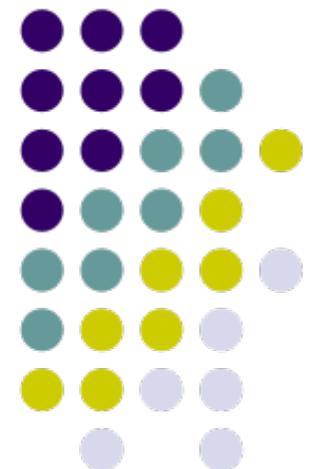


Network Visualization and Analysis

Gary Bader (University of Toronto)



Gary Bader
Prash Suravajhala
<http://wiki.bioinformatics.org/prash>



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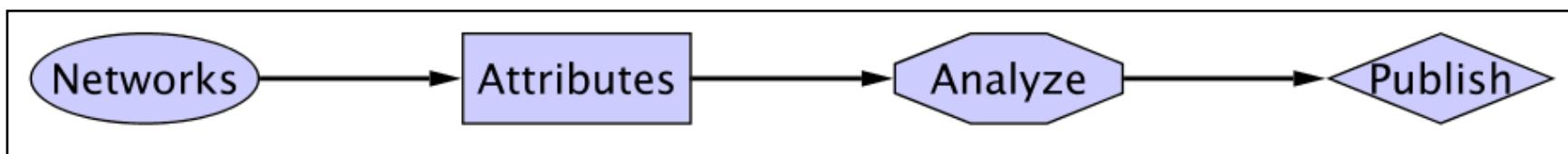
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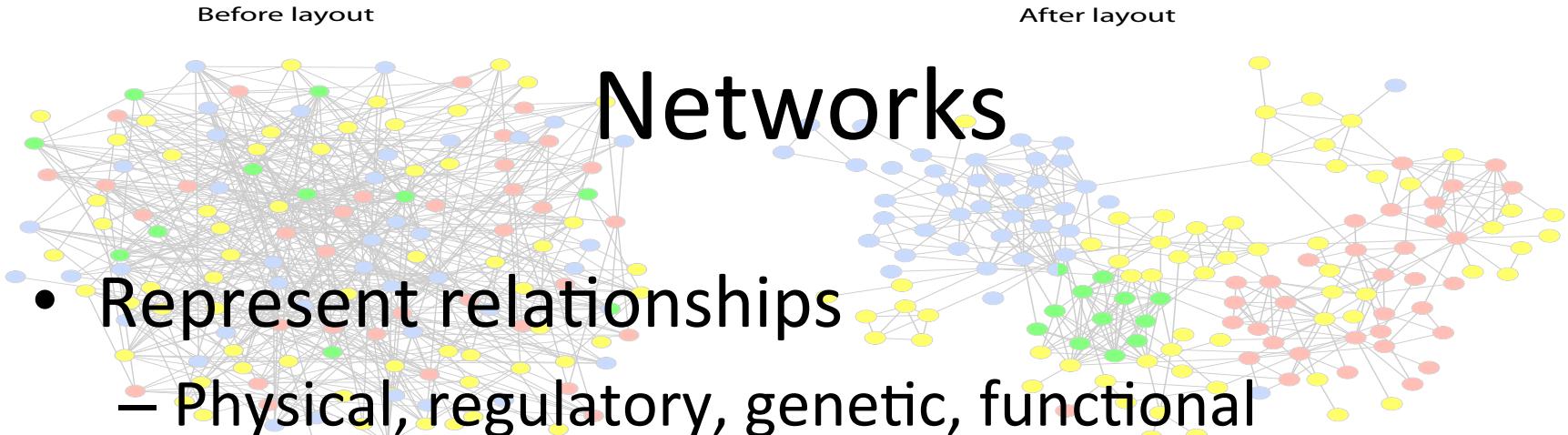
Network Analysis Workflow

- Load Networks e.g. PPI data
 - Import network data into Cytoscape
- Load Attributes e.g. gene expression data
 - Get data about networks into Cytoscape
- Analyze and Visualize Networks
- Prepare for Publication
- A specific example of this workflow:
 - Cline, et al. “Integration of biological networks and gene expression data using Cytoscape”, Nature Protocols, 2, 2366-2382 (2007).



Network Visualization and Analysis Outline

- Network introduction
- Network visualization
- Cytoscape software tool for network visualization and analysis
- Network analysis

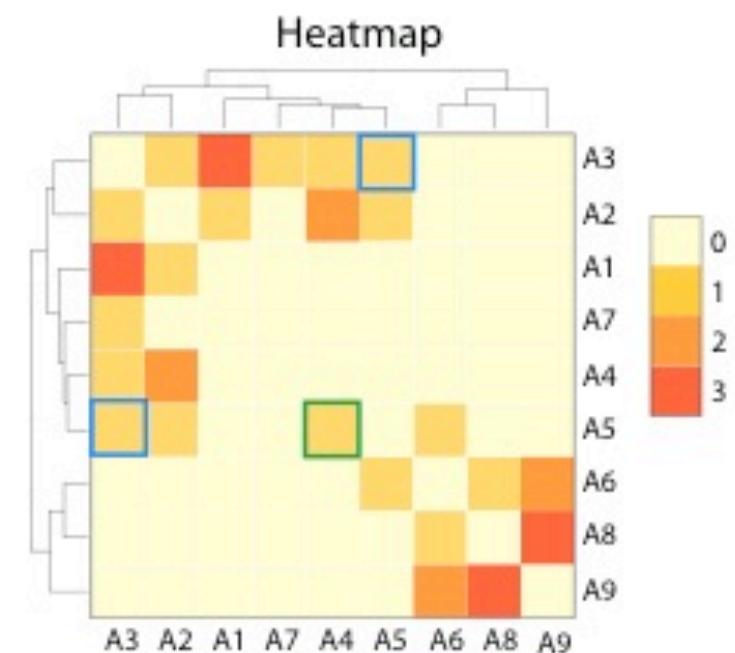
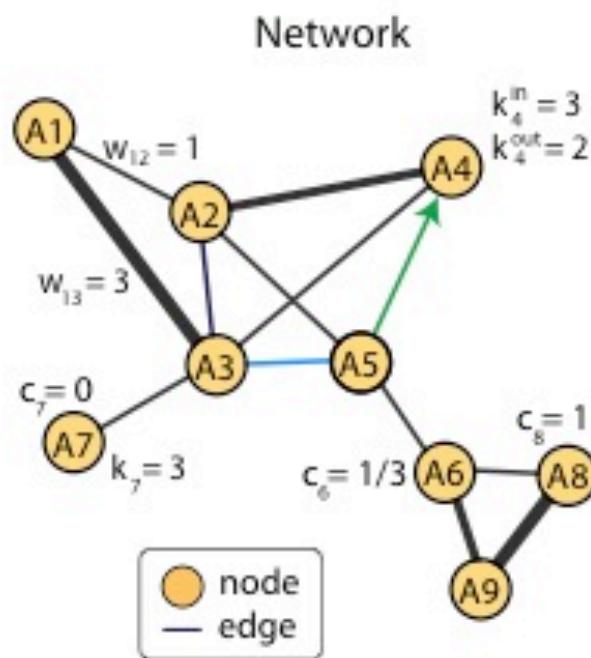


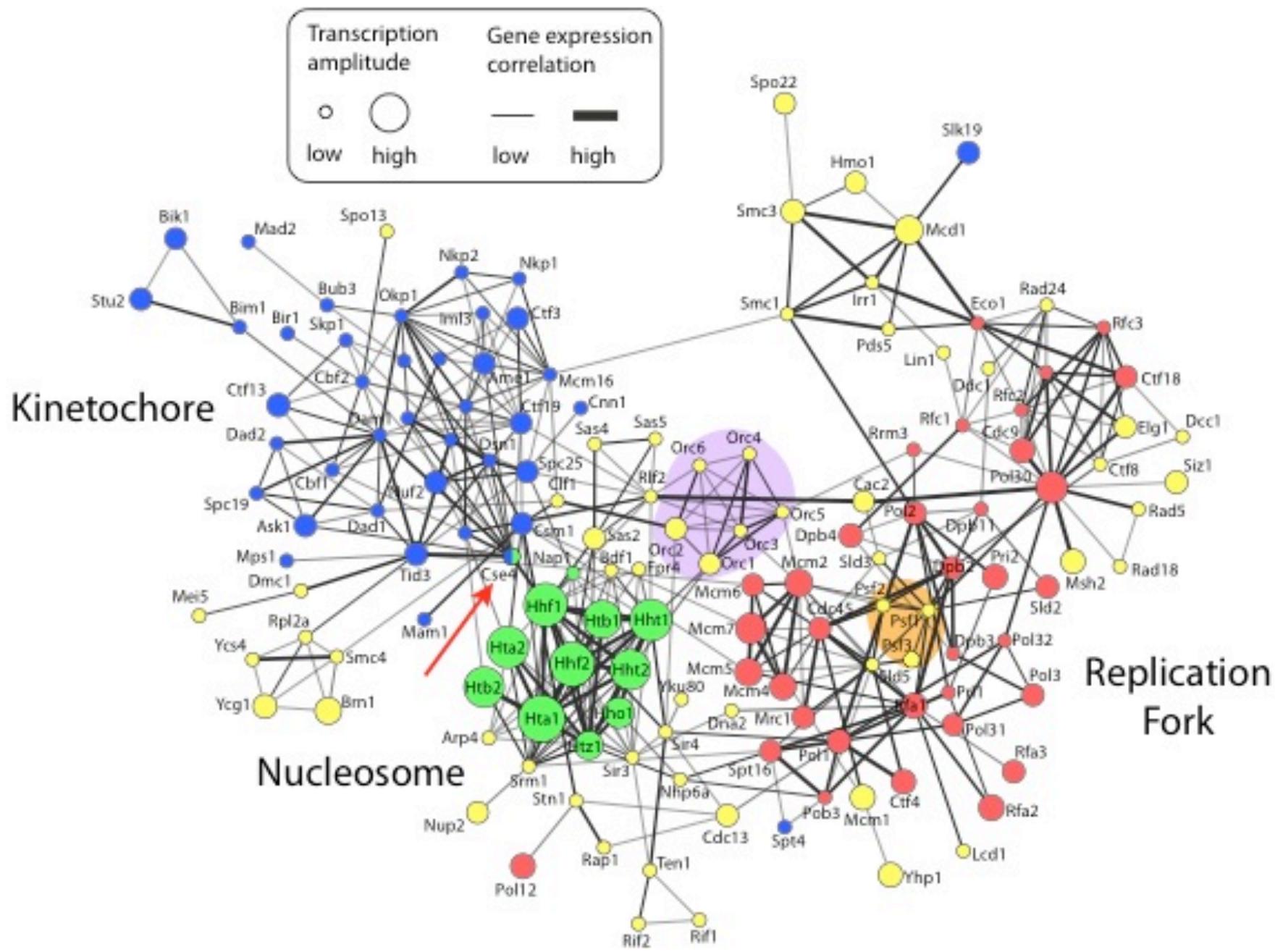
Networks

- Represent relationships
 - Physical, regulatory, genetic, functional interactions
- Useful for discovering relationships in large data sets
 - Better than tables in Excel
- Visualize multiple data types together
 - See interesting patterns

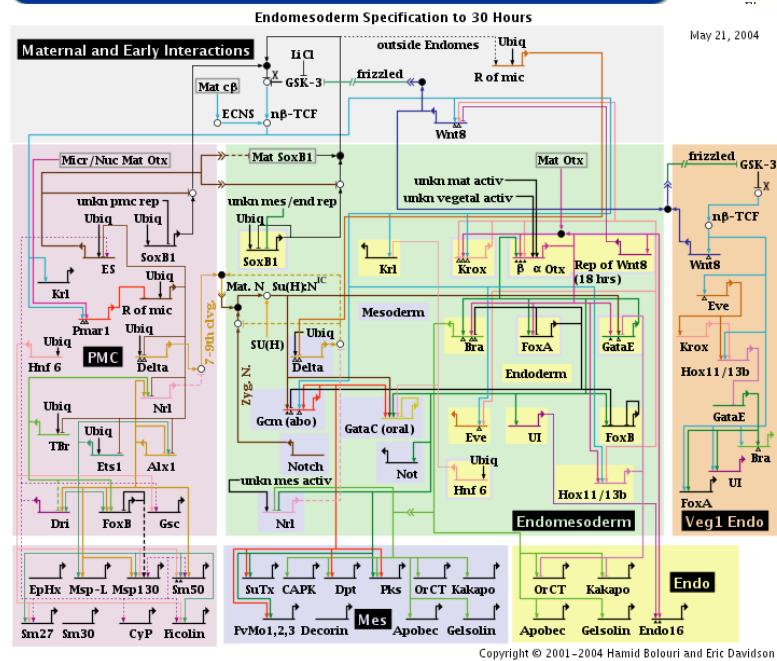
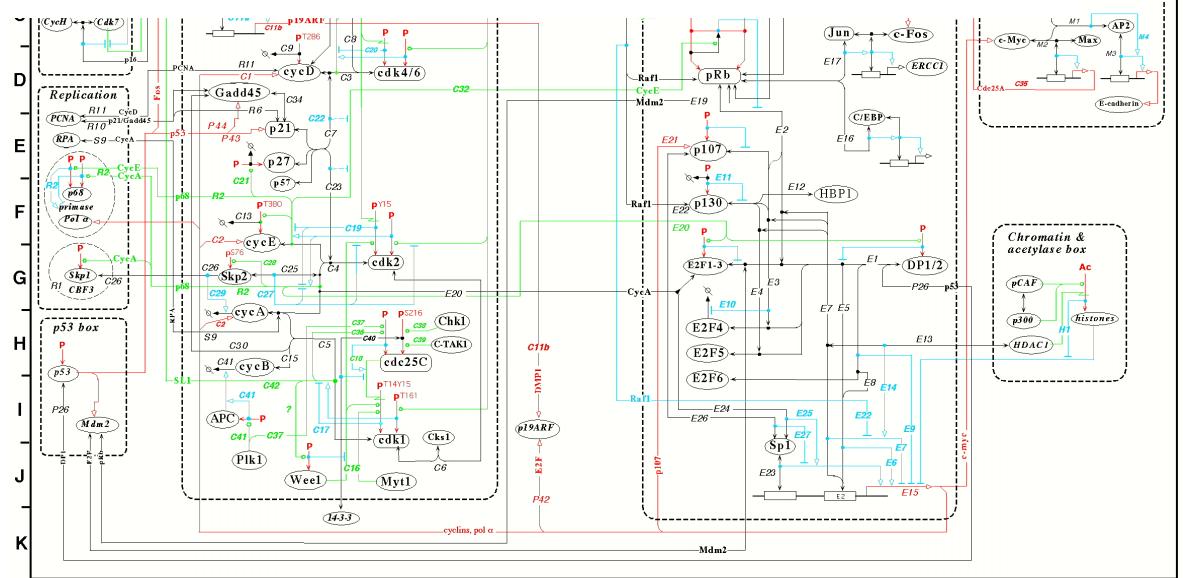
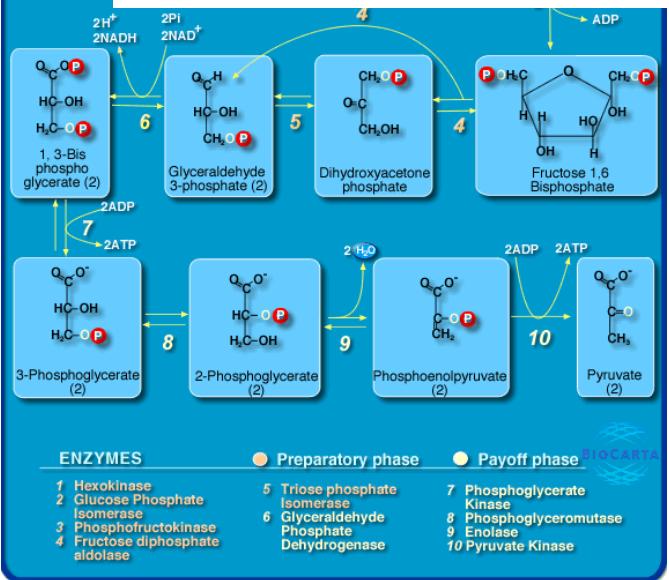
Network Representations

Relationships	Optional weight
A1 ↔ A2	1
A1 ↔ A3	3
A2 ↔ A3	1
A2 ↔ A4	2
A2 ↔ A5	1
A3 ↔ A4	1
A3 ↔ A5	1
A3 ↔ A7	1
A5 → A4	1
A5 ↔ A6	1
A6 ↔ A8	1
A6 ↔ A9	2
A8 ↔ A9	3



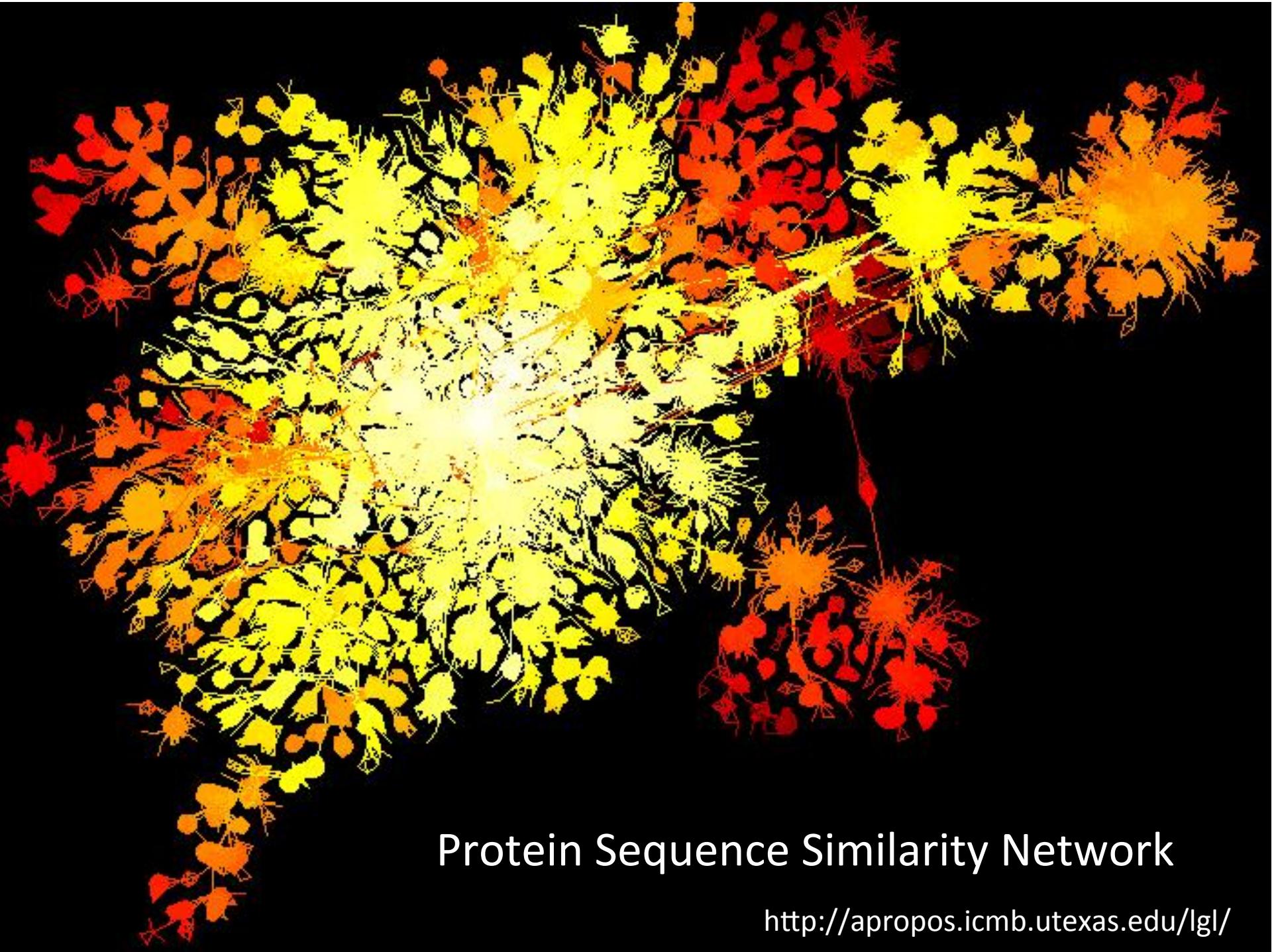


Biological Pathways/Networks?



Mapping Biology to a Network

- A simple mapping
 - one compound/node, one interaction/edge
- A more realistic mapping
 - Cell localization, cell cycle, cell type, taxonomy
 - Only represent physiologically relevant interaction networks
- Edges can represent other relationships
- **Critical:** understand what nodes and edges mean

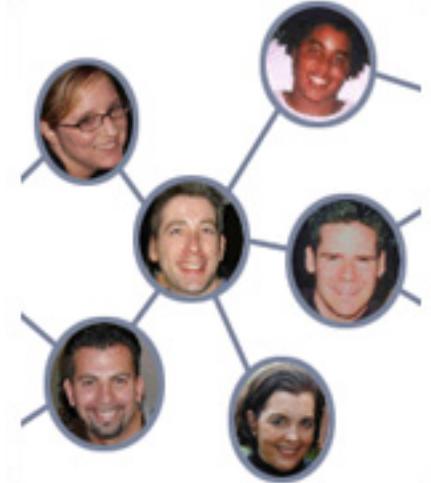


Protein Sequence Similarity Network

<http://apropos.icmb.utexas.edu/lgl/>

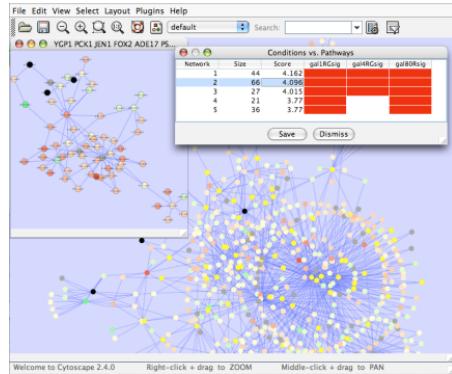
Six Degrees of Separation

- Everyone in the world is connected by at most six links
- Which path should we take?
- Shortest path by breadth first search
 - If two nodes are connected, will find the shortest path between them
- Are two proteins connected? If so, how?
- Biologically relevant?

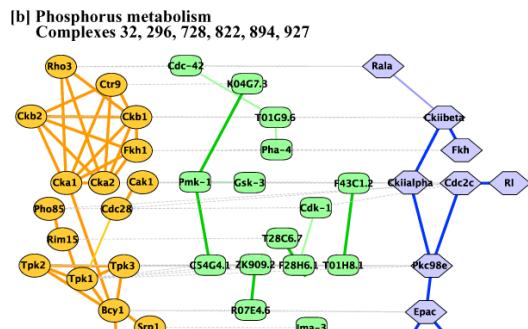


<http://www.time.com/time/techtime/200406/community.html>

Applications of Network Biology

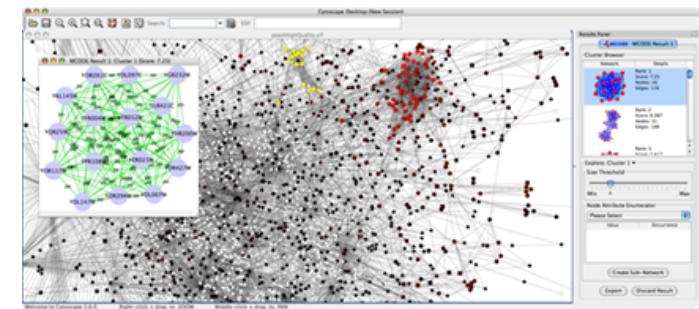


jActiveModules, UCSD

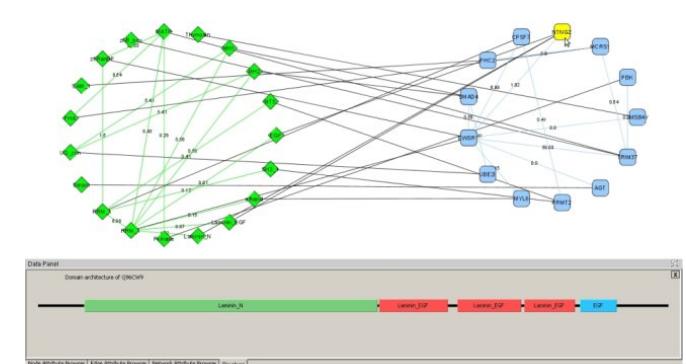


PathBlast, UCSD

- **Gene Function Prediction –** shows connections to sets of genes/proteins involved in same biological process
 - **Detection of protein complexes/other modular structures –** discover modularity & higher order organization (motifs, feedback loops)
 - **Network evolution –** biological process(es) conservation across species
 - **Prediction of new interactions and functional associations –** Statistically significant domain-domain correlations in protein interaction network to predict protein-protein or genetic interaction

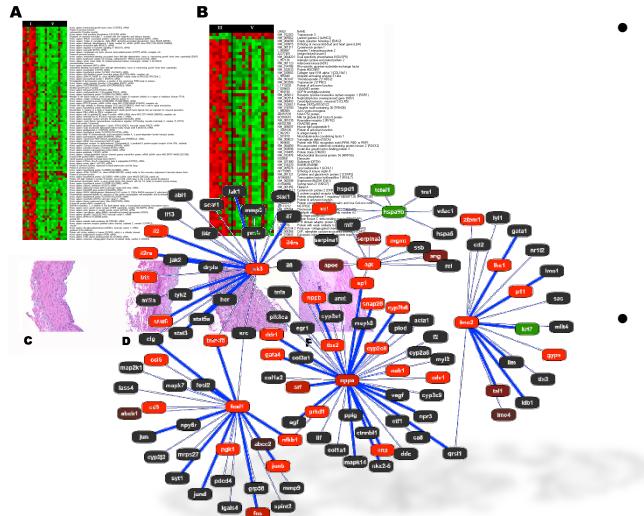


MCODE, University of Toronto

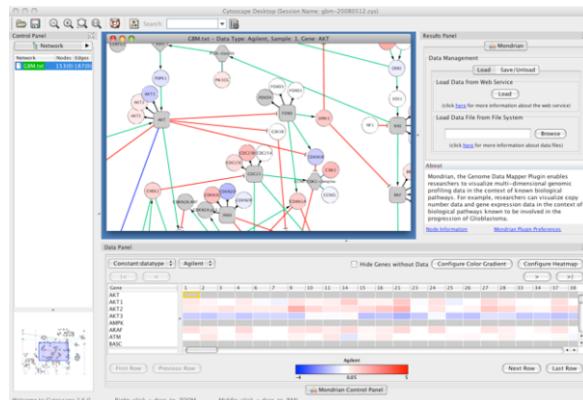


DomainGraph, Max Planck Institute

Applications of Network Informatics in Disease

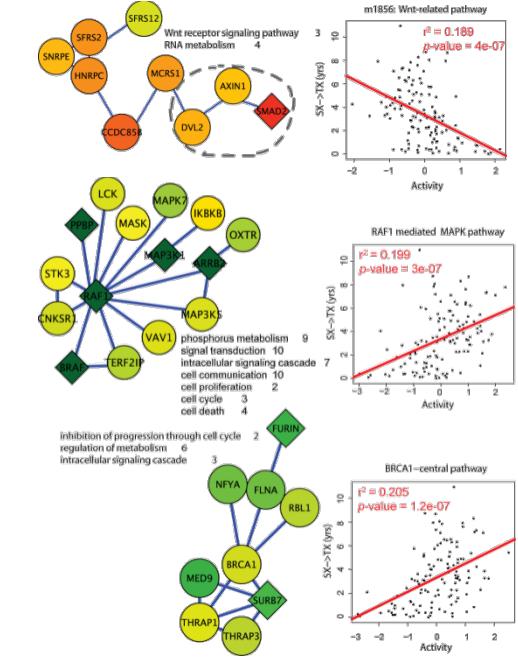


Agilent Literature Search



Mondrian, MSKCC

- **Identification of disease subnetworks** – identification of disease network subnetworks that are transcriptionally active in disease.
- **Subnetwork-based diagnosis** – source of biomarkers for disease classification, identify interconnected genes whose aggregate expression levels are predictive of disease state
- **Subnetwork-based gene association** – map common pathway mechanisms affected by collection of genotypes



PinnacleZ, UCSD

What's Missing?

- Dynamics
 - Pathways/networks represented as static processes
 - Difficult to represent a calcium wave or a feedback loop
 - More detailed mathematical representations exist that handle these e.g. Stoichiometric modeling, Kinetic modeling (VirtualCell, E-cell, ...)
 - Need to accumulate or estimate comprehensive kinetic information
- Detail – atomic structures
- Context – cell type, developmental stage

What Have We Learned?

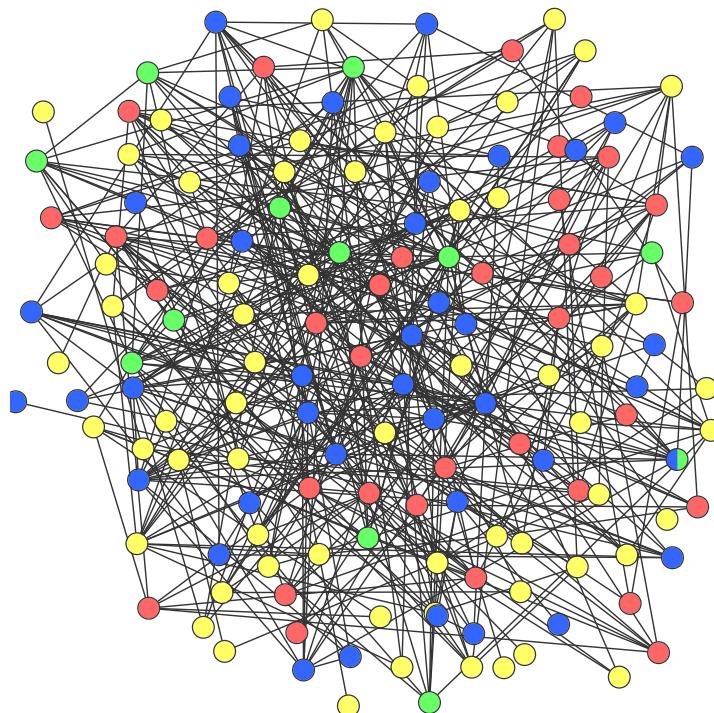
- Networks are useful for seeing relationships in large data sets
- Important to understand what the nodes and edges mean
- Important to define the biological question - know what you want to do with your gene list or network
- Many methods available for gene list and network analysis
 - Good to determine your question and search for a solution
 - Or get to know many methods and see how they can be applied to your data

Network Visualization Outline

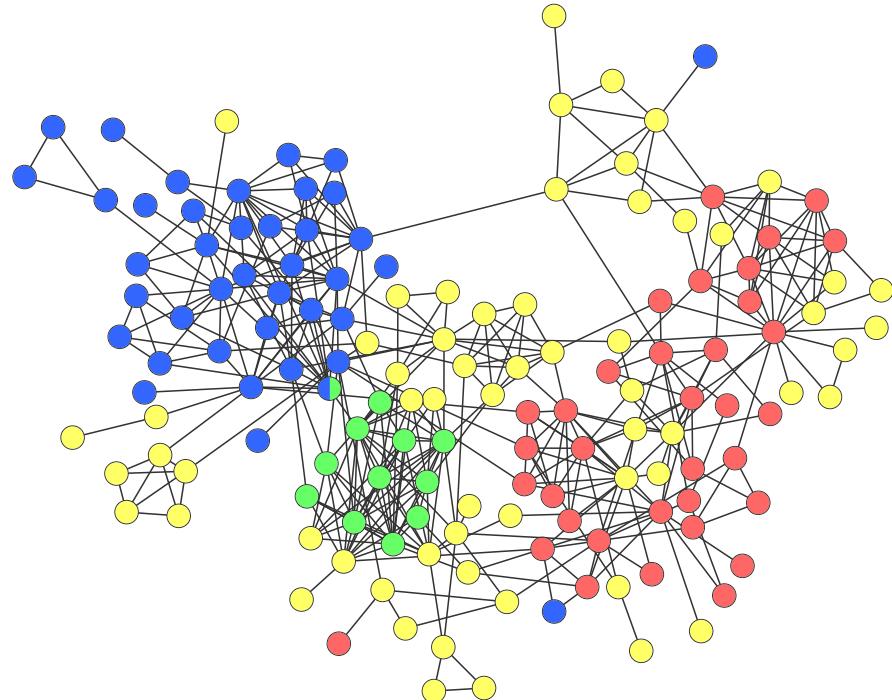
- Automatic network layout
- Visual features
- Visually interpreting a network

Automatic network layout

Before layout



After layout

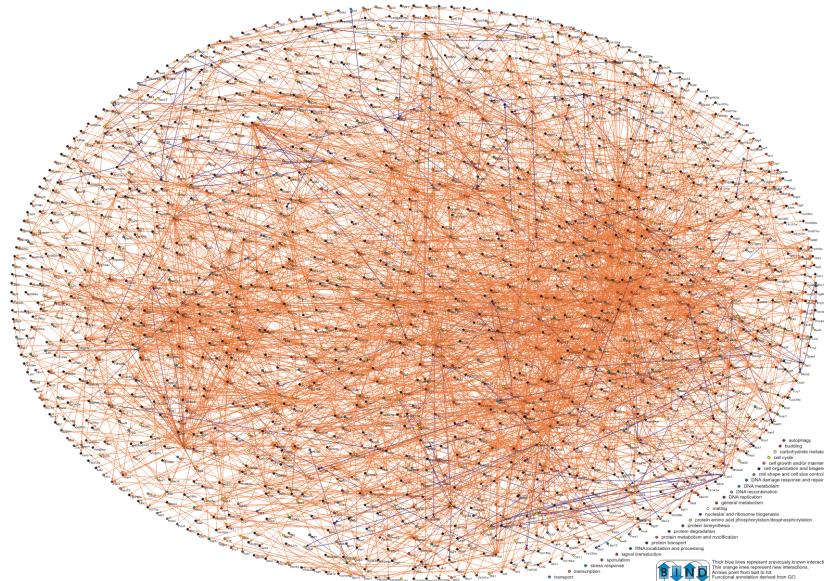


Automatic network layout

- Force-directed: nodes repel and edges pull
- Good for up to 500 nodes
 - Bigger networks give hairballs - Reduce number of edges
- Advice: try force directed first, or hierarchical for tree-like networks
- Tips for better looking networks
 - Manually adjust layout
 - Load network into a drawing program (e.g. Illustrator) and adjust labels

Overview

Systematic identification of protein complexes in *Saccharomyces cerevisiae* by mass spectrometry

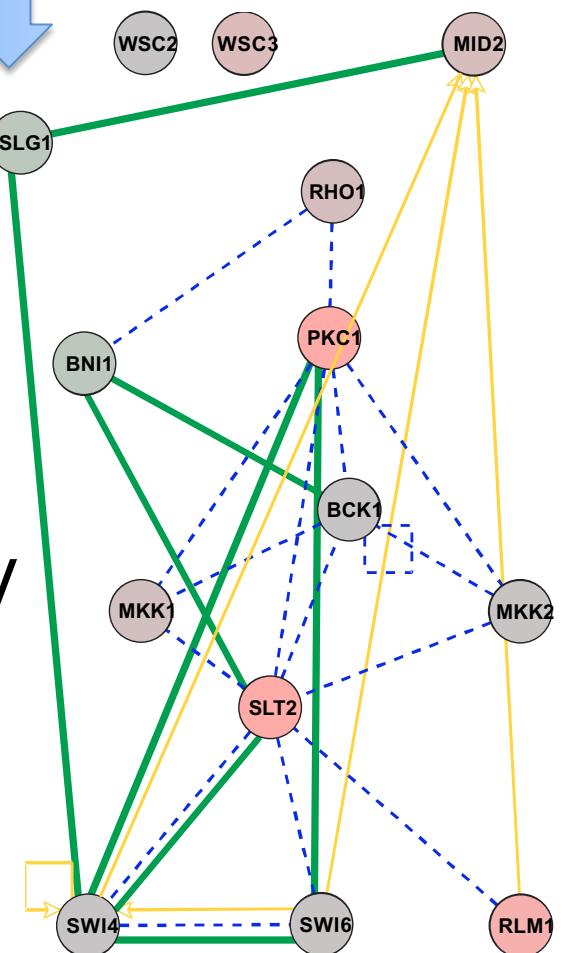


Zoom

Focus

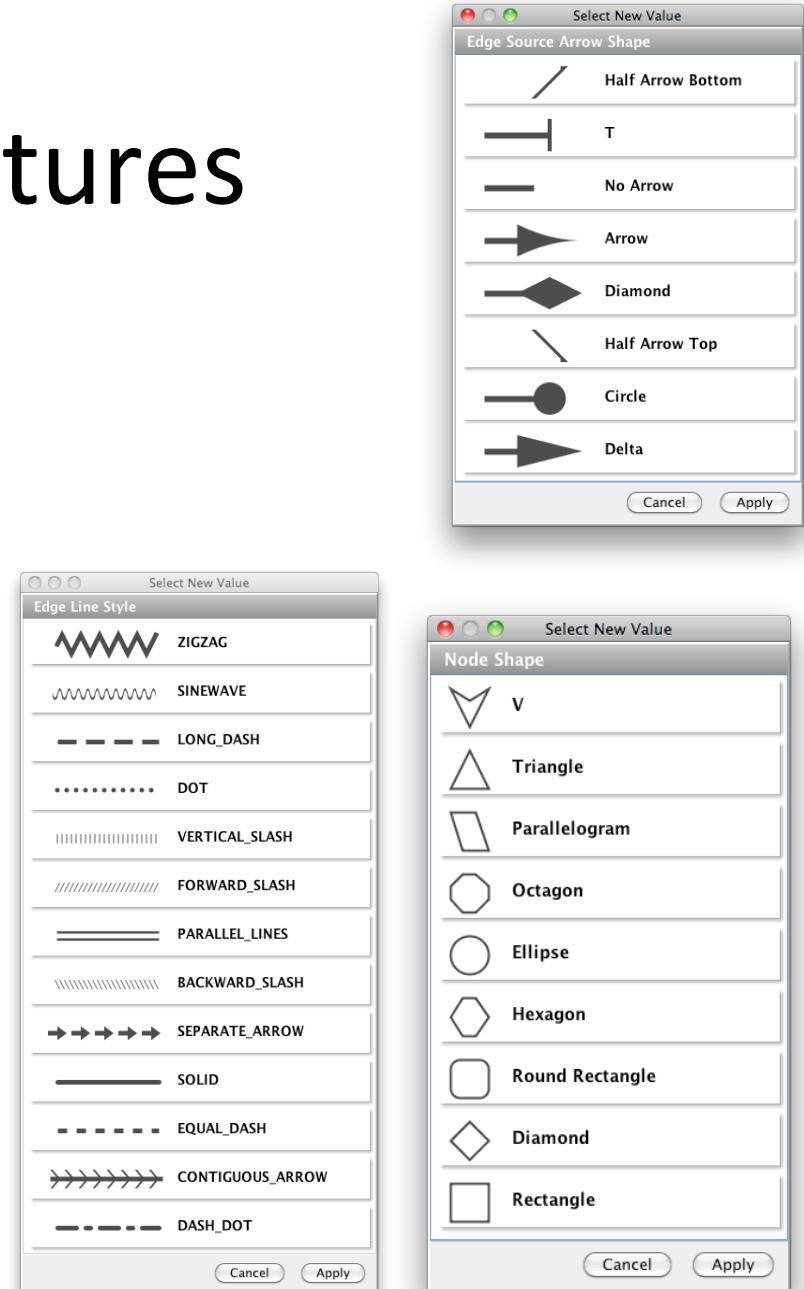
PKC
Cell
Wall
Integrity

- Synthetic Lethal
- Transcription Factor Regulation
- - - Protein-Protein Interaction
- Up Regulated Gene Expression
- Down Regulated Gene Expression

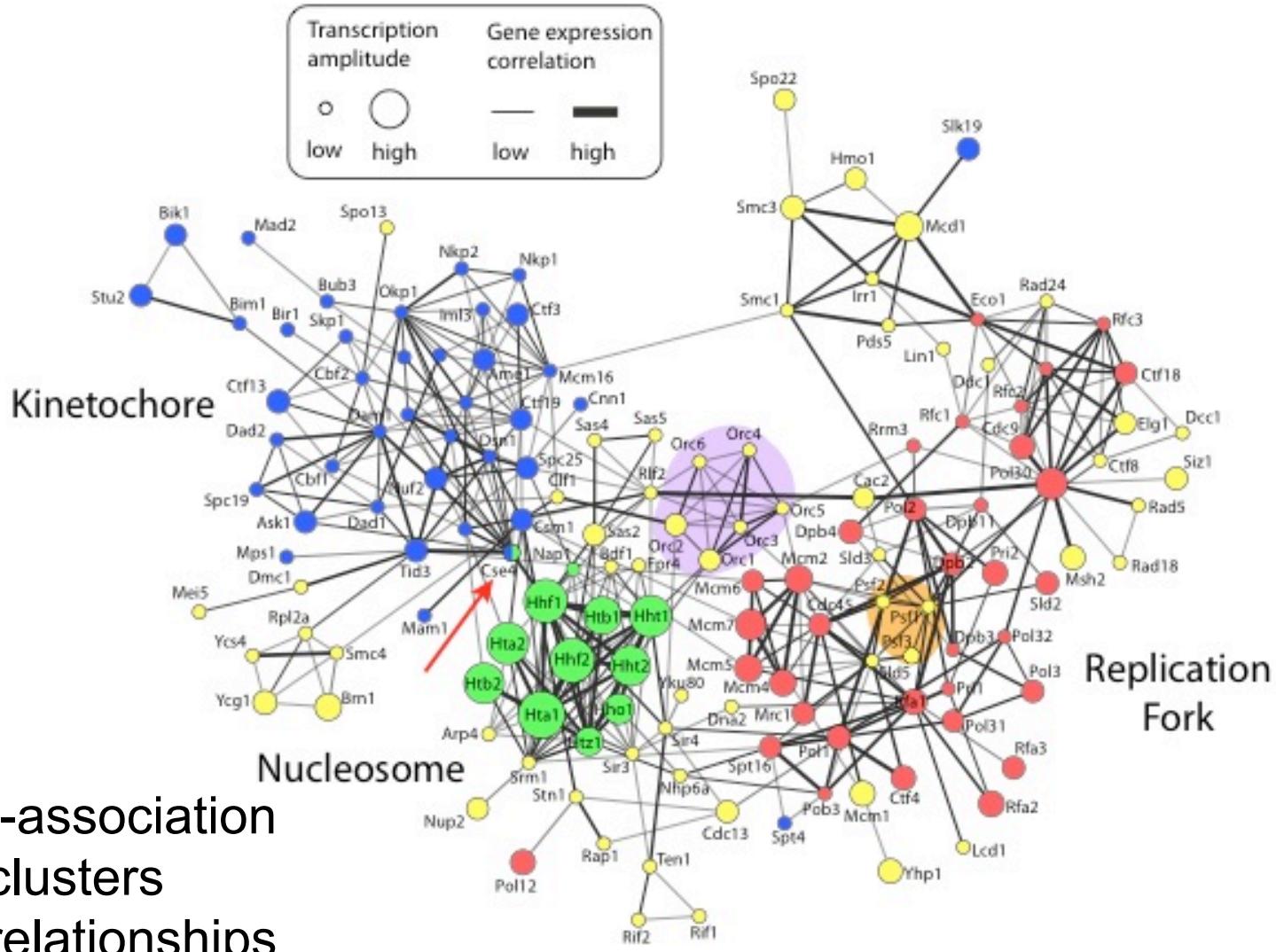


Visual Features

- Node and edge attributes
 - String, integer, float, Boolean, list
 - E.g. represent gene, interaction attributes
- Visual attributes
 - Node, edge visual properties
 - Colour, shape, size, borders, opacity...



Visually Interpreting a Network



What Have We Learned?

- Automatic layout is required to visualize networks
- Networks help you visualize interesting relationships in your data
- Avoid hairballs by focusing analysis
- Visual attributes enable multiple types of data to be shown at once – useful to see their relationships

Network Visualization and Analysis using Cytoscape

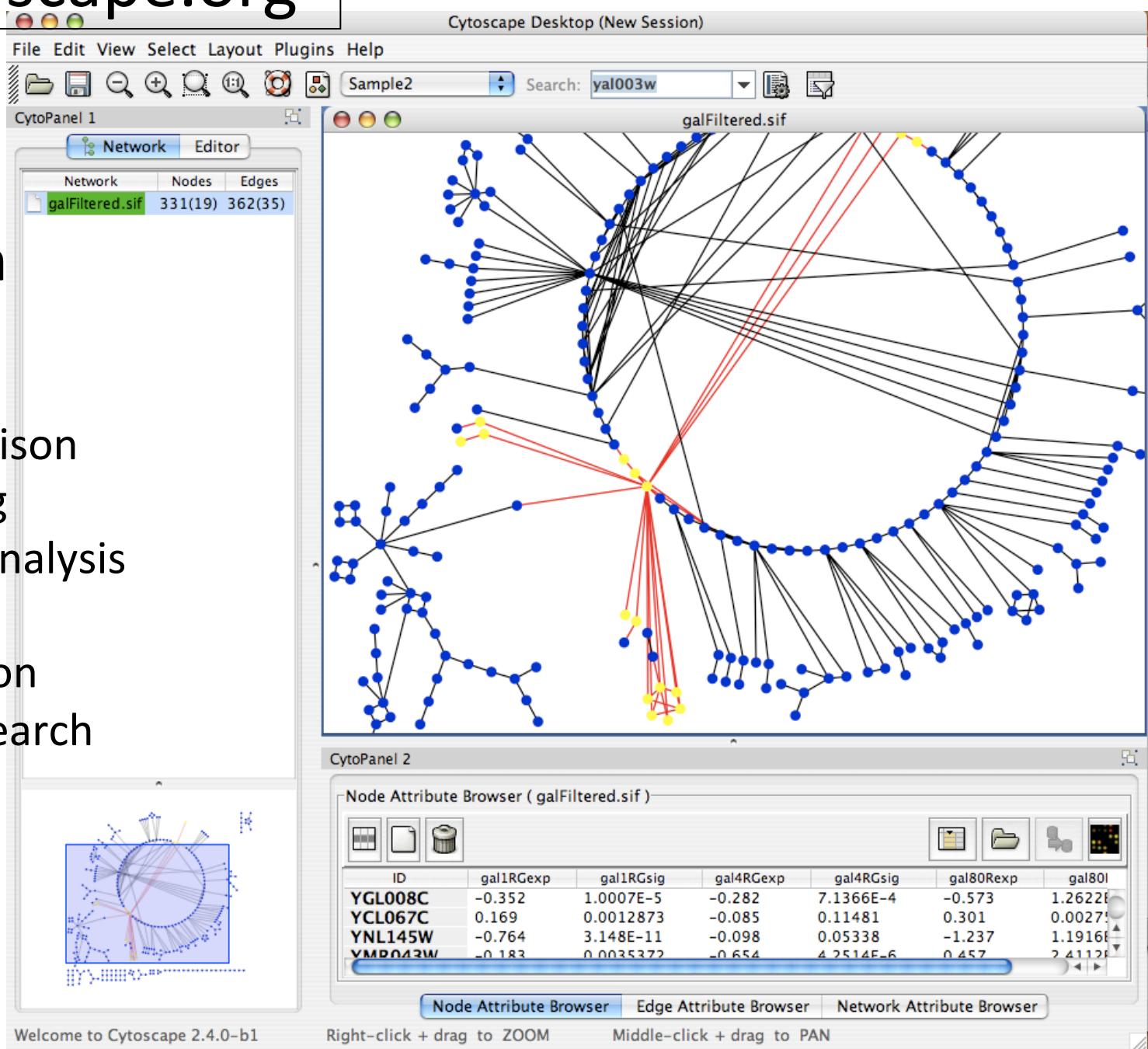
- Network visualization and analysis using Cytoscape software
- Cytoscape basics
- Cytoscape network analysis examples

<http://cytoscape.org>

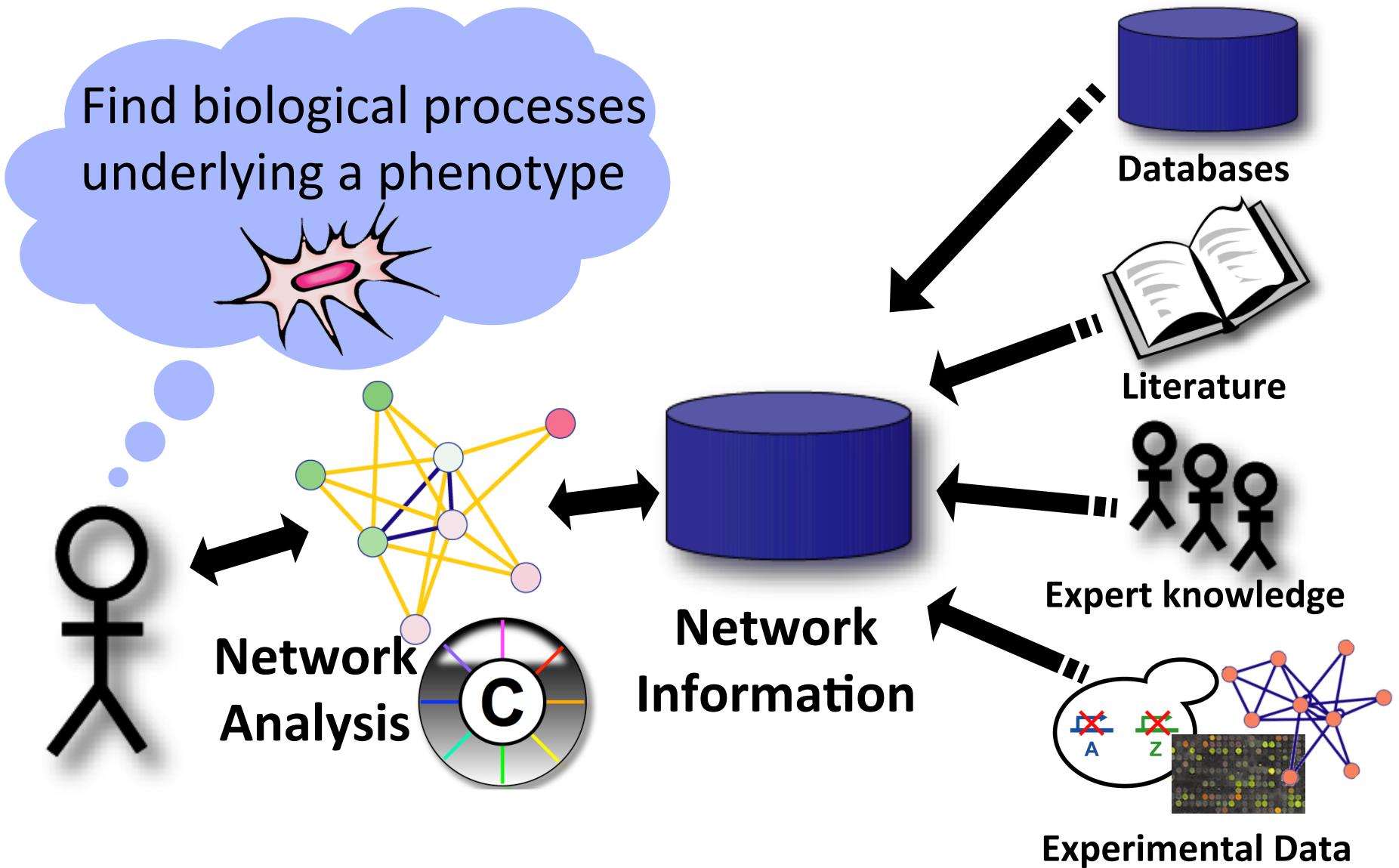
Network visualization and analysis

Pathway comparison
Literature mining
Gene Ontology analysis
Active modules
Complex detection
Network motif search

UCSD, ISB, Agilent,
MSKCC, Pasteur, UCSF,
Unilever, UToronto, U
Texas



Network Analysis using Cytoscape



Active Community

<http://www.cytoscape.org>

- Help
 - Tutorials, case studies
 - Mailing lists for discussion
 - Documentation, data sets
- Annual Conference: San Diego, May 18-21, 2011
- 10,000s users, 2500 downloads/month
- >100 Plugins Extend Functionality
 - Build your own, requires programming

Cline MS et al. Integration of biological networks and gene expression data using Cytoscape
Nat Protoc. 2007;2(10):2366-82

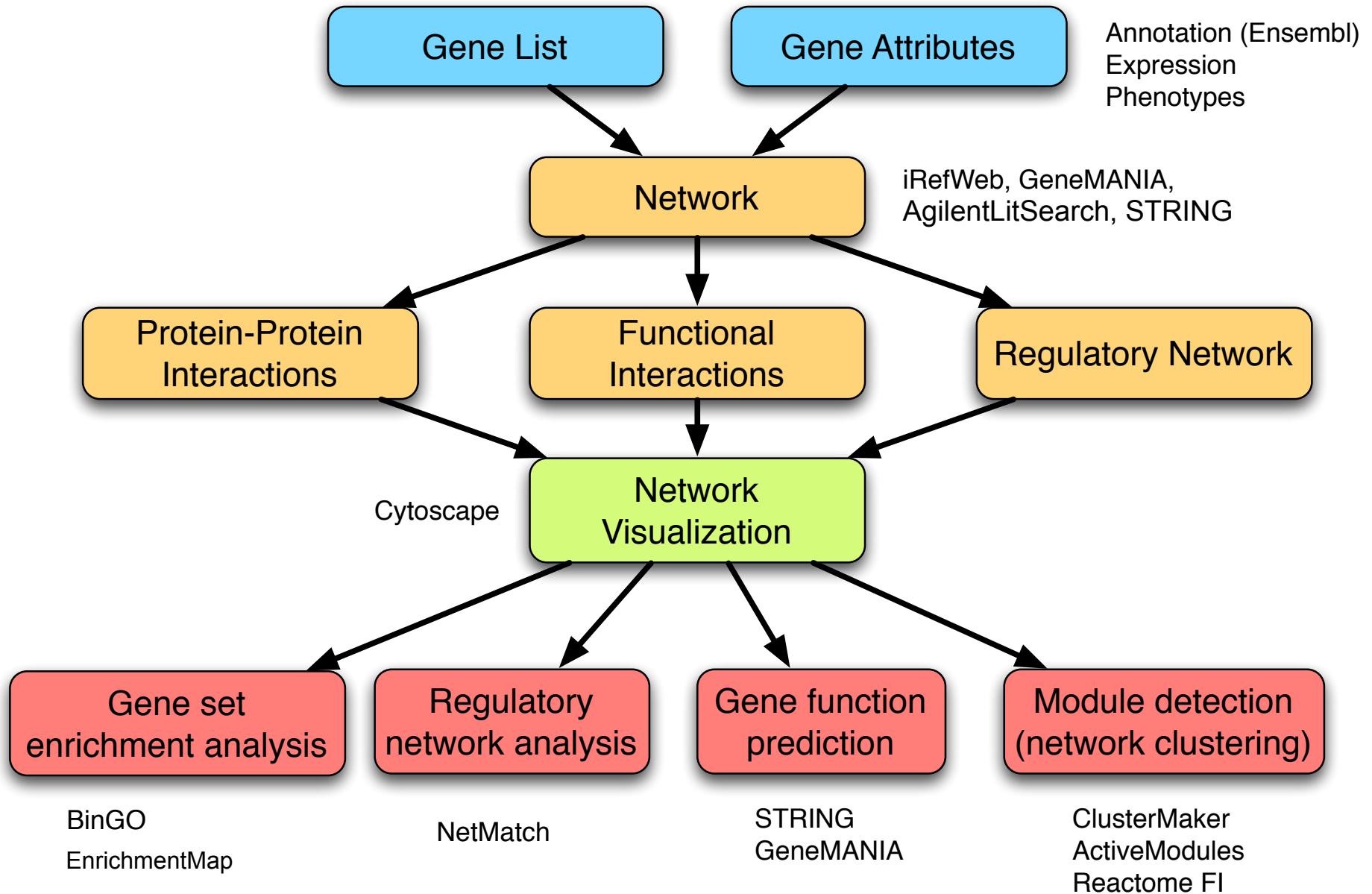


Cytoscape Demo

Version 2.8.0

www.cytoscape.org

Gene List and Network Analysis Overview



GENEMANIA

Find genes in **S. cerevisiae** (baker's yeast)related to **cdc27; apc11; apc4; cdc26; doc1**

Go

Showing 20 related genes

Show advanced options

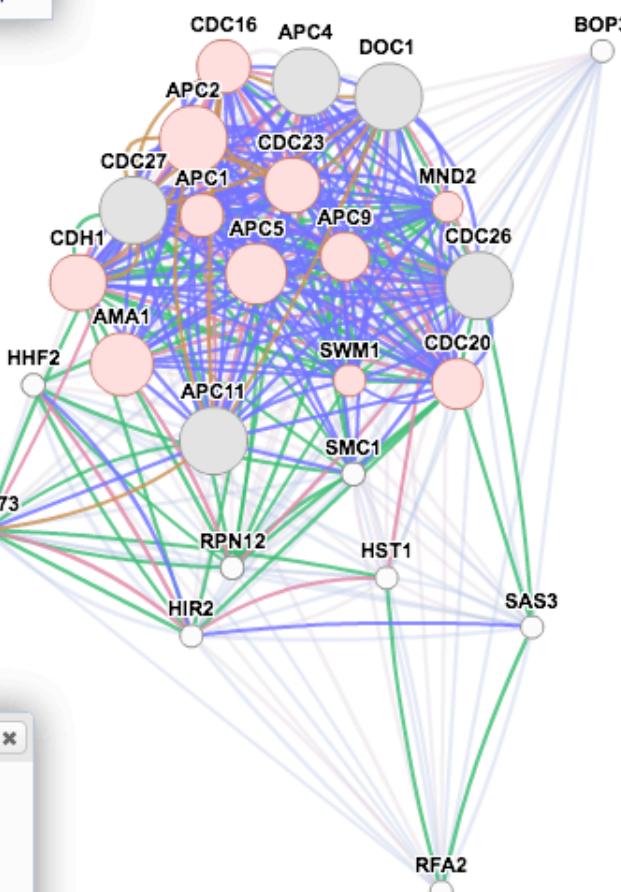
File ▾

Actions ▾

Networks legend

Functions legend

Functions legend



Networks legend

Co-expression

Co-localization

Genetic interactions

Other

Physical interactions

Predicted

Networks Genes Functions Help

Sort by: name, score

Expand: all, none

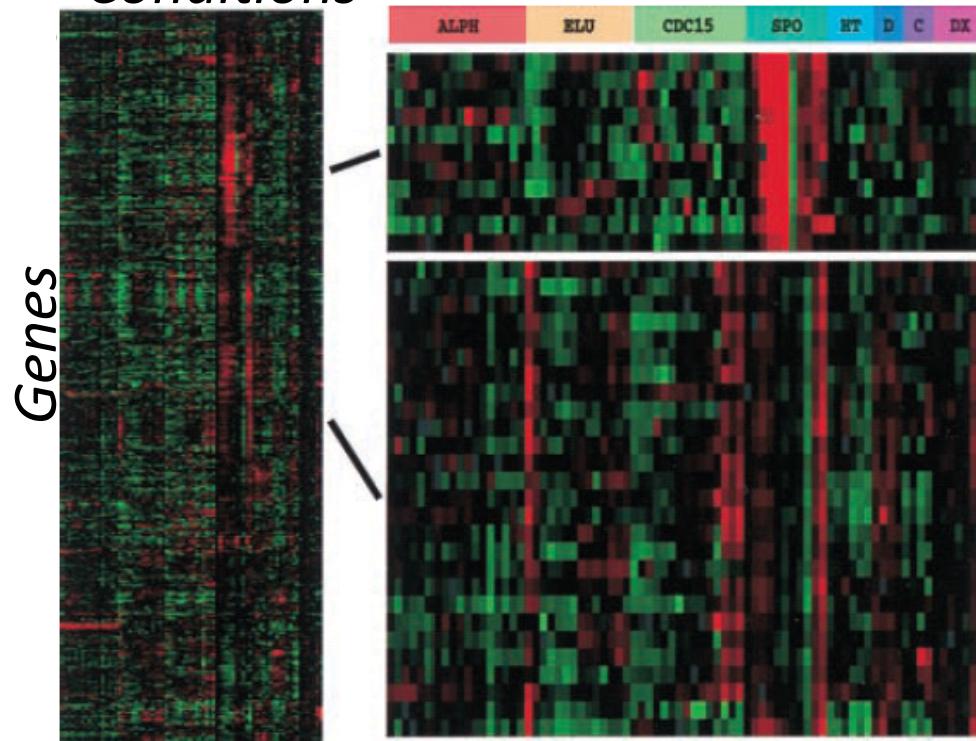
- ▶ **DOC1** Processivity factor required for the ubiquitination activity of the APC/Cyclosome 0.81
- ▶ **APC4** Subunit of the Anaphase-Promoting Complex/Cyclosome (APC/C) 0.75
- ▶ **APC11** Catalytic core subunit of the Anaphase-Promoting Complex/Cyclosome (APC/C) 0.73
- ▶ **CDC26** Subunit of the Anaphase-Promoting Complex/Cyclosome (APC/C) 0.69
- ▶ **CDC27** Subunit of the Anaphase-Promoting Complex/Cyclosome (APC/C) 0.64
- ▶ **APC2** Subunit of the Anaphase-Promoting Complex/Cyclosome (APC/C) 0.64
- ▶ **AMA1** Activator of meiotic anaphase promoting complex (APC/C) 0.67
- ▶ **CDH1** Cell-cycle regulated activator of the anaphase-promoting complex 0.66
- ▶ **CDC23** Subunit of the Anaphase-Promoting Complex/Cyclosome (APC/C) 0.64
- ▶ **CDC16** Subunit of the anaphase-promoting complex/cyclosome 0.64
- ▶ **CDC20** Cell-cycle regulated activator of anaphase-promoting complex 0.60
- ▶ **APC9** Subunit of the Anaphase-Promoting Complex/Cyclosome (APC/C) 0.58
- ▶ **APC1** Largest subunit of the Anaphase-Promoting Complex/Cyclosome (APC/C) 0.52
- ▶ **MND2** Subunit of the anaphase-promoting complex (APC/C) 0.37
- ▶ **SWM1** Subunit of the anaphase-promoting complex, which contains APC/C 0.37
- ▶ **RPN12** Subunit of the 19S regulatory particle of the 26S proteasome 0.28
- ▶ **CDC73** Component of the Paf1 complex that binds to an RNA polymerase II 0.28
- ▶ **HHF2** Histone H4, core histone protein required for chromatin structure 0.27
- ▶ **HIR2** Subunit of the HIR complex, a nucleosome assembly factor 0.27
- ▶ **HST1** NAD(+)-dependent histone deacetylase; essential subunit of HIR complex 0.27
- ▶ **BOP3** Protein of unknown function, potential Cdc28p substrate 0.27
- ▶ **RFA2** Subunit of heterotrimeric Replication Protein A (RPA), involved in DNA double-strand break repair 0.27
- ▶ **SAS3** Histone acetyltransferase catalytic subunit of NuA3 complex 0.27
- ▶ **SMC1** Subunit of the multiprotein cohesin complex, essential for cell division 0.27



www.genemania.org

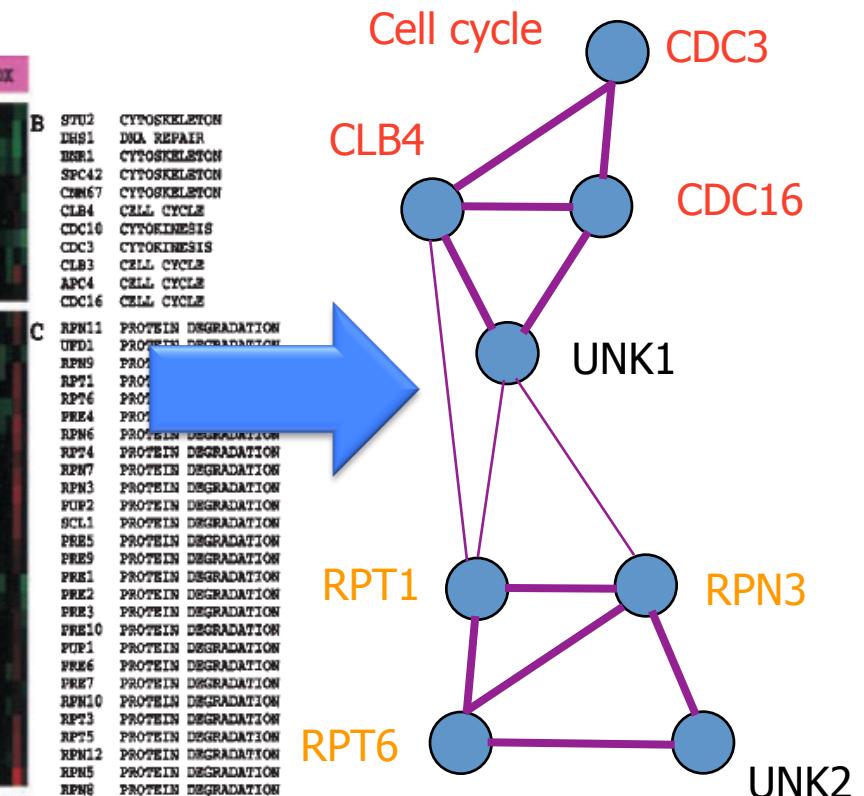
Guilt-by-association principle

Microarray expression data
Conditions



Eisen et al (PNAS 1998)

Co-expression network



Fraser AG, Marcotte EM - A probabilistic view of gene function - Nat Genet. 2004 Jun;36(6):559-64

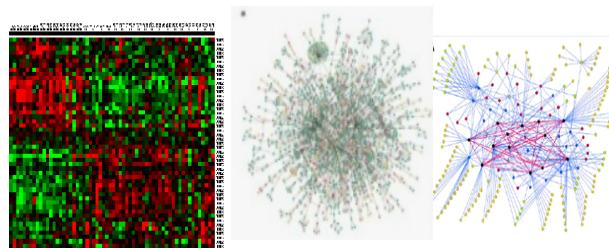
Two types of functional prediction

- “**Give me more genes like these**”,
 - e.g. find more genes in the Wnt signaling pathway, find more kinases, find more members of a protein complex
- “**What does my gene do?**”
 - Goal: determine a gene’s function based on who it interacts with: “guilt-by-association”.

“Give me more genes like these”

Input

Network and profile data



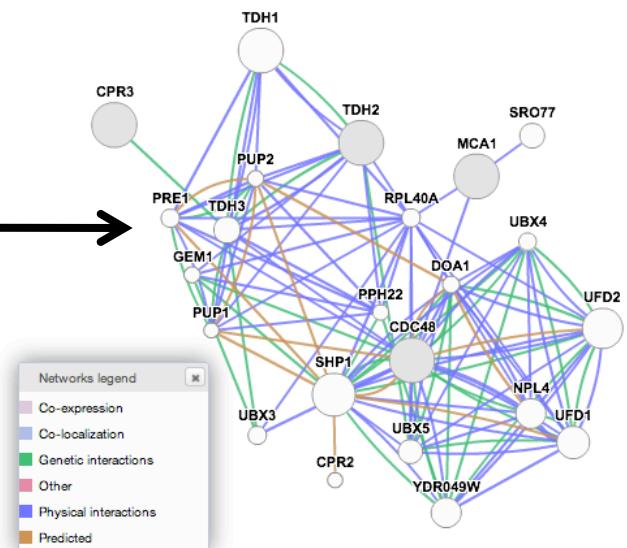
Query list

CDC48
CPR3
MCA1
TDH2

Gene
recommender
system

Output

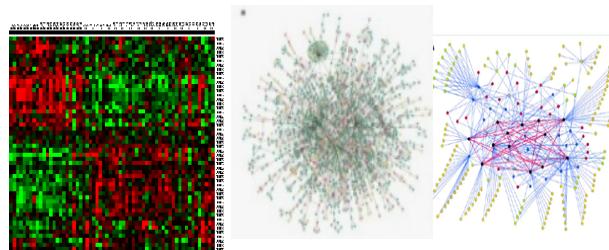
from GeneMANIA



“What does my gene do?”

Input

Network and profile data

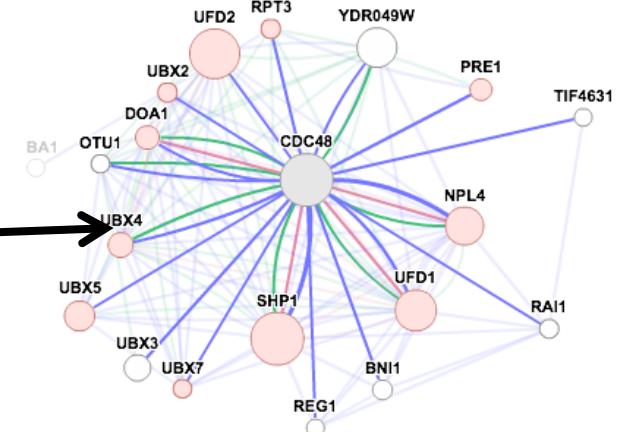


Query list

CDC48

Gene
recommender
system, then
enrichment
analysis

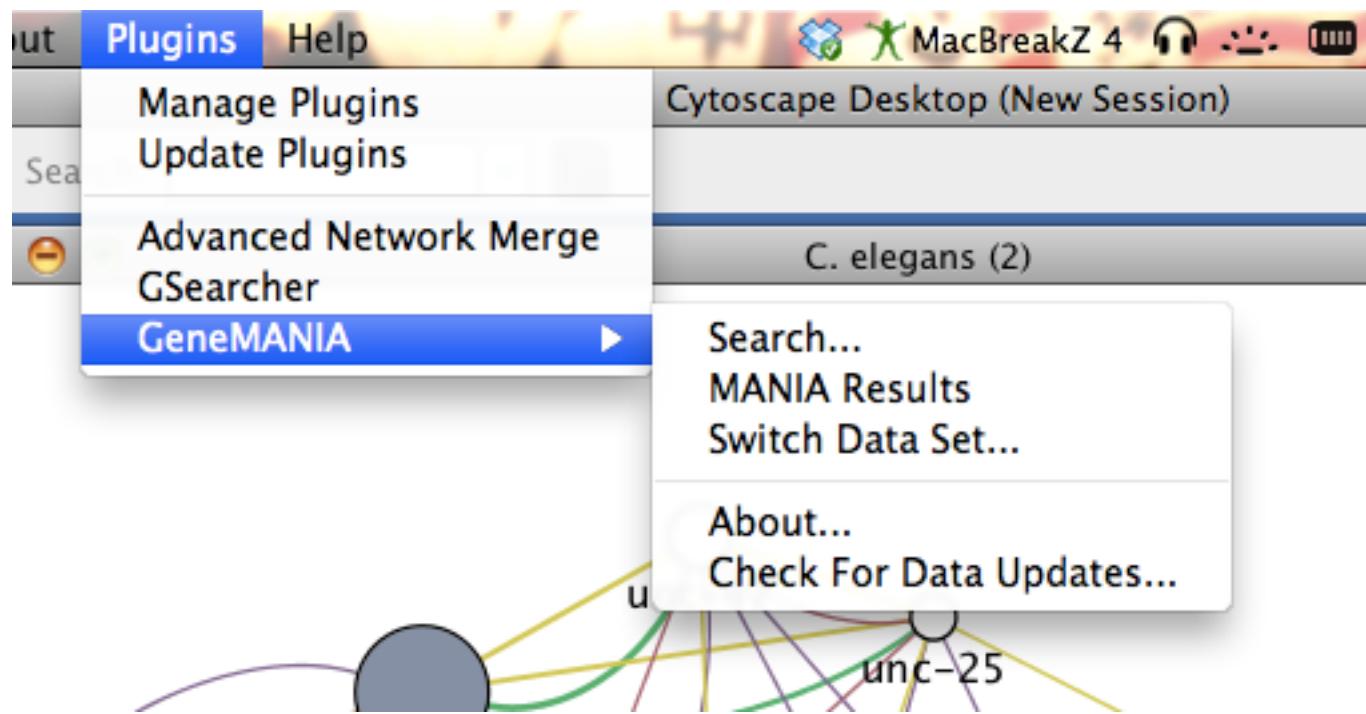
Output



Three parts of GeneMANIA:

- A large, automatically updated collection of interactions networks.
- A query algorithm to find genes and networks that are functionally associated to your query gene list.
- An interactive, client-side network browser with extensive link-outs

Cytoscape plugin



<http://www.genemania.org/plugin/>

GeneMANIA

Available Data

Organisms	Networks	Genes	Interactions	Version	Manage Data
1	76	20247	9394174	2010-04-28	

Choose Query Genes

Organism: C. elegans (worm)

Name	Description
unc-18 (UNC18_CAEEL)	unc-18 encodes the C. elegans ortholog of Saccharomyces cerevisiae SEC1 and mammalian Munc18 proteins. L
unc-30 (UNC30_CAEEL)	unc-30 encodes a homeodomain-containing protein that is orthologous to the Pitx family of homeodomain tran
unc-4 (UNC4_CAEEL)	The unc-4 gene encodes a paired-class homeodomain protein with homologs in Drosophila and vertebrates. I
unc-5 (UNC5_CAEEL)	unc-5 encodes a netrin receptor. unc-5 activity is required cell autonomously for dorsalward cell and pioneer

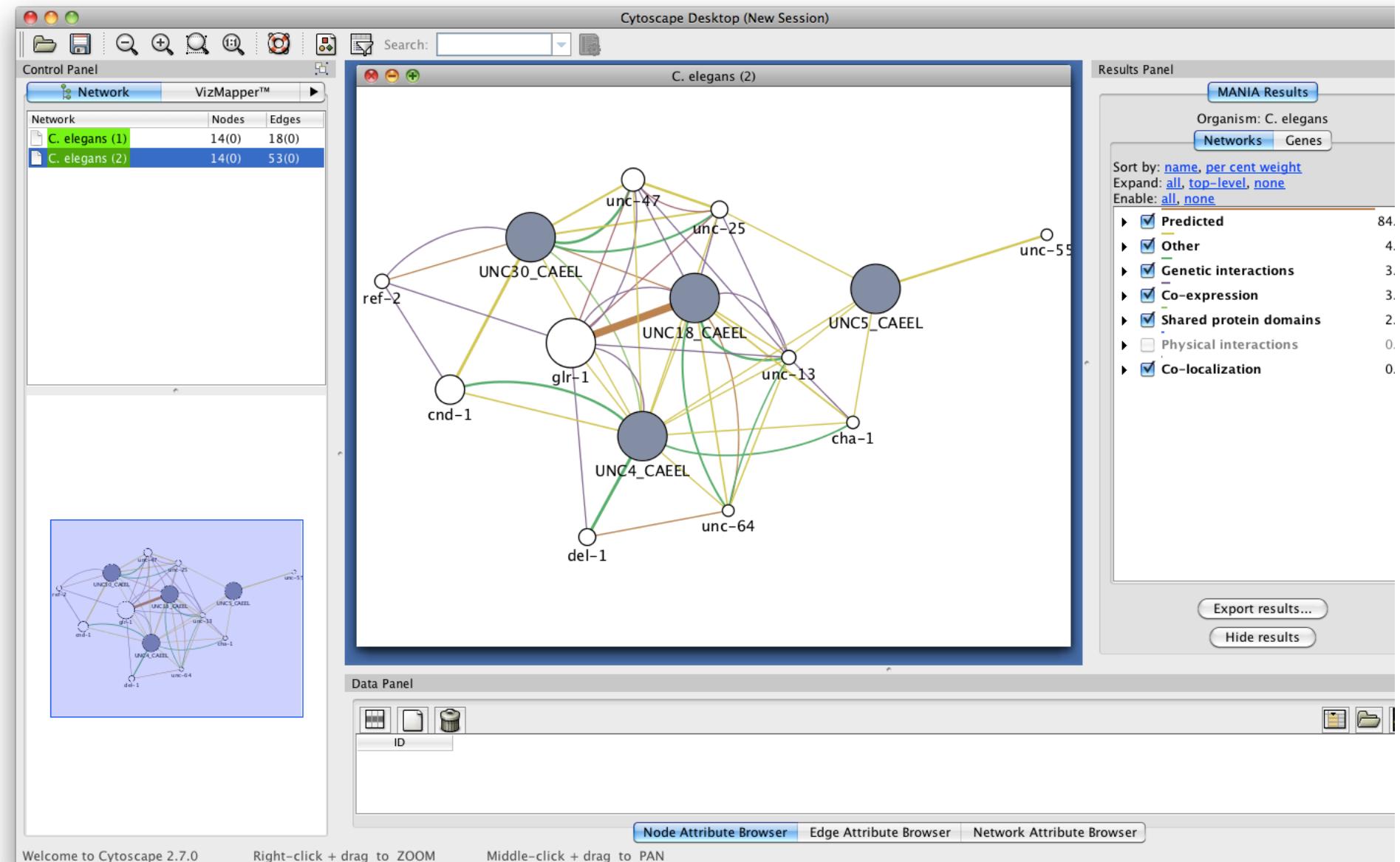
Remove Remove All

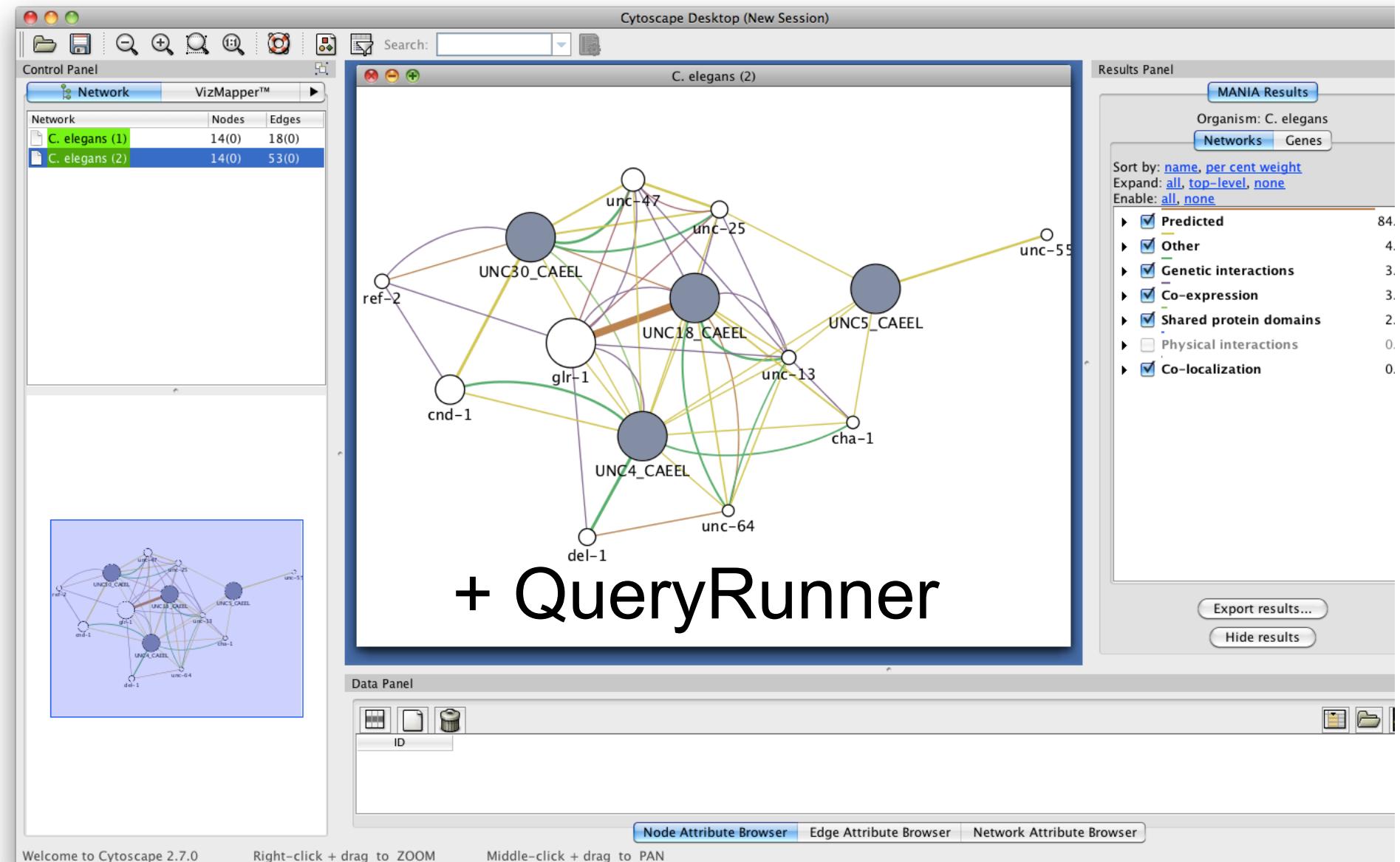
Choose Interaction Networks

Select: [all](#), [none](#), [default](#).

<input checked="" type="checkbox"/> Co-expression (3/10)	<input type="checkbox"/> Baugh-Hunter-2005
<input checked="" type="checkbox"/> Co-localization (1/1)	<input type="checkbox"/> Fox-Miller-2007 A
<input checked="" type="checkbox"/> Genetic interactions (2/4)	<input type="checkbox"/> Fox-Miller-2007 B
<input type="checkbox"/> Other (0/1)	<input type="checkbox"/> Kirienko-Fay-2007
<input checked="" type="checkbox"/> Physical interactions (4/8)	<input type="checkbox"/> Lee-Marcotte-2008 Co-expressi
<input type="checkbox"/> Predicted (0/50)	<input checked="" type="checkbox"/> Lewis-Jackson-2009
<input type="checkbox"/> Shared protein domains (0/2)	<input type="checkbox"/> McElwee-Gems-2004

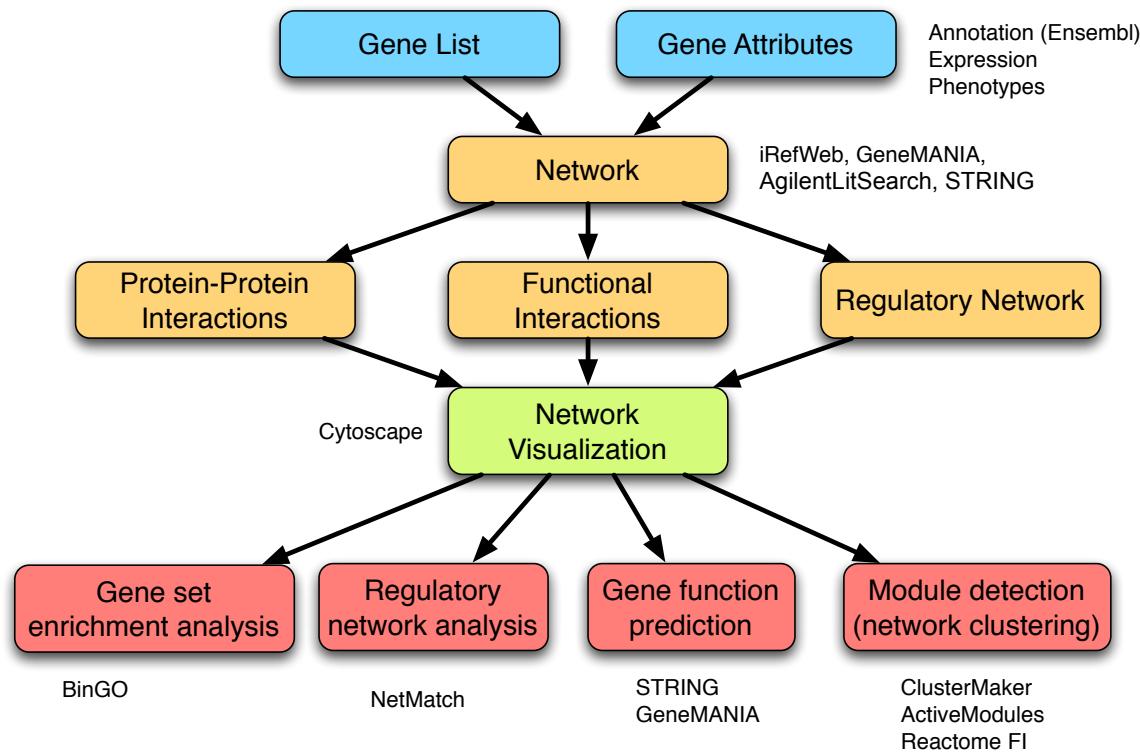
Find the top 10 related genes using automatic weighting. Start





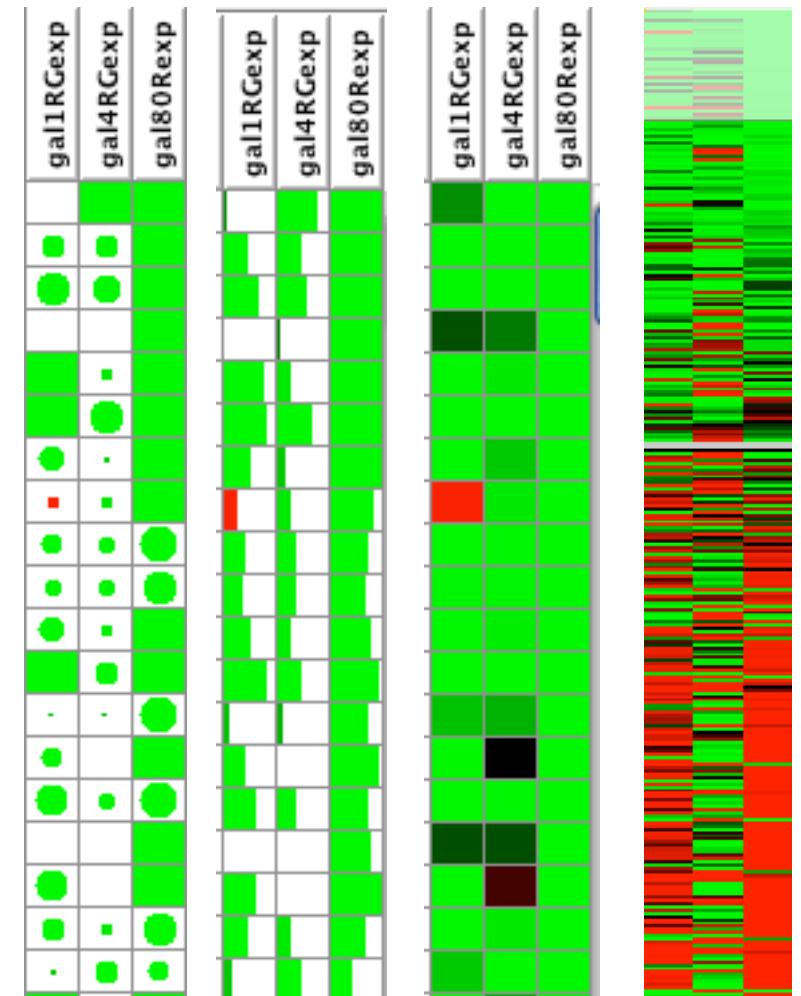
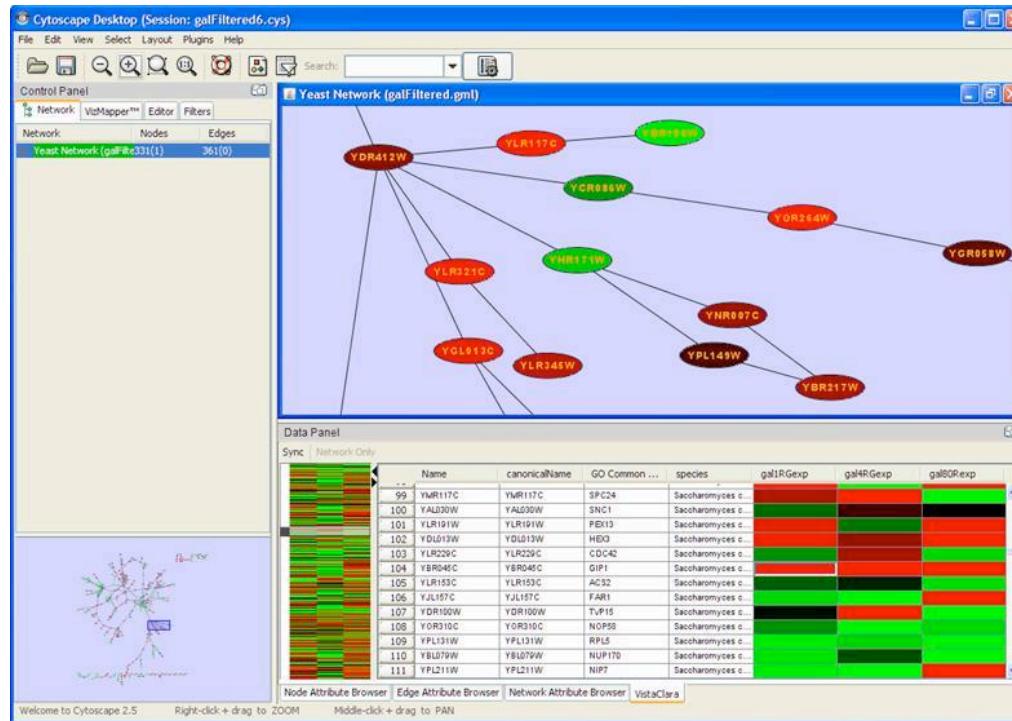
More detail on specific network analysis tasks using Cytoscape

Gene List and Network Analysis Overview



VistaClara

- Visualization for gene expression data
- Heat maps, sorting, animation



Cytoscape Lab

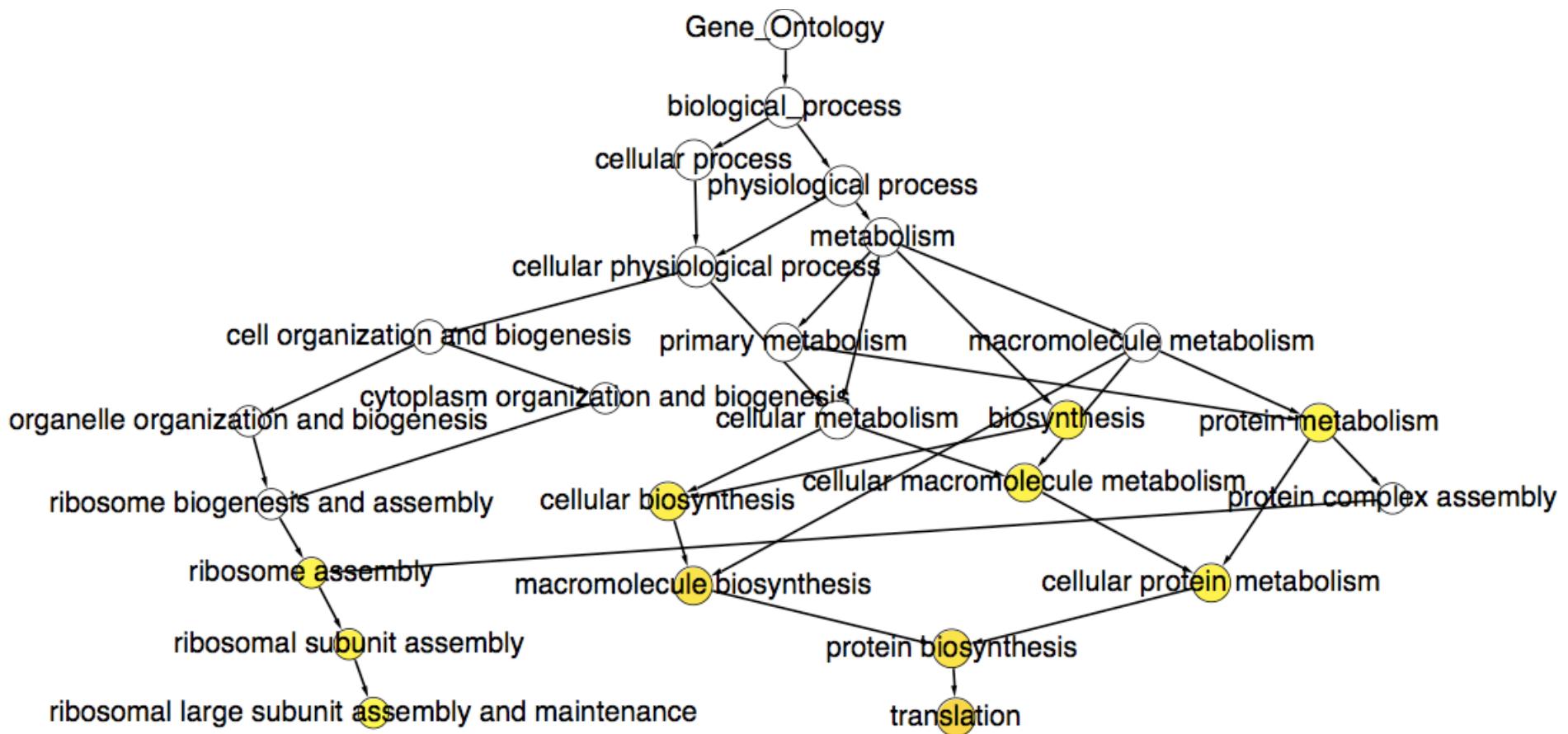
- Cytoscape – expression data visualization
 - Load the sample network file: galFiltered.sif
 - Lay it out – try different layouts
 - Load expression data - galExpData.pvals
 - Use File->Import->Attribute from Table
 - Examine node attributes
 - Visualize gene expression data using the Visual Mapper
 - Install the VistaClara plugin from the plugin manager
 - Play the expression data as a movie

BiNGO plugin

- Calculates over-representation of a subset of genes with respect to a background set in a specific GO category
- Input: subnetwork, or list
 - Background set by user
- Output: tree with nodes color reflecting overrepresentation; also as lists
- Caveats: Gene identifiers must match; low GO term coverage, GO bias, Background determining

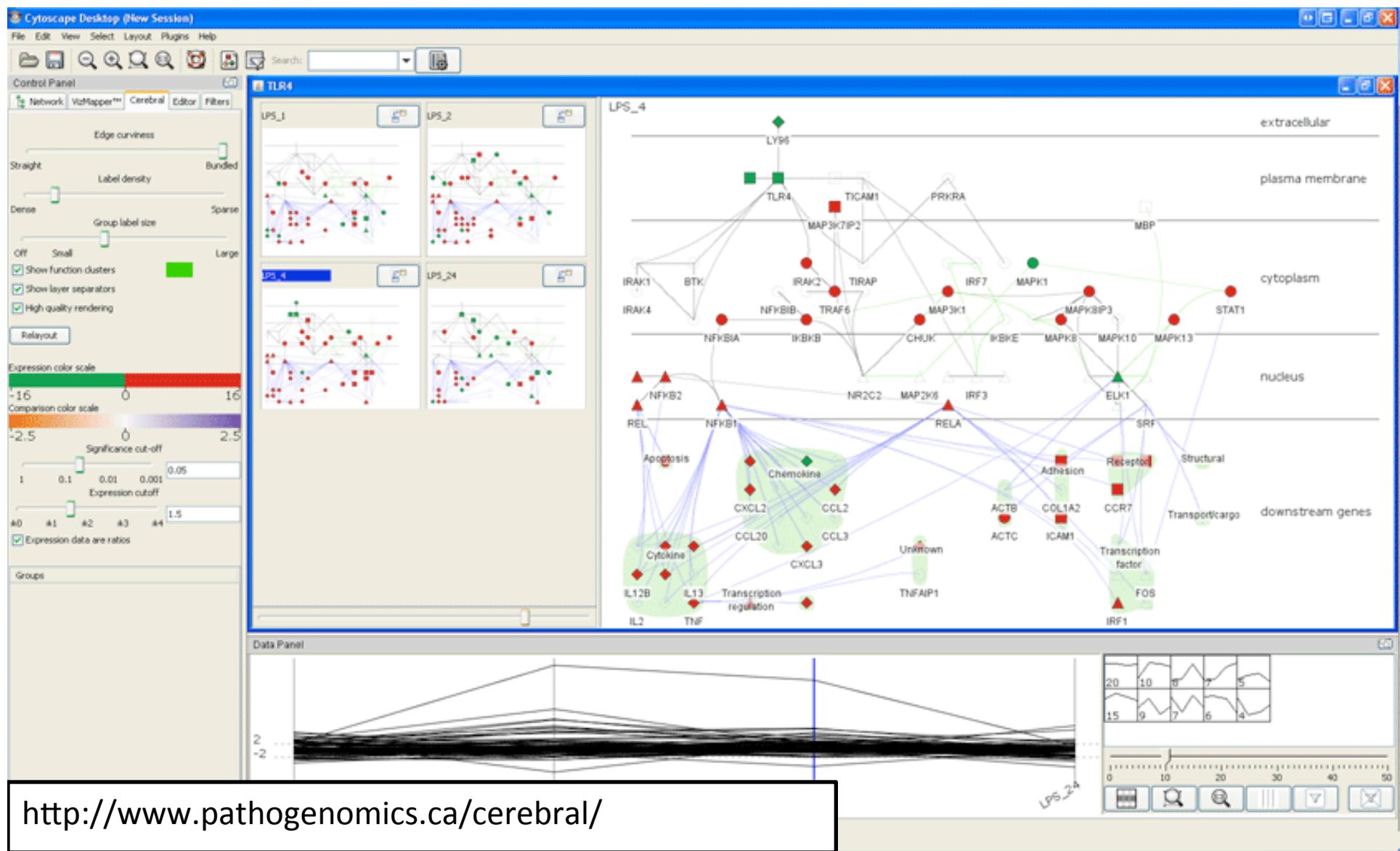
BiNGO

Hypergeometric p-value Multiple testing correction (Benjamini-Hochberg FDR)



Maere, S., Heymans, K. and Kuiper, M
Bioinformatics 21, 3448-3449, 2005

Cerebral



Find Active Subnetworks

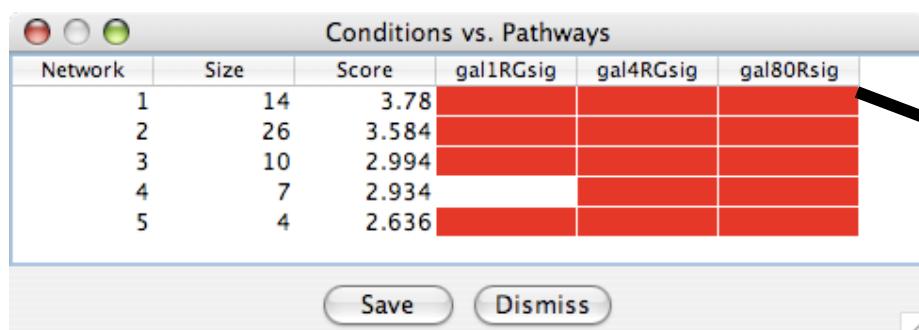
- Active modules
 - Input: network + p-values for gene expression values e.g. from GCRMA
 - Output: significantly differentially expressed subgraphs
- Method
 - Calculate z-score/node, Z_A score/subgraph, correct vs. random expression data sampling
 - Score over multiple experimental conditions
 - Simulated annealing used to find high scoring networks

Ideker T, Ozier O, Schwikowski B, Siegel AF
Bioinformatics. 2002;18 Suppl 1:S233-40

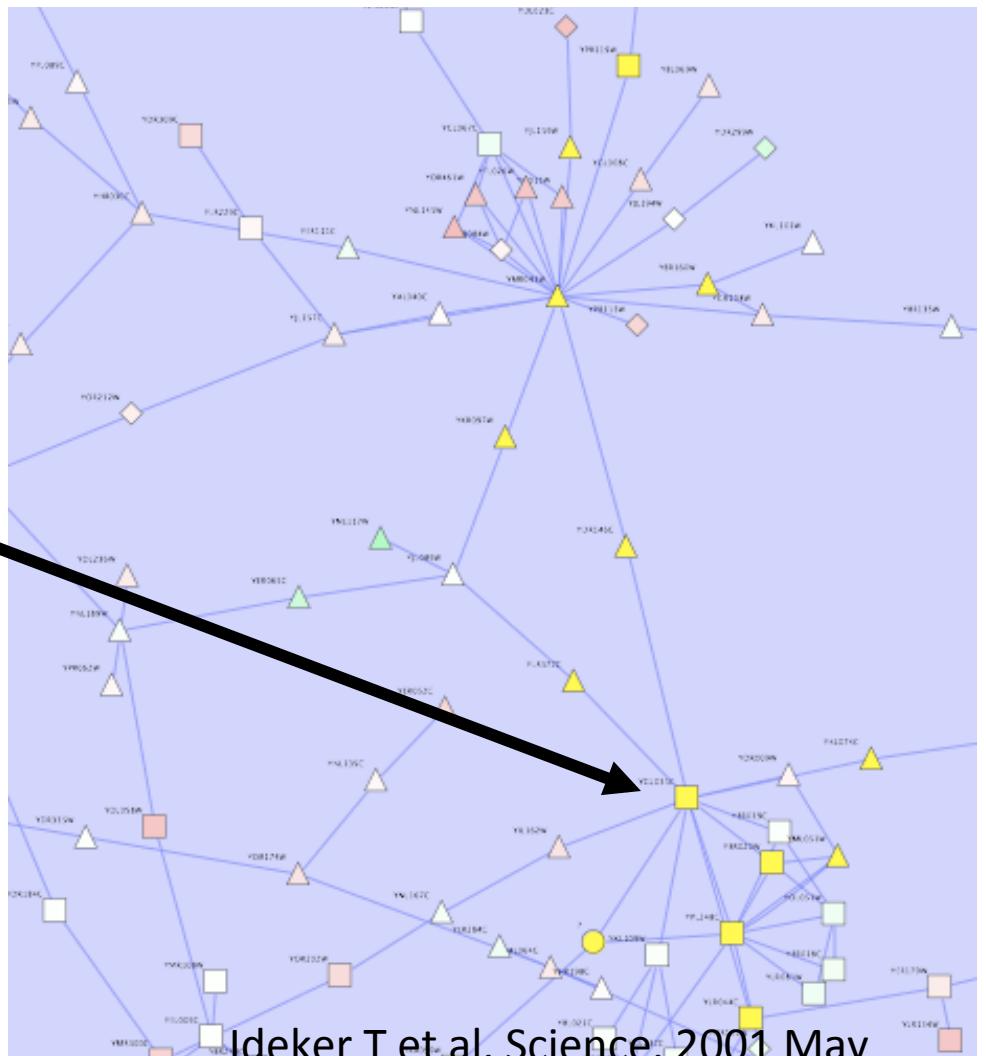
Active Module Results

Network: yeast protein-protein and protein-DNA network

Expression data: 3 gene knock out conditions (enzyme, TF activator, TF repressor)



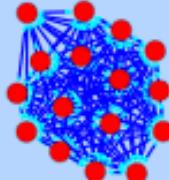
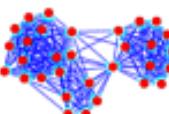
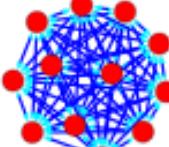
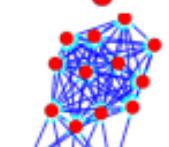
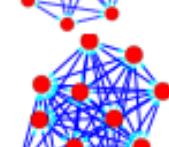
Note: non-deterministic, multiple runs required for confidence of result robustness



Ideker T et al. Science. 2001 May 4;292(5518):929-34.

Network Clustering

- Clusters in a protein-protein interaction network have been shown to represent protein complexes and parts of pathways
- Clusters in a protein similarity network represent protein families
- Network clustering is available through the ClusterMaker Cytoscape plugin

MCODE Results Summary				
Rank	Score	Size	Names	Complex
1	7.25	16,116	YGR232W, YDL007W, YKL145W, YFR052W, YFR004W, YLR421C, YOR261C, YDL147W, YDR427W, YHR200W, YER021W, YOR117W, YDL097C, YOR259C, YPR108W, YDR394W	
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, YPR187W, YPR010C, YPR110C, YNL248C, YOR341W, YNR003C, YKL144C, YOR207C, YPR190C, YNL113W, YOR116C, YBR154C	
5	5	12,60		



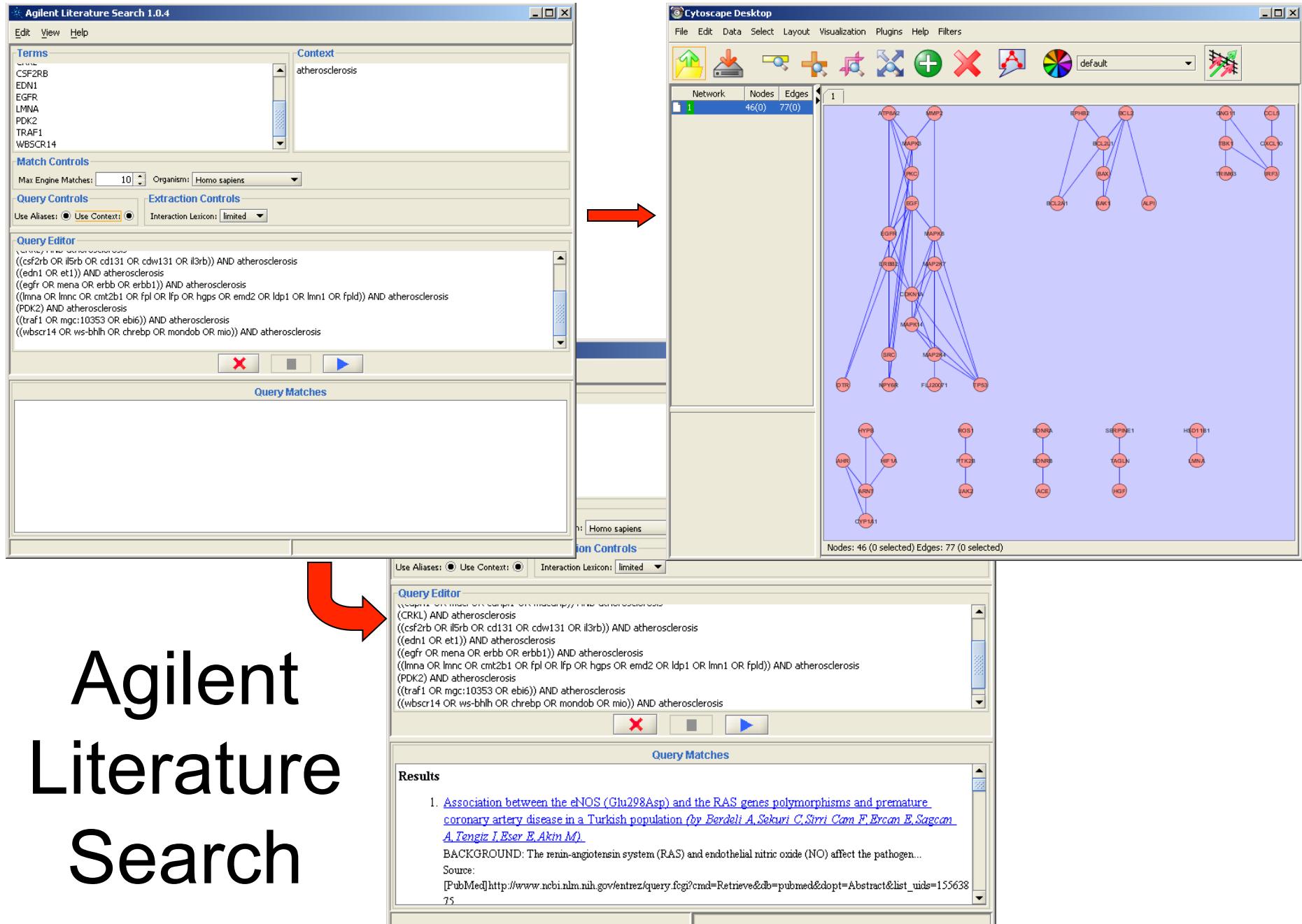
Create a new child network.

Save

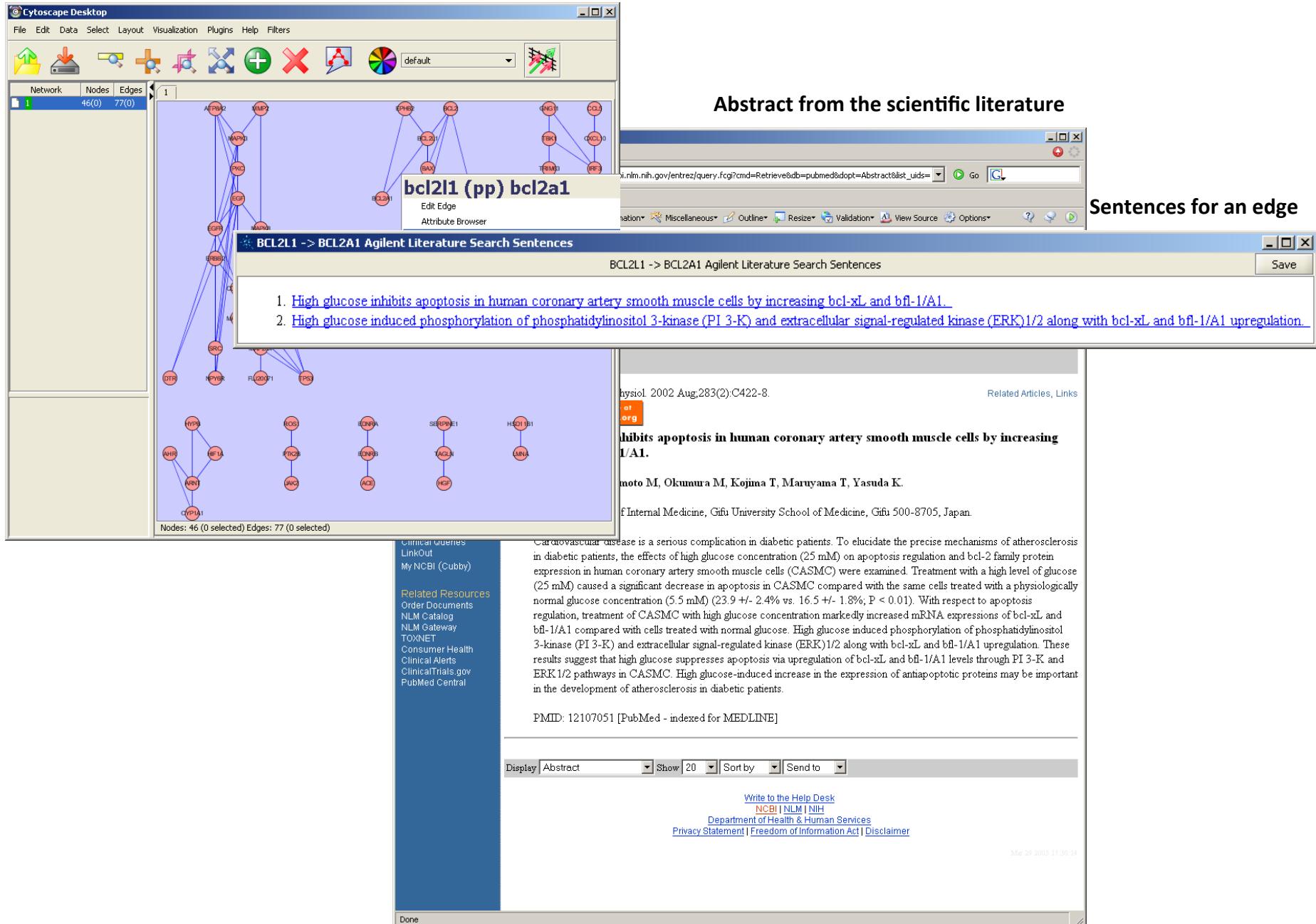
Done

Text Mining

- Computationally extract gene relationships from text, usually PubMed abstracts
- Useful if network is not in a database
 - Literature search tool
- BUT not perfect
 - Problems recognizing gene names
 - Natural language processing is difficult
- Agilent Literature Search Cytoscape plugin
- iHOP (www.ihop-net.org/UniPub/iHOP/)



Cytoscape Network produced by Literature Search.



Analysis Lab

Find Network Motifs - Netmatch plugin

- Network motif is a sub-network that occurs significantly more often than by chance alone
- Input: query and target networks, optional node/edge labels
- Output: topological query matches as subgraphs of target network
- Supports: subgraph matching, node/edge labels, label wildcards, approximate paths
- <http://alpha.dmi.unict.it/~ctnyu/netmatch.html>

Finding specific biological relevant TF-PPI sub-networks

NetMatch Query Editor – new query*

Query Edit

Palette Motifs

Feed Forward Loop

Info:

Pass Query to NetMatch

Nodes: 6 Edges: 6 Paths: 0 Loops: 0

Query

The screenshot shows the NetMatch Query Editor interface. On the left, there's a toolbar with icons for file operations and a palette containing motifs. A 'Motifs' tab is selected, showing a 'Feed Forward Loop' motif where three nodes are arranged in a triangle with directed edges forming a loop. Below the toolbar is an 'Info:' panel which is currently empty. At the bottom left is a 'Pass Query to NetMatch' button. The main area is labeled 'Query' and contains the motif diagram. At the bottom right of the editor is a status bar showing 'Nodes: 6 Edges: 6 Paths: 0 Loops: 0'. The bottom of the window has buttons for 'Acquire Data', 'Go', and 'Reset'.

NetMatch V1.0.1

File Query Wizard Help

Graph Properties:

Labeled
 Directed

Query Properties:

Query: Draw a query...
QE-FFL

Query Node Attributes:
QE-FFL - Nodes Attributes

Query Edge Attributes:
QE-FFL - Edges Attributes

Network Properties:

Network: 1-galFiltered.sif

Network Node Attributes:
annotation.GO BIOLOGIC...

Network Edge Attributes:
TextSourceInfo

Options:

Acquire Data
Go
Reset

Match Number Nodes Image

1	YMR309C, YOR361C, YPR041W	
2	YOR310C, YDL014W, YLR197W	
3	YDR100W, YGL161C, YOR036W	
4	YIL015W, YMR043W, YCL067C	

Create a new child network. Save

Results

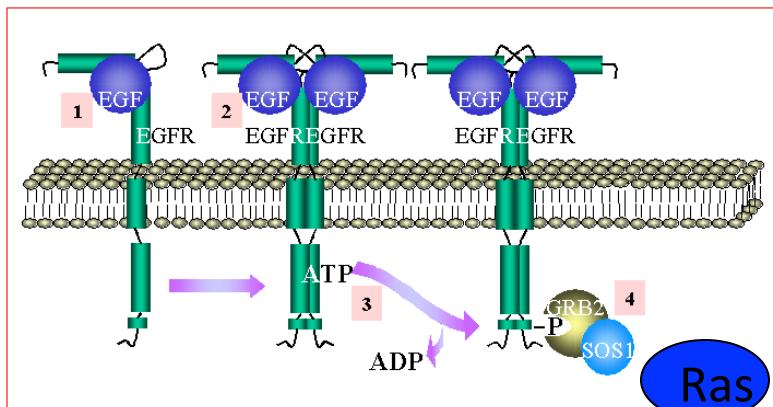
```
1 matches YBR020W
2 matches YGL035C
*****
Match 21
0 matches YPL248C
1 matches YML051W
2 matches YPR020W
*****
0 matches Y
1 matches Y
2 matches Y
*****
```

Ferro et al. Bioinformatics 2007

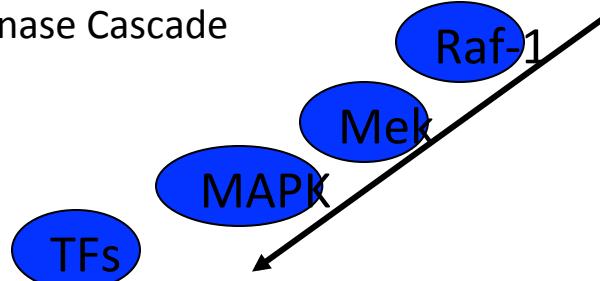
Find Signaling Pathways

- Potential signaling pathways from plasma membrane to nucleus via cytoplasm

Signaling pathway example

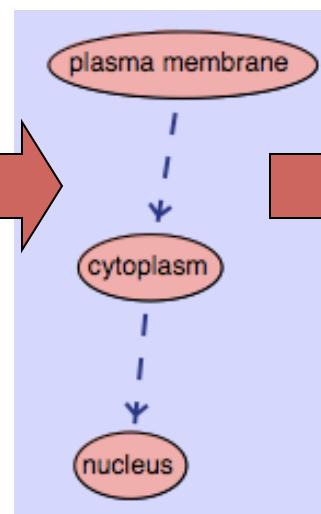


MAP Kinase Cascade



Nucleus - Growth Control
Mitogenesis

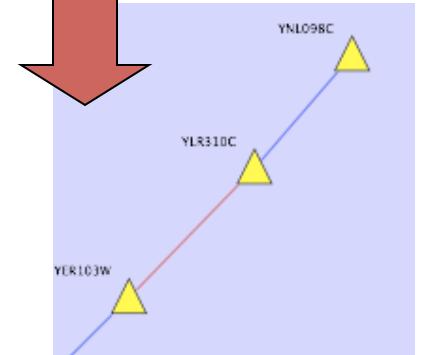
NetMatch query



NetMatch Results

Match Number	Nodes	Image
YGL008C		
4	YJL157C, YMR043W, YLR229C	
5	YJL157C, YAL040C, YLR229C	

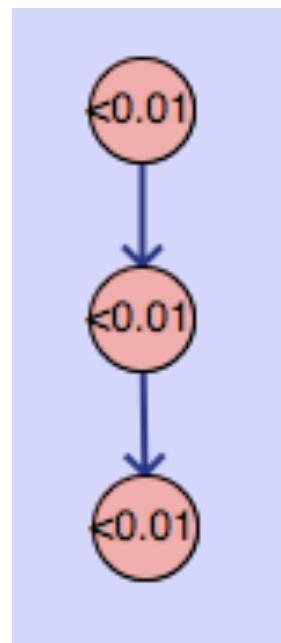
Shortest path between subgraph matches



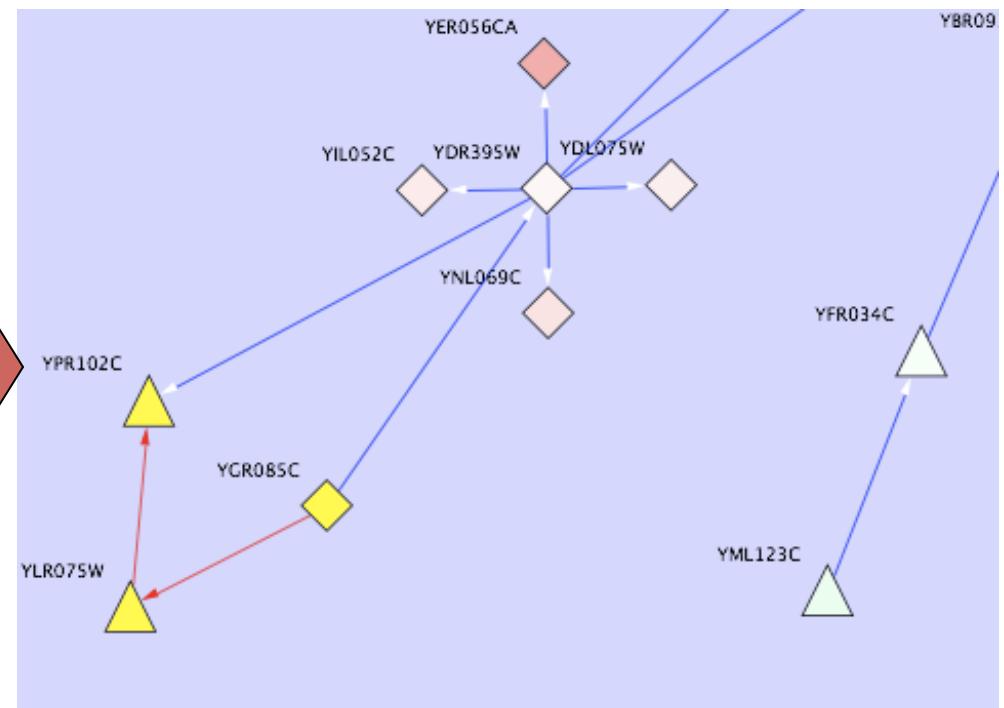
Find Expressed Motifs

Find specific subgraphs where certain nodes are significantly differentially expressed

NetMatch query



NetMatch Results



Protein	Differential Expression Significance
YLR075W	1.7255E-4
YGR085C	2.639E-4
YPR102C	3.7183E-4

Cytoscape Tips & Tricks

- “Root graph”
 - “There is one graph to rule them all....”
 - The networks in Cytoscape are all “views” on a single graph.
 - Changing the attribute for a node in one network *will* also change that attribute for a node with the same ID in all other loaded networks
 - There is no way to “copy” a node and keep the same ID
 - Make a copy of the session

Cytoscape Tips & Tricks

- Network views
 - When you open a large network, you will not get a view by default
 - To improve interactive performance, Cytoscape has the concept of “Levels of Detail”
 - Some visual attributes will only be apparent when you zoom in
 - The level of detail for various attributes can be changed in the preferences
 - To see what things will look like at full detail:
 - View→Show Graphics Details

Cytoscape Tips & Tricks

- Sessions
 - Sessions save pretty much everything:
 - Networks
 - Properties
 - Visual styles
 - Screen sizes
 - Saving a session on a large screen may require some resizing when opened on your laptop

Cytoscape Tips & Tricks

- Logging
 - By default, Cytoscape writes its logs to the Error Dialog: Help→Error Dialog
 - Can change a preference to write it to the console
 - Edit→Preferences→Properties...
 - Set logger.console to true
 - Don't forget to save your preferences
 - Restart Cytoscape
 - (can also turn on debugging: cytoscape.debug, but I don't recommend it)

Cytoscape Tips & Tricks

- Memory
 - Cytoscape uses lots of it
 - Doesn't like to let go of it
 - An occasional restart when working with large networks is a good thing
 - Destroy views when you don't need them
 - Java doesn't give us a good way to get the memory right at start time
 - Since version 2.7, Cytoscape does a much better job at “guessing” good default memory sizes than previous versions

Cytoscape Tips & Tricks

- .cytoscape directory
 - Your defaults and any plugins downloaded from the plugin manager will go here
 - Sometimes, if things get really messed up, deleting (or renaming) this directory can give you a “clean slate”
- Plugin manager
 - “Outdated” doesn’t necessarily mean “won’t work”
 - Plugin authors don’t always update their plugins immediately after new releases