# NetworkWorkbench

A Workbench for Network Scientists

# Network Workbench Tool For Network Analysis, Modeling, and Visualization

#### Four-Hour Workshop

Katy Börner and the NWB Team @ IUB

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Network Workbench (http://nwb.slis.indiana.edu).



#### The Changing Scientific Landscape

- Star Scientist -> Research Teams: In former times, science was driven by key scientists. Today, science is driven by effectively collaborating co-author teams often comprising expertise from multiple disciplines and several geospatial locations (Börner, Dall'Asta, Ke, & Vespignani, 2005; Shneiderman, 2008).
- Users -> Contributors: Web 2.0 technologies empower anybody to contribute to Wikipedia and to exchange images and videos via Fickr and YouTube. WikiSpecies, WikiProfessionals, or WikiProteins combine wiki and semantic technology in support of real time community annotation of scientific datasets (Mons et al., 2008).
- *Cross-disciplinary:* The best tools frequently borrow and synergistically combine methods and techniques from different disciplines of science and empower interdisciplinary and/or international teams of researchers, practitioners, or educators to fine-tune and interpret results collectively.
- **One Specimen -> Data Streams:** Microscopes and telescopes were originally used to study one specimen at a time. Today, many researchers must make sense of massive streams of multiple types of data with different formats, dynamics, and origin.
- Static Instrument -> Evolving Cyberinfrastructure (CI): The importance of hardware instruments that are rather static and expensive decreases relative to software infrastructures that are highly flexible and continuously evolving according to the needs of different sciences. Some of the most successful services and tools are decentralized increasing scalability and fault tolerance.
- **Modularity:** The design of software modules with well defined functionality that can be flexibly combined helps reduce costs, makes it possible to have many contribute, and increases flexibility in tool development, augmentation, and customization.
- **Standardization:** Adoption of standards speeds up development as existing code can be leveraged. It helps pool resources, supports interoperability, but also eases the migration from research code to production code and hence the transfer of research results into industry applications and products.
- *Open data and open code:* Lets anybody check, improve, or repurpose code and eases the replication of scientific studies.



#### **Desirable Features of Plug-and-Play Macroscopes**

*Division of Labor:* Ideally, labor is divided in a way that the expertise and skills of computer scientists are utilized for the design of standardized, modular, easy to maintain and extend "core architecture". Dataset and algorithm plugins, i.e., the "filling", are initially provided by those that care and know most about the data and developed the algorithms: the domain experts.

- *Ease of Use:* As most plugin contributions and usage will come from non-computer scientists it must be possible to contribute, share, and use new plugins without writing one line of code. Wizard-driven integration of new algorithms and data sets by domain experts, sharing via email or online sites, deploying plugins by adding them to the 'plugin' directory, and running them via a Menu driven user interfaces (as used in Word processing systems or Web browsers) seems to work well.
- **Plugin Content and Interfaces:** Should a plugin represent one algorithm or an entire tool? What about data converters needed to make the output of one algorithm compatible with the input of the next? Should those be part of the algorithm plugin or should they be packaged separately?
- **Supported (Central) Data Models:** Some tools use a central data model to which all algorithms conform, e.g., Cytoscape, see Related Work section. Other tools support many internal data models and provide an extensive set of data converters, e.g., Network Workbench, see below. The former often speeds up execution and visual rendering while the latter eases the integration of new algorithms. In addition, most tools support an extensive set of input and output formats.
- *Core vs. Plugins:* As will be shown, the "core architecture" and the "plugin filling" can be implemented as sets of plugin bundles. Answers to questions such as: "Should the graphical user interface (GUI), interface menu, scheduler, or data manager be part of the core or its filling?" will depend on the type of tools and services to be delivered.
- **Supported Platforms:** If the software is to be used via Web interfaces then Web services need to be implemented. If a majority of domain experts prefers a stand-alone tool running on a specific operating system then a different deployment is necessary.

banch für Natwork Scienlins	Project Details
Investigators:	Katy Börner, Albert-Laszlo Barabasi, Santiago Schnell, Alessandro Vespignani & Stanley Wasserman, Eric Wernert
Software Team:	Lead: Micah Linnemeier
	Members: Patrick Phillips, Russell Duhon, Tim Kelley & Ann McCranie
	Previous Developers: Weixia (Bonnie) Huang, Bruce Herr, Heng Zhang, Duygu Balcan, Bryan Hook, Ben Markines, Santo Fortunato, Felix Terkhorn, Ramya Sabbineni, Vivek S. Thakre & Cesar Hidalgo
Goal:	Develop a large-scale network analysis, modeling and visualization toolkit for physics, biomedical, and social science research.
Amount:	\$1,120,926, NSF IIS-0513650 award
Duration:	Sept. 2005 - Aug. 2009
Website:	http://nwb.slis.indiana.edu

# NetworkWorkbench

# Project Details (cont.)

#### **NWB Advisory Board:**

James Hendler (Semantic Web) <u>http://www.cs.umd.edu/~hendler/</u> Jason Leigh (CI) <u>http://www.evl.uic.edu/spiff/</u> Neo Martinez (Biology) <u>http://online.sfsu.edu/~webhead/</u> Michael Macy, Cornell University (Sociology) <u>http://www.soc.cornell.edu/faculty/macy.shtml</u> Ulrik Brandes (Graph Theory) <u>http://www.inf.uni-konstanz.de/~brandes/</u> Mark Gerstein, Yale University (Bioinformatics) <u>http://bioinfo.mbb.yale.edu/</u>

Stephen North (AT&T) <u>http://public.research.att.com/viewPage.cfm?PageID=81</u> Tom Snijders, University of Groningen <u>http://stat.gamma.rug.nl/snijders/</u> Noshir Contractor, Northwestern University <u>http://www.spcomm.uiuc.edu/nosh/</u>



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# **VetworkWorkbenc**

## Resources

**Publications** 

o http://nwb.slis.indiana.edu/pub.html

Community Wiki, Tutorials, FAQ

- o https://nwb.slis.indiana.edu/community
- o http://nwb.slis.indiana.edu/doc.html
- o GUESS Manual http://guess.wikispot.org/manual

#### Software

- o http://cishell.org
- o http://nwb.slis.indiana.edu/download.html

**Developer Resources** 

o http://cns-trac.slis.indiana.edu/trac/nwb

# NetworkWorkbench

## Outline

- 1. Exemplary Network Science Research by NWB PIs
  - Computational Proteomics
  - Computational Economics
  - Computational Social Science
  - Computational Scientometrics
  - Computational Epidemics
- 2. NWB Tool Challenges and Opportunities
- 3. NWB Tool Overview
- 4. NWB Tool for Scientometrics Research
- 5. Discussion of Future Work

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#### **Computational Proteomics**

What relationships exist between protein targets of all drugs and all disease-gene products in the human protein—protein interaction network?

Yildriim, Muhammed A., Kwan-II Goh, Michael E. Cusick, Albert-László Barabási and Marc Vidal. (2007) Drug-target Network. Nature Biotechnology 25 no. 10: 1119-1126.



Network Workbench (http://nwb.slis.indian



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Figure 2 Ung-target network (U) network). Ine U) network is generated by Using me known associations between PUA-approve drugs and their target proteins. Circles and rectangles correspond to drugs and target proteins, respectively. A link is placed between a drug node and a target node if the protein is a known target of that drug. The area of the drug (protein) node is proportional to the number of targets that the drug has (the number of drugs targeting the protein). Color codes are given in the legend. Drug nodes (circles) are colored according to their Antomical Therapeutic Chemical Classification, and the target proteins (rectanglar boxes) are colored according to their cellular component obtained from the Gene Otology database.



Second sight

## **Computational Social Science**

Studying large scale social networks such as Wikipedia

#### Vizzards 2007 Entry

Second Sight: An Emergent Mosaic of Wikipedian Activity, The NewScientist, May 19, 2007





## **Computational Scientometrics**



## **Computational Epidemics**

Forecasting (and preventing the effects of) the next pandemic.

Epidemic Modeling in Complex realities, V. Colizza, A. Barrat, M. Barthelemy, A. Vespignani, Comptes Rendus Biologie, 330, 364-374 (2007).

Reaction-diffusion processes and metapopulation models in heterogeneous networks, V.Colizza, R. Pastor-Satorras, A.Vespignani, Nature Physics 3, 276-282 (2007).

Modeling the Worldwide Spread of Pandemic Influenza: Baseline Case and Containment Interventions, V. Colizza, A. Barrat, M. Barthelemy, A.-J. Valleron, A.Vespignani, PloS-Medicine 4, e13, 95-110 (2007).



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# etworkWorkbench 2. NWB Challenges and Opportunities

#### 0 Data

- Different data formats
- Different data models
- o Algorithms
  - Different research purposes (preprocessing, modeling, analysis, visualization, clustering)
  - Different implementations of the same algorithm
  - Different programming languages
  - Algorithm developers/users are not computer scientists
- o Different tools (Pajek, UCINet, Guess, Cytoscape, R, ...)
- o Different communities, practices, cultures

#### Network Workbench (http://nwb.slis.indiana.edu).

# kbend

# **NWB** Deliverables

#### **Network Workbench (NWB) Tool**

- o A network analysis, modeling, and visualization toolkit for physics, biomedical, and social science research.
- o Install and run on multiple Operating Systems.
- o Supports many file formats.
- o Easy integration of new algorithms thanks to CIShell/OSGi.

#### Cyberinfrastructure Shell (CIShell)

- An open source, software framework for the integration and utilization of datasets, algorithms, tools, and computing resources.
- Extends OSGi industry standard.





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

#### OSGi (http://www.osgi.org) is

Back Spect - Strad.

Network Workbench (http://nwb.slis.indiana.edu).

- A standardized, component oriented, computing environment for networked services.
- Successfully used in the industry from high-end servers to embedded mobile devices since 8 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 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.

# letworkWorkbench

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#### **NWB Community Wiki**

- A place for users of the NWB Tool, the Cyberinfrastructure Shell (CIShell). or any other CIShell-based program to request, obtain, contribute, and share algorithms and datasets.
- All algorithms and datasets that are available via the NWB Tool have been  $\geq$ well documented in the Community Wiki.

Network Workbench (http://nwb.slis.indiana.edu).

NetworkWorkbench

## Network Workbench Tool

http://nwb.slis.indiana.edu

Downloads for NWB Tool Releases 35,000 in Aug 09 20,000 The Network Workbench (NWB) tool supports researchers, educators, and Cumulative Tota practitioners interested in the study of Number of Downloads per Month 15,000 biomedical, social and behavioral science, physics, and other networks. In Aug. 2009, the tool provides more 160 y Workbench: Al 10,000 Network Workbench: A Large-Sca Toolkit for Biomedical, Social Scie evaluate, and operate a unique di scale network analysis, modeling, (NWB). The envisioned data-code plugins that support the preprocessing, analysis, modeling, and visualization of more How to cite this project networks. 5.000 More than 40 of these plugins can be News & Updates 5.1.09 Kaelble, Steve. 2009. Ma applied or were specifically designed for Knowledge, Research & Ci (website accessed 5/1/09) S&T studies. 8.05 3.23.09 1.0.0 beta 5 Released Oct Dec-o8 It has been downloaded more than 35,000 1.23.09 Ann Mcranie's <u>tutorial abs</u> 2009 Time times since Dec. 2006. 11.4.08 Two NWB PIs featured in "<u>Connected—The</u> <u>Power of Six Degrees</u>," 2008. Anna Maria Talas, Director, Australian Broadcasting Corporation, Ltd. (YouTube) [Full Video (300MB)) Getting Started See more documentation

Herr II, Bruce W., Huang, Weixia (Bonnie), Penumarthy, Shashikant & Börner, Katy. (2007). Designing Highly Flexible and Usable Cyberinfrastructures for Convergence. In Bainbridge, William S. & Roco, Mihail C. (Eds.), Progress in Convergence - Technologies for Human Wellbeing (Vol. 1093, pp. 161-179), Annals of the New York Academy of Sciences, Boston, MA.

Get involved



# NetworkWorkbench NWB Tool: Supported Data Formats

#### Personal Bibliographies

- Bibtex (.bib) ≻
- ≻ Endnote Export Format (.enw)

#### **Data Providers**

- >Web of Science by Thomson Scientific/Reuters (.isi)
- Scopus by Elsevier (.scopus)
- $\triangleright$ Google Scholar (access via Publish or Perish save as CSV, Bibtex, EndNote)
- ≻ Awards Search by National Science Foundation (.nsf)

#### Scholarly Database (all text files are saved as .csv)

- Medline publications by National Library of Medicine  $\geq$
- $\geq$ NIH funding awards by the National Institutes of Health (NIH)
- NSF funding awards by the National Science Foundation (NSF)
- $\triangleright$ U.S. patents by the United States Patent and Trademark Office (USPTO)
- ≻ Medline papers - NIH Funding

#### **Network Formats**

- >NWB (.nwb)
- Pajek (.net)
- GraphML (.xml or .graphml)
- XGMML (.xml)

#### **Burst Analysis Format**

≻ Burst (.burst)

#### **Other Formats**

- CSV (.csv)
- > Edgelist (.edge)
- Pajek (.mat)
- TreeML (.xml) >

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#### NWB Tool: Algorithms (July 1st, 2008)

See https://nwb.slis.indiana.edu/community and handout for details.

#### Preprocessing Edit

Remove Nodes Extract Top Nodes Extract Nodes Above or Below Val Delete High Degree Nodes Delete Random Nodes Delete Isolates Remove Edges Extract Top Edges Extract Edges Above or Below Val Remove Self Loops Trim By Degree? Pathfinder Network Scaling Sampling Snowball Sampling (n nodes) Node Sampling Edge Sampling Transformations Symmetrize

#### Dichotomize Multipartite Joining

#### Modeling Edit General Random Graph Watts-Strogatz Small World Barabási-Albert Scale-Free Structured CAN Chord Unstructured Hypergrid PRU Other TARL Discrete Network Dynamics

Analysis Edit General Purpose Network Analysis Toolkit<sup>2</sup> Unweighted & Undirected Based on degree/ Node Degree Node Distribution **Based on clustering** k-Nearest Neighbor Watts Strogatz Clustering Coefficient Watts Strogatz Clustering Coefficient Over k Based on path Diameter Average Shortest Path Shortest Path Distribution Node Betweenness Centrality Based on components Connected Components Weak Component Clustering K-Core Extract K-Core? Annotate K-Coreness **Unweighted & Directed Based on degree** Node Indegree Node Outdearee Indegree Distribution Outdegree Distribution Based on local graph structure k-Nearest Neighbor Single Node In-Out Degree Correlations **Unnamed Category?** 

Page Rank Based on local graph structure #2 Dyad Reciprocity? Arc Reciprocity?

tion Edit

Tools GUESS <u>GnuPlot</u>? **Predefined Positions Layout** DrL (VxOrd) Pre-defined Positions (prefuse beta)? Move Circular **Tree Layouts** Radial Tree (prefuse alpha) Radial Tree with Annotations (prefuse beta)? Tree Map Tree View Balloon Graph (prefuse alpha)<sup>2</sup> **Network Layouts** Force Directed with Annotation (prefuse beta) Kamada-Kawai (JUNG) Fruchterman-Reingold (JUNG) Fruchterman-Reingold with Annotation (prefuse beta) Spring (JUNG) Small World (prefuse alpha) **Other Layouts** Parallel Coordinates (demo)? LaNet (k-Core Decomposition) etrics Edit Extract Network From Table Extract Co-Authorship Network Extract Co-Occurrence Network From Table? Extract Directed Network From Table **Extract Network From Another Network** Extract Bibliographic Coupling Similarity Network Extract Co-Citation Similarity Network<sup>2</sup> Cleaning

Remove ISI Duplicate Records

# NetworkWorkbench NWB Tool: Output Formats

- NWB tool can be used for data conversion. Supported output formats comprise:
- ► CSV (.csv)
- ► NWB (.nwb)
- Pajek (.net)
- Pajek (.mat)
- GraphML (.xml or .graphml)
- ➤ XGMML (.xml)

#### GUESS

Supports export of images into common image file formats.

- Horizontal Bar Graphs
- saves out raster and ps files.





# NetworkWorkbench

## **NWB Tool Overview**

- 1. Download, install, and run.
- 2. Load, view, convert, save data.
- 3. Read and visualize a directory hierarchy.
- 4. Load a network, compute its basic properties, and explore it in GUESS.



# NWB Tool Interface Components

E Console		VISUAlización Delence	ometrics Help		
Welcome to visualization The Network IIS-0513650 Schnell, Dr The NWB to Balcan, Mari Ramawat, C Vespignani, Cyberinfrasl	Console displa (save, load, vii of small, n algorithm inpu selection, & ac well as error re award. The primary investig Alessandro Vespignani, Dr. 5 Il was developed by Weixia I ano Beiró, Bruce Herr, Santo ésar Hidalgo, Ramya Sabbin and Katy Börner. It uses the ructure for Network Science	ys data operations ww.etc.) and parameters, knowledgements as porting. acors are Dr. Kacy Domi- tanley Wasserman, and tuang, Russell Duhon, M Fortunato, Ben Markine ani, Vivek Thakres, Soma Cyberinfrastructure Sh- Center (http://cns.sli	preprocessing, modeling, analysis is supported in part by the NSF er, Dr. Albert-László Barabási, Dr. S Dr. Firk A. Wernert. Nach Linnemeier, Timothy Kelley, Du ss, Felix Terkhorn, Heng Zhang, Meç a Sanyal, Ann McCranie, Alessandro a Sanyal, Ann McCranie, Alessandro s.indiana.edu) at Indiana Universi	A antiago ygu ha at the ty.	track of vailable tation
Please cite a NWB Team. http://nwb	s fallows: (2006). Network Workbench sils indiana.edu <b>Scheduler</b> lists used and disp progress.	Tool. Indiana University what algorithms you'v lays algorithm teel automaticativ	e all completed	Table Matrix Plot Text	
	Algorithm Name	Date	Time % Complet	e GUESS	
ench (http://	wb.slis.indiana.edu).				
rkw	orkbench	File, Pre	eprocessing, Mo	deling, and Visualiz	ation Me

Load and Clean ISI File Read Directory Hierarchy Datasets	Extract Nodes Above or Below Value Remove Node Attributes Delete High Degree Nodes Delete Random Nodes Delete Isolates Extract Top Edges	Watts-Strogatz Small World Barabási-Albert Scale-Free	GnuPlot
		Can Chord Hypergrid	DrL (V×Ord) Specified (prefuse beta)
Save			Circular (JUNG)
View View with		PRU	Radial Tree/Graph (prefuse alpha)
Merge Node and Edge Files	Remove Edge Attributes	TARL	Radial Tree/Graph with Annotation (prefuse beta)
Split Graph to Node and Edge Files	Remove Self Loops Trim by Degree Snowball Sampling (n nodes) Node Sampling	Discrete Network Dynamics (DND)	Tree View (prefuse beta) Tree View (prefuse beta)
Tests		Evolving Network (Weighted)	Balloon Graph (prefuse alpha)
Preferences			Force Directed with Annotation (prefuse beta)
Exit	Edge Sampling		Kamada-Kawai (JUNG) Eruchterman-Reingold (JUNG)
	Symmetrize		Fruchterman-Reingold with Annotation (prefuse beta
	Dichotomize		Spring (JUNG) Small Warld (profilice plabe)
Multipartite Joining Normalize Text Slice Table by Time	Normalize Text Slice Table by Time		Parallel Coordinates (demo)
-		_	LaNet
			Circular Hierarchy

NetworkWorkbench

Analysis	Unweighted and Undirected			
letwork Analysis Toolkit (NAT) Inweighted and Undirected	Node Degree Degree Distribution	]		
Veighted and Undirected		Weighted and Undirected		
Inweighted and Directed Veighted and Directed	Watts-Strogatz Clustering Coefficient Watts Strogatz Clustering Coefficient over K	Clustering Coefficient Nearest Neighbor Degree		
earch iscrete Network Dynamics 'extual	Diameter Average Shortest Path Shortest Path Distribution Node Betweenness Centrality Global Connected Components HITS	Strength vs Degree Degree & Strength Average Weight vs End-point Degree K-Nearest Neighbor (Java) Strength Distribution Weight Distribution Bandomize Weighte		
Unweighted and Directed	Weak Component Clustering Blondel Community Detection	MST-Pathfinder Network Scaling Fast Pathfinder Network Scaling		
Node Indegree Node Outdegree	MST-Pathfinder Network Scaling	Blondel Community Detection	Analysis Menu	
Indegree Distribution Extract K-Core Outdegree Distribution Annotate K-Coreness	Extract K-Core Annotate K-Coreness		and Submenus	
K-Nearest Neighbor	rrelations	Search		
PageRank HITS	Discrete Network Dynamics	Can Chord k Random-Walk		
Dyad Reciprocity Arc Reciprocity Adjacency Transitivity	Extract and Annotate Attractors	Random Breadth First		
Weak Component Clustering Strong Component Clustering	Weighted and Directed HITS	Textual		
Blondel Community Detection	Weighted PageRank	Burst Detection		
Extract K-Core	Fast Pathfinder Network Scaling			
Annotate K-Coreness	Blondel Community Detection			



portable command-line driven interactive data and function plotting utility http://www.gnuplot.info/. exploratory data analysis and visualization tool for graphs and networks.

https://nwb.slis.indiana.edu/community/?n =VisualizeData.GUESS.



#### NWB Ecology of Data Formats and Converters

Not shown are **15** sample datasets, **45** data preprocessing, analysis, modeling and visualization algorithms, **9** services.





# Sample Datasets

The '*\*yournwbdirectory\*/sampledata*' directory provides sample datasets from the biology, network, scientometics, and social science research domains:

/biology
/network
/scientometrics
/scientometrics/bibtex
/scientometrics/csv
/scientometrics/endnote
o FourNetSciResearchers.isi
/scientometrics/nsf
o Cornell.nsf
o Indiana.nsf
o Michigan.nsf
/scientometrics/scopus
/socialscience
o florentine nwb

Property Files and Python Scripts

The blue ones are used in this tutorial.

#### The '\*yournwbdirectory\*/" directory also contains

/sampledata/scientometrics/properties // Used to extract networks and merge data

- o bibtexCoAuthorship.properties
- o endnoteCoAuthorship.properties
- o isiCoAuthorship.properties
- o isiCoCitation.properties

Network Workbench (http://nwb.slis.indiana.edu).

- o isiPaperCitation.properties
- o mergeBibtexAuthors.properties
- o mergeEndnoteAuthors.properties
- o mergelsiAuthors.properties
- o mergeNsfPIs.properties
- o mergeScopusAuthors.properties
- o nsfCoPI.properties
- o scopusCoAuthorship.properties

#### /sampledata/scripts/GUESS

- o co-author-nw.py
- o co-PI-nw.py
- o paper-citation-nw.py
- o reference-co-occurrence-nw.py

// Used to do color/size/shape code networks



















# Workflow Design Primer

Modularity at data preprocessing/analysis/modeling level.

Modularity at visualization level:

- Data Layers' are used in GIS systems to support the visual layering and coordination of different datasets, e.g., water pipes, streets, electricity lines, etc.
- Design Layers' supported by graphic design software such as Photoshop or Dreamweaver enable the separate design and modular composition of design elements.
- Visualization Layers' define distinct parts with very specific functionality that collectively define a visualization.

# BREAK



# **Exemplary Analyses and Visualizations**

### Individual Level

- A. Loading ISI files of major network science researchers, extracting, analyzing and visualizing paper-citation networks and co-author networks.
- B. Loading NSF datasets with currently active NSF funding for 3 researchers at Indiana U

#### Institution Level

C. Indiana U, Cornell U, and Michigan U, extracting, and comparing Co-PI networks.

#### Scientific Field Level

D. Extracting co-author networks, patent-citation networks, and detecting bursts in SDB data.



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## Data Acquisition from Web of Science

Download all papers by

- Eugene Garfield
- Stanley Wasserman
- > Alessandro Vespignani
- > Albert-László Barabási

from

- Science Citation Index
   Expanded (SCI-EXPANDED)
   --1955-present
- Social Sciences Citation Index (SSCI)--1956-present
- Arts & Humanities Citation Index (A&HCI)--1975-present





#### **Comparison of Counts**

No books and other non-WoS publications are covered.

	Age	Total # Cites	Total # Papers	H-Index
Eugene Garfield	82	1,525	672	31
Stanley Wasserman		122	35	17
Alessandro Vespignani	42	451	101	33
Albert-László Barabási	40	2,218	126	47 (Dec 2007)
	41	16,920	159	52 (Dec 2008)



# Network Extraction

Sample paper network (left) and four different network types derived from it (right)

From ISI files, about 30 different networks can be extracted.



Local citation counts (within this dataset) are given in black and global citation counts (ISI times cited) are given in green above each paper.



#### Extract Co-Author Network

Load\*yournwbdirectory\*/sampledata/scientometrics/isi/FourNetSciResearchers.isi' using 'File > Load and Clean ISI File'.

To extract the co-author network, select the '361 Unique ISI Records' table and run 'Scientometrics > Extract Co-Author Network' using isi file format:

Extract Co-Author Network	2
Extracts a co-authorship network from o types.	ne of several supported file
File Format isi	• •
	OK Cancel

The result is an undirected network of co-authors in the Data Manager. It has 247 nodes and 891 edges.

To view the complete network, select the network and run *Visualization* > *GUESS* > *GEM*'. Run *Script* > *Run Script*.... *And select Script folder* > *GUESS* > *co-author-nw.py*.





## Paper-Citation Network Layout

Load "yournwbdirectory"/sampledata/scientometrics/isi/FourNetSciResearchers.isi" using 'File > Load and Clean ISI File'.

To extract the paper-citation network, select the '361 Unique ISI Records' table and run 'Scientometrics > Extract Directed Network' using the parameters:

Extract Directed Ne	twork		×
	Given a table, this algorithm creates a directed network by placing a directed edge between the values in a given column to the values of a different column.		
Source Column	Cited References	- 4	
Target Column	Cite Me As	- 4	
Text Delimiter	1	4	
Aggregate Function File	$\label{eq:locuments} \begin{tabular}{lllllllllllllllllllllllllllllllllll$	Browse 🔇	
		OK Cance	1

The result is a directed network of paper citations in the Data Manager. It has 5,335 nodes and 9,595 edges.

To view the complete network, select the network and run *Visualization* > GUESS'. Run 'Script > Run Script ...' and select 'yournwbdirectory\*/script/GUESS/paper-citation-nw.py'.





## **Exemplary Analyses and Visualizations**

#### Individual Level

- A. Loading ISI files of major network science researchers, extracting, analyzing and visualizing paper-citation networks and co-author networks.
- B. Loading NSF datasets with currently active NSF funding for 3 researchers at Indiana U

**Institution Level** 

**C.** Indiana U, Cornell U, and Michigan U, extracting, and comparing Co-PI networks.

**Scientific Field Level** 

**D.** Extracting co-author networks, patent-citation networks, and detecting bursts in SDB data.

## NSF Awards Search via http://www.nsf.gov/awardsearch

🕲 NSF - Award Search - Awardee Information - Mozilla Firefox	100 NSF - Award Search - Awardee Information - Mozilla Firefox	
Ele Edit View Higtory Bookmarks Iools Help	Eile Edit View History Bookmarks Tools Help	
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Hint: The text field below 'Search Award For' searches the title, abstract, and award numb	CISE Research Instrumentation for a 8921679 Program in Physical Computation & Complex Systems	90 <u>Fox.</u>
Search Award For: Restrict to Title Only:	REU Site: To Continue an 8900464 REU Site in Computer and Information Science and Engineering at Caltech OCI CROSS-DIRECTORATE 05/01/19	39 <u>Fox</u> ,
Awardee Information Principal Investigator First Name:	Proposal to Continue an 8804528 ERU Site in Computer And InformationScience And Engineering Engineering	38 <u>Fox,</u>
Last Name:         fox         PI Lookup           Hint: Including CO-PI will result in slower searches.         File         File	A Pilot Project in Performance CROSS-DIRECTORATE 8719502 Scient Select Archit	
Include CO-PI: Organization: State:	Save in CSV format as *name*.nsf	
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#### NSF Awards Search Results

Name	# Awards	First A. Starts	Total Amount to Date
Geoffrey Fox	27	Aug 1978	12,196,260
Michael McRobbie	8	July 1997	19,611,178
Beth Plale	10	Aug 2005	7,224,522

#### Disclaimer:

Only NSF funding, no funding in which they were senior personnel, only as good as NSF's internal record keeping and unique person ID. If there are 'collaborative' awards then only their portion of the project (award) will be included.



## Using NWB to Extract Co-PI Networks

- > Load into NWB, open file to count records, compute total award amount.
- > Run 'Scientometrics > Extract Co-Occurrence Network' using parameters:

Extract Network from	n Table	×
	Extracts a network from a delimited table	
Column Name	All Investigators	- 🤣
Text Delimiter	1	ې
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	[	OK Cancel

- Select 'Extracted Network ...' and run 'Analysis > Network Analysis Toolkit (NAT)'
- > Remove unconnected nodes via Preprocessing > Delete Isolates'.
- Visualization > GUESS', layout with GEM
- > Run 'co-PI-nw.py' GUESS script to color/size code.







# **Exemplary Analyses and Visualizations**

Individual Level

- A. Loading ISI files of major network science researchers, extracting, analyzing and visualizing paper-citation networks and co-author networks.
- **B.** Loading NSF datasets with currently active NSF funding for 3 researchers at Indiana U

## Institution Level

C. Indiana U, Cornell U, Michigan U, and Stanford U extracting, and comparing Co-PI networks.

#### Scientific Field Level

**D.** Extracting co-author networks, patent-citation networks, and detecting bursts in SDB data.

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Award Search Send C Awardes Information Program Information Search All Free-Text Search All Fields	Search Results Back Results are sorted by award date, with the most recent awards at the top. Click on a column heading to re-sort the resul The up/down arrows at the right of each column title control whether the sort is ascending or descending. To view the abstract, click on the award number or title. Click on the data in other columns to perform a new search with
Hint: The text field below 'Search Award For' searches the title, abstract, and award number fields.  Search Award For:  Restrict to Title Only:	Refine Search 619 awards found, dia [First/Prev] 1. 2. 3, 4 Award & Table 0820609 Physiolo 0820609 Physiolo Halanos
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Hint: Including CO-PI will result in slower searches. Include CO-PI:	Collaborative Research: Tissue Cutting Machanics_ 0825795 Investigation of the Effective CMMI CONST MACH EOP and Mnimally Invasive Biopsy
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#### NSF Awards Search via http://www.nsf.gov/awardsearch

#### Active NSF Awards on 11/07/2008:

#### Indiana University

(there is also Indiana University at South Bend Indiana University Foundation, Indiana University Northwest, Indiana University-Purdue University at Fort Wayne, Indiana University-Purdue University at Indianapolis, Indiana University-Purdue University School of Medicine)

> Cornell University

(there is also Cornell University – State, Joan and Sanford I. Weill Medical College of Cornell University)

## University of Michigan Ann Arbor

(there is also University of Michigan Central Office, University of Michigan Dearborn, University of Michigan Flint, University of Michigan Medical School)

#### Active NSF Awards on 09/10/2009:

Stanford University

Save files as csv but rename into .nsf.

Or simply use the files saved in '\*yournwbdirectory\*/sampledata/scientometrics/nsf/'.

#### 257

501

#### \_ .

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## **Extracting Co-PI Networks**

Load NSF data, selecting the loaded dataset in the Data Manager window, run *'Scientometrics > Extract Co-Occurrence Network'* using parameters:

Extract Network from	n Table		×
	Extracts a network from a delimited table		
Column Name	All Investigators	•	٩
Text Delimiter	[I		٩
Aggregation Function File	$\begin{tabular}{lllllllllllllllllllllllllllllllllll$	Browse	٩
		OK Ca	ncel

Two derived files will appear in the Data Manager window: the co-PI network and a merge table. In the network, nodes represent investigators and edges denote their co-PI relationships. The merge table can be used to further clean PI names.

Running the '*Analysis* > *Network Analysis Toolkit* (*NAT*)' reveals that the number of nodes and edges but also of isolate nodes that can be removed running *Preprocessing* > *Delete Isolates*'.

Select 'Visualization > GUESS' to visualize. Run 'co-PI-nw.py' script.



# **Extract Giant Component**

Select network after removing isolates and run 'Analysis > Unweighted and Undirected > Weak Component Clustering' with parameter

🔜 Weak Component Clu	ustering	×
Creates new graphs contain	ning the top connected compo	nents.
Number of top clusters	0	٢
	OK C	ancel

Indiana's largest component has 19 nodes, Cornell's has 67 nodes, Michigan's has 55 nodes.

Visualize Cornell network in GUESS using same .py script and save via *File > Export Image*' as jpg.



# Top-10 Investigators by Total Award Money

for i in range(0, 10):

print str(nodesbytotalawardmoney[i].label) + ": " +
str(nodesbytotalawardmoney[i].totalawardmoney)

Indiana University	у	Cornell University		Michigan University		
Curtis Lively:	7,436,828	Maury Tigner:	107,216,976	Khalil Najafi:	32,541,158	
Frank Lester:	6,402,330	Sandip Tiwari:	72,094,578	Kensall Wise:	32,164,404	
Maynard Thompson:	6,402,330	Sol Gruner:	48,469,991	Jacquelynne Eccles:	25,890,711	
Michael Lynch:	6,361,796	Donald Bilderback:	47,360,053	Georg Raithel:	23,832,421	
Craig Stewart:	6,216,352	Ernest Fontes:	29,380,053	Roseanne Sension:	23,812,921	
William Snow:	5,434,796	Hasan Padamsee:	18,292,000	Theodore Norris:	23,35,0921	
Douglas V. Houweling	g: 5,068,122	Melissa Hines:	13,099,545	Paul Berman:	23,350,921	
James Williams:	5,068,122	Daniel Huttenloche	r: 7,614,326	Roberto Merlin:	23,350,921	
Miriam Zolan:	5,000,627	Timothy Fahey:	7,223,112	Robert Schoeni:	21,991,140	
Carla Caceres: 5,000,627		Jon Kleinberg:	7,165,507	Wei-Jun Jean Yeung:	21,991,140	





# **Top-10** Investigators by Total Award Money



Search for all active NSF awards by Northwestern University on 9/2/2009 via http://www.nsf.gov/awardsearch





# 3. Exemplary Analyses and Visualizations

**Individual Level** 

- A. Loading ISI files of major network science researchers, extracting, analyzing and visualizing paper-citation networks and co-author networks.
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#### **Institution Level**

**C.** Indiana U, Cornell U, and Michigan U, extracting, and comparing Co-PI networks.

## Scientific Field Level

D. Extracting co-author networks, patent-citation networks, and detecting bursts in SDB data.

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Register as an IU User Register as a Non IU User	
In the News Whitfield, John. 2008. Group Theory. Nature, 455, 9: 720-723.	Goto: <u>http://sdb.slis.indiana.edu</u>
La Rove, Gavin, Ambre, Sumeet, Burgoon, John, Ke, Weimao and Börner, Katy. (2007) The Utility for Scientometrics Research. In Proceedings of the 11th International Conference on 1 Madrid, Spain, June 25-27, 2007, pp. 457-462.	Scholarly Database and Its Scholarly Database and Its Scholarly Database and Informetrics,
http://ella.elis.indiana.edu/~katy/paper/07-issi-sdb.pdf Acknowledgements	
Science center at Indiana University, the National Science Foundation under Grants No. IIS°C a James S. McChanell Foundation grant in area Studying Complex Systems. Any opinions, findings, and conclusions or recommendations expressed in this material are not necessarily reflect the views of the National Science Foundation.	1239261 and IIS-0513650, and those of the author(s) and do
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Search	If multiple terms are entered in a field, they are automatically combined using 'OR'. So, 'breast
Creators:	cancer matches any record with 'breast' or 'cancer' in that field.
Title:	You can put AND between terms to combine with 'AND'. Thus 'breast AND cancer' would only match records that contain both terms.
Abstract: All Text: sustainability First Year: 1898	Double quotation can be used to match compound terms, e.g., "breast cancer" retrieves records with the phrase "breast cancer", and not records where "breast" and "cancer' are both present, but not the
Last Year: 2008 💌	exact phrase. The importance of a particular term in a query can be
✓ Medline (1898 - 2008)	Increased by pucking a " and a number arter the term. For instance, breast cancer'10' would increase the importance of matching the term 'cancer' by ten compared to matching the term 'breast'.
₩ (1997 - 2002) ₩ NSF (1985 - 2004) ₩ NSF (1985 - 2004)	
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NetworkWorkbench

# **Burst Analysis**

Run 'Analysis > Textual > Burst Detection' with parameters: and space as a separator.

#### Sort result by burst weight

		V			
Word	Length	Weight	Strength	Start	End
care	1	Infinity	Infinity	1988	1988
water	1	29.8883	29.8883	2002	2002
countri	10	27.03612	27.03612	1990	1999
protect	1	26.88557	26.88557	2002	2002
farm	1	23.32114	23.32114	2005	2005
villag	2	23.273	40.65081	2008	
crop	2	22.33649	30.42535	2008	
educ	2	22.14556	26.98588	1995	1996
blood	5	22.12166	22.12166	1996	2000
Network Workbe	ench ( <u>http://nwb.s</u>	lis.indiana.edu).			

#### Burst Detection x Perform Burst Detection on time-series textual data. Gamma 1.0 2) General Ratio 2.0 ٢ ٢ 2.0 First Ratio Bursting States 1 ٢ published\_year ٩ Date Column • уууу ٢ Date Format abstract - 🗘 Text Column ٢ Text Separator OK Cancel





#### Top-10 burst terms from abstracts of the AI search results.

Medline					NIH				
Word	Length	Weight	Start	End	Word	Length	Weight	Start	E
medical	17	299.7924	1983	1999	Phase	8	117.2205	1993	20
knowledge	5	293.9375	1991	1995	commercial	9	87.57158	1995	
knowledge	6	215.2407	1997	2002	proposed	9	87.57158	1995	
expert	13	171.0443	1985	1997	mass	3	83.36952	1978	19
systems	15	170.3306	1985	1999	protein	1	72.15788	1988	19
intelligence	21	123.9794	1981	2001	networks	4	71.252	1993	19
patient	21	123.9297	1982	2002	patterns	3	66.44826	1977	19
care	12	106.5522	1990	2001	being	8	66.29254	1971	19
registration	5	104.8139	2005		reasoning	2	65.68178	1984	19
knowledge-based	16	98.83778	1987	2002	expert	4	60.49935	1987	19
	·					•			
NSF					USPTO				
Word	Length	Weight	Start	End	Word	Length	Weight	Start	Eı
their	6	47.05097	1999		human	3	19.03937321	2004	20
gray	2	28.19808	2000	2001	video	3	15.32736425	1998	20
learning	2	27.40728	1997	1998	disclosed	2	14.06694671	1999	20
human	5	25.4525	2000		neural	3	13.30105906	2004	20
control	2	24.07877	1992	1993	"correct"	2	12.4336047	1999	20
knowledge	1	21.48756	1998	1998	unit	2	12.35745838	2002	20
students	1	21.07674	1997	1997	material	1	12.08487035	2000	20
problems	2	20.77133	1998	1999	feedback	1	12.07730195	2000	20
more	2	19.96109	2000	2001	rule	1	12.07730195	2000	20
use	1	19.38503	2001	2001	elevator	4	11.83351857	1991	19

# Bonus: Sci<sup>2</sup> Tool

## Sci<sup>2</sup> Tool

Sci² Tool					
File Preprocessing Modeling Analysis Visualization	Scientometrics Help	metrics Help			
E Console	Remove ISI Duplicate Records				
	Remove Rows with Multitudinous Fields				
Nodes: 323	Detect Duplicate Nodes	is added.			
Isolated nodes: 107 Node attributes presents label	Update Network by Merging Nodes	is added2			
node autodes present laber		O\sampledata\scientometrics\ge			
Edges: 313	Extract Directed Network	<pre>scientometrics\geo\worldfactbo</pre>			
No self loops were discovered.	Extract Paper Citation Network	O\sampledata\scientometrics\ge			
Did not detect any edge attributes	Extract Author Paper Network	ntometrics \nsf \Northwestern.nsf			
This network does not seem to be a valued network.	Extract Co-Occurrence Network	ntometrics\nst\lotinaa.nsf			
Average degree: 1.938080495356041	Extract Word Co-Occurrence Network	ntometrics\nsf\Northwestern.nsf			
This graph is not weakly connected.	Extract Co-Author Network				
There are 149 weakly connected components. (107 isolates)	Extract Reference Co-Occurrence (Ribliographic Coupling) Network				
Did not calculate strong connectedness because this graph	Extract Reference Co-occurrence (Bibliographic Coupling) Network				
not directed.	Extract Document Co-Citation Network	-			
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	Weak Component Cluster of 18 nodes				
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	PostScript: NSF csv file: C:\Users\User\Desktop\Sci2-Tool-NICO\s	ampledata\scientometrics\nsf\Nc			
! Algorithm Name Date	Time Stracted Network on Column All Investigators.2				
GUESS 09/03/2009	11:11:17 Weak Component Cluster of 63 nodes.2				
Weak Component Clust 09/03/2009	D1:10:56 Start Component Cluster of 11 podes				
	Merce Table: based on All Investigators 2	-			
		•			





#### (a) Overview

Date and input directory Basic counts

# Overlay of all matched journal references from all PDF files on 554 scientific disciplines (nodes) in UCSD Map of Science Circle size denotes # references Listing of all references

# (b) Visual Index

For each PDF file: Basic counts and thumbnail science map Max 18 per page

#### (d) Top-10 Most Similar



Overlay of all matched Journal references on 554 scientific fields (nodes) in UCSD Map of Science

grouped by 13 science areas

Circle size denotes # references Colors and names of. science areas that are cited

Alphabetic listing of cited journals and # of times cited





Top-n most similar PDF files identified based on journal name co-occurrences The similarity of each PDF file to itself is 1

Overlay of matched journal references from all above listed PDF files on UCSD Map of Science and grouping by 13 science areas

#### **RefMapper** Output

Please read the documentation at http://sci.slis.indiana.edu/refmapper.pdf for information on how to get started with the tool, to learn how journal names are identified in PDF files of references and science map overlays are generated, and for guidance on how to interpret the resulting science map overlays presented in this document.

Date and time of analysis: June 5, 2009 10:16:47 AM EDT Input directory:

C:\Users\User\Desktop\RefMapper\Data\Scisip-2008\Implementing\_science\_policy

6 PDF files found. 112 references identified in all files. 107 references with journal names.

The references with identified journal names are shown below:

Overlaid on the UCSD Map of Science





Provided by the <u>Cyberinfrastructure for Network Science Center</u> at Indiana University.



Introduction E. O. Wilson writes in Constilence: The Unity of Knowledge (1998): "Features that distinguish science from peudoscince are repeatability, economy, mensuration, heuristics, and consilience." Please see Borner's recent presentation at the A Deeper Look at the Visualization of Scientific Discovery NSF Workshop for a general introduction of the needs and the resources provided here.

#### Needs Analysis

Needs Analysis As part of the <u>TLS: Towards a Macroscope for Science Policy Decision Making</u><sup>•</sup> NSF SBE-0738111 award, interviews with science policy makers are conducted to identify what science of science research results and tools might be most desirable and effective. So fars, 30 formal, one-hour interviews have been conducted with science policy makers at university campus level, program officer level, and division director level for governmental, state, and private foundations. Data computation will start in October 2008 and resulting report can be ordered by sending a request to Mark Price (maaprice@indiana.edu).

Conceptualization of Science A'science of science' requires a theoretically grounded and practically useful conceptualization of the structure and evolution of science. A special journal issue entitled "<u>Science of Science</u>: <u>Conceptualizations and Models of Science</u>" edited by <u>Katv Börner</u>, Indiana University & <u>Andrea</u> <u>Scharnhorst</u>, Boyal Netherlands Academy of Arts and Sciences invites contributions on this topic. It will be published in the *Journal of Informetrics* g(1) in January 2009.



#### Scholarly Database

Scholarly Database (SDB) at Indiana University aims to serve researchers and practitioners interested in the analysis, modeling, and visualization of large-scale scholarly datasets. The database currently provides access to over 20 million papers, patents and grants. Resulting datasets can be downloaded in bulk. Register for free access at <u>https://sdb.slis.indiana.edu/</u>.



#### Cyberinfrastructures

Cybernin rastructures The Scientometrics filling of the <u>Network Workbench (NWB) Tool</u> provides a unique distributed, shared resources environment for large-scale network analysis, modeling, and visualization. Thomson Scientific/JSJ, Scopus and Google Scholar data, EndNote and Bibts files, or NSF a wards can be read and diverse networks can be extracted and studied. Download <u>User Manual with focus on Scientometrics</u>.

#### http://sci.slis.indiana.edu



All papers, maps, cyberinfrastructures, talks, press are linked from http://cns.slis.indiana.edu