

# Seminar on biological networks

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"Network science deals with complexity by "simplifying" complex systems, summarizing them merely as **components (nodes)** and **interactions (edges)** between them. In this simplified approach, the functional richness of each node is lost. Despite or even perhaps because of such simplifications, useful discoveries can be made."

Marc Vidal, Michael E. Cusick, and Albert-László Barabási, **Cell**, 144, 986-998 (2011).



## Biological networks: weighted graphs with a biological interpretation

	Mathematical $G = (V, E)$	Biological	Visual
Nodes (vertices)	A finite set V	Components of the system: genes, proteins, metabolites	
Edges	A set <i>E</i> of, unordered or ordered, node pairs	Pairwise interactions of the components: physical, regulatory, genetic	
Edge weights	Function from the set <i>E</i> to real numbers	Interaction strength	



## Biological networks: weighted graphs with a biological interpretation

	Mathematical $G = (V, E)$	Biological	Visual
Nodes (vertices	A finite set V	Components of the system: genes, proteins, metabolites	
Edges	Typical process in bioi move from <b>biological</b> <b>computational</b> (abstr In a way that produces		
Edge weights	Function from the set <i>E</i> to real numbers	Interaction strength	



**Nodes:** disorders **Edge** if disorders share genes in which mutations are associated with both disorders

**Nodes:** genes **Edge** if they are associated with the same disorder

Goh K. et al. The human disease network *PNAS* 2007; 104:8685-8690





Nodes: transcription factors (TFs) Edge if a TF is predicted to regulate another by binding to an enhancer element

Only about 1300 nodes and 50,000 edges





#### **Course requirements**

- Written report, 10-15 pages
- Oral presentation, about 45 minutes
- Active participation in the meetings including
  - this meeting
  - one personal meeting with me
  - the oral presentations of all the participants
- Absence from maximum one presentation allowed (not your own)



- The report and the presentation have equal weights
- Constructive participation (or the lack of it) can raise (lower) the grade by one
- The difficulty of the material is taken into account
- Meeting the deadlines counts
- Check the department "joint objectives for all seminars"!



#### General guidelines (1)

- The presentation and the report need to understandable to your peers
  - Introduce the field
  - Expand the concise presentation of original articles
  - Biology: Explain everything beyond very basic molecular biology (gene no, ortholog yes)
  - Computation: Explain all graph theoretical concepts needed
- Use supplementary material, review articles, cited articles, books, Wikipedia ... to first understand yourself and then to explain to others
- No need to cover everything in the articles, choose the main points



#### General guidelines (2)

- In the report emphasize scientific precision
  - Use formal definitions, formulas, references ...
  - Follow the basic conventions of scientific writing (as taught on the course)
- In the oral presentation emphasize clarity
  - Use schematic figures, simple examples ...
  - Omit technical details, long sentences ...
  - Go slowly, especially in difficult parts: better to get one algorithmic idea across than rush through five
  - Think what you are going to say (and rehearse it)



#### Make sure that everybody

- understands
  - The biological problem
  - The abstract computational problem
  - How they are connected
- knows what the nodes and edges represent in your networks
- what is the input to the computation and its source
- what is the output of the computation and its interpretation



#### Schedule

- Personal meetings: January 28,
  10:00
  10:30
  - 11:00
  - 11:30
  - 12:00
- Written report deadline: March 14 (Friday)
  - Distributed to all participants. Read!
- Oral presentations: at 10:15 here

- March 18
- March 25
- April 1
- April 8
- April 15

Done before Easter



#### **Personal meeting**

- Ready
  - article selection
  - broad understanding of the topic and the selected material
  - outline of the report with
    - section headings
    - a couple bullet points per heading
- Aim
  - to go through the material and the story that you plan to present
  - to check that its scope and size are appropriate for the course
  - To discuss problematic parts (if any)
- Details can change during the work



#### What is a good topic for this seminar?

- Should have something to do with biology and networks ...
- Has both biologically and computationally relevant aspects
  - My suggestions tend to be algorithmic but statistical or mathematical are OK too
- However, the computational method does not need to be the newest, fastest and the most shining version
  - The goal is to communicate essential concepts and ideas, not detailed solutions
- At least two papers to be covered (but not everything in them)
  - Method and its application
  - Two competing methods
  - A simpler special case and a more general one ..

HELSINGIN YLIOPISTO HELSINGFORS UNIVERSITET UNIVERSITY OF HELSINKI Interesting!



#### How to choose one?

- 1. Choose one of my suggestions today after my presentation
- 2. Choose one of my suggestions not already chosen within a week and tell me by email
- 3. Choose your own topic and send it and the two main articles you are going to cover for my approval within a week.
  - See the review articles on the course web site



- Topics that I think
  - are interesting
  - have suitable material
- The article(s) mentioned just the starting point
  - Many more to choose from
  - Follow references backward and forward (Google scholar)
  - Choose based on your interests and knowledge



# Topic 1: Detection of protein families by network clustering

- Network clustering identifies dense neighborhoods
  - Sets of nodes have a higher tendency to link to nodes within the set than to nodes in other sets
- It can be used to assign proteins to families based on their sequence similarity
- MCL is network clustering algorithm that has been widely used in protein family detection and in other tasks
- You can emphasize either
  - The MCL algorithm (mathematical)
  - Protein family detection (recent PFAM clustering)
- Or choose another application

HELSINGIN YLIOPISTO HELSINGFORS UNIVERSITET JNIVERSITY OF HELSINKI Enright et al. An efficient algorithm for large-scale detection of protein families. Nucl. Acids Res. (2002) 30 (7): 1575-1584.



# Topic 2: Identifying conserved pathways by network alignment

- In principal one can extend the search from individual conserved proteins to conserved pathways using protein-protein interaction data but ...
- Computationally the task is not an easy one
- Many papers available

Kelley et al. Conserved pathways within bacteria and yeast as revealed by global protein network alignment. PNAS (2003) 100 (20): 11394–11399



# Topic 3: Network motif discovery by color coding

- Network motifs are small subnetworks with characteristic topologies that appear in biological networks more often than expected by change
- It has been shown that specific types of motifs carry out specific dynamic functions (like electronic circuits)
- Counting occurrences of motifs that are larger than few nodes is algorithmically challenging
- Color coding is an elegant algorithmic technique that can be applied to many network problems (also alignment)

Alon. Network motifs: theory and experimental approaches. Nature Reviews Genetics 8, 450-461 (2007)

Alon et al. Biomolecular network motif counting and discovery by color coding. Bioinformatics (2008) 24 (13): i241-i249.



# Topic 4: Inferring regulatory interactions by network deconvolution

- Correlation of expression between a gene coding a transcription factor and another gene suggests potential regulatory relationship
- However, indirect relationships also cause correlation
- Two recent papers propose "network convolution" as a means to separate direct from indirect effects
- Such methods could have large impact as vast amounts correlative data is produced by high-throughput methods

Barzel et al. Network link prediction by global silencing of indirect correlations.

Nature Biotechnology (2013) 31, 720–725

Feizi et al. Network deconvolution as a general method to distinguish direct dependencies in networks. Nature Biotechnology (2013) 31, 726–733



# Topic 5: Linking genes and diseases via network propagation

- Genes related to same disease tend to lie close to each other in various biological networks
- This observation can used to find novel disease-causing genes or to divide diseases into subtypes

Vanunu et al. Associating Genes and Protein Complexes with Disease via Network Propagation PLoS Comput Biol 6(1): e1000641. doi:10.1371/journal.pcbi.10

Hofree et al. Network-based stratification of tumor mutations. Nature Methods 10, 1108–1115 (2013)

• See also

Eronen et al. Biomine: predicting links between biological entities using network models of heterogeneous databases. BMC Bioinformatics 2012, 13:119



- **Topic 1:**Detection of protein families by network clustering
- **Topic 2:** Identifying conserved pathways by network alignment
- **Topic 3:** Network motif discovery by color coding
- Topic 4:Inferring regulatory interactions by network<br/>deconvolution
- **Topic 5:** Linking genes and diseases via network propagation



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