

Connecting The Dots

Showing Relationships in Data and Beyond

Marc Streit¹, Hans-Jörg Schulz², Alexander Lex³

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

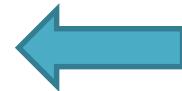
Motivation

Common task in data analysis and many kinds of information intensive work:

**Compare, evaluate and interpret
related pieces of information**

**LET'S START WITH A LITTLE
GAME...**

Do you know this guy?



Wally



Walter



Waldo

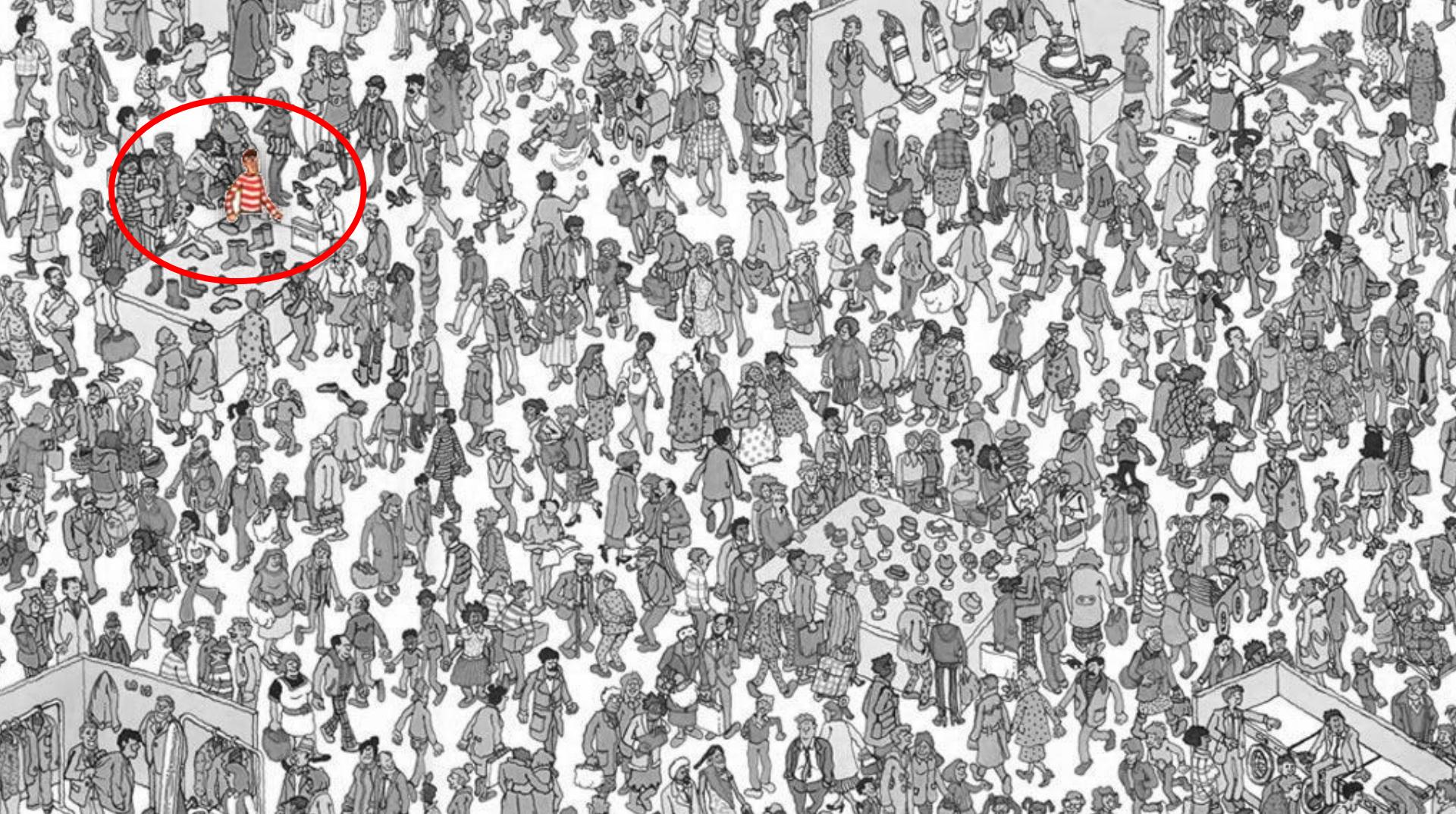


Holger



...

<http://www.classicmedia.tv/pr/whereswaldo/>



Search Task





In case you
wanna have
a tattoo...

Spot the differences

Comparison Task



What's the Problem?

Finding, comparing and interpreting information
is **error-prone** and **tedious**

→ Support human

Search

About 61,500,000 results (0.10 seconds)

Everything

[Highlight all search pattern matches - Vim Tips Wiki](#)

vim.wikia.com/wiki/Highlight_all_search_pattern_matches

When searching, it is often helpful to [highlight](#) all search hits (in a program, for example, that al.

Images

Maps

Videos

News

Shopping

More

All results

Sites with images

Related searches

More search tools

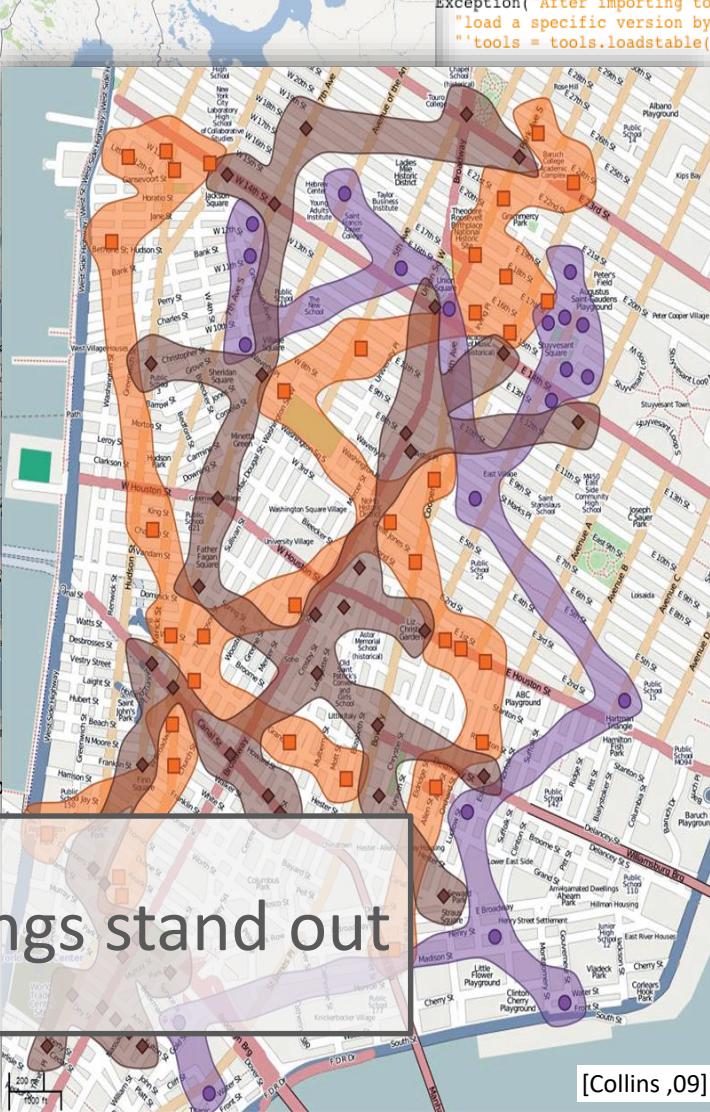


Extensible search [highlighting](#) in PHP (See related posts). Based on Dean's original Google Hiltite, but refactored a bit to make it easy to add support for more ...

[Highlighting WordPress authors in search - Yoast](#)

yoast.com/WordPress

Make things stand out



```
def myimport(name, theglobals=None, thelocals=None, fromlist=None, level=-1):
    if name.split('.')[0] != "tools":
        return _original_import_(name, theglobals, thelocals,
                               fromlist, level)
```

if not currentversion:

```
Exception("After importing tools, you must "
"load a specific version by typing something like "
"\"tools = tools.loadstable(\"0.1\")\" .")
```

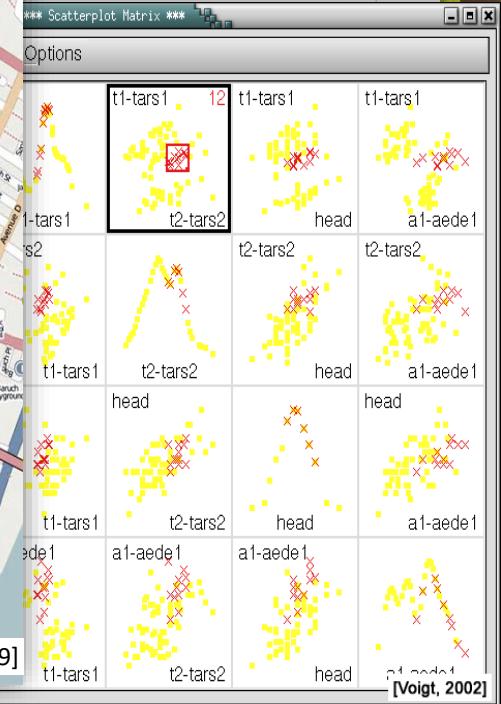
```
ionname>{.anything}" , where
ols._stable_0_1'.
```

eg 'tools._stable_0_1'

ls", but otherwise execute the

), theglobals, thelocals,

top-level package instead of



Overview

PART 1: What to link?

Defining Common Relations

PART 2: How to link?

Representing Relation on View Level

PART 3: When to link?

Cases in which Linking is Beneficial

Overview

PART 1: What to link?

Defining Common Relations

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Cases in which Linking is Beneficial

Part I: What to Link?

- 1. Entities/Elements (what is linked?)**
 - data items, clusters, datasets...
- 2. Cardinality (how many are linked?)**
 - binary or n-ary ($n > 2$)
- 3. Domain (where do the links stem from?)**
 - data, view, interaction

About Ourselves: Hans-Jörg Schulz

MSc+PhD in Rostock (Topic: Graph Visualization)

Currently researcher at the University of Rostock
working on visualization of heterogeneous data
(funded by the German Research Foundation DFG)

What he does when the DFG is not looking:

tree visualization survey: <http://treevis.net>

visualization design spaces

visualization for the biological domain

Overview

PART 1: What to link?

Defining Common Relations

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Cases in which Linking is Beneficial

http://en.wikipedia.org/wiki/Providence,_Rhode_Island



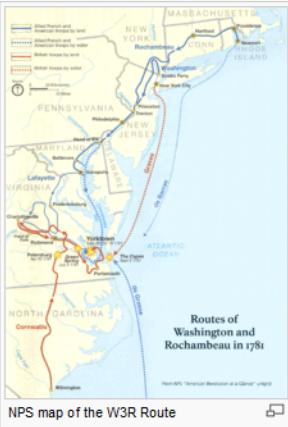
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In the mid-1770s, the British government levied taxes that impeded Providence's maritime, fishing and agricultural industries, the mainstay of the city's economy. One example was the Sugar Act, which was a tax levied against Providence's distilleries 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.^[13]

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.^[13]

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.^{[14][15]} 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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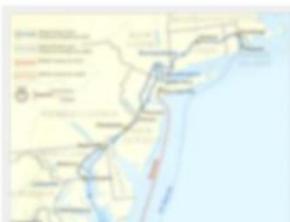
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First Baptist Church in America, founded 1638, present building occupied in 1776, is the oldest Baptist congregation in America



Providence in the mid-nineteenth century



Route of Washington and Rochambeau in 1776
NPS map of the WSR Route

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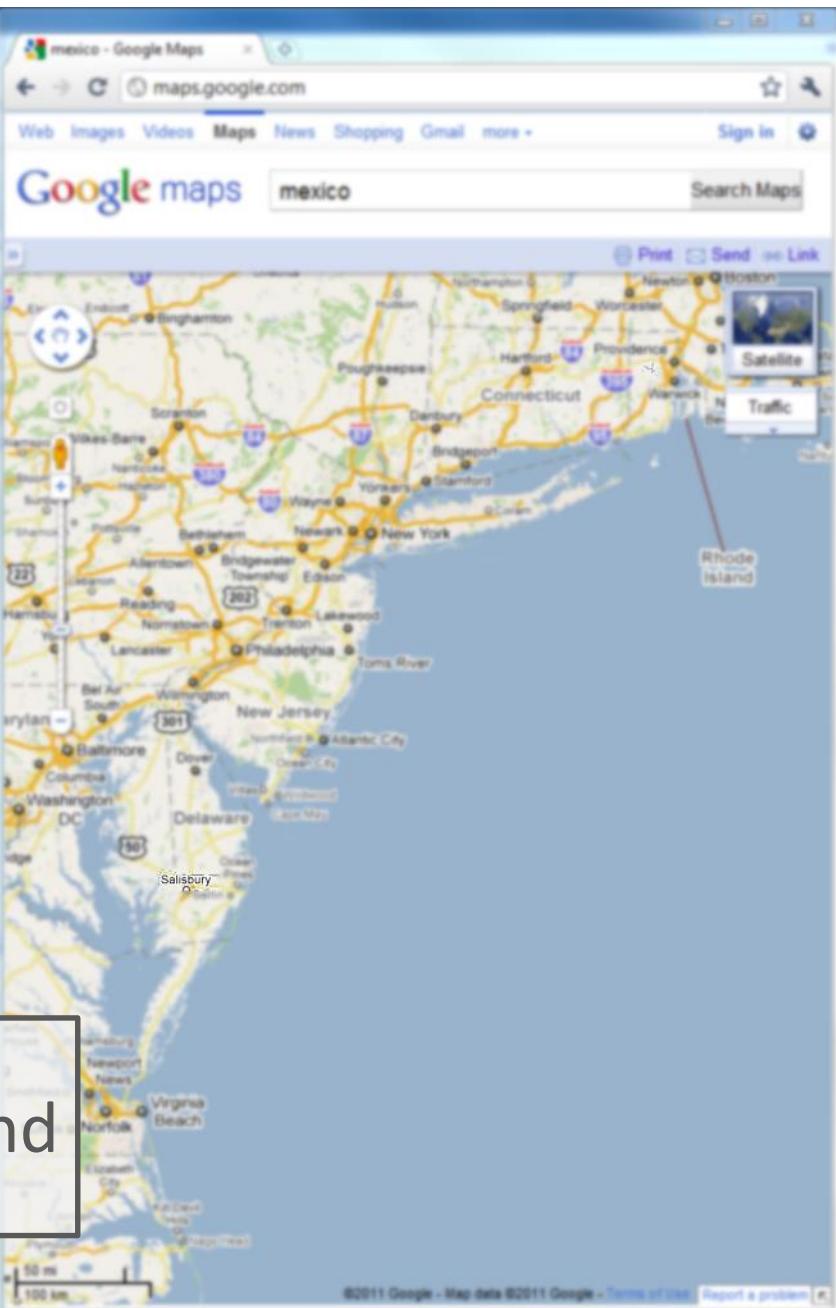
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Campaign led jointly by General George Washington & a decisive match that ended with the defeat of General Cornwallis in the Siege of Yorktown.

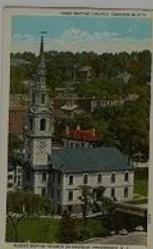
Virginia and the Battle of Yorktown are fully described in the section on the largest city—Richmond, with 2,044 people. The economy shifted from maritime endeavors to manufacturing, particularly machinery, tools, silverware, jewelry and pottery. The city became known as the "Silversmith of the World".

Providence boasted some of the largest manufacturing plants in the country, including Brown & Sharpe



Blur Background

[d... wikipedia.org/wiki/Providence,_Rhode_Island](http://en.wikipedia.org/wiki/Providence,_Rhode_Island)



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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.

Today, Providence is the second largest city in Rhode Island with 76,614 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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Rhode Island

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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.^[13]

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 colony's fourth largest city.^[13] 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**.

Change Color

NPS map of the W3R Route

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Following the war, Providence was the third largest city.^{[6][13]} 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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Blinking

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Visual Linking

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Routed Visual Linking

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Part II: How to Link?

1. Similarity (Gestalt principle, Wertheimer 1923)
2. Proximity (Gestalt principle, Wertheimer 1923)
3. Connectedness (Palmer&Rock 1994)

About Ourselves: Alex Lex

PhD from Graz University of Technology

Post-doctoral Researcher at VCG@Harvard

Research Topics:

Visualizations with applications in molecular biology

Visual linking

Overview

PART 1: What to link?

Defining Common Relations

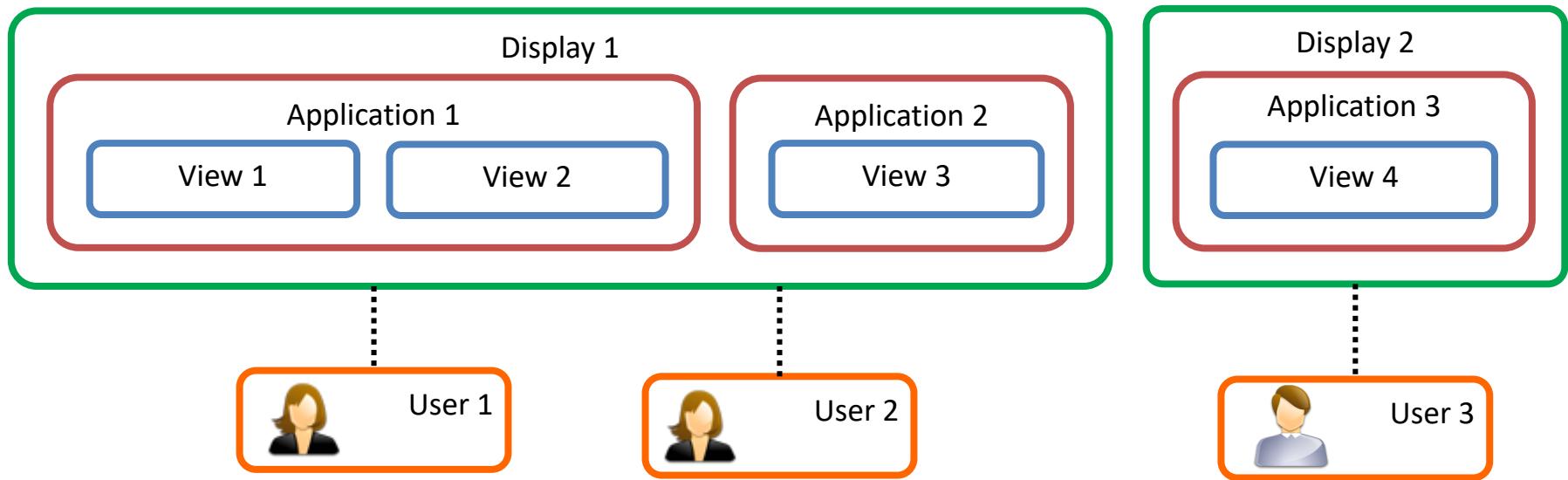
PART 2: How to link?

Representing Relation on View Level

PART 3: When to link?

Cases in which Linking is Beneficial

Part III: When to link?



About Ourselves: Marc Streit

PhD from Graz University of Technology

Assistant Professor at Johannes Kepler University Linz

Visiting Researcher at Harvard Medical School

Research Topics:

Visual Analysis of Heterogeneous Data

Focus: Biomolecular Data

Visual Linking

Caleydo (www.caleydo.org)

Overview

PART 1: What to link?

Relations on Data, View, and Interaction Level

PART 2: How to link?

Representing Relation on View Level

PART 3: When to link?

Application Areas that Benefit from Linking

Schedule

2:15 – 3:15	Part I: What to Link?
3:15 – 3:40	Part II: How to Link?
3:40 – 4:15	Coffe break
4:15 – 4:50	Part II: How to Link?
4:50 – 5:50	Part III: When to link?

WHAT'S YOUR BACKGROUND?

WHAT'S NEXT: WHAT TO LINK BY HANSI