A Workbench for Network Scientists

A Tool For Large Scale Network Analysis, Modeling and Visualization

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Project Details

Investigators: Katy Börner, Albert-Laszlo Barabasi, Santiago Schnell, Alessandro Vespignani & Stanley Wasserman, Eric Wernert



Software Team: Lead: Weixia (Bonnie) Huang

Developers: Santo Fortunato, Russell Duhon, Bruce Herr, Tim Kelley, Micah Walter Linnemeier, Megha Ramawat, Ben Markines, M 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. 2008

Website: <u>http://nwb.slis.indiana.edu</u>

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>



□ What is "Network Science" and its challenges

Outline

- Major contributions of Network Workbench (NWB)
- Present the underlying technologies NWB tool architecture
- Hand on NWB tool
- Review some large scale network analysis and visualization works

Network Science

Basic Concepts

NetworkWorkbench

Netwo	ork or G	raph or Ma	ıtrix	
Nodes	s or Ver	tices		
Edges	or Link	(S		
Undire	ected	VS.	Direct	ed network
$A {\leftarrow} {\rightarrow}$	В		$A \rightarrow E$	$B \iff B \Rightarrow A$
source	target		source	target
1	3		1	3
1	5		3	1
2	7		2	7
2	3		2	3
\//aialat			the second se	

Weighted vs. Unweighted network

More Basic Concepts

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Symmetric vs. Asymmetric matrix

	A	nn	Bob C	hris [David	A	Ann	Bob	Chris	David
	Ann	0	3	2	1	Ann	0	3	2	1
	Bob	3	0	2	3	Bob	1	0	2	3
	Chris	2	2	0	1	Chris	1	2	0	3
	David	1	3	1	0	David	2	3	1	0
_					0					

- Undirected network == Symmetric matrix
- Directed network == Asymmetric matrix
- Two-mode vs. One-mode network
- □ Self loop
- Multiple edges
- Multigraph



Mapping the Evolution of Co-Authorship Networks

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



Mapping Topic Bursts

Co-word space of the top 50 highly frequent and bursty words used in the top 10% most highly cited PNAS publications in 1982-2001.

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Mane & Börner. (2004) PNAS, 101(Suppl. 1): 5287-5290.



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

Network Science

- Physicists study large scale network data such as Internet. In this case, each node represents a website, an edge between two nodes indicates that one website contains a URL link pointing to another website.
- Store network data as an edge list
- Study network Structure

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- Scale Free a power law degree distribution
- \succ Random a poisson distribution
- Small World -- a network with a small shortest path and a clustering coefficient significantly higher than that of a random network with similar nodes and edges

- Biologists study gene or protein networks. In this context, each node represents a gene or a protein, edges between two nodes indicate the interactions between gene-gene or protein-protein.
- Store network data in various formats: edge list, nwb format, GraphML format, etc.
- Some sample datasets are provided in the nwb tool
- Using various layout algorithms to visualize a network with different annotations (look at a network from different view)

- □ Social Scientists study interactions among people.
- Usually small datasets less than 100 nodes
- Rich attribute information for nodes and edges
- Store network data in various formats: GraphML, Pajek .net, matrix
- Some sample datasets are provided in the nwb tool
- Network Analysis
 - Remove nodes:
 - Run High Degree Node Deletion on a BA network
 - Remove edges:
 - Run Pathfinder Network Scaling on the terror network

Network Science

"A science concerned with the study of networks, be they biological, technological, or scholarly networks. It contrasts, compares, and integrates techniques and algorithms developed in disciplines as diverse as mathematics, statistics, physics, social network analysis, information science, and computer science."

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

Challenges in Network Science Research

Data Different data formats Different data models Algorithms \succ Different research purposes (preprocessing, modeling, analysis, visualization, clustering) Different implementations of the same algorithm Different programming languages Match between Data and Algorithms Different communities and practices Different tools (Pajek, UCINet, Guess, Cytoscape, R, NWB tool)

Major Deliverables

Network Workbench (NWB) Tool

- A network analysis, modeling, and visualization toolkit for physics, biomedical, and social science research.
- Can install and run on multiple Operating Systems.
- Uses Cyberinfrastructure Shell Framework underneath.

Cyberinfrastructure Shell (CIShell)

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

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 well documented in the Community Wiki.

Ne ⁴ A Warkbench f	WorkWorkb ar Network Scientites	ench Community Wiki
	Netwo A Workbench for Network Scientis	rkWorkbench Analyze Data / Home Page
	Main People NWB Tool Update Sites Custom Fillings Datasets	<< <u>Algorithms</u> >> Analyze Data Algorithms This section is for algorithms that can analyze data. Examples would be Betweenness Centrality, Attack Tolerance, etc
	Algorithms Load Data Sample Data Analyze Data Measurement Local Edge/Node Level Node Degree Node Indegree	Analyze Data Edit Measurement Local Edge/Node Level Node Degree Node Indegree Max Flow Edge ² Degree Distributions
	Node Outdegree Max Flow Edge Degree Distributions <u>Undirected Degree</u> <u>Distribution</u> <u>Indegree Distribution</u> Outdegree	Indegree Distribution Outdegree Distribution Outdegree Distribution Degree Correlations Undirected K-Nearest Neighbor Directed K-Nearest Neighbor One Point Correlations Clustering Coefficient
	Distribution Degree Correlations Undirected K-Nearest Neighbor Directed K-Nearest Neighbor One Point	Watts Strogatz Clustering Coefficient Watts Strogatz Clustering Coefficient Over k Newman Clustering Coefficient ² Newman Clustering Coefficient Over k ² Other Local Measurements Distribution of Weights ² <u>k-Core Count²</u> <u>Coherence for Weighted Graphs²</u>

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NetworkWorkbench Community Wiki (cont.)

A Workbench for Network Scientis	™ Custom Fillings / Home Page
Main	
People	Custom Fillings
NWB Tool	Many scientists use a very specific subset of <u>algorithms</u> and <u>datasets</u> in their work.
Update Sites	Here, we link to custom fillings designed by different researchers. Descriptions of
Custom Fillings	custom fillings frequently resemble learning modules providing an easy introduction into
Datasets	the working styles of different sciences.
Algorithms	Physics
Related Work FAQ	Analysis of Large-Scale Networks by Soma Sanyal
Statistics	Biology Analysis of Biological Networks by Cesar A. Hidalgo R.
DIGG IT!	Scientometrics <u>Modeling the Co-Evolution of Co-Author and Paper-Citation Networks</u> by Soma Sanyal & Katy Börner <u>Map Your Bibtex File</u> ² by Bruce Herr & Katy Börner coming soon <u>Semantic Analysis of Scholarly Data</u> ² by Katy Börner coming soon
	Internet Research <u>Error and Attack Tolerance of Networks</u> by Katy Börner and Hardik Sheth <u>Search Performance of P2P Networks</u> by Hardik Sheth and Katy Börner
	Others <u>Data Conversion Service</u> by Weixia (Bonnie) Huang & Bruce Herr

A Workbench for Network

NWB Tool Major Deliverables

Download from http://nwb.slis.indiana.edu/software.html

Major features in v0.6.0 Release

- Installs and runs on Windows, Linux x86 and Mac osx.
- Provides over 50 modeling, analysis and visualization algorithms. Half of them are written in Fortran, others in Java.
- Supports large scale network modeling and analysis (over 100,000 nodes)
- Supports various visualization layouts with node/edge annotation.
- > Provides several sample datasets with various formats.
- Supports multiple ways to introduce a network to the NWB tool.
- Supports the loading, processing and saving of four basic file formats: GraphML, Pajek .net, XGMML and <u>NWB</u>. Can load and view TreeML, edge list, etc.
- Supports automatically Data Conversion.
- Provides a Scheduler to monitor and control the progress of running algorithms.
- Integrates a 2D plotting tool -- Gnuplot.

NWB Tool – Data Formats

Converters and Conversion Services Between Various Data Formats



Workbench

Integrating and Implementing Algorithms

Modeling and Network Generation Random Network Model Random

Preferential Attachment Algorithms Barabasi-Albert Model Dorogovtsev-Mendes-Samukhin Fitness Vertices/edges deletion Copying strategy Finite vertex capacity TARL

Rewiring algorithms Rewiring based on degree distribution Watts Strogatz Small World Model

Peer-to-Peer Models

Structured CAN Model Chord Model

Unstructured PRU Model Hypergrid Model

Statistical Measurement Edge/Node level node degree BC value of nodes/edges Max flow edge Hub/Authority value for nodes Distribution of node distances (Hop plot) Local (directed and weighted versions) Clustering Coefficient (Watts Strogatz) Clustering Coefficient (Newman) k-Core Count Distributions (Plot and gamma, and R²) Degree Distributions (in, out, total) (Directed/TotalDegree Distribution) Degree Correlations (in-out, out-out, out-in, in-in, total-total) Clustering Coefficient over k Coherence for weighted graphs Distribution of weights Probability of degree distribution Global Densitv Square of Adjacency Matrix Giant Component Motif Identification Strongly Connected Component Page Rank **Betweenness Centrality** Closeness centrality Diameter Reach centrality Shortest Path = Geodesic Distance Eigenvector centrality Average Path Length Minimum Spanning Tree

More Algorithms

Searching on Networks Search k Random-Walk Search Depth First Search p-rand Breadth-First Search P2P CAN Search Chord Search

Epidemics Spreading SIR SIS

Graph Matching On Networks Simple Match Similarity Flooding ABSURDIST

Clustering on Networks

Based on Attributes Hierarchical Clustering Single Link Complete Link Average Link Ward's Algorithm

Based on Network Structure Newman Girvan Clauset-Newman-Moore Newman Cecconi-Parisi Simulated annealing of modularity Caldarelli Weak Component Clustering vanDongen (random walk) Cfinder (Clique percolation method) Reichardt, Bornholdt (q-potts model)

Visualization of Networks Distribution Scatterplot Histogram Geospatial Circle layout Grid-based Dendrogram Treemap Hyperbolic tree Radial Tree Sparse Matrix Visualization Kamada-Kawaii Fruchterman-Rheingold **Orthogonal Layout** k-core visualization

Workbench for Network Scientists

NWB Tool – Algorithms (Implemented)

Category	Algorithm	Language
	Random Node Deletion	JAVA
Preprocessing	High Degree Node Deletion	JAVA
	Pathfinder Network Scaling	JAVA
	Directory Hierarchy Reader	JAVA
	Erdös-Rényi Random	FORTRAN
	Barabási-Albert Scale-Free	FORTRAN
	Watts-Strogatz Small World	FORTRAN
	Chord	JAVA
Medeling	CAN	JAVA
wodening	Hypergrid	JAVA
	PRU	JAVA
	TARL	JAVA
	Тгее Мар	JAVA
	Tree Viz	JAVA
Visualization	Radial Tree / Graph	JAVA
	Kamada-Kawai	JAVA
	Force Directed	JAVA
	Spring	JAVA
	Fruchterman-Reingold	JAVA
	Circular	JAVA

Analysis Algorithm	Language
Node Betweenness Centrality	FORTRAN
Average Shortest Path	FORTRAN
Connected Components	FORTRAN
Diameter	FORTRAN
Page Rank	FORTRAN
Shortest Path Distribution	FORTRAN
Watts-Strogatz Clustering Coefficient	FORTRAN
Watts-Strogatz Clustering Coefficient Versus Degree	FORTRAN
Directed k-Nearest Neighbor	FORTRAN
Undirected k-Nearest Neighbor	FORTRAN
Indegree Distribution	FORTRAN
Outdegree Distribution	FORTRAN
Node Indegree	FORTRAN
Node Outdegree	FORTRAN
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
Chord Search	JAVA
Weak Component Clustering	JAVA
Tool: GnuPlot	

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

Abstract Algorithm Definition

An Abstract Definition of Algorithms, Datasets and Converters



Abstract Algorithm Definition (cont.)



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Abstract Algorithm Definition (cont.)



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Abstract Algorithm Definition (cont.)

Visualization Algorith	ms	Input
Retwork Workbench Tool File Preprocessing Modeling Analysis Search Clustering	Visualization Tools Help Circular	
Implementer(s): Santo Fortunato Integrator(s): Santo Fortunato, Weixia Huang Reference: Barabási, A-L. & Albert, R. (1999). Emergence of Sc (http://lanl.arxiv.org/abs/cond-mat/9910332) Docu: https://nwb.slis.indiana.edu/community/?n=Moc Input Parameters: Seed of random number generator: 1 Links set by new node: 2 Number of nodes: 1000 	Specified Radial Tree/Graph Radial Tree/Graph with Annotation Tree Map Tree View Force Directed Kamada-Kawai Fruchterman-Reingold Fruchterman-Reingold with Annotation Spring Content and the second s	Pajek .net file: C:\apps\nwb-0.5.0\sampledata\vert Radial Graph Visualization
Loaded: C:\apps\nwb-0.5.0\sampledata\Network\netsci06-confi Radial Tree/Graph (Alpha) was selected. Author(s): G. Battista, P. Eades, R. Tamassia, I. G. Tollis. Implementer(s): Prefuse Integrator(s): Weixia Huang Reference: Battista, G., Eades, P., Tamassia, R., and Tollis, I. G. Prentice Hall. Docu: https://nwb.slis.indiana.edu/community/?n=Visua	Parallel Coordinates (demo) , (1999). Graph Drawing: Algorithms for the Visuali	Mr. Chriff Public Scientometrics (14) (29) (7) Ecology (8) Daniel Delaurentis (1, With one of the second s
Scheduler Remove From List Remove completed automatically Remove	nove all completed	(Dr. Katherine Strandburg Information Technology (47) (Dr. Valad wow manian) Dr. Uuyong Fakibella (Dr. Vaoki Masuda) (Dr. Naoki Masuda) (Dr. Denis Boyer))))er (Or Thom Dr. Denis Boyer))))er (Dr. Danis Boyer))))er (Dr. Danis Boyer)))
Network Workbench (http://nwb.slis.indiana.edu).	•	25

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For Algorithm Integrators



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For Algorithm Integrators (cont.)

GUI Builder and MetaType Service

Workbench

Network Workbench Tool		
ile Preprocessing Modeling Analysis Search Clustering Visualization Tools Help	Barabasi-Albert	X
Console	Barabasi-Albe	rt 📃
Barabási-Albert Scale-Free was selected.	Number of nodes	1000 🗘
Author(s): AL. Barabási and R. Albert.	Links set by new node	2 🦃
Implementer(s): Santo Fortunato Integrator(s): Santo Fortunato Weixia Huang	Seed of random number generator	1 🌮
🖹 💼 nwb.product 📄 validation.proper 📄 service.properties 📄 config.properties 📄 gui.xml 🗙 🎇		OK Cancel
<pre><?xml version="1.0" encoding="UTF-8"?> <metatype:metadata xmlns:metatype="http://www.osgi.org/xmlns/metatype/v1.0.0"></metatype:metadata></pre>	1/>	

Three User Groups

Application Users

- Scientists in the natural and social sciences (physics, biology, chemistry, psychology, sociology, etc.)
- Their needs -- want to find the best datasets and the most effective algorithms to conduct their research.
- Problem too many algorithms. Finding a correctly working piece of code is challenging. Frequently, not only one but a sequence of different algorithms needs to be applied to load, parse, clean, mine, analyze, model, visualize, and print data. Today, there is no easy way to extend a tool by adding new algorithms as needed or to customize a tool so that it exactly fits the needs of a specific user (group).

Three User Groups (cont.)

Application Designers/Developers

- Computer scientists or application users that developed the applications and tools we use today.
- They usually start by developing applications/tools that meet their own needs, and then generalize them to satisfy the requirements of their research community.
- Challenge -- not only need to take care of the software architecture, the GUI design, the development of many basic components and functionalities, but also play the role of algorithm developers.

Three User Groups (cont.)

Algorithm Developers

- Computer scientists, statisticians and other researchers
- They look for opportunities to disseminate their work and test the practical utilities of their algorithms.
- Challenge -- the integration of a dataset or algorithm into an existing application or tool requires a deep understanding of the architecture of that application, which is non-trivial.

OSGi – Technical Details

NWB/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.
- Alliance members include IBM (Eclipse), Sun, Intel, Oracle, Motorola, NEC and many others.
- Has successfully been used in the industry from high-end servers to embedded mobile devices for 8 years now.
- Widely adopted in open source realm, especially since Eclipse 3.0 that uses OSGi R4 for its plugin model.

Advantages of Using OSGi

- Directly use many components provided by OSGi framework, such as service registry
- Contribute diverse algorithms to OSGi community -- any CIShell algorithm becomes a service that can be used in any OSGi-based framework.
- Running CIShells/tools can connect to each other via exposed CIShell-defined web services supporting peer-to-peer sharing of data, algorithms, and computing power.

Ideally, CIShell becomes a standard for creating algorithm services in OSGi developed Tools/CI, e.g., IVC&NWB will be using the CIShell reference GUI

OSGi – Technical Details (cont.)

Service Oriented Component-based Architecture



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A Workbench for Networ

NWB/CIShell Architecture

An Overview of NWB/CIShell Architecture



Interfaces Layer – Algorithm





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

Interfaces Layer – Algorithm (cont.)

Basic Algorithm APIs

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public interface AlgorithmFactory {

public MetaTypeProvider createParameters(Data[] data); public Algorithm createAlgorithm(Data[] data, Dictionary parameters, CIShellContext context);



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

NetworkWorkbench Templates

	Select a wizard	
	Wizards:	
	type filter text	
Annlinetian	General Genera	
	 Executable (command line) based algorithm Java-based algorithm 	
	E CVS	
	Java 💌	r Peerto-Peer
		Solution
		eference Implementations of
	Image: Section of the section of t	Components
Reference Service oplementation	Cancel APIs for Algorithms and Converters	APIs for Other Framework

Interfaces Layer – Basic Services

Basic Services

- Preferences Service
- Log Service
- Data Conversion Service
- GUI Builder Service



Interfaces Layer – Application Services

Application Services

NetworkWorkbench

- Scheduler Service
- Data Manager Service



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

Interfaces Layer – Other Components

Other Framework Components

CIShellContext

Data



Services Layer – Basic Services

Basic Services

- Preferences Service
- Log Service
- Data Conversion Service
- **GUI Builder Service**



NetworkWorkbench Services Layer – Application Service **Application Services** Scheduler Service **Data Manager Service** Reference Implementations Reference Implementations Reference Service of of **Basic Services** Application Services Implementations APIs for Other **APIs for Algorithms** APIs for APIs for Interfaces Framework and Converters **Basic Services Application Services** Components

Services Layer – Other Components

Other Framework Components

- CIShellContext LocalCIShellContext
- Data BasicData



Application Solutions

Reference GUI (using Eclipse RCP)

Framework View

- Data Manager View
- Console(log) View
- **Scheduler View**



Application Solutions (cont.)

Other application solutions



Applications

NWB Tool

□ Analyze, visualize and model network/graph

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- Support most popular data formats and data conversion among them
- Serve three communities with different practices



Applications (cont.)

Biological Networks Portal

- Use Web front-end solution
- For educational purpose

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Algorithm Developers Need to Know

For Algorithm Developers (Java-based)

- Must implement CIShell Algorithm APIs
- Know how to use Basic Serivces APIs, Application Serivces APIs, CIShellContext, and Data APIs, but don't need to take care of the detail implementations of those services or components.



Application Designers Need to Know

Component Level

- Using OSGi service implementations from different vendors
- Each service/component can have more than one implementations



Application Designers Need to Know

Framework Level

- Use all implementations of algorithms and converters
- Use all implementations on the service layer
- Concentrate on application solutions
- Use or refer to the reference implementations of an application



Application Users

- Get the most efficient algorithm implementations
- Get as many algorithms as needed

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- Have tools running on multiple platforms and various application solutions
- Don't worry about the match between the data format of a dataset vs. algorithm input



NWB tool and CIShell provide

□ A testbed for diverse algorithm implementations

Summary

- A mechanism to quickly integrate an algorithm and disseminate it through the NWB tool and community wiki.
- A bridge between what algorithm developers can provide and what application users need.

NWB Tool: Demo and Hand-on



Workbench

Network Analysis and Visualization

Examples

- □ A Map of Science (800,000 published papers)
- An Emergent Mosaic of Wikipedian Activity (659, 388 interconnected Wikipedia articles, 16,582,425 links)
- Movies and Actors: Mapping the Internet Movie Database (302,691 movies, 896,308 unique actors, 3,792,390 links)



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Comments & Questions

Websites

- http://nwb.slis.indiana.edu
- https://nwb.slis.indiana.edu/community
- http://cishell.org

NetworkWorkbench

<u>http://cns-trac.slis.indiana.edu/trac/</u>

Thank You