

human disease network analysis reveals the clinical severity of genetic disorders



POSTECH

생명과학과 김상욱

Research Keywords

A word cloud of research keywords. The words are arranged in a non-uniform, overlapping manner. The colors of the words include orange, green, blue, red, and yellow. The sizes of the words vary, with 'Network' and 'Evolution' being the largest. The words are: Network, Bioinformatics, Transcriptome, Genetic diseases, Computational biology, Function, Proteome, Evolution, Membrane proteins, Structure, Domain, Systems biology, Protein-protein interaction, Conformational change, and Subcellular localization.

Network Bioinformatics Transcriptome
Genetic diseases
Proteome Computational biology Function
Evolution Membrane proteins
Structure Domain
Systems biology Protein-protein interaction
Conformational change Subcellular localization

Structural Bioinformatics Laboratory

Pohang University of Science and Technology

Acknowledgement



SBI lab

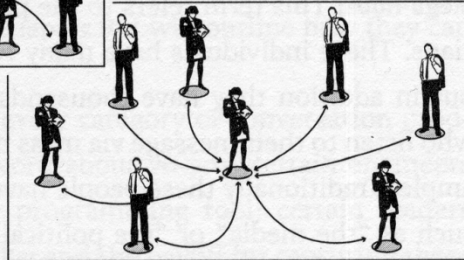
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Jihye Hwang
Inhae Kim
Sung gyu Han
Bui Phuong Thao
Heetak Lee
Sangjin Han
Jinsuk Hong

Network Biology and Medicine

- Network Distance & Localization → Disease Comorbidity *Nature Mol Sys Biol.* 2011
Human disease evolution *Scientific Reports* 2012
Mitochondrial protein network *Scientific Reports* 2013
 - Network Clustering → Cancer *PLoS Comp. Biol.* 2011
 - Network Rewiring and Evolution → Gene essentiality changes *Scientific Reports* 2012
Neuronal Disease *PLoS Genetics* 2012
-
1. Spatial and functional organization of mitochondrial protein network. *Scientific Reports* 2013 3:1403.
 2. Network rewiring is an important mechanism of gene essentiality change. *Scientific Reports* 2012 2:900.
 3. Rewiring of PDZ domain-ligand interaction network contributed to eukaryotic evolution. *PLoS Genetics*. 2012 8(2):e1002510.
 4. Evolutionary history of human disease genes reveals phenotypic connections and comorbidity among genetic diseases. *Scientific Reports* 2012 2:757.
 5. A multifunctional core-shell nanoparticle for dendritic cell-based cancer immunotherapy *Nature Nanotechnology* 2011 6(10):675-682.
 6. Network clustering revealed the systemic alterations of mitochondrial protein expression” *PLoS Comp. Biol.* 2011 7(6):e1002093.
 7. Protein localization as a principal feature of the etiology and comorbidity of genetic diseases *Nature Mol Sys Biol.* 2011 7:494.

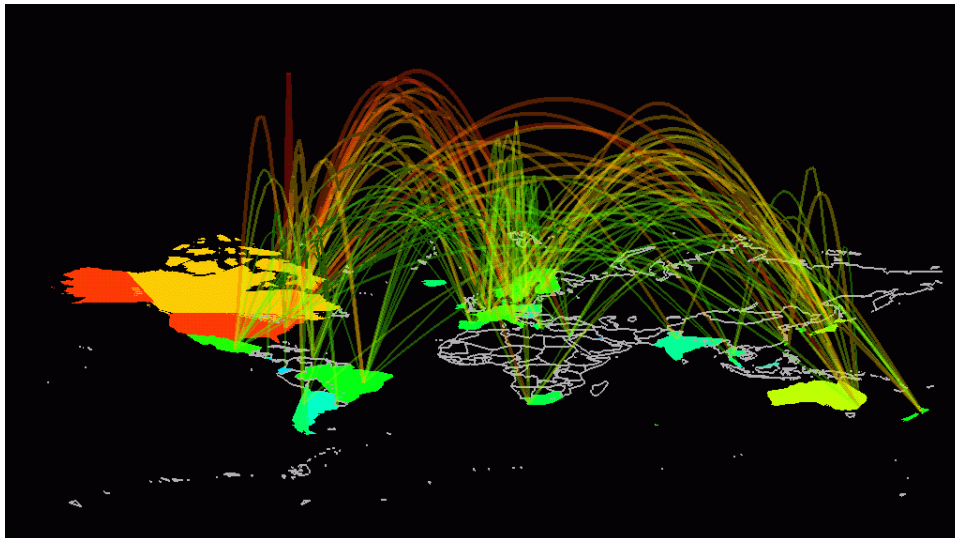
Society

Mega-Hub. An MTV veejay spreads the word to thousands or millions of people through one-way links.

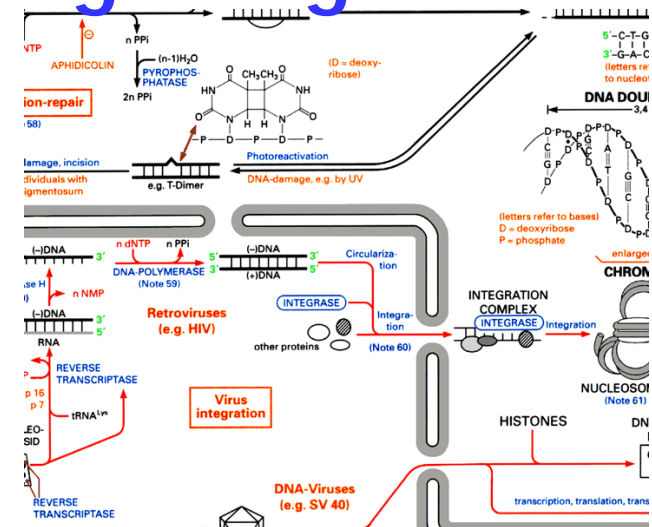


Hub. This undergraduate has spread the word to seven other people through two-way links.

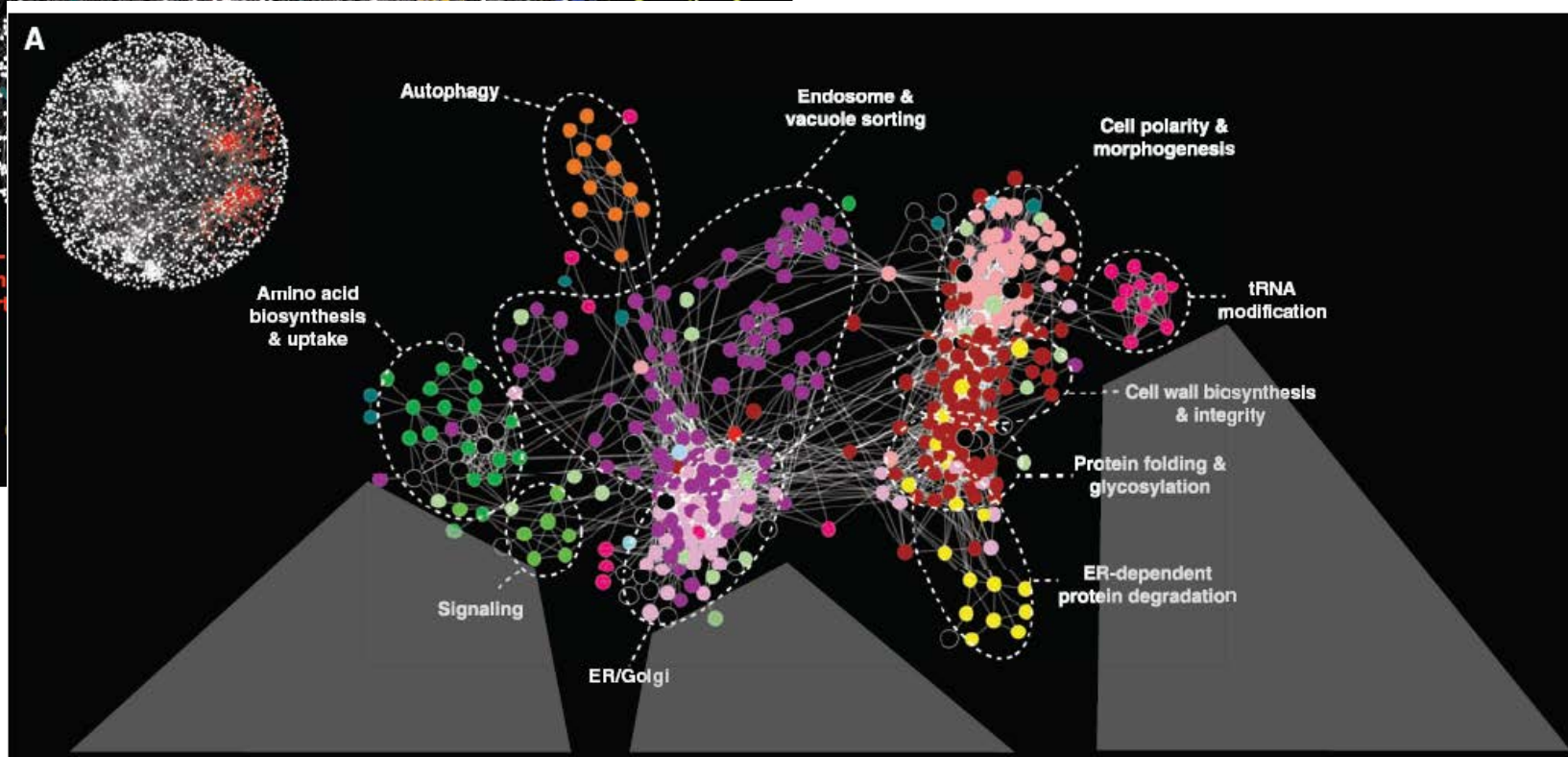
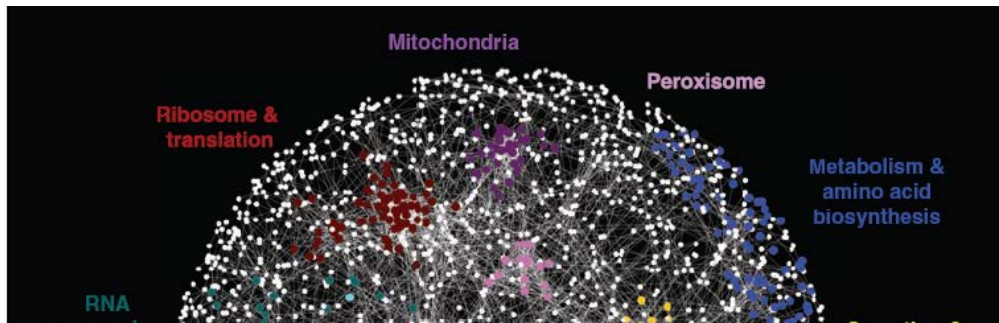
Internet



Biological signaling network

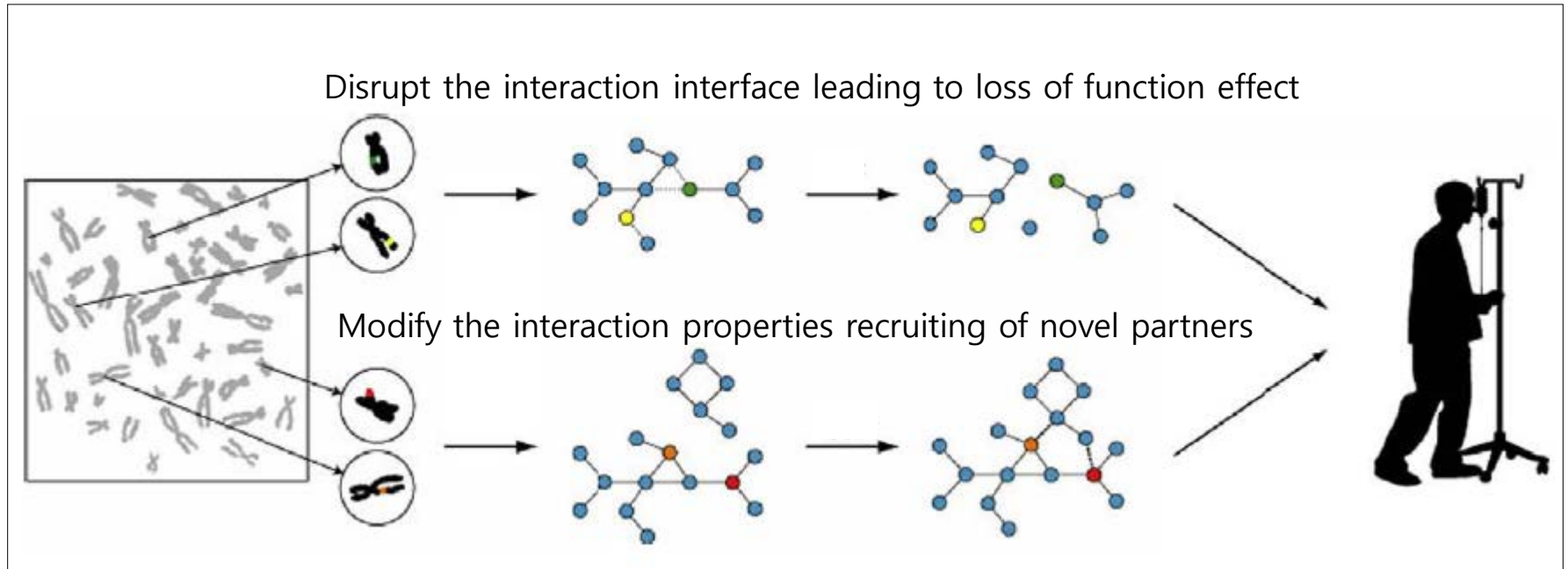


Biological Network



Disease pleiotropy and network modularity

Disease mechanism in the protein interaction network



Major issues of Network Medicine

Medical language system, Biomedical vocabularies, Clinical repository
Disease classification, Disease gene mapping, Network medicine, Autonomic diagnosis

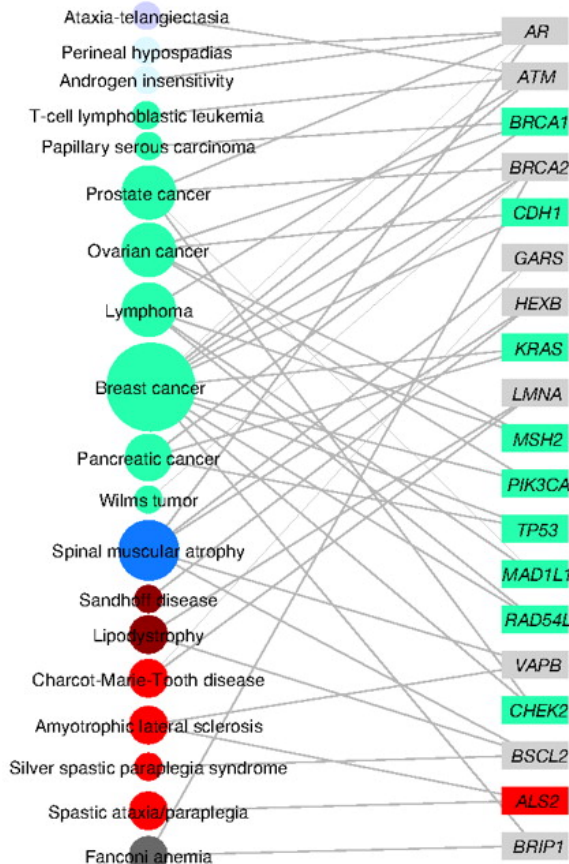
The human disease network

Construction of the diseasome bipartite network

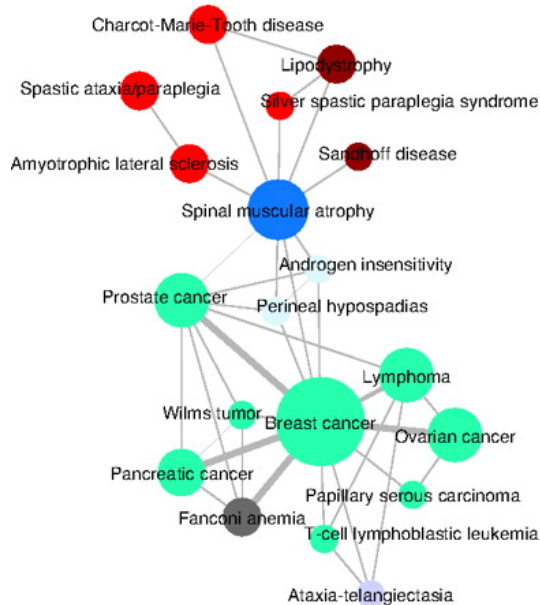
DISEASOME

disease phenotype

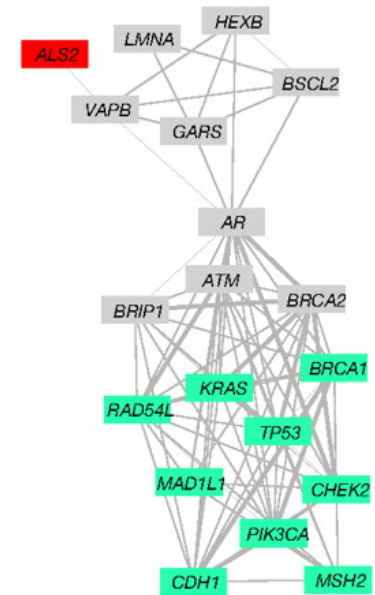
disease genome



Human Disease Network (HDN)

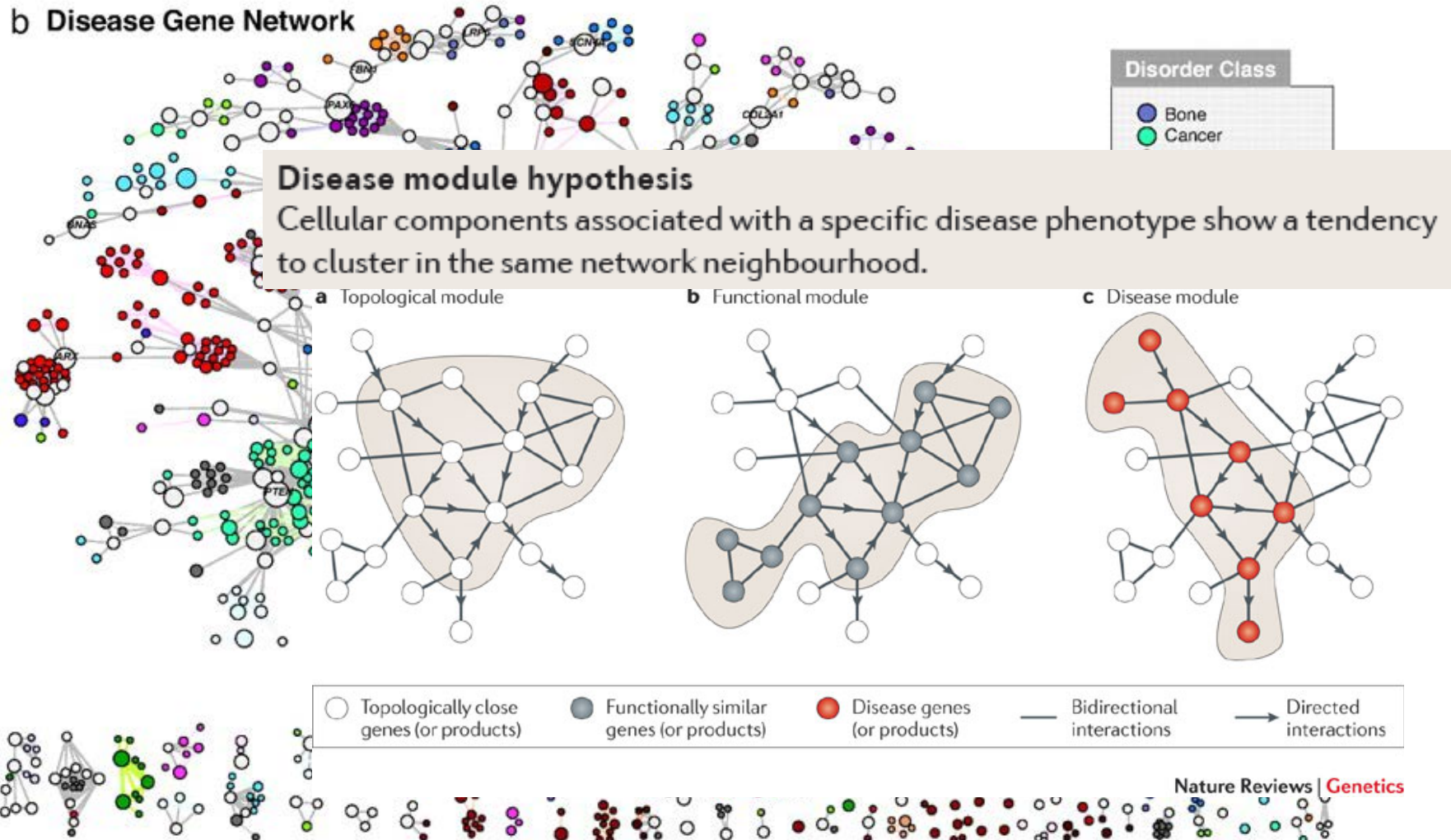


Disease Gene Network (DGN)

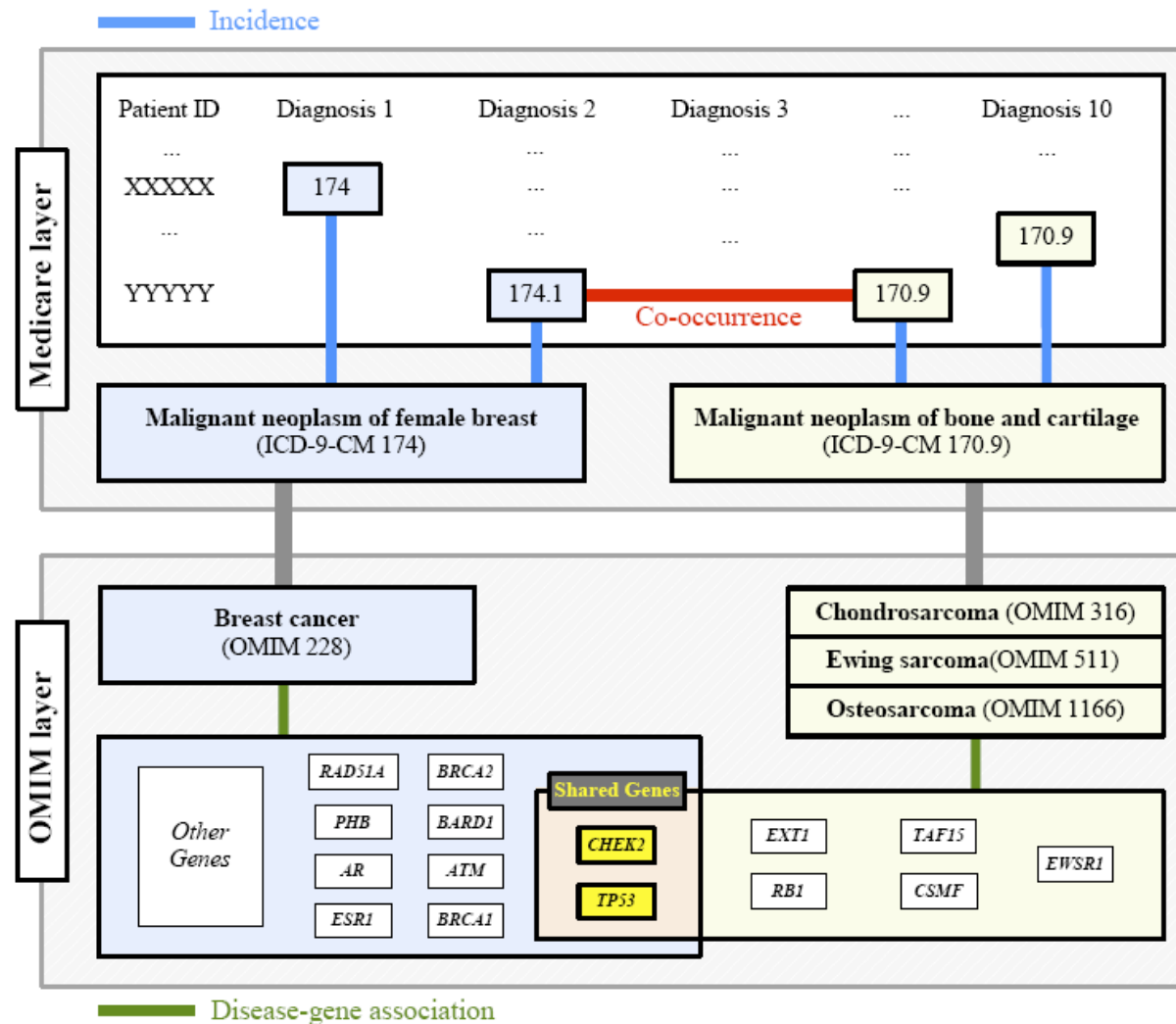


Disease Gene Network

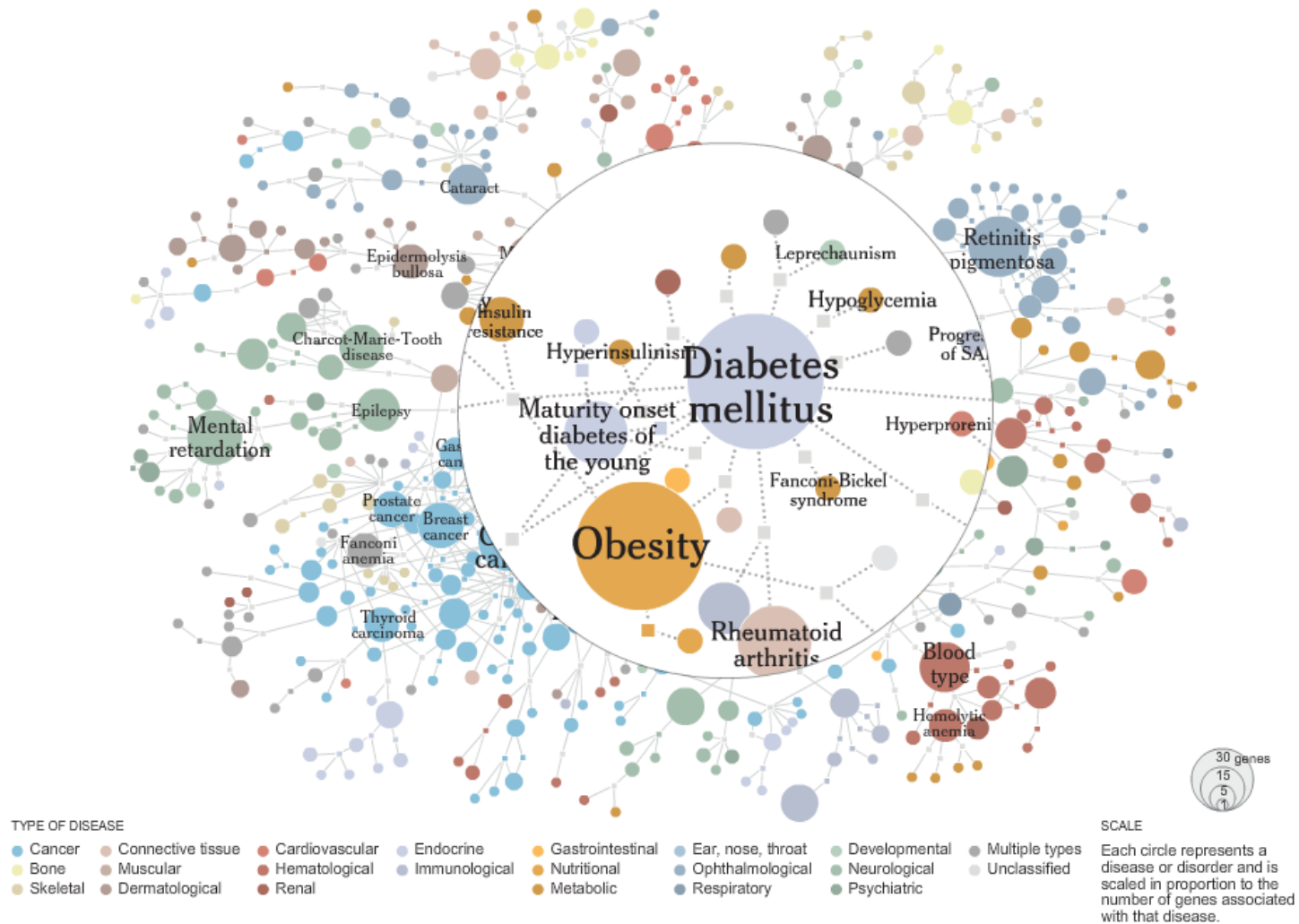
b Disease Gene Network



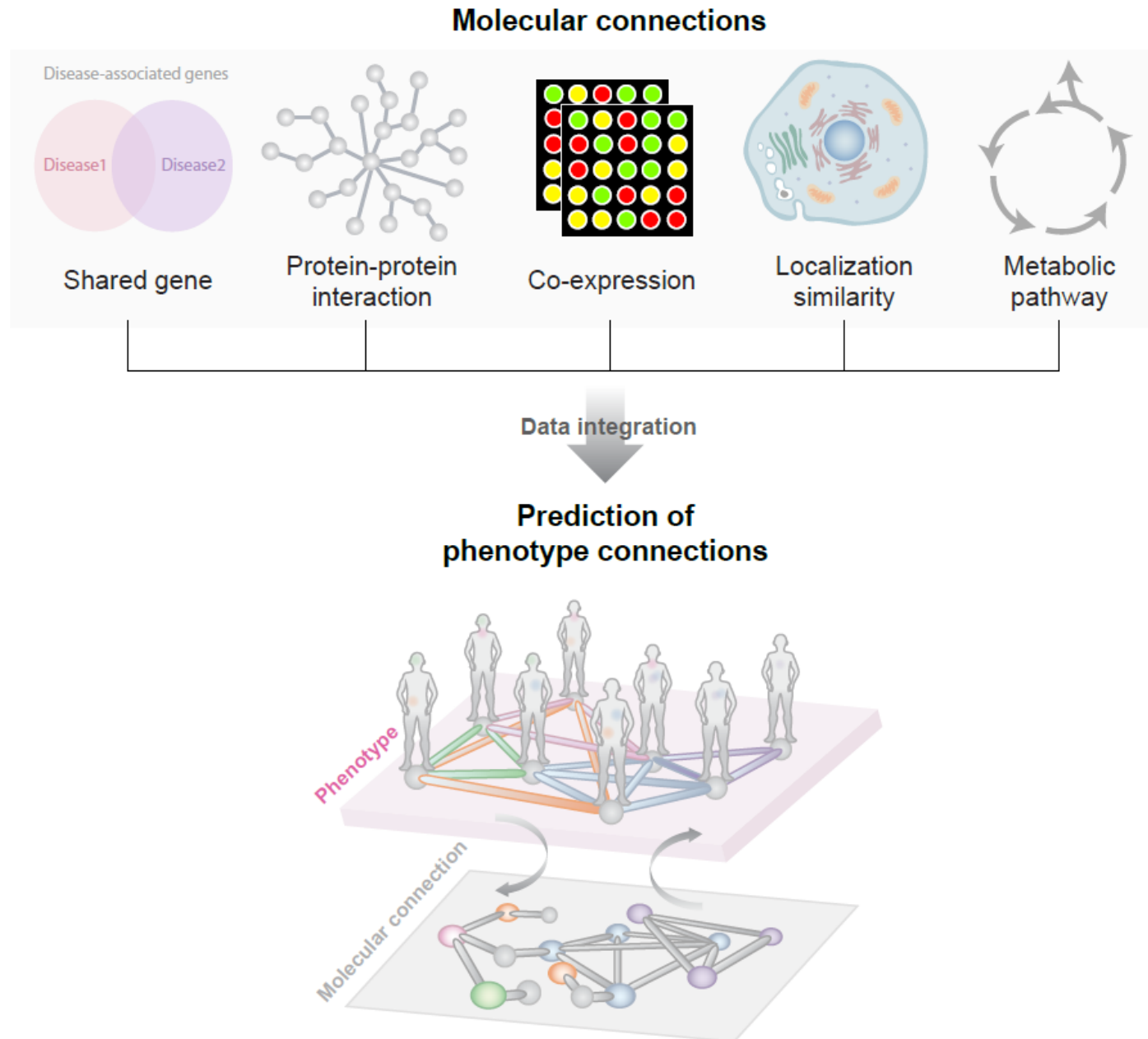
Procedures to connect comorbidity and genetic associations



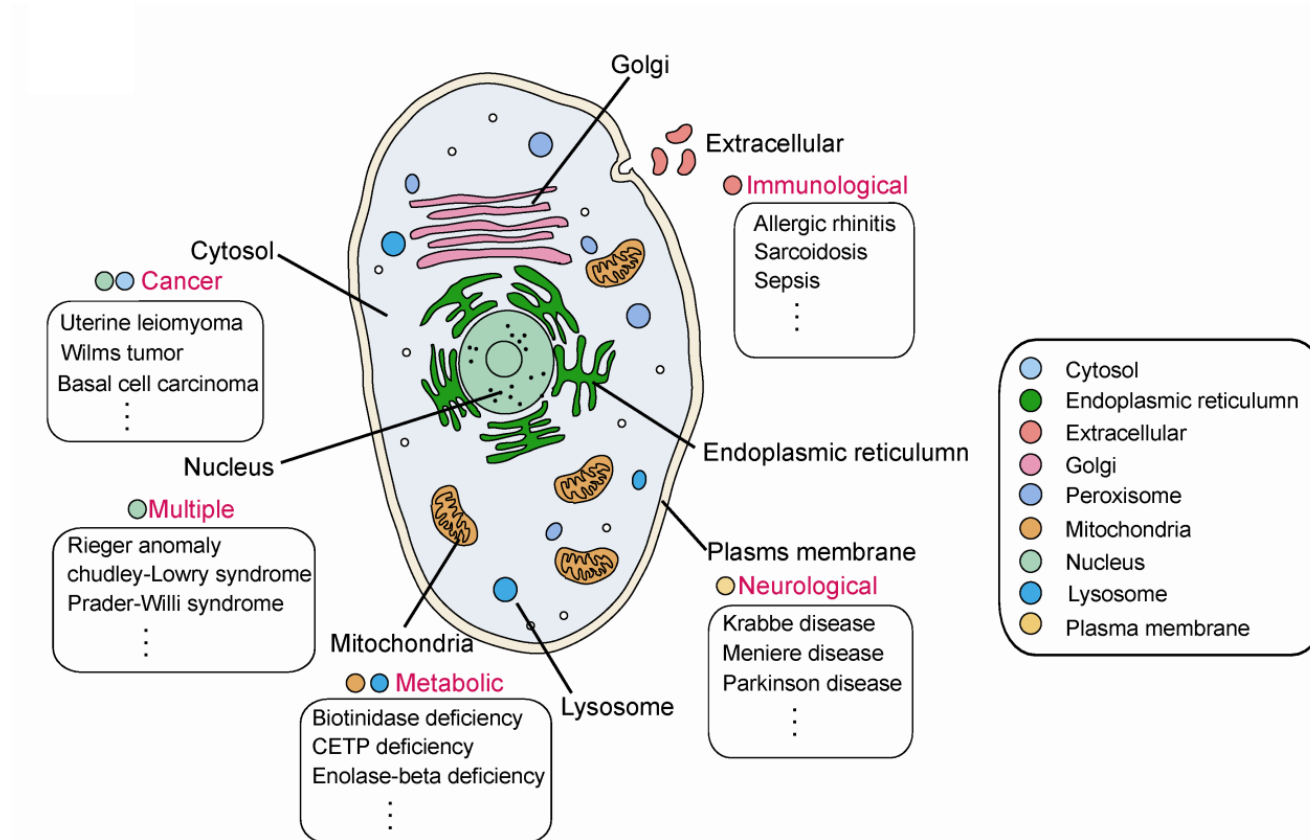
Example: Diabetes in the Human disease network



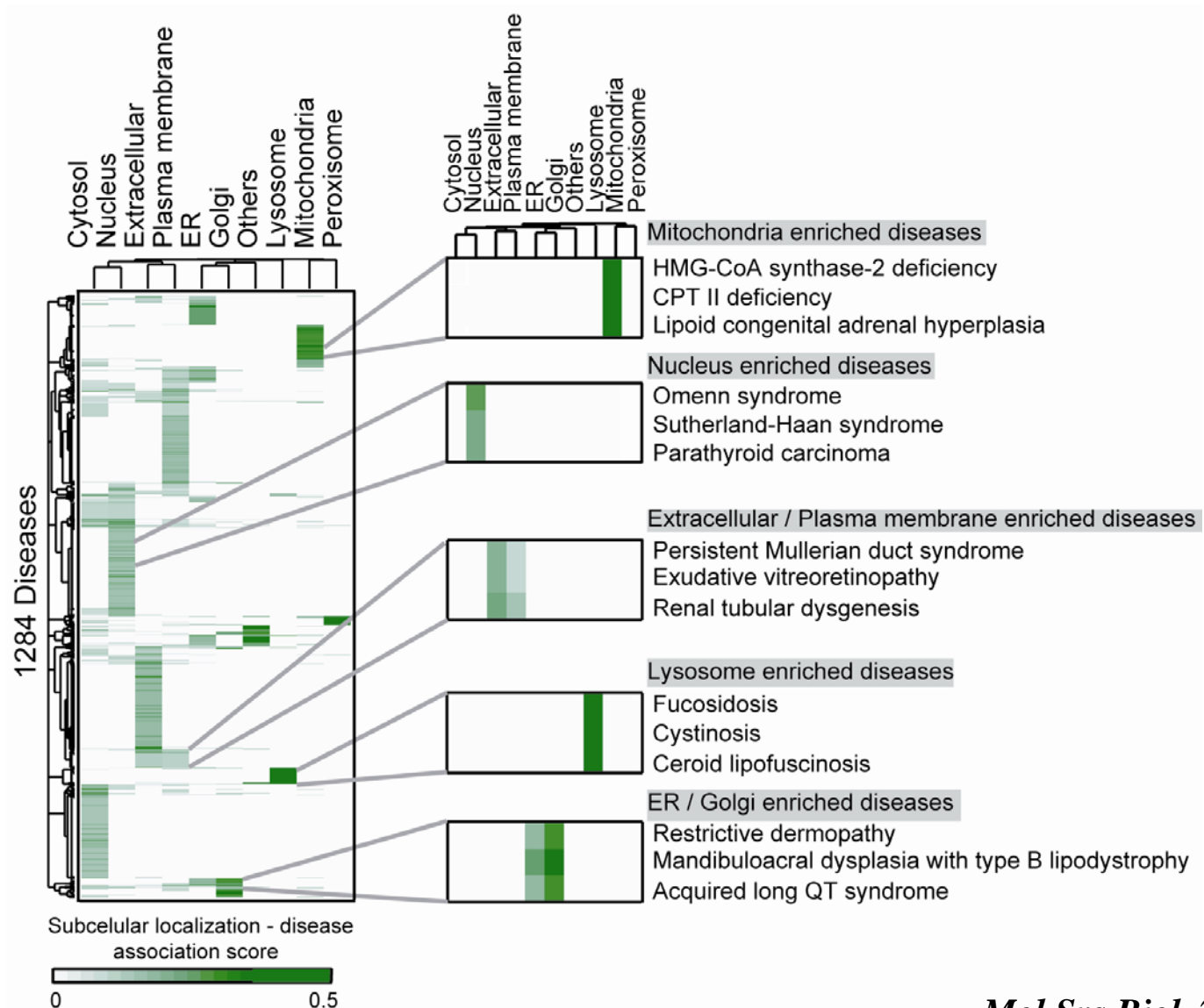
Integrative approach to predict phenotype connections



Protein subcellular localization and Human diseases

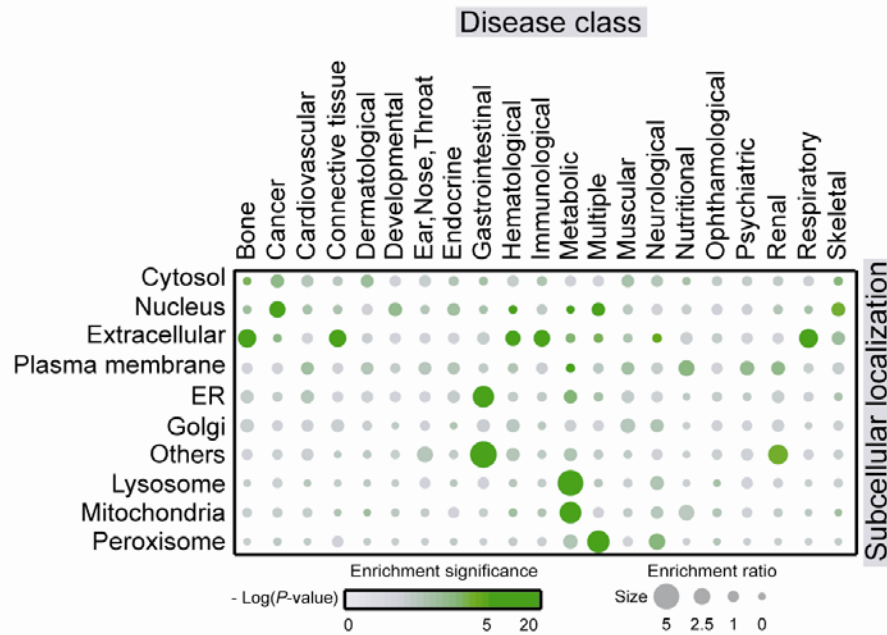


Relationships between disease-associated proteins and their subcellular localizations

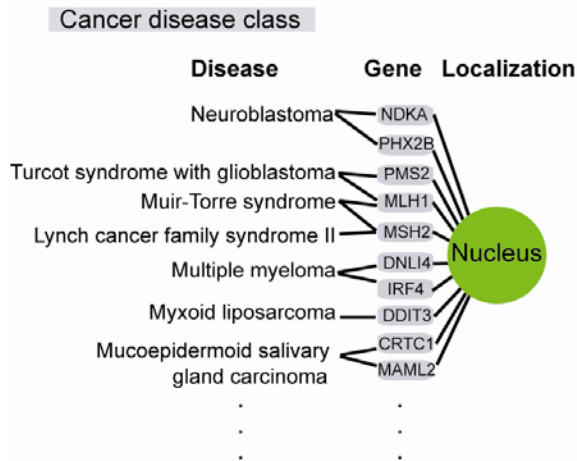


Correlation between disease classes and subcellular localizations

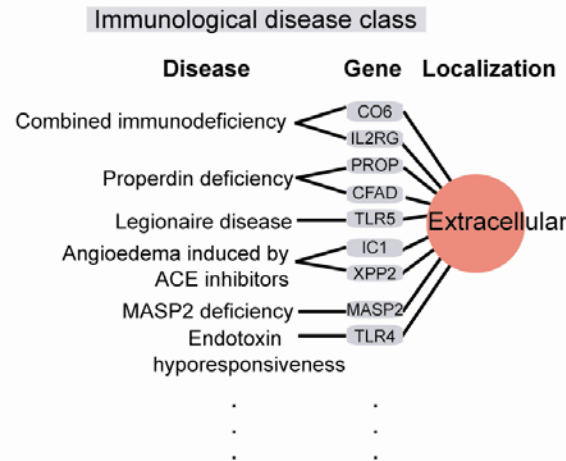
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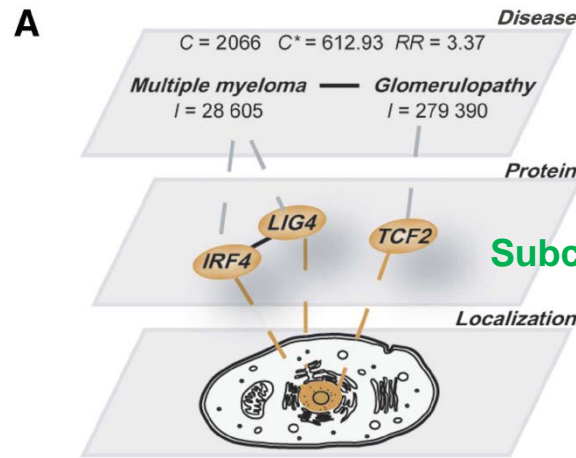
B



C



The implication of subcellular localization for disease comorbidity



Subcellular localization similarity of human diseases

Subcellular localization similarity of comorbid disease pairs

Popultaion-level disease patterns

Patient

Diagnosis

Patient 1 $\left\{ \begin{array}{l} \text{Retinoblastoma} \\ \text{Stem-cell leukemia} \end{array} \right.$

Patient 2 $\left\{ \begin{array}{l} \text{Von Willebrand disease} \\ \text{Hemorrhagic diathesis} \end{array} \right.$

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•

Disease comorbidity

Retinoblastoma

Nuc

Stem-cell leukemia

Nuc

Von Willebrand disease

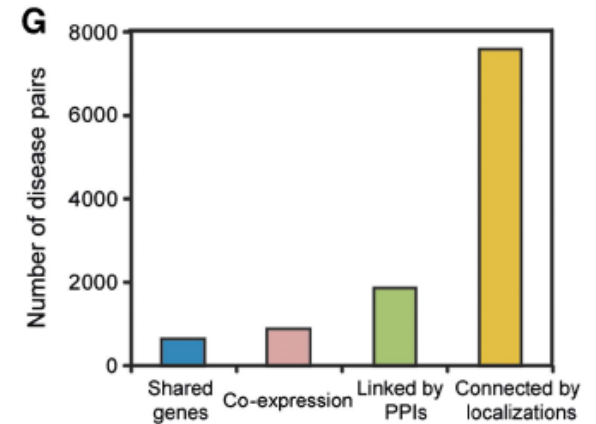
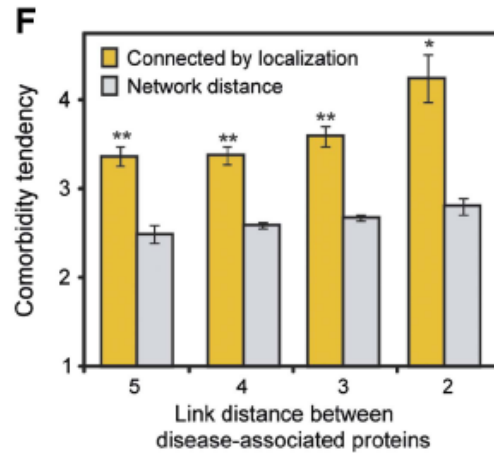
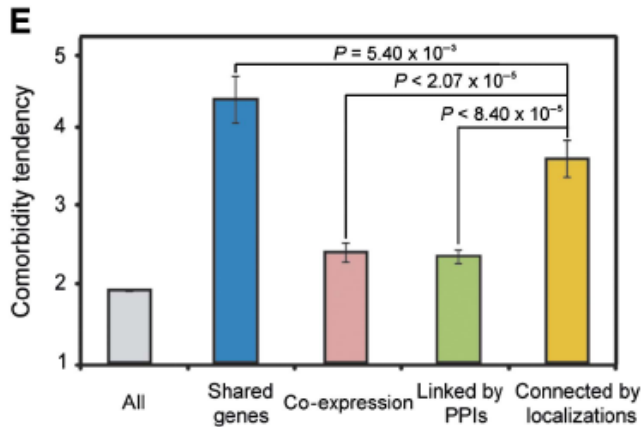
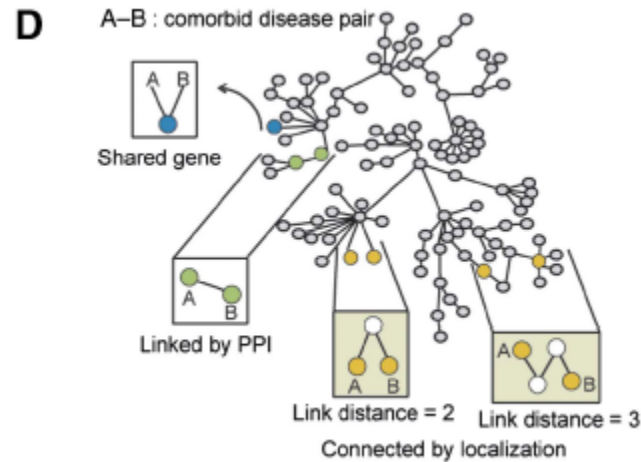
Ext

Hemorrhagic diathesis

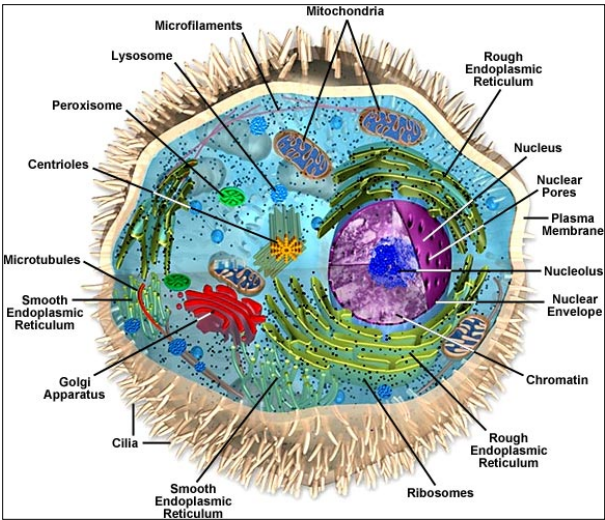
Ext

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The implication of subcellular localization for disease comorbidity



Subcellular localization and human diseases

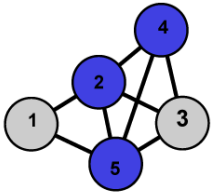


Construction of functional interaction networks through consensus localization predictions of the human proteome.

Park et al. J. Proteome Res., 2009, 8 (7), pp 3367–3376

A

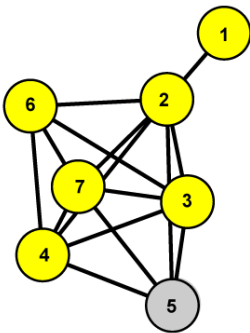
Localization: Plasma membrane
Disease: Basal cell carcinoma



- 1: GP107_Human
- 2: PTC1_Human
- 3: HHIP_Human
- 4: SMO_Human
- 5: PTC2_Human

B

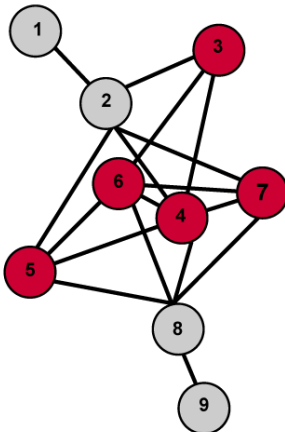
Localization: Cytosol
Disease: Deafness, autosomal dominant



- 1: MYO3A_Human (Con)
- 2: WHRN_Human
- 3: MYO15_Human
- 4: OMP_Human
- 5: MYO6_Human
- 6: MYO7A_Human
- 7: USH1C_Human (Con)

C

Localization: Nucleus
Disease: Mental retardation



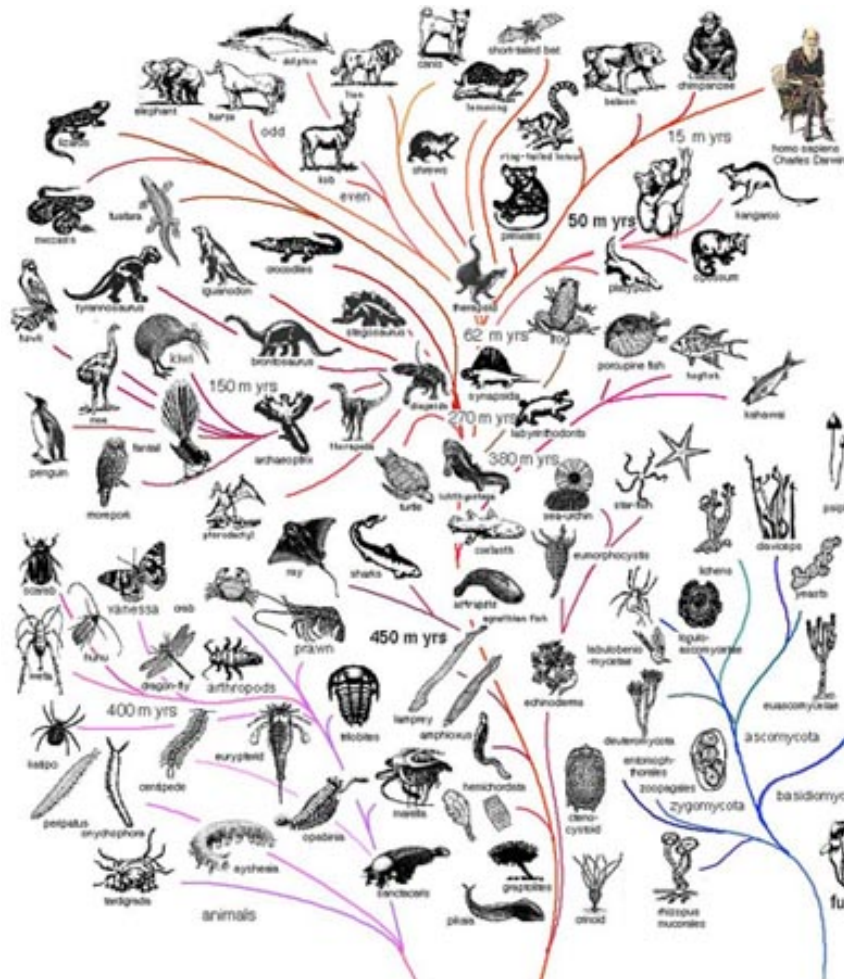
- 1: VEX2_Human (Con)
- 2: ARX_Human
- 3: ZNF81_Human
- 4: JADIC_Human
- 5: AFF2_Human (Con)
- 6: OPHN1_Human
- 7: ZNF41_Human (Con)
- 8: ACSL4_Human
- 9: TMEM9_Human

> Protein **localization information** facilitates the identification of **disease** associated genes

Evolutionary history of human disease genes reveals phenotypic connections and comorbidity among genetic diseases

A philosophical question?

Evolution of human diseases

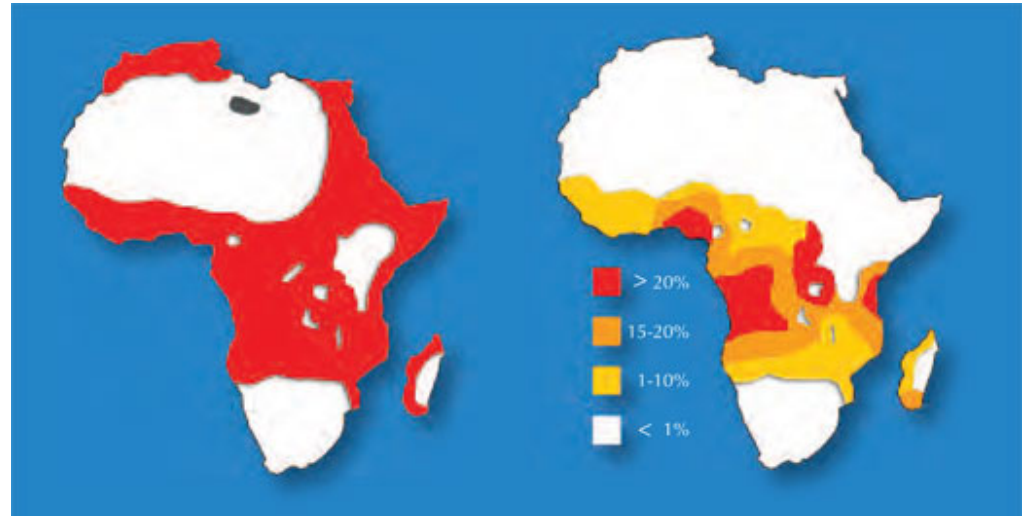
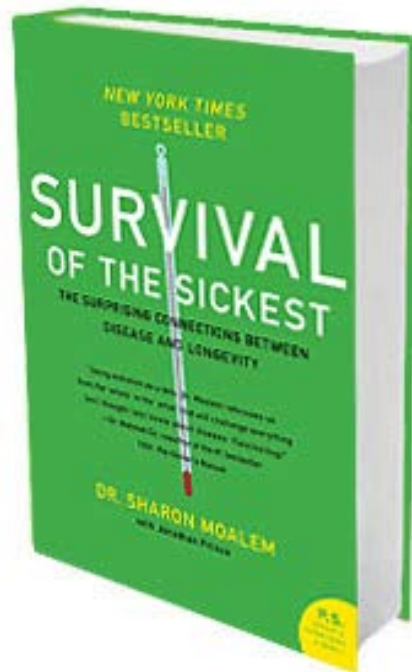


gain or loss of function ?

Evolution of anatomy and physiology

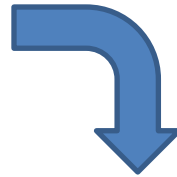
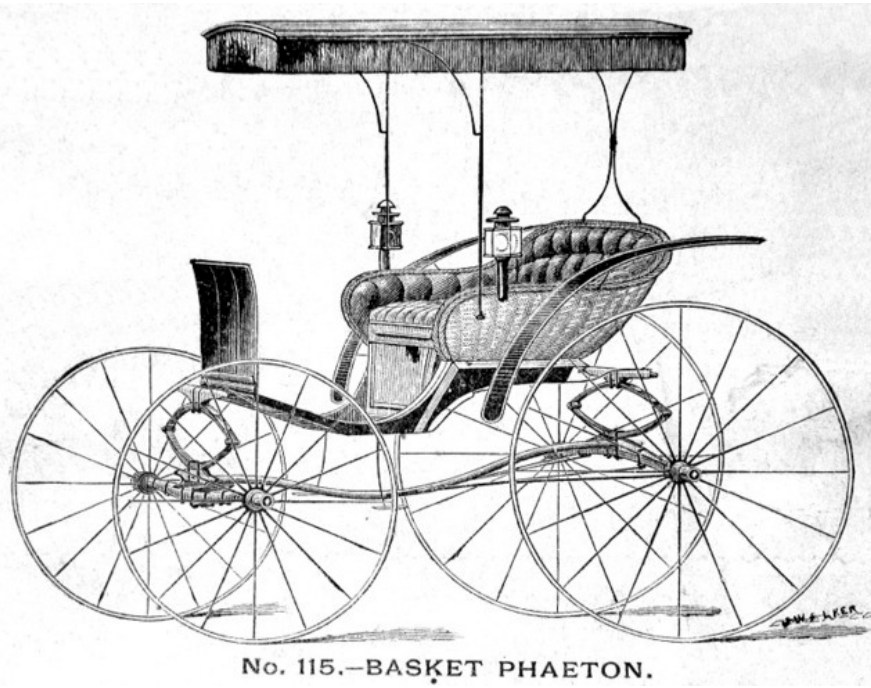
Disease and evolution

Why do we need diseases?

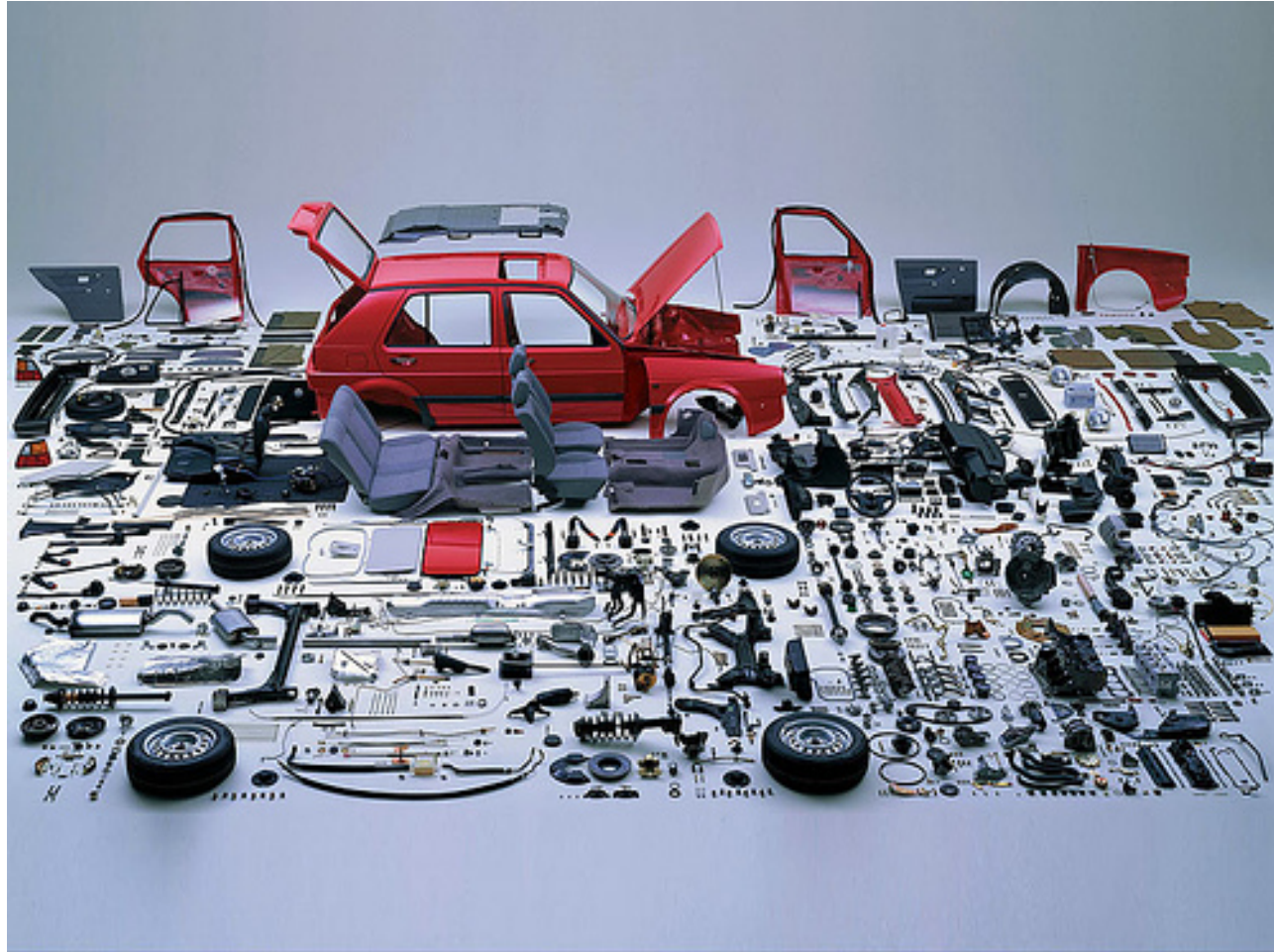


Comparison of the distribution of malaria (left) and sickle-cell anaemia (right) in Africa

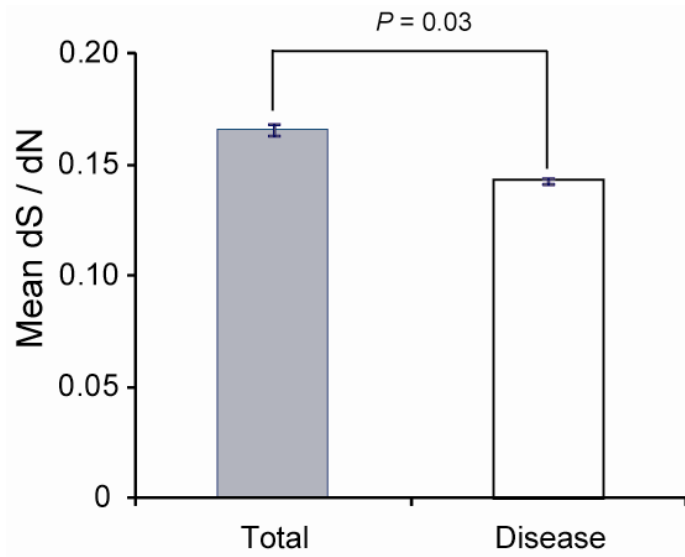
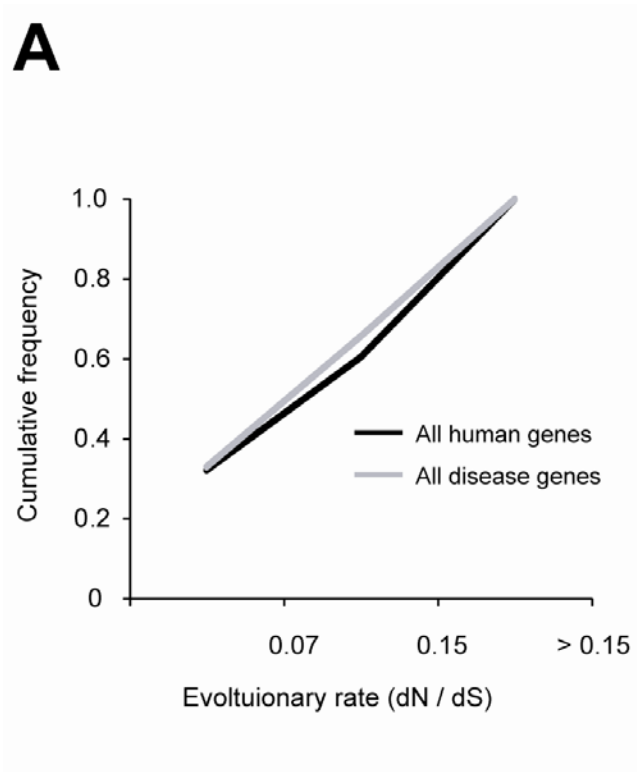
Evolution of automobiles



Conserved (common) or evolving (species specific) parts ?

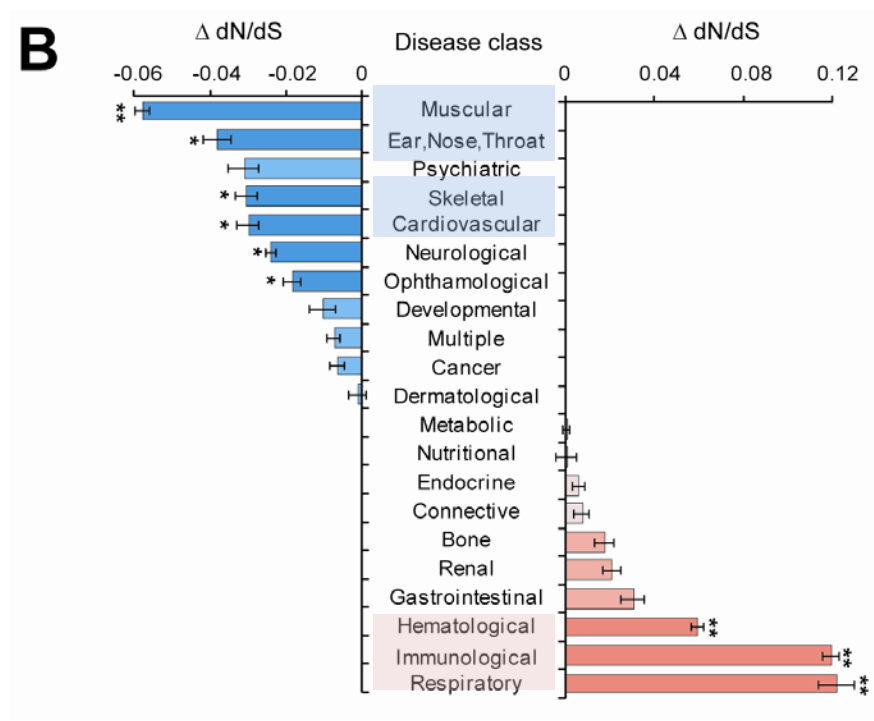


Human disease genes; fast or slow evolving ?



Suppl. Figure

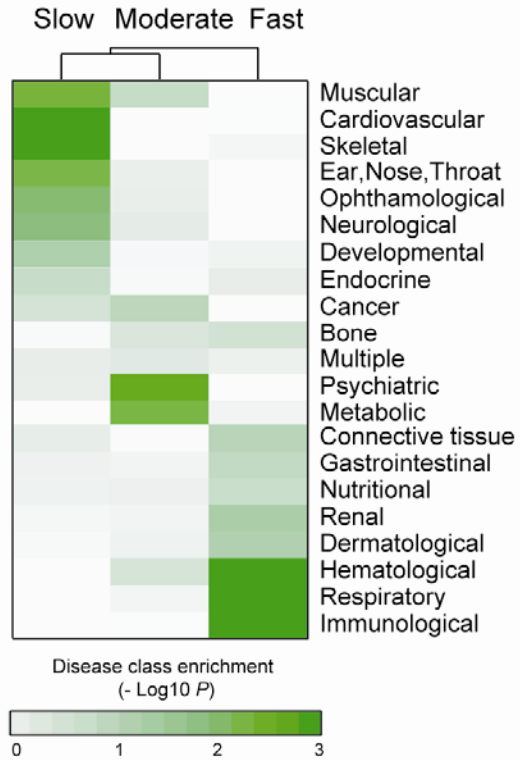
Human disease genes have diverse evolutionary rates



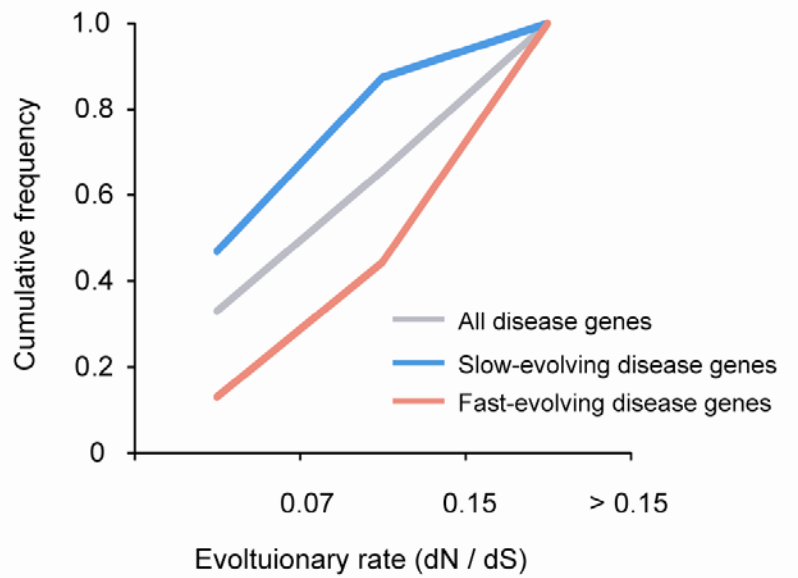
Phenotypically similar disease classes share similar evolutionary history

Human disease genes have diverse evolutionary rates

C

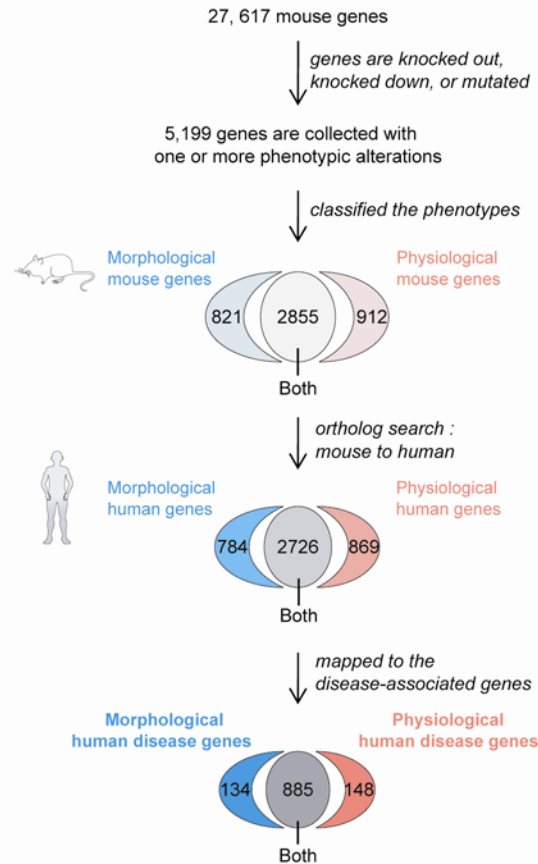


D

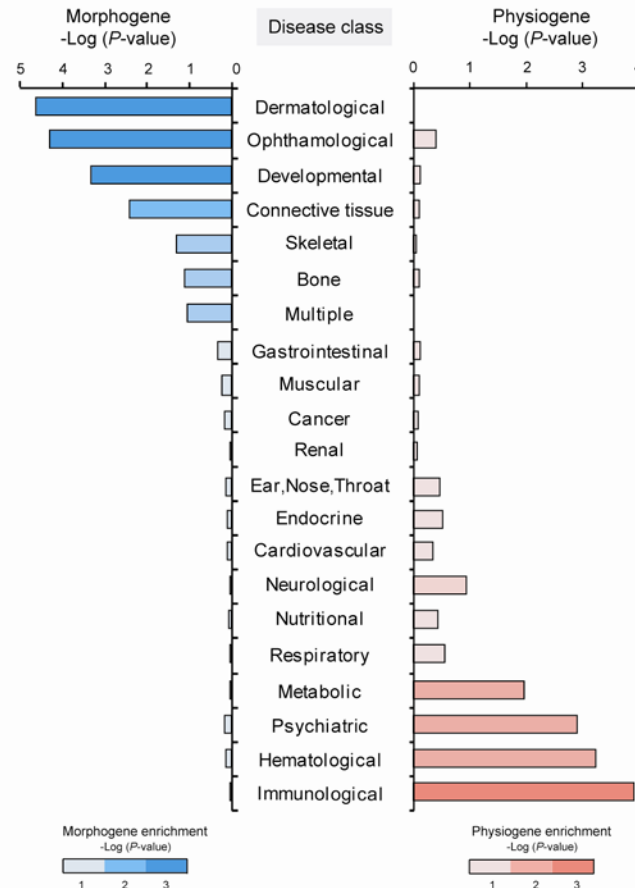


Morphogenes and physiogenes enriched differently In various disease classes

A



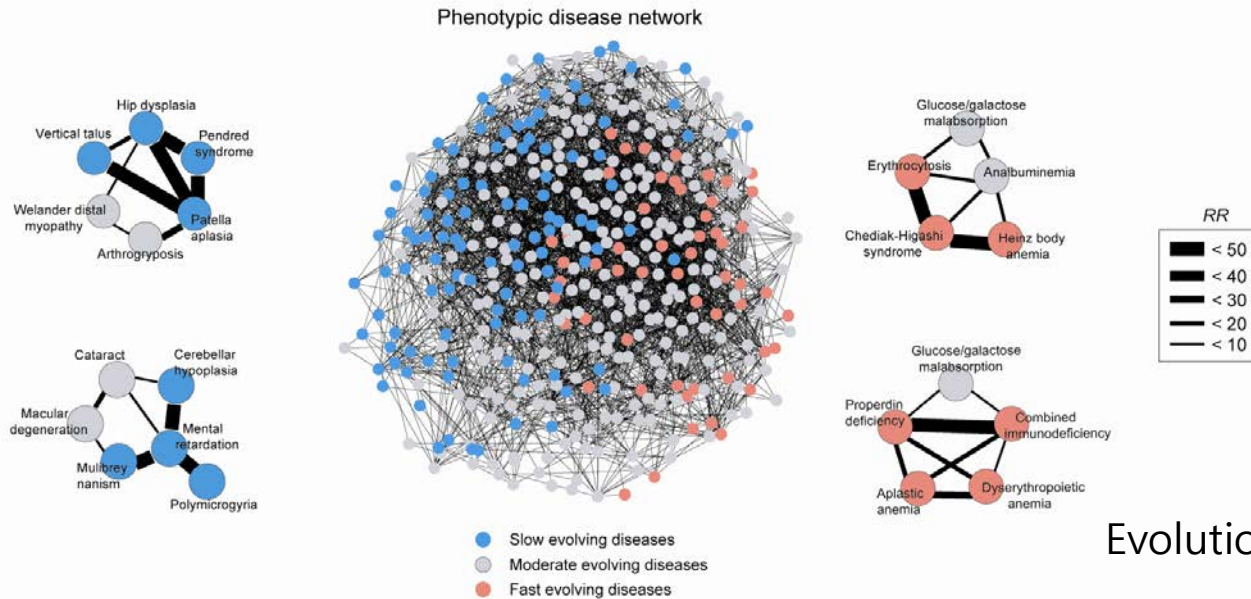
B



Evolution connect genotype to phenotype

Molecular connections in the comorbid disease pairs

A



Evolutionary connections

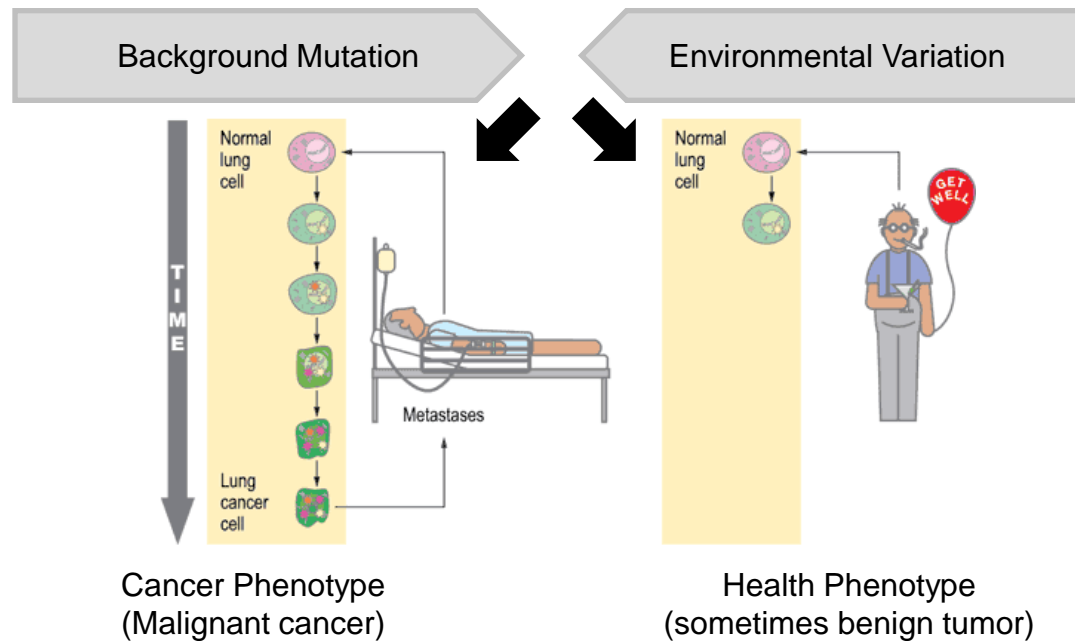


Molecular connections



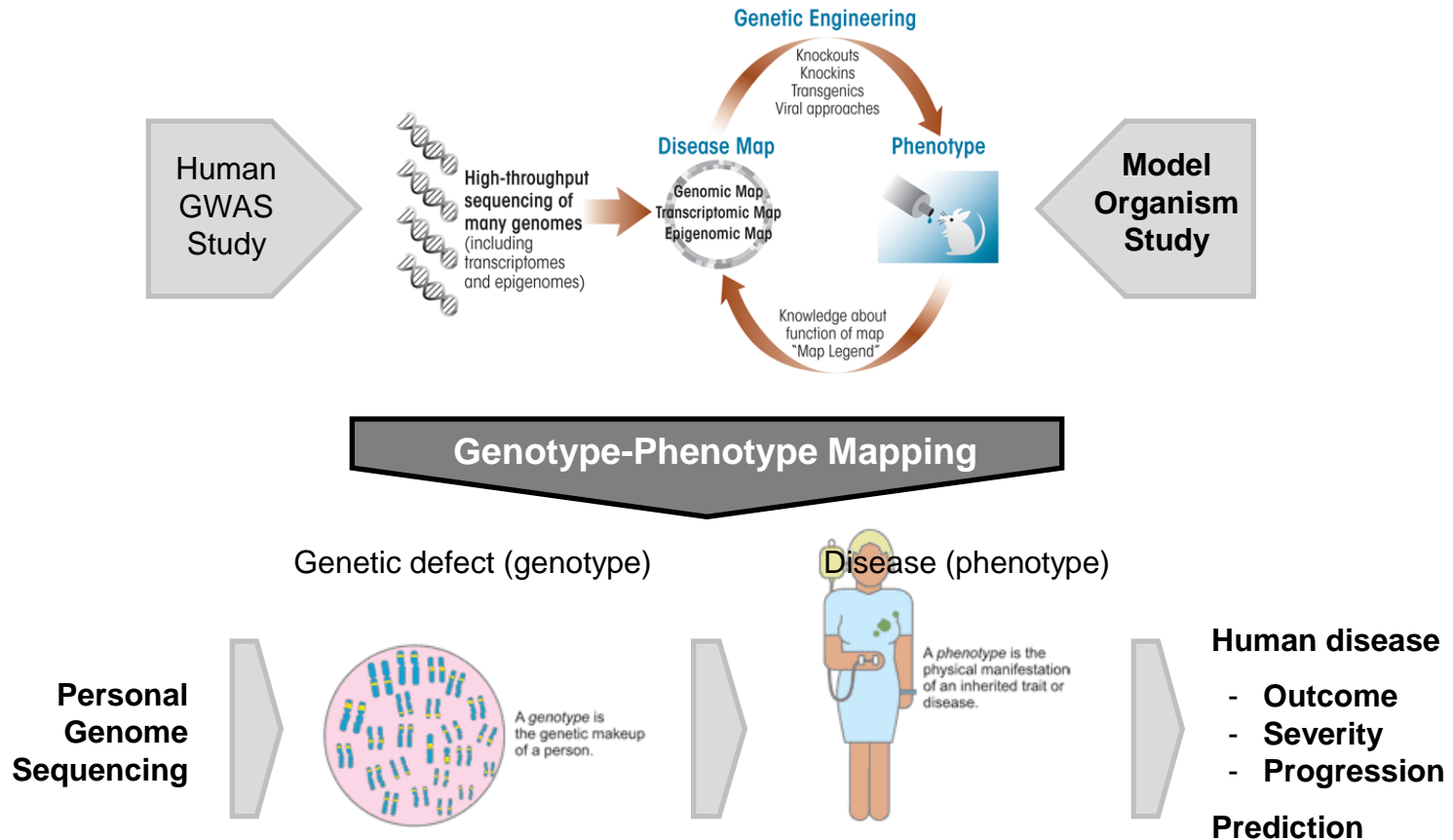
Phenotypic connections
: *comorbidity*

- It is hard to relate mutations **with disease** due to various **genetic backgrounds and environmental factors**



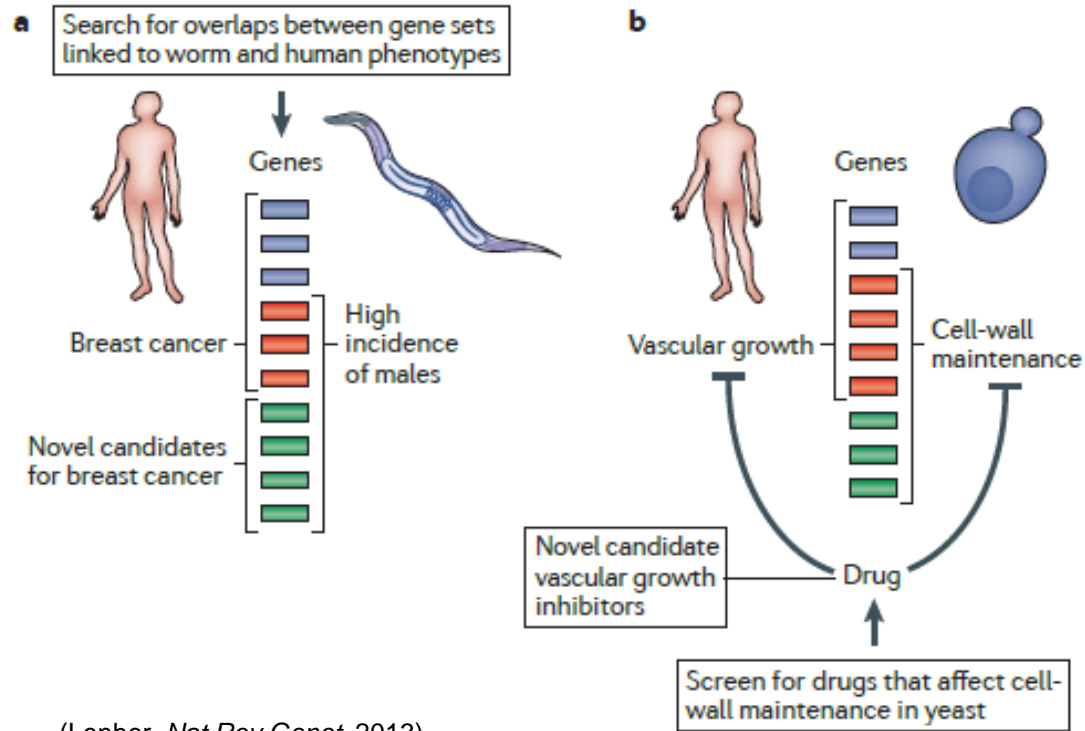
Building genotype-phenotype map from model organism is important for human disease prognosis.

- Disease-associated genes found by GWAS have low heritability and small effect for clinical use (Human disease outcome, severity, and progression prediction).
- Experiments on model organisms offers opportunity to evaluate the phenotypic effect of disease-causing mutations



(Modified from Matthew et al. *Alcohol Research: Curr Reviews*. 2011)

Model organism genotype-phenotype maps have relevance to human disease.

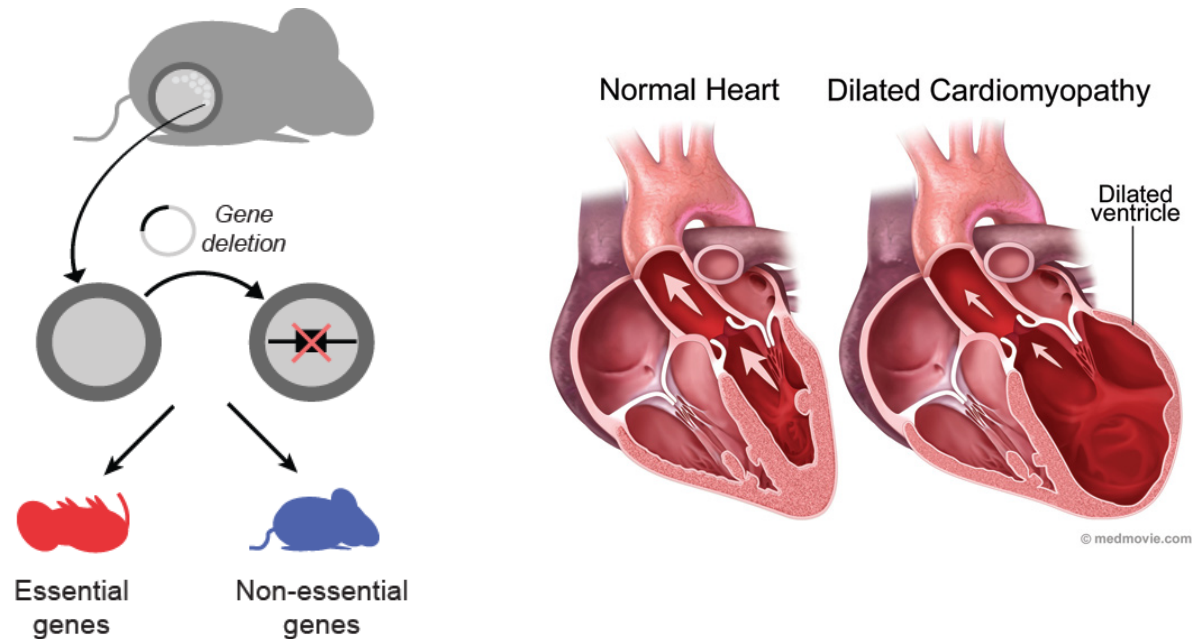


(Lenher. *Nat Rev Genet.* 2013)

Relationship between gene essentiality and disease-association is under debate.

Essential genes are associated with human diseases.

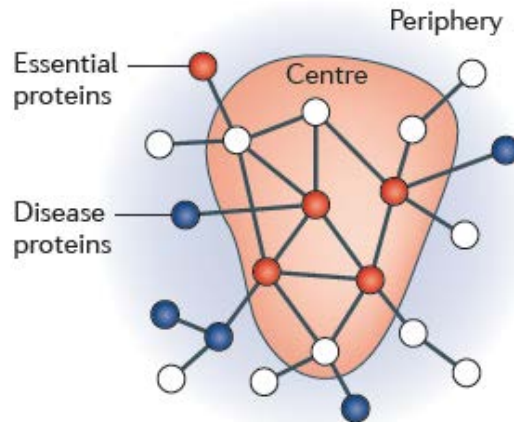
- Essential genes are required for survival and contribute to fitness of model organism.
- Perturbations of essential genes cause discernible phenotypic symptoms as human disease phenotypes.



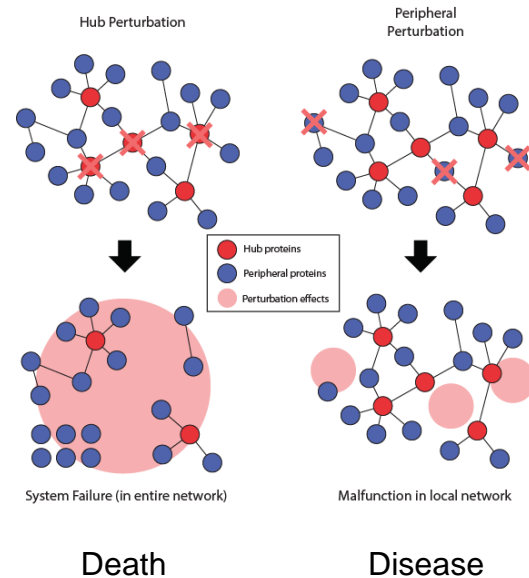
- In mouse, knock-out of ACTC-1 makes mouse lethal with heart development failure.
- In human, mutations in ACTC-1 are found in cardiomyopathy patients.

However, many **non-essential genes** are **also** related with human diseases.

Perturbation of		Effects	Network
Disease genes	Individuals can tolerate disease-causing mutations longer, often past their reproductive age.	Malfunction (Disease)	Periphery
Essential genes	Functional perturbation of essential genes leads to abortion in the embryonic stages.	System Failure (Death)	Hub

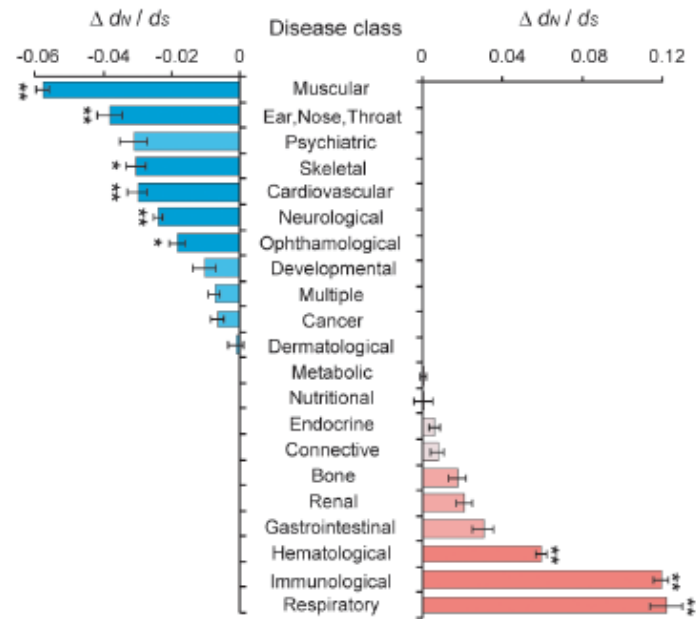


(Barabasi et al. *Nat Genet Rev.* 2011)



Genotype and phenotypes of human diseases are diverse.

- Diseases are caused by mutation of conserved gene effecting loss of function in organism.
- Some disease phenotypes are beneficial for survival and reproduction of organisms.



(Park et al. *Scientific Reports*. 2012)

Genotype-phenotype relationship of human disease are diverse.

Apply

Interpretation of human disease from genotype-phenotype map of model organism

Investigation of association between essential genes and human disease genes

OMIM[®]

Online Mendelian Inheritance in Man[®]

Human genes and genetic disease phenotypes

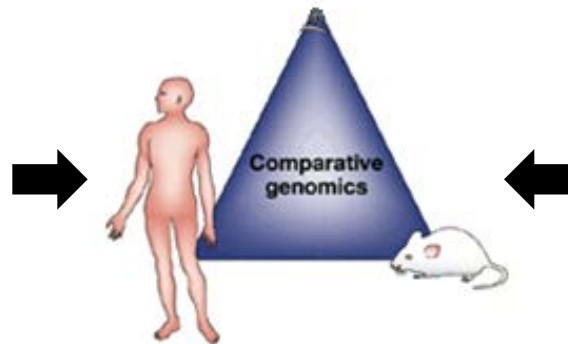


Human disease genome

1,954 disease genes

Comparative genomics

orthologue mapping based on
sequence homology (inparanoid)
and gene annotation (ensemble)



Model organism

Genotype-phenotype mapping



Mouse essential genome

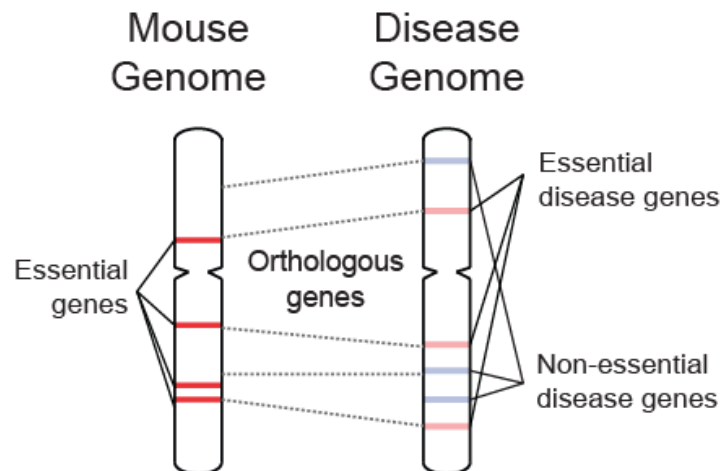
2,726 essential genes

Mouse model organism

high sequence homology with human
well-annotated mutant phenotypes

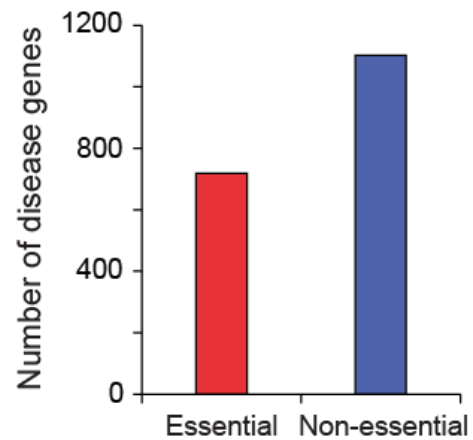
Criteria of defining essential genes

- Embryonic lethality
- Prenatal lethality
- Survival postnatal lethality
- Abnormal reproductive system morphology or physiology
- Premature death or induced morbidity
- Mutant life span < 50 days

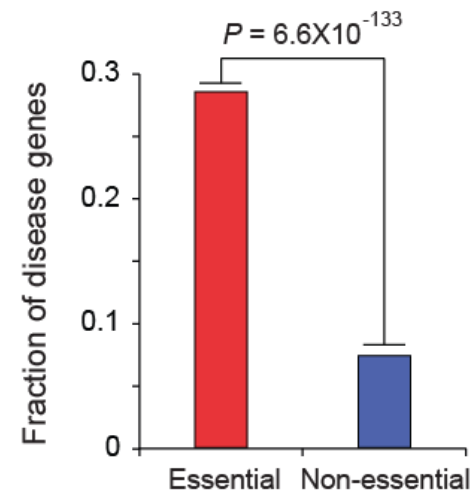


Gene Essentiality and Human disease-association

A

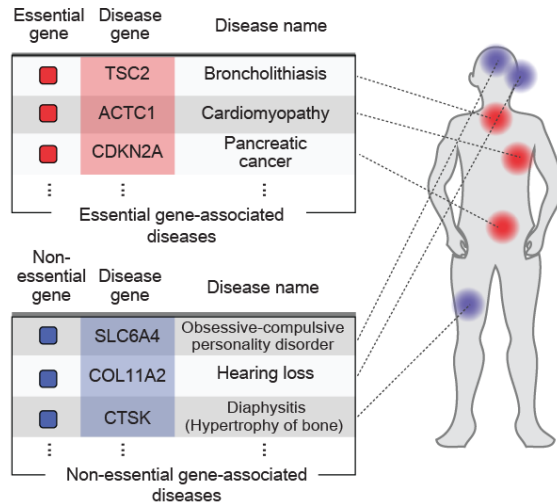


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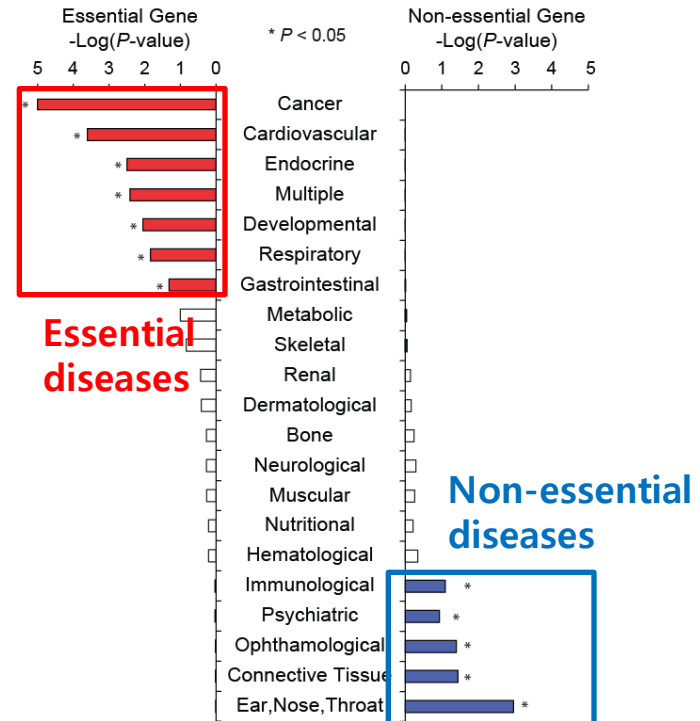


Human diseases associated with essential or non-essential genes are different.

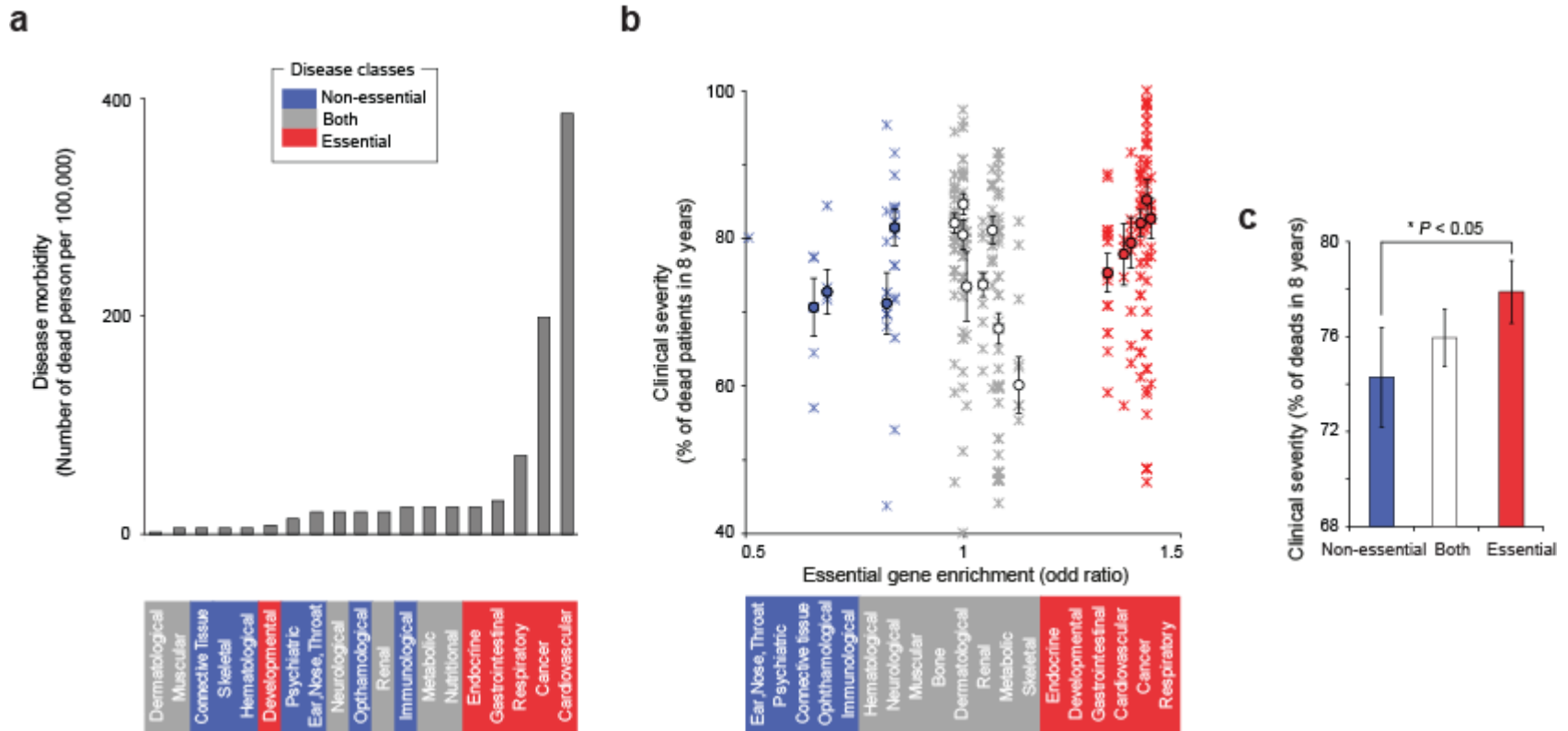
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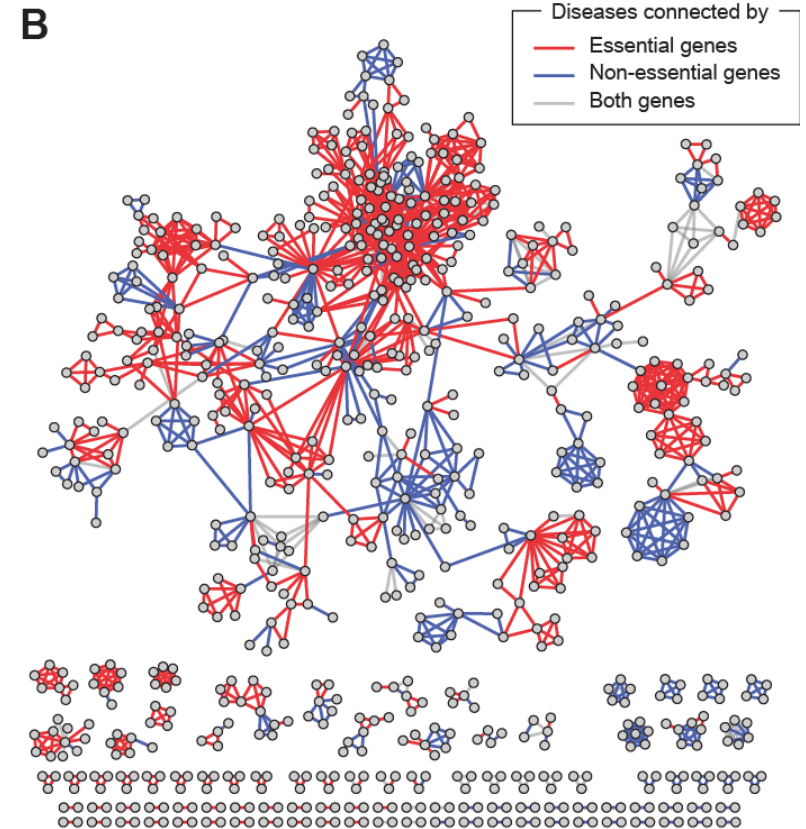
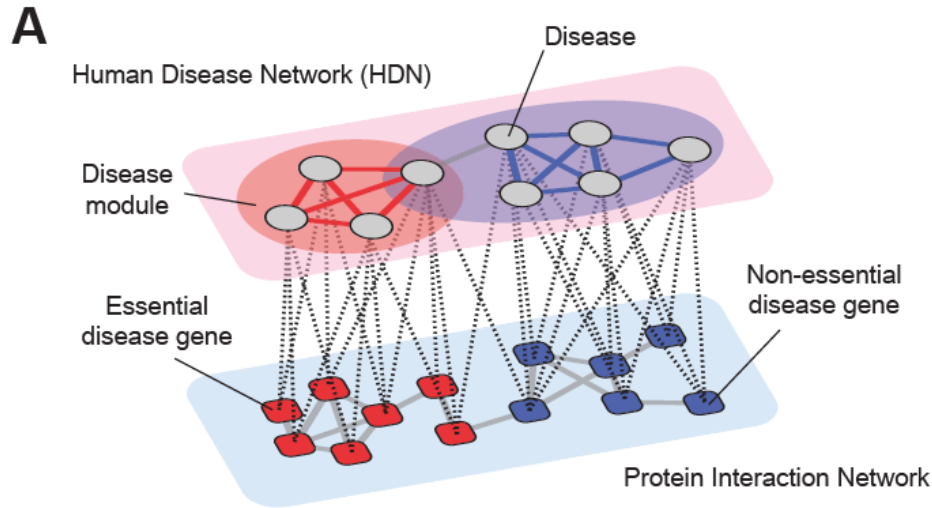


Essential diseases are more clinically severe than non-essential diseases in human population study.

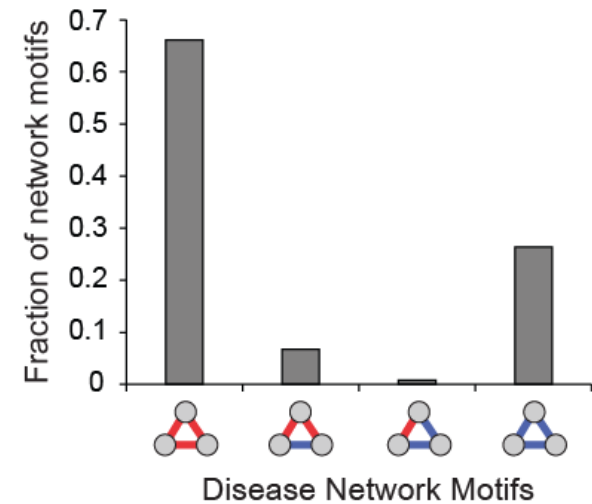
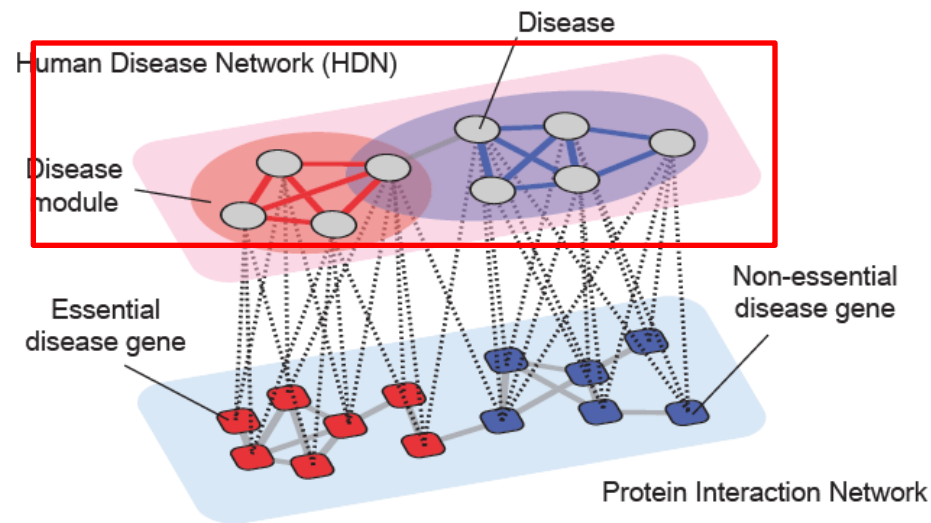


- We investigated disease progression (death or viable) of specific diseases patients from medicare patients population data (13,039,018).
- Essential disease classes have higher fraction of dead patients in 8 years than non-essential disease classes.
- Top 5 of disease classifications causes death in US are overlapped with essential diseases.

Association between gene essentiality and disease classes is originated from disease module connected by essential or non-essential genes in HDN.

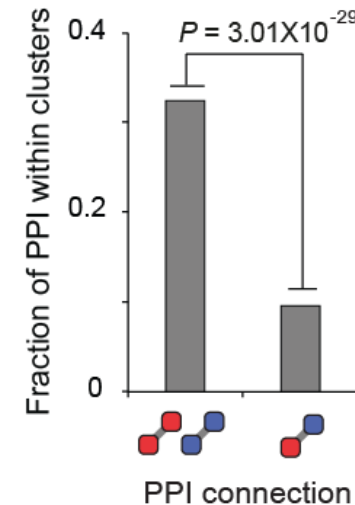
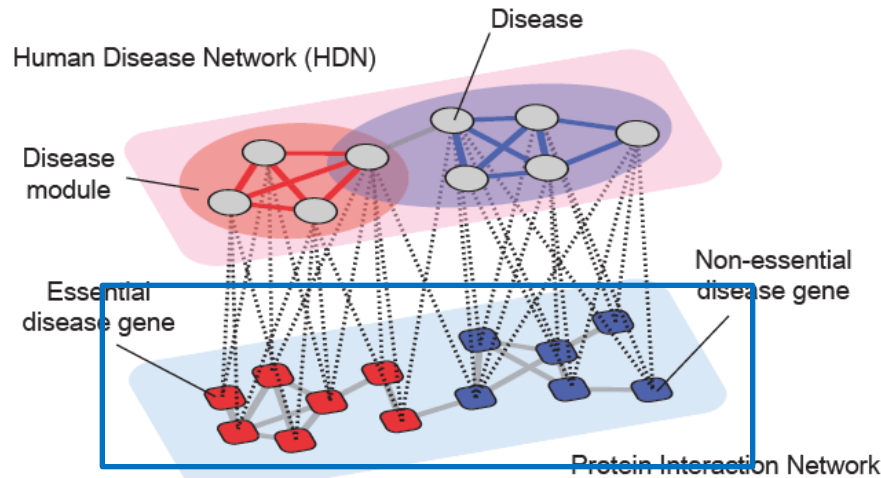


- Goh et al. found that diseases in same major class are clustered in Human Disease Network (HDN).
- Diseases connected by essential or non-essential genes have strong modularity in HDN.



- Complete disease network motif composed by 3 diseases is basic component of disease modules.
- 90% of disease network motif found from HDN are connected by all essential or non-essential genes.

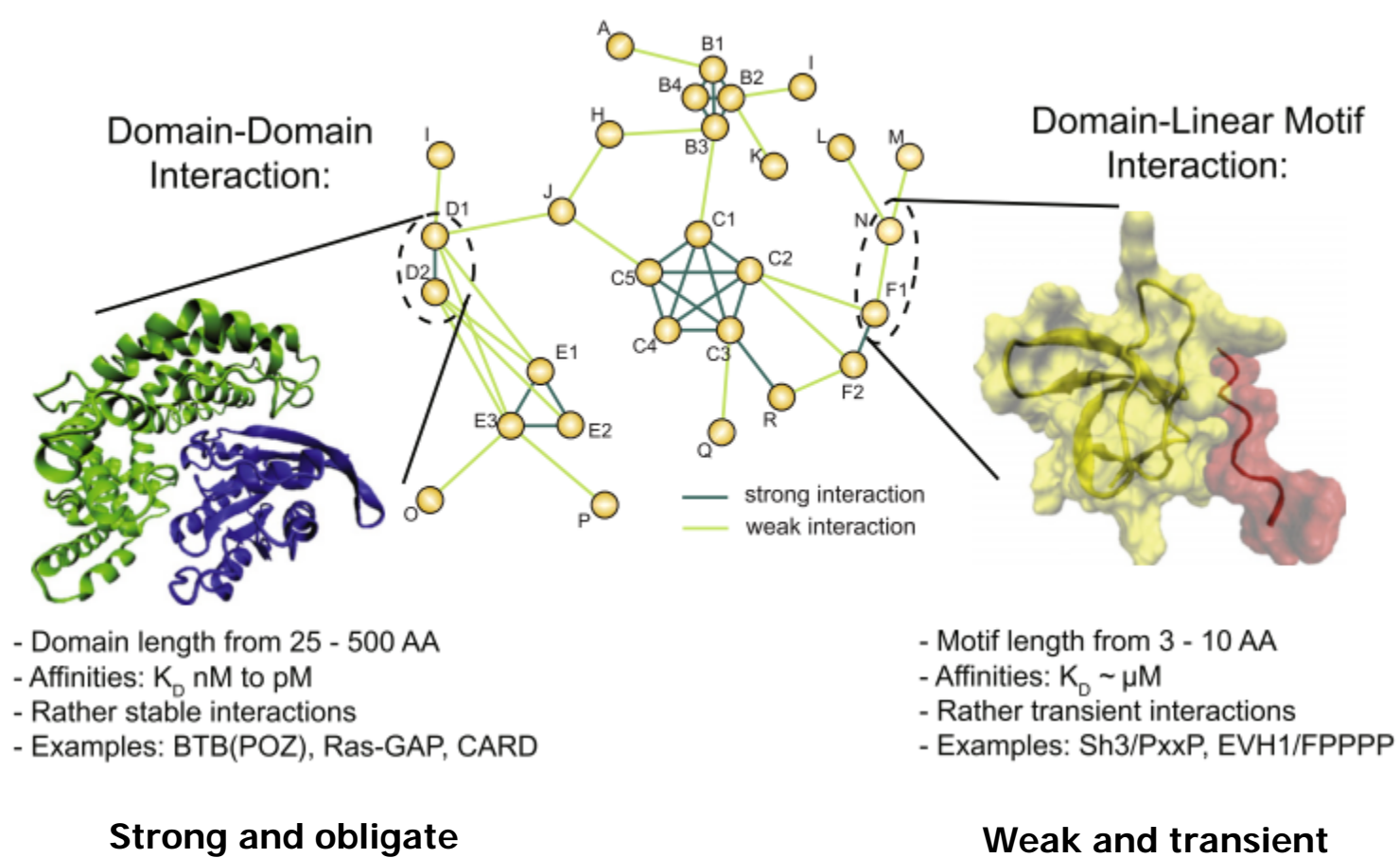
**Clustering of essential or non-essential gene
in protein interaction network is related with diseases modules in HDN.**



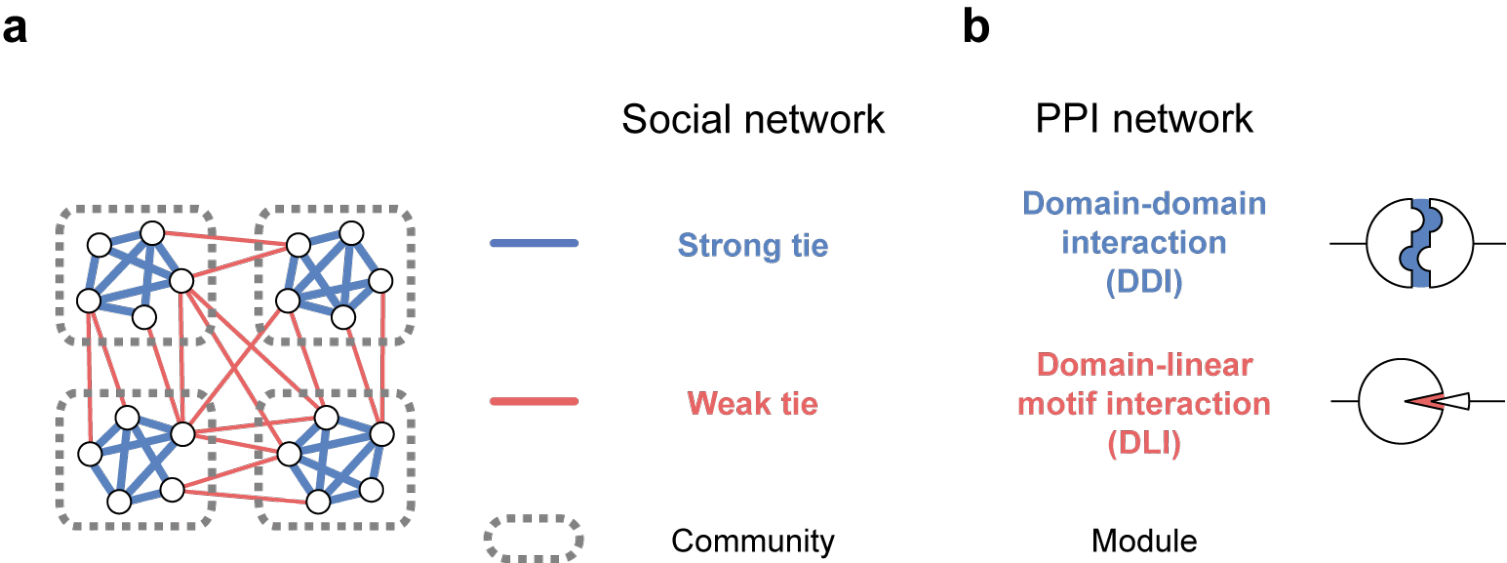
- Protein interaction composed by all essential or non-essential genes tend to connect within module in protein interaction network.
- Modularity of human diseases is closely related with protein interaction network (PIN).

Domain-Linear Motif Interactions Shape the Modular Architecture of Human Protein-protein Interaction Network During Evolution

Two types of PPI: DDI and DLI



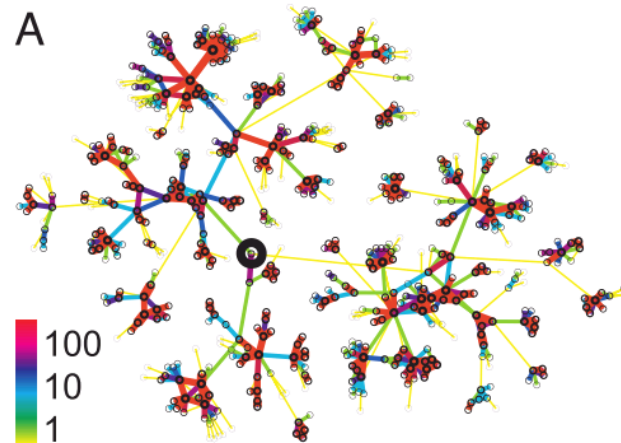
Hypothesis; Interaction strength is related with modular architecture



DDIs and DLIs have distinct roles for the modular architecture of PPI networks and its evolution.

The strength of weak ties

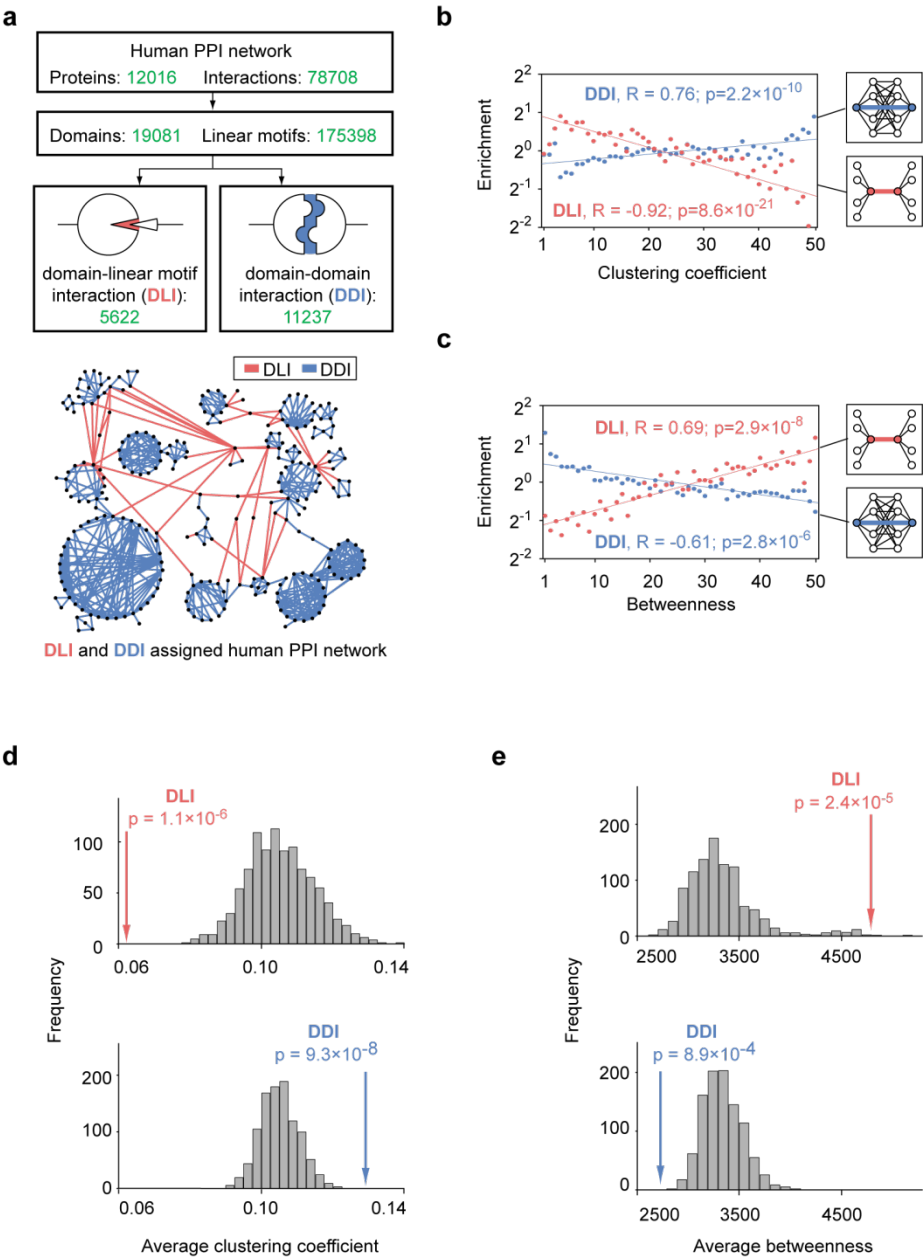
Mobile call graph with call duration



Proc Natl Acad Sci U S A. 2007 May 1;104(18):7332–6.

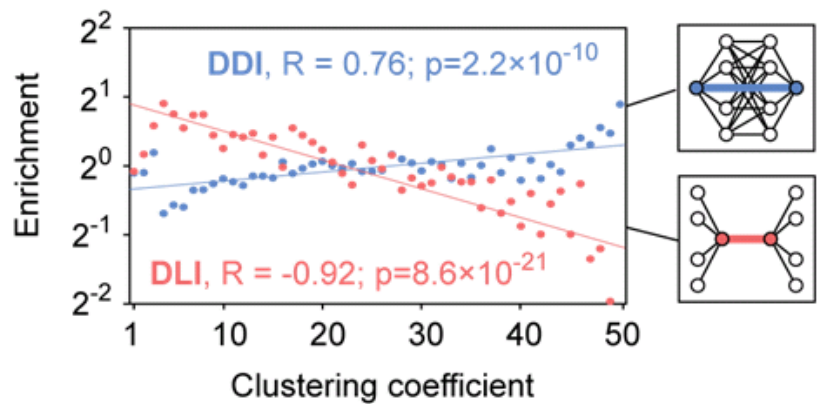
**Weak interactions connect between modules,
whereas strong interactions cluster nodes
within modules.**

DLIs and DDIs have different topological roles in the PPI network

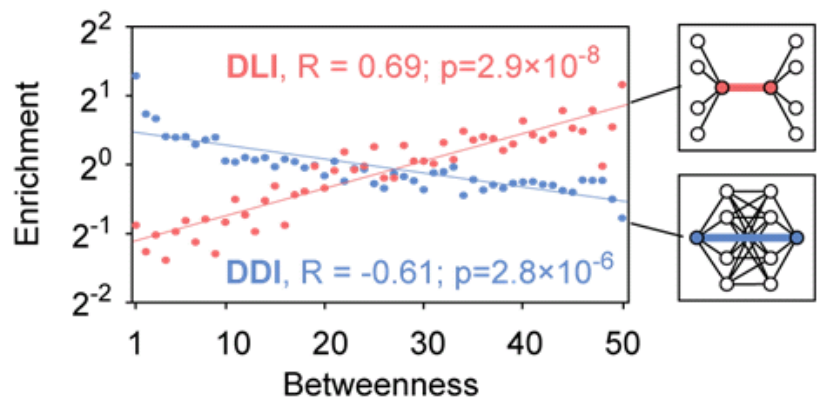


DDIs are enriched in within modular interactions and
DLIs are enriched in between modular interactions in the PPI network

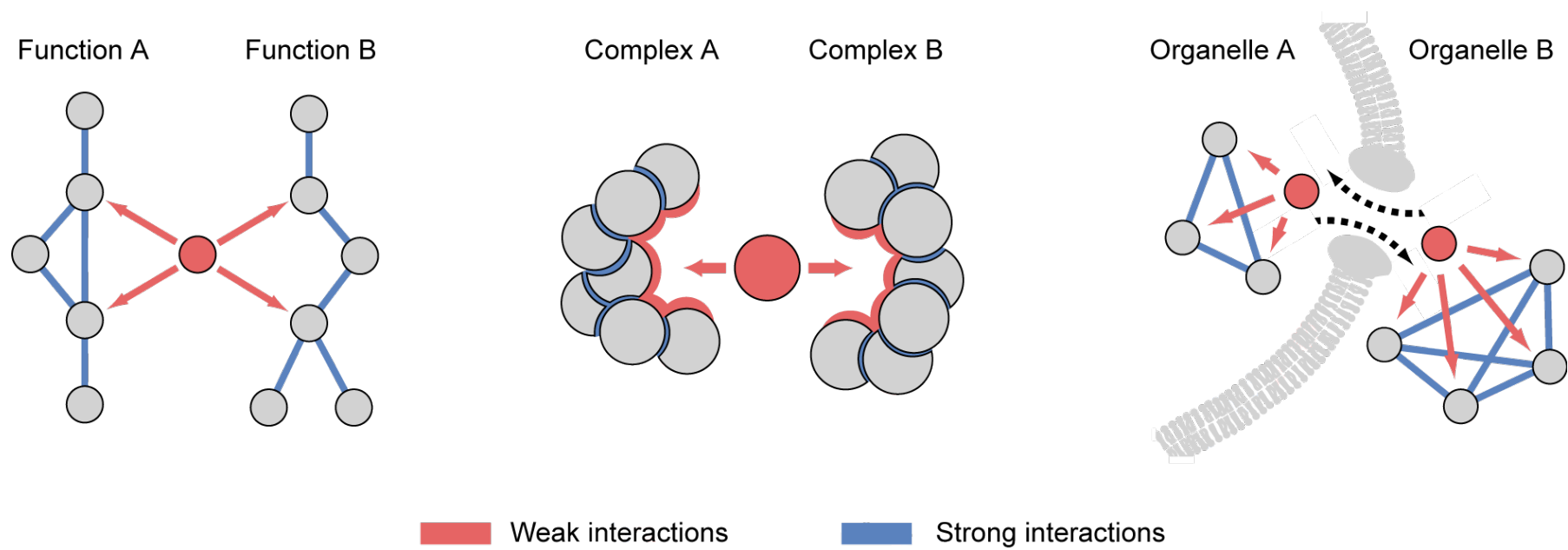
b



c

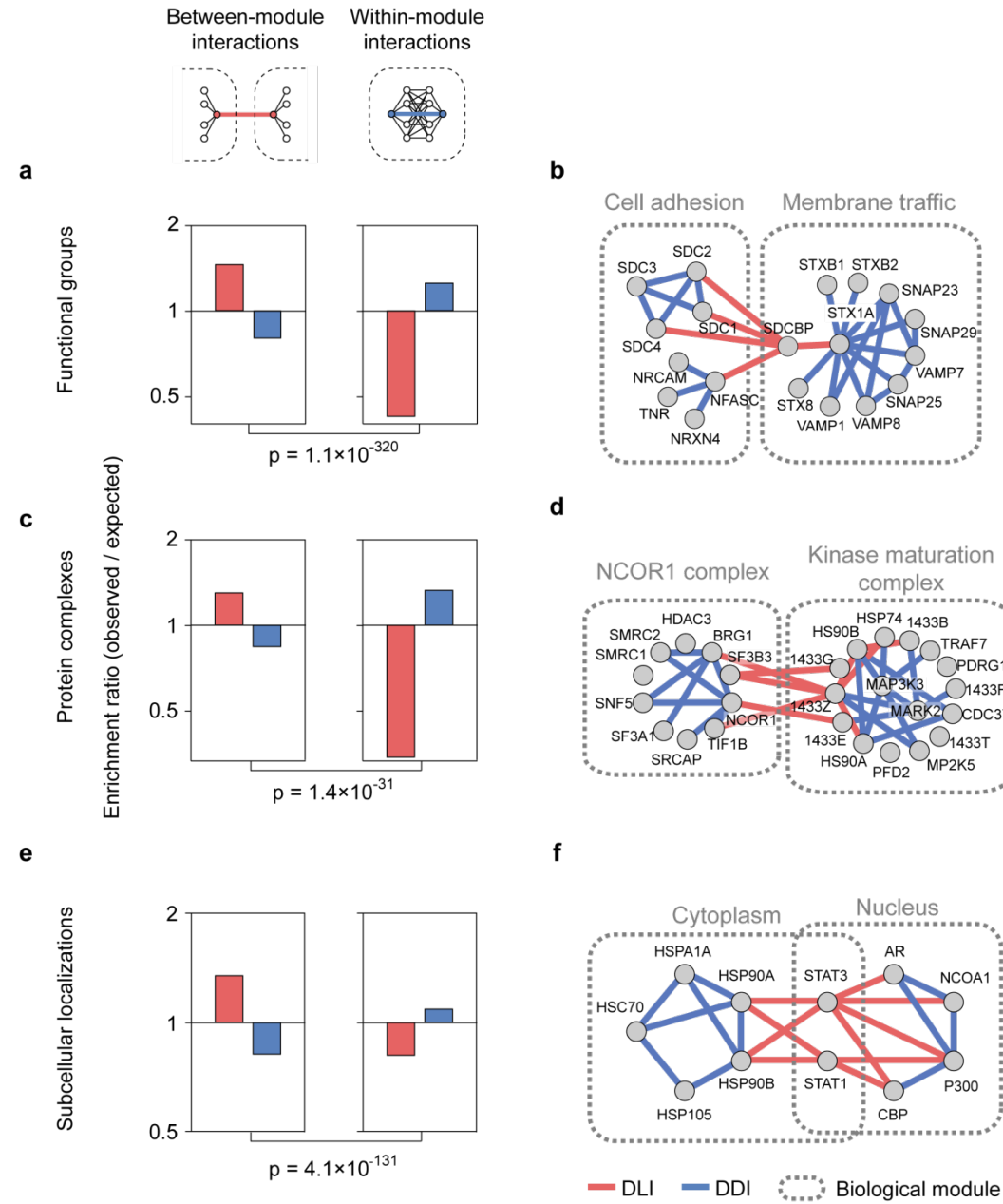


Weak (transient) interactions have important roles in biological network



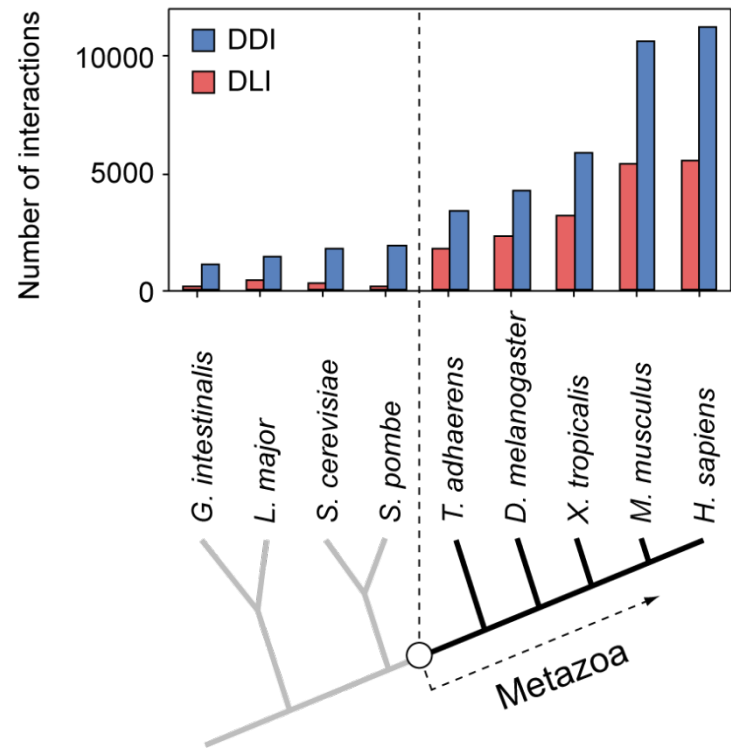
Weak interactions are physically more suitable for transient interactions between biological modules, including functional groups, protein complexes, and subcellular localizations.

DDIs are enriched in within modular interactions and DLIs are enriched in between modular interactions in the PPI network

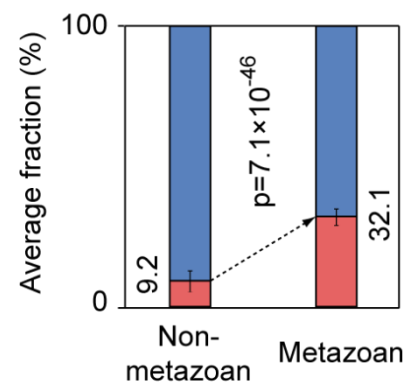


Transient interactions have increased during the course of metazoan species evolution

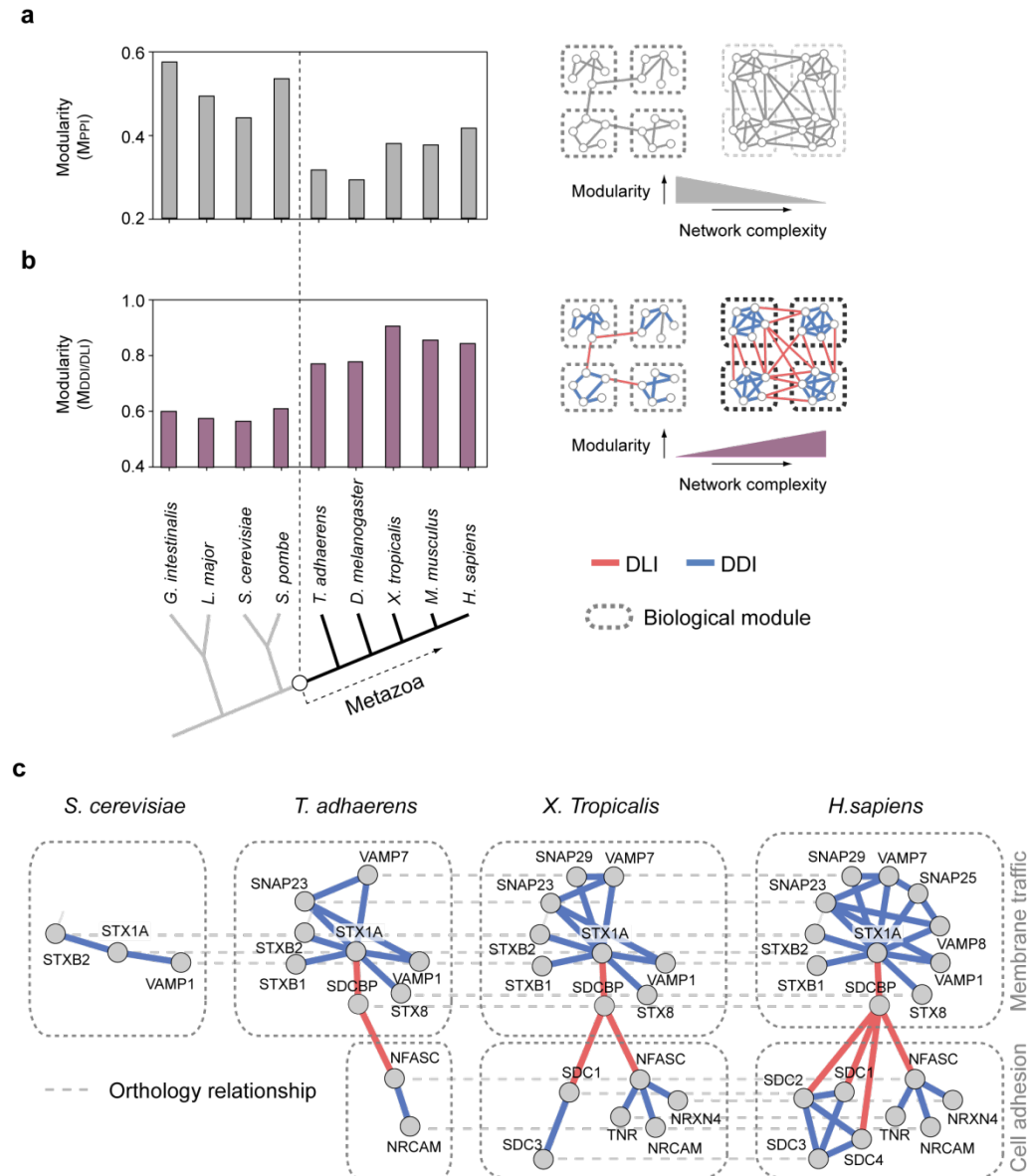
a



b

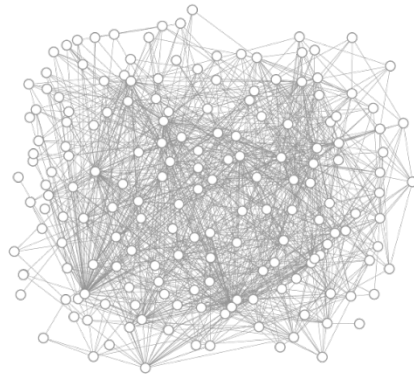


Transient interactions improved the modularity of PPI networks

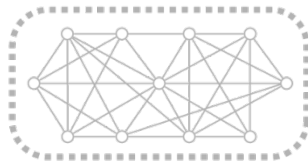


Refinement of module detection by using DLI and DDI information

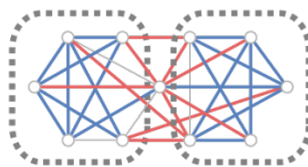
a



PPI network

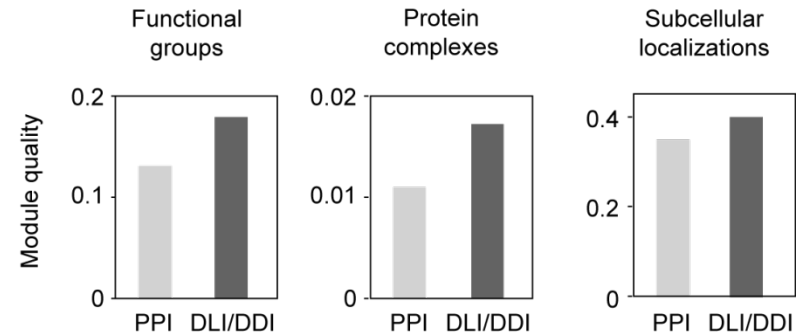


Modules clustered by PPI



Refined modules by DLI/DDI

b



c

