

1. Introduction to Molecular & Systems Biology

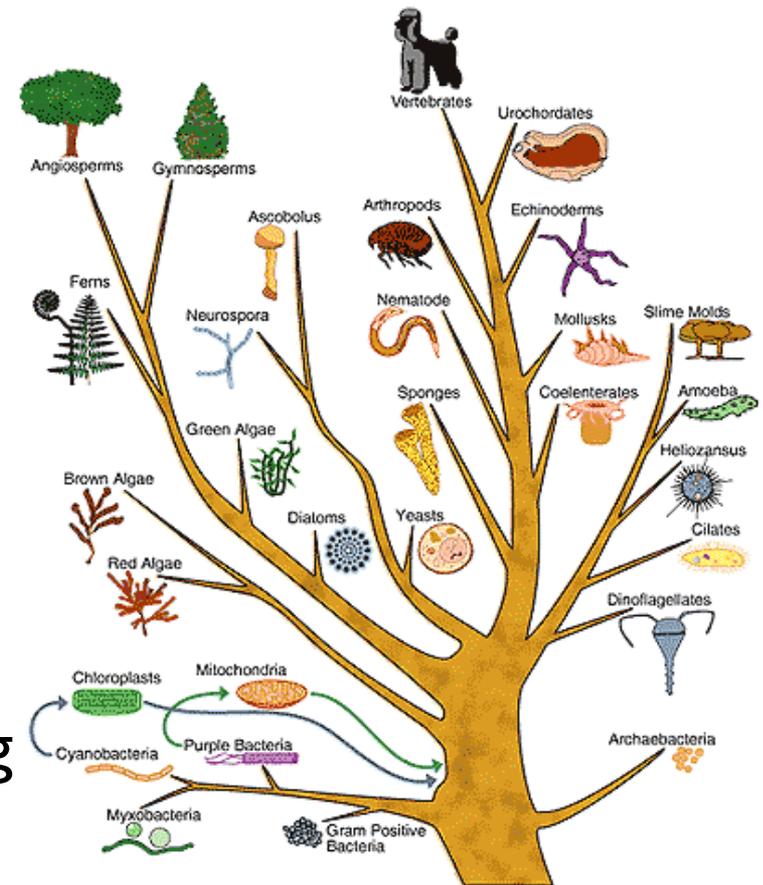
EECS 600: Systems Biology & Bioinformatics, Fall 2008
Instructor: Mehmet Koyuturk

Life

- ▶ **There is no universal definition of life**
 - ▶ The structural and functional unit of all living organisms is the cell
 - ▶ Living beings use energy to produce offsprings
 - ▶ Living beings feed on negative entropy
- ▶ **Fundamental properties**
 - ▶ Diversity
 - ▶ Unity
- ▶ **In biology, almost every rule has an exception**
 - ▶ Are viruses a form of life?

Evolution

- ▶ All organisms are part of a continuous line of ancestors and descendants
- ▶ Key principles
 - ▶ Self-replication: Inheritance of characters
 - ▶ Variation: Diversity and adaptation
 - ▶ Selection: Not all variation goes through
- ▶ Evolution is key to understanding the principles that underlie life



Molecular Biology



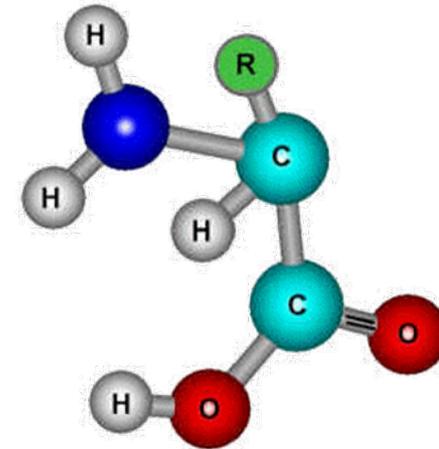
Structure & Function

- ▶ *Structure*: Physical composition and relationships of a molecule, cell, organism
- ▶ *Function*: The role of the component in the process of life
- ▶ The main function: Turn available matter & energy into offsprings
- ▶ Required structural components
 - ▶ Boundaries to separate organism from environment
 - ▶ Membranes, composed of lipids
 - ▶ Storage medium for inheritable characteristics
 - ▶ Chromosomes
 - ▶ All other materials necessary for survival and reproduction
 - ▶ Cytoplasm

Molecules

▶ Small molecules

- ▶ Source of energy or material, structural components, signal transmission, building blocks of macromolecules
 - ▶ Water, sugars, fatty acids, amino acids, nucleotides



▶ Proteins

- ▶ Main building blocks and functional molecules of the cell
 - ▶ Structure, catalysis of chemical reactions, signal transduction, communication with extracellular environment



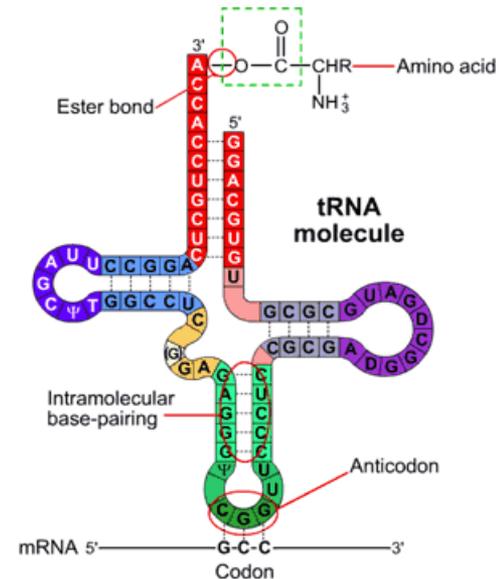
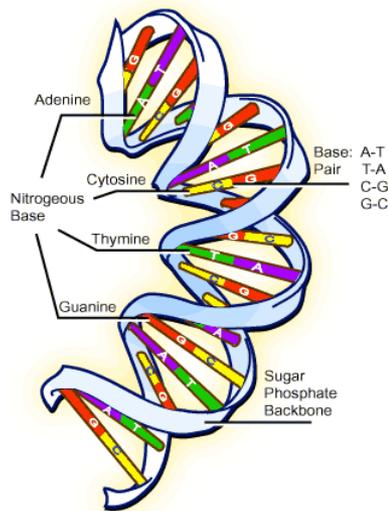
Molecules

▶ DNA

- ▶ Storage and reproduction of information

▶ RNA

- ▶ Key role in transformation of genetic information to function



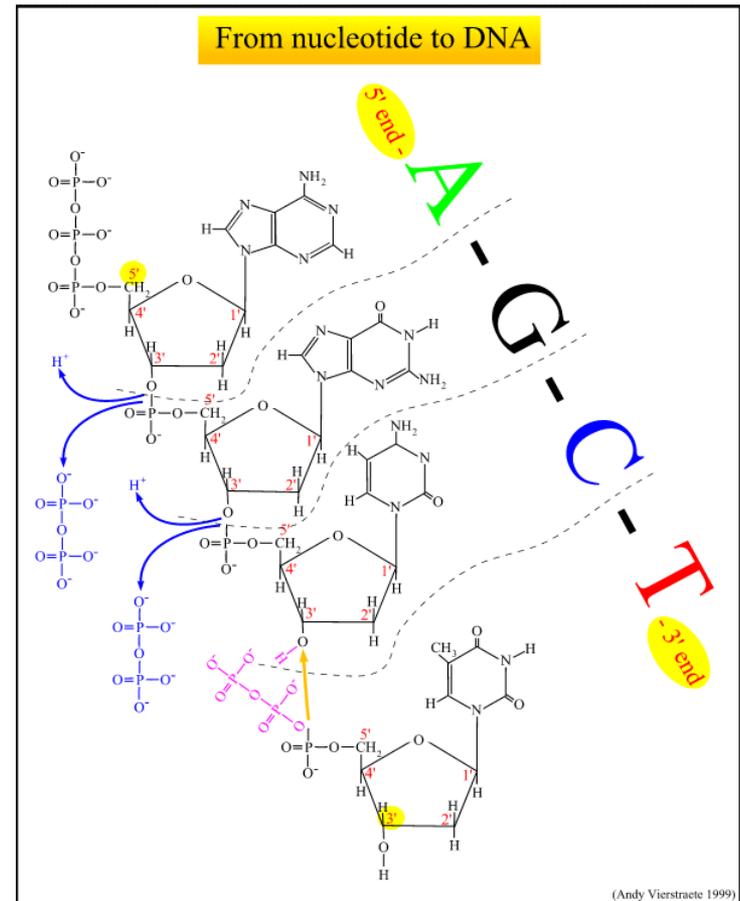
The Central Dogma



- ▶ Proteins are in action, their structure determines their function
- ▶ DNA stores the information that determines a protein's structure
- ▶ RNA mediates transformation of genetic information into functional molecules
 - ▶ There are functional RNA molecules as well!

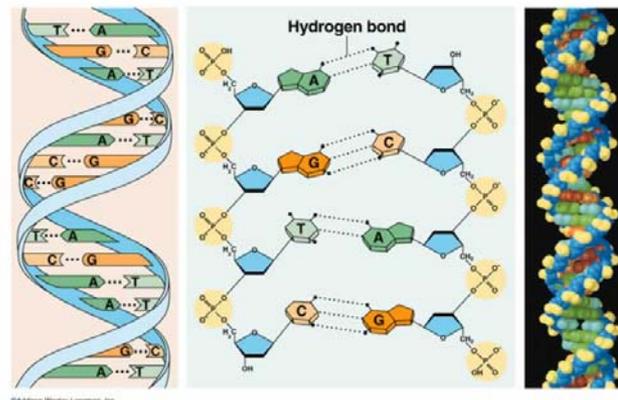
DNA

- ▶ Sequence of nucleotides
- ▶ Backbone is composed of sugars, linked to each other via phosphate bonds
- ▶ Each sugar is linked to a base
 - ▶ Adenine (A), Thymine (T), Guanine (G), Cytosine (C)
 - ▶ Base molecules compose the alphabet of genetic information



The Double Helix

- ▶ DNA is generally found in a double strand form
 - ▶ A and T, C and G form hydrogen bonds
 - ▶ Two strands with complementary sequences run in opposite directions
 - 5' A-T-C-T-G-A 3'
 - 3' T-A-G-A-C-T 5'
 - ▶ They are coiled around one another to form double helix structure



Storage of Genetic Information

▶ Chromosomes

- ▶ Long double stranded DNA molecules
- ▶ In eukaryotes, chromosomes reside in nucleus
- ▶ Humans have 23 pairs of chromosomes

▶ Genome

- ▶ All chromosomes (and mitochondrial DNA) form the genome of an organism
- ▶ It is believed that almost all hereditary information is stored in the genome
- ▶ All cells in an organism contain identical genomes

Genome Length Statistics

Organism		Genome Size (KB)	No. of Genes
Viruses	MS2	4	
	Lambda	50	~30
	Smallpox	267	~ 200
Prokaryotes	M. genitalium	580	470
	E. coli	4,700	4,000
Eukaryotes	S. cerevisiae (yeast)	12,068	5,885
	Arabidopsis	100,000	20 - 30,000
	Human	3,000,000	~ 100,000
	Maize	4,500,000	~ 30,000
	Lily	30,000,000	

RNA

- ▶ RNA is made of ribonucleic acids instead of deoxyribonucleic acids (as in DNA)
 - ▶ RNA is single-stranded
 - ▶ In RNA sequences, Thymine (T) is replaced by Uracil (U)
- ▶ mRNA carries the message from genome to proteins
- ▶ tRNA acts in translation of biological macromolecules from the language of nucleic acids to aminoacids
- ▶ Several different types of RNA have several other functions
 - ▶ RNA is hypothesized to be the first organic molecule that underlies life

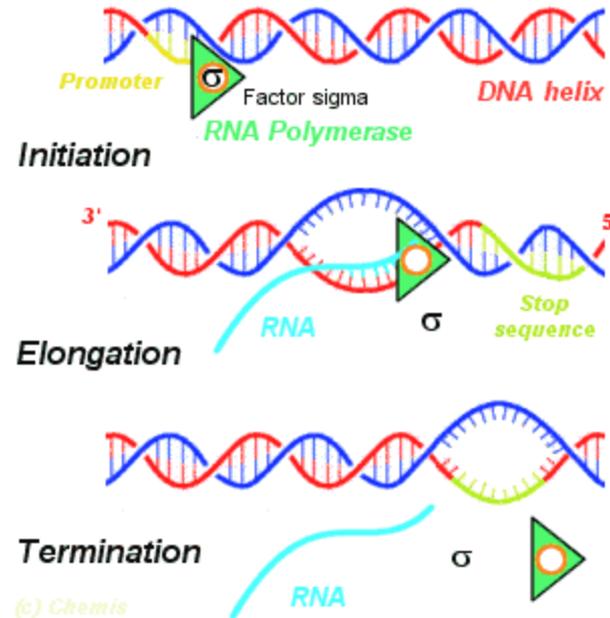
Proteins

- ▶ **Proteins are chains of aminoacids connected by peptide bonds**
 - ▶ Often called a polypeptide sequence
 - ▶ There are 20 different types of aminoacid molecules (each aminoacid in the chain is commonly referred to as a residue)
- ▶ **Proteins carry out most of the tasks essential for life**
 - ▶ Structural proteins: Basic building blocks
 - ▶ Enzymes: Catalyze chemical reactions that enable the mechanism transform forms of matter and energy to one another (metabolism)
 - ▶ Transcription factors: Genetic regulation, *i.e.*, control of which protein will be synthesized to what extent

Proteins: Synthesis, Structure, Function



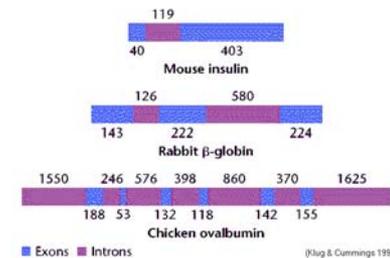
Transcription



- ▶ One strand of DNA is copied into complementary mRNA
- ▶ Carried out by protein complex RNA polymerase II

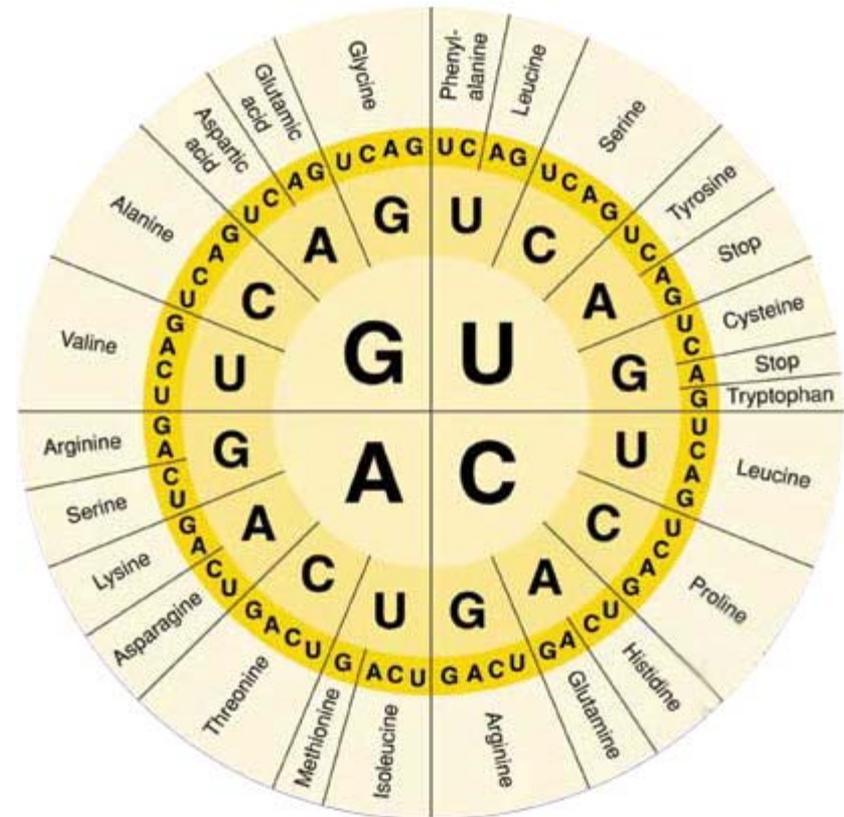
Splicing

- ▶ A gene is a continuous stretch of genomic DNA from which one (or more) type(s) of protein(s) can be synthesized
- ▶ Genes contain coding regions (exons) separated by non-coding regions (intron)
- ▶ Introns are removed from pre-mRNA through a process called splicing, resulting in mRNA
- ▶ *Alternative splicing*: Different combinations of introns and exons may be used to synthesize different proteins from a single gene



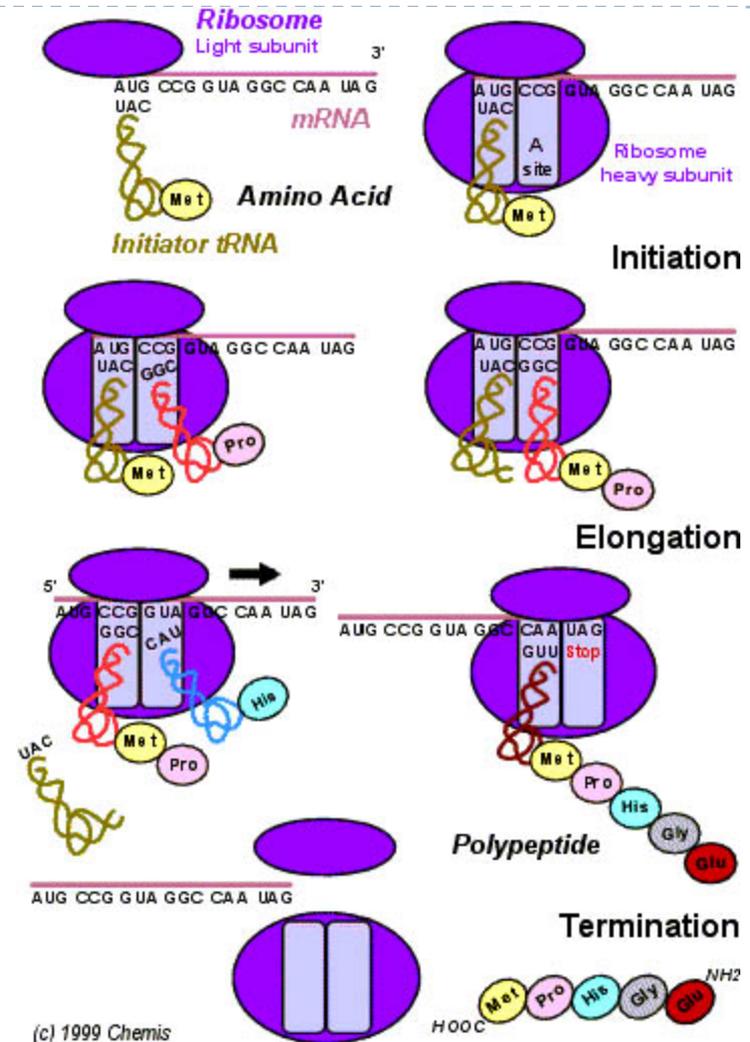
Genetic Code

- ▶ There are 4 different types of nucleotides, 20 different types of aminoacids
- ▶ A contiguous group of 3 nucleotides (codon) codes for a single aminoacid
 - ▶ 64 possible combinations, multiple codons code for a single aminoacid
 - ▶ There are codons reserved for signaling termination



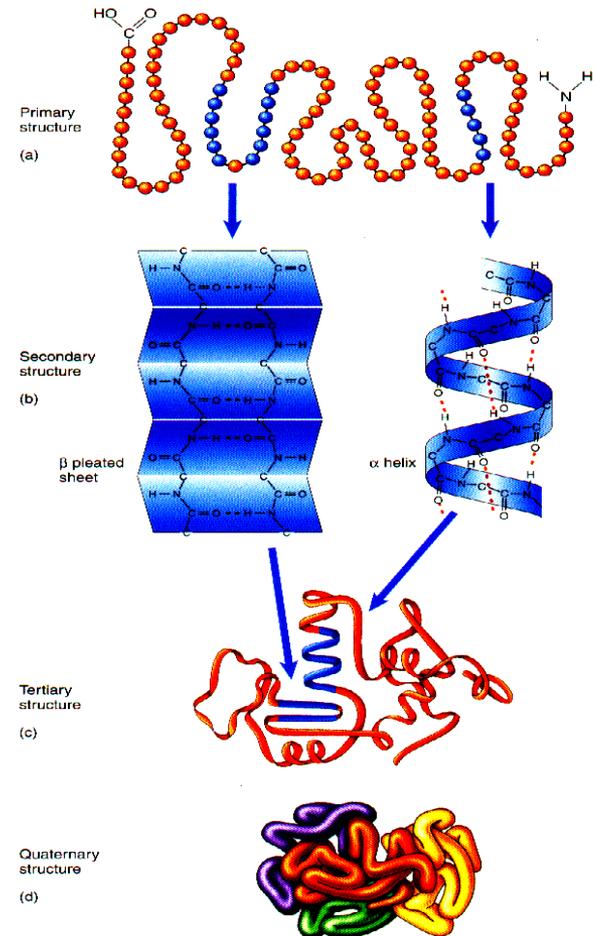
Translation

- ▶ The process of synthesizing a protein, using an mRNA molecule as template
- ▶ Carried out in ribosome
- ▶ tRNA
 - ▶ Cloverleaf structure, three bases at the hairpin loop form an *anticodon*
 - ▶ A single type of amino acid may be attached to the 3' end of a single tRNA
- ▶ There is no tRNA with a stop anticodon



Protein Structure

- ▶ **Primary structure**
 - ▶ The aminoacid sequence and the chemical environment determine a protein's 3D structure
- ▶ **Secondary structure**
 - ▶ Alpha helices, beta sheets
- ▶ **Tertiary structure**
 - ▶ Folding: relatively stable 3D shape
 - ▶ Domain: functional substructure
- ▶ **Quarternary structure**
 - ▶ More than one aminoacid chain
- ▶ Structure is key in function



Protein Function

- ▶ **Three aspects**
 - ▶ **Activity:** What does the protein do? (e.g., an enzyme might break a particular kind of bond)
 - ▶ **Specificity:** The ability to act on particular targets
 - ▶ **Regulation:** Activity may be modulated by other molecules (on or off?)
- ▶ **Each of these aspects is realized by a corresponding aspect of structure**
- ▶ **In this course, we will focus on analyzing data that provide clues on how proteins cooperate to perform complex functions**

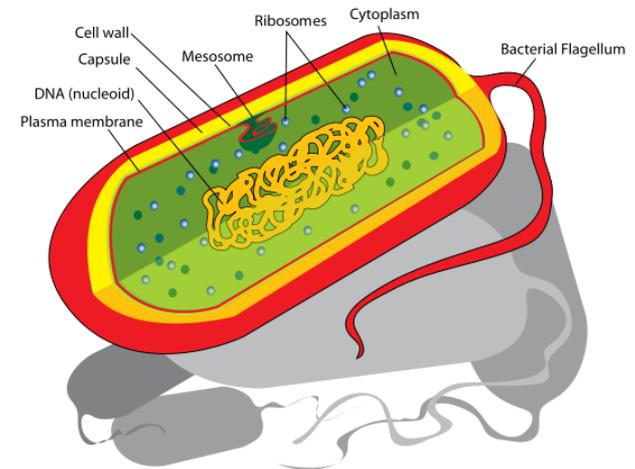
Domains of Life

Domains of Life

- ▶ **Three cell types**
 - ▶ Prokaryotes
 - ▶ Eukaryotes
 - ▶ Archaea
- ▶ **Similarities**
 - ▶ All have DNA as genetic material
 - ▶ All are membrane bound
 - ▶ All have ribosomes
 - ▶ All have similar basic metabolism
 - ▶ All are diverse in forms

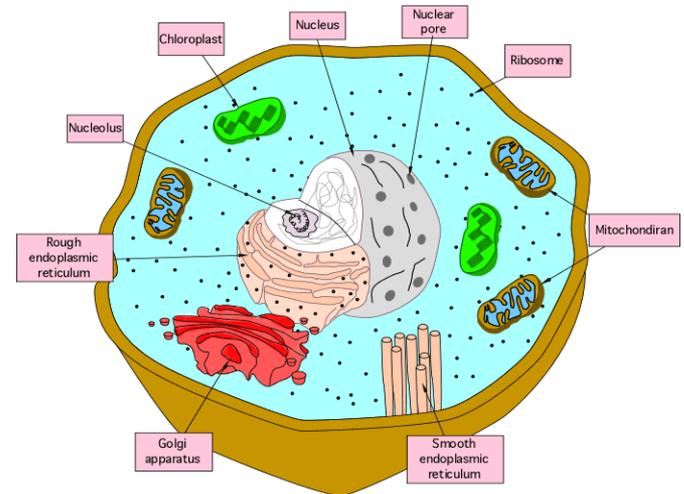
Prokaryotes

- ▶ Their genetic material is not membrane bound
- ▶ They do not have membrane bound cellular compartments
- ▶ They contain only a single loop of DNA (no chromosomes)
- ▶ All prokaryotes are unicellular (they do form colonies, though)
- ▶ They are ubiquitous
- ▶ All bacteria are prokaryotes
 - ▶ *E. coli*, *H. Pylori*



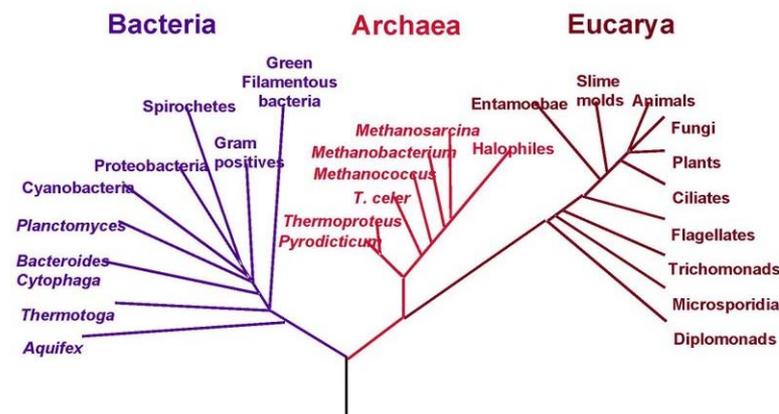
Eukaryotes

- ▶ Cells are organized into complex structures by internal membranes and a cytoskeleton
 - ▶ Nucleus is the most characteristic membrane bound structure
 - ▶ Genetic material is stored in chromosomes
- ▶ All multicellular organisms are eukaryotes
 - ▶ Can be unicellular as well
- ▶ Plants, animals, fungi, protists
 - ▶ Human (*H. sapiens*)
 - ▶ Mouse (*M. musculus*)
 - ▶ Weed (*A. thaliana*)
 - ▶ Fly (*D. melanogaster*)
 - ▶ Baker's yeast (*S. cerevisiae*)



Archaea

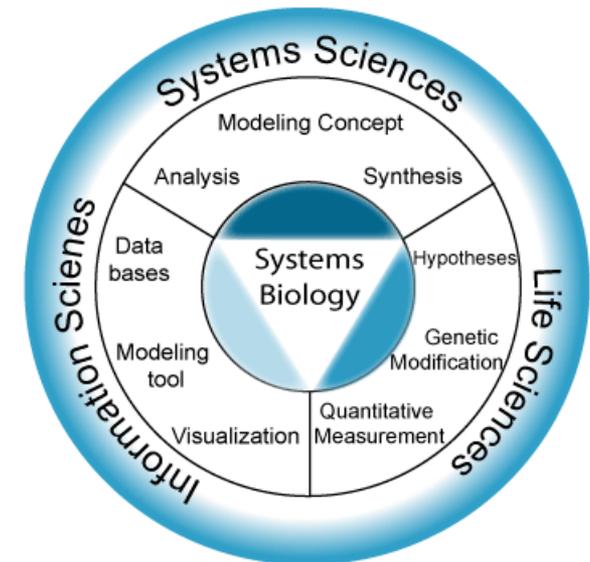
- ▶ Most recently discovered domain of life
- ▶ Generally extremophile
- ▶ Microorganisms like prokaryotes, therefore sometimes referred to as archaeobacteria
 - ▶ Similar to prokaryotes in cell structure and metabolism
 - ▶ Genetic transcription and translation is more similar to that in eukaryotes



Systems Biology

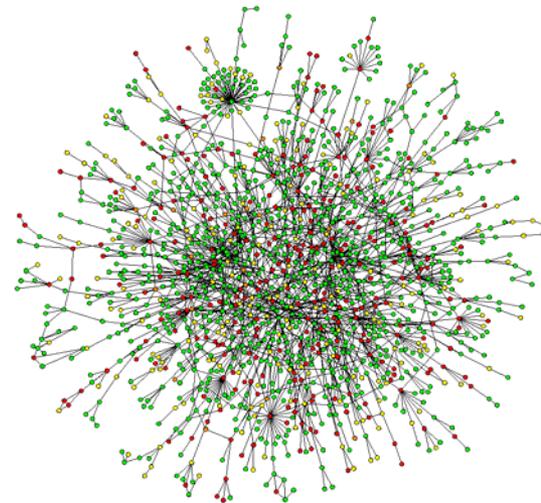
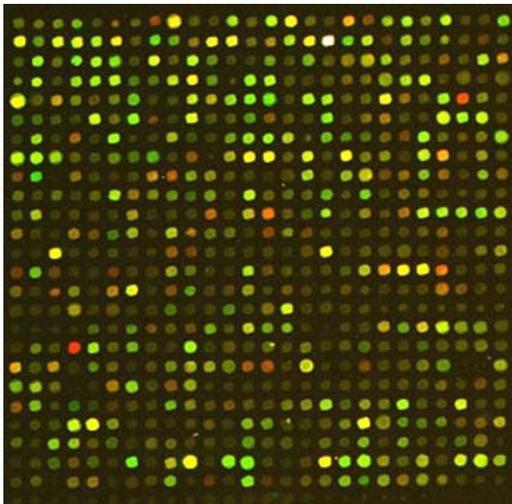
Why Systems Biology?

- ▶ “To understand biology at the system level, we must examine the **structure** and **dynamics** of **cellular and organismal function**, rather than the characteristics of **isolated** parts of a cell or organism.” (Kitano, *Science*, 2002)
- ▶ Cell is not just an assembly of genes and proteins
- ▶ Systems biology **complements** molecular biology



Systems Perspective is Possible Today

- ▶ Progress in molecular biology
 - ▶ Genome sequencing
 - ▶ Information on underlying molecules
 - ▶ High-throughput measurements
 - ▶ Comprehensive data on system state



An Analogy

- ▶ Understanding how an airplane works
 - ▶ What do we learn if we list all parts of an airplane?
 - ▶ Identifying single genes or proteins
 - ▶ How are these parts assembled to form the structure of an airplane?
 - ▶ This tells us on what parts may have an effect what parts
 - ▶ Identifying regulatory effects of genes on one another, protein-protein interactions, etc.
 - ▶ How do individual components dynamically interact?
 - ▶ What is the voltage on each signal line?
 - ▶ How do voltages on different signal lines effect each other?
 - ▶ How do the circuits react when malfunction occurs?

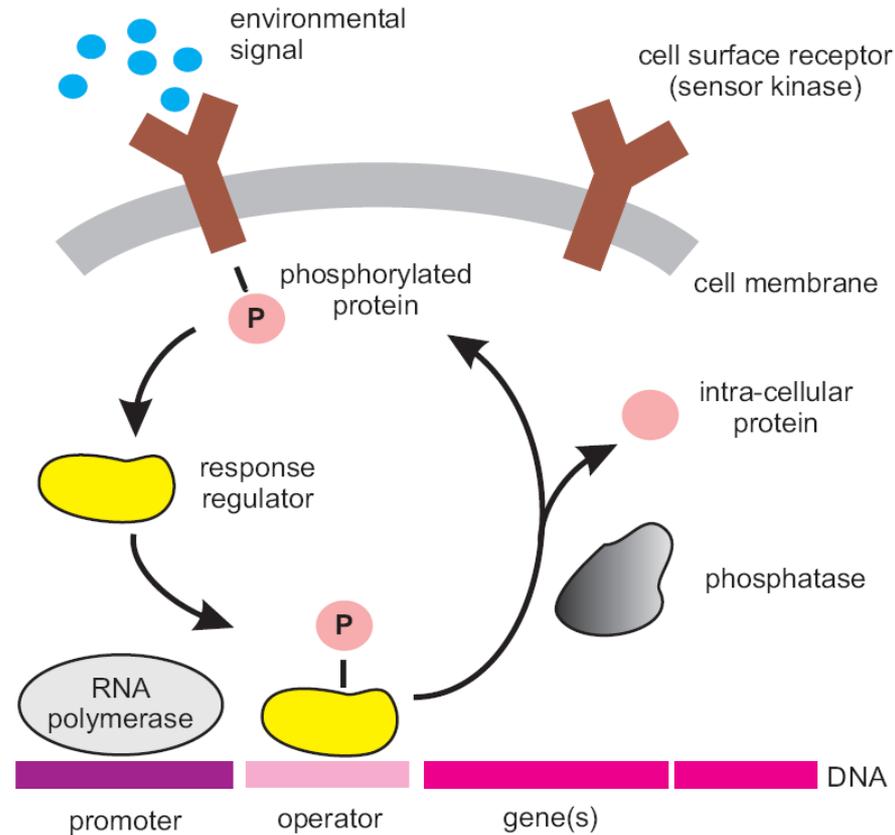
What is a System?



System Concepts

- ▶ 1. System structures
 - ▶ Topology, wiring, architecture, organization
- ▶ 2. System dynamics
 - ▶ Behavior over time, under different conditions
- ▶ 3. System control
 - ▶ Mechanisms that systematically control the state of the cell
- ▶ 4. System design
 - ▶ Underlying design principles
- ▶ All interrelated!

An Example: Cellular Signaling



<http://www.informatik.uni-rostock.de/~lin/GC/Slides/Wolkenhauer.pdf>

System Structure

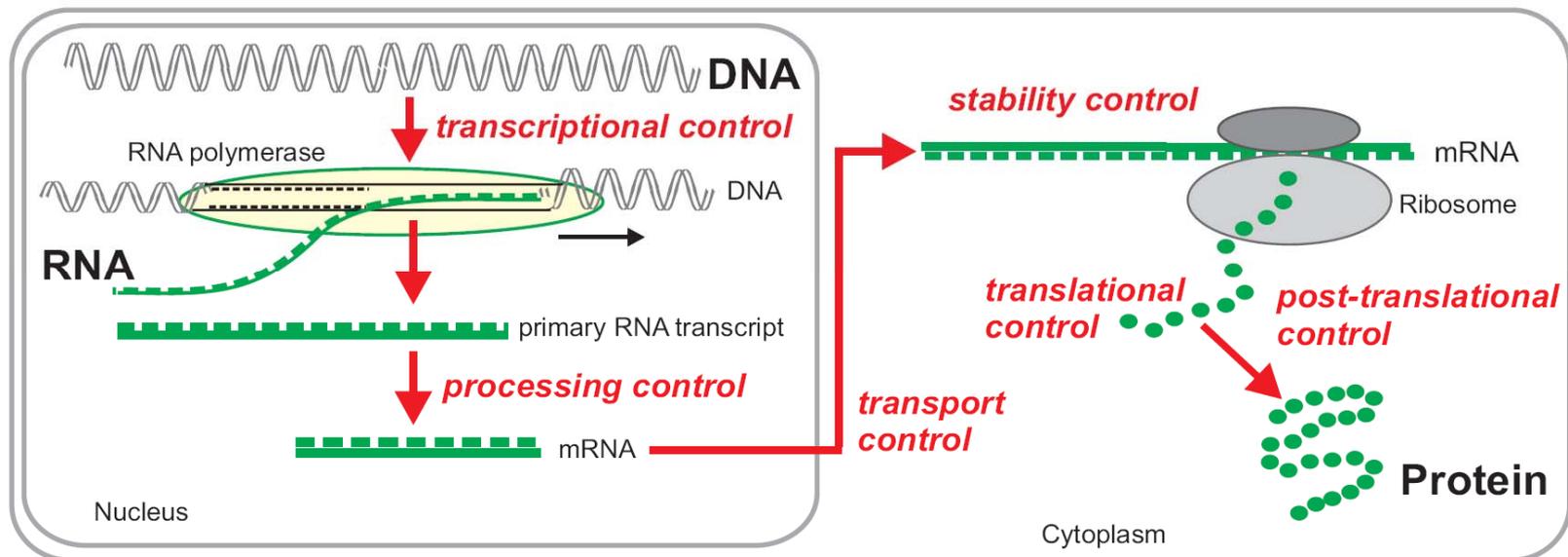
- ▶ **Wiring, architecture, or organization of the system**
 - ▶ Protein-protein interactions form a network
 - ▶ From direct physical relationships to large-scale orchestration between proteins
 - ▶ How are cellular signals are transmitted?
 - ▶ Metabolic network represents chains of reactions
 - ▶ Gene regulatory networks characterize the “control” of cellular state
- ▶ **Has to go beyond intracellular wiring**
 - ▶ How about organization of cells?
- ▶ **Tools**
 - ▶ Informatics, data analysis, knowledge discovery

System Dynamics

- ▶ The logic of system control in biological systems is *fuzzy*
 - ▶ Dimensions of time and space
- ▶ How does a system behave over time under various conditions?
 - ▶ How do concentrations of biochemical factors influence each other?
 - ▶ What is the effect of perturbation?
 - ▶ What are the essential mechanisms that underlie specific behaviors?
- ▶ Tools
 - ▶ Mathematical modeling
 - ▶ Simulation

System Control

- ▶ Mechanisms that systematically control the state of the cell
 - ▶ Robustness, how does the system respond to malfunction?



<http://www.informatik.uni-rostock.de/~lin/GC/Slides/Wolkenhauer.pdf>

System Design

- ▶ **Engineering aspects of the system**
 - ▶ Optimization, use of resources
- ▶ **Are there general principles?**
 - ▶ Convergent evolution
 - ▶ Evolutionary families of cellular circuitry?
 - ▶ “Periodic table” of functional regulatory circuits?
- ▶ **In most cases, we may not know what we are looking for**
 - ▶ Data mining & knowledge discovery
 - ▶ Pattern identification
 - ▶ Statistical evaluation: Which patterns are potentially relevant?

Organization & Dynamics

- ▶ Organization tells us about the architecture, but not how that architecture behaves
 - ▶ We have a road map, we want to characterize traffic patterns on the roads as well
 - ▶ The map is useful, but we need more information and more detailed modeling
- ▶ Organization underlies dynamics
 - ▶ If we understand network structure, we can start assigning functions on links (how do the gates behave?)
- ▶ Nevertheless, understanding of organization and dynamics is an overlapping process
 - ▶ Dynamic analysis may provide clues on identifying interactions

Properties of Complex Systems



Properties of Complex Systems

1. Emergence
2. Robustness
3. Modularity

Biological systems demonstrate these properties.

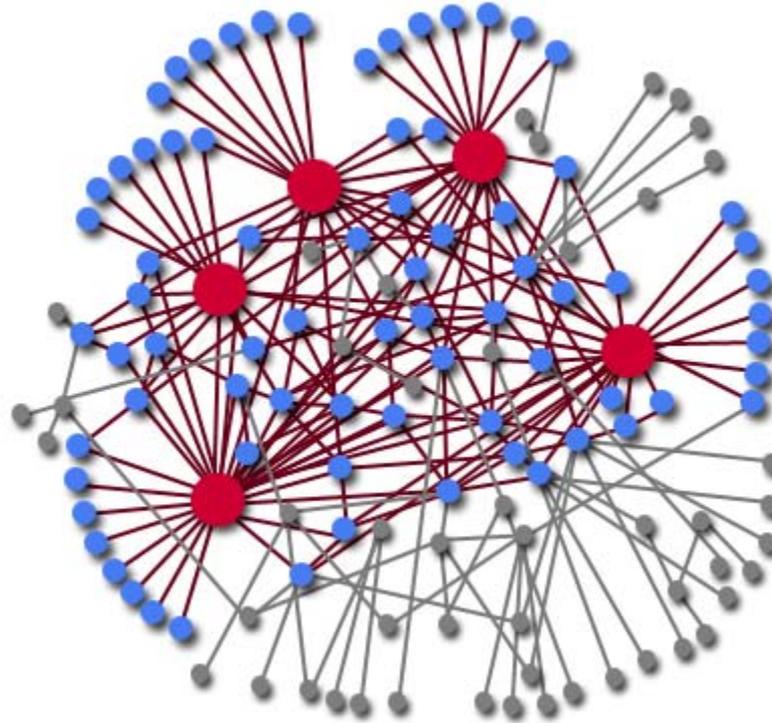
Emergence

- ▶ **Emergent properties:** Those that are not demonstrated by individual parts and cannot be predicted even with full understanding of the parts alone
 - ▶ Understanding hydrogen and oxygen is not sufficient to understand water
- ▶ **Life is an emergent property**
 - ▶ It is not inherent to DNA, RNA, proteins, carbohydrates, or lipids, but it is a consequence of their actions together
- ▶ **Systems-level perspective is required to comprehensively understand emergent properties**

Robustness

- ▶ Phenotypic stability under diverse perturbations
 - ▶ Environment, stochastic events, genetic variation
- ▶ Properties
 - ▶ Adaptation
 - ▶ Ability to cope with environmental changes
 - ▶ Parameter insensitivity
 - ▶ Not affected too much by slight perturbations
 - ▶ Graceful degradation
 - ▶ Slow degradation of a system's functions after damage (as compared to catastrophic failure)
 - ▶ Robustness might also cause fragility

Cost of Robustness



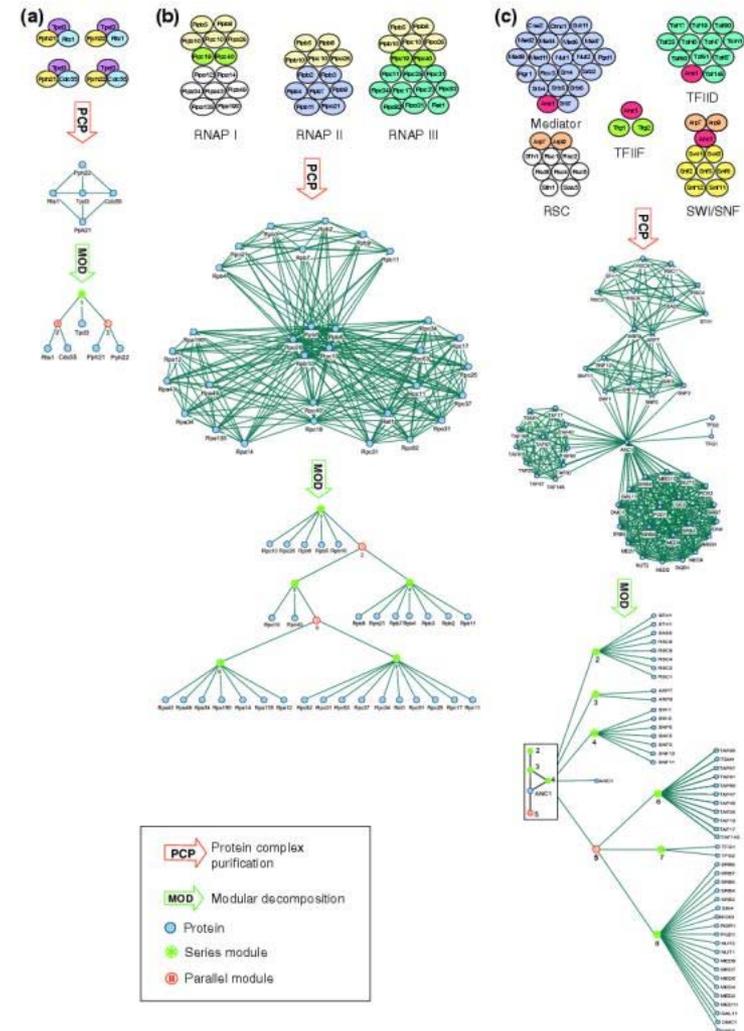
Scale-free networks: Robust against random attacks, vulnerable to targeted attacks

Robustness

- ▶ How can robustness be attained?
 - ▶ System control
 - ▶ Negative feedback: Insulates system from fluctuations imposed by the environment, dampens noise, rejects perturbations
 - ▶ Positive feedback: Enhances sensitivity
 - ▶ Redundancy
 - ▶ Multiple components with equivalent functions, alternate pathways
 - ▶ Structural stability
 - ▶ Intrinsic mechanisms that promote stability
 - ▶ Modularity
 - ▶ Sub-systems are physically or functionally isolated
 - ▶ Failure in one module does not spread to other parts

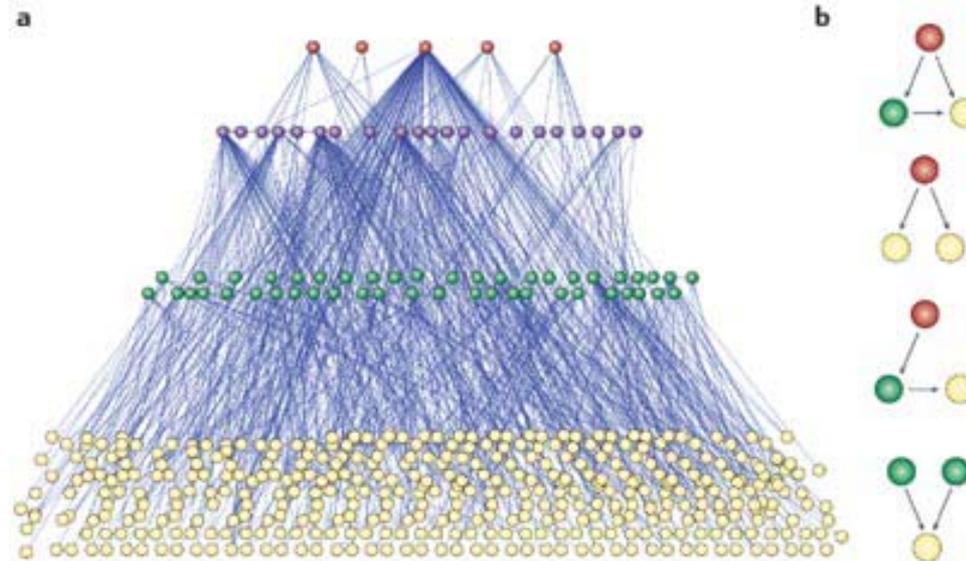
Modularity

- ▶ A module is a functional unit, a collection of parts that interact together to perform a distinct function
 - ▶ Inputs: signals that influence a module
 - ▶ Outputs: signals that are produced by a module



Modularity

- ▶ Contributes to robustness
- ▶ Contributes to development and evolution
 - ▶ Just multiply, rewire, revert a module
- ▶ Hierarchical modularity
 - ▶ Modules of modules of modules...



Omics of Systems Biology



Central Dogma Revisited

replication



genome

transcriptome

proteome

<http://www.informatik.uni-rostock.de/~lin/GC/Slides/Wolkenhauer.pdf>

'Omes and 'Omics

- ▶ ...'ome: the complete set of ...
 - ▶ Genome: genes
 - ▶ Transcriptome: mRNA (used to measure the state of a cell in terms of gene expression)
 - ▶ Proteome: proteins
 - ▶ Interactome: molecular interactions
 - ▶ Metabolome: chemicals involved in metabolic reactions
- ▶ ...'omics': the study of...
- ▶ High-throughput methods
 - ▶ The same experiment is performed on many different molecules (genes, proteins, etc.) in a (partially) automated way
 - ▶ Make 'omics possible

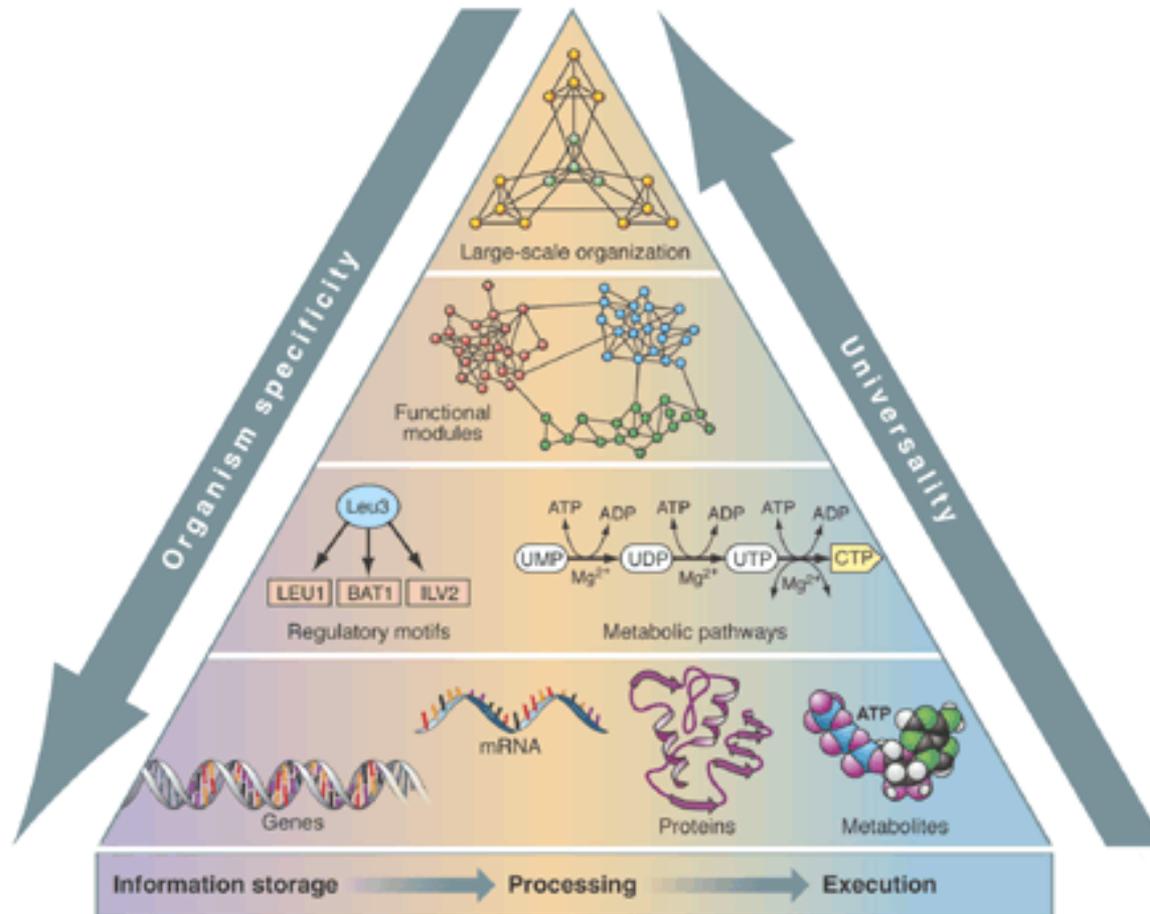
Layers of Organization

- ▶ **Genome**
 - ▶ Long term information storage
- ▶ **Transcriptome**
 - ▶ Retrieval of information
- ▶ **Proteome**
 - ▶ Short term information storage
- ▶ **Interactome**
 - ▶ Execution
- ▶ **Metabolome**
 - ▶ State
- ▶ Analogies with computer hard/software?

Levels of Complexity



Life's Complexity Pyramid

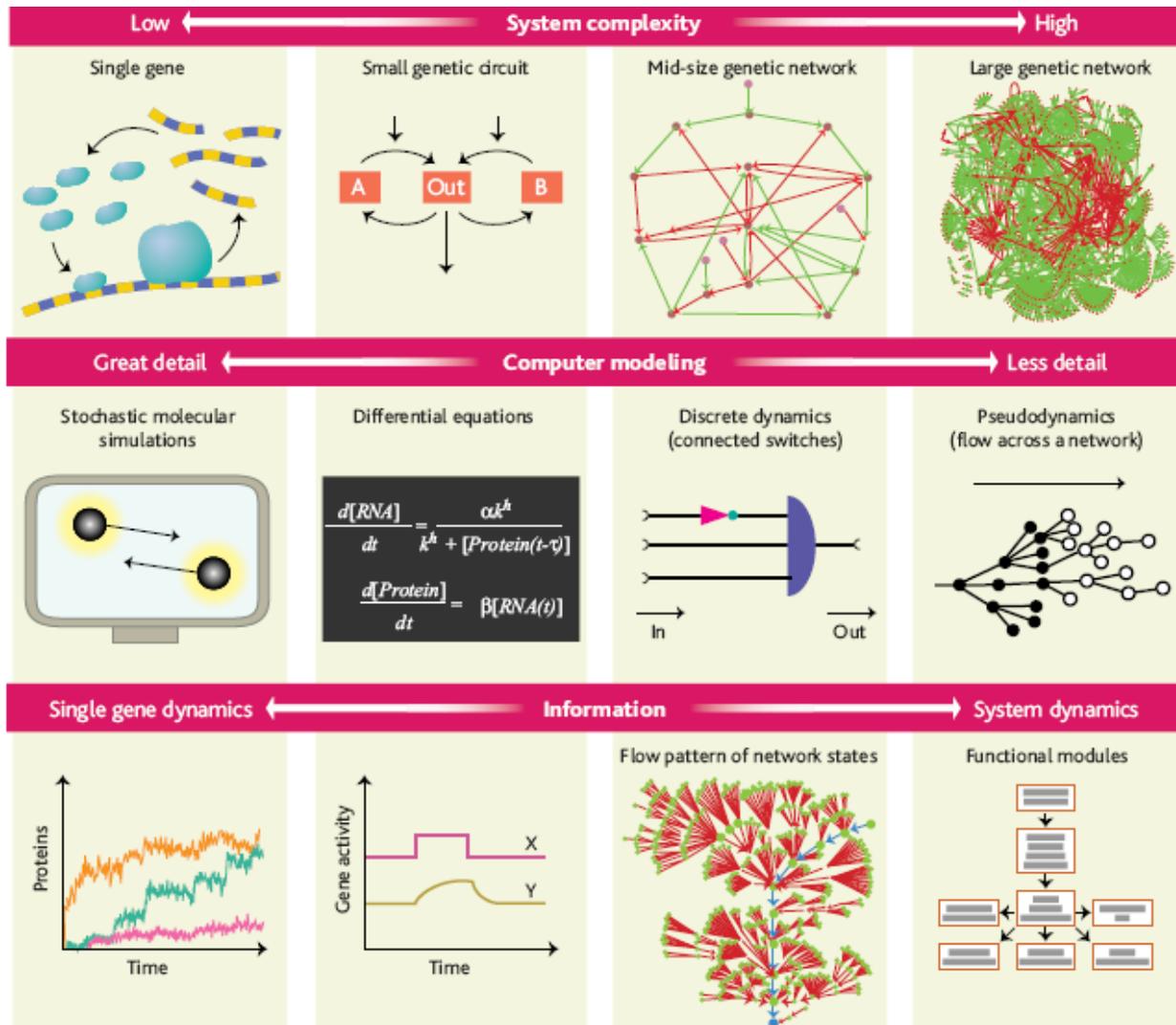


Oltvai & Barabasi, *Science*, 2002

Specificity vs. Universality

- ▶ Tendency toward universal as levels coarsen
 - ▶ Genes, metabolites, proteins are unique to organism
 - ▶ 43 organisms, for which metabolic information is available, share only about 4% of their metabolites
 - ▶ Key metabolic pathways are more frequently shared
- ▶ Higher degree of universality at module level?
 - ▶ Properties appear to be
 - ▶ Scale-free, hierarchical nature of wiring
 - ▶ Coherent regulatory motifs are common
 - ▶ Results on identified “modules” also demonstrate significant conservation
 - ▶ Still a lot to explore on modular conservation

Model Resolution



Bornholdt,
Science, 2005

System Complexity

- ▶ Different models, different abstraction, different information, different computational needs
 - ▶ Boolean networks
 - ▶ General (thousands of genes)
 - ▶ Irrelevant to a particular system
 - ▶ Simple model
 - ▶ Flux networks
 - ▶ Specific (a few genes)
 - ▶ Relevant only to a particular system
 - ▶ Complex model

Level of Detail

- ▶ **Trade off: Less is more**
 - ▶ Less low level detail enables understanding at a larger scale
 - ▶ Computational limitations
 - ▶ Availability of data is an important consideration (e.g., gene expression provides correlation, what about causality?)
- ▶ **What level of detail do we need?**
 - ▶ The trajectory of segment polarity network in *Drosophila* was predicted solely on the basis of discrete binary modeled genes (Albert et al., *J.Theo. Biol.*, 2003)
 - ▶ A dynamic binary model of yeast cell cycle genetic network was constructed (Li et al., *PNAS*, 2004)

Comprehensiveness of Data

1. Factor comprehensiveness

- ▶ Number of components that can be inspected at a time
- ▶ How many mRNA transcripts in an assay?

2. Time-line comprehensiveness

- ▶ Time frame within which measurements are made
- ▶ Longitude, resolution
- ▶ Correlation vs causality

3. Item comprehensiveness

- ▶ Simultaneous measurement of multiple items
- ▶ mRNA & protein concentrations, phosphorylation, localization

Studying Systems Biology



What Systems Biology Offers

- ▶ **How genotype determines phenotype**
 - ▶ Genes (and regulatory elements) have combinatorial effect on phenotype
 - ▶ Transcription factors combinatorially determine which genes are expressed
 - ▶ What determines the state of the cell?
 - ▶ What makes a difference during development?
 - ▶ Regulation, cooperation, redundancy
- ▶ **Drug design**
 - ▶ A ligand might influence multiple factors
 - ▶ A multiple drug system may guide a malfunctioning system to desired state with minimal *effects*

Challenges

- ▶ **Data quality and standardization**
 - ▶ Incompleteness
 - ▶ Not standardized or properly annotated
 - ▶ Quality is uncertain
- ▶ **How do we use available data?**
 - ▶ Hypotheses?
 - ▶ Iterative refinement
- ▶ **Technology**
 - ▶ Limited “comprehensiveness”
 - ▶ We cannot measure many things, so we have to make inference
 - ▶ Transient interactions

Challenges

- ▶ **Data Integration**
 - ▶ How do different sources of data relate?
 - ▶ Interactions
 - ▶ Two-hybrid
 - ▶ Co-expression
 - ▶ Phylogenetic profiling
 - ▶ Linkage
 - ▶ What is an interaction?