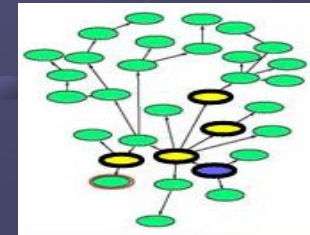
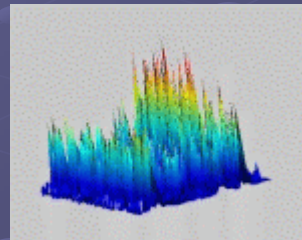


# 6.092/HST.480

## Bioinformatics & Proteomics: An Engineering-Based Problem Solving Approach



***Gil Alterovitz<sup>1</sup>, Manolis Kellis<sup>2</sup>, Marco Ramoni<sup>1</sup>***

*<sup>1</sup> Harvard/MIT Division of Health Science and Technology (HST)*

*<sup>2</sup> Electrical Engineering & Computer Science, MIT*



Harvard-MIT  
Division of Health  
Science & Technology

# Today

## ● Introduction- Gil Alterovitz

- Motivation: Why Bioinformatics?
- Course Introduction
- Introduction to Modern Biology: Part I

## ● Bioinformatics from Industry's Perspective: Mathworks- Rob Henson

- Bioinformatics in Industry
- Matlab Bioinformatics Toolbox
- Clustering and Related Technologies (DeRisi's Microarray Paper)





# Motivation: Why Bioinformatics?

# Why Engineering and Computer Science?

Robotics/Automation: For lab automation, hypothesis testing and generation

## nature

**Functional genomic hypothesis generation and experimentation by a robot scientist**

Ross D. King<sup>1</sup>, Kenneth E. Whelan<sup>1</sup>, Ffion M. Jones<sup>1</sup>, Philip G. K. Reiser<sup>1</sup>, Christopher H. Bryant<sup>2</sup>, Stephen H. Nuggleton<sup>3</sup>, Douglas B. Kell<sup>4</sup> & Stephen G. Oliver<sup>5</sup>

Visualization/Image Processing: Protein Expression 3-D Heat Map

## ARTIFICIAL INTELLIGENCE IN MEDICINE

Data mining techniques for cancer detection using serum proteomic profiling

Lihua Li<sup>a,\*</sup>, Hong Tang<sup>a</sup>, Zuobao Wu<sup>a</sup>, Jianli Gong<sup>a</sup>, Michael Gruidl<sup>b</sup>, Jun Zou<sup>b</sup>, Melvyn Tockman<sup>b</sup>, Robert A. Clark<sup>a</sup>

Network Theory: Modeling Protein Interaction

## Science

**A Map of the Interactome Network of the Metazoan *C. elegans***

Sining Li,<sup>1\*</sup> Christopher M. Armstrong,<sup>1\*</sup> Nicolas Berth,<sup>1\*</sup> Hui Ge,<sup>1\*</sup> Sbart Mikstein,<sup>1\*</sup> Mike Boxem,<sup>1\*</sup> Pierre-Olivier Vidalain,<sup>1\*</sup> Jing-Dong J. Han,<sup>1\*</sup> Alban Chesneau,<sup>1,2\*</sup> Tong Hao,<sup>1</sup> Dabra S. Goldberg,<sup>2</sup> Ning Li,<sup>1</sup> Monica Marthoz,<sup>1</sup> Jean-François Rual,<sup>1,4</sup> Philippe Lamasch,<sup>1,4</sup> Lili Xu,<sup>1,7</sup> Munesh Tewari,<sup>1</sup> Sheryl L. Wong,<sup>1</sup> Lin V. Zhang,<sup>2</sup> Gabriel F. Berriz,<sup>2</sup> Laurent Jacotot,<sup>1,2</sup> Philippe Vaglio,<sup>1,2</sup> Jérôme Rabouat,<sup>1,3</sup> Tomoko Hirozane-Kishikawa,<sup>1</sup> Qianru Li,<sup>1</sup> Harrison W. Gabal,<sup>1</sup> Ahmed Elwa,<sup>1</sup> Bridget Baumgartner,<sup>2</sup> Dabra J. Rosa,<sup>6</sup> Halyuan Yu,<sup>7</sup> Stephanie Bosak,<sup>8</sup> Reynaldo Sequerra,<sup>8</sup> Andrew Fraser,<sup>9</sup> Susan E. Mango,<sup>10</sup> William M. Saxton,<sup>6</sup> Susan Strömberg,<sup>6</sup> Sander van den Heuvel,<sup>11</sup> Fabio Piano,<sup>1,2</sup> Jean Vanderschueren,<sup>4</sup> Claude Sarda,<sup>2</sup> Mark Gerstein,<sup>7</sup> Lynn Doucette-Stamm,<sup>6</sup> Kristin C. Gunsalus,<sup>12</sup> J. Wade Harper,<sup>2</sup> Michael E. Cusick,<sup>1</sup> Frederick P. Roth,<sup>2</sup> David E. Hill,<sup>1,8</sup> Marc Vidal<sup>1,9</sup>

New Mass Spectrometry Technologies With Clinical Applications

## Annals of Surgical Oncology

**Surface-Enhanced Laser Desorption/Ionization Time-of-Flight (SELDI-TOF) Differentiation of Serum Protein Profiles of BRCA-1 and Sporadic Breast Cancer**

Stephen Becker, MD, Lisa H. Cazares, Patrice Watson, PhD, Henry Lynch, MD, O John Semmes, PhD, Richard R. Drake, PhD and Christine Laronga, MD

# Signal Processing in Biology

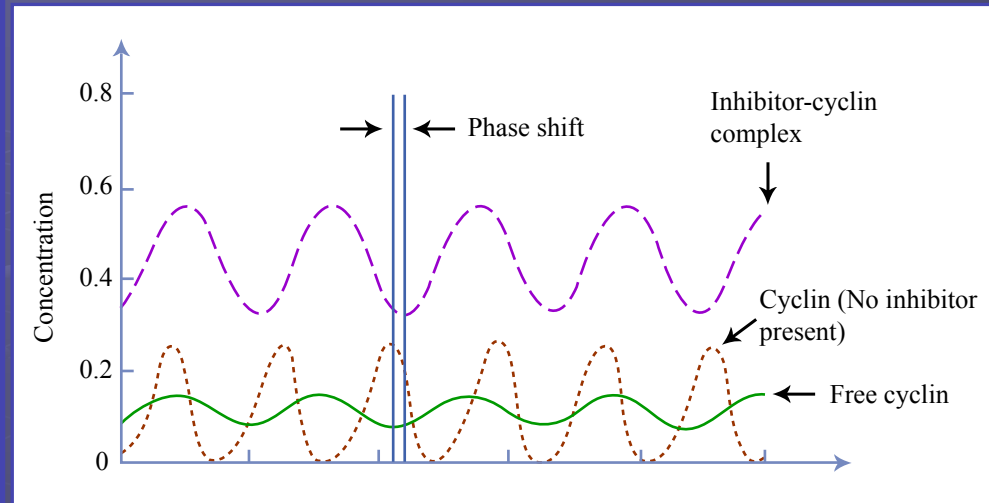
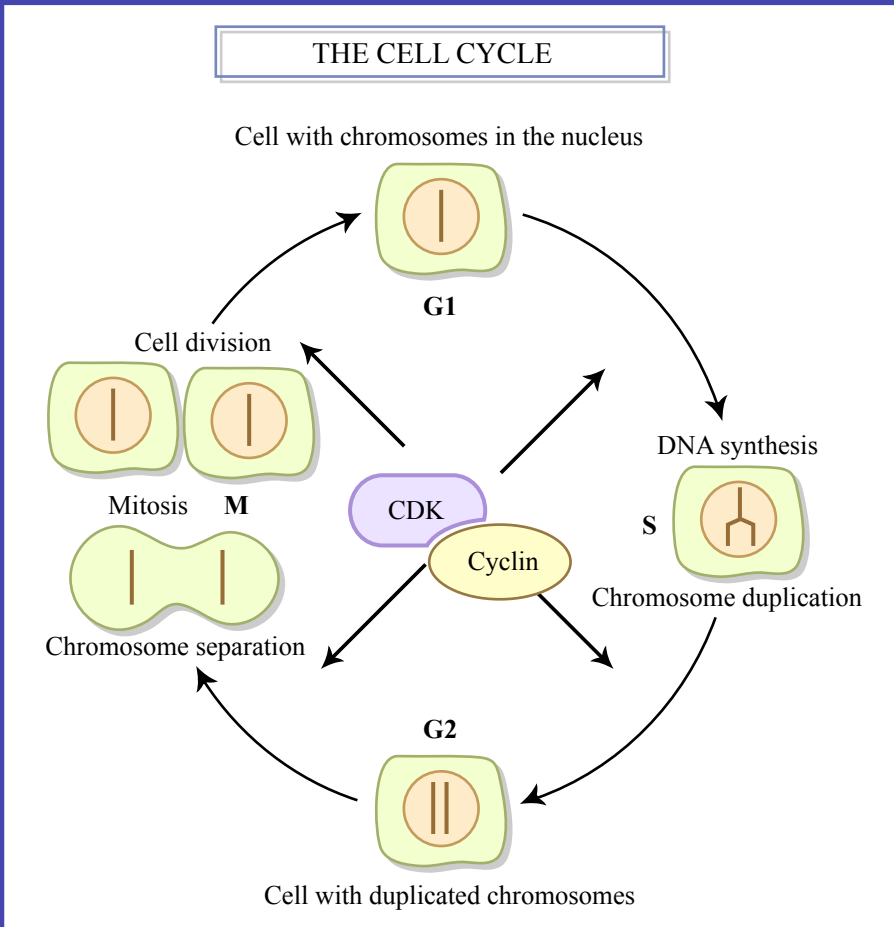


Figure by MIT OCW

Model:

$$\begin{aligned} \dot{C} &= v_i - k_1 \frac{XC}{C + K_5} - k_d C, \\ \dot{M} &= \frac{V_1(1 - M)}{(1 - M) + K_1} - \frac{V_2 M}{M + K_2}, \\ \dot{X} &= \frac{V_3(1 - X)}{(1 - X) + K_3} - \frac{V_4 X}{X + K_4}, \\ V_1 &= \frac{C}{C + K_6} V_1', \quad V_3 = M V_3', \end{aligned}$$

Figure by MIT OCW

Gardner, T. S., Dolnik, M. & Collins, J. J. A theory for controlling cell cycle dynamics using a reversibly binding inhibitor. *Proc Natl Acad Sci* **95**, 14190-5 (1998).





# Course Introduction

# Signal Processing in Bioinformatics

Genes

*arp7*: Component of global transcriptional activator complex (Cytoskeleton)

*chs2*: Chitin synthase II (Cell wall biogenesis)

$r = 0.61$

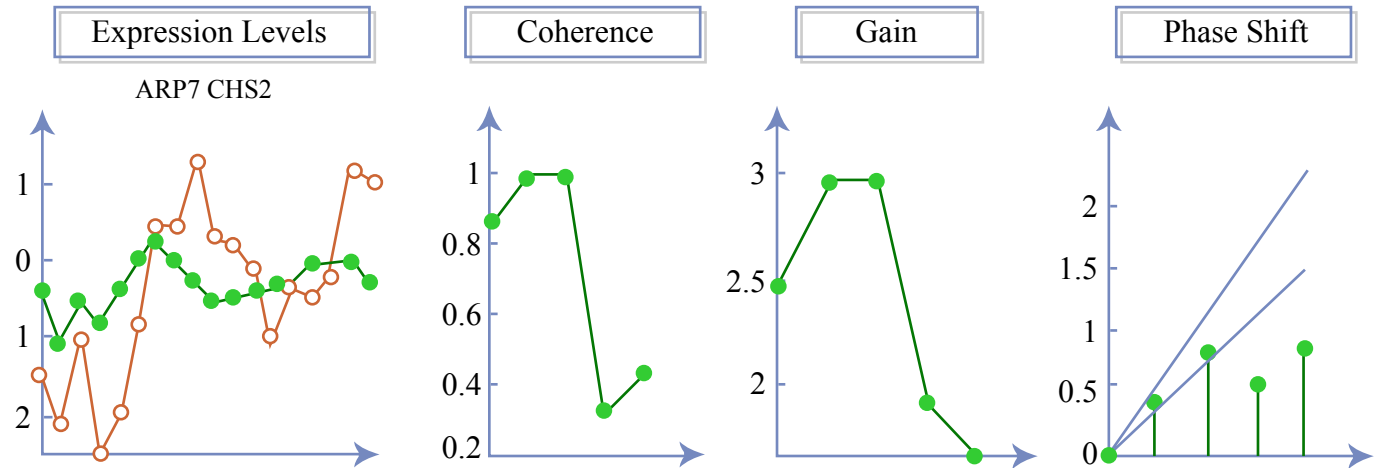
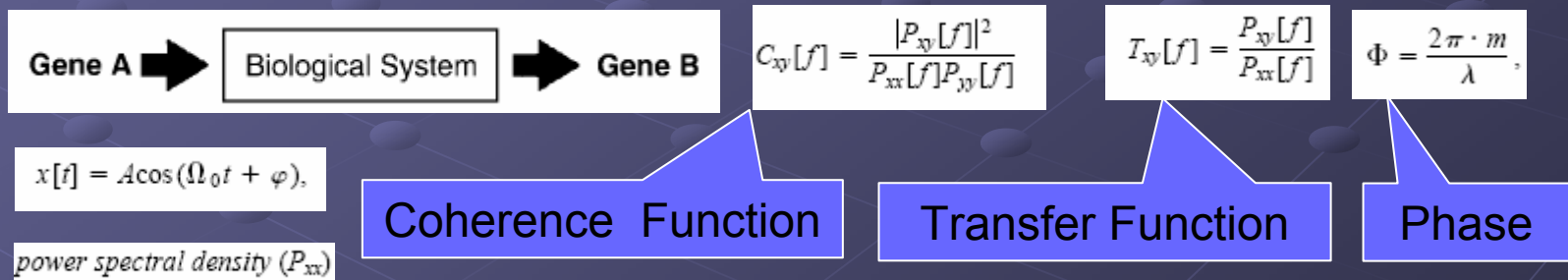


Figure by MIT OCW



Butte, A. J., Bao, L., Reis, B. Y., Watkins, T. W. & Kohane, I. S. Comparing the similarity of time-series gene expression using signal processing metrics. *J Biomed Inform* 34, 396-405 (2001).





# Instructors

## ● **Gil Alterovitz**

- HST Medical Engineering Medical Physics-Electrical Engineering and Computer Science, Graduate Student/Whitaker Fellow.
- Proteomics & Computational Biology, Introductory Material

## ● **Robert Berwick**

- Professor, Electrical Engineering and Computer Science, MIT
- Language/Sequence Analysis

## ● **Rob Henson**

- Director of Bioinformatics Group, Mathworks (Matlab).
- Mathematics and Signal Processing, Industrial Experience

## ● **Manolis Kellis**

- Assistant Professor, Electrical Engineering and Computer Science, MIT
- Sequence Analysis

## ● **Nanguneri Nirmala**

- Functional Genomics Group, Novartis Institutes for BioMedical Research
- Expression Analysis, Industrial Experience

## ● **Marco F. Ramoni**

- Assistant Professor of Pediatrics and Medicine, Harvard Medical School
- Expression Analysis, Bayesian Networks

## ● **Paola Sebastiani**

- Associate Professor, Department of Biostatistics, Boston University
- Statistical Methodologies and Bioinformatics





# Organization: Levels of Abstraction

- Part I: Sequence
- Part II: Expression
- Part III: Proteomics
- Part IV: Systems/Misc.

# Part I / II

- Tue, January 4, 2005, 11:00am-11:45pm
  - Review of Modern Biology- Gil Alterovitz
- Tue, January 4, 2005, 11:45am-12:30pm
  - Introduction to Bioinformatics Laboratory / Bioinformatics in the Computer Industry- Rob Henson / Gil Alterovitz
- Thurs, January 6, 2005, 11:00am-11:45pm
  - Review of Modern Biology II- Gil Alterovitz
- Thurs, January 6, 2005, 11:45am-12:30pm
  - Sequence Analysis: Motif and Regulation- Manolis Kellis
- Tue, January 11, 2005, 11:00am-11:45pm
  - Sequence Analysis: Genes and Genome- Manolis Kellis
- Tue, January 11, 2005, 11:45am-12:30pm
  - Sequence Analysis: Gene Evolution- Manolis Kellis and Robert Berwick
- Thurs, January 13, 2005, 11:00am-11:45pm
  - Microarray Expression Data Analysis- Marco Ramoni
- Thurs, January 13, 2005, 11:45am-12:30pm
  - Machine Learning: Bayesian Methodologies- Marco Ramoni



# Part IV / III

- Tue, January 18, 2005, 11:00am-12:00pm
  - Bioinformatics in the Biotech Industry- Nanguneri Nirmala
- Tue, January 18, 2005, 12:00am-12:30pm
  - Control and Feedback in Systems- Gil Alterovitz
- Thurs, January 20, 2005, 11:00am-11:45pm
  - Scale-free Networks I- Paola Sebastiani
- Thurs, January 20, 2005, 11:45am-12:30pm
  - Scale-free Networks II- Paola Sebastiani
- Tue, January 25, 2005, 11:00am-11:45pm
  - Statistical Models and Stochastic Processes in Proteomics- Gil Alterovitz
- Tue, January 25, 2005, 11:45am-12:30pm
  - Signal Processing for Proteomics – Gil Alterovitz
- Thurs, January 27, 2005, 11:00am-12:00pm
  - Biological Methods, Automation, Robotics- Gil Alterovitz
- Thurs, January 27, 2005, 12:00pm-12:30pm
  - Project Discussion and Wrap-up- Gil Alterovitz

Parts III/IV switched to accommodate speakers.



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# Class Information

● **Date:** Winter 2005

● **Credits/Hours:**

- *Four weeks:* TR, 11:00 am-12:30 pm  
*Total hours:* 12 scheduled + estimated 28 outside = 40  
*Weekly load:* 3 scheduled + estimated 7 outside = 10
- *Units:* 3 credits (1-0-2), U
- *Audience:* upper undergraduate/graduate.

● **Student Prerequisites:**

- 7.012 or equivalent recommended
- 6.003 or equivalent recommended
- 6.041 or equivalent recommended

● **Grades:**

- P/D/F

● **Time/Location:**

- Lecture TR, 11a-12:30p
- Lab (optional), 9a-~10:40a (cluster of dual-processor, dual LCD panel Windows-based machines with Matlab pre-installed).



# Resources

## ● Book chapter:

- G. Alterovitz, E. Afkhami, and M. Ramoni, "Robotics, Automation, and Statistical Learning for Proteomics," in *Focus on Robotics and Intelligent Systems Research*, vol. 1, F. Columbus, Ed. New York: Nova Science Publishers, Inc., 2005 (In press).

## ● Reference texts:

- A. V. Oppenheim, A. S. Willsky, and H. Nawab, *Signals and Systems*, 3rd ed. Englewood Cliffs, NJ: Prentice Hall, 1997.
- A. Papoulis and S. U. Pillai, *Probability, Random Variables and Stochastic Processes*. New York, NY: McGraw-Hill, 2002.
- I. S. Kohane, A. T. Kho, and A. J. Butte, *Microarrays for an Integrative Genomics*. Cambridge, MA: MIT Press, 2002.

## ● Other:

- 17 other papers/resources (*Nature*, *PNAS*, *Machine Learning*, *Bioinformatics*, *Physical Review E*, etc.)





# Academic Information

## Labs/Homework

- 3 Labs (homeworks)
- Final Project- Student selected based on one of the four areas.

## Grading

- Labs
  - 40%
- Final Project
  - 50%
- Participation
  - 10%





# Miscellaneous

- Fill out background sheet and turn them in at the front.



# Modern Biology in Two Lectures (Part I Today)

# Genes to Proteins



## DNA: "Lifetime Plan"

5' ATCTACAGATCAGCTACGACGCGACGAT  
TTAGCAGCAGCGACGCGACAGCAGCTAGTG  
ACGATAGCACATAGTTAGCACAGAGCAGAC  
ACAGACAGCACAGCGACAGCGACGACG-3'

## mRNA: "Task List"

5' AUCUACAGAUCAGCUACGACGCGACGAU  
UUAGCAGCAGCGACGCGACAGCAGCUAGUG  
ACGAUAGCACAUAGUUAGCACAGAGCAGAC  
ACAGACAGCACAGCGACAGCGACGACG-3'

## Protein: Machines

MWTRFDSALPRSTPSTAKLVMPOILLLEE  
EDTYESAQYKTWLMVCSDETTTE

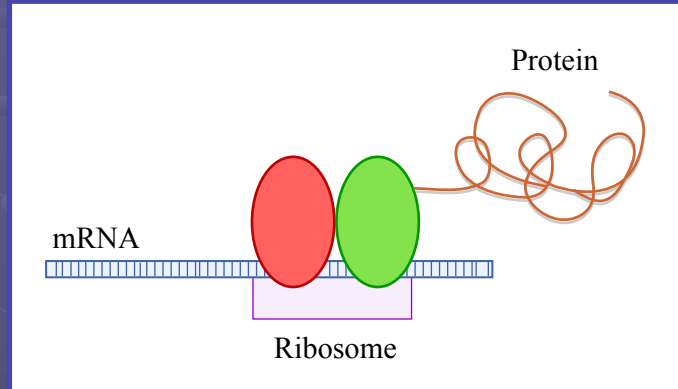


Figure by MIT OCW

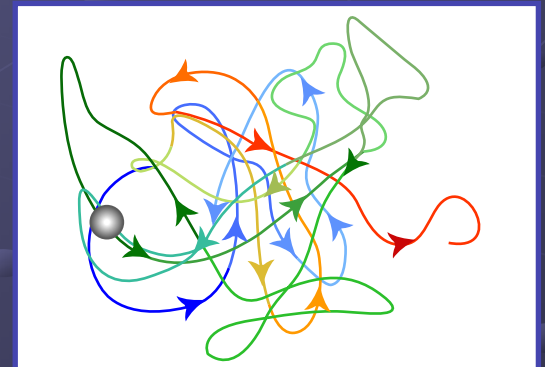


Figure by MIT OCW

DNA Sequencing

Relative Expression Levels

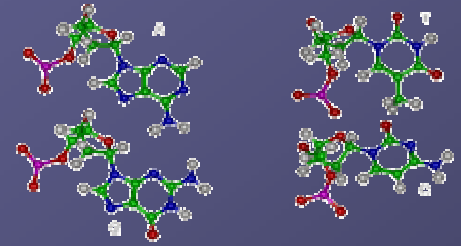
Identification  
Post translation modification  
Splicing variants  
Relative expression levels

Source: HPCGG



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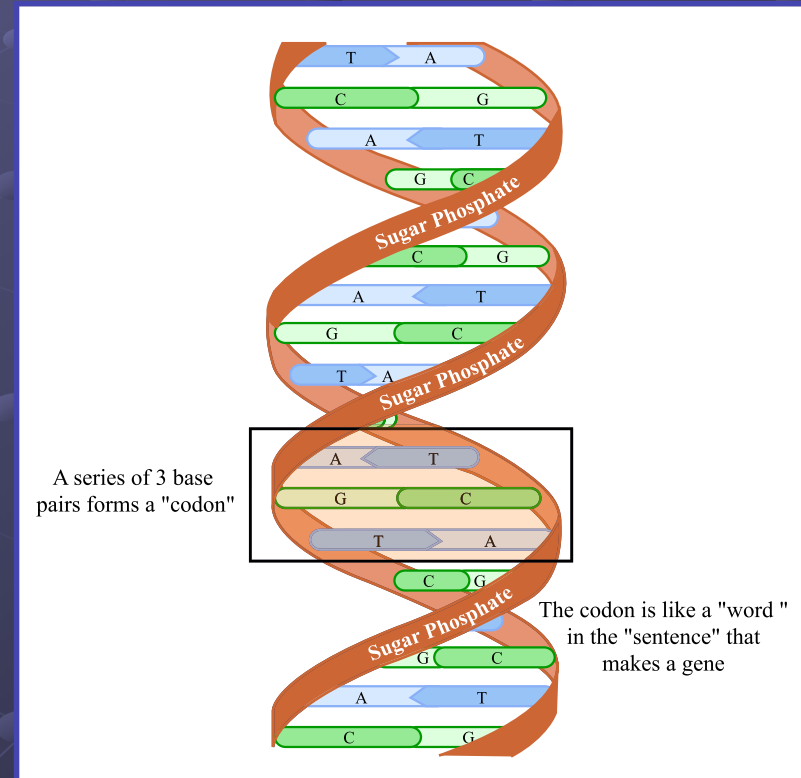
# Transcription



## DNA→RNA

- G=Guanine
- C=Cytosine
- A=Adenine,
- T=Thymine (DNA only)
- U=Uracil (RNA only).
- (DNA) T → U (RNA)
  
- DNA, RNA= sequence of nucleotide bases
- “Parity Bit” Analogy
  - Redundant information in second strand for error correction.

Atom	Color
Oxygen	Red
Nitrogen	Blue
Carbon	Green
Phosphorus	Magenta
Sulfur	Yellow
Hydrogen	Grey



DNA = deoxyribonucleic acid

RNA = ribonucleic acid

Figure by MIT OCW

# Translation

		SECOND BASE							
		U	C	A	G				
FIRST BASE	U	UUU } Phenyl- UUC } alanine UUA } Leucine UUG }	UCU } Serine UCC } UCA } UCG }	UAU } Tyrosine UAC } UAA } Stop codon UAG } Stop codon	UGU } Cysteine UGC } UGA } Stop codon UGG } Tryptophan	U	C	A	G
	C	CUU } Leucine CUC } CUA } CUG }	CCU } Proline CCC } CCA } CCG }	CAU } Histidine CAC } CAA } Glutamine CAG }	CGU } Arginine CGC } CGA } CCG }	U	C	A	G
	A	AUU } Isoleucine AUC } AUA } AUG } Methionine start codon	ACU } Threonine ACC } ACA } ACG }	AAU } Asparagine AAC } AAA } Lysine AAG }	AGU } Serine AGC } AGA } Arginine AGG }	U	C	A	G
	G	GUU } Valine GUC } GUA } GUG }	GCU } Alanine GCC } GCA } GCG }	GAU } Aspartic acid GAC } GAA } Glutamic acid GAG }	GGU } Glycine GGC } GGA } GGG }	U	C	A	G

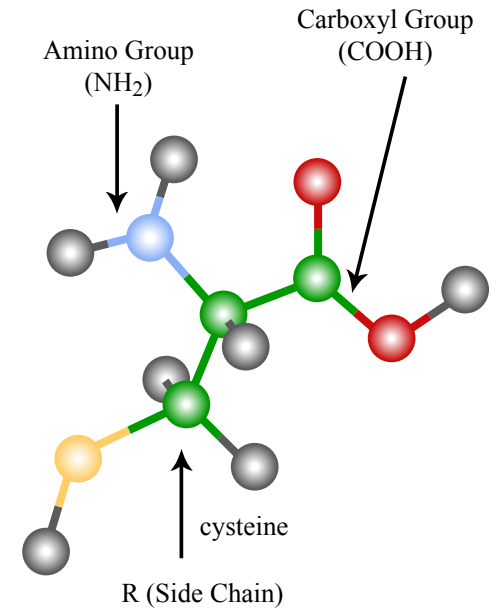


Figure by MIT OCW

RNA → Protein  
 Protein = Sequence of Amino Acids

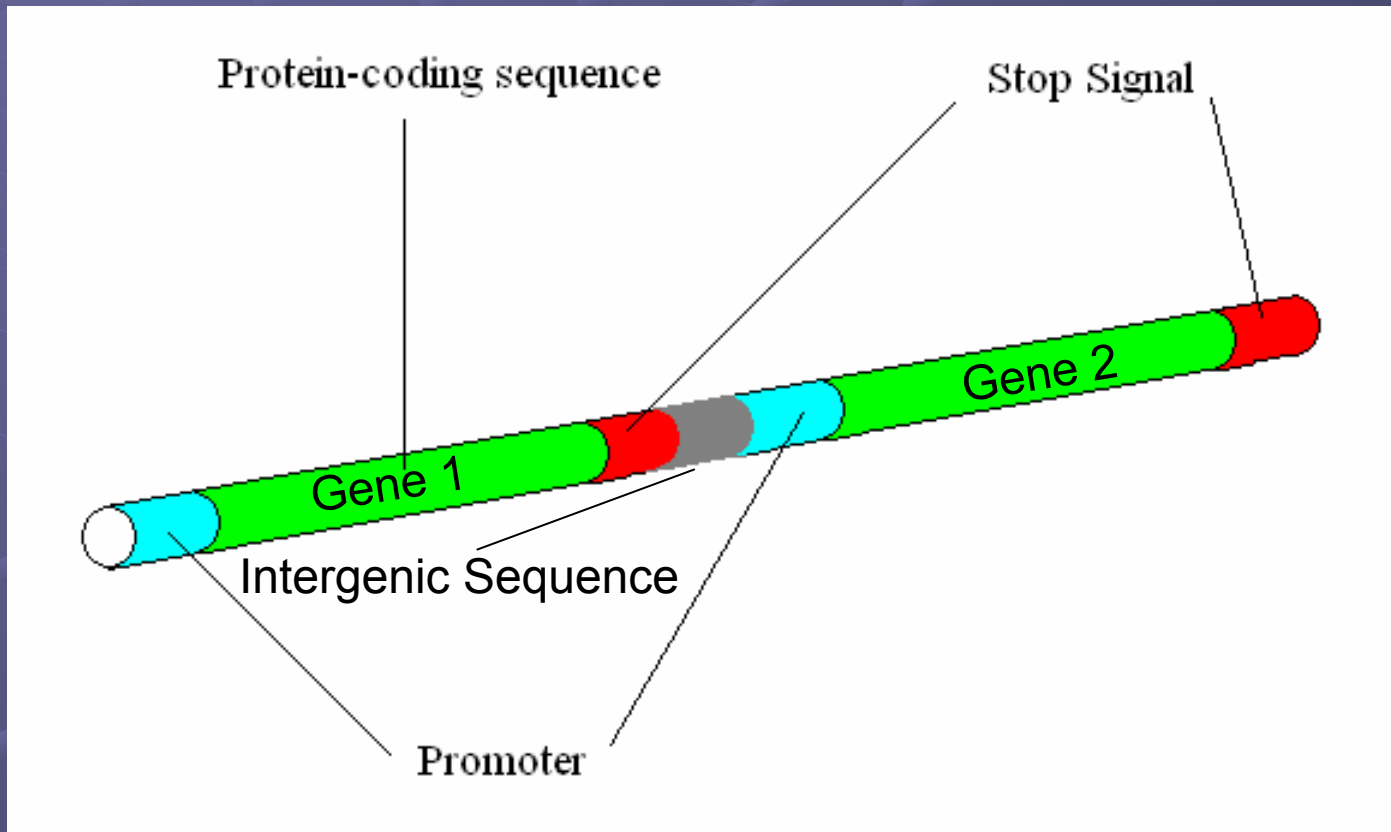
Name	Symbol	Mass (-H <sub>2</sub> O)	Side Chain	Occurrence (%)
<a href="#"><u>Alanine</u></a>	A, Ala	71.079	CH <sub>3</sub> -	7.49
<a href="#"><u>Arginine</u></a>	R, Arg	156.188	HN=C(NH <sub>2</sub> )-NH-(CH <sub>2</sub> ) <sub>3</sub> -	5.22
<a href="#"><u>Asparagine</u></a>	N, Asn	114.104	H <sub>2</sub> N-CO-CH <sub>2</sub> -	4.53
<a href="#"><u>Aspartic acid</u></a>	D, Asp	115.089	HOOC-CH <sub>2</sub> -	5.22
<a href="#"><u>Cysteine</u></a>	C, Cys	103.145	HS-CH <sub>2</sub> -	1.82
<a href="#"><u>Glutamine</u></a>	Q, Gln	128.131	H <sub>2</sub> N-CO- (CH <sub>2</sub> ) <sub>2</sub> -	4.11
<a href="#"><u>Glutamic acid</u></a>	E, Glu	129.116	HOOC-(CH <sub>2</sub> ) <sub>2</sub> -	6.26
<a href="#"><u>Glycine</u></a>	G, Gly	57.052	H-	7.10
<a href="#"><u>Histidine</u></a>	H, His	137.141	N=CH-NH-CH=C-CH <sub>2</sub> -   	2.23
<a href="#"><u>Isoleucine</u></a>	I, Ile	113.160	CH <sub>3</sub> -CH <sub>2</sub> -CH(CH <sub>3</sub> )-	5.45
<a href="#"><u>Leucine</u></a>	L, Leu	113.160	(CH <sub>3</sub> ) <sub>2</sub> -CH-CH <sub>2</sub> -	9.06
<a href="#"><u>Lysine</u></a>	K, Lys	128.17	H <sub>2</sub> N-(CH <sub>2</sub> ) <sub>4</sub> -	5.82
<a href="#"><u>Methionine</u></a>	M, Met	131.199	CH <sub>3</sub> -S-(CH <sub>2</sub> ) <sub>2</sub> -	2.27
...				

20 amino acids in total.

Letters- compared to DNA/RNA



# Genes



Communication analogy: start, message, stop.

Source: Ehsan Afkhami



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[Slide not shown]

## Rob Henson

- Rob Henson comes to us from Mathworks-creators of Matlab software. Rob studied Mathematics at Cambridge University. He spent 7 years in Japan working in the software industry before coming to the US. At Mathworks, he leads the bioinformatics group- which released the newest version of their bioinformatics toolbox a couple months ago. It is my great pleasure to introduce Rob- who will be talking about clustering technologies in bioinformatics and his perspective from industry. Thank you for coming today.



[Rob Henson's lecture (will be posted when available)]

## Outline

- Bioinformatics from Industry's Perspective:  
Mathworks- Rob Henson
  - Bioinformatics in Industry
  - Matlab Bioinformatics Toolbox
  - Clustering and Related Technologies  
(DeRisi's Microarray Paper)



# Modern Biology in Two Lectures (Part II Thurs)

Splicing, Alternative Splicing, Post-Translational Modifications, and Bioinformatics Tools and Databases