Science Maps: How to Analyze, Map, and Make Sense of Science

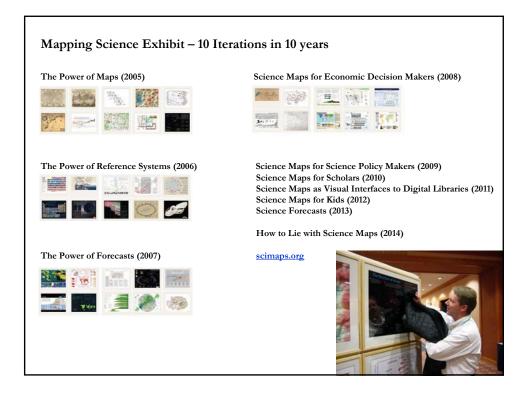


Dr. Katy Börner Cyberinfrastructure for Network Science Center, Director Information Visualization Laboratory, Director School of Library and Information Science Indiana University, Bloomington, IN <u>katy@indiana.edu</u>

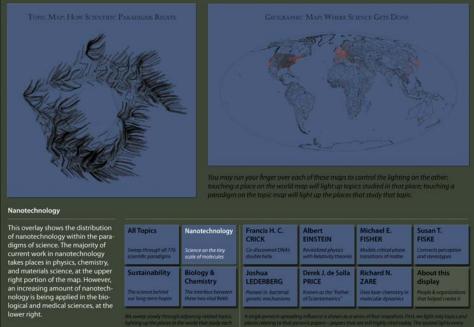


National Research Council, Ottawa, Canada 10:00am, July 7th, 2008

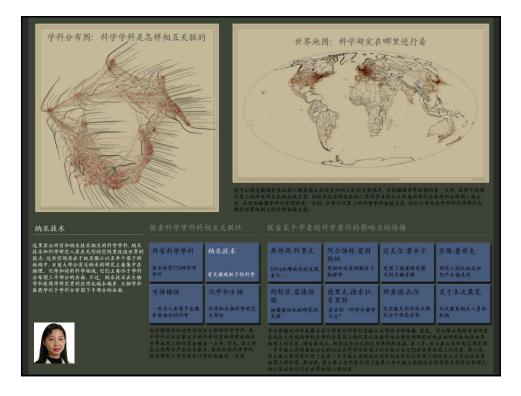


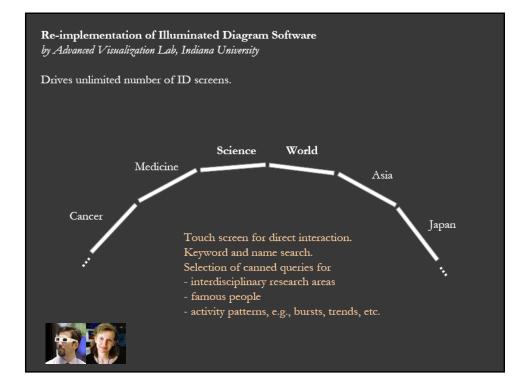




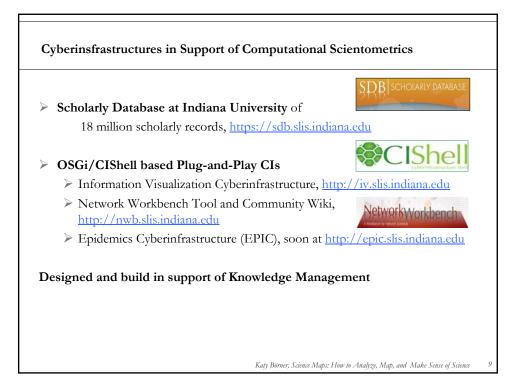


pics hrough all 776 c paradigms	Nanotechnology Science on the tiny scale of molecules	Francis H. C. CRICK Co-discovered DNA's double helia	Albert EINSTEIN Revitalized physics with Relativity theories	Michael E. FISHER Models critical phase transitions of matter	Susan T. FISKE Connects perc and stereotyp	
inability nce behind p-term hopes	Biology & Chemistry The interface between these two wital fields	Joshua LEDERBERG Pioneer in bacterial genetic mechanisms	Derek J. de Solla PRICE Known as the "Father of Scientometrics"	Richard N. ZARE Uses loser chemistry in molecular dynamics	About thi display People & orgathat helped or	
p the places in t may select a su	adjoining related topics, he world that study each liset of the topics that deal ig subjects by touching it.		ing influence is shown as a s enort's papers — papers that what work. Note that this firs he third shapshot lights scien	are still highly cited today t-generation impact exten	The second light ds to far more to	

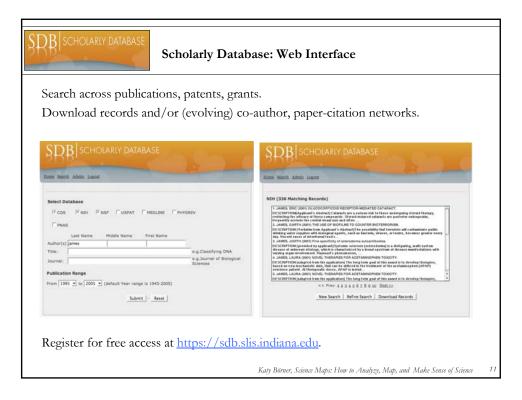


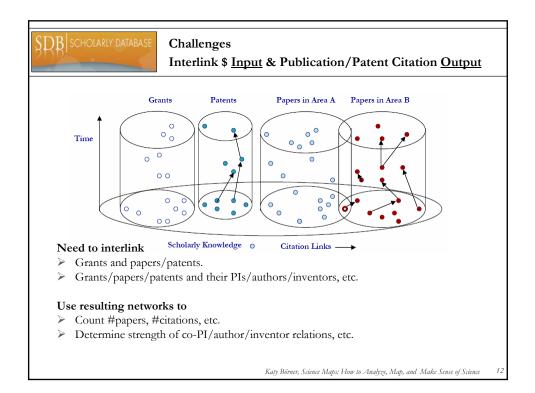


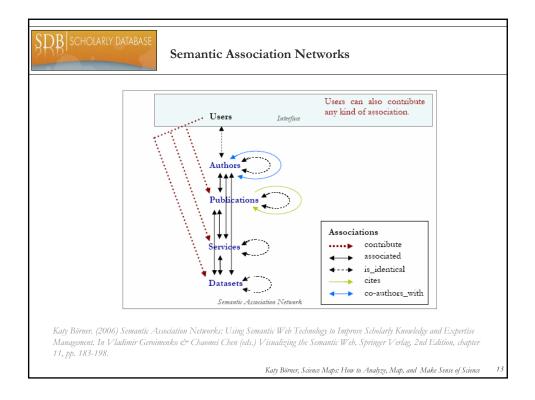
Ad	vantages for Funding Agencies
	Supports monitoring of (long-term) money flow and research developments, evaluation of funding strategies for different programs, decisions on project durations, funding patterns.
	Staff resources can be used for scientific program development, to identify areas for future development, and the stimulation of new research areas.
Ad	vantages for Researchers
	Easy access to research results, relevant funding programs and their success rates, potential collaborators, competitors, related projects/publications (research push).
\geq	More time for research and teaching.
Ad	vantages for Industry
\geq	Fast and easy access to major results, experts, etc.
	Can influence the direction of research by entering information on needed technologies (industry- pull).
Ad	vantages for Publishers
\geq	Unique interface to their data.
\geq	Publicly funded development of databases and their interlinkage.
Fo	r Society
>	Dramatically improved access to scientific knowledge and expertise.

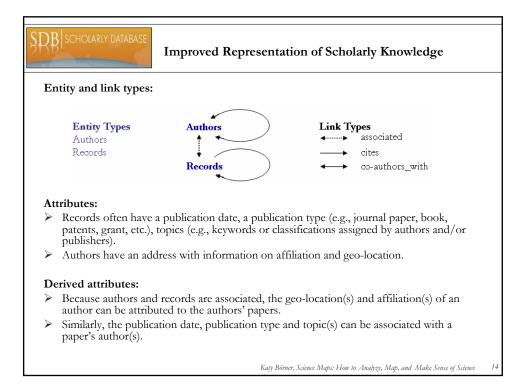


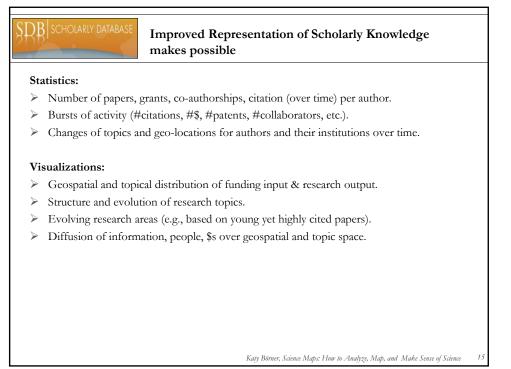






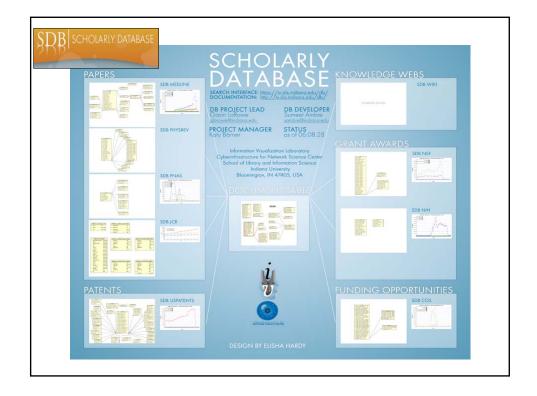


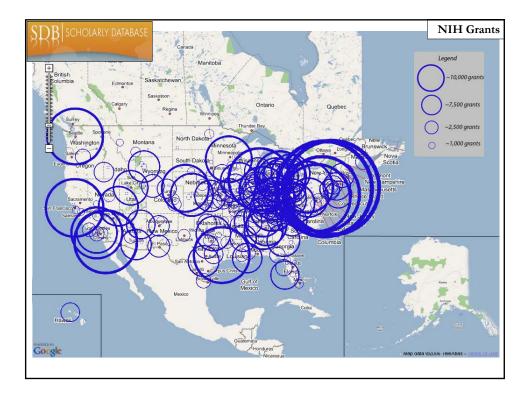


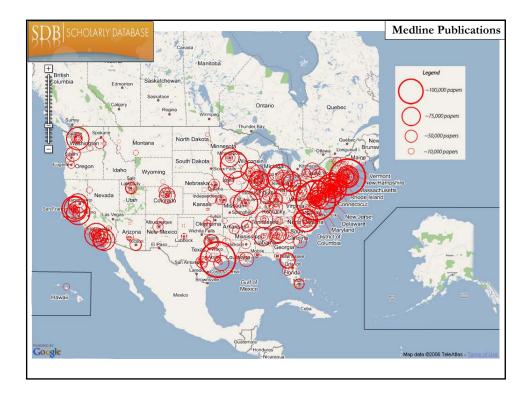


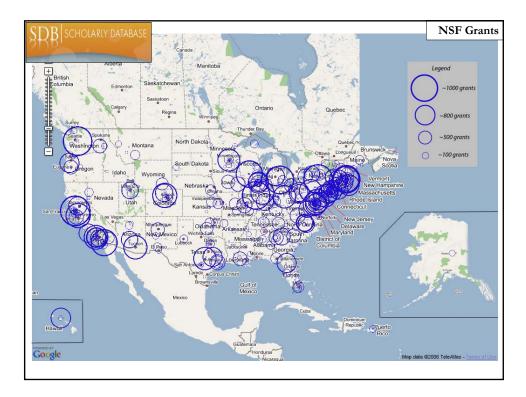
-	Sch	olarly Database: # Rec	Joius & Tean	s covered
) atasets av	vailable via the So	cholarly Database (* futt	ure feature)	
	# Records	, , , , , , , , , , , , , , , , , , , ,	,	Destaisted
Dataset	# Kecorus	Years Covered	Updated	Restricted Access
Medline	13,149,741	1965-2005	Yes	
PhysRev	398,005	1893-2006		Yes
PNAS	16,167	1997-2002		Yes
JCR	59,078	1974, 1979, 1984, 1989 1994-2004		Yes
USPTO	3,179,930	1976-2004	Yes	
NSF	174,835	1985-2003	Yes*	
NIH	1,043,804	1972-2002	Yes*	
Total	18,021,560	1893-2006	4	3

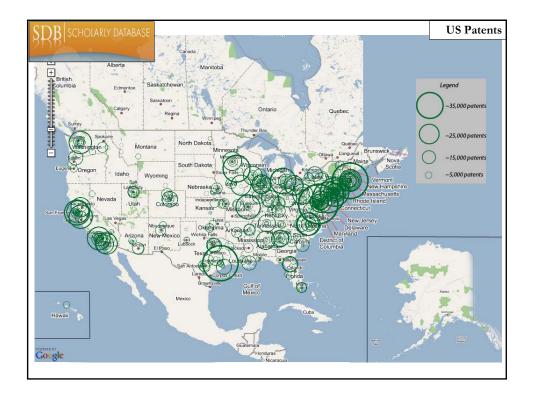
Katy Börner, Science Maps: How to Analyze, Map, and Make Sense of Science 10

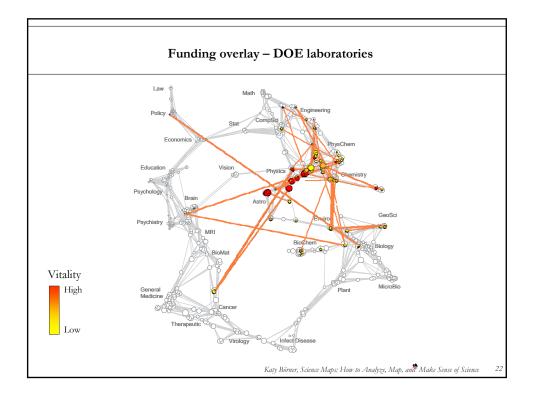


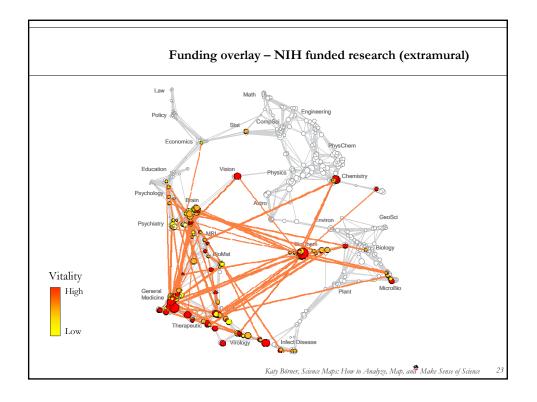


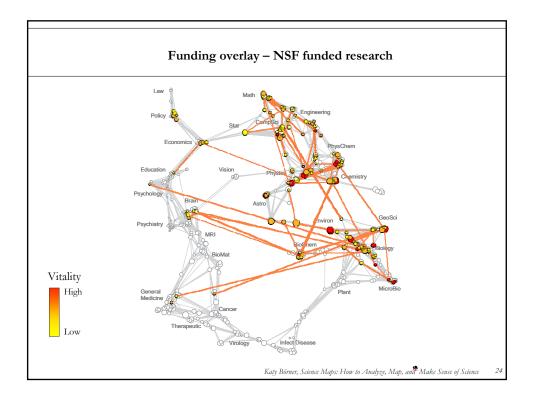


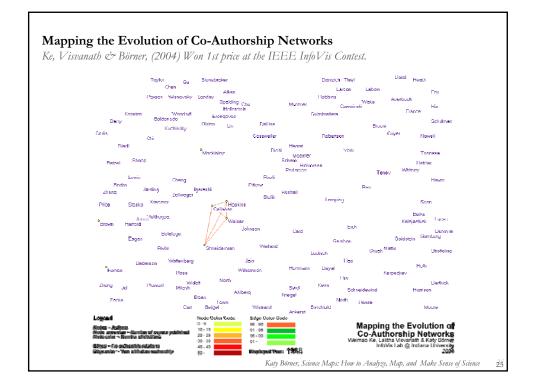


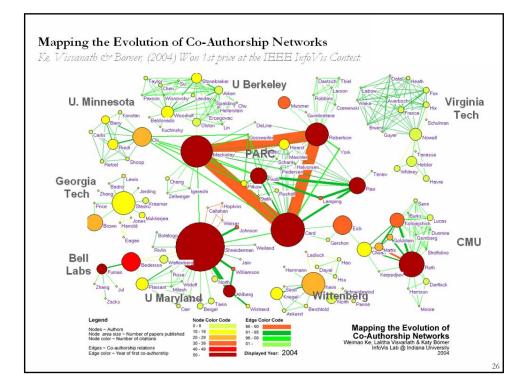




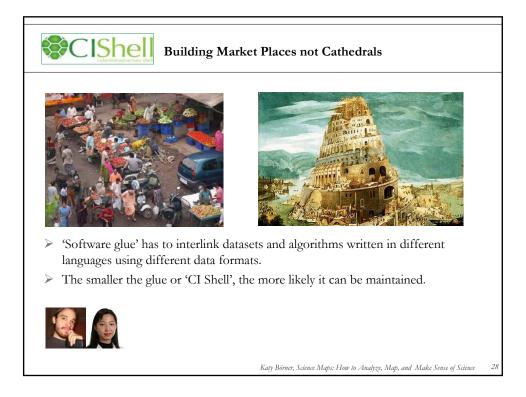


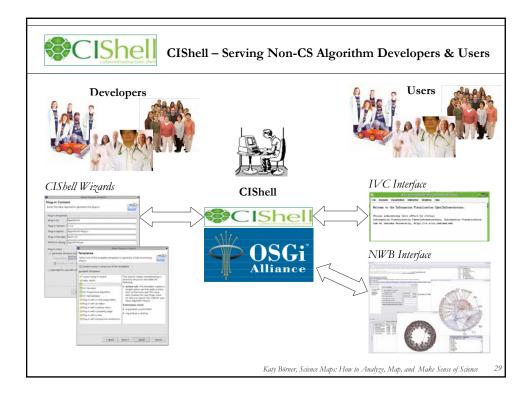


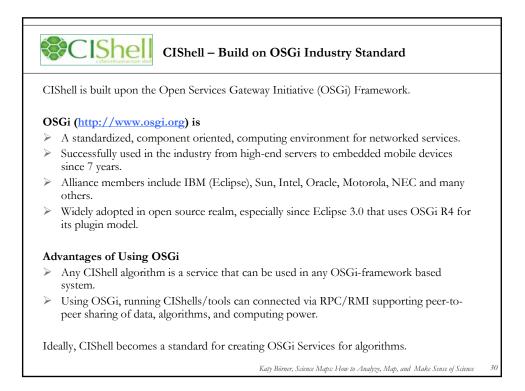




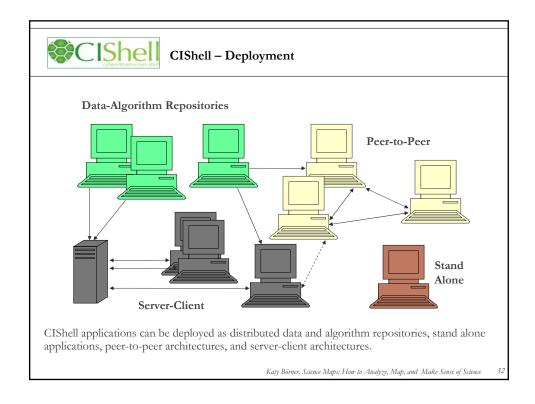
DSGi/CIShell based Plug-and-Play CIs See also Herr, Bruce W., Huang, Weixia, Penumarthy, Shashikant, Börner, Katy . (2007) Designing Highly Flexible and Usable Cyberinfrastructures for Convergence. In William S. Bainbridge and Mihail C. Roco (Eds.) Progress in Convergence – Technologies for Human Wellbeing. Annals of the New York Academy of Sciences, Boston, MA, volume 1093, pp. 161-179.

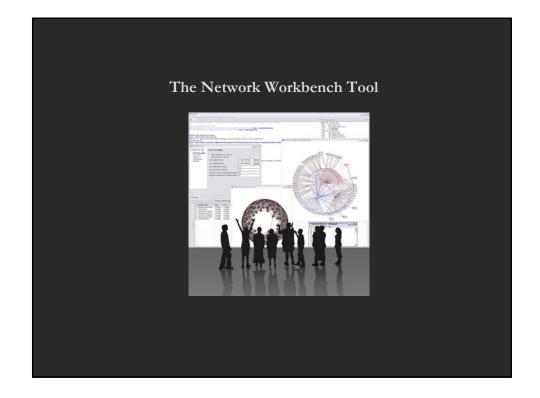








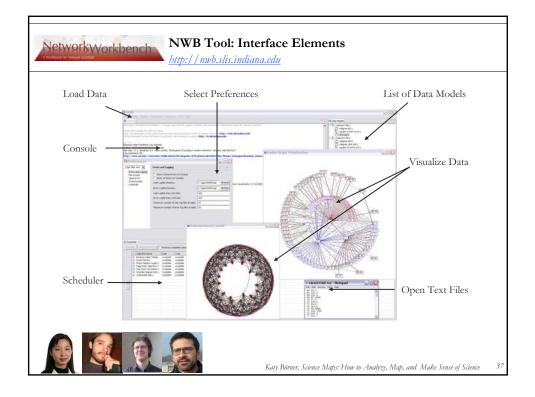


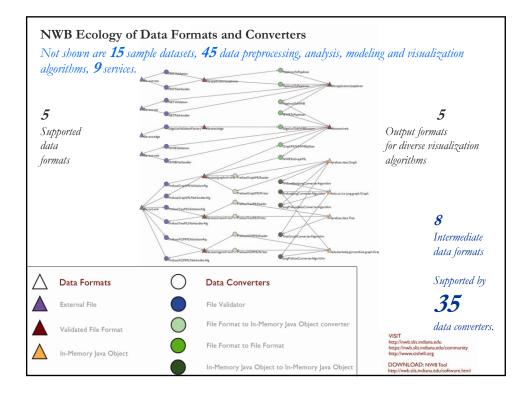


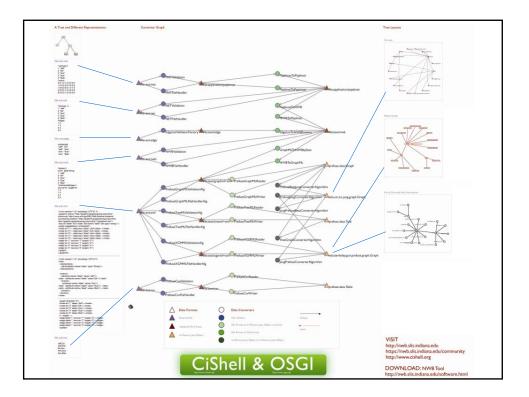
Investigators:	Katy Börner, Albert-Laszlo Barabasi, Santiago Schnell,
	Alessandro Vespignani & Stanley Wasserman, Eric Wernert
Software Team:	Lead: Weixia (Bonnie) Huang
	Developers: Bruce Herr, Ben Markines, Santo Fortunato, Cesar Hidalgo, Ramya Sabbineni, Vivek S. Thakre, & Russell Duhon
Goal:	Develop a large-scale network analysis, modeling and visualization toolkit for biomedical, social science and physics research.
Amount:	\$1,120,926 NSF IIS-0513650 award.
Duration:	Sept. 2005 - Aug. 2008
Website:	http://nwb.slis.indiana.edu

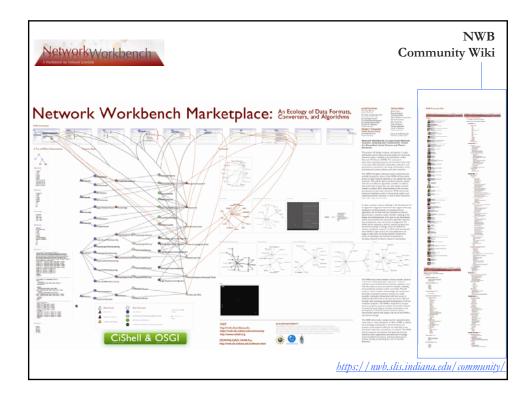


Cyberglue:	
 CIShell 	Core programmer team lead by Bonnie Huang
Tools & Services:	
NWB Tool	Lead by Alex Vespignani with input from other PIs
SciMaps Service	Lead by Katy Borner
> Bio Tool	Lead by Laszlo Barabasi & Santiago Schnell
All three are prototypica implementations.	l instantiations of CIShell serving as reference
Documentation/Regis	stry/Market Place:

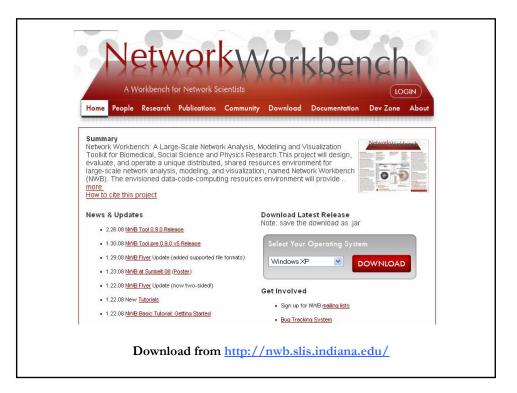


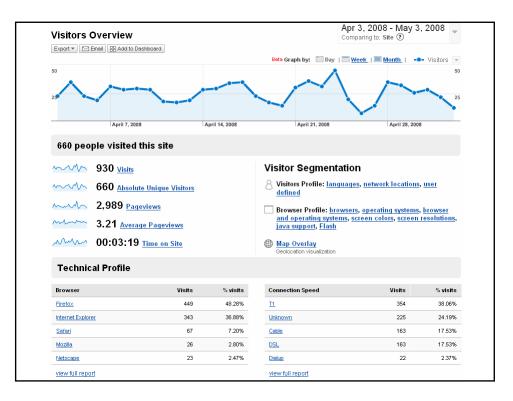




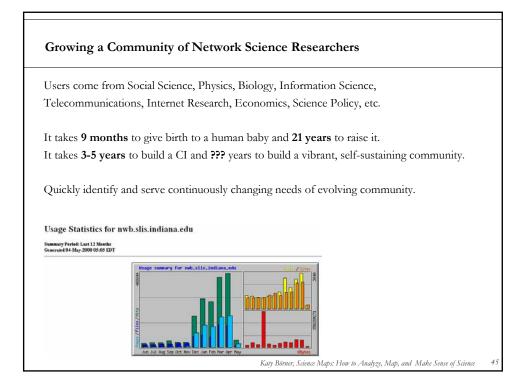












		1 3300		Total NWB Tool URLs Tracked – Last 30 days
5	599 0.13%	20532984	28.71%	/nightly/0.9.0.200802261543NGT/installers/nwb-installer-0.9.0-win32.win32.jar
6	518 0.11%	1656		/svn/nwb/tags/pre-v1.0.0/plugins/visualization/edu.iu.nwb.visualization.prefuse.beta/src/edu/iu/nwb/visualization/prefuse/bet
7	398 0.08%	124934	0.17%	/Docs/NWB Getting Started.pdf
8	377 0.08%	847		/svn/nwb/tags/v0.6.0/plugins/visualization/edu.iu.nwb.visualization.prefuse.beta/src/edu/iu/nwb/visualization/prefuse/beta/co
9	341 0.07%	1467		/svn/nwb/tags/v0.6.0/plugins/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/src/edu/iu/nwb/visualization/src/edu/iu/nwb/
10	337 0.07%	1629		/svn/nwb/tags/pre-v1.0.0/plugins/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/edu.iu.nwb.visualization
11	336 0.07%	590		/svn/nwb/tags/v0.4.0/plugins/visualization/edu.iu.nwb.visualization.prefuse.beta/src/edu/iu/nwb/visualization/prefuse/beta/column/seture
12	332 0.07%			/doc.html
13	327 0.07%	1763	0.00%	/download.html
14	315 0.07%	1468		/svn/nwb/tags/v0.7.0/plugins/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/pre
15	306 0.07%	1222		/svn/nwb/tags/v0.5.0/plugins/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/pre
16	300 0.06%	1225		/svn/nwb/tags/v0.9.0/plugins/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/pre
17	299 0.06%	1389		/svn/nwb/tags/v0.4.0/plugins/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/pre
18	296 0.06%			/papers/arist02.pdf
19	293 0.06%	1341		/svn/nwb/tags/v0.3.0/plugins/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/pre
20	286 0.06%		1.31%	/downloads/nwbflyer.pdf
21	285 0.06%	1171		/svn/nwb/tags/v0.8.0/plugins/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/pre
22	284 0.06%	1057		/svn/nwb/trunk/plugins/visualization/edu.iu.nwb.visualization.prefuse.alpha.smallworld/src/edu/iu/nwb/visualization/prefuse/e
23	274 0.06%	614		/svn/nwb/tags/v0.9.0/plugins/visualization/edu.iu.nwb.visualization.prefuse.beta/src/edu/iu/nwb/visualization/prefuse/beta/co
24	268 0.06%			/Docs/NWB VisualizingTree.pdf
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26	250 0.05%	58556		/Docs/Thomson Tutorial.pdf
27	220 0.05%	89987		<u>/papers/2006-bomer-arist.pdf</u>
28	217 0.05%	83388		/papers/2007-colizza-epidmod.pdf
29	209 0.04% 203 0.04%	3602 509		/people.html /svn/nwb/tags/v0.8.0/plugins/visualization/edu.iu.nwb.visualization.prefuse.beta/src/edu/nu/nwb/visualization/prefuse/beta/co



	Analysis Edit	Visualization Edit
Algorithms Currently Available	General Purpose	Tools
	<u>Network Analysis Toolkit[?]</u>	GUESS
	Unweighted & Undirected	GnuPlot ²
Preprocessing Edit	Based on degree/	Predefined Positions Layout
Remove Nodes	Node Degree	DrL (VxOrd)
Extract Top Nodes	Node Distribution	Pre-defined Positions (prefuse beta) ²
Extract Nodes Above or Below Val	Based on clustering	Move
Delete High Degree Nodes	k-Nearest Neighbor	Circular
Delete Random Nodes	Watts Strogatz Clustering Coefficient	
Delete Isolates	Watts Strogatz Clustering Coefficient	
Remove Edges	Based on path	Radial Tree with Annotations (prefuse beta) ²
Extract Top Edges	Diameter	Tree Map
Extract Edges Above or Below Value	Average Shortest Path	Tree View
Remove Self Loops	Shortest Path Distribution	Balloon Graph (prefuse alpha) ²
Trim By Degree ²	Node Betweenness Centrality	Network Layouts
Pathfinder Network Scaling	Based on components	
Sampling	Connected Components	Force Directed with Annotation (prefuse beta)
Snowball Sampling (n nodes)	Weak Component Clustering	Kamada-Kawai (JUNG)
Node Sampling	K-Core	Fruchterman-Reingold (JUNG)
Edge Sampling	Extract K-Core ²	Fruchterman-Reingold with Annotation (prefuse bet
Transformations		Spring (JUNG)
Symmetrize	Annotate K-Coreness ²	Small World (prefuse alpha)
Dichotomize	Unweighted & Directed	Other Layouts
Multipartite Joining	Based on degree	Parallel Coordinates (demo) ²
	Node Indegree	LaNet (k-Core Decomposition)
Modeling Edit	Node Outdegree	
	Indegree Distribution	Scientometrics Edit
General	Outdegree Distribution	Extract Network From Table
Random Graph	Based on local graph structure	Extract Co-Authorship Network
Watts-Strogatz Small World	k-Nearest Neighbor	Extract Co-Occurrence Network From Table ²
Barabási-Albert Scale-Free	Single Node In-Out Degree Correlation	Extract Directed Network From Table ²
Structured	Unnamed Category?	Extract Network From Another Network
CAN	Page Rank	Extract Bibliographic Coupling Similarity Network
Chord	Based on local graph structure #2	Extract Co-Citation Similarity Network?
Unstructured	Dyad Reciprocity ²	Cleaning
Hypergrid	Arc Reciprocity?	Remove ISI Duplicate Records
PRU	Adjacency Transitivity?	Detect Duplicate Nodes
Other	Based on components	Remove Rows With Multitudinous Fields ²
TARL	Weak Component Clustering	Remote Rono Filar Halddonious Helds
Discrete Network Dynamics	Extract Attractors?	
	K-Core	
	Extract K-Core?	July 1 st , 2008

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Pages	Percent	Count		
1. Main.HomePage	8%	1608		
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4. <u>VisualizeData.Kamada-Kawaii</u>	4%	921		
5. VisualizeData.Fruchterman-Rheingold	4%	917		
6. <u>Main.NWBTool</u>	4%	877		
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.2. <u>Main.FAQ</u>	2%	329		
13. <u>VisualizeData.SprinqLayout</u>	1%	Users		
14. <u>AnalyzeData.ClusterinqCoefficientWattsStroqatz</u>	196	Users	Percent	Cou
.5. <u>VisualizeData.RadialTree</u>	196	1.0	50%	105
.6. AnalyzeData.BetweennessCentralitySiteAmpEdge	196	2. Guest (not authenticated) 45%	94
.7. <u>VisualizeData.HomePaqe</u>	196	3. mwlinnem	1%	1.
.8. <u>AnalyzeData.NodeDegree</u>	196	4. rduhon	1%	1.
.9. <u>CustomFillings.HomePage</u>	196	5. bhook	1%	1
20. CustomFillings.AnalysisOfBiologicalNetworks	196	6. bh2	0%	
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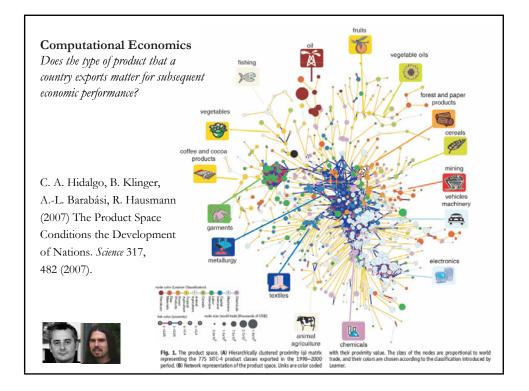


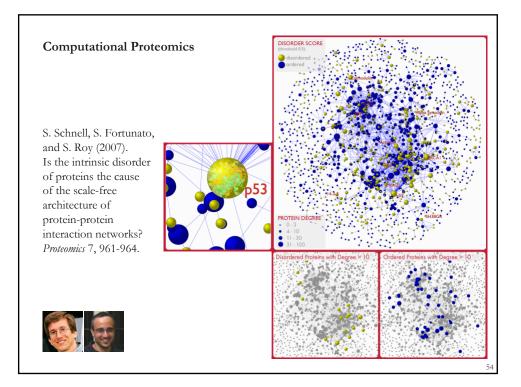
Network Workbench in Action: Embracing the Diversity of Network Science

See also

Börner, Katy, Sanyal, Soma & Vespignani, Alessandro. (2007). Network Science. In Cronin, Blaise (Eds.), Annual Review of Information Science & Technology (Vol. 41, pp. 537-607), chapter 12, Medford, NJ: Information Today, Inc./ American Society for Information Science and Technology.









Hidalgo, César A. and C. Rodriguez-Sickert. <u>Persistence, Topology and Sociodemographics</u> of a Mobile Phone Network. 2007. (Submitted to Physica A)
Hidalgo, C.A., B. Klinger, A. L. Barabási, and R. Hausmann. <u>The Product Space and its</u> <u>Consequences for Economic Growth</u> . <i>Science</i> . Vol. 317 (2007, July 27): 482-487.
Börner, Katy. <u>Making Sense of Mankind's Scholarly Knowledge and Expertise: Collecting</u> , Interlinking, and Organizing What We Know and Different Approaches to Mapping (<u>Network) Science</u> . <i>Environment and Planning B: Planning and Design</i> . Vol. 34(5), 808-825, Pion.
Yildriim, Muhammed A., Kwan-II Goh, Michael E. Cusick, Albert-László Barabási, and Marc Vidal. (2007). Drug-target Network. <i>Nature Biotechnology</i> 25 no. 10: 1119-1126.
Vespignani, Alessandro, Soma Sanyal, and Katy Börner. (2007). <u>Network Science</u> . In Annual Review of Information Science & Technology, vol. 41, ed. Blaise Cronin, 537-607. Medford, NJ: Information Today, Inc./American Society for Information Science and Technology.
Herr II, Bruce W., Weixia (Bonnie) Huang, Shashikant Penumarthy, and Katy Börner. (2007). Designing Highly Flexible and Usable Cyberinfrastructures for Convergence. In Progress in Convergence – Technologies for Human Wellbeing, vol. 1093, eds. William S. Bainbridge and Mihail C. Roco, 161-179. Boston: Annals of the New York Academy of Sciences.

References (Cont.)

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- Colizza, Vittoria, Romualdo Pastor-Satorras, and Alessandro Vespignani. (2007). Reaction-diffusion processes and metapopulation models in heterogeneous networks. Nature Physics 3: 276-282. Nature Publishing Group.
- Vermeirssen, Vanessa, M. Inmaculada Barrasa, César A. Hidalgo, Jenny Aurelle B. Babon, Reynaldo Sequerra, Lynn Doucette-Stamm, Albert-László Barabási, and Albertha J. M. Walhout. (2007). Transcription factor modularity in a genecentered C. elegans core neuronal protein-DNA interaction network. Network Genome Research. Cold Spring Harbor Laboratory Press.
- Börner, Katy, Elisha F. Hardy, Bruce W. Herr II, Todd Holloway, and W. Bradford Paley. (2007). <u>Taxonomy Visualization in Support of the Semi-Automatic Validation and Optimization of Organizational Schemas</u>. *Journal of Informetrics* 1 (3): 214-225. Elsevier.

> More papers are linked from <u>http://ivl.slis.indiana.edu/publications/</u>

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The End.