Science of Science Research and Tools

Katy Börner

Visiting Scientist in Dirk Helbing's Group, SOMS, ETHZ Cyberinfrastructure for Network Science Center, Director Information Visualization Laboratory, Director School of Library and Information Science Indiana University, Bloomington, IN katv@indiana.edu





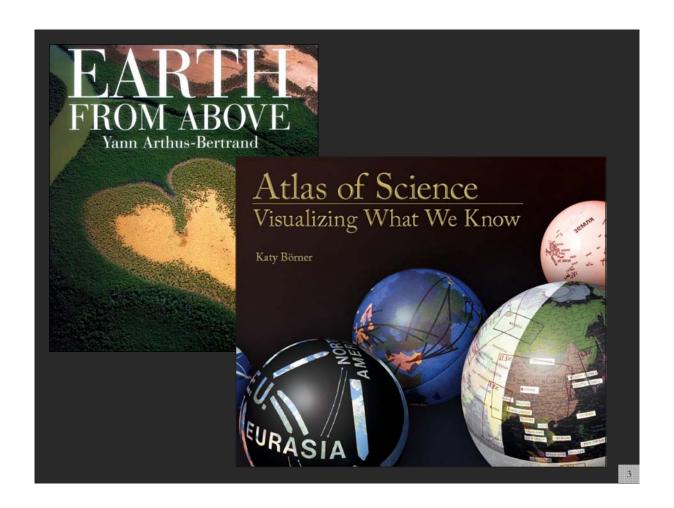
With special thanks to the members at the Cyberinfrastructure for Network Science Center, Kevin W. Boyack, the Mapping Science exhibit advisory board, and the VIVO Consortium

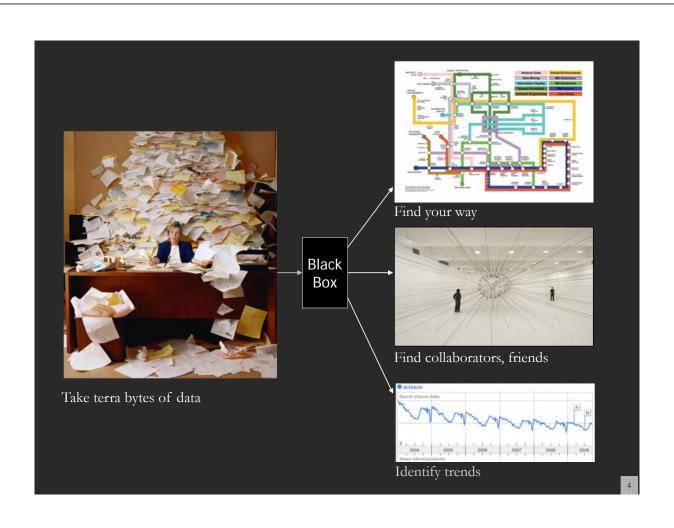
Research Seminar, Dirk Helbing's Team Eidgenössische Technische Hochschule Zürich

June 9, 2011

Four Parts:

- 1. Atlas of Science and Mapping Science exhibit
- 2. Macroscopes: The Science of Science (Sci2) Tool
- 3. Interactive Science and Technology Maps
- 4. S&T Studies that Use Semantic Web Data (VIVO)





Mapping Science Exhibit – 10 Iterations in 10 years

The Power of Maps (2005)



The Power of Reference Systems (2006)



The Power of Forecasts (2007)



Science Maps for Economic Decision Makers (2008)



Science Maps for Science Policy Makers (2009)



Science Maps for Scholars (2010)

Science Maps as Visual Interfaces to Digital Libraries (2011)

Science Maps for Kids (2012) Science Forecasts (2013)

Towards Science Mapping Standards (2014)

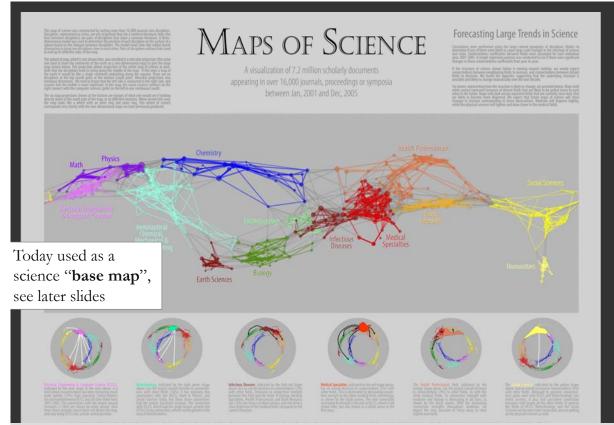
Exhibit has been shown in 72 venues on four continents. Currently at

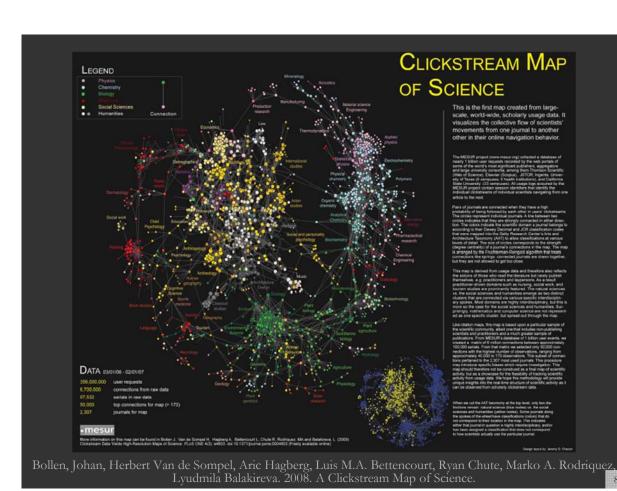
- NSF, 10th Floor, 4201 Wilson Boulevard, Arlington, VA
- Center of Advanced European Studies and Research, Bonn, Germany
- University of Michigan, Ann Arbor, M





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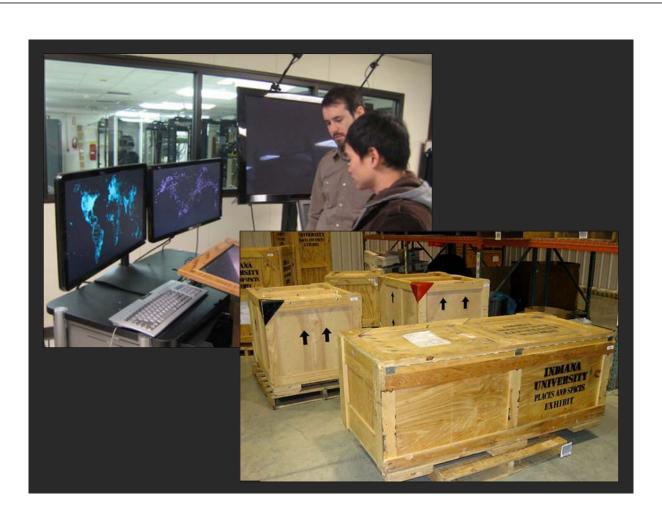






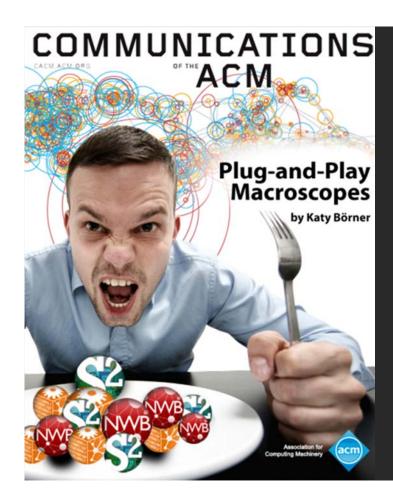


Debut of 5th Iteration of the Mapping Science Exhibit at MEDIA X was in 2009 at Wallenberg Hall, Stanford University, http://mediax.stanford.edu, http://mediax.stanford.edu





12 coaches, 300 m long. http://www.expedition-zukunft.de



Börner, Katy. (March 2011). Plug-and-Play Macroscopes. Communications of the ACM, 54(3), 60-69.

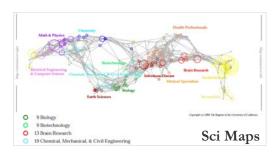
Video and paper are at

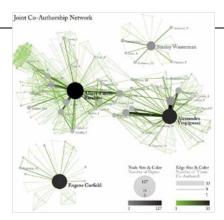


Sci² Tool - "Open Code for S&T Assessment"

http://sci2.cns.iu.edu

OSGi/CIShell powered tool with NWB plugins and many new scientometrics and visualizations plugins.

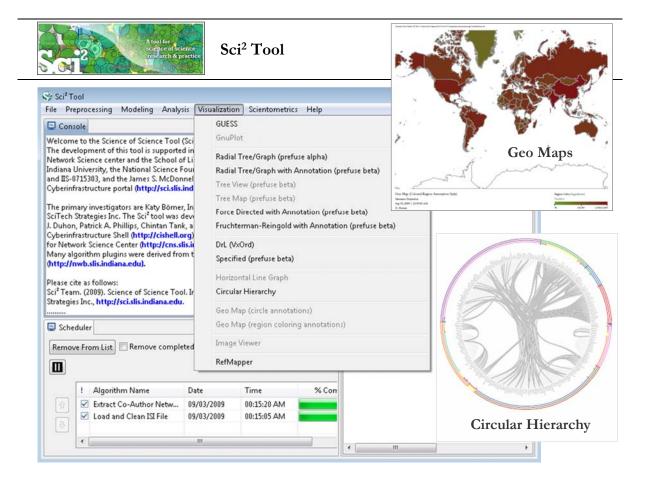


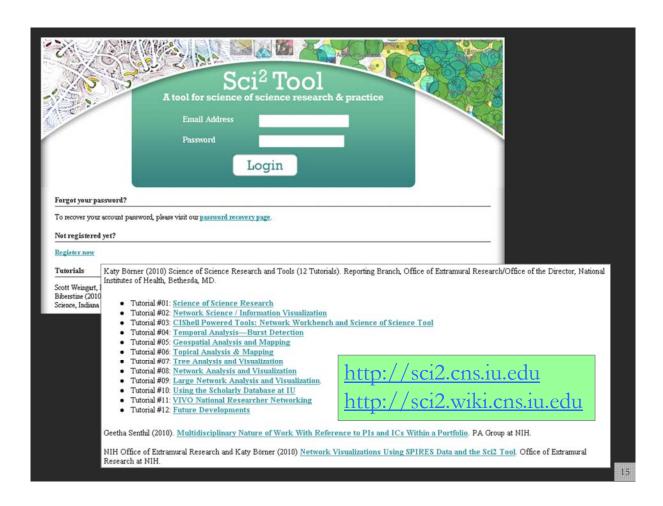


GUESS Network Vis



Börner, Katy, Huang, Weixia (Bonnie), Linnemeier, Micah, Duhon, Russell Jackson, Phillips, Patrick, Ma, Nianli, Zoss, Angela, Guo, Hanning & Price, Mark. (2009). Rete-Netzwerk-Red: Analyzing and Visualizing Scholarly Networks Using the Scholarly Database and the Network Workbench Tool. Proceedings of ISSI 2009: 12th International Conference on Scientometrics and Informetrics, Rio de Janeiro, Brazil, July 14-17. Vol. 2, pp. 619-630.







Type of Analysis vs. Level of Analysis

	Micro/Individual (1-100 records)	Meso/Local (101–10,000 records)	Macro/Global (10,000 < records)
Statistical Analysis/Profiling	Individual person and their expertise profiles	Larger labs, centers, universities, research domains, or states	All of NSF, all of USA, all of science.
Temporal Analysis (When)	Funding portfolio of one individual	Mapping topic bursts in 20-years of PNAS	113 Years of Physics Research
Geospatial Analysis (Where)	Career trajectory of one individual	Mapping a states intellectual landscape	PNAS Publications
Topical Analysis (What)	Base knowledge from which one grant draws.	Knowledge flows in Chemistry research	VxOrd/Topic maps of NIH funding
Network Analysis (With Whom?)	NSF Co-PI network of one individual	Co-author network	NSF's core competency



Sci² Tool: Algorithms

Preprocessing

Extract Top N% Records Extract Top N Records Normalize Text Slice Table by Line

Extract Top Nodes

Extract Nodes Above or Below Value

Delete Isolates

Extract top Edges

Extract Edges Above or Below Value

Remove Self Loops

Trim by Degree

MST-Pathfinder Network Scaling Fast Pathfinder Network Scaling

Snowball Sampling (in nodes)

Node Sampling

Edge Sampling

Symmetrize

Dichotomize

Multipartite Joining

Geocoder

Extract ZIP Code

Modeling

Random Graph Watts-Strogatz Small World

Barabási-Albert Scale-Free

TARL

Analysis

Network Analysis Toolkit (NAT)

Unweighted & Undirected

Node Degree

Degree Distribution

K-Nearest Neighbor (Java)

Watts-Strogatz Clustering Coefficient

Watts Strogatz Clustering Coefficient over K

Diameter

Average Shortest Path

Shortest Path Distribution

Node Betweenness Centrality

Weak Component Clustering

Global Connected Components

Extract K-Core

Annotate K-Coreness

HITS

Weighted & Undirected

Clustering Coefficient

Nearest Neighbor Degree

Strength vs Degree

Degree & Strength

Average Weight vs End-point Degree

Strength Distribution

Weight Distribution

Randomize Weights

Blondel Community Detection

HITS

Unweighted & Directed

Node Indegree

Node Outdegree

Indegree Distribution

Outdegree Distribution

K-Nearest Neighbor

Single Node in-Out Degree Correlations

Dyad Reciprocity

Arc Reciprocity

Adjacency Transitivity

Weak Component Clustering

Strong Component Clustering



Sci² Tool: Algorithms cont.

Extract K-Core

Annotate K-Coreness

HITS

PageRank

Weighted & Directed

HITS

Weighted PageRank

Burst Detection

Visualization

GnuPlot GUESS

Image Viewer

Radial Tree/Graph (prefuse alpha)

Radial Tree/Graph with Annotation

(prefuse beta)

Tree View (prefuse beta)

Tree Map (prefuse beta)

Force Directed with Annotation

(prefuse beta) Fruchterman-Reingold with Annotation

(prefuse beta)

DrL (VxOrd)

Specified (prefuse beta)

Horizontal Bar Graph Circular Hierarchy

Geo Map (Circle Annotation Style) Geo Map (Colored-Region Annotation Style)

Science Map (Circle Annotation)

Scientometrics

Remove ISI Duplicate Records

Remove Rows with Multitudinous Fields

Detect Duplicate Nodes

Update Network by Merging Nodes

Extract Directed Network

Extract Paper Citation Network Extract Author Paper Network

Extract Co-Occurrence Network

Extract Word Co-Occurrence Network

Extract Co-Author Network

Extract Reference Co-Occurrence

(Bibliographic Coupling) Network

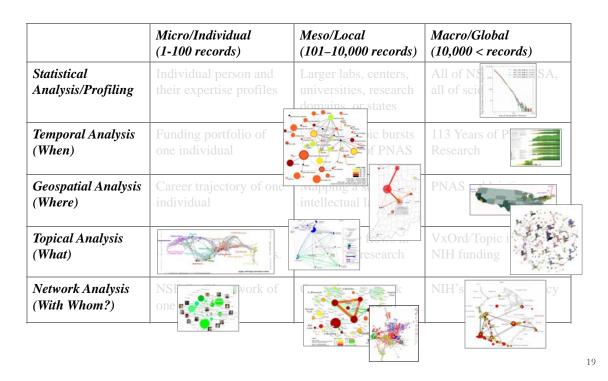
Extract Document Co-Citation Network

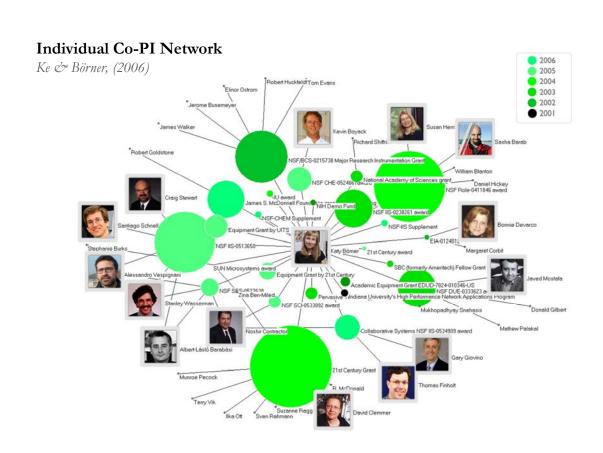
Soon:

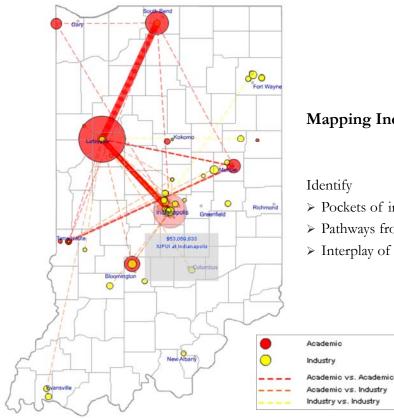
Database support for ISI and NSF data.



Type of Analysis vs. Level of Analysis







Mapping Indiana's Intellectual Space

- > Pockets of innovation
- > Pathways from ideas to products
- > Interplay of industry and academia

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Mapping Topic Bursts CLONING RNA e expression regulation Co-word space of molecular weight the top 50 highly inhibition 96' frequent and bursty cultured polymerase chain reaction transfection words used in the activation sequence homology top 10% most EXPRESSION. models highly cited PNAS 92' & 94' comparative study induction nucleic acid hybridization publications in signal transduction CELL LINE 90' antibodies 1982-2001. GENES 2000' tumor cells structural inbred strains plasmids Mane & Börner. (2004) 99 MOLECULAR SEQUENCE DATA PNAS, 101(Suppl. 1): mutagenesis *5287-5290*. nucleic acid apoptosis growth-factor 95 Color Code base sequence 82 - 85 86 - 89 90 - 93 94 - 97 mino acid amino acid seguence n circle size ~ burst weight cicle color ~ burst onset ring color ~ year of max word count years of 2nd and 3rd burst are given in color 22 sequence gene expression

Spatio-Temporal Information Production and Consumption of Major U.S. **Research Institutions** Börner, Katy, Penumarthy, Shashikant, Meiss, Mark and Ke, Weimao. (2006) Mapping the Diffusion of Scholarly Knowledge Among Major U.S. Research Institutions. Scientometrics. 68(3), pp. 415-426 Research questions: Stanford U Does space still matter in the Internet age? 2. Does one still have to study and work at major research 0 1.772 - 2.097 0 2,098 - 2,529 institutions in order to have access to 9 2.530 - 3.039 high quality data and expertise and to produce high 10,000 quality research? og of number of institutions citing each other 1982-1986: 1.94 (R2=91.5%) 3. Does the Internet lead to more global citation 1987-1991: 2.11 (R2=93.5%) 1992-1996: 2.01 (R2=90.8%) patterns, i.e., more citation links between papers 1997-2001: 2.01 (R2=90.7% 1000 produced at geographically distant research instructions? **Contributions:** 100 Answer to Qs 1 + 2 is YES. Answer to Qs 3 is NO. 10 Novel approach to analyzing the dual role of institutions as information producers and

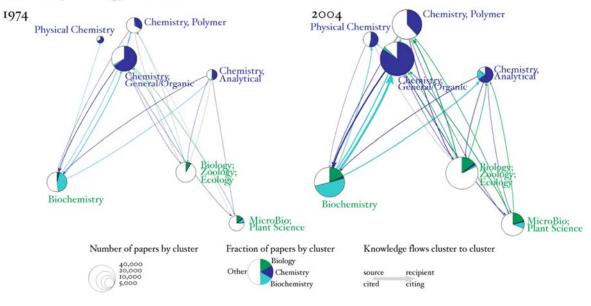
Topical Composition and Knowledge Flow Patterns in Chemistry Research for 1974 and 2004

Kevin W. Boyack, Katy Börner, & Richard Klavans (2007)

consumers and to study and visualize the diffusion

Chemistry - Biology Interface

of information among them.



log of geographic distance

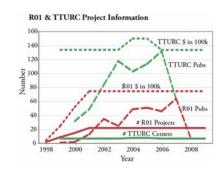
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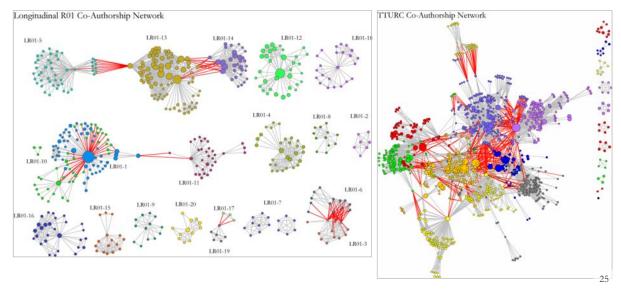
Mapping Transdisciplinary Tobacco Use Research Centers Publications

Compare R01 investigator based funding with TTURC Center awards in terms of number of publications and evolving co-author networks.

Zoss & Börner, forthcoming.

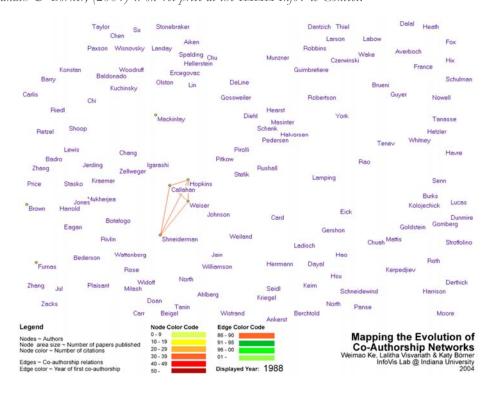
Supported by NIH/NCI Contract HHSN261200800812





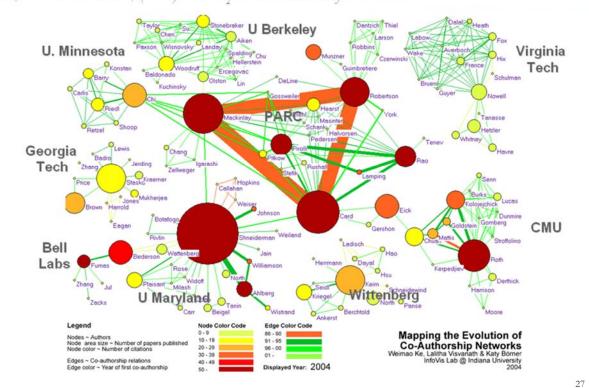
Mapping the Evolution of Co-Authorship Networks

Ke, Visvanath & Börner, (2004) Won 1st price at the IEEE InfoVis Contest.



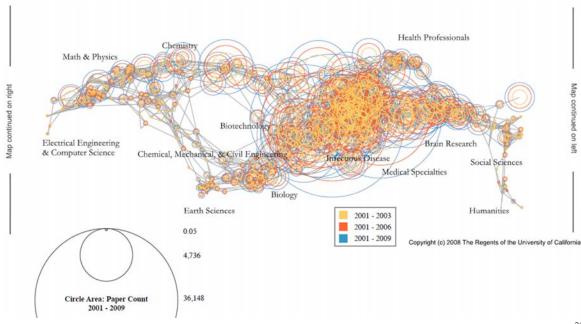
Mapping the Evolution of Co-Authorship Networks

Ke, Visuanath & Börner, (2004) Won 1st price at the IEEE InfoVis Contest.



MEDLINE Publication Output by The National Institutes of Health (NIH) Using Nine Years of ExPORTER Data

Katy Börner, Nianli Ma, Joseph R. Biberstine, Cyberinfrastructure for Network Science Center, SLIS, Indiana University, Robin M. Wagner, Rediet Berhane, Hong Jiang, Susan E. Ivey, Katrina Pearson and Carl McCabe, Reporting Branch, Division of Information Services, Office of Research Information Systems, Office of Extramural Research, Office of the Director, National Institutes of Health (NIH), Bethesda, MD.



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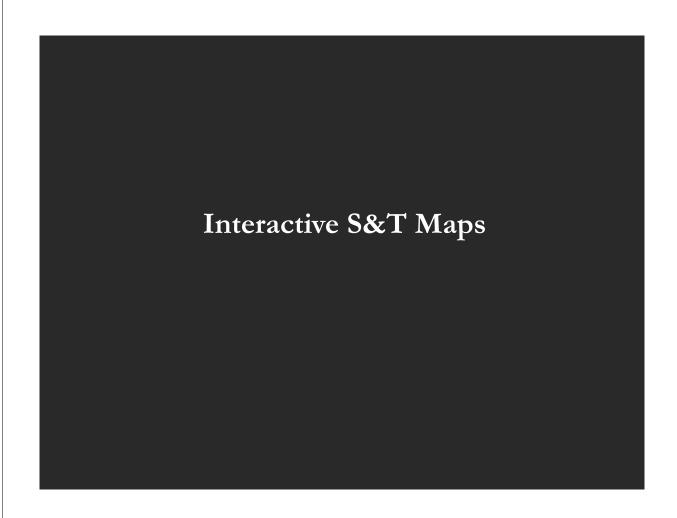


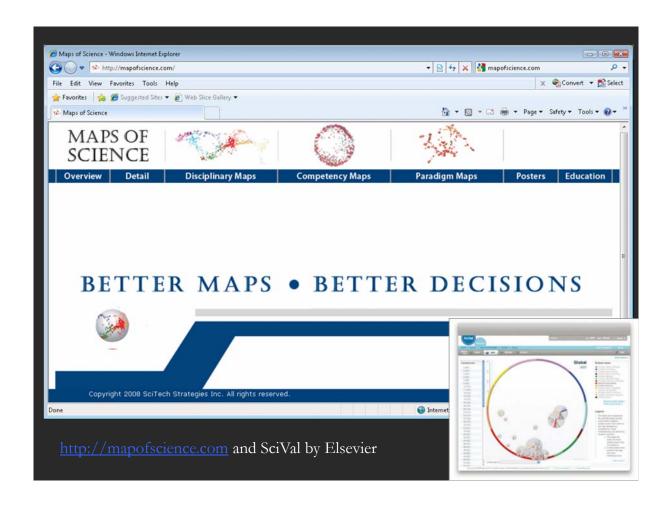
OSGi/CIShell Adoption

A number of other projects recently adopted OSGi and/or CIShell:

- Cytoscape (http://cytoscape.org) Led by Trey Ideker at the University of California, San Diegois an open source bioinformatics software platform for visualizing molecular interaction networks and integrating these interactions with gene expression profiles and other state data (Shannon et al., 2002).
- Taverna Workbench (http://taverna.org.uk) Developed by the myGrid team (http://mygrid.org.uk) led by Carol Goble at the University of Manchester, U.K. is a free software tool for designing and executing workflows (Hull et al., 2006). Taverna allows users to integrate many different software tools, including over 30,000 web services.
- MAEviz (https://wiki.ncsa.uiuc.edu/display/MAE/Home) Managed by Jong Lee at NCSA is an open-source, extensible software platform which supports seismic risk assessment based on the Mid-America Earthquake (MAE) Center research.
- TEXTrend (http://textrend.org) Led by George Kampis at Eötvös Loránd University, Budapest, Hungary supports natural language processing (NLP), classification/mining, and graph algorithms for the analysis of business and governmental text corpuses with an inherently temporal component.
- DynaNets (<u>http://www.dynanets.org</u>) Coordinated by Peter M.A. Sloot at the University of Amsterdam, The Netherlands develops algorithms to study evolving networks.

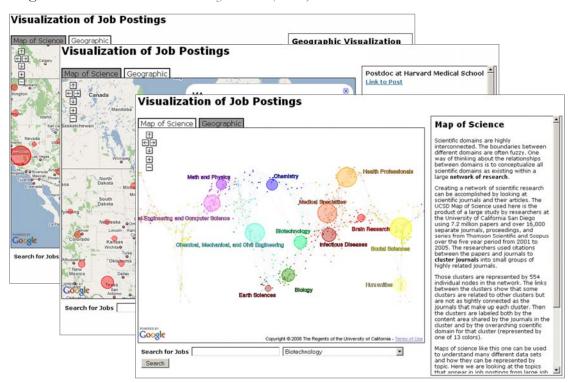
As the functionality of OSGi-based software frameworks improves and the number and diversity of dataset and algorithm plugins increases, the capabilities of custom tools will expand.

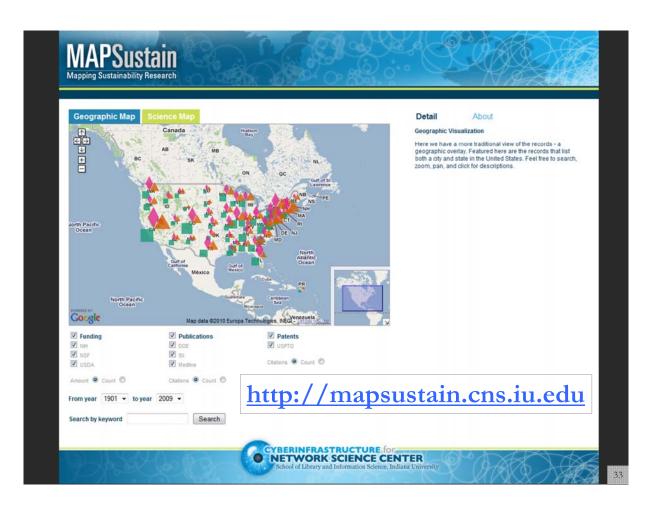


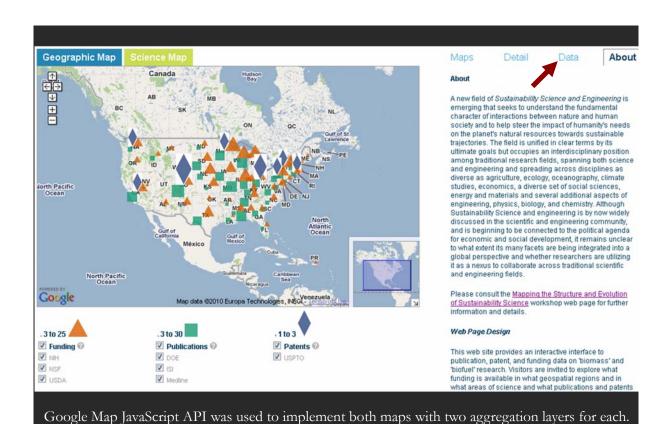


Interactive World and Science Map of S&T Jobs

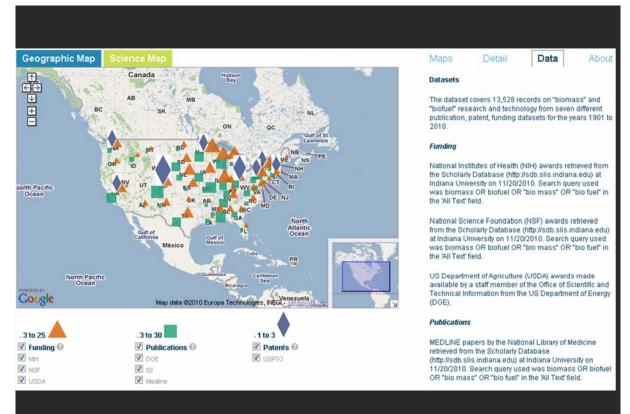
Angela Zoss, Michael Connover, Katy Börner (2010)





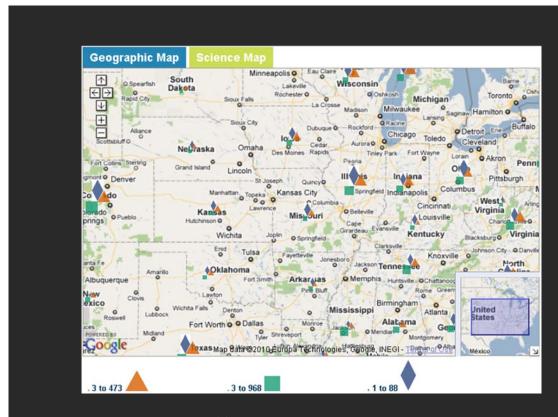


The geographic map aggregates to the **state level** and the **city level**. The science map has a high level of aggregation of 13 top-level scientific **disciplines** and a low level of 554 **sub-disciplines**.



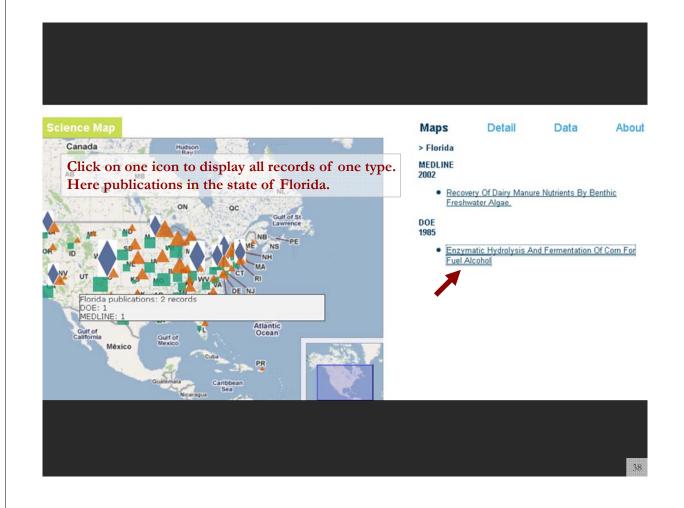
The geographic map at state level.

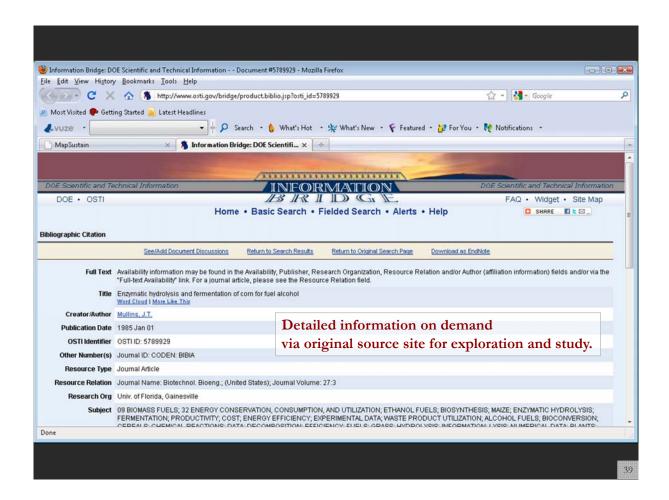


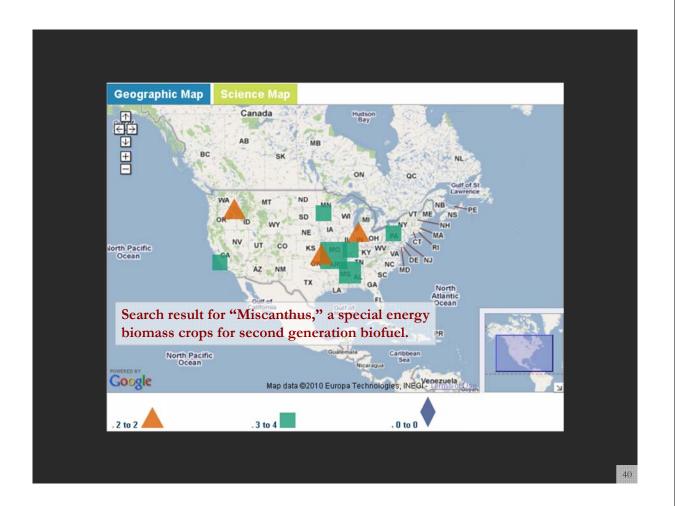


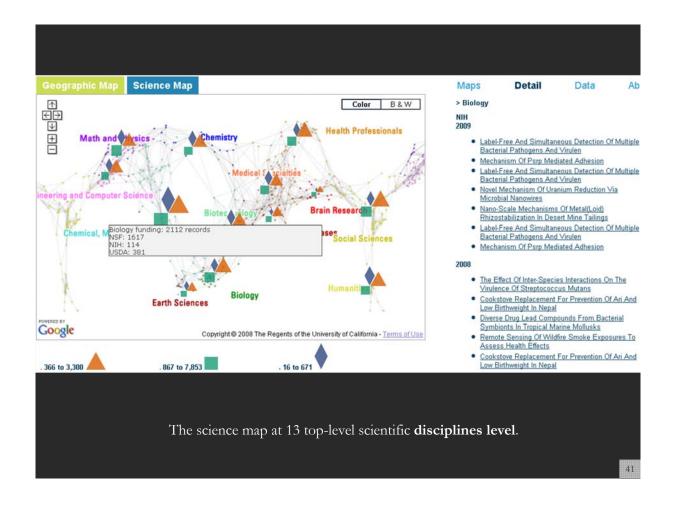
The geographic map at city level.

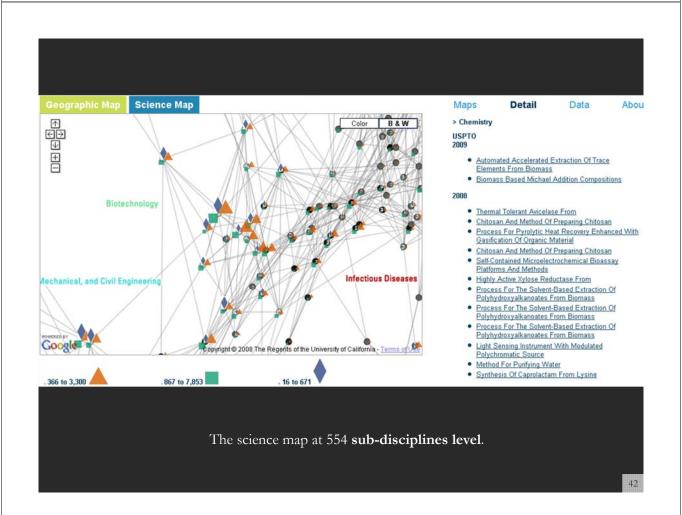


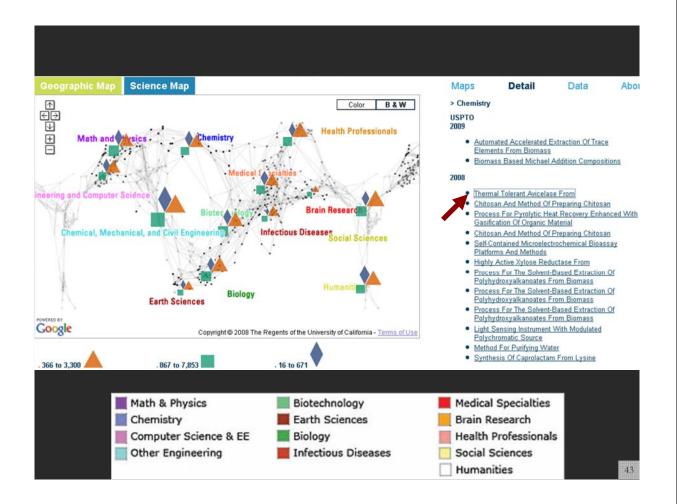


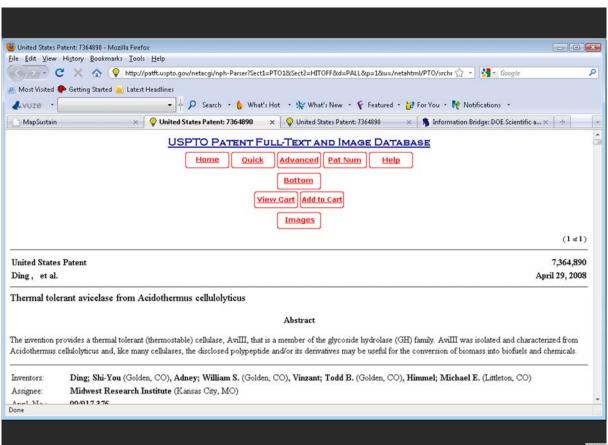




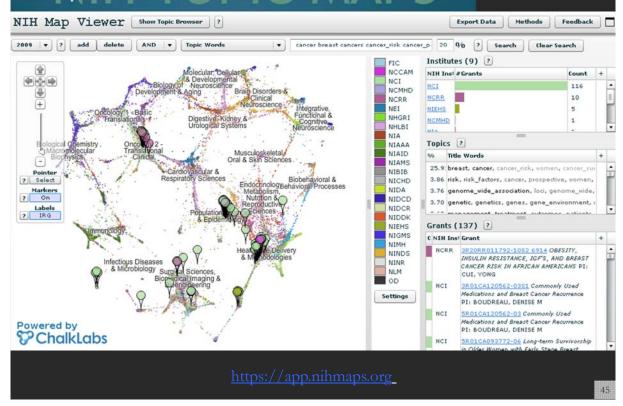


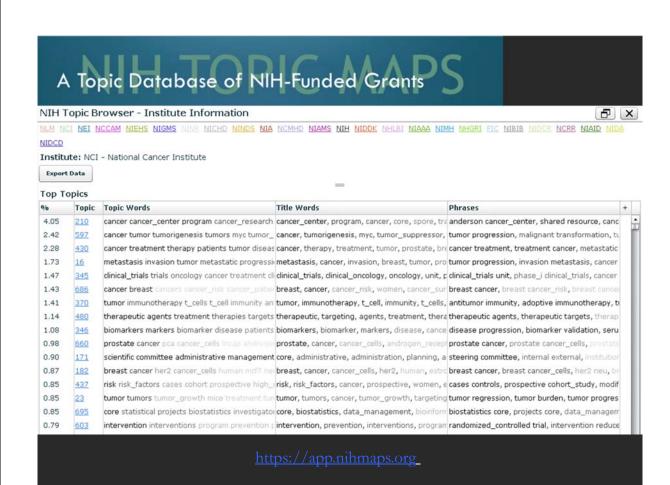




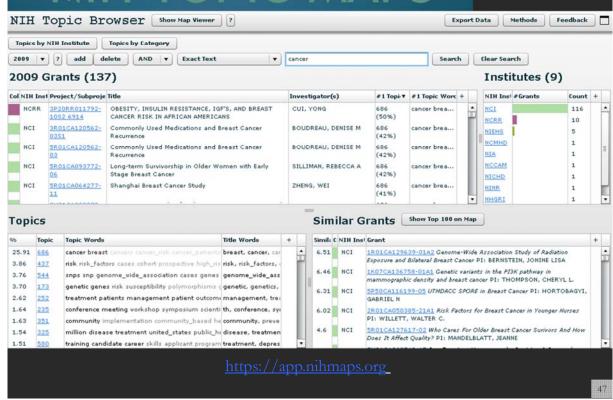


A Topic Database of NIH-Funded Grants



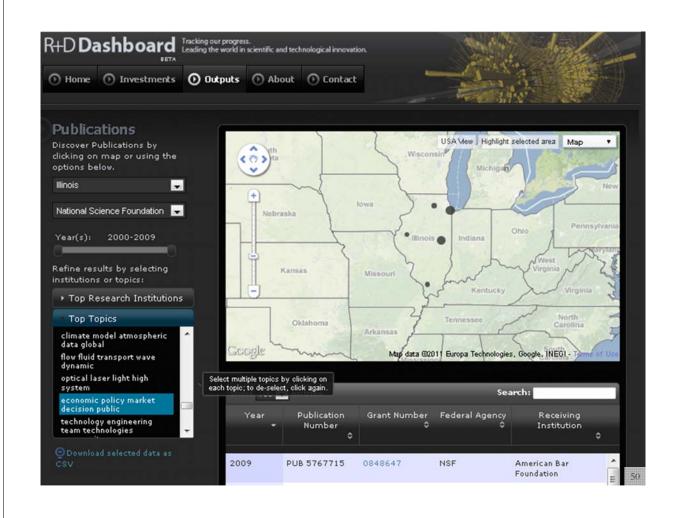


A Topic Database of NIH-Funded Grants



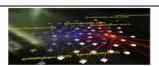


A Topic Database of NIH-Funded Grants NIH Map Viewer Show Topic Browser ? Export Data Methods Feedback 2009 | v | ? | add | delete | AND | v | Related Grants 7960745 Top 100 ▼ Search Clear Search Institutes (3) 2 NCCAM NIH Inst #Grants NCI NCMHD NCRR NCRR + NEI NCMHD NHGRI NHLBI NIA NIAAA Topics 2 % Title Words NIAID NIAMS 14.72 breast, cancer, cancer_risk, women, cancer_su NIBIB Pointe 11.05 breast, mammography, mammographic, cance ? Select NICHD NIDA Markers ? On 9.60 risk, risk_factors, cancer, prospective, women, NIDCD 3.23 genome_wide_association, loci, genome_wide, Labels ? IRG NIDCR NIDDK Grants (101) 2 NIEHS NIGMS C NIH Inst Grant NIMH NCRR 3P20RR011792-1052 6914 OBESITY, INSULIN RESISTANCE, IGF'S, AND BREAST NINDS NINR CANCER RISK IN AFRICAN AMERICANS PI: CUI, YONG NLM OD 3R01CA120562-03S1 Commonly Used Medications and Breast Cancer Recurrence Settings PI: BOUDREAU, DENISE M 5R01CA120562-03 Commonly Used Powered by ChalkLabs Medications and Breast Cancer Recurrence PI: BOUDREAU, DENISE M 5R01CA093772-06 Long-term Survivorship https://app.nihmaps.org



S&T Studies Using Semantic Web Data

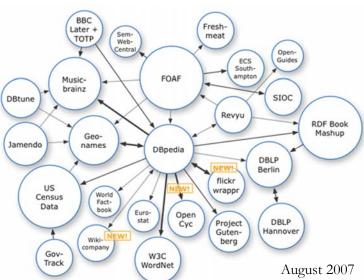
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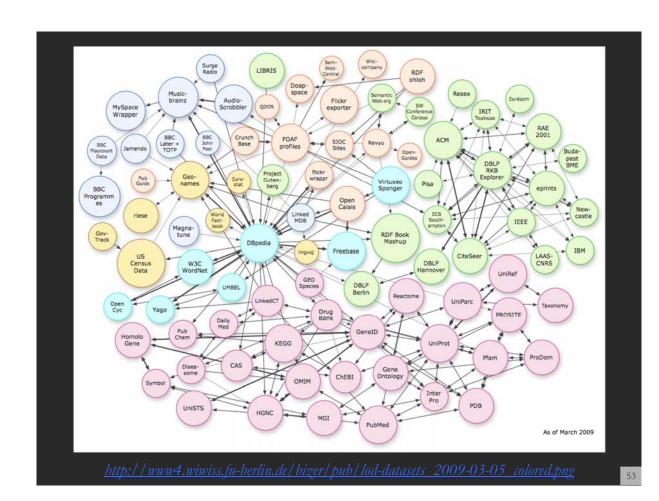


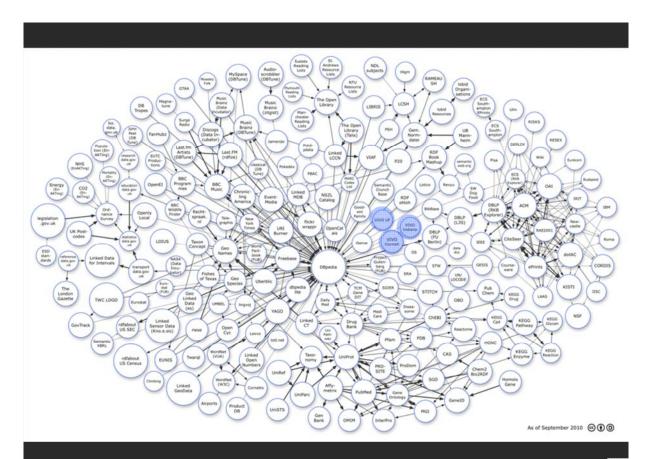
Linked Open Data

- > Interlinking existing data silos and
- Exposing them as <u>structured data</u>
- Adding new high quality data relevant for S&T studies

http://linkeddata.org



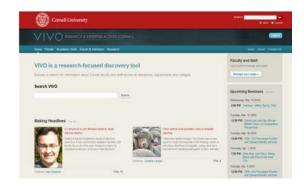






VIVO: A Semantic Approach to Creating a National Network of Researchers (http://vivoweb.org)

- Semantic web application and ontology editor originally developed at Cornell U.
- Integrates research and scholarship info from systems of record across institution(s).
- Facilitates research discovery and crossdisciplinary collaboration.
- Simplify reporting tasks, e.g., generate biosketch, department report.



Funded by \$12 million NIH award.

Cornell University: Dean Krafft (Cornell PI), Manolo Bevia, Jim Blake, Nick Cappadona, Brian Caruso, Jon Corson-Rikert, Elly Cramer, Medha Devare, John Fereira, Brian Lowe, Stella Mitchell, Holly Mistlebauer, Anup Sawant, Christopher Westling, Rebecca Younes. University of Florida: Mike Conlon (VIVO and UF PI), Cecilia Botero, Kerry Britt, Erin Brooks, Amy Buhler, Ellie Bushhousen, Chris Case, Valrie Davis, Nita Ferree, Chris Haines, Rae Jesano, Margeaux Johnson, Sara Kreinest, Yang Li, Paula Markes, Sara Russell Gonzalez, Alexander Rockwell, Nancy Schaefer, Michele R. Tennant, George Hack, Chris Barnes, Narayan Raum, Brenda Stevens, Alicia Turner, Stephen Williams. Indiana University: Katy Borner (IU PI), William Barnett, Shanshan Chen, Ying Ding, Russell Duhon, Jon Dunn, Micah Linnemeier, Nianli Ma, Robert McDonald, Barbara Ann O'Leary, Mark Price, Yuyin Sun, Alan Walsh, Brian Wheeler, Angela Zoss. Ponce School of Medicine: Richard Noel (Ponce PI), Ricardo Espada, Damaris Torres. The Scripps Research Institute: Gerald Joyce (Scripps PI), Greg Dunlap, Catherine Dunn, Brant Kelley, Paula King, Angela Murrell, Barbara Noble, Cary Thomas, Michaeleen Trimarchi. Washington University, St. Louis: Rakesh Nagarajan (WUSTL PI), Kristi L. Holmes, Sunita B. Koul, Leslie D. McIntosh. Weill Cornell Medical College: Curtis Cole (Weill PI), Paul Albert, Victor Brodsky, Adam Cheriff, Oscar Cruz, Dan Dickinson, Chris Huang, Itay Klaz, Peter Michelini, Grace Migliorisi, John Ruffing, Jason Specland, Tru Tran, Jesse Turner, Vinay Varughese.

VIVO ENABLING NATIONAL NETWORKING OF SCIENTISTS









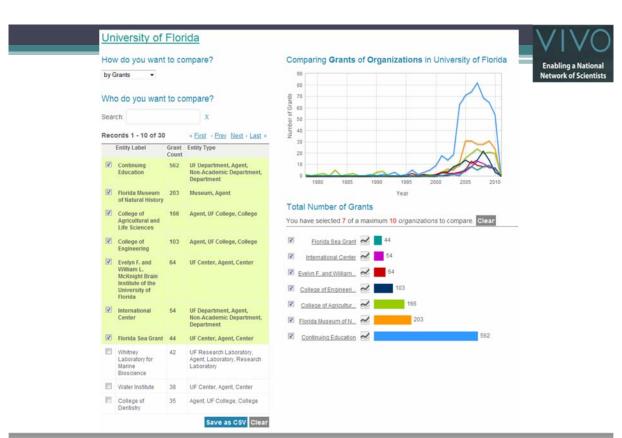




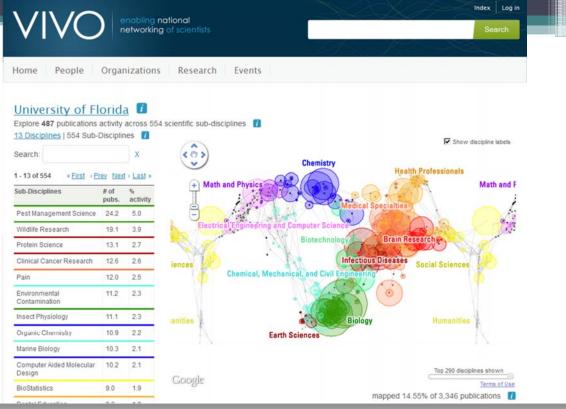
Type of Analysis vs. Level of Analysis

	Micro/Individual (1-100 records)	Meso/Local (101–10,000 records)	Macro/Global (10,000 < records)
Statistical Analysis/Profiling	Individual person and their expertise profiles	Larger labs, centers, universities, research domains or states	All of NS
Temporal Analysis (When)	Funding portfolio of one individual	ic bursts of PNAS	113 Years of PResearch
Geospatial Analysis (Where)	Career trajectory of one individual	intellectual la	PNAS
Topical Analysis (What)		research	VxOrd/Topic r NIH funding
Network Analysis (With Whom?)	NSI work of one	The second secon	NIH's cy
		The second secon	

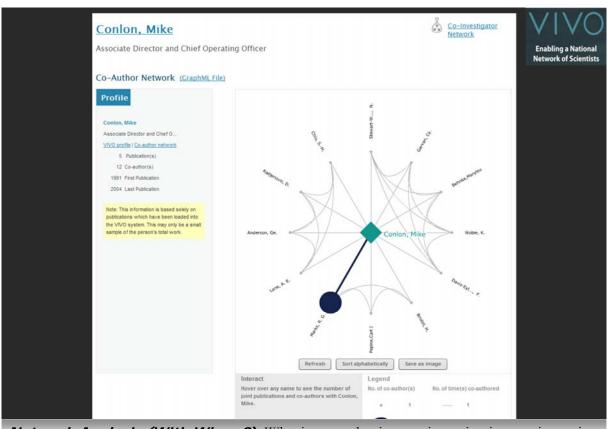
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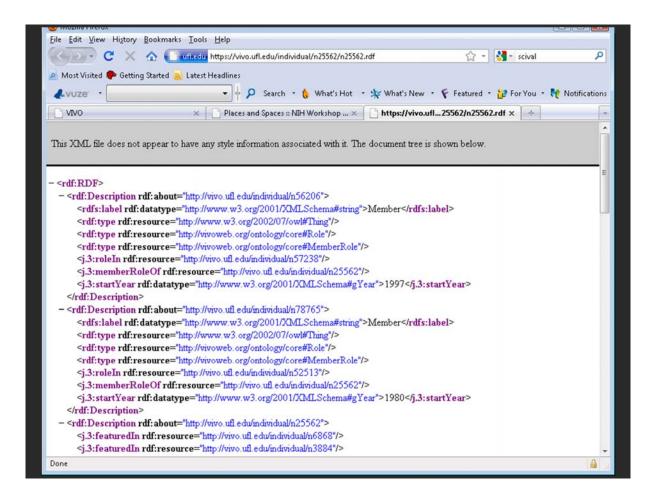
Temporal Analysis (When) Temporal visualizations of the number of papers/funding award at the institution, school, department, and people level

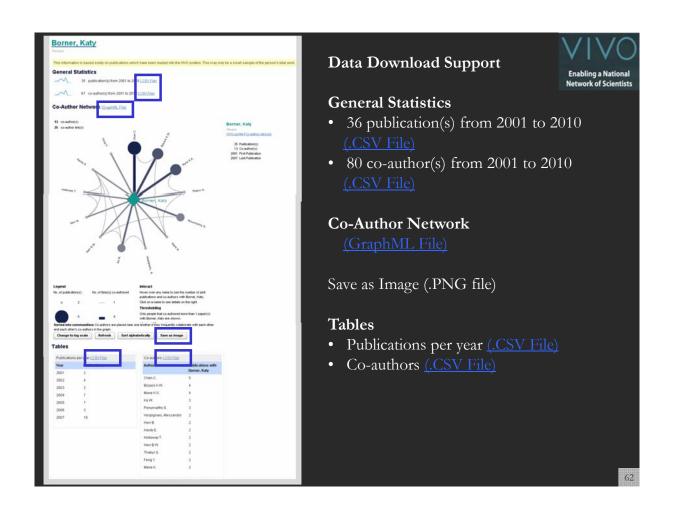


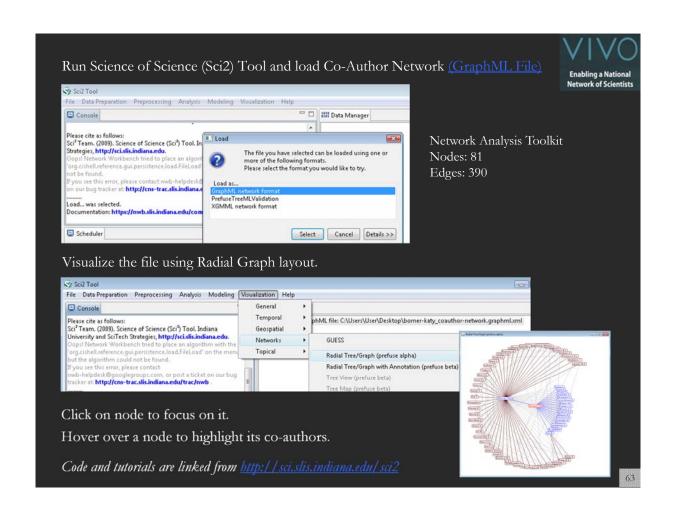
Topical Analysis (What) Science map overlays will show where a person, department, or university publishes most in the world of science. (in work)

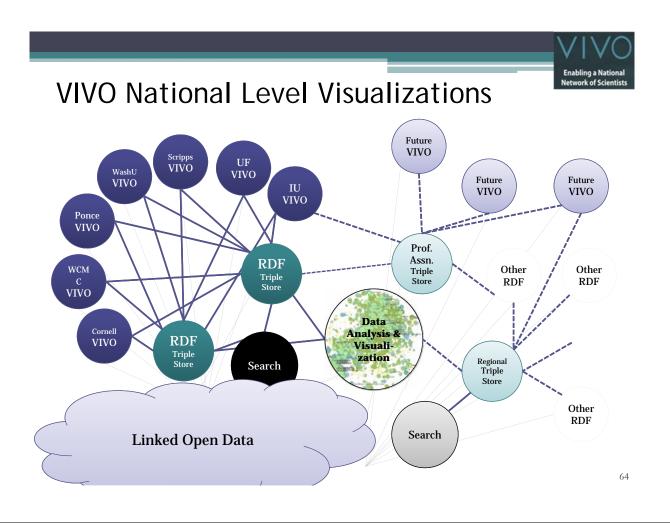


Network Analysis (With Whom?) Who is co-authoring, co-investigating, co-inventing with whom? What teams are most productive in what projects?













Second Annual VIVO Conference

August 24-26, 2011

Gaylord National, Washington D.C.

http://vivoweb.org/conference



References

Börner, Katy, Chen, Chaomei, and Boyack, Kevin. (2003). **Visualizing Knowledge Domains.** In Blaise Cronin (Ed.), *ARIST*, Medford, NJ: Information Today, Volume 37, Chapter 5, pp. 179-255.

http://ivl.slis.indiana.edu/km/pub/2003-borner-arist.pdf

Shiffrin, Richard M. and Börner, Katy (Eds.) (2004). **Mapping Knowledge Domains**. Proceedings of the National Academy of Sciences of the United States of America, 101(Suppl_1).

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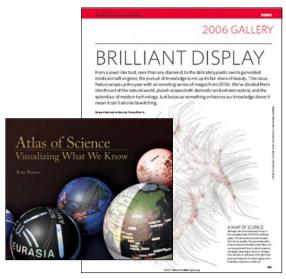
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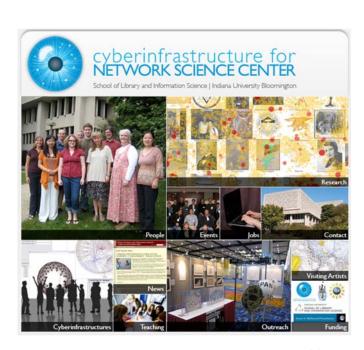
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