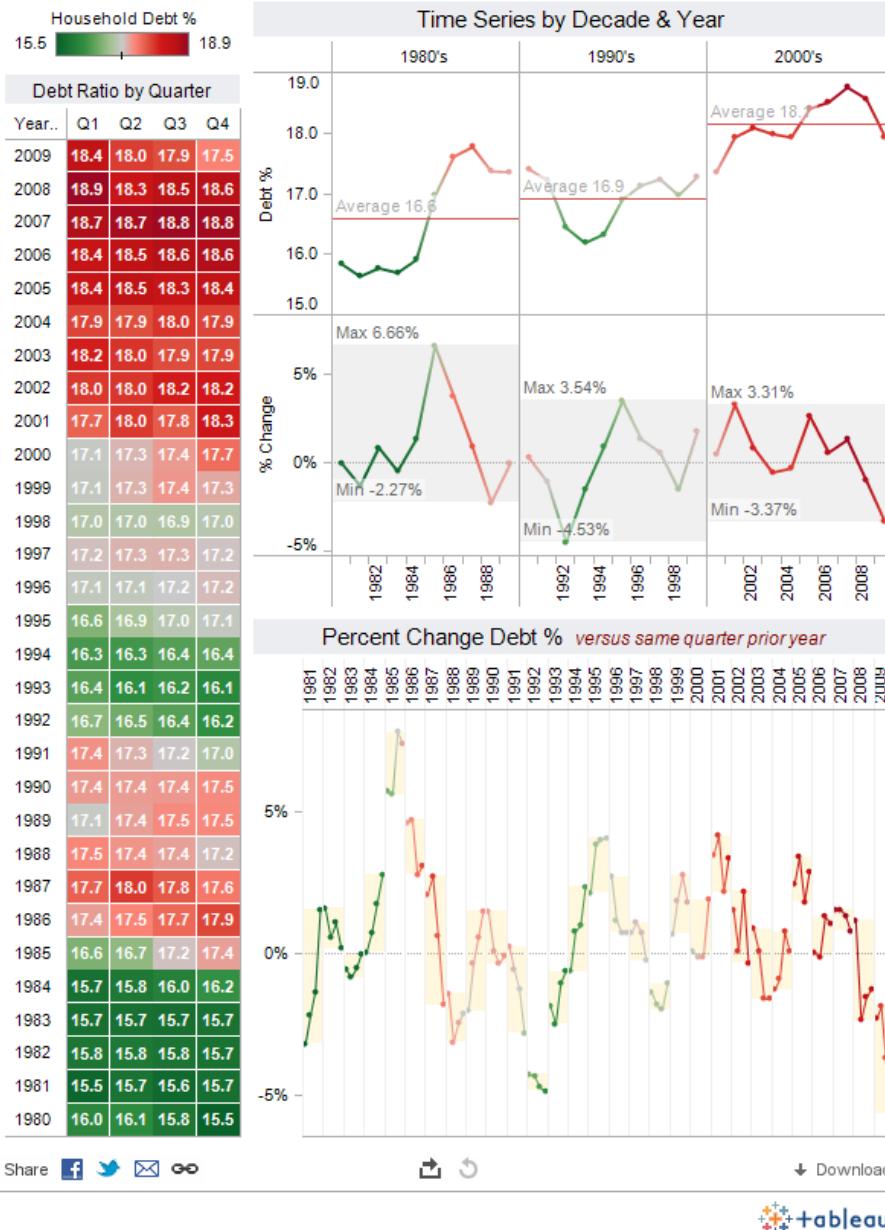
Single or composite visualization?



# LINKING ACROSS APPLICATIONS

## Household Debt as a % of Disposable Income

interworks inc.

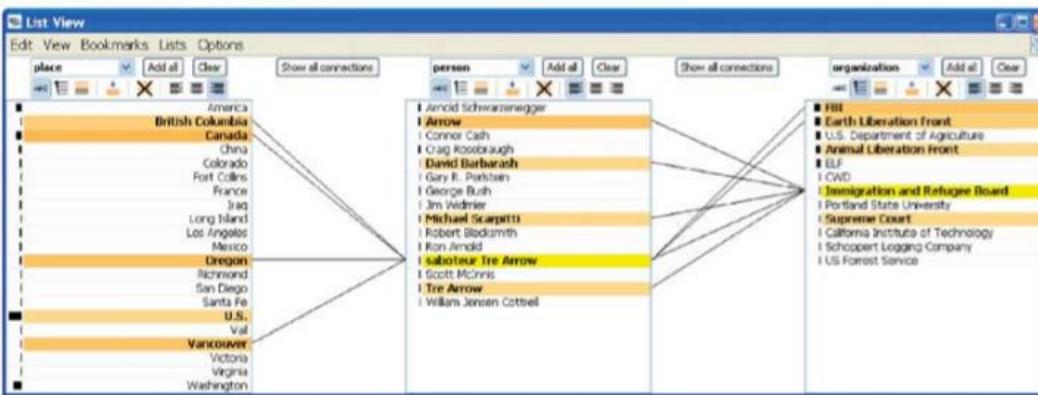


## Domain specific specializations:

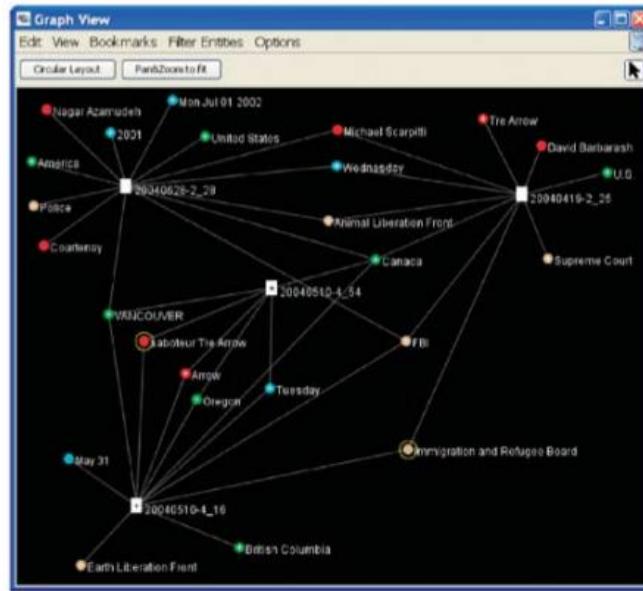
Banking, Consumer  
Packaged Goods,  
Education, Game  
Design, Government,  
Healthcare, Insurance,  
Manufacturing, Oil  
And Gas, Real Estate,  
Retail, Securities And  
Investments,  
Communications

# Jigsaw

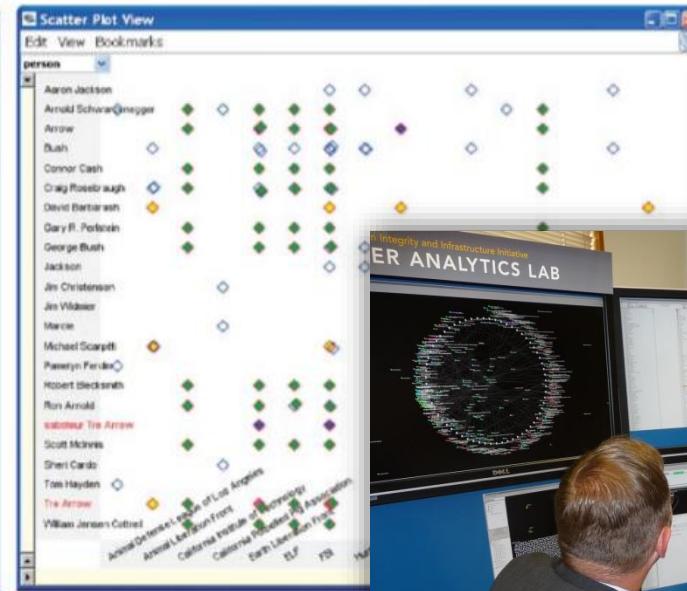
[Stasko et al. 2007]



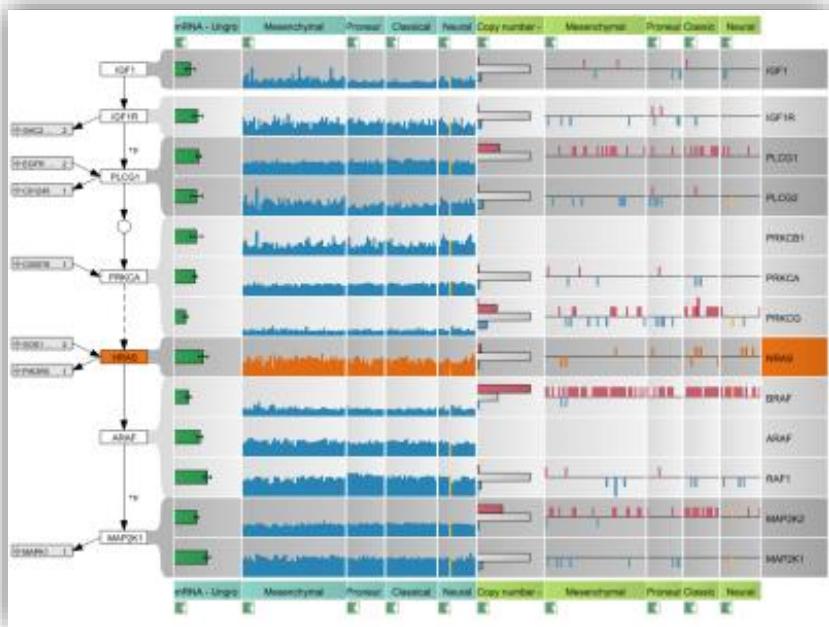
C



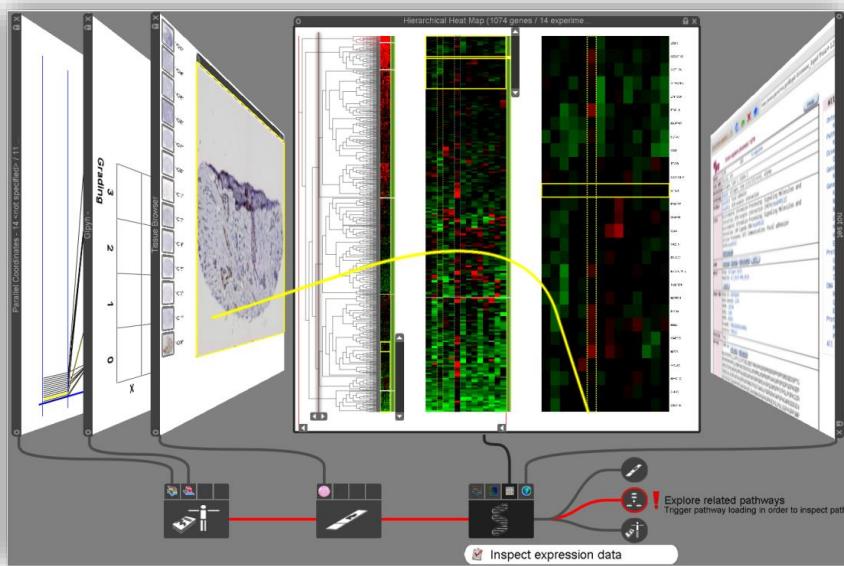
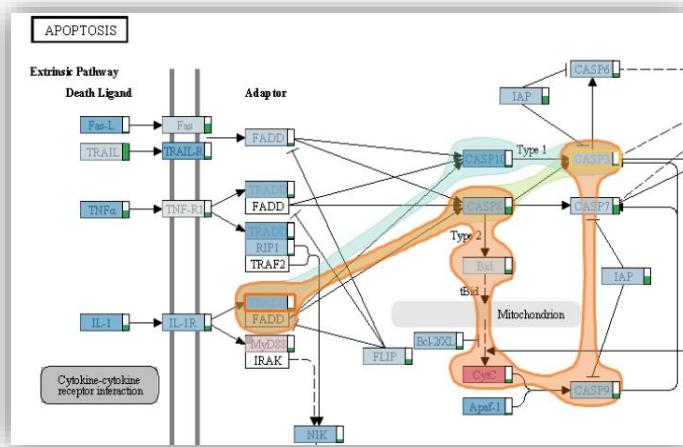
D



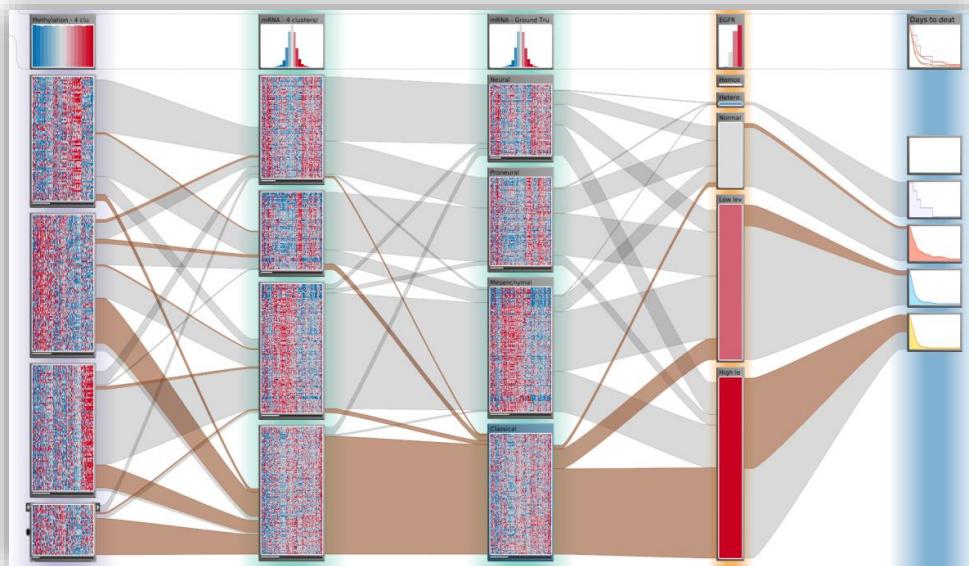
[Partl et al. 2012]



# Caleydo



[Streit et al. 2012]



[Lex et al. 2012]

# Super Application?

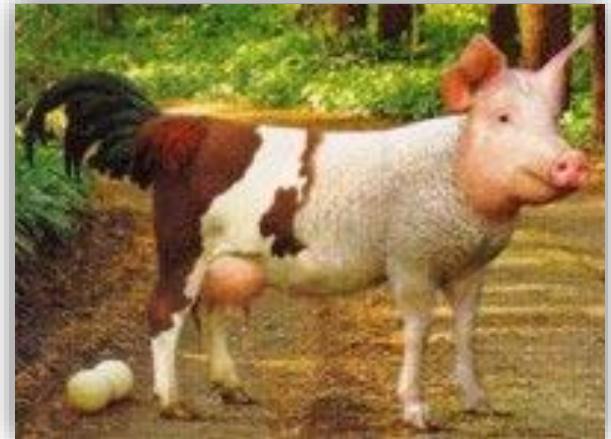
Super Application that can visualize everything

Not Feasible! Solution: use existing applications

Downsides:

not integrated

no highlighting, linking, etc.



Can we solve this?

$$A \otimes_{\text{jux}} B = AB$$

Juxtaposition

# Snap-Together Visualizations

[North and Shneiderman 2000]

## Linking & brushing across multiple applications

The figure displays four windows arranged in a grid, illustrating how multiple data visualizations can be linked and interacted with simultaneously:

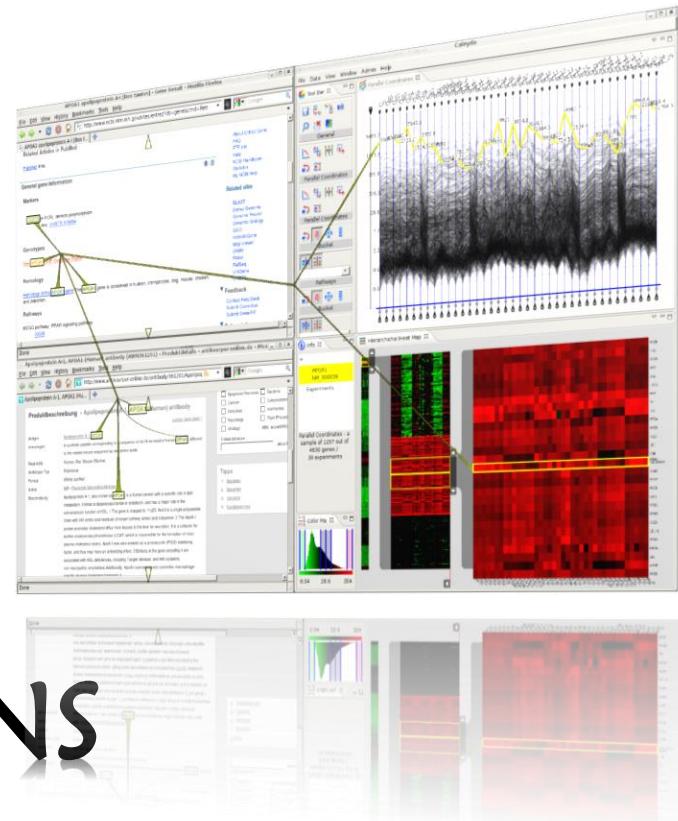
- Outliner - Division**: A hierarchical tree view of US divisions, with "MARYLAND" selected.
- Scatter Plot - Imported ODBC Data**: A scatter plot showing "Income per Capita" on the Y-axis (15000 to 27500) versus "Population 1995" on the X-axis (0 to 30000). Data points are colored by state, and the point for Maryland is highlighted.
- Table - Counties of a State [24000]**: A table listing population data for Maryland counties in 1995, 1990, 1980, and 1990 Housing Units. The row for "Montgomery, MD" is selected.
- Treemap 97 - Maryland**: A treemap visualization of Maryland's economy by industry and year (1993-1996). The "Montgomery" county area is highlighted in yellow.



Manuela Waldner

[Waldner, GI 2010] – best paper award

# VISUAL LINKING ACROSS APPLICATIONS



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http://aigicrv.site.uottawa.ca/ ics interface 2010

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GENERAL CONFERENCE INFORMATION



**University of Ottawa**  
Ottawa, Ontario, Canada  
May 31<sup>st</sup> to June 2<sup>nd</sup>

The 2010 AI/GI/CRV Conference with the collaboration among three leading research conferences ([Artificial Intelligence 2010](#), [Graphics Interface 2010](#), and [Computer and Robot Vision 2010](#)), will bring together hundreds of industry leaders, government leaders, research leaders and Canada's most accomplished students to showcase Canada's ingenuity, innovation and leadership in intelligent systems and advanced information and communications technology.

A single [registration](#) (not open yet) will let you attend any session in the three Conferences, which will be scheduled in parallel tracks. All [paper submissions](#) (not open yet) are handled by each of the Conferences separately.

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Save As Undo Continue Quick Open... VIS:VisRendererApplicationInterface

Intelligent Systems Collaborativ...

**University of Ottawa**  
Ottawa, Ontario, Canada  
May 31<sup>st</sup> to June 2<sup>nd</sup>

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Map Satellite Hybrid

Received Selection: Ottawa

Map data ©2010 Google, Tele Atlas - [Terms of Use](#)

KDevelop

Line: 480 Col: 14 Documentation

```
applicationInterface
clear all data
clearAllData()
event = CompObjectEvent
response =
clear all sent
VIS::VisRenderer ai;
UE
getAccessing
Ids;
sourceCluster
this->manager
* cluster =
e is off, co
ourceCluster)
Equatorial Guinea find
center map to external selection
```

Done

Canada Travel Information and ...

In North America (publisher The Vendome Press 2008) Originally published in French by Editions du Chêne (2008) I have talked before about Vendome's and their wonderful travel books. When they sent me Coast to Coast for review, I could not stop raving about how beautiful it is. [...] This content is a post from: A Traveler's Library

[Read the full post](#)

**PhotoFriday: Canada – Prince Edward Island**  
Blog: Sophie's World - 26 February 2010

I decided to remain with our friendly Arctic neighbour, specifically Atlantic Canada, this week as well. The light house is in Summerside in fairy tale Prince Edward Island, of Anne of Green Gables fame. We caught the ferry from Picton in Nova Scotia to PEI and spent a few days in the adorable, diminutive province capital Charlottetown, [...] PhotoFriday: Canada – Prince Edward Island is a post from: Sophie's World

[Read the full post](#)

**More Winter Olympics Photos: Lindsey Vonn, Skeleton and Scenery**  
Blog: Travelogged - 25 February 2010

At first, I wasn't that jealous that my friends Libby and Pete went

travel north america

Patricia Hotel (2 star Hotel)  
Author Pick

Book now  
See all hotels and hostels in Canada

FIND FLIGHT DEALS  
From: VIE (Vienna)  
To: YYZ (Toronto)

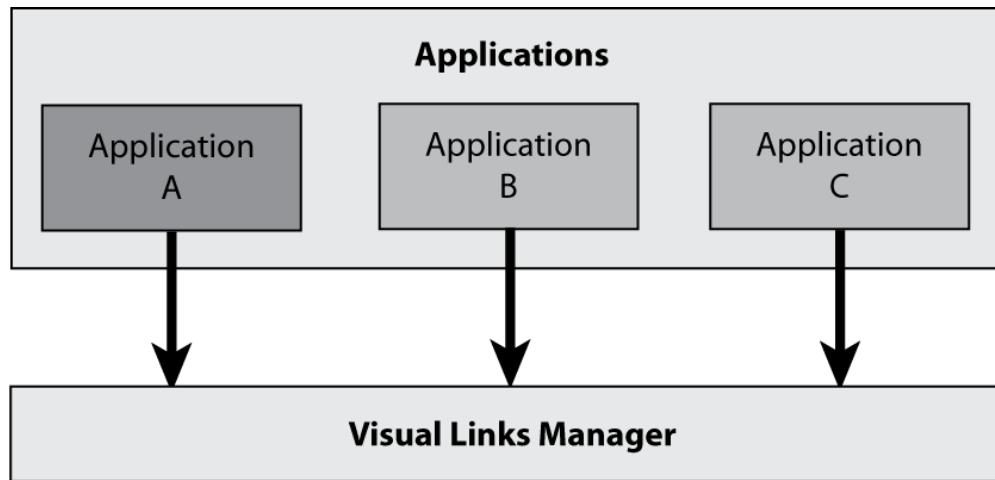
Talent Incubator in space research: TU Graz hosts Space Studies Programme  
© Photo: ESA - AOES MediaLab  
» more (german only)

FOR  
Students »  
Prospective students »  
Alumni »  
Staff »  
Media »

ABOUT  
Life Long Learning »  
Events »  
Unit for Tasks of Gender Equality »

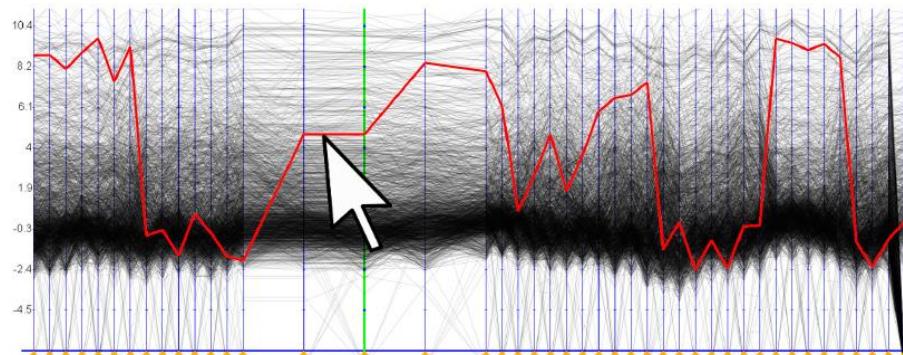
Webmaster ©2005-2010 ZID-TU Graz. All rights reserved Last Update 24.FEB.10

# Visual Links Across Applications



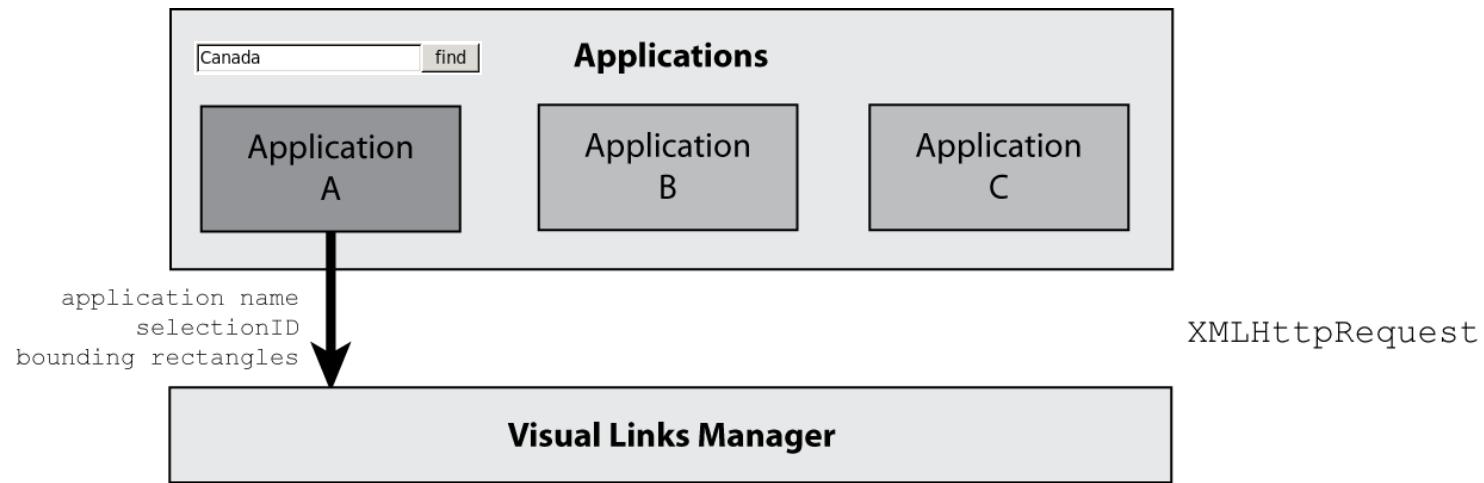
# Triggering Selections

Determined by individual application

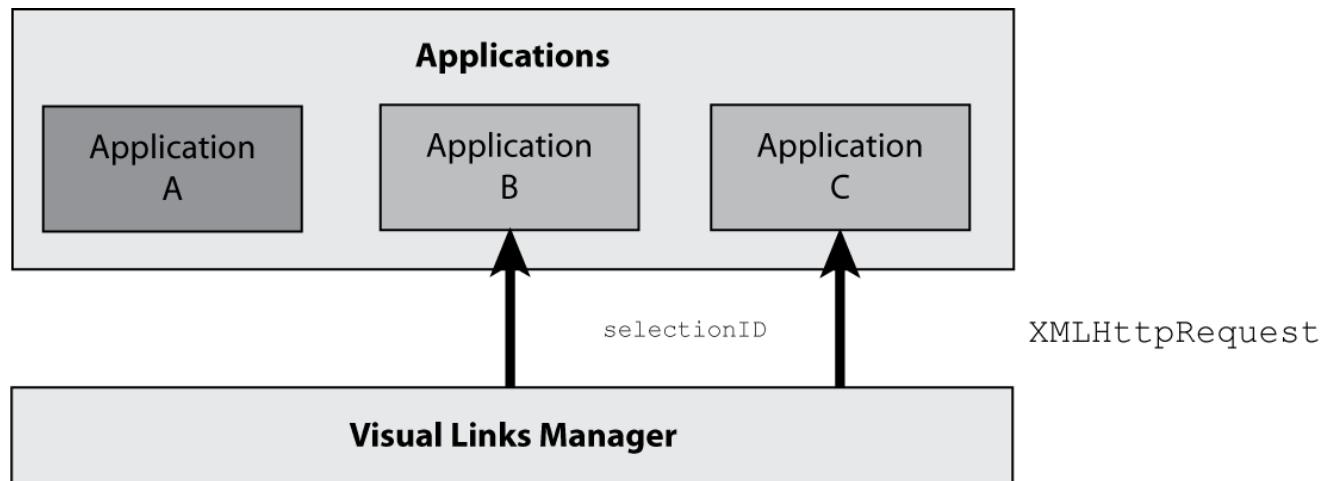
 

**University of Ottawa**  
Ottawa, Ontario, Canada  
May 31<sup>st</sup> to June 2<sup>nd</sup>  
e with the collaboration among three leading re  
e 2010, and Computer and Robot Vision 2010),

# Visual Links Across Applications



# Visual Links Across Applications



# Selection Mapping

Applications evaluate incoming selection ID

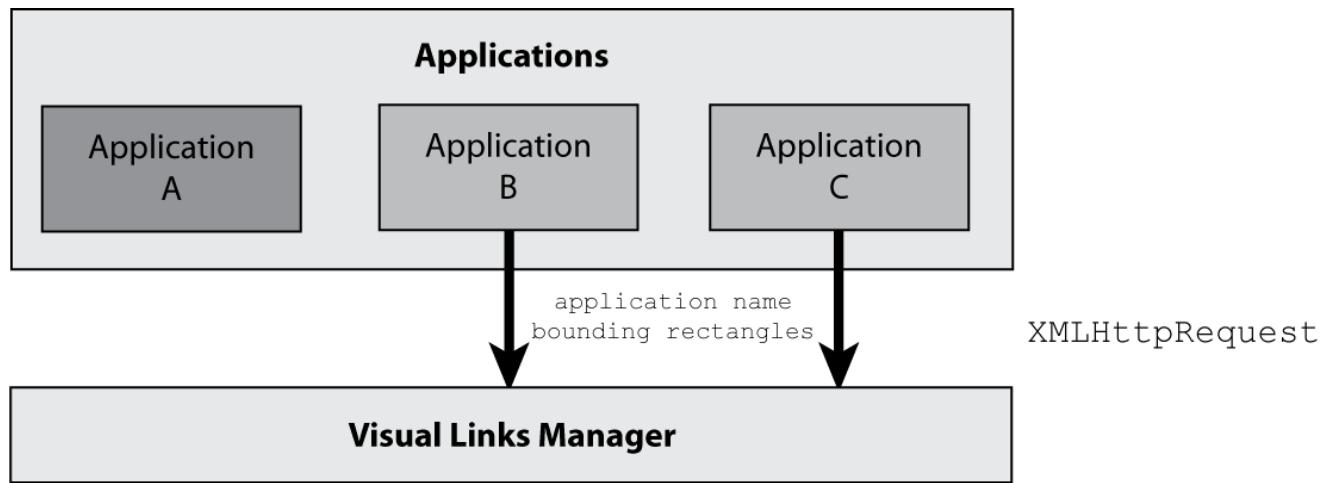
**University of Ottawa**  
Ottawa, Ontario, Canada

May 31<sup>st</sup> to June 2<sup>nd</sup>

With the collaboration among three leading research conferences ([Artificial 2010](#), and [Computer and Robot Vision 2010](#)), will bring together hundreds of research leaders and Canada's most accomplished students to showcase Canada's in intelligent systems and advanced information and communications technology.

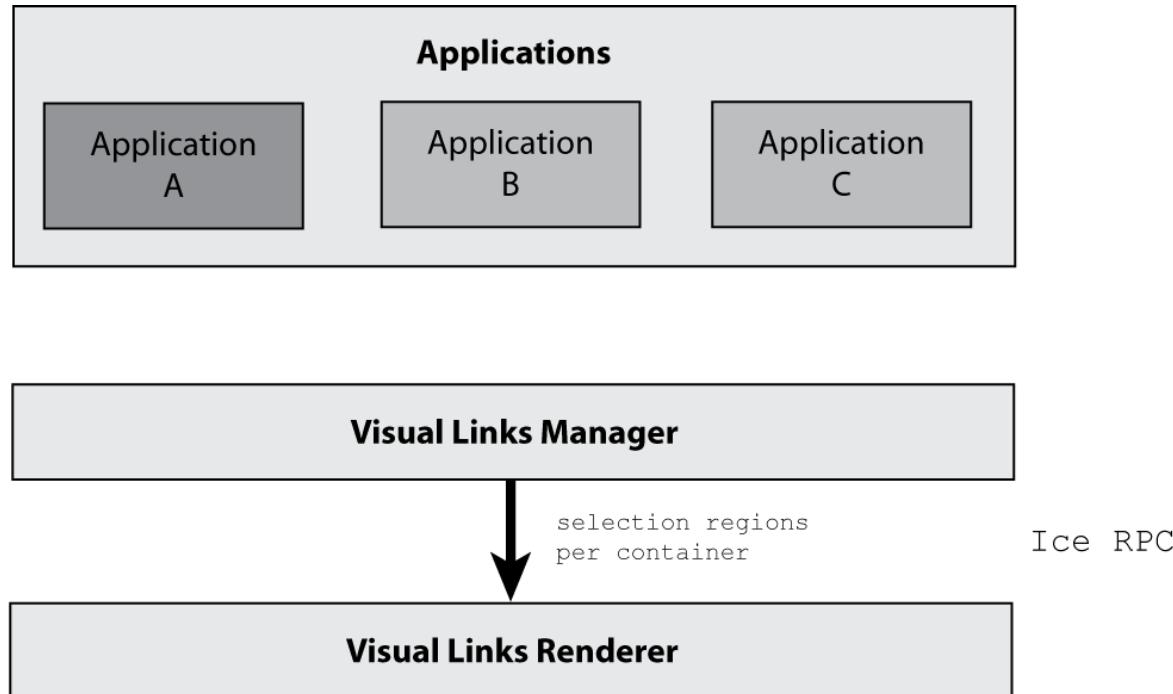


# Visual Links Across Applications

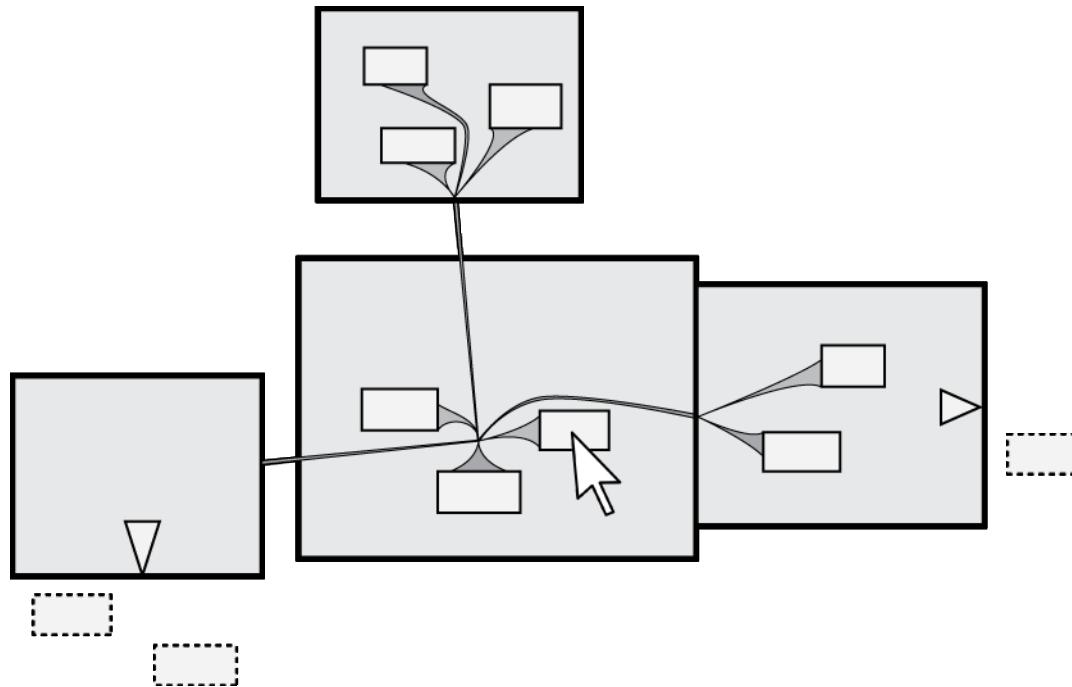


# Visual Links Across Applications

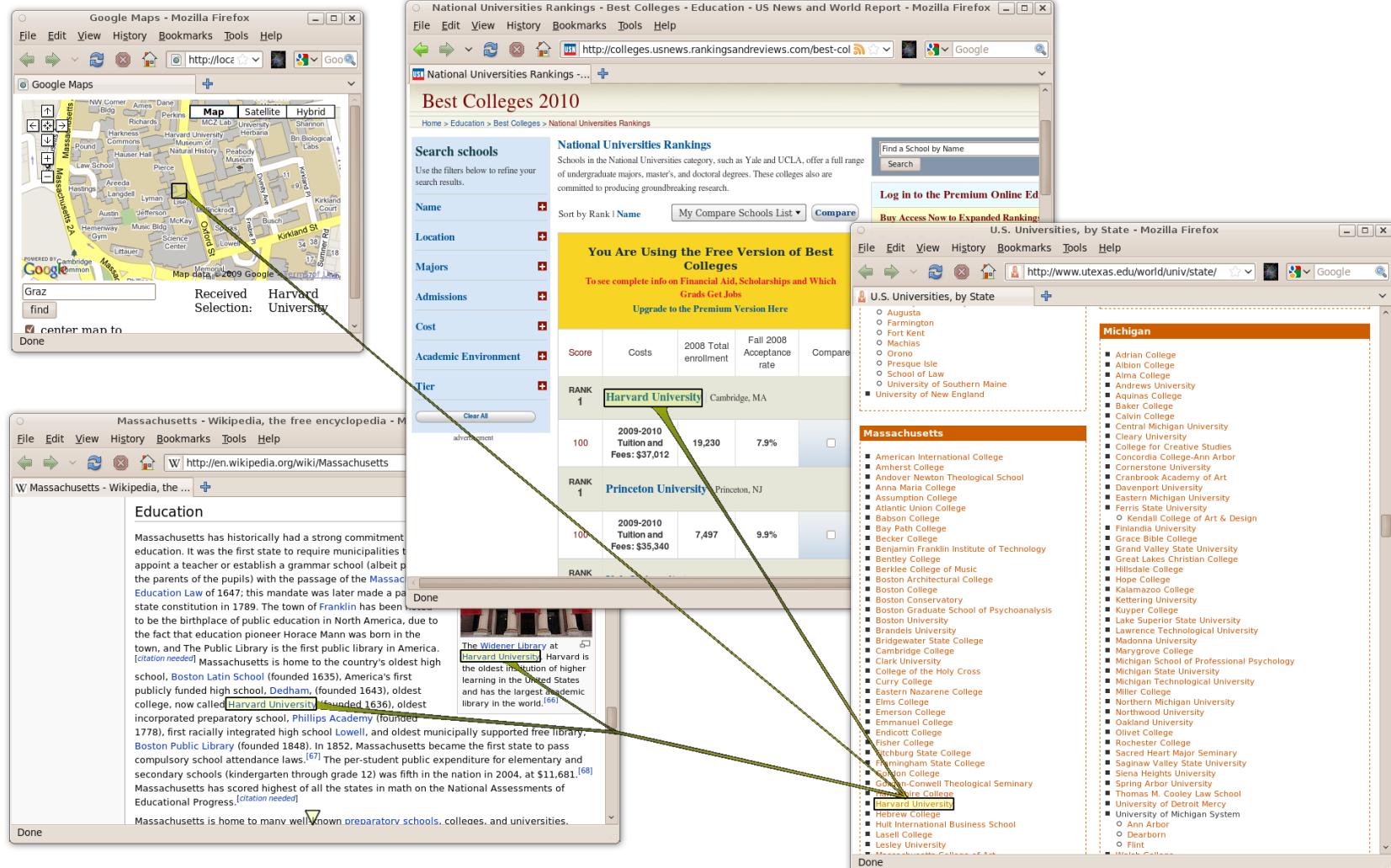
Selection regions are collected and sent to renderer



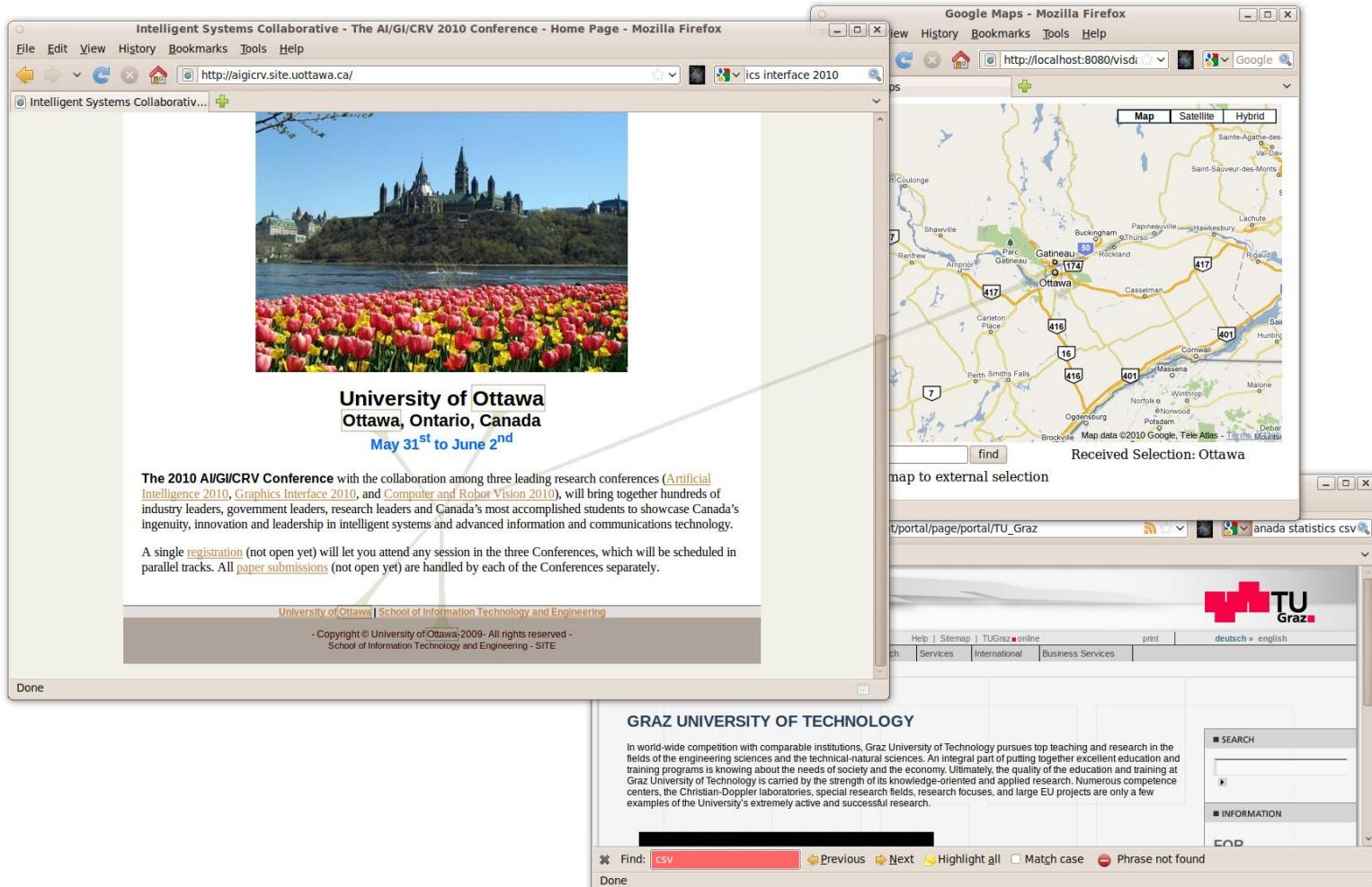
# Design of Visual Links Across Apps



# Design of Visual Links



# Design of Visual Links



# Application Integration

Application support

Direct support

Software extensions (plug-ins)

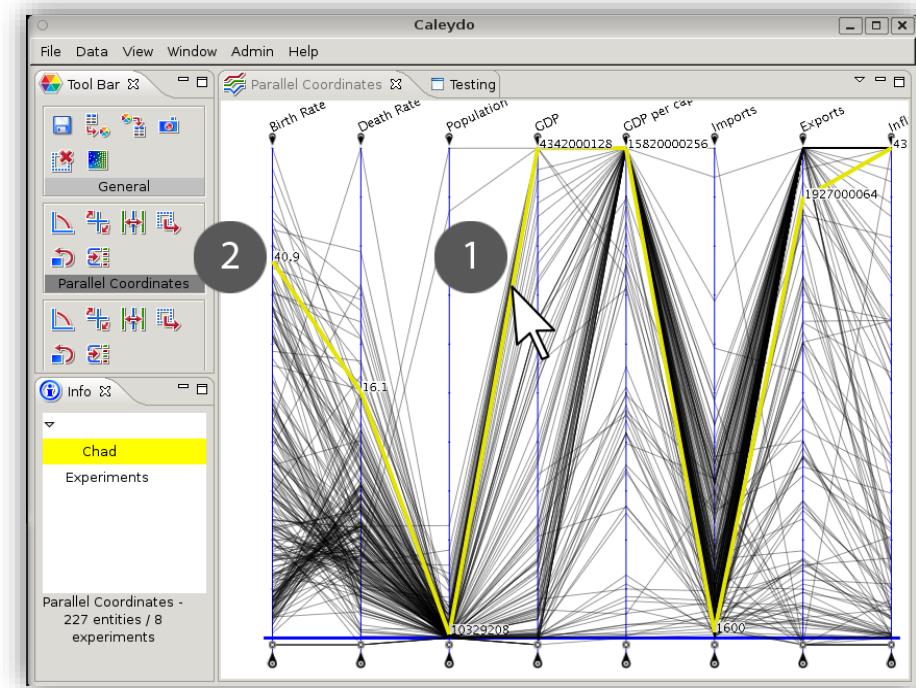
Mashup application

OCR

# Direct Application Support

Extending Caleydo visualization framework

Internal highlighting → coordinates are sent to manager

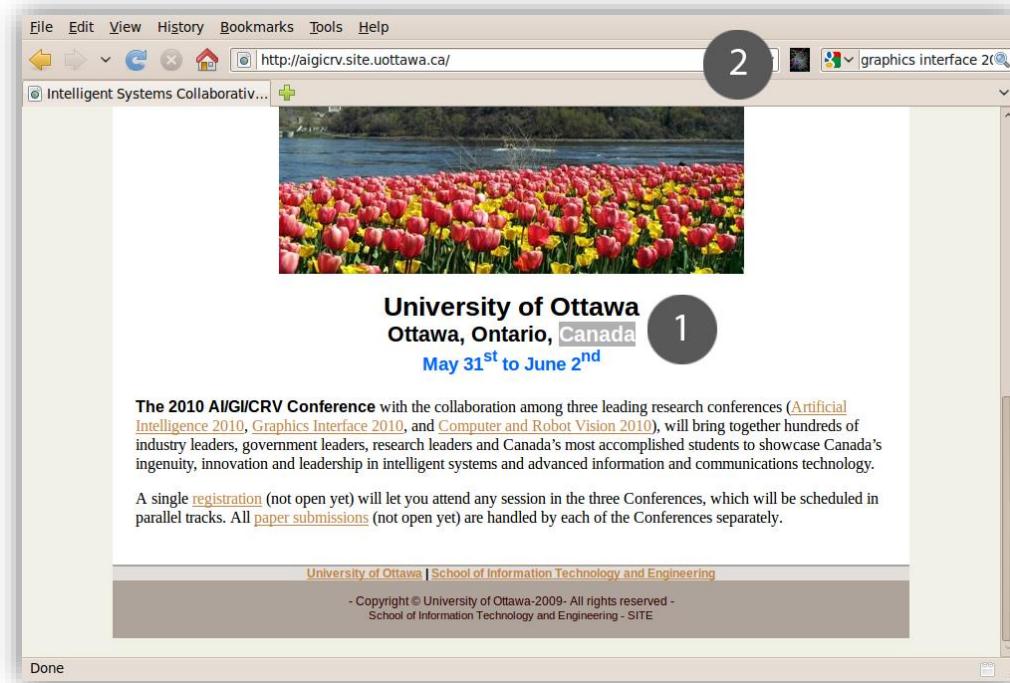


# Software Extension

Mozilla Firefox web browser add-on

Access to DOM of HTML-document

Temporarily enclosing selection ID with <span>-tag

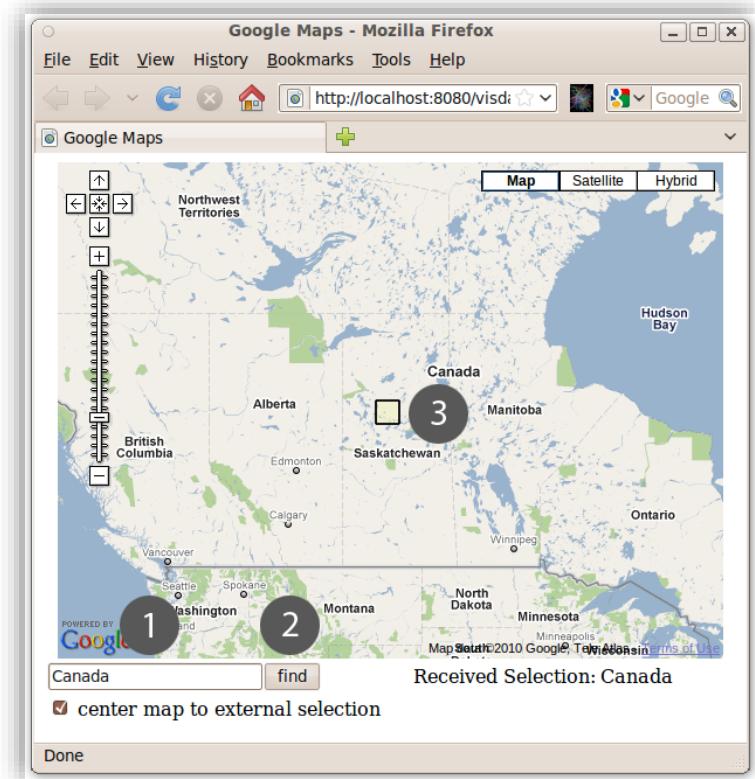


# Mashup Application

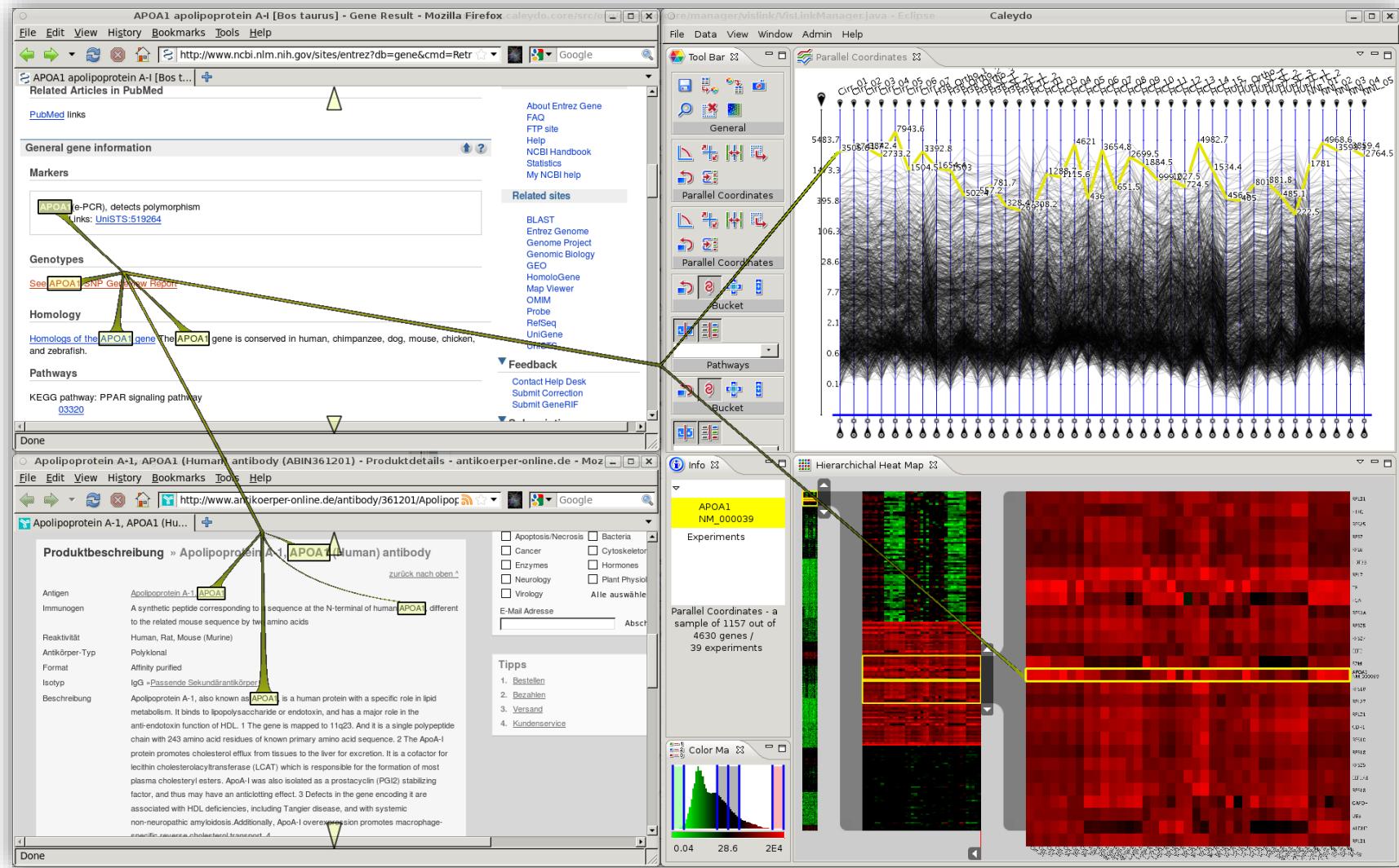
HTML-page utilizing JavaScript  
and Google Maps API

Geographic location associated  
with selection ID

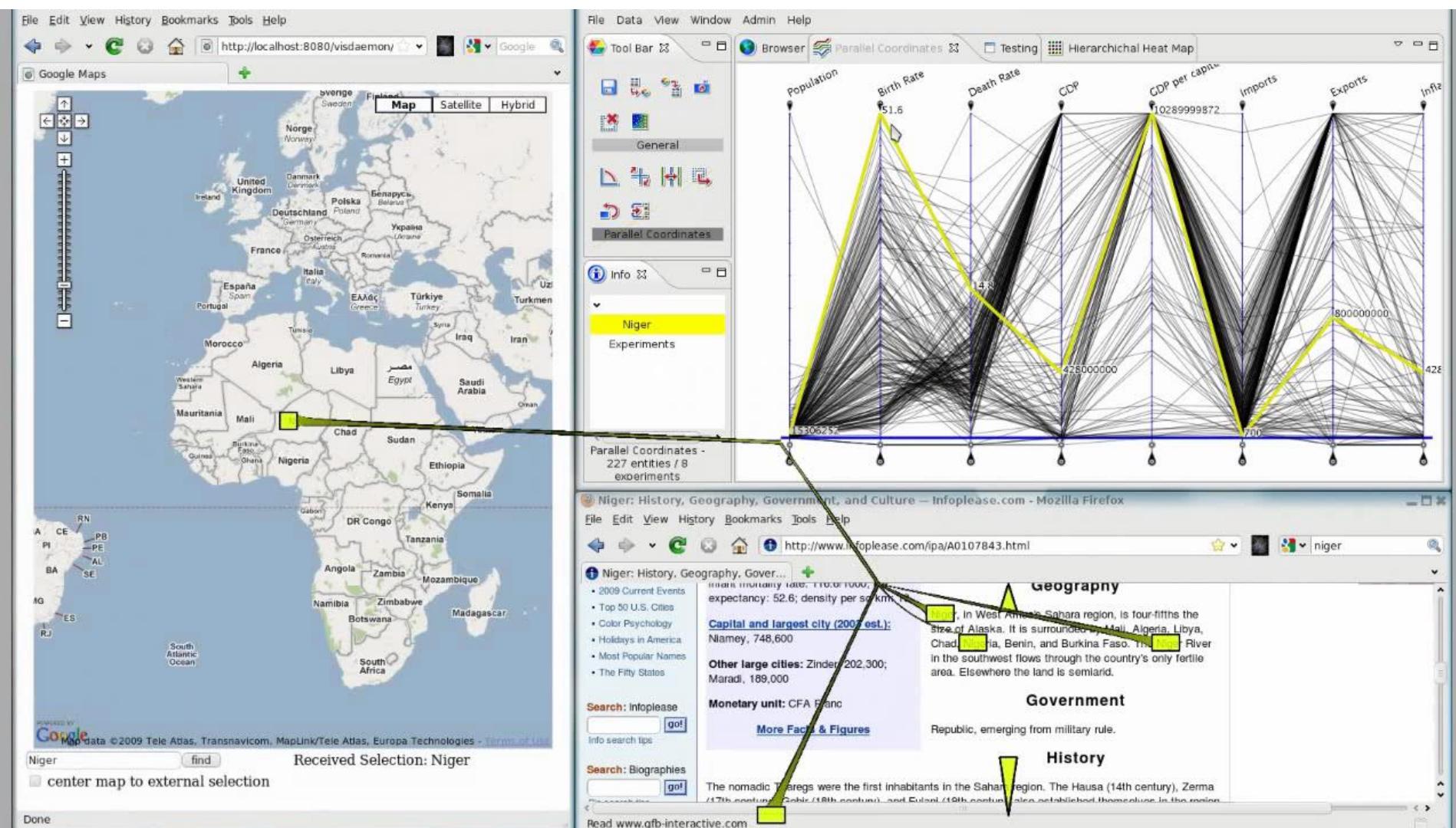
Reports bounding rectangle  
around screen coordinates



# Usage Scenario: Biomedical Analysis



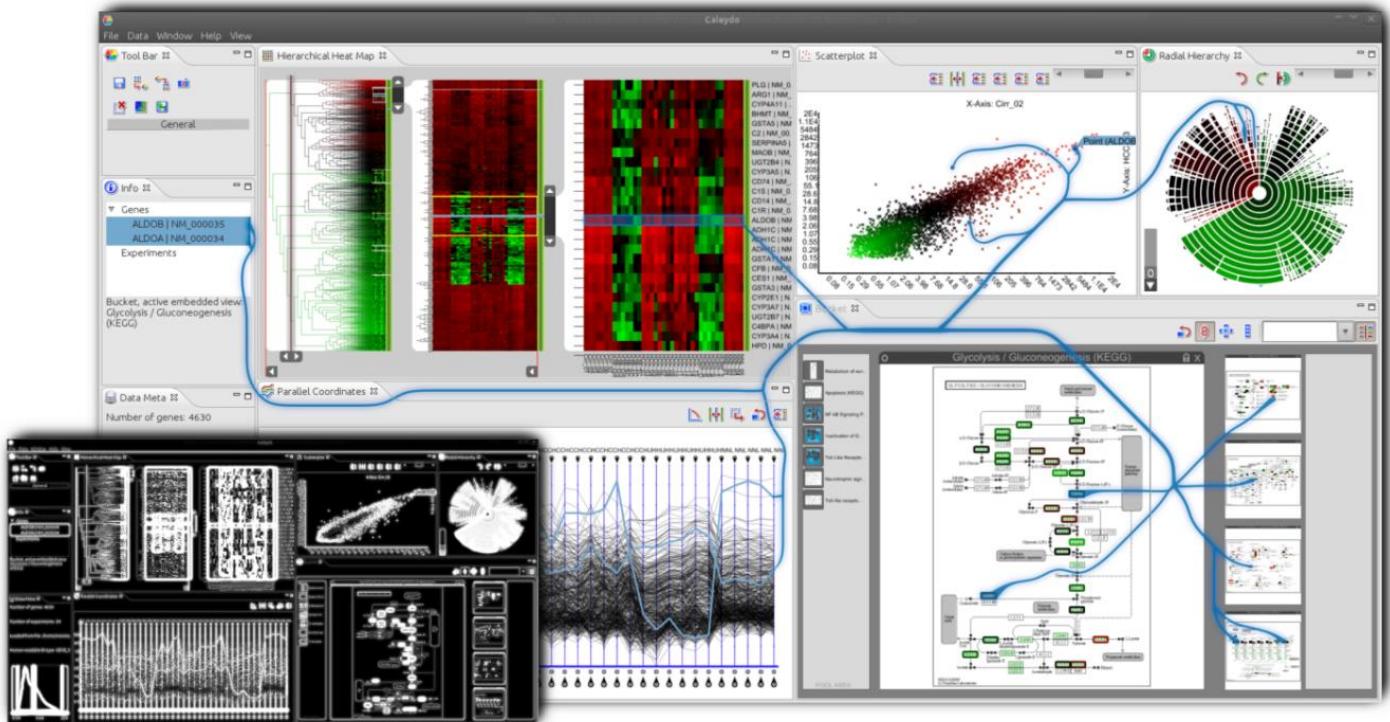
# Usage Scenario: Economic Statistics



# Soon Available: Routed Visual Links Across Apps

Light-weight app that renders on top of desktop

Real-time, OS-independent



# What's missing: Linking beyond Strings

Data

Abstractions

Selections

Intermediate processing results

Meta-data

Groups (clusters)

Interaction

→ As discussed in Part I

# GENOME SPACE BETA



Domain specific coordination project  
for systems biology

Broad Institute

<http://www.genomespace.org>

Allows to move data(sets) smoothly between  
applications



# GAGGLE

Domain specific coordination project  
for systems biology

Institute of Systems Biology

<http://gaggle.systemsbiology.net/>

Also integrates analytical tools such as R



Allows to exchange:

Name list

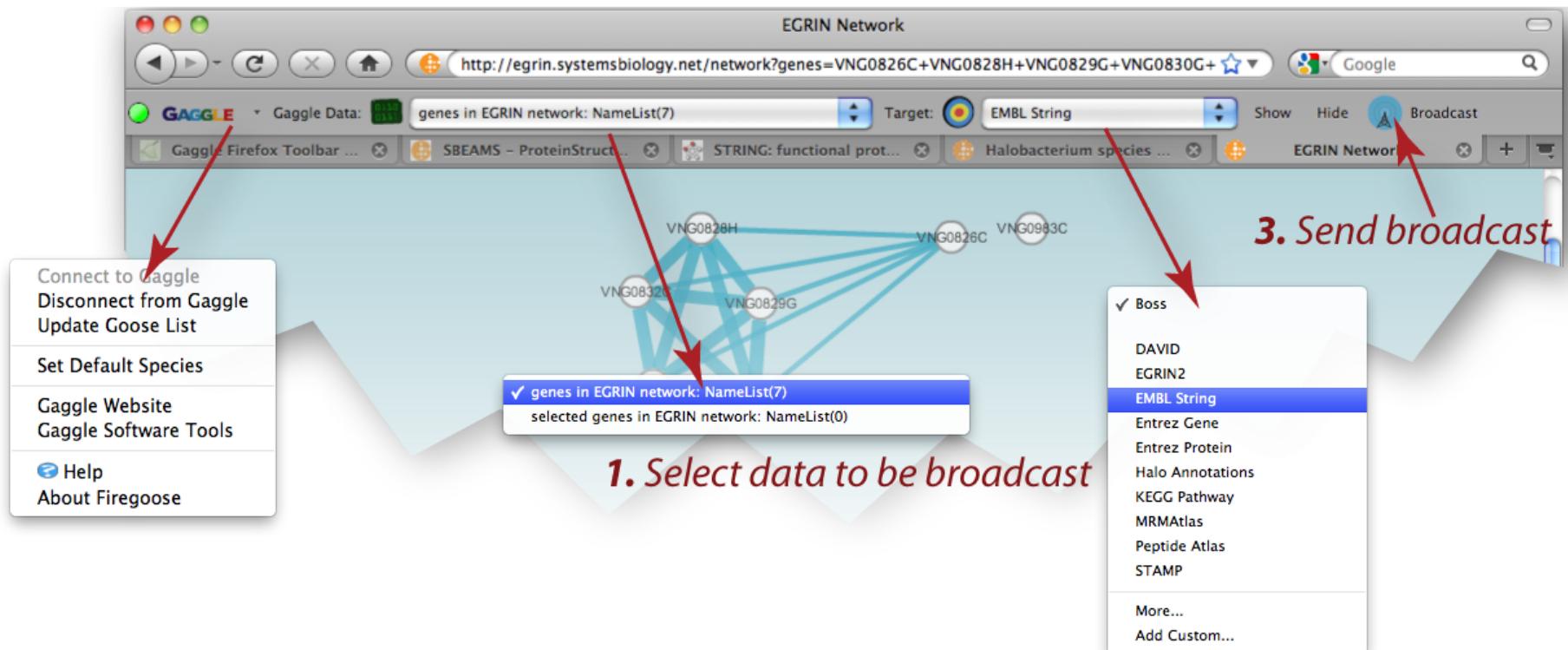
Clusters/groups

Tuple: a collection of name/value pairs

Matrix (rows and columns)

Network: a collection of nodes and edges

# Firefox toolbar for the Gaggle



# Obvious

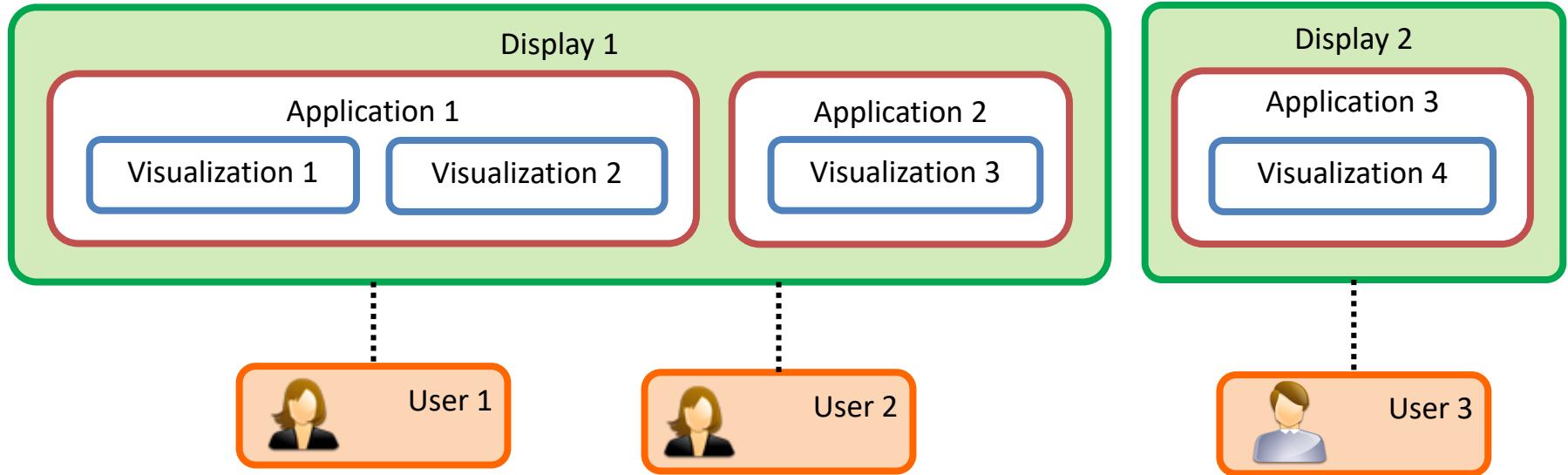
[Fekete et al. 2011]

## Meta-Toolkit to Encapsulate Information Visualization Toolkits

<http://code.google.com/p/obvious>

## Deep integration between frameworks

Unifies Prefuse, the InfoVis Toolkit, partly Improvise, JUNG and other data management libraries

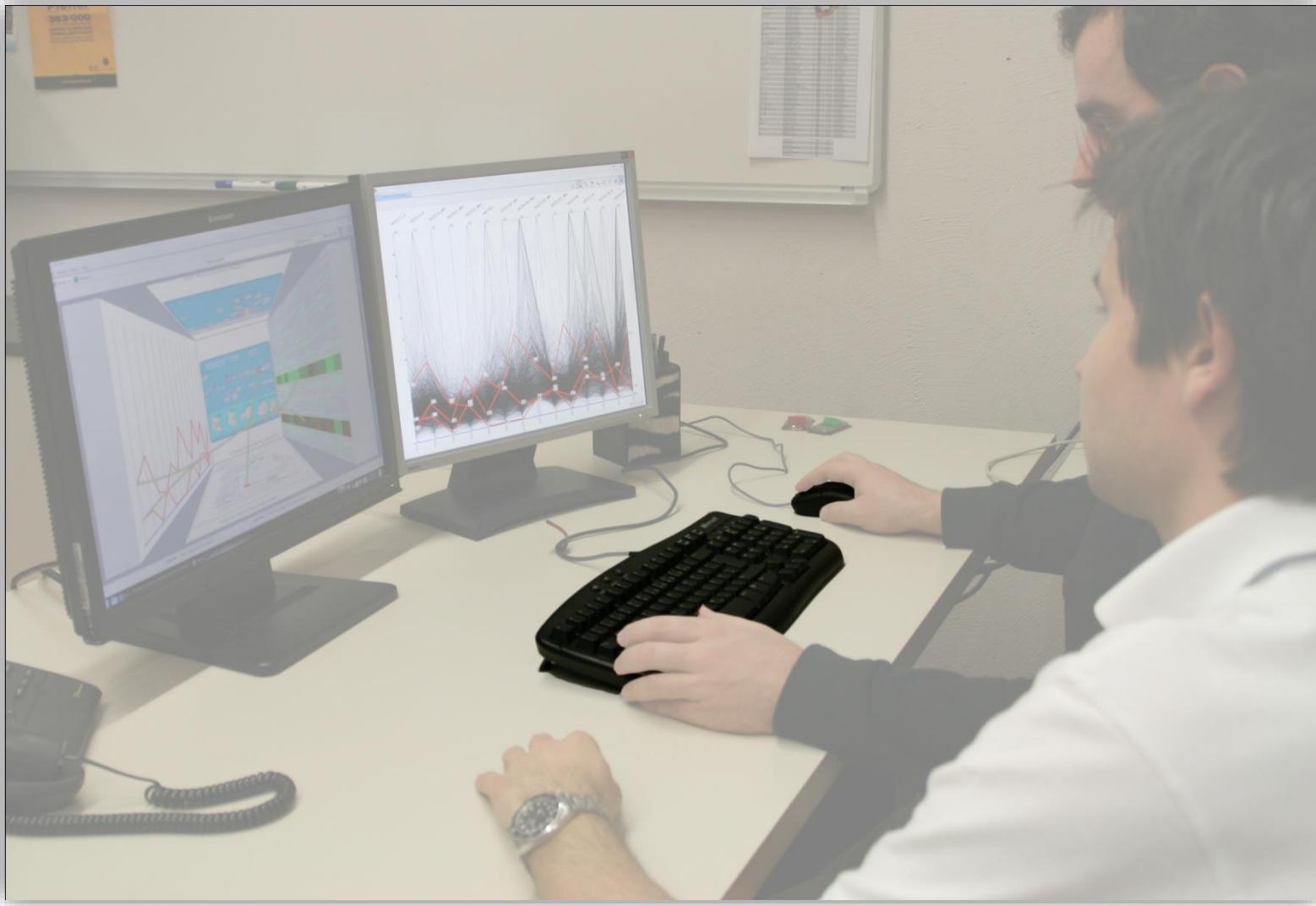


# LINKING ACROSS DISPLAYS / USERS

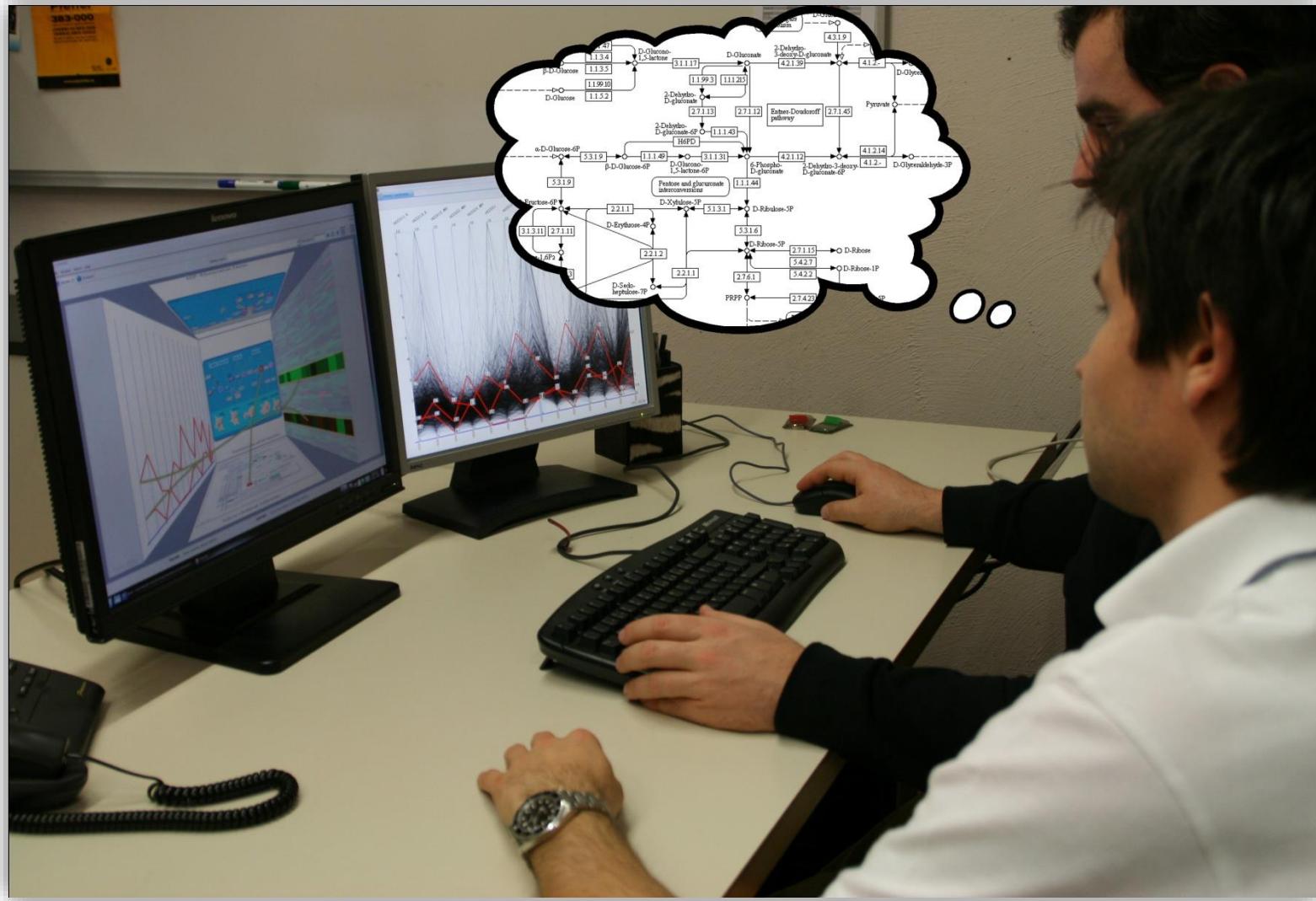
# Collaborative Information Analysis



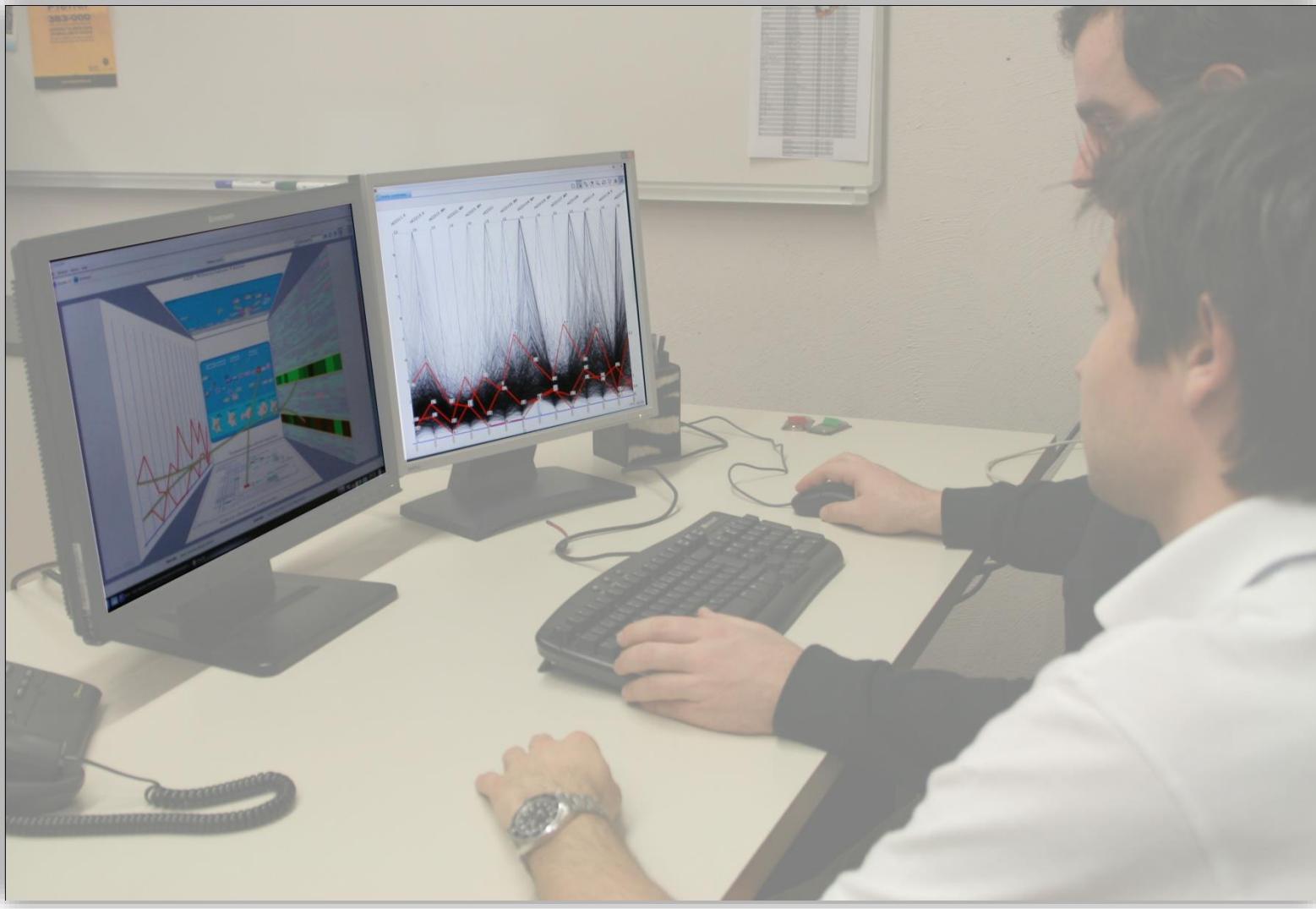
# Collaborative Information Analysis



# Collaborative Information Analysis



# Collaborative Information Analysis



# Collaborative Information Analysis

Separation

Individual information extraction

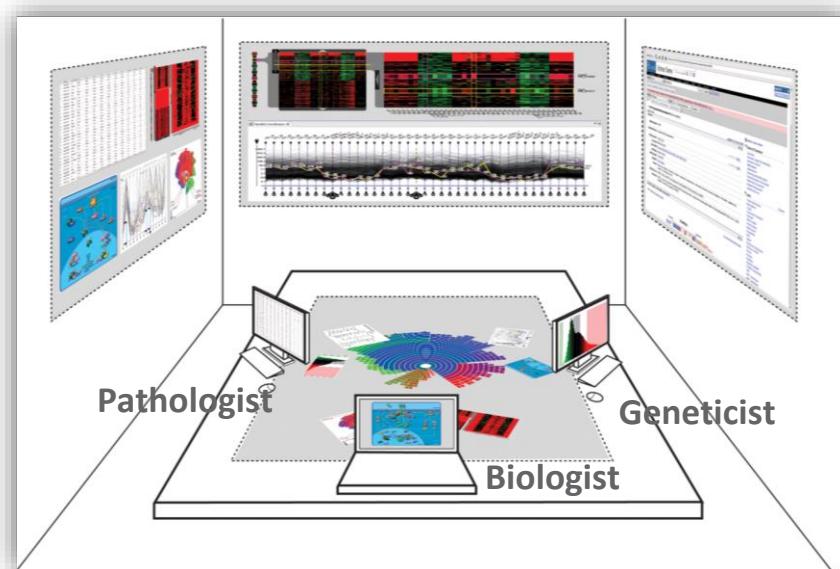
Discussion of individual contributions



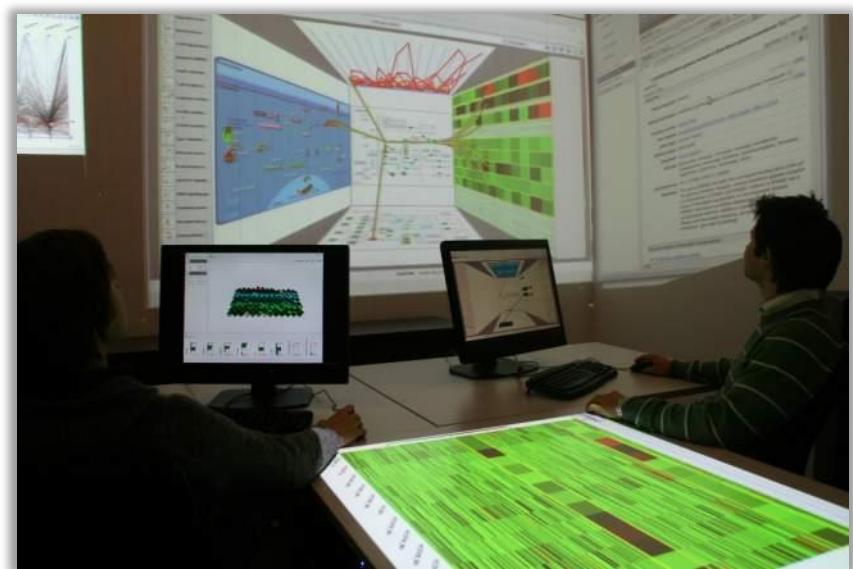
# Collaborative Visual Analysis

## Interdisciplinary analysis problems

Single domain expert may not be enough  
→ Need for collaboration



[Streit et al. 2009]

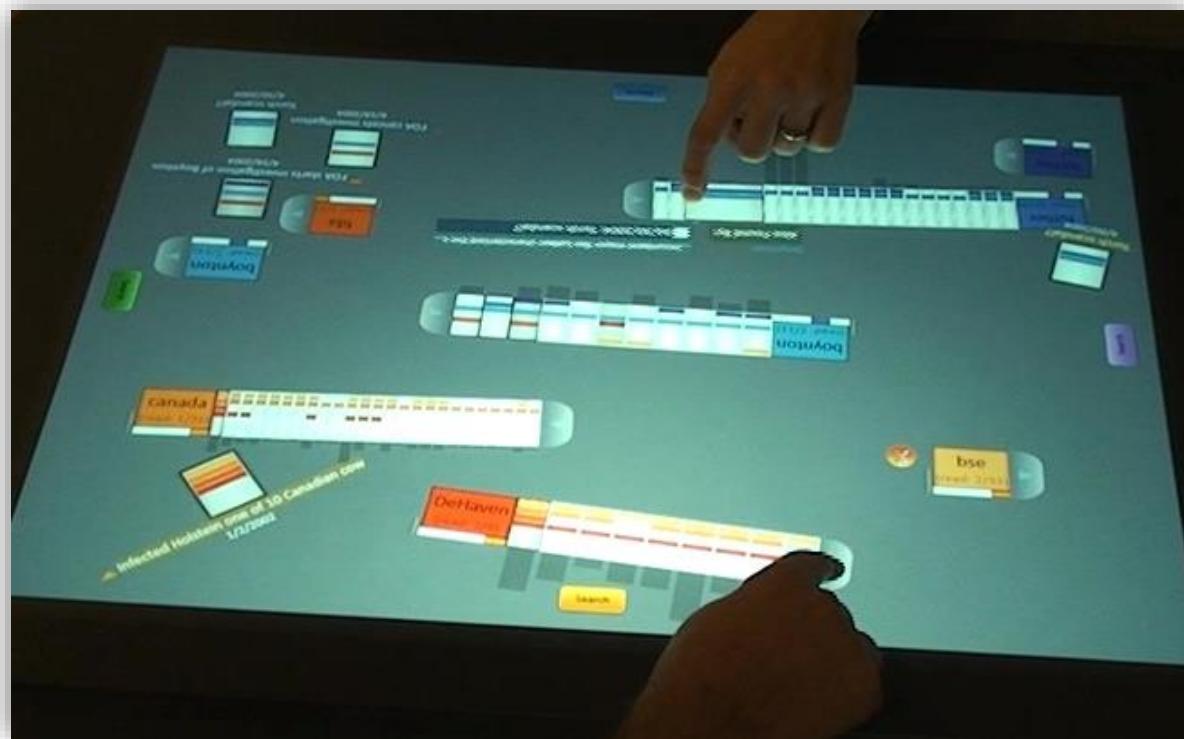


[Waldner et al. 2009]

# Collaborative Brushing and Linking

[Isenberg and Fisher 2009]

## Co-located Visual Analytics of Document Collections

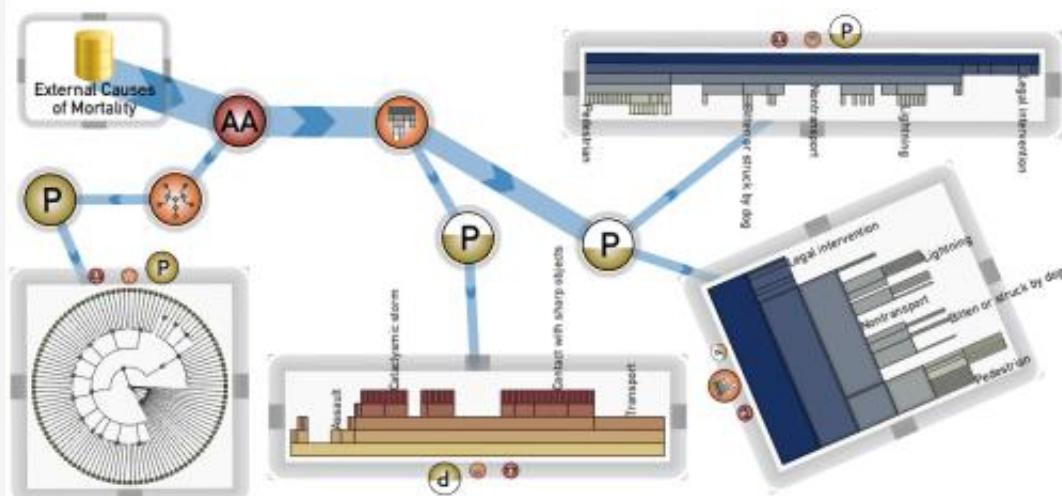


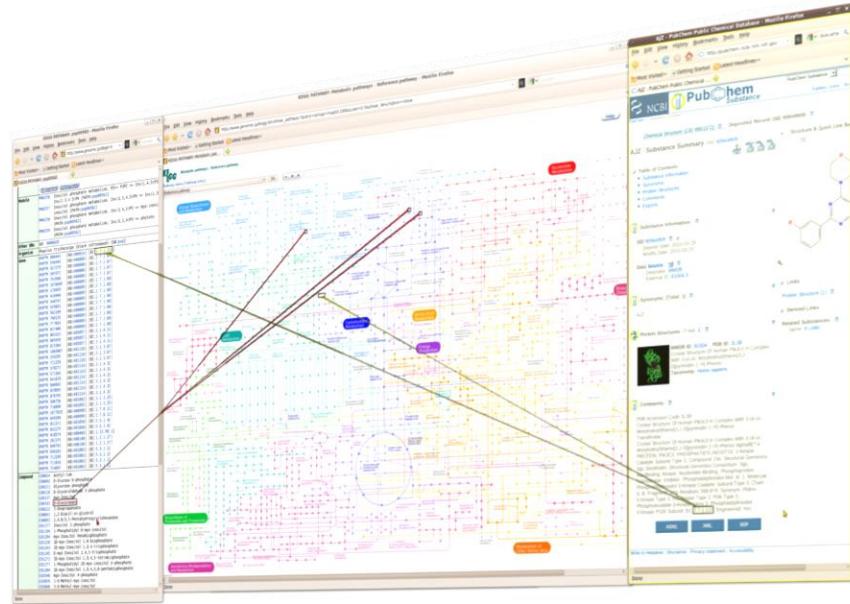
# LARK: Coordinating Co-located Collaboration with InfoVis

[Tobiasz et al. 2009]

MCV on large multi-touch displays

Explicitly indicating coordination points on  
data, representation, presentation, and view level





[Waldner et al. 2011]

# COLLABORATIVE INFO LINKING

# Collaborative Info-Linking Approach

**Collaborative environment** that provides:

Unmodified single-user application support

Sufficient screen space

Multi-pointer support

User-specific visual links  
across applications

Protecting workspaces

Storing and sharing

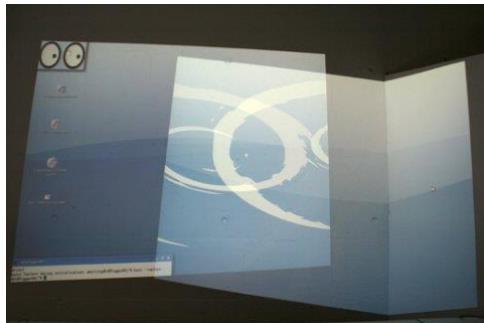


# Large displays

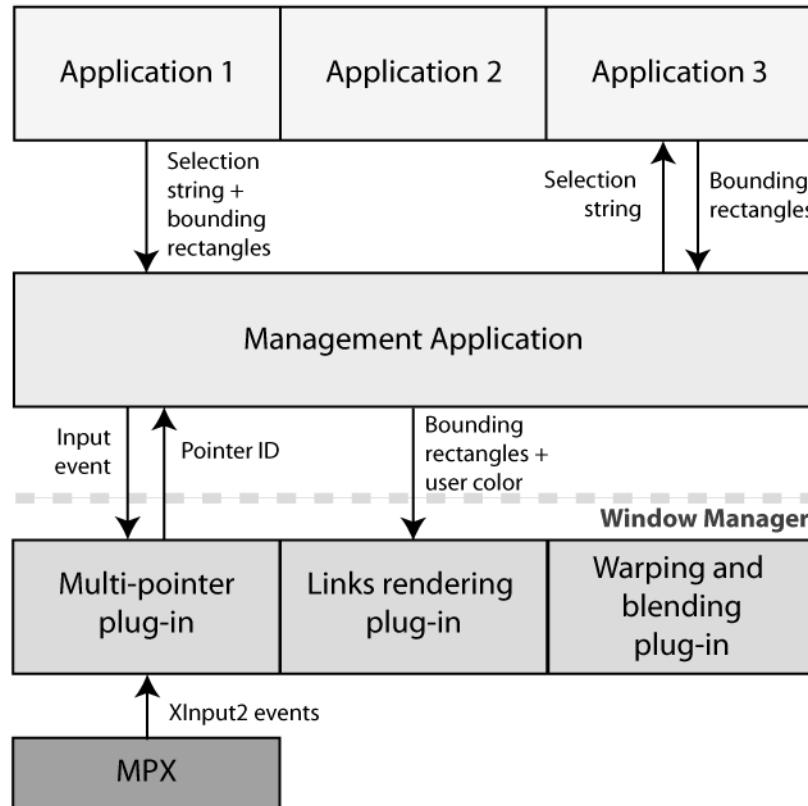
Casually aligned multi-projector displays

Compiz extension for tiled displays [Waldner et al., EDT/IPT 2008]

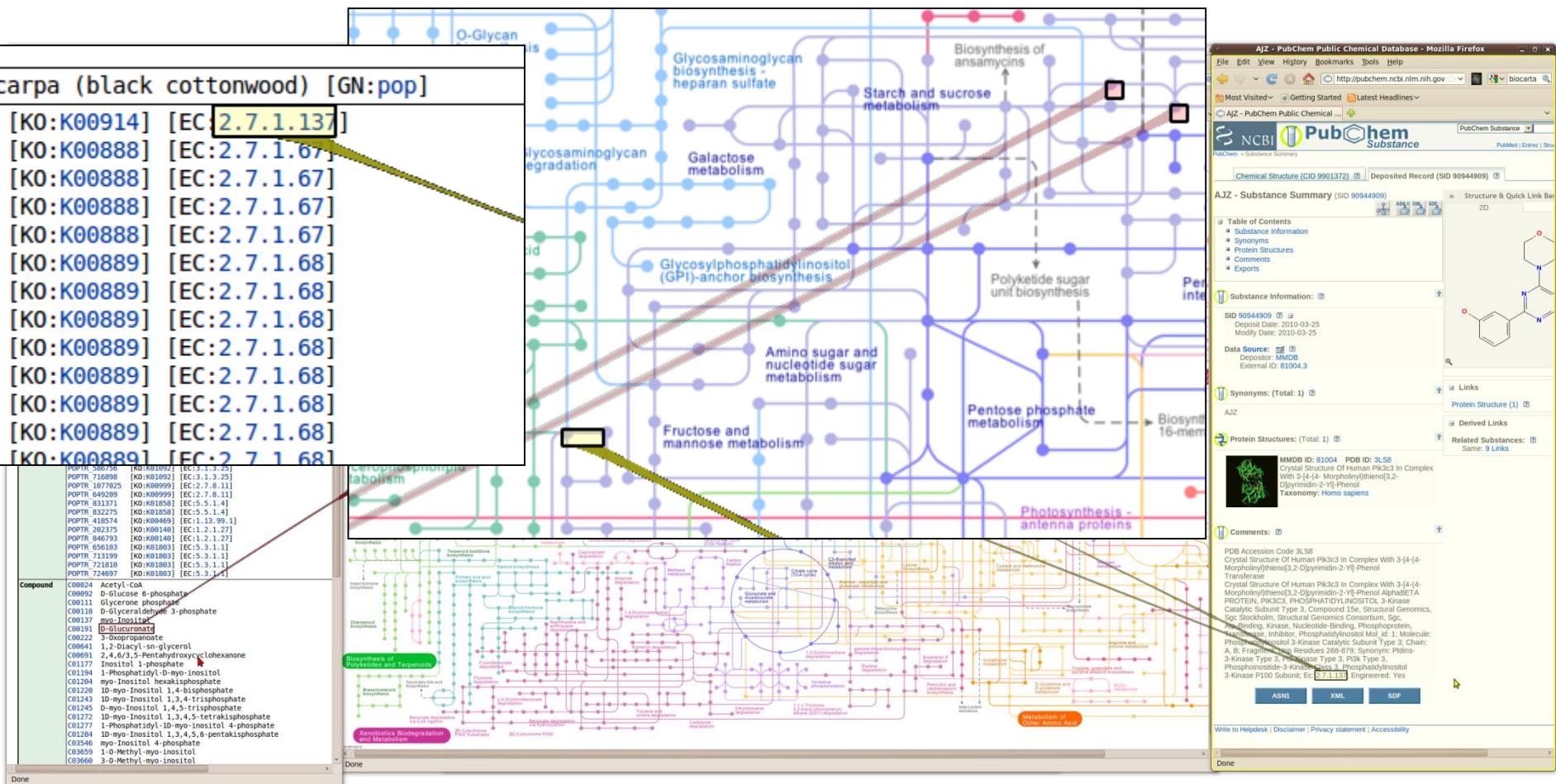
Warping and blending of overlapping projections in the window manager → application transparent



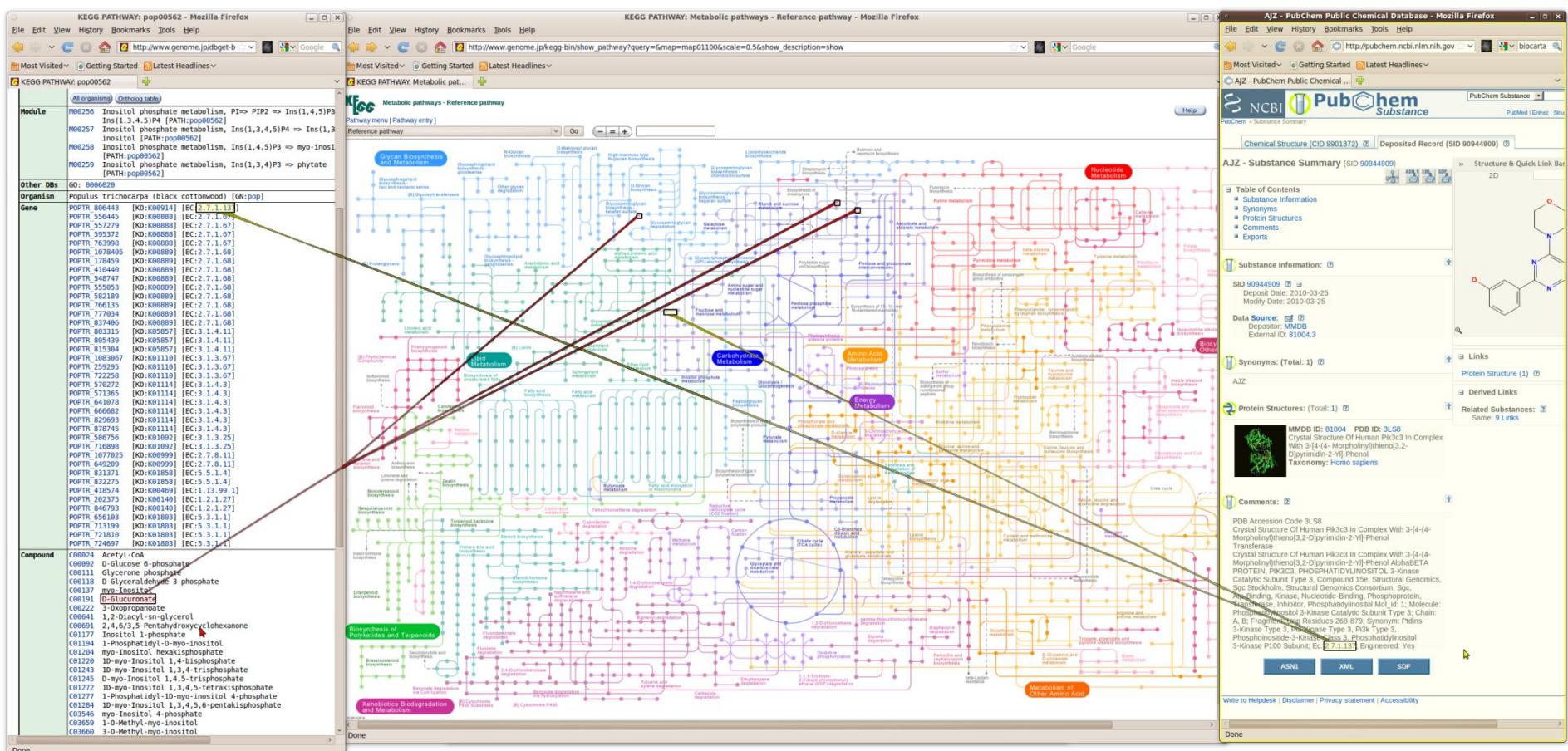
# Linking Infrastructure



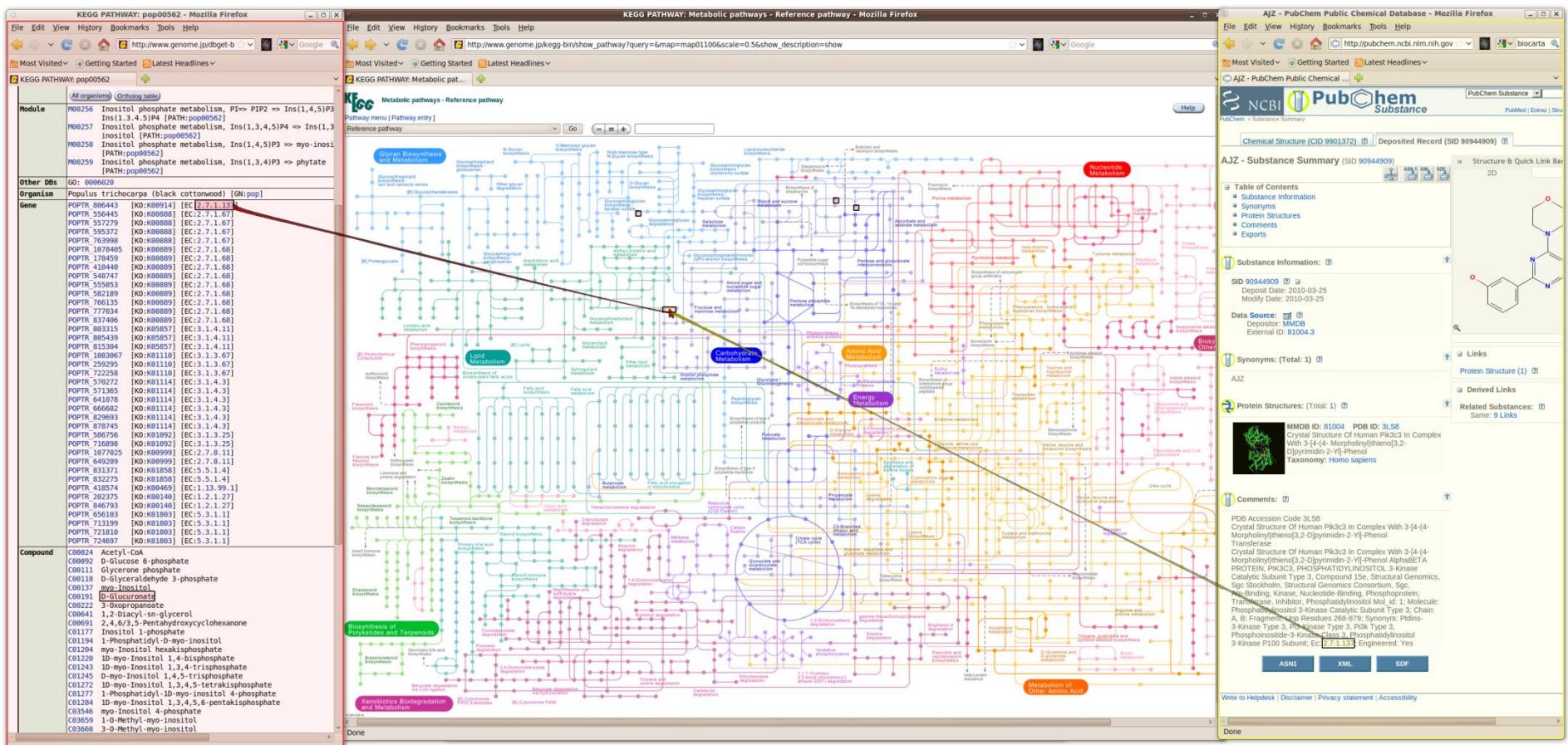
# Collaborative Information Linking



# Window Protection

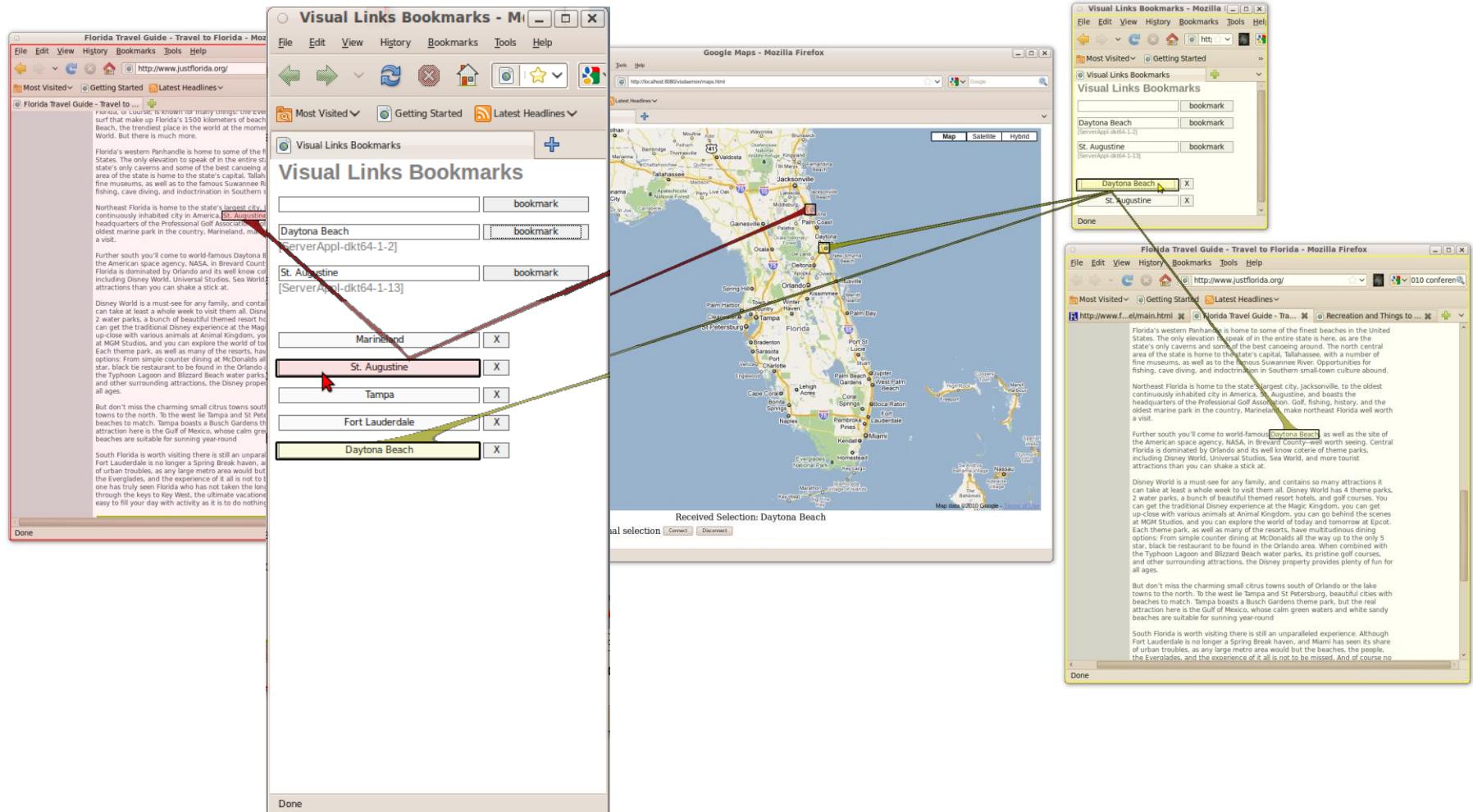


# Selection „Hijacking“



# Selection Storage and Management

## Bookmark list as central storage and global



# One-Shot Linking

Light-weight linking *from* unmodified applications

Text selection → keyboard shortcut → selection buffer

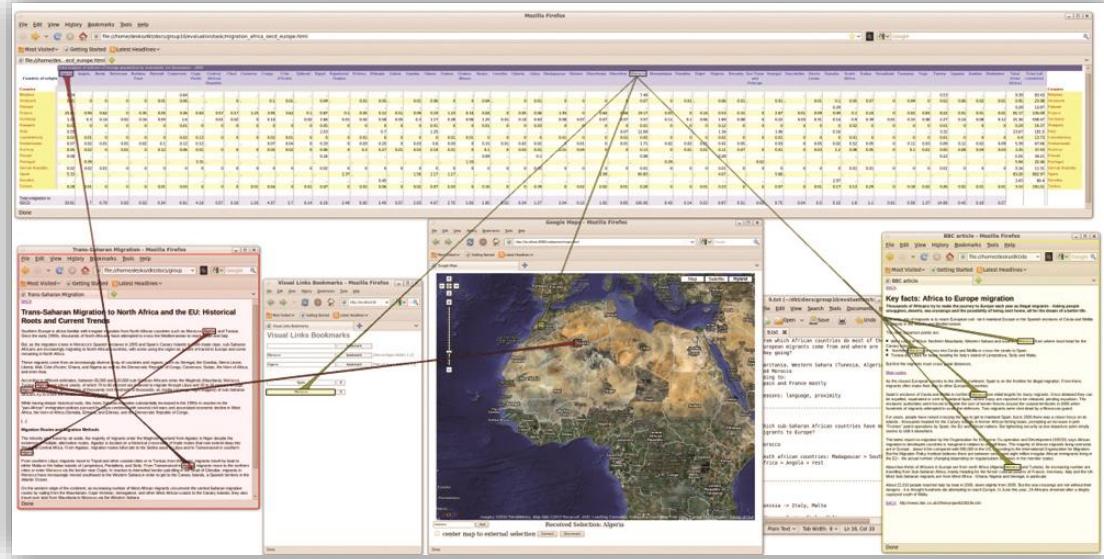
Places to go		
Orlando	Airport	
Tampa	Busch Gardens	Gulf of Mexico
Miami		
Everglades	National Park	
Key West		
Jacksonville	oldest inhabited town in US	
Daytona Beach	famous beach	

# Observational Experiment

18 participants (16 males, 2 females) - pairs

Analysis of migration from Africa to Europe

Observations, video / audio recording,  
questionnaires, interview



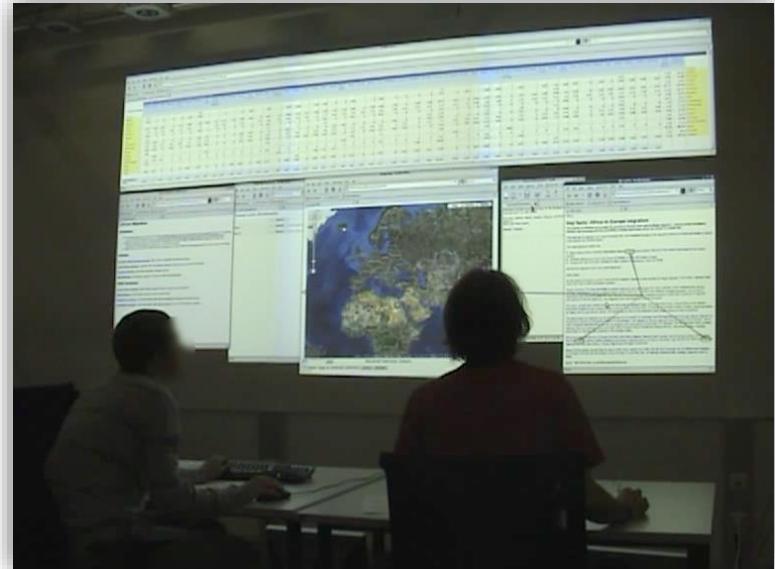
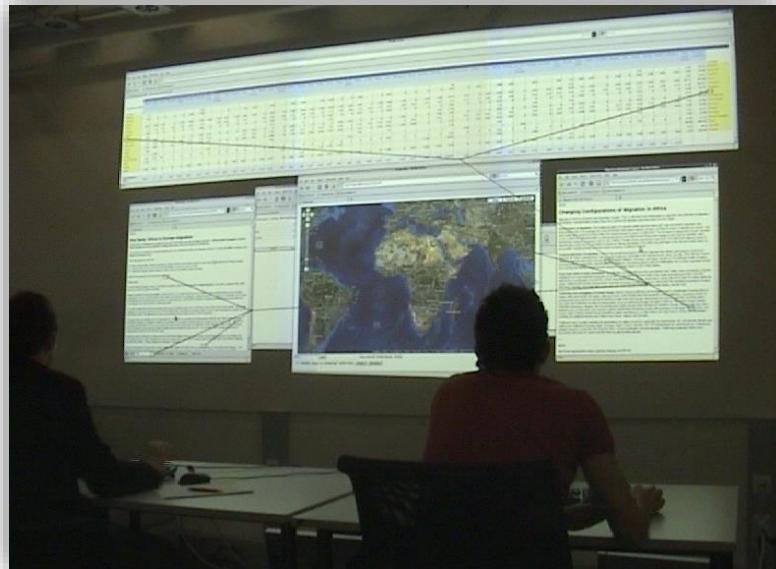
# Results

Usage of information linking depends on work style

Individual information retrieval → links to locate info

Joint discussion → one set of links only

Mixed-focus collaboration: most frequently



# Results

## Distractions and conflicts

In general distraction was assessed as low

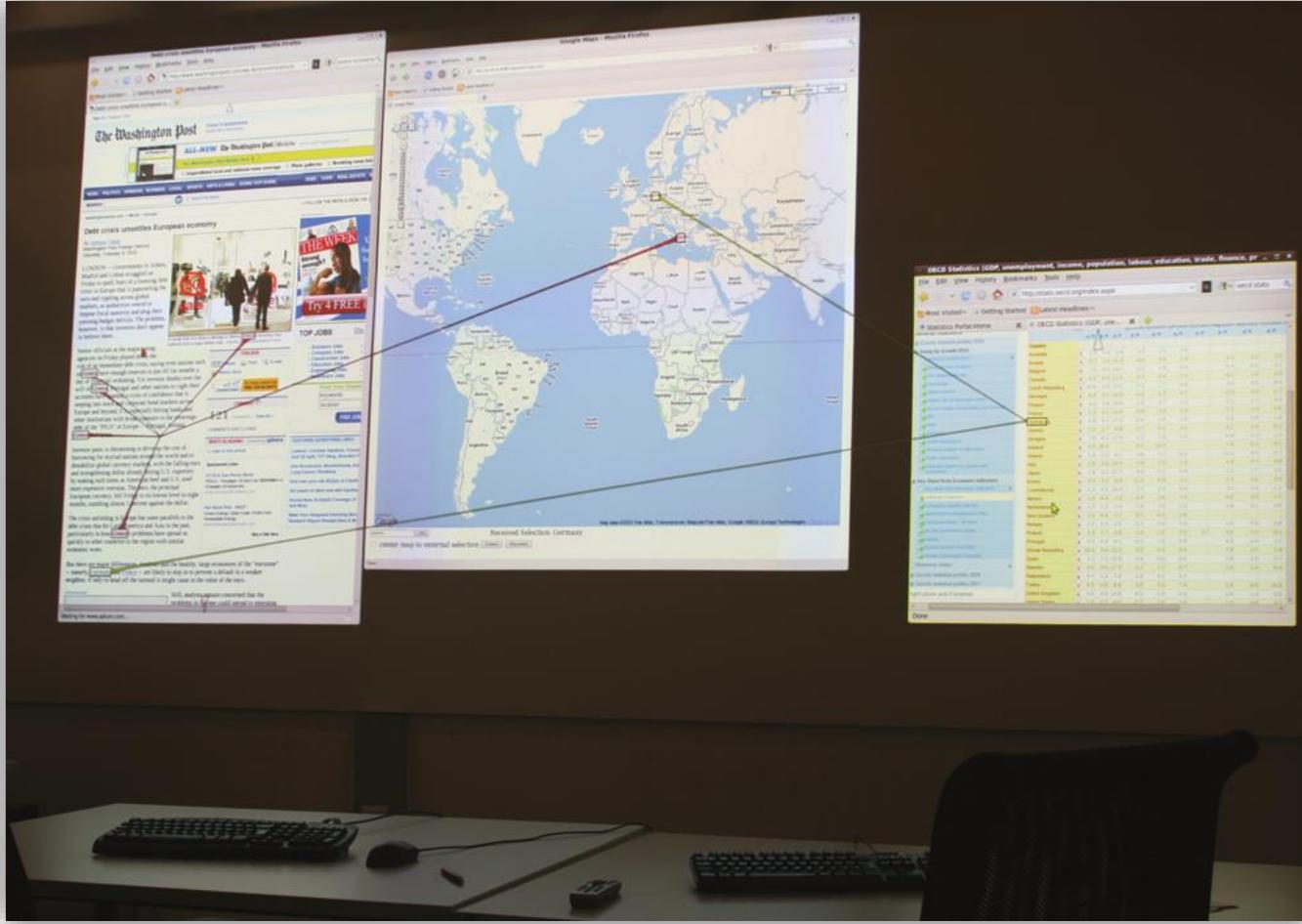
Input conflicts on shared windows, changes to window layout

Could be resolved by social protocols, but subjectively annoying

## Territoriality

Window ownership based on initial window layout

Movement of shared windows rare



# Open Issues

What about visual clutter when more users are interacting?  
How to handle discontinuous multi-display/projector setups?

# Virtual Reality

## Visual links in immersive environments



Biological Network Analysis in VR [Dickerson et al 2002]

Connecting the Dots

# TUTORIAL SUMMARY

# Summary Part I – What to Link

Relations differ in their:

Cardinality

Elements (Granularity + Scope)

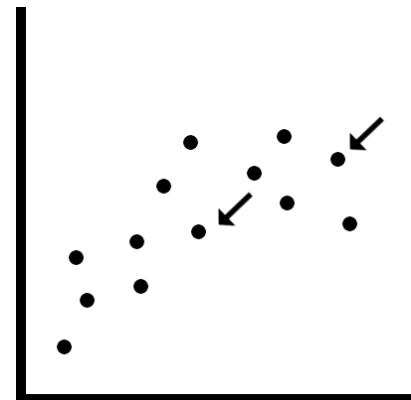
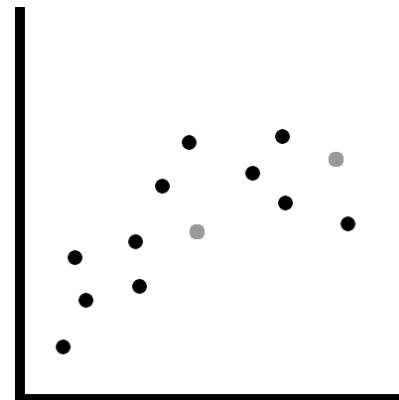
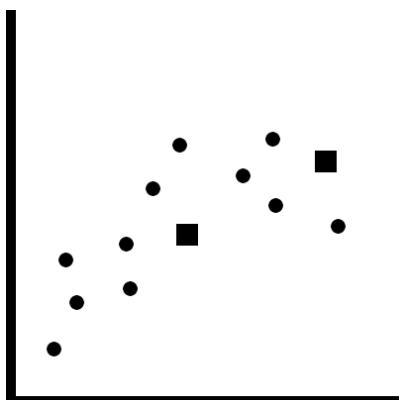
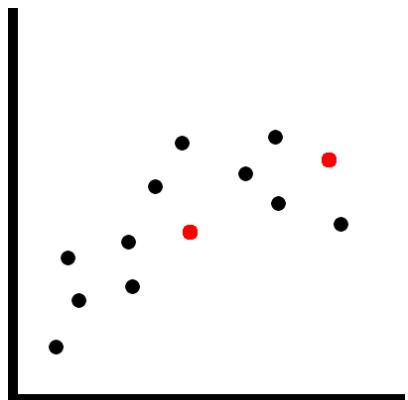
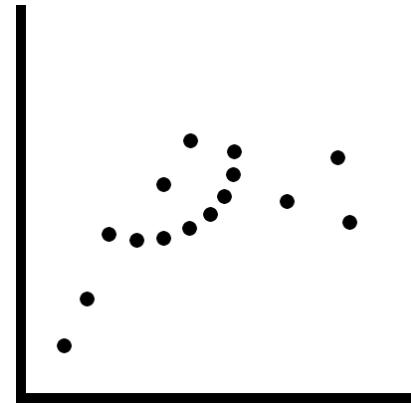
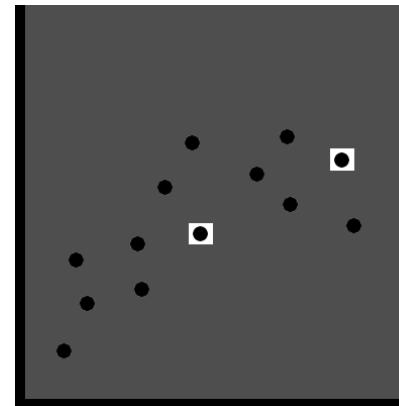
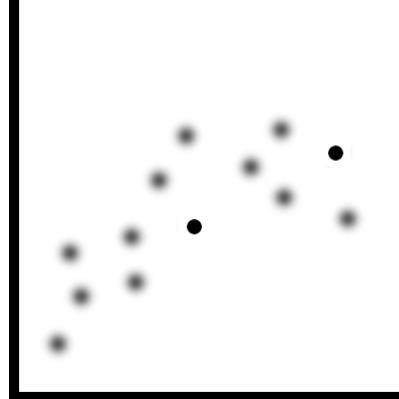
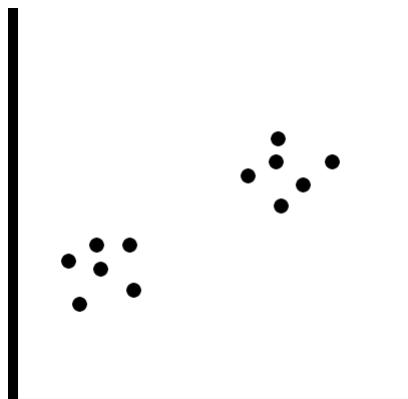
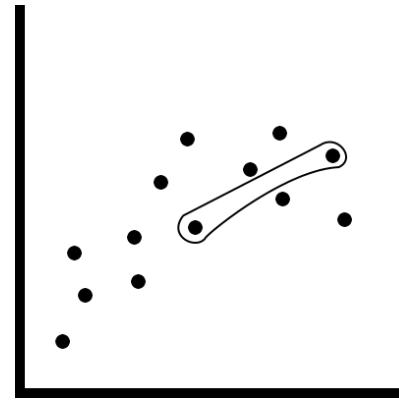
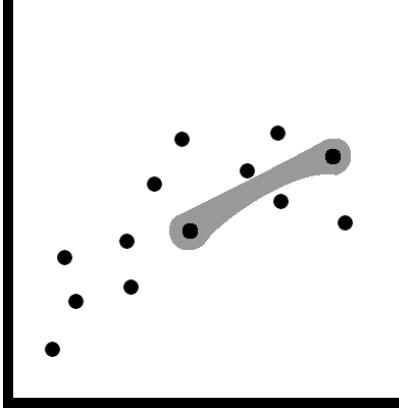
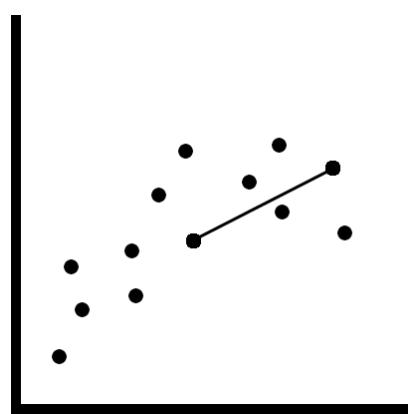
Domain

Relations can be derived or inherent

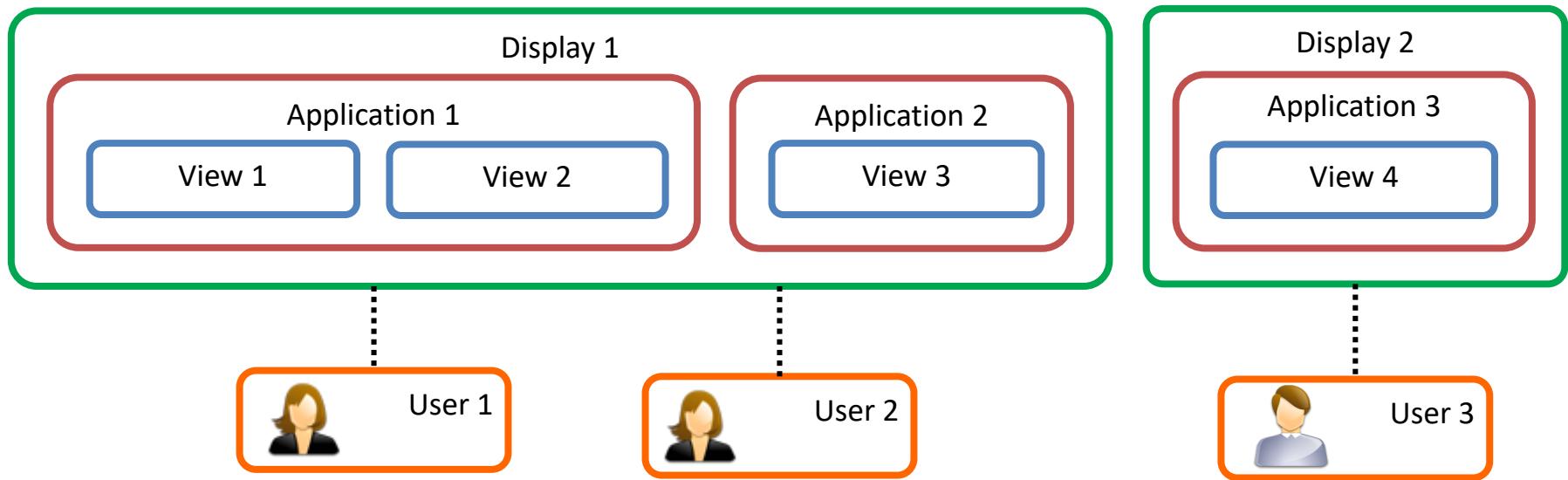
Examples given show what's already been done

– and what's still left to explore!

# Summary Part II – How to Link



# Summary Part III – When to Link





# Connecting The Dots

Showing Relationships in Data and Beyond

[connecting-the-dots.caleydo.org](http://connecting-the-dots.caleydo.org)

Marc Streit

Hans-Jörg Schulz

Alexander Lex

[marc.streit@jku.at](mailto:marc.streit@jku.at)

[contact@hjschulz.net](mailto:contact@hjschulz.net)

[alex@seas.harvard.edu](mailto:alex@seas.harvard.edu)



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