

Analysis and Visualization of Biological Networks

John "Scooter" Morris, Ph.D. Resource for Biocomputing, Visualization, and Informatics, UCSF



Caveats

- Research in biological network analysis requires...
 - in-depth knowledge of graph theory
 - Which I'm not sure I have...
 - strong background in statistics
 - Which I know I don't have...
 - strong background in biology
 - Which I *think* I have...
- I'm not going to talk about cutting edge research
- I'm going to introduce some of the approaches and tools only



So, why am I here?

- Executive Director: NIH Resource for Biocomputing, Visualization, and Informatics
- 19 Years of Pharmaceutical Experience (Genentech)
- Cytoscape core team (4 years)
- Author:
 - Cytoscape layout mechanism
 - Cytoscape group mechanism
 - Metanode Plugin
 - clusterMaker
 - chemViz
 - structureViz



Why are you here?

- Bench biologists?
- Geneticists?
- Bioinformaticists?
- Mathematians?
- Cheminformaticians?
- Structural biologists?

Outline

- The Challenge
- Biological network taxonomy
- Analytical approaches
- Visualisation approaches
 - Data mapping
 - Layouts
- Tools
 - Cytoscape



The Challenge

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The Challenge

- Biological networks (nodes and edges)
 - Seldom tell us anything by themselves
 - Analysis involves:
 - Understanding the characteristics of the network
 - Modularity
 - Comparison with other networks (specifically random networks)
 - Visualization involves:
 - Placing nodes in a meaningful way (layouts)
 - Mapping biologically relevant data to the network
 - Node size
 - Node color
 - Edge weights







Biological Network Taxonomy







- Scale-free networks
 - Degree distribution follows power law: $P(k) \sim k^{\gamma}$, where γ is a constant.
 - Result is that there are distinctive "hubs" (essential proteins?)
 - Overall, though, network is resilient to perturbation
 - Biological (and social) networks tend to be scalefree







• Hierarchical networks















Visualisation approaches

- Data mapping
- Layouts
- Animation





Data mapping

- Avoid cluttering your visualization with too much data
 - Map the data you are specifically interested in to call out meaningful differences
 - Mapping too much data to visual attributes may just confuse the viewer
 - Can always create multiple networks and map different values







Layouts

- Use layouts to convey the true relationships between the nodes
- Layout algorithms may need to be "tuned" to fit your network
- Lots of parameters to change layout algorithm behavior
- Can also consider laying out portions of your network



Animation

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Cytoscape

• About Cytoscape:

"Cytoscape is an open source bioinformatics software platform for *visualizing* molecular interaction networks and *integrating* these interactions with gene expression profiles and other state data." – Cytoscape Web Site



What is Cytoscape?



www.cytoscape.org

- Visualization
- Integration
- Analysis



What is Cytoscape?



- Open source
- Cross platform
- A consortium





Demonstration

- Cytoscape Demo
 - Vizmapper
 - clusterMaker
 - structureViz
 - chemViz







Workshop: Cytoscape

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Core Concepts

Networks and Annotations



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Networks e.g, biological pathways Annotations e.g., attributes or data



Core Concepts

• Visual Mapping with VizMapper



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	gi14602492	SCMH1	11540	AAH09752.1	22955		Q96GD3	SCMH1	SAM	Doma
	gi21361625	EXOC2	11544	NP_060773.3	55770		Q96KP1	SEC5 like 1	IPT	Doma
	gi17998551	SERPINB12	11548	NP_536722.1	89777		Q96P63	Serpin B12	SERPIN	Doma
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	gi4507755	TYROBP	4996	NP_003323.1	7305	604142	043914	DAP12	ITAM	Doma
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12	gi11496982	SVIL	4992	NP_068506.1	6840	604126	095425	Supervillin	VHP	Doma
13	gi31563386	SULT2B1	4991	NP_814444.1	6820	604125		Sulfotransferase family 2B, member	r 1	
14	gi21040399	RBBP8	4990	AAH30590.1	5932	604124	Q99708	CTIP	LZ	Motif
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16	gi11321617	DPYSL4	7463	NP_006417.1	10570	608407	014531	Collapsin response mediator protei	13	
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18	gi5454090	SSR4	2101	NP_006271.1	6748	300090	P51571	Signal sequence receptor delta	SP	Motif
19	gi5730045	SLC16A2	2106	NP_006508.1	6567	300095	P36021	X linked PEST containing transport	TM	Doma
20	gi11968027	FTS	7467	NP_071921.1	64400	608483	Q9H8T0	FTS	UBC	Doma
21	gi48255885	PRKCI	2105	NP_002731.3	5584	600539	P41743	Protein kinase C, iota type	S_T_kinase	Doma
22	qi9558731	RPA4	6591	NP 037479.1	29935			RPA4	TRNAA	Doma
23	gi13376812	PPP1R2P9	6593	NP_079486.1	80316			Type 1 protein phosphatase inhibit	or	
24	gi15826862		6595	NP_296375.1	90060			JM11 protein	CC	Motif
25	qi7661844	CCDC22	6594	NP 054727.1	28952			JM1 protein	CC	Motif
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Networks



Annotations





Visual Styles







Use specific line types to indicate different types of interactions

as different node shapes.

Encode specific physical entities Set node sizes based on the degree of connectivity of the nodes.



Browse extremely dense networks by controlling for the opacity of nodes



Set node font sizes based on the degree of connectivity of the nodes.



Expression data



Core Concepts

• Plugins!

http://chianti.ucsd.edu/cyto_web/plugins/index.php



Cytoscape

- Traditional uses
 - Visualizing:
 - PPI
 - Pathways
 - Mapping:
 - Expression profiles
 - "Other state data"



Cytoscape



Cytoscape: Platform

Plugins

• MCODE

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2	6.387	31,198	YPL093W, YBL004W, YOR272W, YNL110C, YKL009W, YFL002C, YOL077C, YPL126W, YIL035C, YLR409C, YLR129W, YOR061W, YKR060W, YCR057C, YDR449C, YOR039W, YJL109C, YPL012W, YGR103W, YLR449W, YOR206W, YKL014C, YLL008W, YKL172W, YNL002C, YLR002C, YGL111W, YOL041C, YGL019W, YOR145C, YPR016C	*
3	5.417	12,65	YGL011C, YOL038W, YPR103W, YMR314W, YBL041W, YOR362C, YER012W, YJL001W, YML092C, YGR253C, YER094C, YGR135W	
4	5	15,75	YPL043W, YMR290C, YER006W, YKR081C, YDR496C, YDL031W, YNL061W, YNL132W, YLR222C, YLR197W, YMR049C, YHR052W, YJL069C, YKL099C, YDL014W	
5	5	12,60	YPR187W, YPR010C, YPR110C, YNL248C, YOR341W, YNR003C, YKL144C, YOR207C, YPR190C, YNL113W, YOR116C, YBR154C	
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Plugins

• BiNGO

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Plugins

Agilent Literature Search

Tutorial

- Start with "Introduction to Cytoscape"
 - NOTE: When you get to the "WikiPathways" step (page 7), you will need to go to the Plugin Manager and load the GPML Plugin (under Network & Attribute I/O)
 - Details on the Plugin Manager are available on page 11 of the handout.
- Other available handouts:
 - Agilent Literature Search
 - ClusterMaker
 - Network Analyzer
- Don't hesitate to ask questions!

After Today

- Downloading cytoscape:
 - <u>www.cytoscape.org</u>
- Questions about cytoscape
 - <u>cytoscape-helpdesk@googlegroups.com</u>
 - <u>cytoscape-discuss@googlegroups.com</u>
- Tutorials web site:
 - http://labrador.library.ucsf.edu/opentutorials/
 - <u>http://opentutorials.rbvi.ucsf.edu/</u> (new URL)
- My contact information:
 - <u>scooter@cgl.ucsf.edu</u>
 - <u>http://www.cgl.ucsf.edu/home/scooter</u>
 - <u>http://www.rbvi.ucsf.edu/cytoscape</u> (documentation on our plugins)

Thanks!

Backup Slides

clusterMaker

- Base Cytoscape:
 - Map expression values onto network
- Next step: *clusterMaker*
 - Visualize expression heat maps
 - Include standard clustering approaches
 - Hierarchical, k-Means
 - Provide interaction between head map and network
 - Extensions:
 - epistatic maps, complex determination

clusterMaker

structureViz

- Base Cytoscape:
 - Show protein-protein pathways and interaction networks
- Next step: *structureViz*
 - Use node and edge annotations to provide structural references:
 - PDB files
 - Functional residues
 - Links to modeled structures
 - Visualize structures in UCSF Chimera
 - Provide interaction between structure and network
 - Provide simplified interface to structural elements

structureViz

chemViz

- Base Cytoscape:
 - Visualize pathways
 - Color nodes by drug screening results
- Next step: *cheminfo* plugin (*chemViz?*)
 - Use node and edge annotation to provide chemical descriptors
 - SMILES strings, InChi fingerprints
 - Visualize structures
 - Cheminformatics calculations
 - Tanimoto similarity
 - Chemical descriptors (e.g. Rule of Five, Hydrogen Bond Donor and Acceptor count)

chemViz

