

Scholarly Data, Network Science, and (Google) Maps – Modeling, Mapping, and Exploring the Landscape 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
katy@indiana.edu

Talk at Google
2007.01.31

The Story of Science Maps

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The Problem: Being Lost in Space

15th Century: One person can make major contributions to many areas of science

Mankind's Knowledge



Amount of knowledge
on brain can mänge

use



Human Brain



contribute



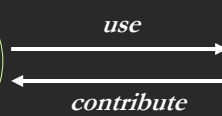
Leonardo Da Vinci
(1452-1519)

20th Century: One person can make major contributions to a few areas of science

Mankind's Knowledge



Amount of knowledge
on brain can manage



Human Brain



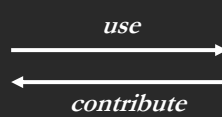
Albert Einstein
(1879-1955)

21st Century: One person can make major contributions to a specific area of science

Mankind's Knowledge



Amount of knowledge
on brain can manage

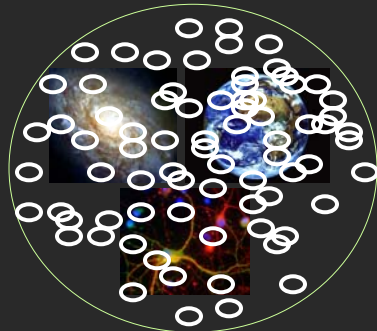


Human Brain

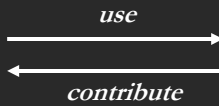


21th Century: One person can make major contributions to a specific area of science

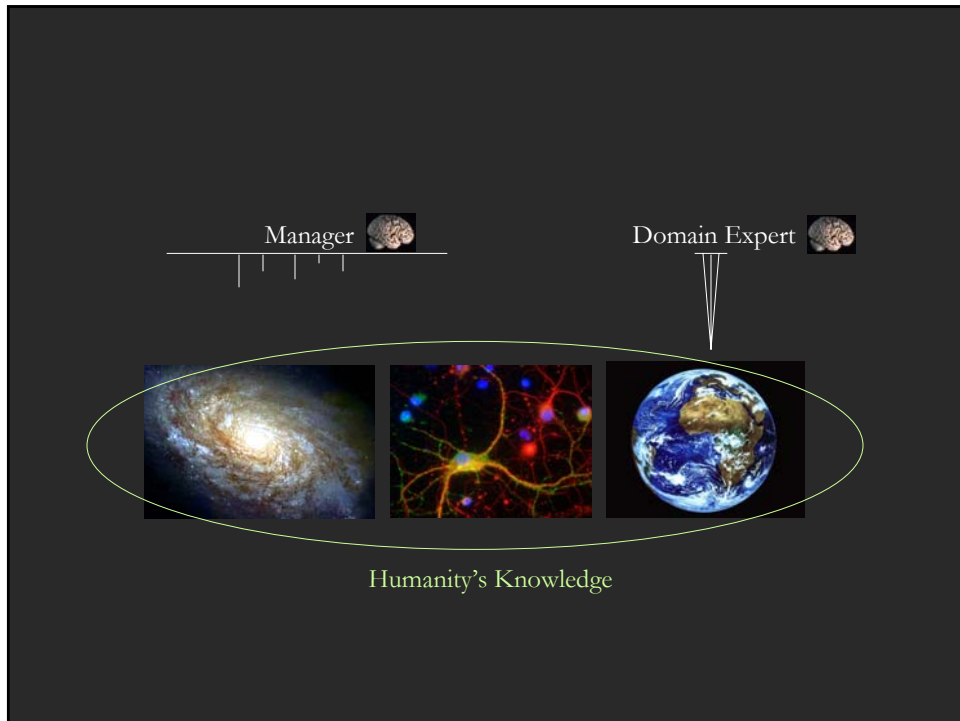
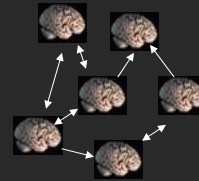
Mankind's Knowledge

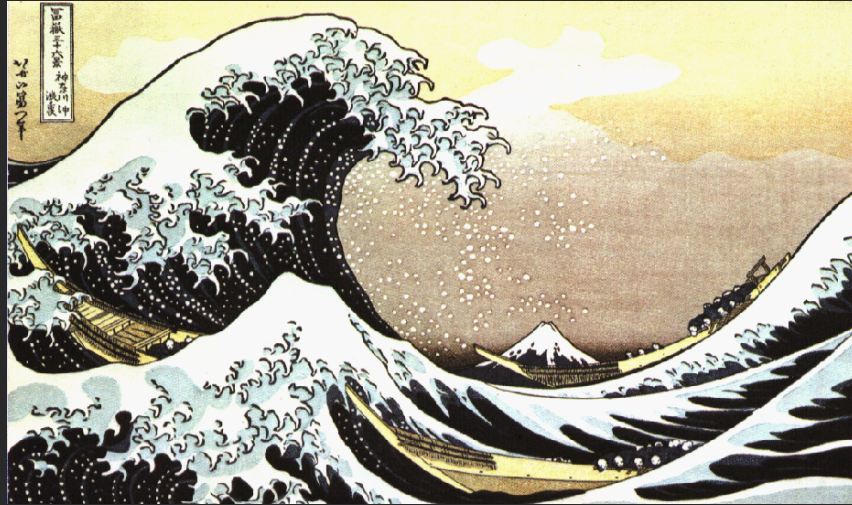


Amount of knowledge on brain can mänge



Human Brains





The Great Wave Off Kanagawa (Katsushika Hokusai, 1760-1849)

A Solution: Science Maps

places & spaces &

Places & Spaces: Mapping Science
An exhibition created to demonstrate the power of maps to understand, navigate, and manage not only physical places, but also abstract information spaces.

Home Browse Maps Compare & Contrast Maps Schedule Connect

Home

Exhibit Purpose and Goals

The Places & Spaces: Mapping Science exhibit has been created to demonstrate the power of maps. An initial theme of this exhibit is to compare and contrast first maps of our entire planet with the first maps of all of science as we know it.

Check out the **schedule of physical showings** and come see with your own eyes the extent to which maps can be employed to help make sense of the flood of information we are confronted with and how domain maps can be used to locate complex and beautiful information.

"Places & Spaces: Mapping Science"
on display at the **New York Hall of Science, Dec. 9, 2006 - Feb. 25, 2007.**

Places & Spaces at the **NYPI Science, Industry, and Business Library** (Madison/34th), New York, April 3rd - August 31st, 2006.

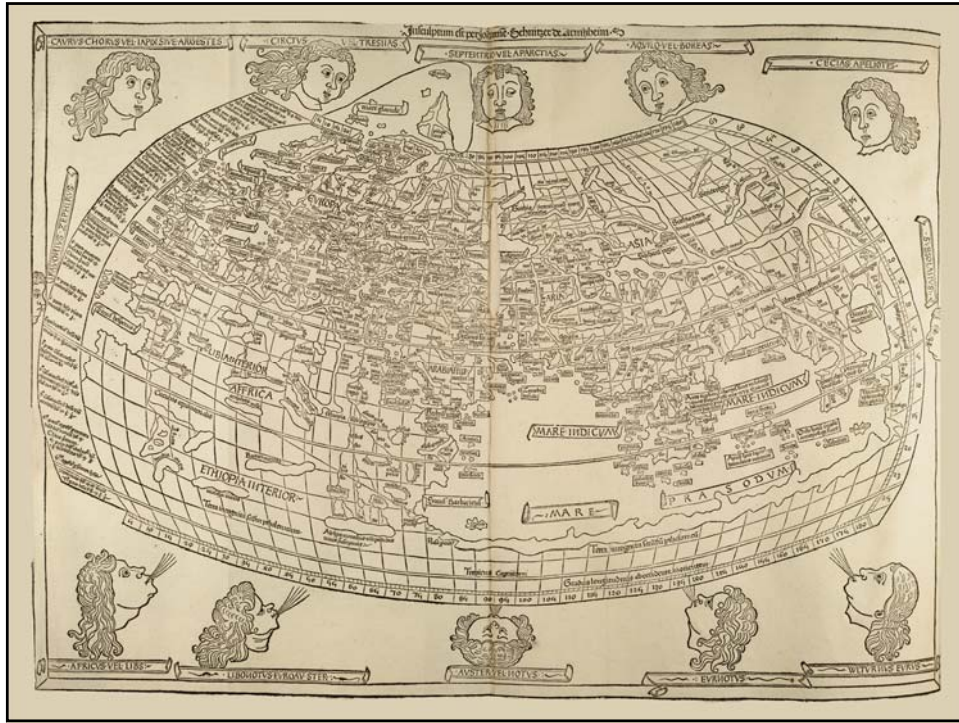
Places & Spaces: Mapping Science
a science exhibit that introduces people to maps of sciences, their makers and users.
Scimaps.org

Exhibit Curators:
Dr. Katy Börner & Julie Smith

The Power of Maps

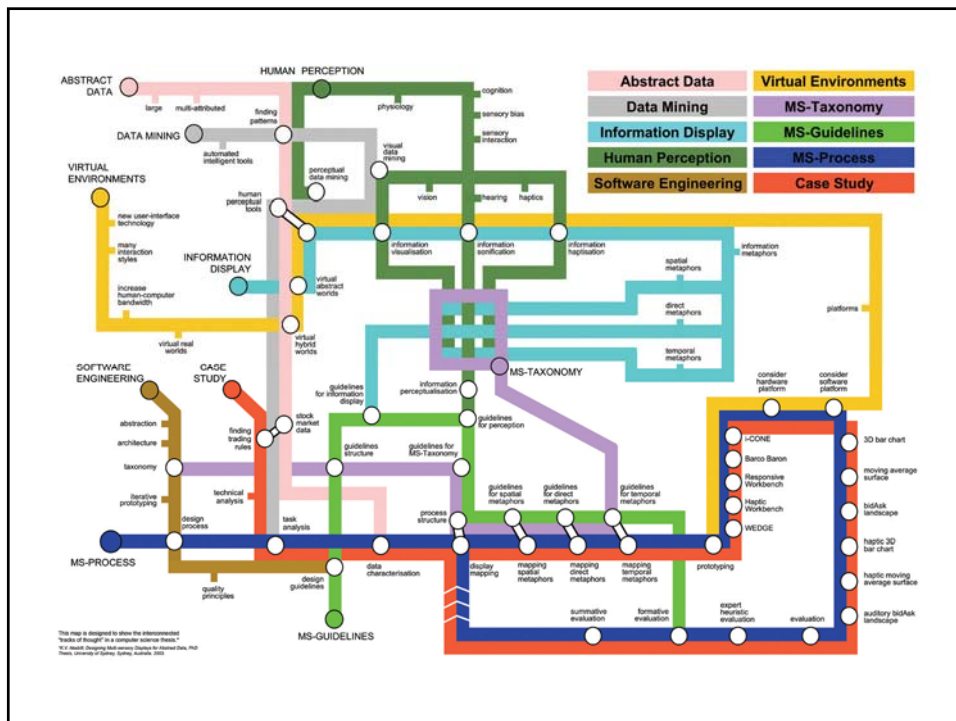
Four Early Maps of Our World VERSUS Six Early Maps of Science

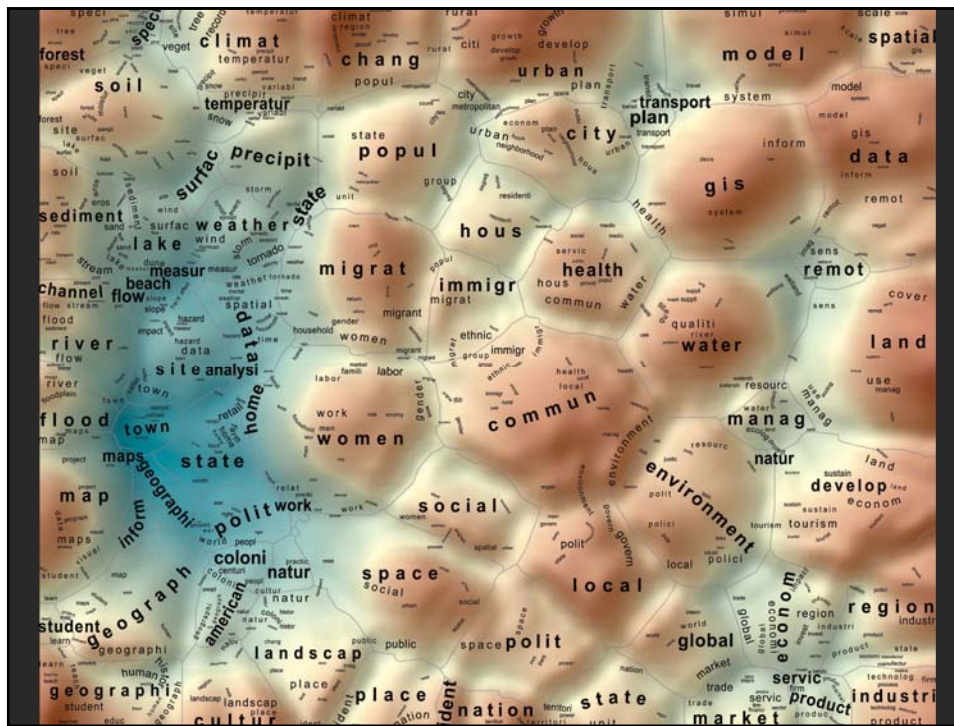
(1st Iteration of Places & Spaces Exhibit - 2005)



How would a map of science look?

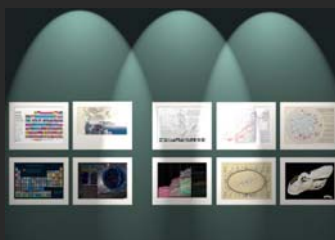
What metaphors would work best?





The Power of Reference Systems

Four Existing Reference Systems VERSUS Six Potential Reference Systems of Science



(2nd Iteration of Places & Spaces Exhibit - 2006)

The Visual Elements Periodic Table

This chart shows the 118 currently known and officially named elements that comprise the Periodic Table (IUPAC 2004). Each element is represented visually by an image produced for the Visual Elements project.

The Periodic Table is an arrangement of all known elements in order of increasing atomic number. The Periodic Table lists all the elements, with their widely diverse physical and chemical properties, into 18 regular patterns. These are displayed vertical columns in the same which display the elements into groups. Elements within a group have closely related physical properties. Horizontal rows list the elements in order of their increasing mass and are called series or periods. Properties of elements change in a systematic way through a period.

Visual Elements is an arts and science collaborative project supported by the Royal Society of Chemistry which aims to engage people with the diversity of elements that comprise the periodic table and molecular world in general. All the images are available together with associated scientific information on the website for each element can be viewed on the Visual Elements website, hosted by the RSC.

Visit the periodic table on the web at www.rsc.org/visualelements

© Murray Robertson/Royal Society of Chemistry 1999-2008

Evening Stars

The Big Dipper floats high in the northeast these early spring evenings, while Orion sinks low in the southwest. These are just a few of the celestial sights you can find on any clear evening in April using a sky map like the one shown here.



How to Use a Sky Map

1. **Check the dates and times at right.** Take your map out under the night sky around the right time, and bring along a flashlight to read it by. It helps to attach a piece of red paper over the front or to use a flashlight with red LEDs; the dim red light won't spoil your night vision.
2. **Outside, you need to know which direction you're facing.** If you're unsure, just note where the Sun sets, that's west. Whenever you're facing, make sure the corresponding yellow label along the curved edge of the map is at the bottom, right-side up. This curved edge represents the horizon. The stars above it on the map match the stars in front of you. The further up from the map's edge they appear, the higher they'll be in the sky. The center of the map is the zenith (straight overhead). Go a star halfway from the edge of the map to the center will appear halfway from straight ahead to straight up. None of the parts of the map above horizons you're not facing.
3. **Let's give it a try!** Pretend you're facing the southwest horizon (labeled "Facing SW"). Just a little way up (that is, a little way in from the edge of the map) is Sirius, the brightest star in the night sky, in the constellation Canis Major. Further up, nearly halfway overhead, is the star Proxima Centauri. Still further up is the largest planet Saturn. Go out at the right time, face southwest, and look up into the sky — there they are!

When to Use This Map
Early April: 10 pm (daylight saving time)
Late April: Dark

Tips

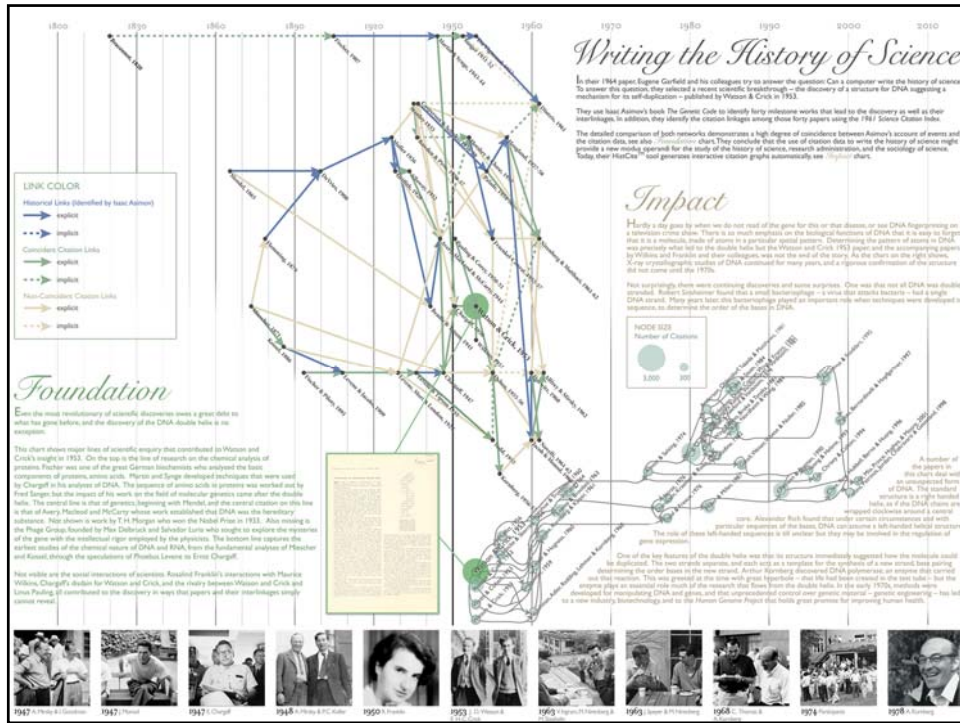
A couple of tips: Look for the brightest stars and constellations first. Light pollution or moonlight may wash out the fainter ones. And remember that star patterns in the sky will look a lot bigger than they do here on paper. With a map like this, you can identify celestial sights all over the sky. Go out the next clear night and make some stargazing friends.

You can customize a night sky map for any time and place at StarrySoftware.com.



How would a reference system for all of science look?

What dimensions would it have?



Evolution - Wikipedia

History
Main Page | Recent changes | Edit this page | Page history | Printable version | Current revision

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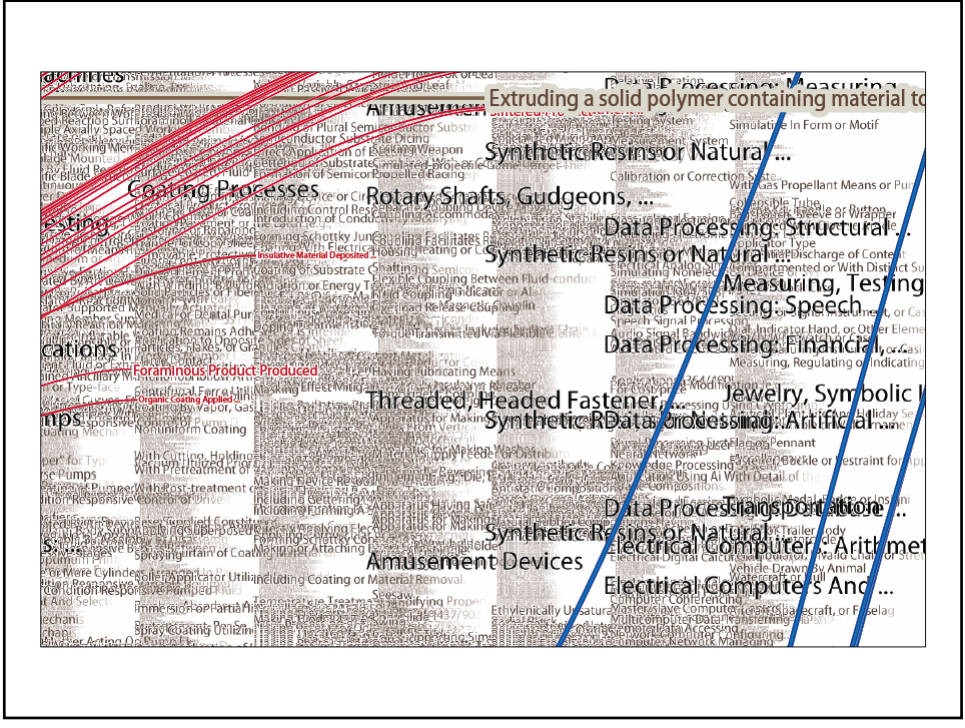
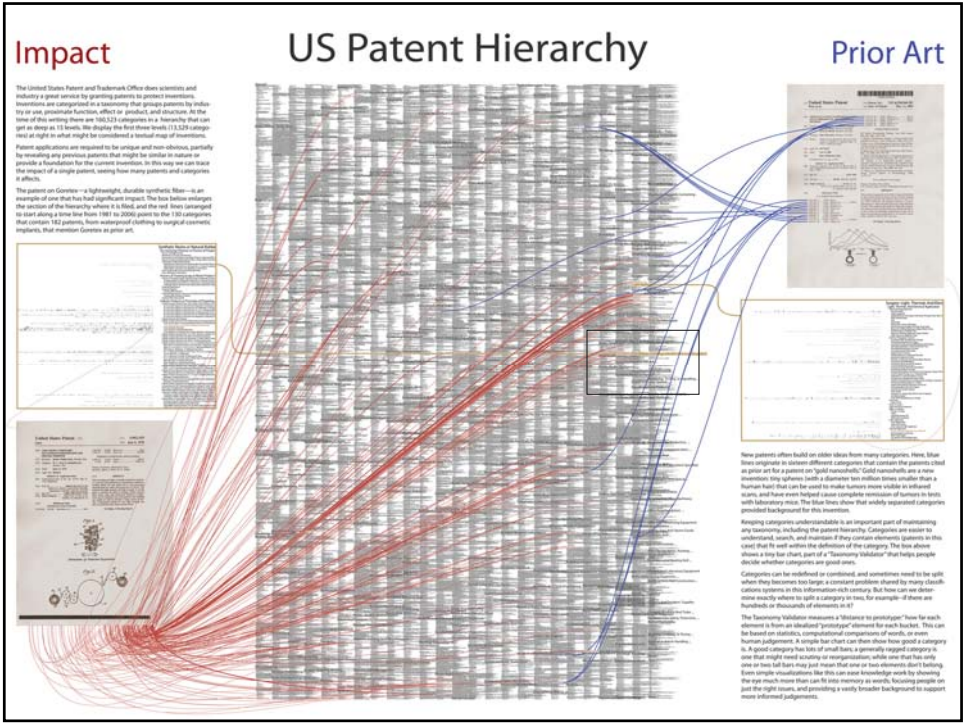
Other languages: [Deutsch](#) | [Español#241;ol](#) | [Esperanto](#) | [Nederlands](#) | [Fran#231;sais](#) | [Polski](#)

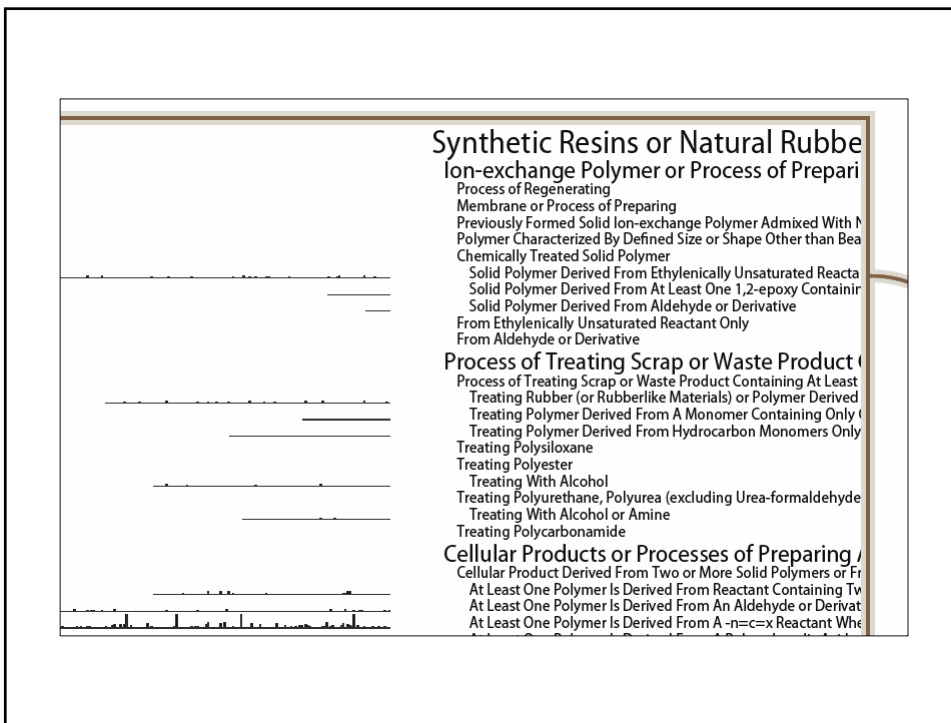
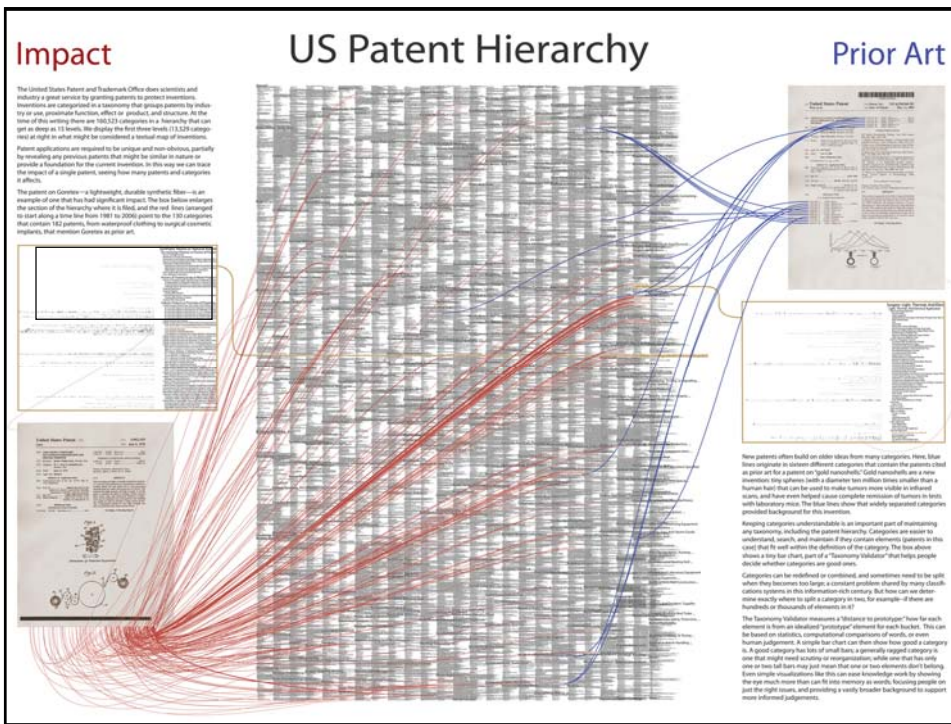
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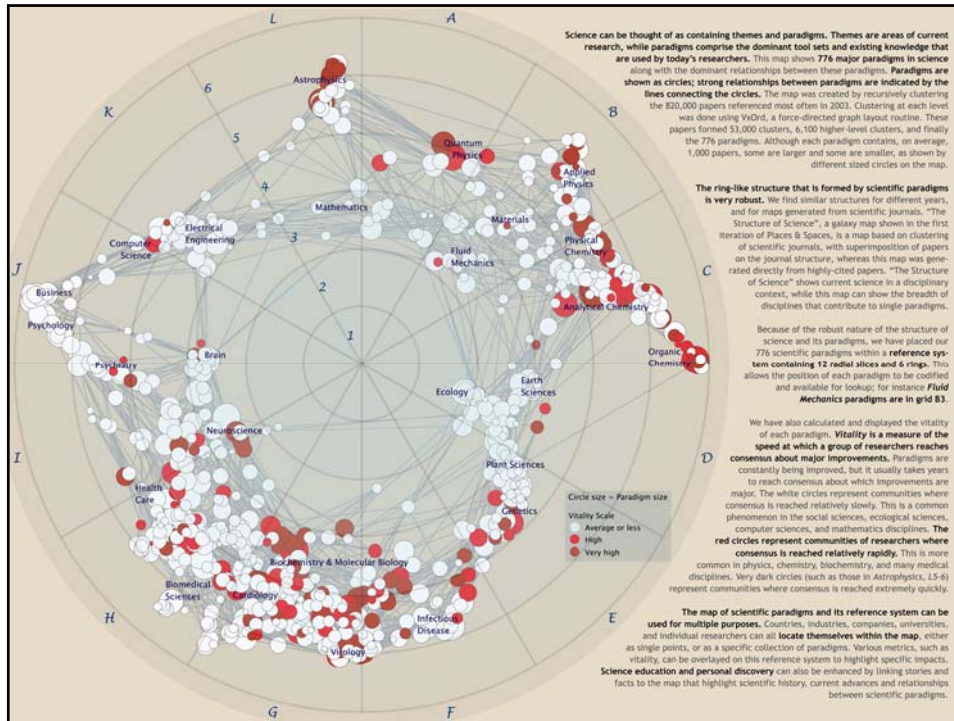
Evolution is any process of growth, change or development. The word stems from the Latin, *evoluere* meaning "unfolding" and prior to the late 1800s was confined to referring to the gradual, pre-programmed processes such as embryological development. A pre-programmed task, as in a military maneuver, using this definition, may be termed an "evolution". One can also speak of stellar evolution, chemical evolution, cultural evolution or the evolution of an idea. Other kinds of evolution include evolutionary algorithms which attempt to mimic processes similar to biological evolution in a computer program, most frequently as an optimization technique and as an experimental framework for the computational modelling of evolution.

In the 19th century the word "evolution" was identified with improvement. It was clear to European thinkers at that time -- in the wake of the Enlightenment and the French Revolution -- that human societies evolved; many people have claimed the same about the evolution of biological species. In the 20th century, most social scientists came to reject the strict identification of social and cultural change with improvement (see also social evolution and [social Darwinism](#)); Most interpretations of Darwin's account of evolution similarly argue against identifying biological changes with improvement.

Since the 19th century, "evolution" is generally used in reference to biological evolution, changes in allele frequencies in a population from one generation to another. Often it is shorthand for the modern

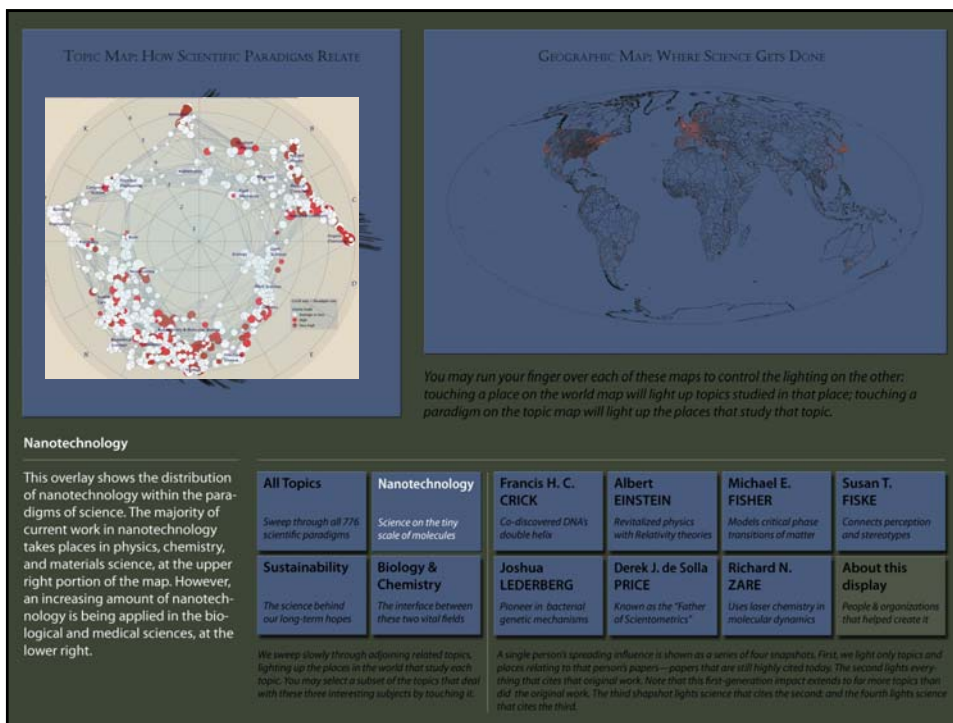
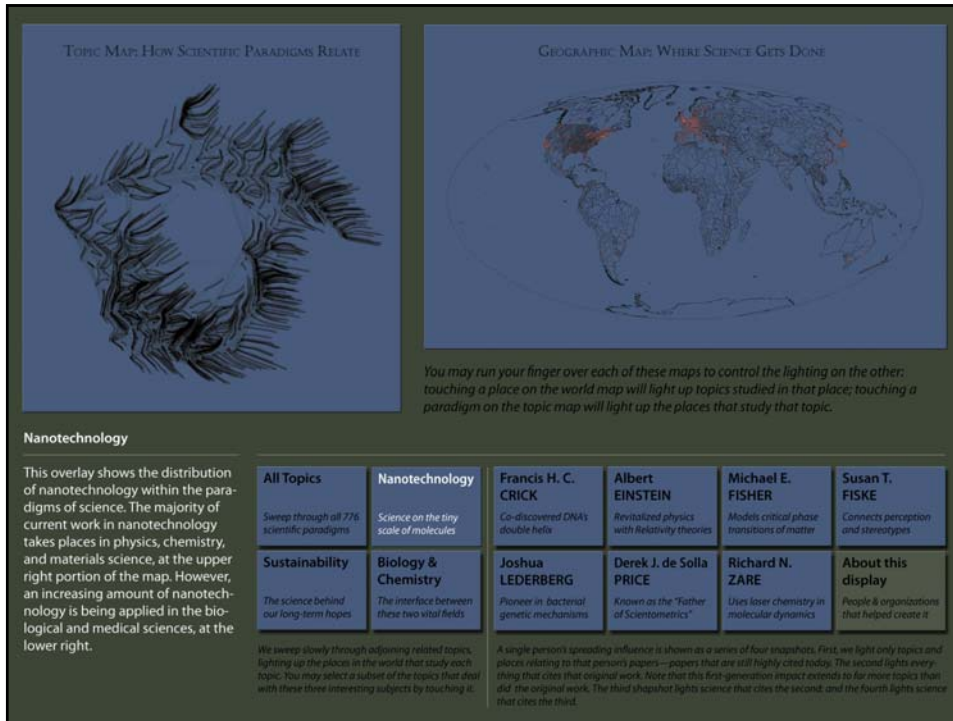


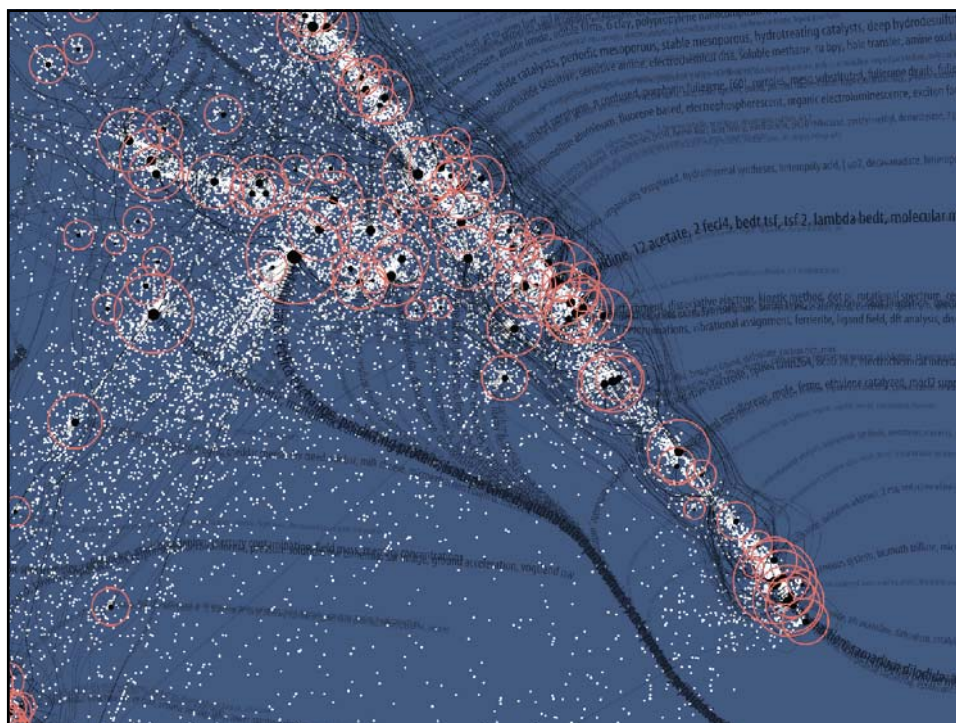
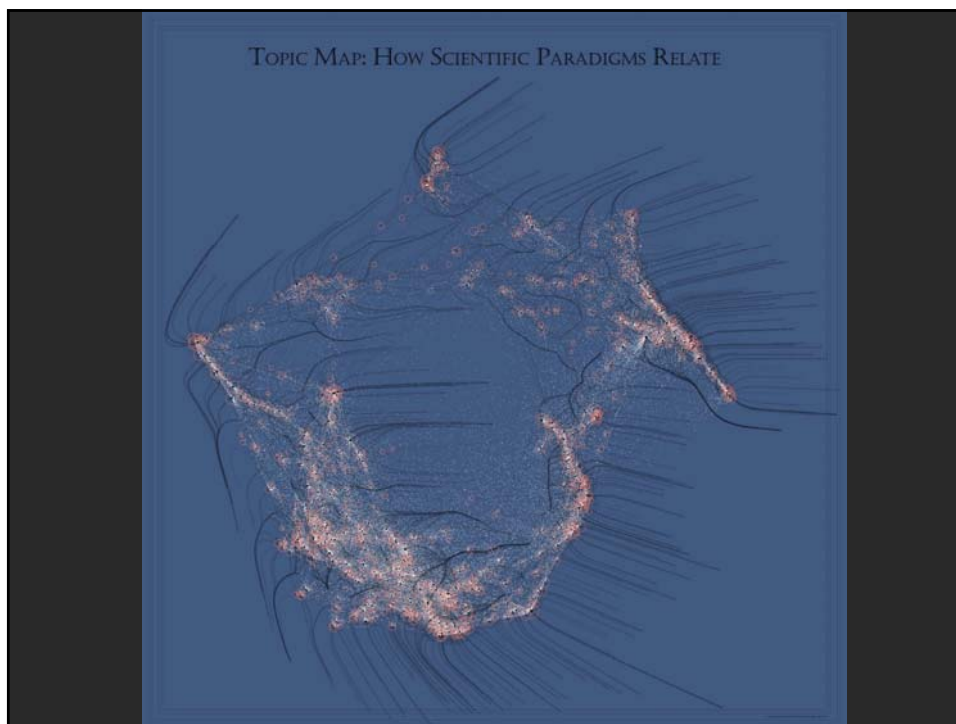




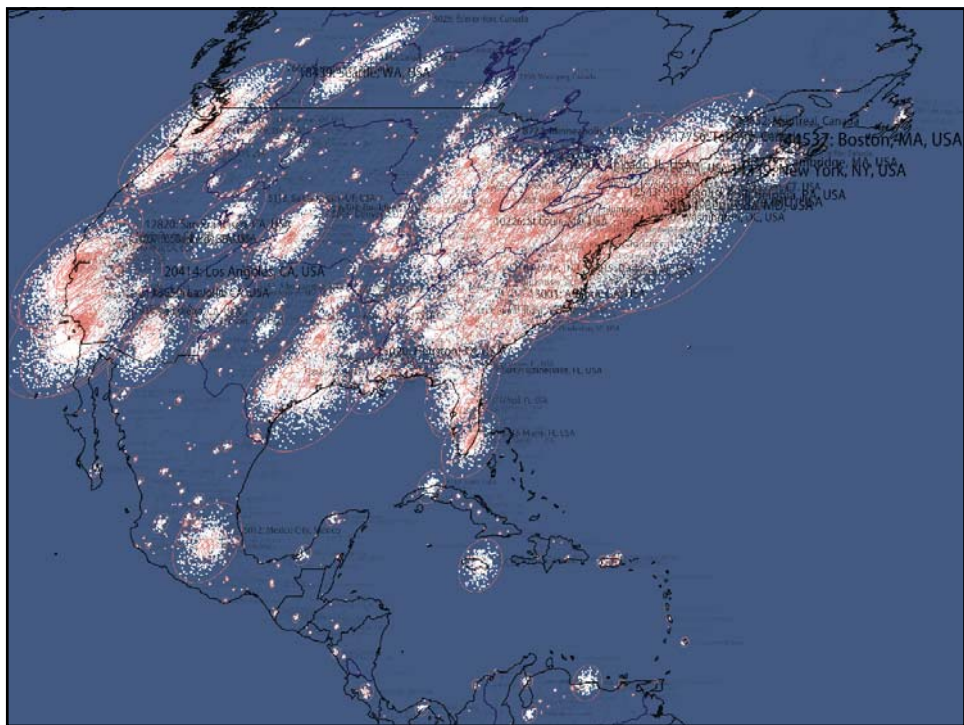
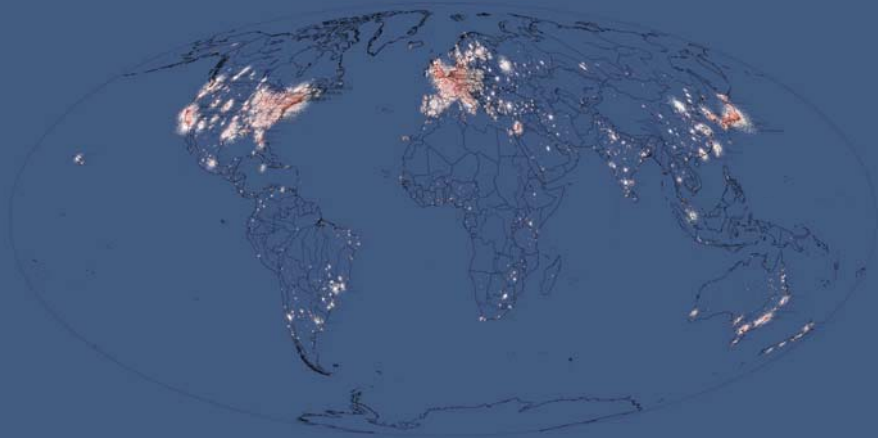
W. Bradford Paley
Scientific Mapmaker
Digital Image Design Incorporated
Dept. of Computer Science, Columbia University

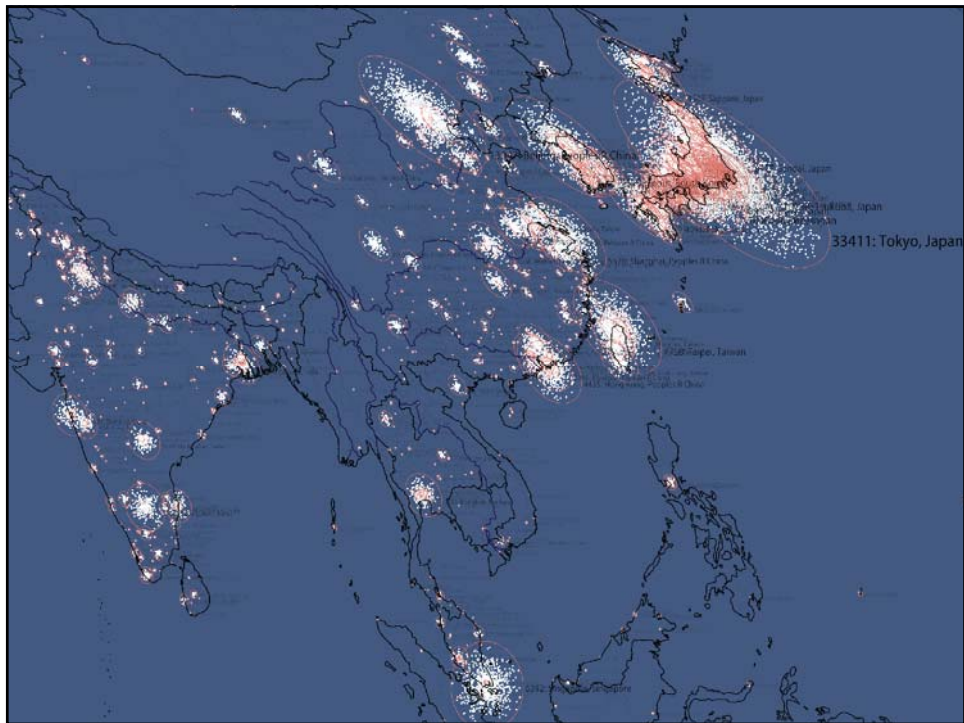
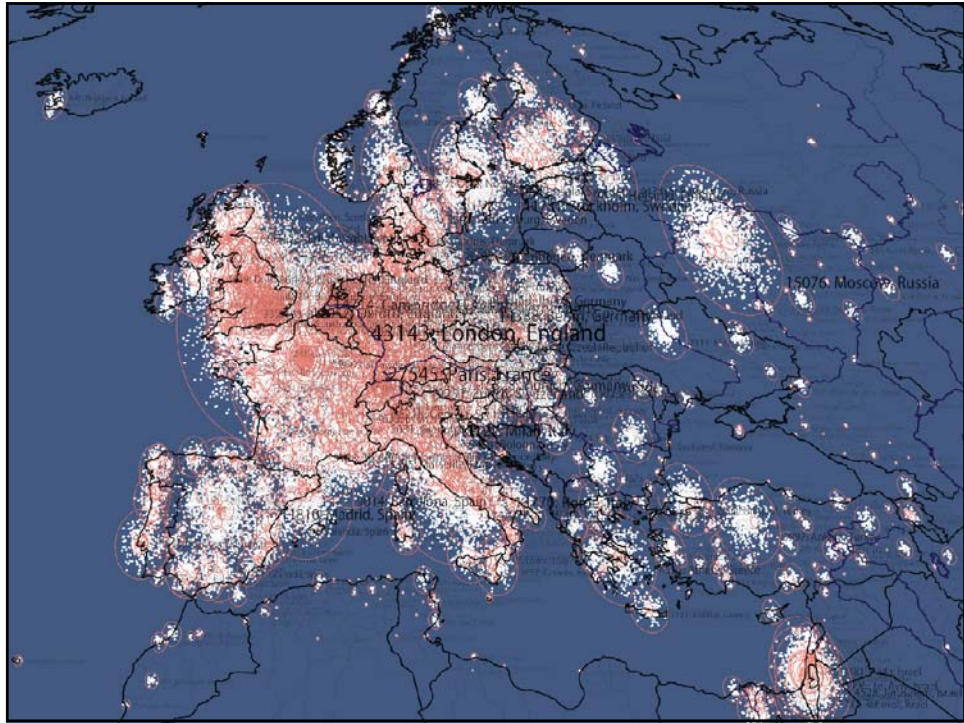
"Places & Spaces: Mapping Science"
on display at the New York Hall of Science
(5 mins from LaGuardia Airport)
December 9th, 2006 – February 25th, 2007.





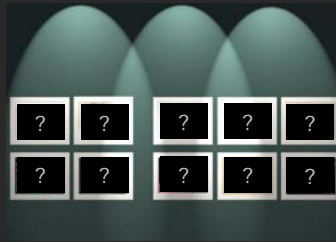
GEOGRAPHIC MAP: WHERE SCIENCE GETS DONE





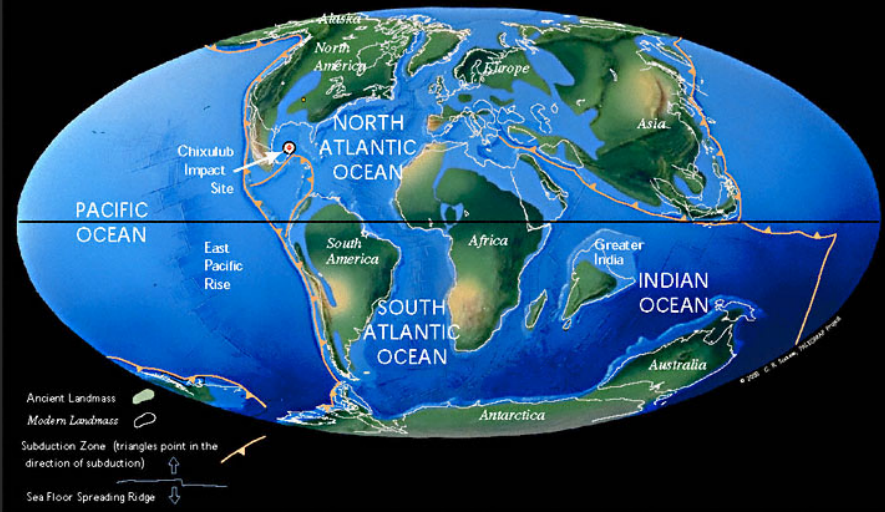
The Power of Forecasts

Four Existing Forecasts
VERSUS
Six Potential Science 'Weather' Forecasts

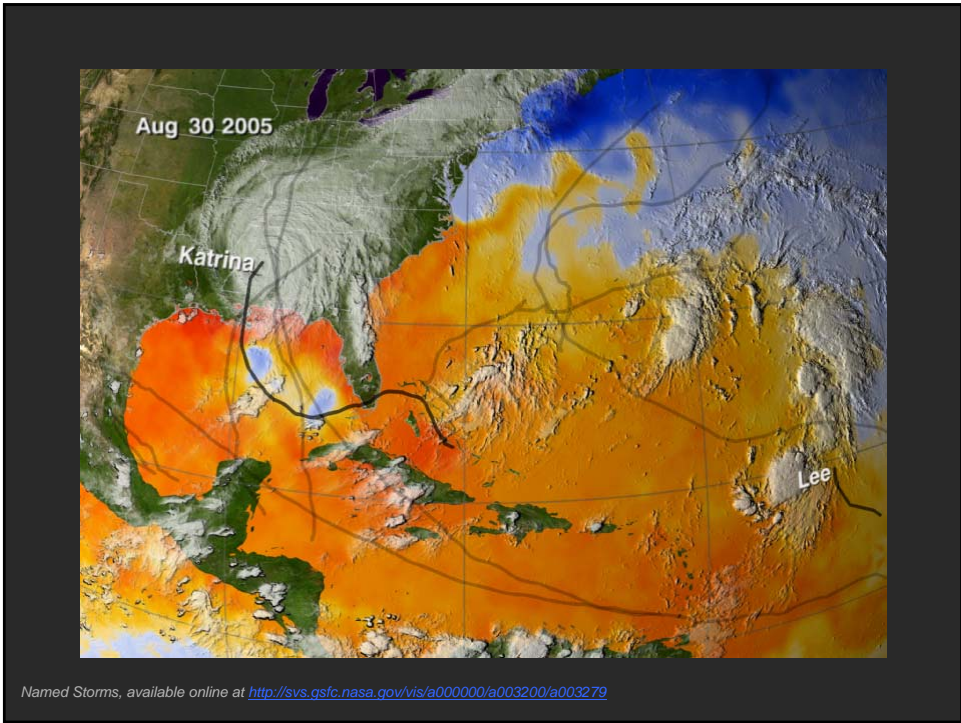
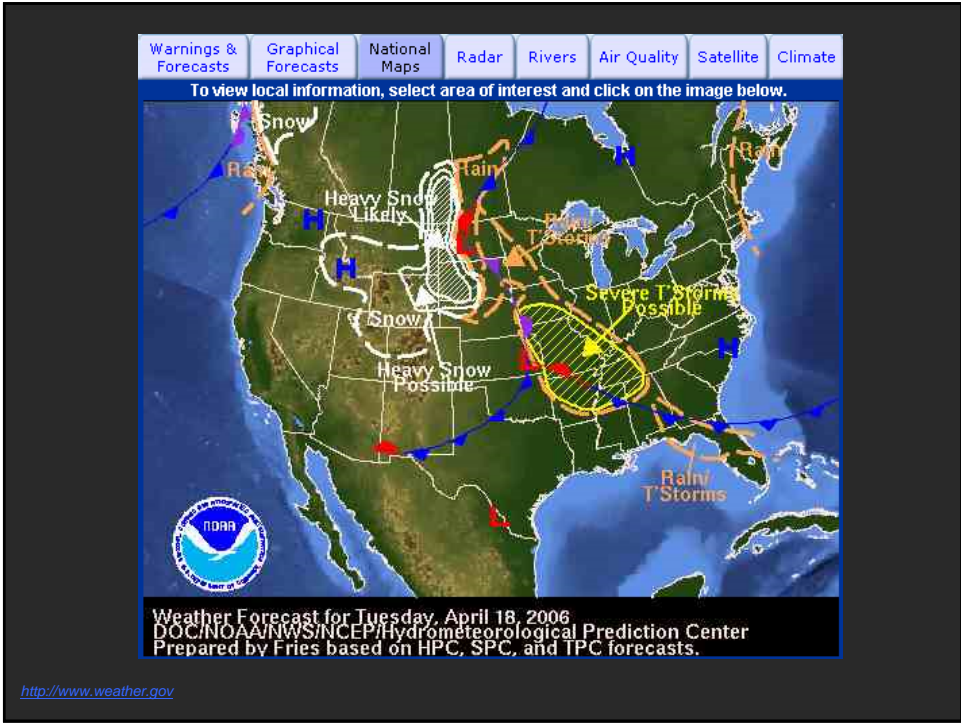


(3rd Iteration of Places & Spaces Exhibit - 2007)

K/T Boundary 66 Ma

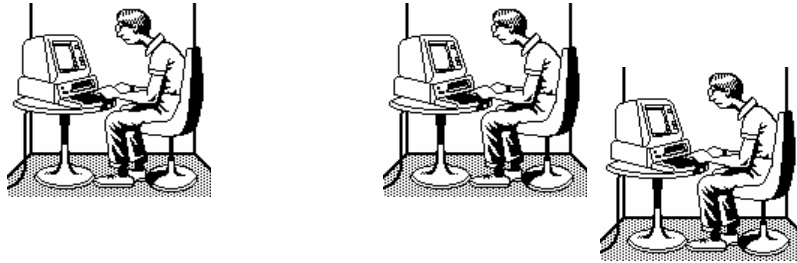


<http://www.scotese.com/>

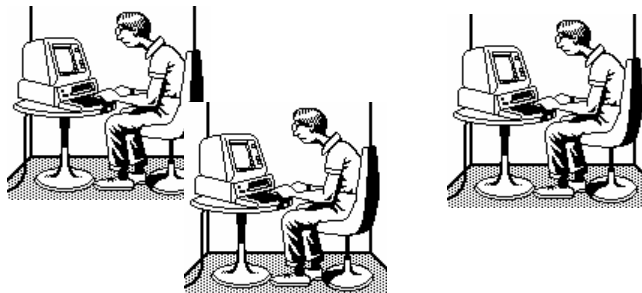


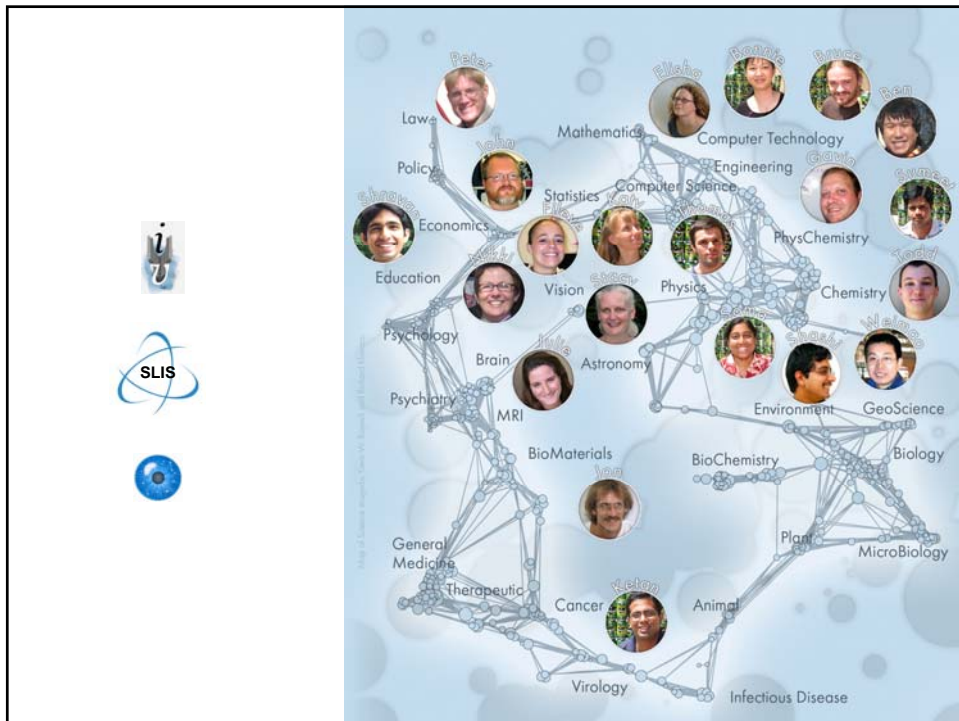
Behind the Scene:

- **People**
- **Scholarly Data Integration**
- **Network Science & (Google) Maps**



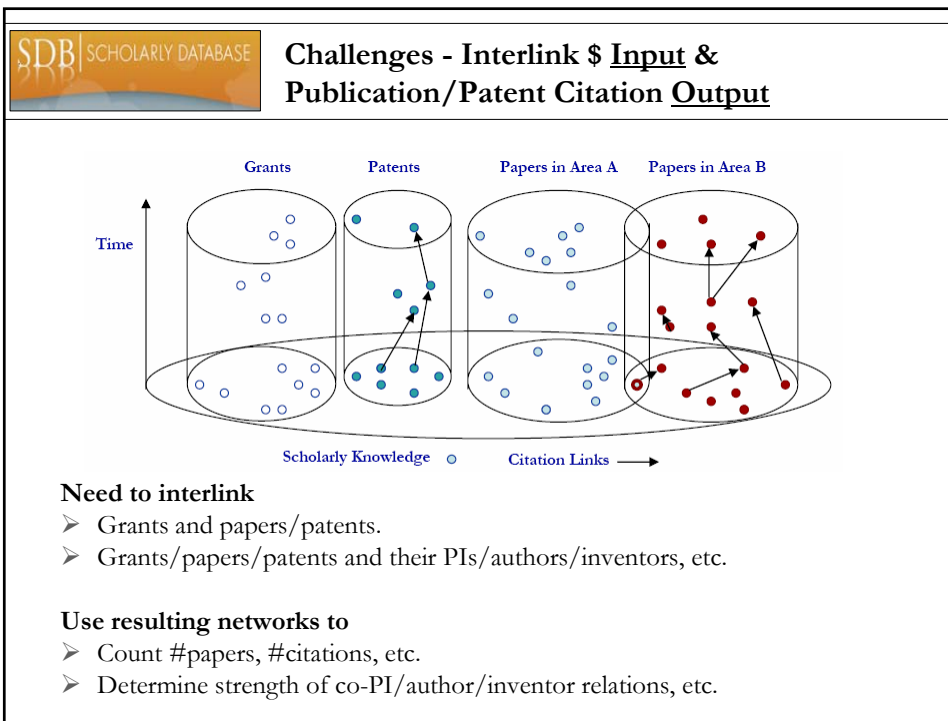
The Cyberinfrastructure Developers

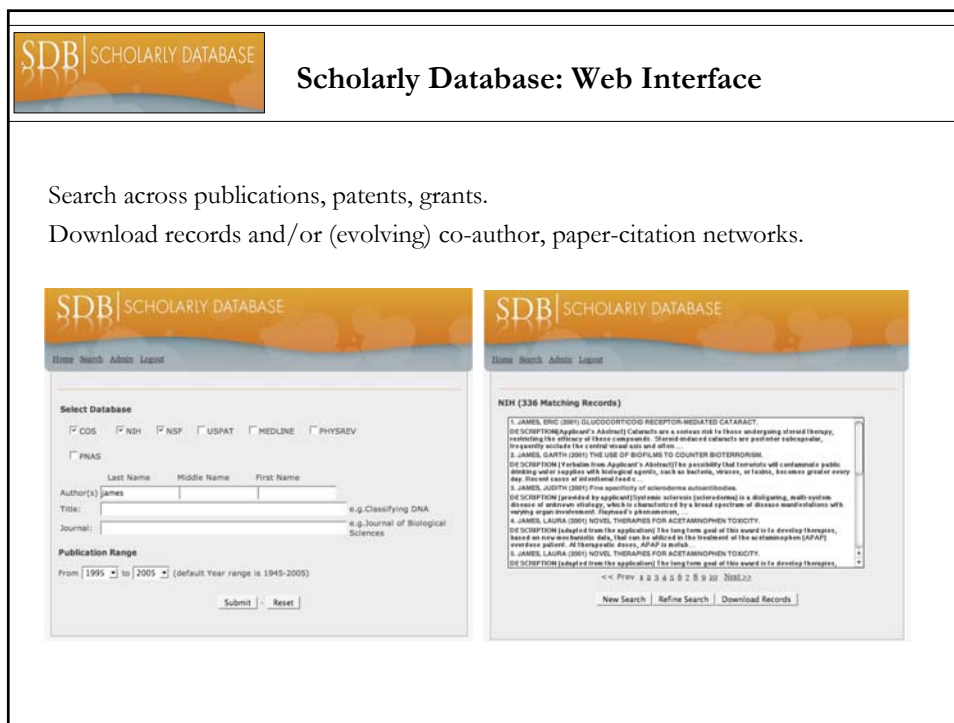
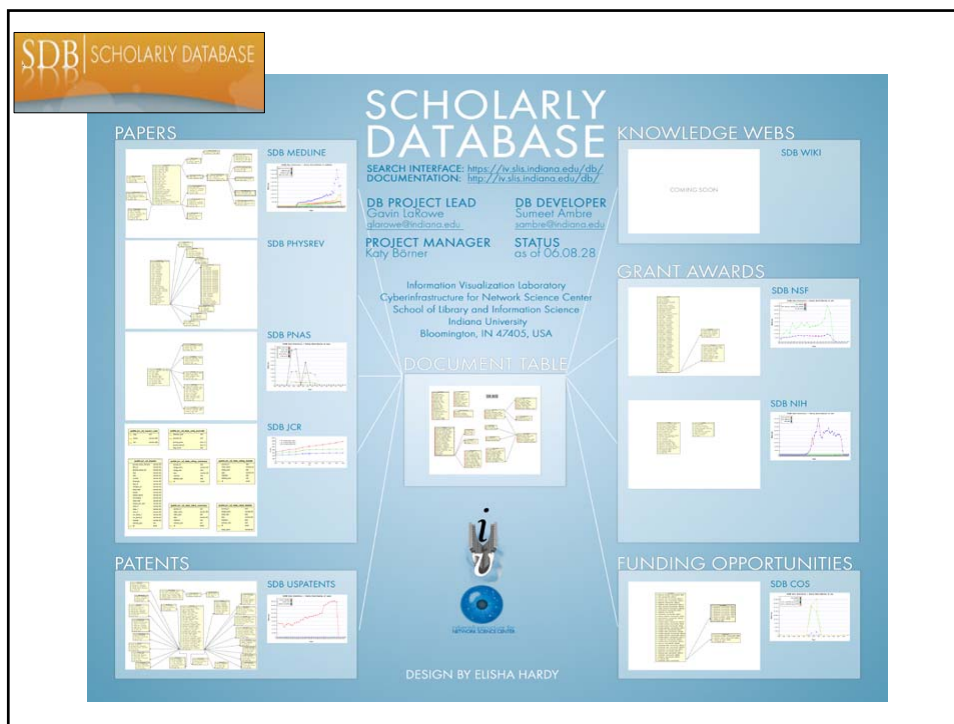




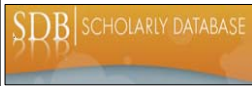
Behind the Scene:

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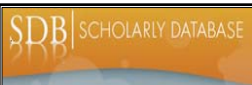
Search across publications, patents, grants.
 Download records and/or (evolving) co-author, paper-citation networks.



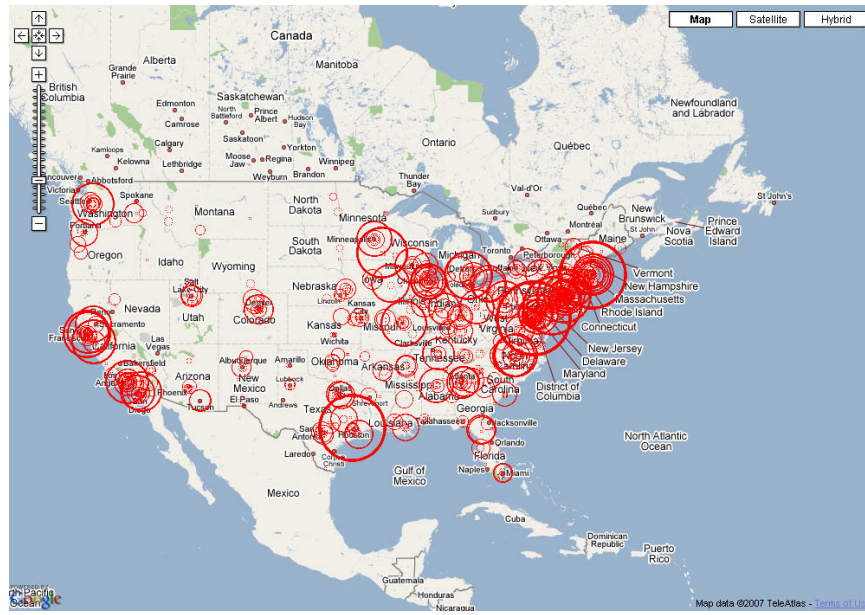
Scholarly Database: # Records & Years Covered

Datasets available via the Scholarly Database (* future feature)

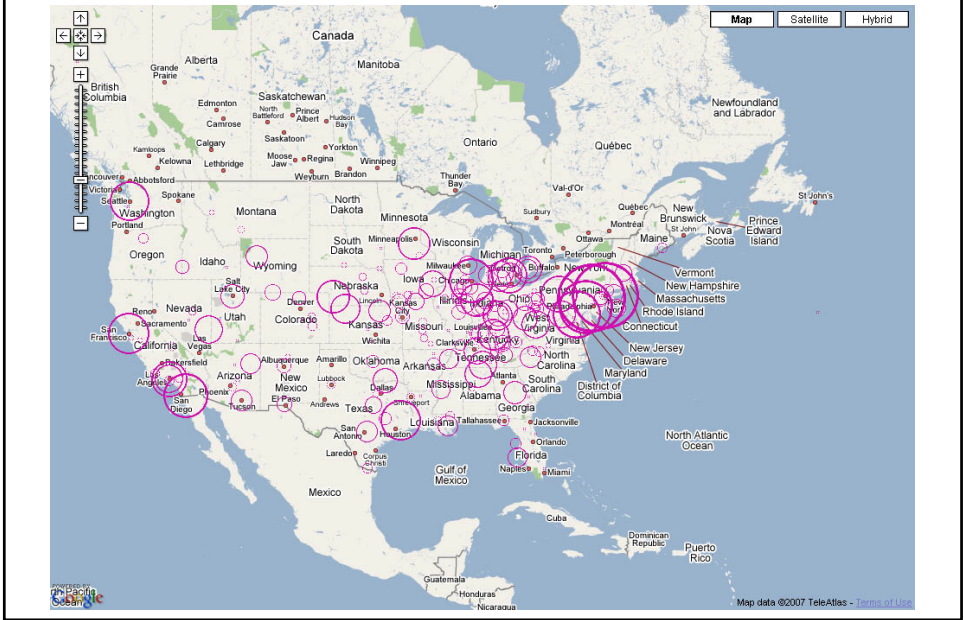
Dataset	# Records	Years Covered	Updated	Restricted Access
Medline	13,149,741	1965-2005	Yes	
PhysRev	398,005	1893-2006		Yes
PNAS	16,167	1997-2002		Yes
JCR	59,078	1974, 1979, 1984, 1989 1994-2004		Yes
USPTO	3,179,930	1976-2004	Yes*	
NSF	174,835	1985-2003	Yes*	
NIH	1,043,804	1972-2002	Yes*	
Total	18,021,560	1893-2006	4	3



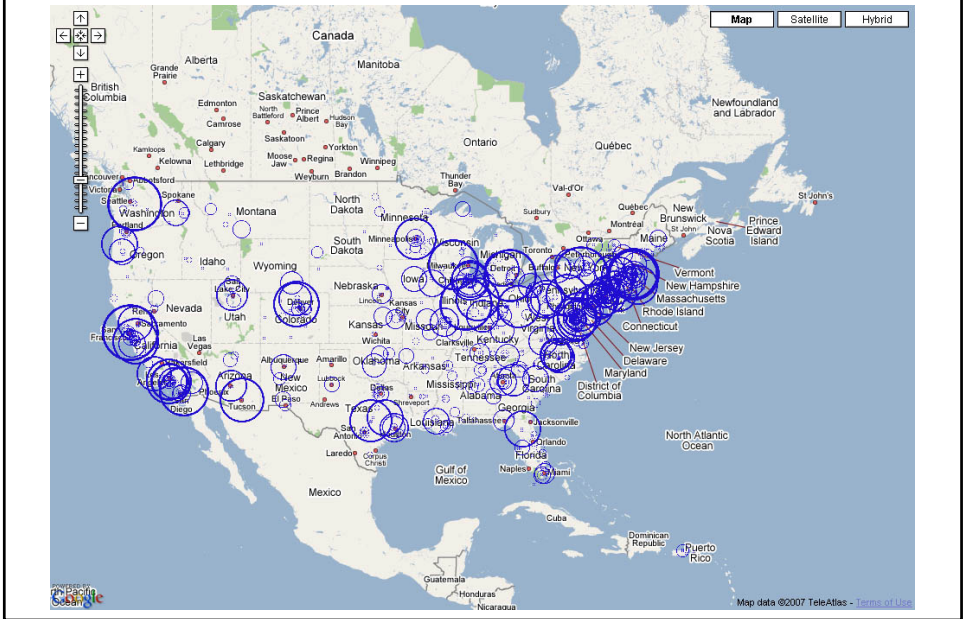
Medline Publications

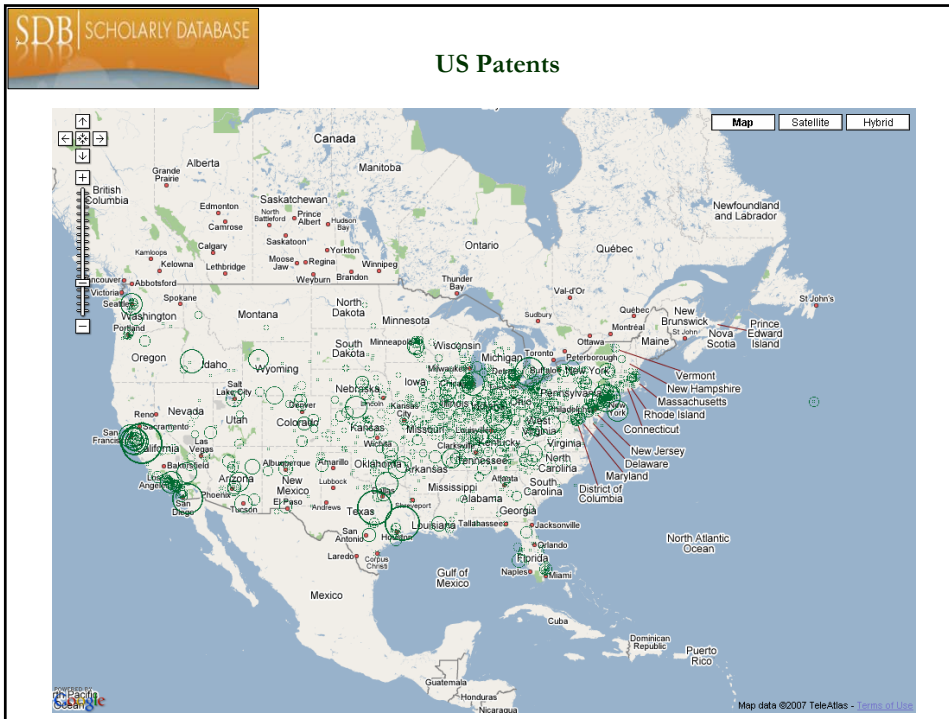


NIH



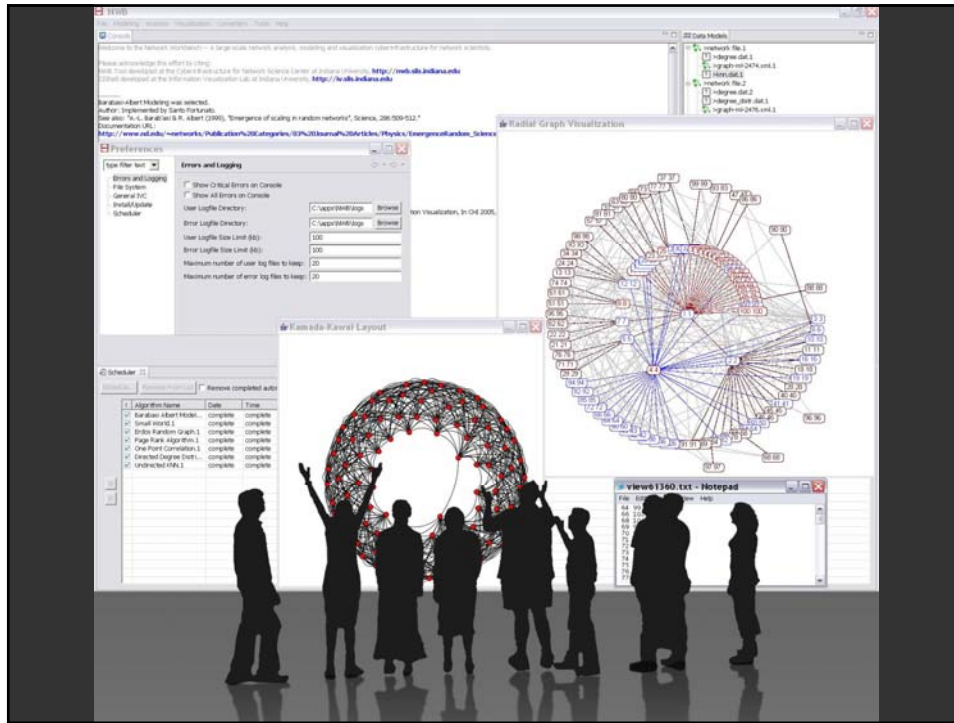
NSF Funding



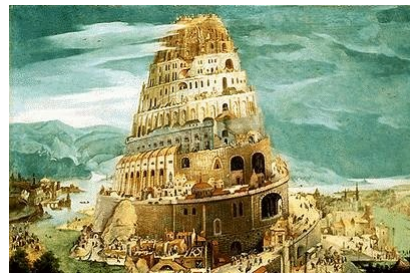


Behind the Scene:

- People
- Scholarly Data Integration
- Network Science & (Google) Maps



Building Market Places not Cathedrals



- Requires the design & implementation of ‘software glue’ that can interlink datasets and algorithms written in different languages using different data formats.
- The smaller the glue or ‘CI Shell’, the more likely it can be maintained.
- Dataset and algorithm ‘plugins’ are provided by application holders/ community.
- Applications resemble custom ‘fillings’.



Cyberinfrastructure Shell (CIShell)

<http://cishell.org>

CIShell is an 'empty shell' that supports

- Easy integration of new datasets and algorithms by algorithm developers and
- Easy usage of algorithms by algorithm users.

Its plug-and-play architecture supports the integration and utilization of diverse

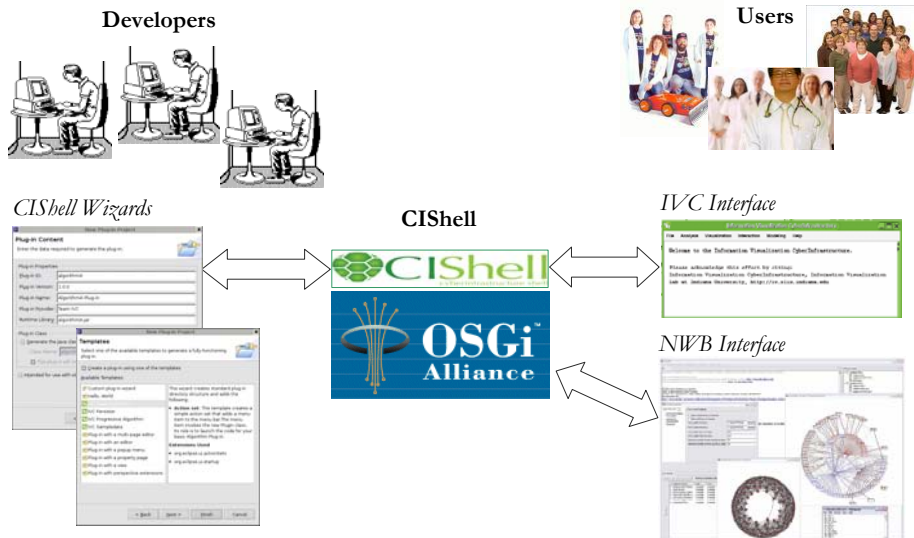
- Datasets, e.g., stored in files, databases, streaming data.
- Algorithms, e.g., data processing, analysis, modeling, visualization.
- Interfaces, e.g., remote services, scripting engines, peer-to-peer clients.
- Services, e.g., workflow support, scheduler.

Hence, it can be used for custom UI/Toolkit development.

Network Workbench: A Large-Scale Network Analysis, Modeling and Visualization Toolkit for Biomedical, Social Science and Physics Research. NSF IIS-0513650 award (Katy Börner, Albert-László Barabási, Santiago Schnell, Alessandro Vespignani & Stanley Wasserman, Eric Werner (Senior Personnel), \$1,120,926) Sept. 05 - Aug. 08.
<http://nwb.slis.indiana.edu>

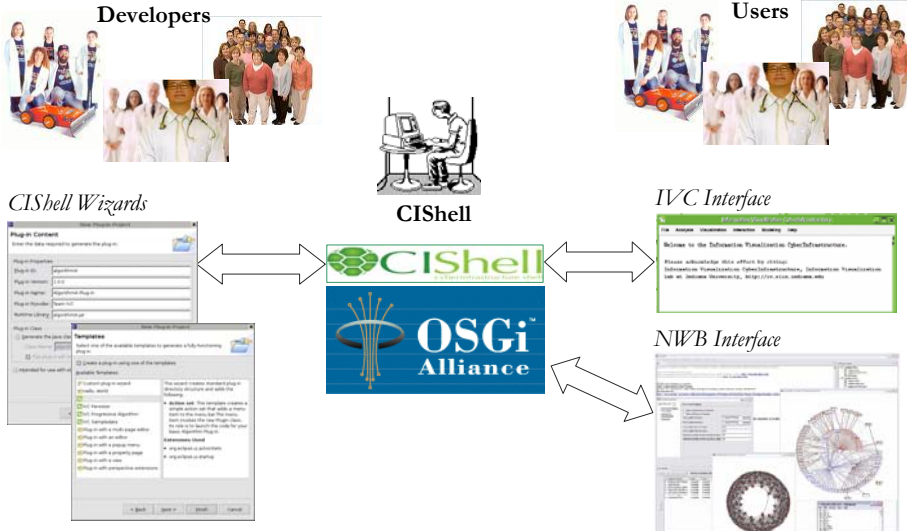


CIShell – Needs of Algorithm Developers & Users





CIShell – Needs of Algorithm Developers & Users



CIShell – Technical Details

CIShell is built upon the Open Services Gateway Initiative (OSGi) Framework.

OSGi (<http://www.osgi.org>) is

- A standardized, component oriented, computing environment for networked services.
- Successfully used in the industry from high-end servers to embedded mobile devices since 7 years.
- Alliance members include IBM (Eclipse), Sun, Intel, Oracle, Motorola, NEC and many others.
- Widely adopted in open source realm, especially since Eclipse 3.0 that uses OSGi R4 for its plugin model.

Advantages of Using OSGi

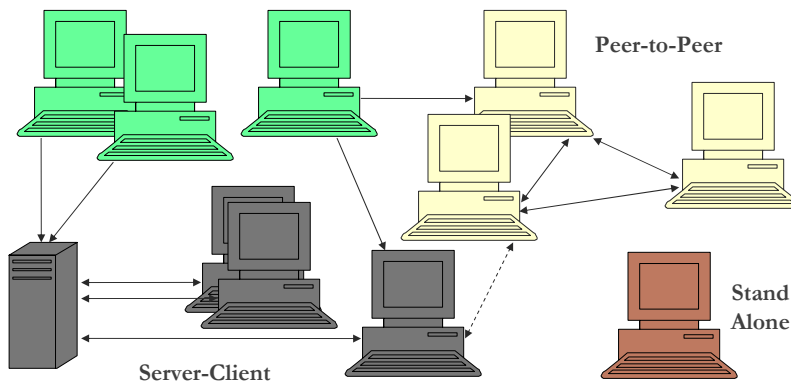
- Any CIShell algorithm is a service that can be used in any OSGi-framework based system.
- Using OSGi, running CIShells/tools can be connected via RPC/RMI supporting peer-to-peer sharing of data, algorithms, and computing power.

Ideally, CIShell becomes a standard for creating OSGi Services for algorithms. Developed Tools/CI, e.g., IVC & NWB, provide a reference GUI for underlying services.

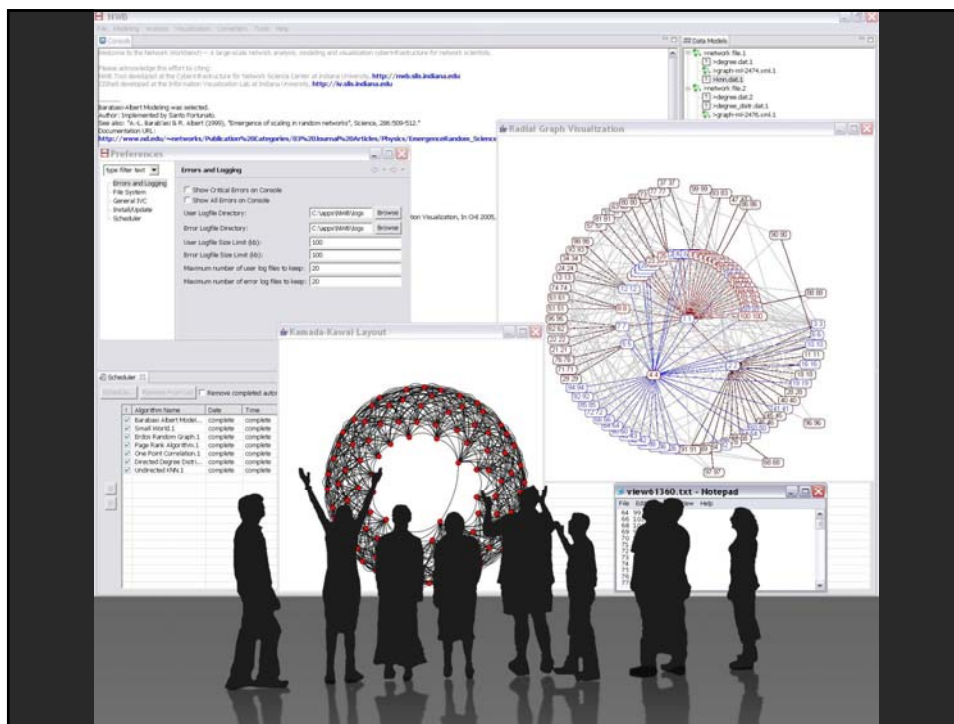
CIShell layer cake.



Data-Algorithm Repositories



CIShell applications can be deployed as distributed data and algorithm repositories, stand alone applications, peer-to-peer architectures, and server-client architectures.



Network Workbench (NWB)

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>





NWB Advisory Board

- James Hendler (Semantic Web)
- Jason Leigh (CI)
- Neo Martinez (Biology)
- Michael Macy, Cornell University (Sociology)
- Ulrik Brandes (Graph Theory)
- Mark Gerstein, Yale University (Bioinformatics)
- Stephen North (AT&T)
- Tom Snijders, University of Groningen (Social Science)



NWB CI Deliverables

Glue:

- CIShell Core programmer team lead by Bonnie Huang

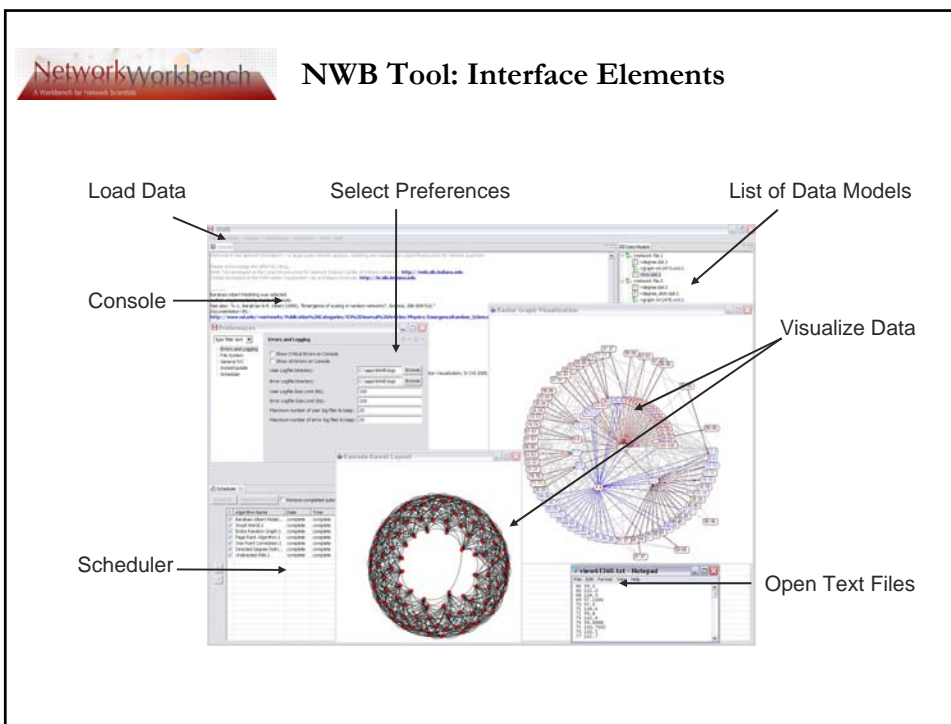
Tools, Services & Portals:

- NWB Tool Lead by Alex Vespignani with input from other PIs
- SciMaps Service Online Lead by Katy Borner
- Bio Portal Lead by Laszlo Barabasi & Santiago Schnell

All three are prototypical instantiations of CIShell serving as reference implementations.

Documentation/Registry/Market Place:

- NWB Community Wiki Lead by Katy Borner





NWB Tool 0.2.0: List of Algorithms

Category	Algorithm	Language	Analysis Algorithm	Language
Preprocessing	Directory Hierarchy Reader	JAVA	Attack Tolerance	JAVA
Modeling	Erdős-Rényi Random	FORTRAN	Error Tolerance	JAVA
	Barabási-Albert Scale-Free	FORTRAN	Betweenness Centrality	JAVA
	Watts-Strogatz Small World	FORTRAN	Site Betweenness	FORTRAN
	Chord	JAVA	Average Shortest Path	FORTRAN
	CAN	JAVA	Connected Components	FORTRAN
	Hypergrid	JAVA	Diameter	FORTRAN
	PRU	JAVA	Page Rank	FORTRAN
Visualization	Tree Map	JAVA	Shortest Path Distribution	FORTRAN
	Tree Viz	JAVA	Watts-Strogatz Clustering Coefficient	FORTRAN
	Radial Tree / Graph	JAVA	Watts-Strogatz Clustering Coefficient Versus Degree	FORTRAN
	Kamada-Kawai	JAVA	Directed k-Nearest Neighbor	FORTRAN
	Force Directed	JAVA	Undirected k-Nearest Neighbor	FORTRAN
	Spring	JAVA	Indegree Distribution	FORTRAN
	Fruchterman-Reingold	JAVA	Outdegree Distribution	FORTRAN
	Circular	JAVA	Node Indegree	FORTRAN
	Parallel Coordinates (demo)	JAVA	Node Outdegree	FORTRAN
Tool	XMGrace		One-point Degree Correlations	FORTRAN
			Undirected Degree Distribution	FORTRAN
			Node Degree	FORTRAN
			k Random-Walk Search	JAVA
			Random Breadth First Search	JAVA
			CAN Search	JAVA

NetworkWorkbench
A Workbench for Network Scientists

Algorithms / Home Page

Main
People
NWB Tool
Update Sites
Custom Fillings

Datasets
Algorithms
Load Data
Sample Data
Analyze Data
Model Data
Visualize Data
Interact with Data

Related Work
FAQ

Statistics
DIGG IT!
reddit! SUBMIT
DEL.icio.us
RSS

Master List of Algorithms
available in the nwb 0.2.0 release.
Please feel free to add relevant algorithms.

Load Data [Edit](#)

Data Formats
IXI²
NWB
Pajek (.net)
GraphML (.xml)
XGMML

Databases
Streaming Data

Sample Data [Edit](#)

Sampling
Cited Reference Search
Snowball Sampling²
Respondent Driven Sampling
Directory Hierarchy Reader

Diagram:
A network diagram showing relationships between 'Jung', 'GraphML', 'text/NWB', 'NWModel', 'A Prefuse', 'B Prefuse', and 'Pajek'. Arrows indicate connections between these nodes.

<https://nwb.slis.indiana.edu/community>

A Potential Future: Science Maps in Action

KIDS first ...



All maps of science are on sale
via <http://scimaps.org>

TOPIC MAP: HOW SCIENTIFIC PARADIGMS RELATE

GEOGRAPHIC MAP: WHERE SCIENCE GETS DONE

You may run your finger over each of these maps to control the lighting on the other: touching a place on the world map will light up topics studied in that place; touching a paradigm on the topic map will light up the places that study that topic.

Nanotechnology

This overlay shows the distribution of nanotechnology within the paradigms of science. The majority of current work in nanotechnology takes place in physics, chemistry, and materials science, at the upper right portion of the map. However, an increasing amount of nanotechnology is being applied in the biological and medical sciences, at the lower right.

All Topics	Nanotechnology	Francis H. C. CRICK	Albert EINSTEIN	Michael E. FISHER	Susan T. FISKE
<i>Sweep through all 776 scientific paradigms</i>	<i>Science on the tiny scale of molecules</i>	<i>Co-discovered DNA's double helix</i>	<i>Revitalized physics with Relativity theories</i>	<i>Models critical phase transitions of matter</i>	<i>Connects perception and stereotypes</i>
Sustainability	Biology & Chemistry	Joshua LEDERBERG	Derek J. de Solla PRICE	Richard N. ZARE	About this display
<i>The science behind our long-term hopes</i>	<i>The interface between these two vital fields</i>	<i>Pioneer in bacterial genetic mechanisms</i>	<i>Known as the "Father of Scientometrics"</i>	<i>Uses laser chemistry in molecular dynamics</i>	<i>People & organizations that helped create it</i>

We sweep slowly through adjoining related topics, lighting up the places in the world that study each topic. You may select a subset of the topics that deal with these three interesting subjects by touching it.


A single person's spreading influence is shown as a series of four snapshots. First, we light only topics and places relating to that person's papers—papers that are still highly cited today. The second lights everything that cites that original work. Next that this first-generation impact extends to far more topics than did the original work. The third snapshot lights science that cites the second, and the fourth lights science that cites the third.

Inventors & Inventions


*Science Puzzle Map for Kids by Fileve Palmer, Julie Smith, Elisha Hardy and Katy Börner, Indiana University, 2006.
 (Base map taken from Illuminated Diagram display by Kevin Boyack, Richard Klavans, and W. Bradford Paley.)*








My Science Story
By _____



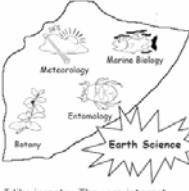
There are seven main fields of science. They are...



social science, mathematics, physics, chemistry, earth science, medicine, and psychology. I like to study earth science.

Color earth science green.

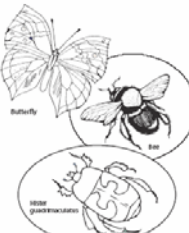
Earth scientists study the weather, plants and trees, marine life, insects, and much more.



I like insects. They are interesting to look at and study.


Color in the insect.

For more information about the map of science for kids or this activity, please contact Kara Bomer (kbomer@indiana.edu) or Tavis Holary (tholar@indiana.edu) at the School of Library and Information Science, Indiana University. These materials were compiled by Tavis Holary in 2006.




Butterfly
Bee
Scorpion

There are many types of insects in the world. Bees, butterflies, and beetles are just a few.



I want to be an **entomologist** when I grow up. Then I can study insects all the time.

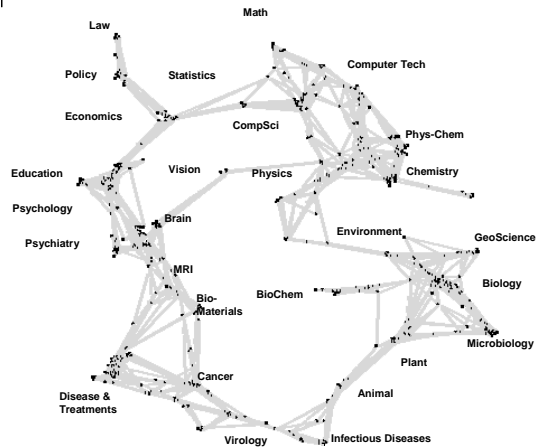
... my SPONSORS next ...



Latest 'Base Map' of Science

Kevin W. Boyack & Richard Klavans, unpublished work.

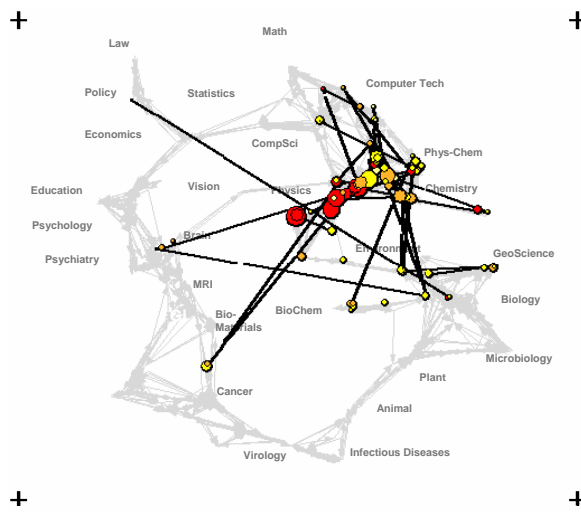
- Uses combined SCI/SSCI from 2002
 - 1.07M papers, 24.5M references, 7,300 journals
 - Bibliographic coupling of papers, aggregated to journals
- Initial ordination and clustering of journals gave 671 clusters
- Coupling counts were reaggregated at the journal cluster level to calculate the
 - (x,y) positions for each journal cluster
 - by association, (x,y) positions for each journal



Science map applications: Identifying core competency

Kevin W. Boyack & Richard Klavans, unpublished work.

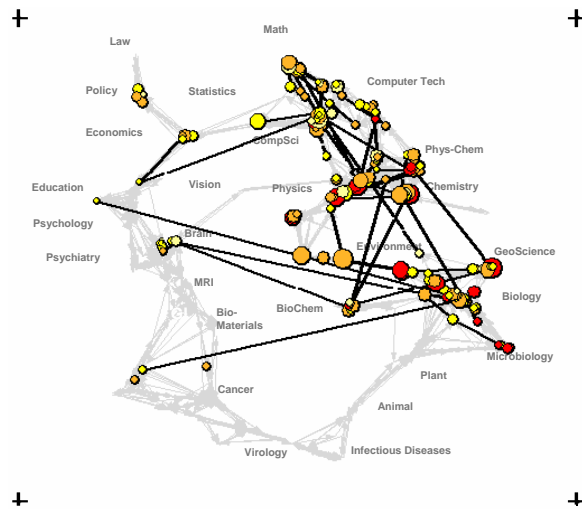
Funding patterns of the US Department of Energy (DOE)



Science map applications: Identifying core competency

Kevin W. Boyack & Richard Klavans, unpublished work.

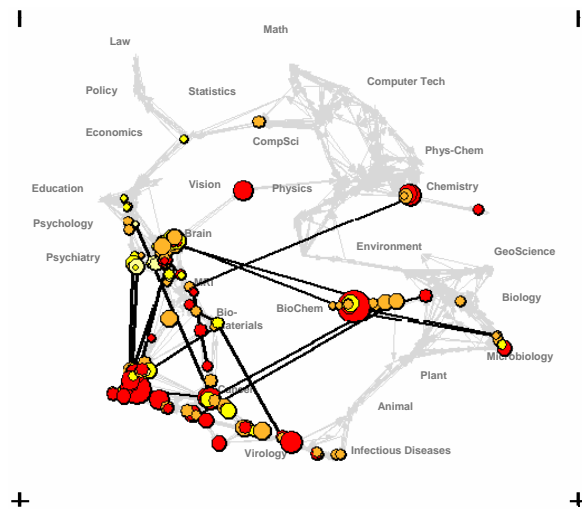
Funding Patterns of the National Science Foundation (NSF)



Science map applications: Identifying core competency

Kevin W. Boyack & Richard Klavans, unpublished work.

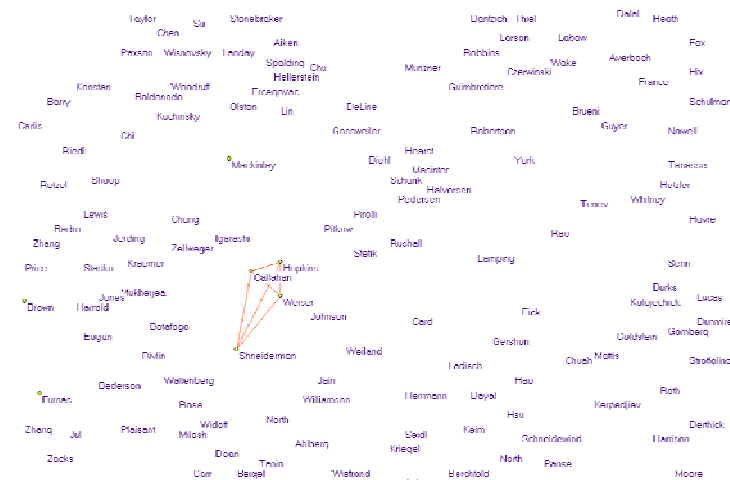
Funding Patterns of the National Institutes of Health (NIH)



... then SCIENTISTS ...

Mapping the Evolution of Co-Authorship Networks

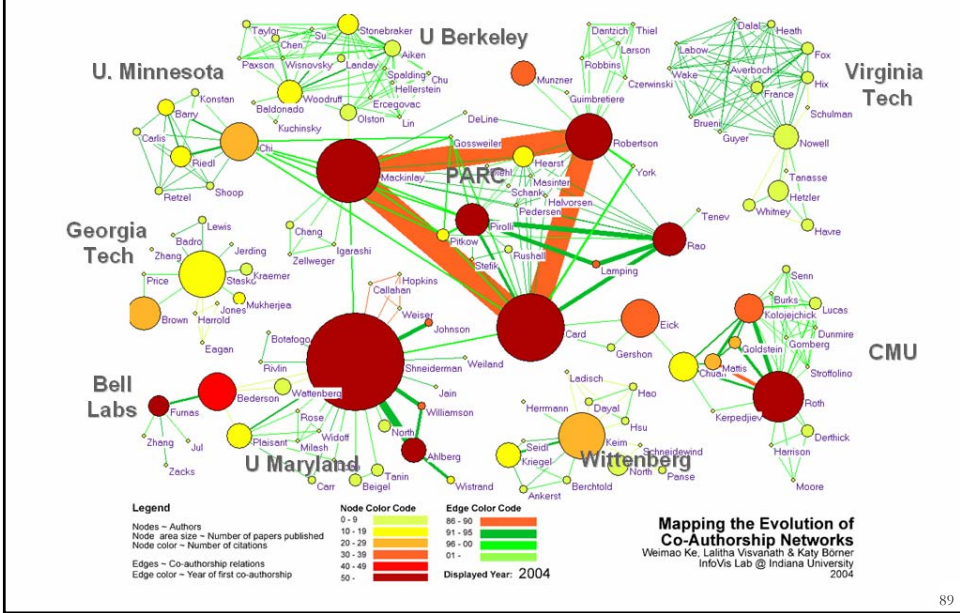
Ke, Viswanath & Börner, (2004) Won 1st price at the IEEE InfoVis Contest.



Mapping the Evolution of Co-Authorship Networks
 Wernoo Ke, Latha Viswanath & Katy Börner
 InfoVis Lab @ Indiana University
 2004

Mapping the Evolution of Co-Authorship Networks

Ke, Viswanath & Borner, (2004) Won 1st price at the IEEE InfoVis Contest



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Lab/Center Management System

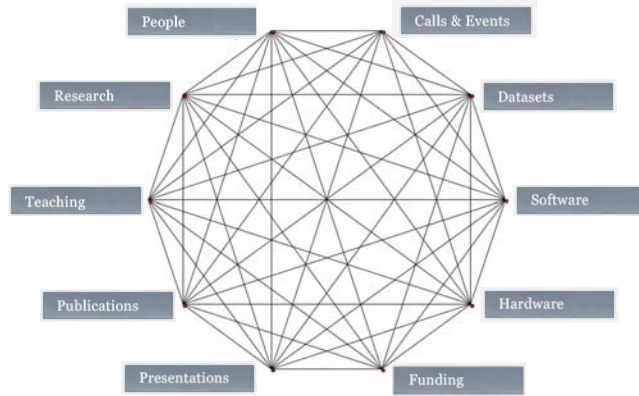
- People
- Research
- Teaching
- Publications
- Presentations

- Calls & Events
- Datasets
- Software
- Hardware
- Funding

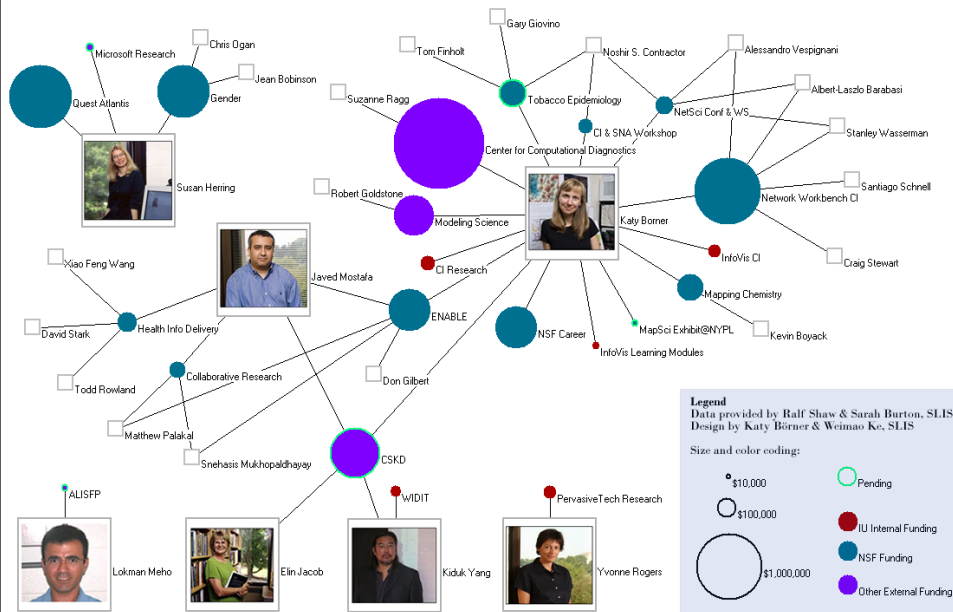
<https://inl.slis.indiana.edu>



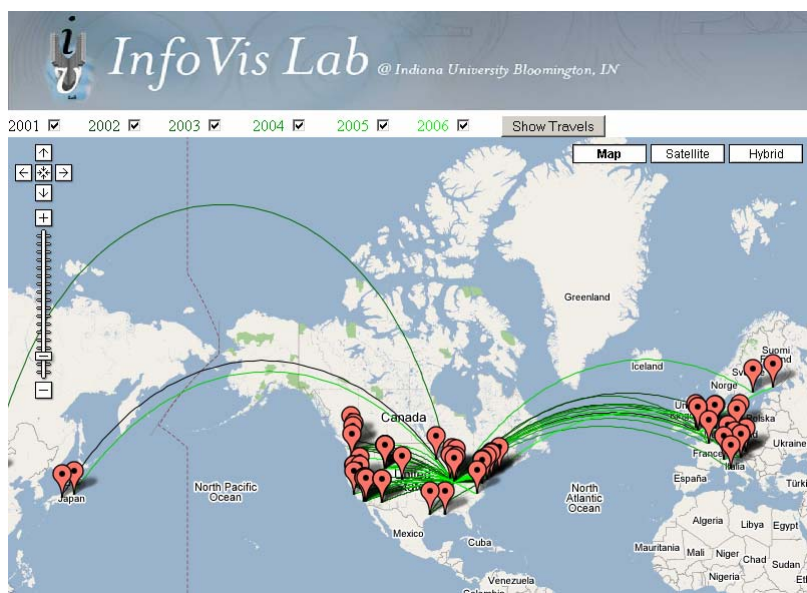
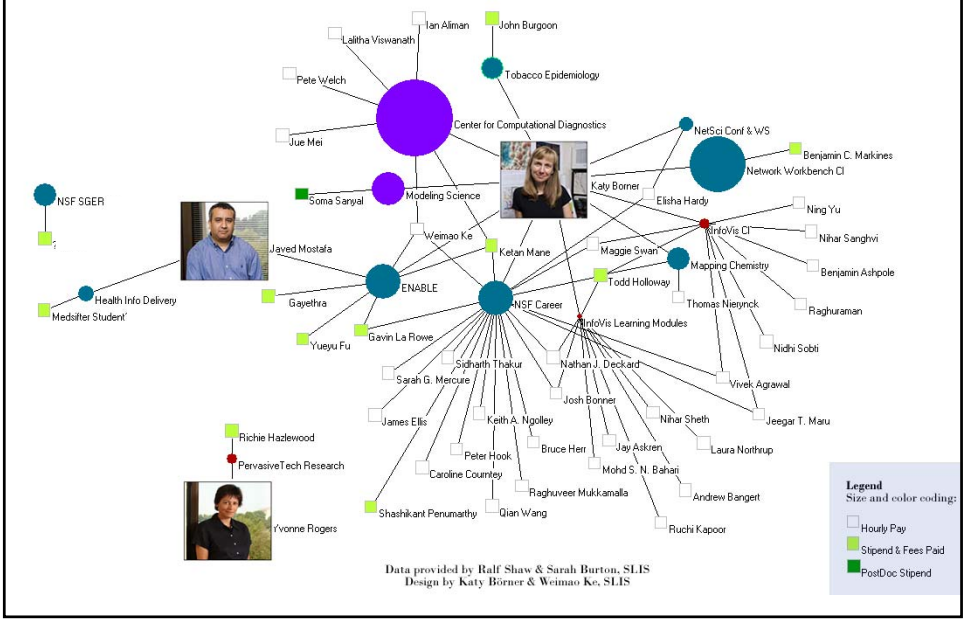
Data Entities and Interlinkages

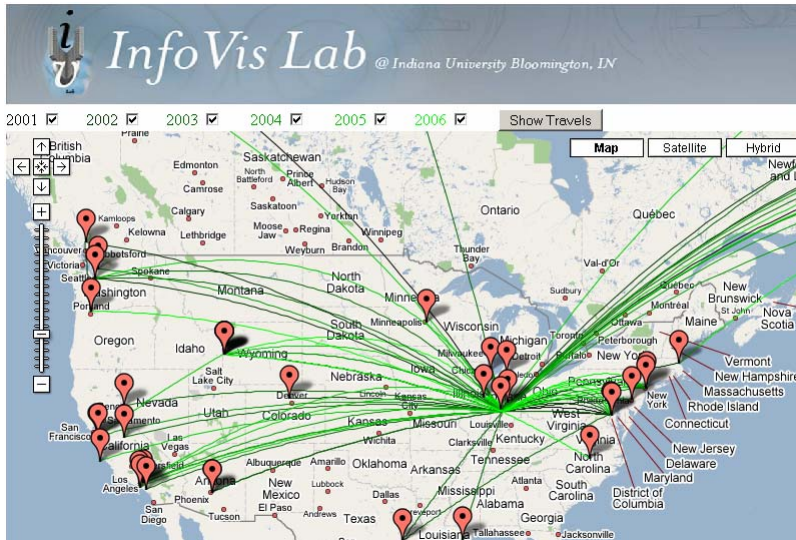


Awarded & Pending Funding of SLIS Faculty Members in January 2006

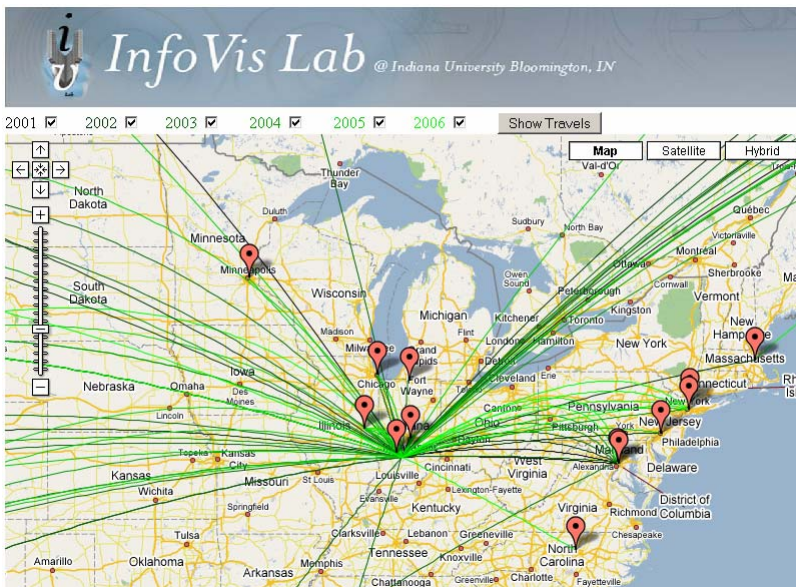


Student Support by SLIS Faculty Members in January 2006

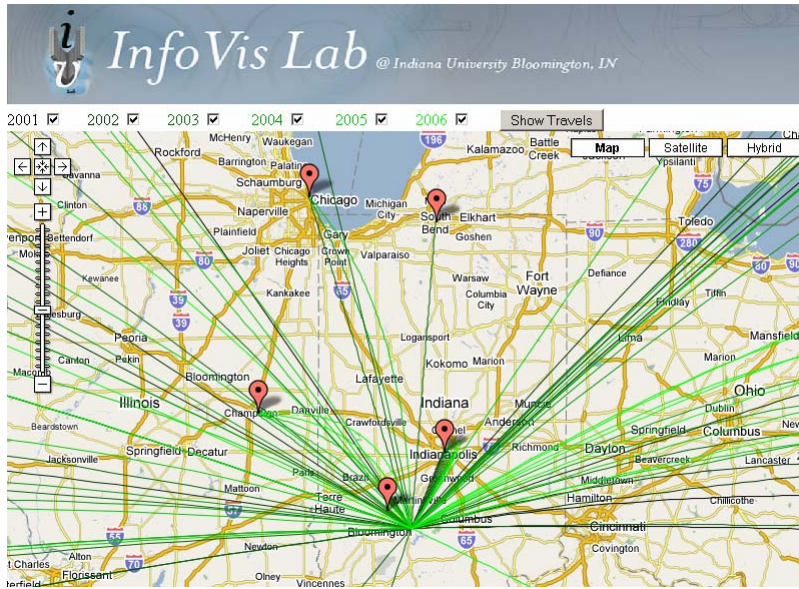




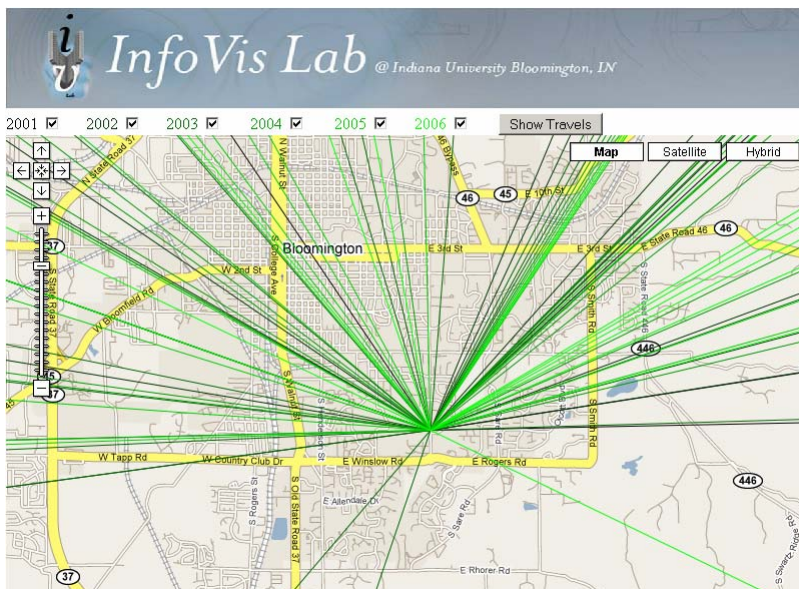
By Thomas Neiryck, 2007.



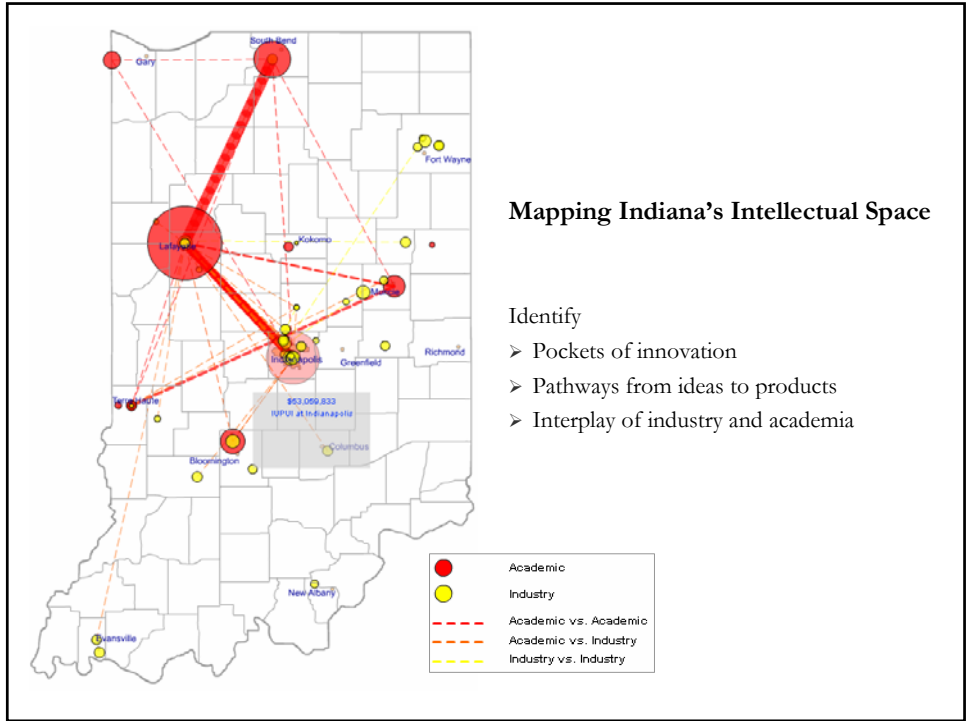
By Thomas Neiryck, 2007.



By Thomas Neiryck, 2007.



By Thomas Neiryck, 2007.



The End.

How to Make a Science Map

DATA EXTRACTION	UNIT OF ANALYSIS	MEASURES	LAYOUT (often one code does both similarity and ordination steps)		DISPLAY
			SIMILARITY	ORDINATION	
SEARCHES ISI INSPEC Eng Index Medline ResearchIndex Patents etc.	COMMON CHOICES Journal Document Author Term	COUNTS/FREQUENCIES Attributes (e.g. terms) Author citations Co-citations By year THRESHOLDS By counts	SCALAR (unit by unit matrix) Direct citation Co-citation Combined linkage Co-word / co-term Co-classification VECTOR (unit by attribute matrix) Vector space model (words/terms) Latent Semantic Analysis (words/terms) ind. Singular Value Decomp (SVD) CORRELATION (if desired) Pearson's R on any of above	DIMENSIONALITY REDUCTION Eigenvector/ Eigenvalue solutions Factor Analysis (FA) and Principal Components Analysis (PCA) Multi-dimensional scaling (MDS) LSA Pathfinder networks (PFNet) Self-organizing maps (SOM) includes SOM, ET-maps, etc. CLUSTER ANALYSIS SCALAR Triangulation Force-directed placement (FDP)	INTERACTION Browse Pan Zoom Filter Query Detail on demand ANALYSIS
BROADENING By citation By terms					

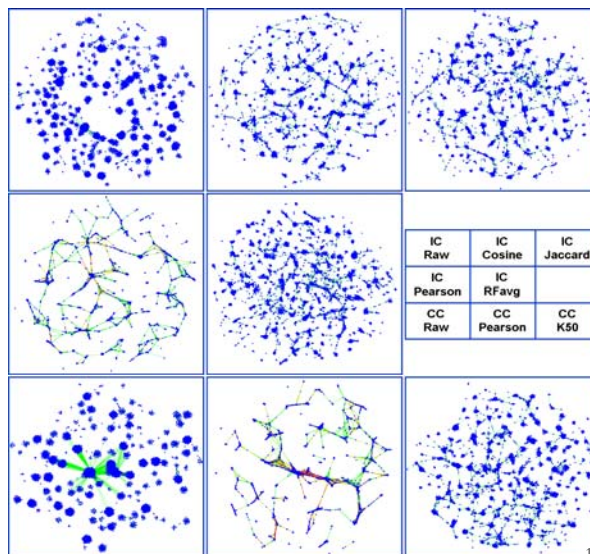
Shiffrin, Richard M. and Börner, Katy (Eds.) (2004). Mapping Knowledge Domains. Proceedings of the National Academy of Sciences of the United States of America, 101(Suppl_1).

Börner, Katy, Chen, Chaomei, and Boyack, Kevin. (2003). Visualizing Knowledge Domains. In Blaise Cronin (Ed.), Annual Review of Information Science & Technology, Volume 37, Medford, NJ: Information Today, Inc./ American Society for Information Science and Technology, chapter 5, pp. 179-255.



Comparison of Similarity Metrics

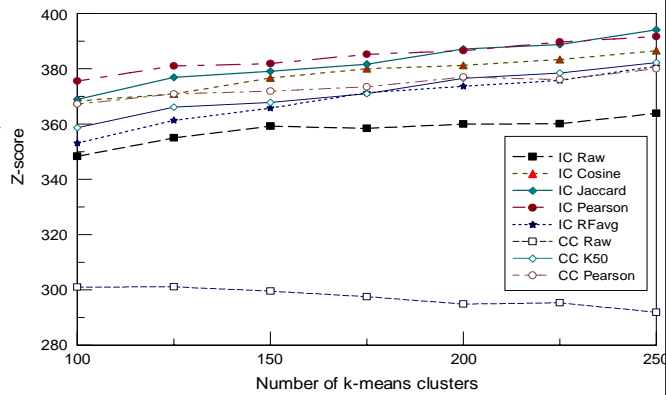
- ISI file year 2000, SCI and SSCI: 7,121 journals.
- Different similarity metrics
 - Inter-citation (raw counts, cosine, modified cosine, Jaccard, RF, Pearson)
 - Co-citation (raw counts, cosine, modified cosine, Pearson)
- Maps were compared based on
 - regional accuracy,
 - the scalability of the similarity algorithm, and
 - the readability of the layouts.



Boyack, Kevin W., Klavans, R. and Börner, Katy. (2005). Mapping the Backbone of Science. Scientometrics. 64(3), 351-374.

Selecting the similarity measure with the best regional accuracy

- For each similarity measure, the VxOrd layout was subjected to k-means clustering using different numbers of clusters.
- Resulting cluster/category memberships were compared to actual category memberships using entropy/mutual information method by Gibbons & Roth, 2002.
- Increasing Z-score indicates increasing distance from a random solution.
- Most similarity measures are within several percent of each other.

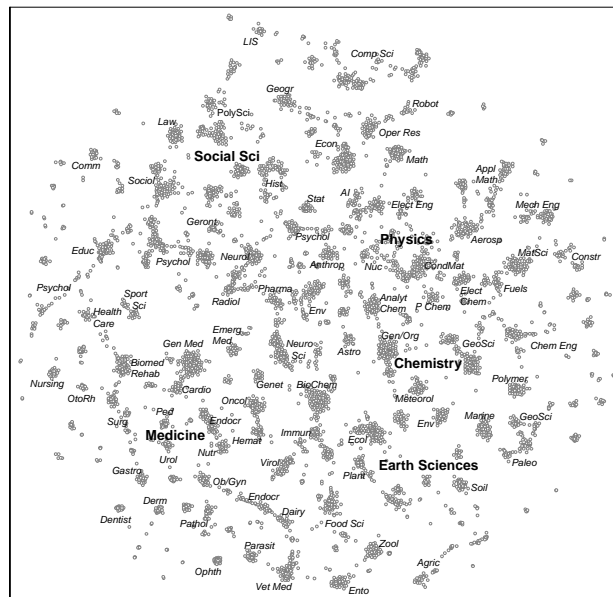


Boyack, Kevin W., Klavans, R. and Börner, Katy. (2005).
Mapping the Backbone of Science. *Scientometrics*. 64(3), 351-374.

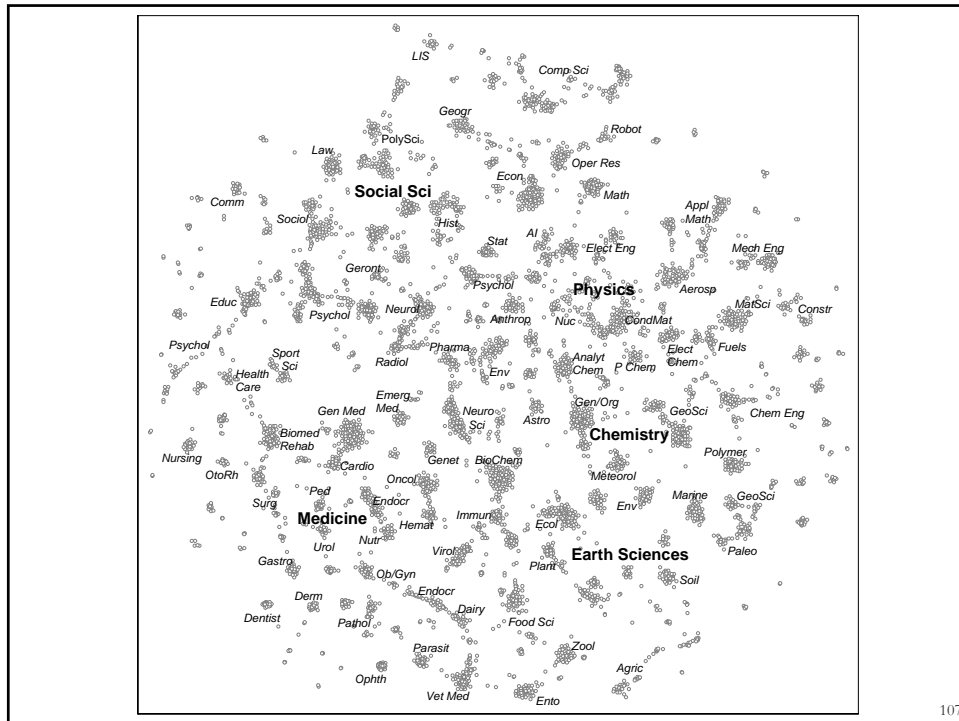
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A 'Backbone' Map of Science & Social Science

- The map is comprised of 7,121 journals from year 2000.
- Each dot is one journal
- An *IC-Jaccard* similarity measure was used.
- Journals group by discipline.
- Groups are labeled by hand.
- Large font size labels identify major areas of science.
- Small labels denote the disciplinary topics of nearby large clusters of journals.



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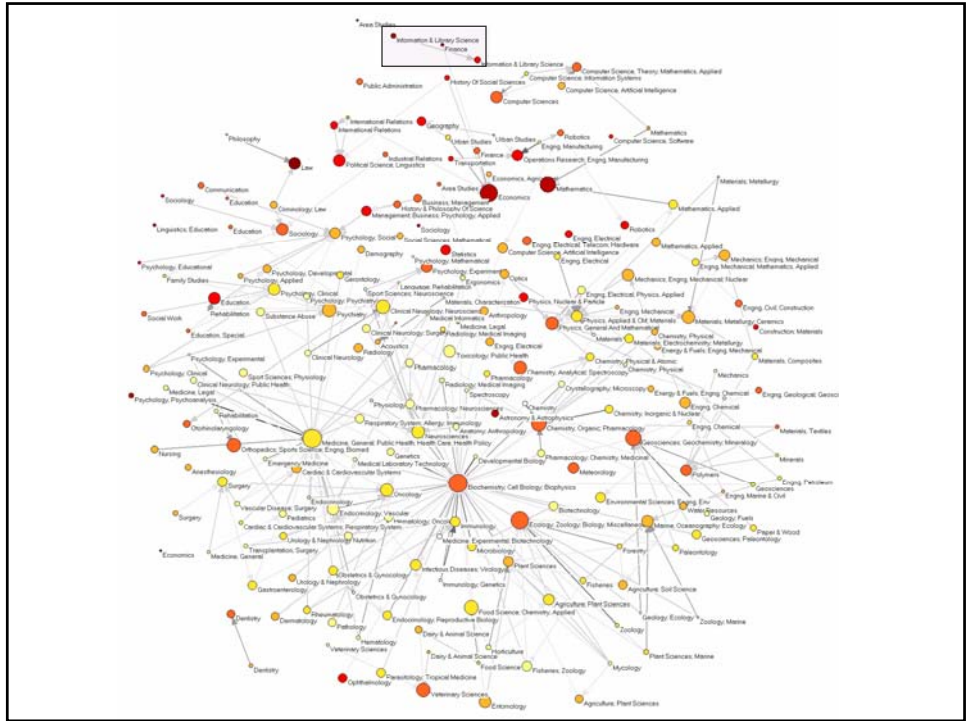
107

Structural Map: Studying Disciplinary Diffusion

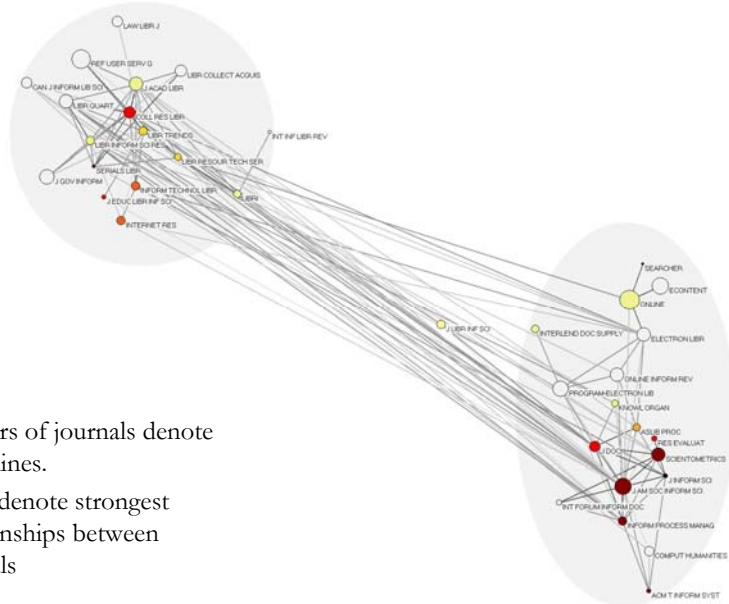
- The 212 nodes represent clusters of journals for different disciplines.
- Nodes are labeled with their dominant ISI category name.
- Circle sizes (area) denote the number of journals in each cluster.
- Circle color depicts the independence of each cluster, with darker colors depicting greater independence.
- Lines denote strongest relationships between disciplines (citing cluster gives more than 7.5% of its total citations to the cited cluster).



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Zoom Into Structural Map



- Clusters of journals denote disciplines.
- Lines denote strongest relationships between journals

Information Visualization CyberInfrastructure

The InfoVis CyberInfrastructure provides access to data, software code and learning modules as well as computing resources in support of the analysis, modeling and visualization of diverse data sets.

DATABASES
An InfoVis database provides access to publications, papers, grants and grant opportunities. The database is continuously and automatically updated.

SOFTWARE
An open source IVC framework was designed to facilitate the integration of diverse data analysis, modeling and visualization algorithms. New algorithms, data persistence methods, links and links to the literature and more analysis tools can be easily integrated in a "plug-and-play" manner.

COMPUTING RESOURCES
The InfoVis CyberInfrastructure is hosted at Indiana University's Research Institute for Computational Science (RICE), consisting of three Sun T5200 server racks, 12 blades, processors and 96 GB of memory each. A 750 Watt Advanced Energy Efficient Data Center, A Rack with 1000 Watts of power and 1000 Watts of cooling, will have been used for the duration of the project.

LEARNING MODULES
A set of associated learning modules aims to equip learners with a practical skill set for processing, analyzing and visualizing diverse network techniques and design theories, and to quickly generate and compare information visualizations.

CAREER: *Visualizing Knowledge Domains*, NSF IIS-0238261 award (Katy Börner, \$440,000) Sept. 03-Aug. 08. <http://iv.slis.indiana.edu/>

NetworkWorkbench

A Workbench for Network Scientists

SEI: *Network Workbench: A Large-Scale Network Analysis, Modeling and Visualization Toolkit for Biomedical, Social Science and Physics Research*, NSF IIS-0513650 award (Katy Börner, Albert-László Barabási, Santiago Schnell, Alessandro Vespignani & Stanley Wasserman, Craig Stewart (Senior Personnel), \$1,120,926) Sept. 05 - Aug. 08. <http://nwb.slis.indiana.edu>

HPNAP High Performance Networks Applications Program