



# Algorithms in Bioinformatics

## 生物信息学算法原理

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Fall 2014

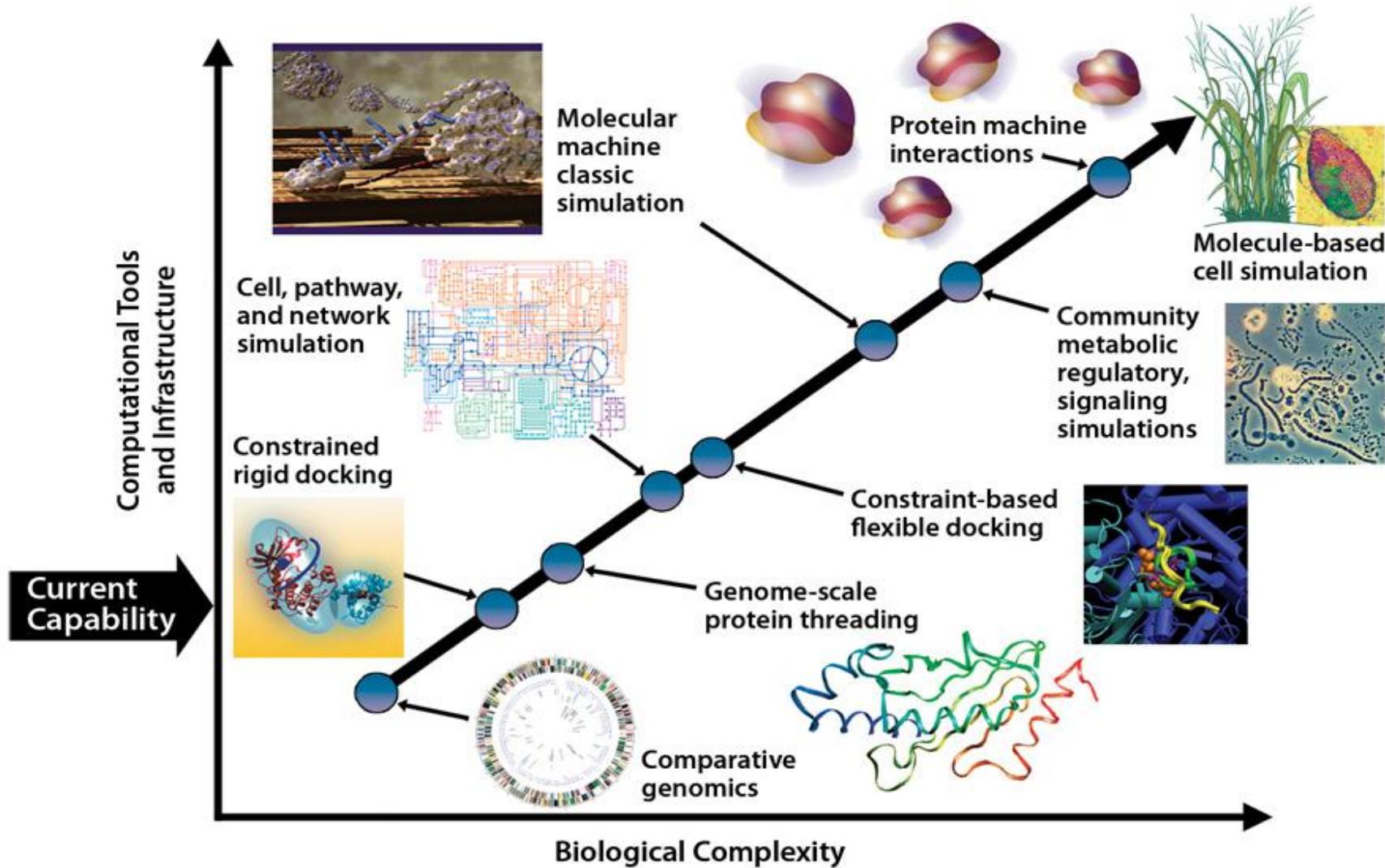


# Contents

- ➊ What is Bioinformatics
- ➋ What is an algorithm
- ➌ Why we need algorithm
- ➍ Course information
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# A Big Picture of Biology

*“Biology is an information science”* -- Leroy Hood



# Bioinformatics

- The science of collecting and analyzing complex biological data such as genetic codes.  
-- Oxford Dictionary

## • Major research areas

- Sequence analysis
- Genome annotation
- Computational evolutionary biology
- Analysis of gene expression, regulation
- Comparative genomics
- Literature analysis
- Biological systems modeling
- Structural Biology

# Algorithm

- ➊ A process or set of rules to be followed in calculations or other problem-solving operations, especially by a computer: *a basic algorithm for division*

--- *Oxford Dictionary*

- ➋ Examples:

- Sorting
- Calculation of Pi
- Task arrangement
- Printing

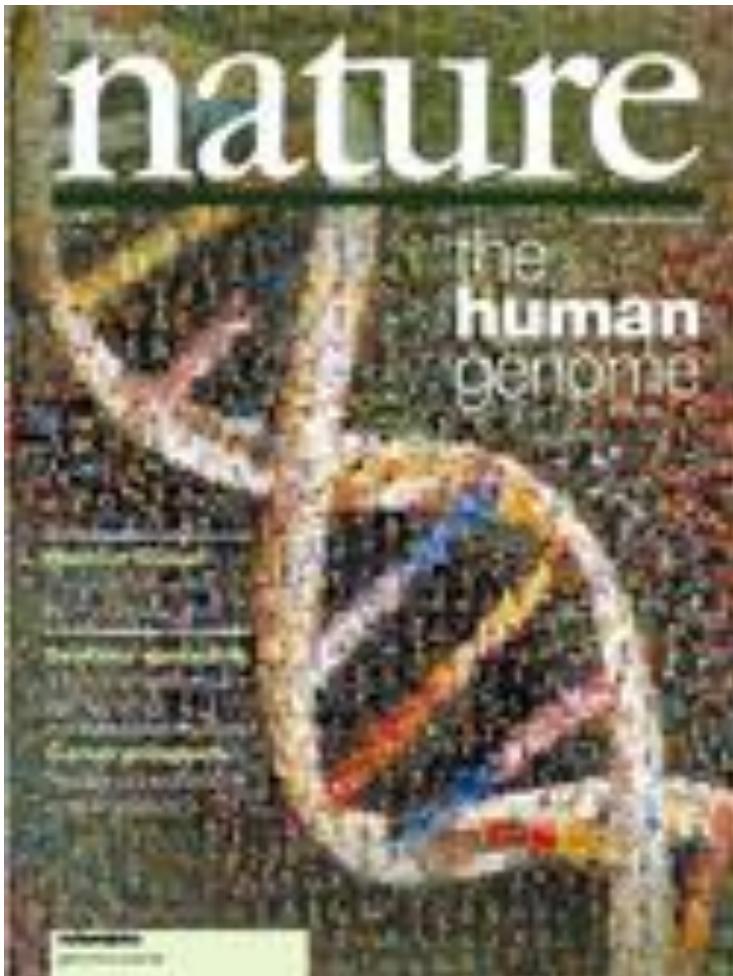
# Why do we need algorithms?

- Lots and lots of data
- Huge computation
- Limited time and space

# Milestone of modern biology: the human genome project



Feb. 15, 2001 *Nature*



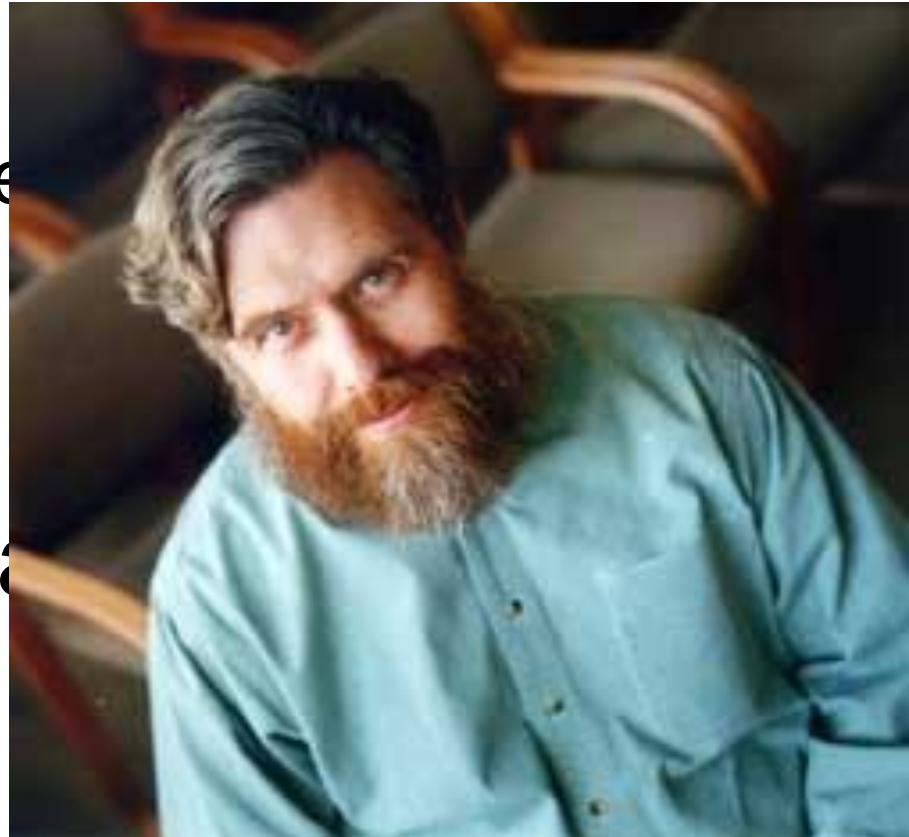
Feb. 16, 2001 *Science*



Human Genome Project  
3 billion dollars, 3 billion re

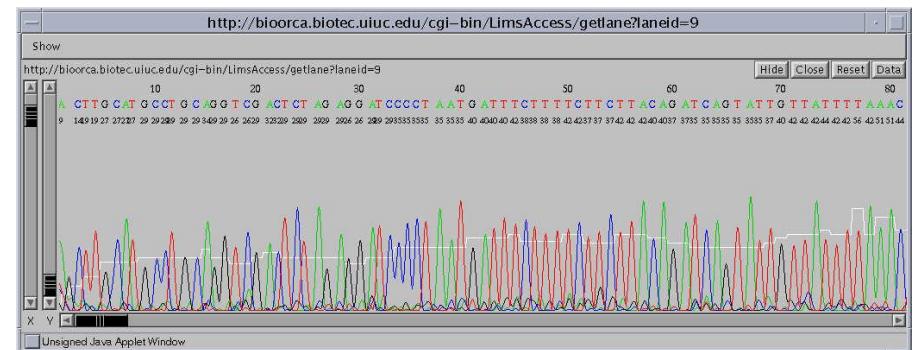
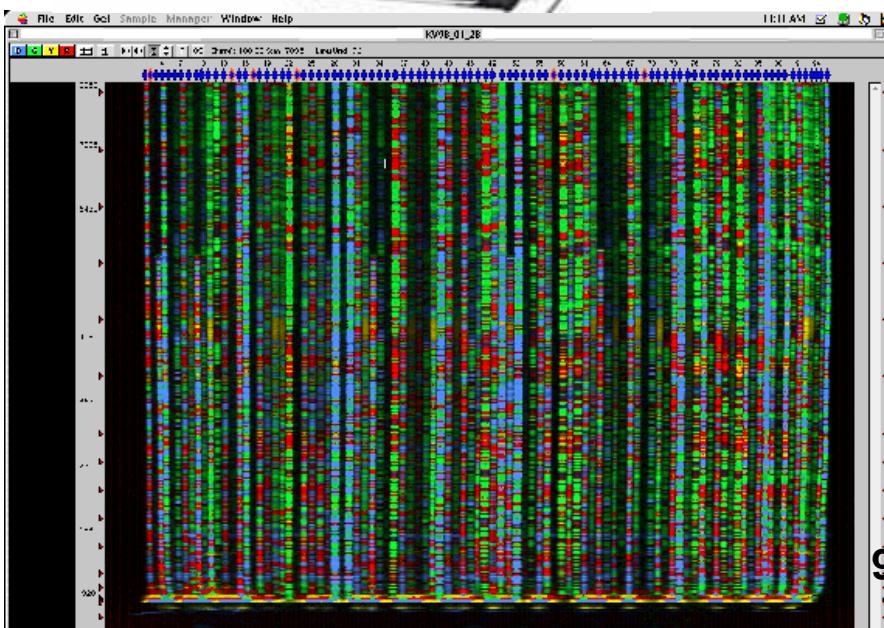


- “This is ...
- a WASTE of time and money....
- We can do a lot better.



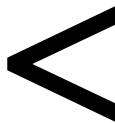
George Church  
Professor of Genetics  
Harvard Medical School

# Automated high throughput sequencing



AGAACGACCATCAACTAAATCAAATGCCTTCAAACCAGCA  
GACAACCCAAAATGCCAAAATGCGGCAAATCCGTATACGCC  
GCNGAAGAAAAAGTAGCTGGAGGATAAAATACCACAAATCC  
TGCTTCAAATGCGGTATGTCAATAAAATGCTGACTCCACC  
AACGTAACTGAACACGAAGCTGAATTGTAATGCAAAATTGC  
CATGGACGTAAATACGGACCTAAGGATACGGATTGGTGGGT  
GGAGCTGGGTGCTTAAGTATGGACGATGGAGGCCAATTCAA  
GGGAACACAATAATTAAAGAAGGAATCAATGTGAAGATGGC  
GGCCAAAACCACACCAACTGTCAGCGGTCGTCAAGTTCTACCC  
TTTCCATCCCCCACTATAACATAATGTAATATTAGATCTT  
AAATTACAGACTTAGTTAATTATAAATTTCGTATGACACG  
TTATAAAATAAGAATTGGTTATTGTAAATAATTGAATTAAATA  
AATCTTATTAAAGACCAAAAAAA

# Next-generation sequencing technology



Sanger method:  
huge lab, numerous machines and staffs

Next-generation:  
one staff, one machine

# 新一代测序技术平台



Applied Biosystems  
ABI 3730XL



Roche / 454  
Genome Sequencer  
FLX



Oxford  
Nanopore  
MinION



Illumina / Solexa  
Genetic Analyzer



Applied Biosystems  
SOLiD



# Comparison of NGSS vs. traditional technology

Platforms	Sanger	454	Solexa	SOLiD
Read Length (bps)	650–1100	150–250	35–150	25–50
Capacity (reads/run)	96	400, 000	200, 000, 000	2, 000, 000, 00
Error Rate	$10^{-3}$	< $10^{-2}$	$\sim 10^{-2}$	$\sim 10^{-2}$
Cost (\$/Mbp)	5000	$\sim 5$	$\sim 0.6$	$\sim 0.2$
Time/run	$\sim 3h$	$\sim 7h$	2–14d	3–14d
Throughput	100Kb	$\sim 1Gb$	$\sim 600Gb$	100–300Gb

# Shanghai NGS Ally (SGA)

Platform	Number	Throughput
454 GS FLX	2	4 Gb/day
Solexa GA IIx	3	1Gb/day
HiSeq 2000	4	100 Gb/day
Solid 4	7	7 Gb/day
HQ	(7)	(128 Gb/day)
合计	16	>110 (220) Gb/day



上海生物芯片有限公司  
生物芯片上海国家工程研究中心



CHGC

国家人类基因组南方研究中心  
National Human Genome Center at Shanghai



上海生物信息技术研究中心  
SHANGHAI CENTER FOR BIOINFORMATION TECHNOLOGY

# Latest sequencing technologies



## Pacific Biosciences

- Human genome: \$100, 15 minutes (2013)



## Complete Genomics

- 10,000 genomes /year (from 2010)



## Ion Torrent



## Oxford Nanopore (2012)



## Visigen



more...

# Personal Genomics

- Craig Venter genome
- James Watson genome
- 2 Koran genomes
- 1 Chinese genome
- 2 cancer genomes
- 1 African genome
- Stephen Quake genome
- Family of Four by Institute of System Biology
- .....

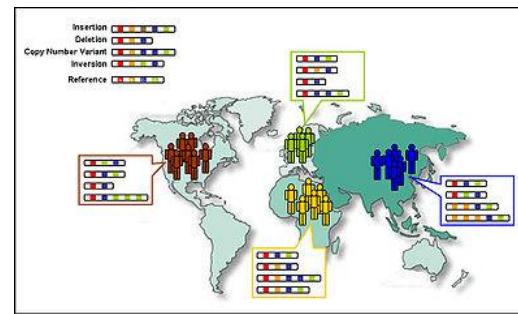


# Latest personal genomics projects

- 1000 Genome Projects (UK, China, US)
- ClinSeq (NHGRI)
- International Cancer Genome Consortium (Canada)
- 23andMe Research Revolution (US)



International  
Cancer Genome  
Consortium



# New ideas, new projects

- ◆ De novo sequencing

- targeted sequencing

- a large number of small genomes

- ◆ SNP discovery

- without reference genomes

- ◆ Transcriptom study

- Unknown Transcriptom

- ◆ Metagenome study

- Microbial genomes in nature

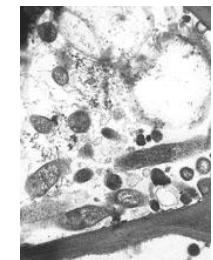
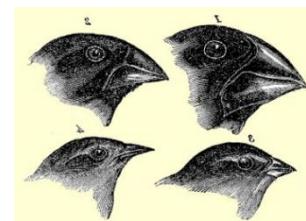
- ◆ Epigentics study

- Regulatory element

- Chip-seq, RNA-seq

- ◆ Other new projects

- High throughput sequence alignment



With so many bioinformation  
data, we need algorithms!

# Goals

- General introduction about algorithms
- Basic knowledge about algorithms in Bioinformatics
- Some practice about Bioinformatics analysis

# Course organization

- Introduction ( Week 1)
- Part I: Algorithms for Sequence Analysis (Week 1 - 11)
  - Chapter 1-3, Models and theories
    - » Probability theory and Statistics (Week 2)
    - » Algorithm complexity analysis (Week 3)
    - » Classic algorithms (Week 4)
    - » Lab: Linux and Perl
  - Chapter 4, Sequence alignment (week 6)
  - Chapter 5, Hidden Markov Models ( week 8)
  - Chapter 6. Multiple sequence alignment (week 10)
  - Chapter 7. Motif finding (week 11)
  - Chapter 8. Sequence binning (week 11)
- Part II: Algorithms for Network Biology (Week 12 - 16)

# Course organization (2)

- Friday (Every Week)
  - Lectures (东中院2-403)
- Wednesday(Even weeks)
  - Lab (生物药楼4号楼-302, 生信实验室)
    - Unix and Perl (Week 2, 4, 6)
    - HMM (week 8, 10)

# Course features

- Subjects
  - Biological sequences ( Genomic, and Proteomic seqs)
  - From reads to whole genomes (peptides to proteomes)
- Topics
  - Algorithms
  - Models
  - Biology
- Theory and Practice:
  - Probability Theory
  - Complexity analysis for algorithms
  - Design and implementation of an HMM-based gene prediction system

# Prerequisites

- Mathematics (a little bit)
  - Calculus
  - Probability Theory
  - Statistics
  - Advanced Algebra
- Computer Science ( a little bit)
  - Programming
- Biology ( a little bit)
  - Molecular Biology

# Text Book

- Biological sequence analysis:  
Probabilistic Models for Proteins and Nucleic Acids, R. Durbin, S. Eddy, A. Krogh, G. Mitchison, Cambridge University Press, 1999

## Biological sequence analysis

Probabilistic models of proteins and nucleic acids

R. Durbin  
S. Eddy  
A. Krogh  
G. Mitchison

# References

- 生物信息学基础, 孙啸, 陆祖宏, 谢建明清华大学出版社, 2004
- Introduction to Algorithms, Thomas Cormen, Charles Leiserson, and Ronald Rivest, The MIT Press.
- Unix and Perl (V.2.3.4) , K. Bradnam & I. Korf, 2009
- An Introduction to Bioinformatics Algorithms  
Neil C. Jones and Pavel A. Pevzner  
中译本: 生物信息学算法导论, 【美】 N.C琼斯 P.A. 帕夫纳 著 王翼飞 等译, 化学工业出版社 (生物.医药出版分社)

# Grading

- Homework 30%
- Projects(1+1) 20%
- Exam 50%

# 作业规定

- 作业允许合作，但是必须注明各人的贡献
- 作业报告必须用自己的语言独立完成
- 期末考试需要独立完成
- 严禁抄袭
  - 抄袭者：不及格(F)
  - 被抄袭者：成绩降一级 (A→B, B→C, C→D, D→F)

# Similar courses in other universities

- ▀ Washington University (Algorithms for Computational Biology)
  - <http://bio5495.wustl.edu/syllabus.html>
- ▀ University of Washington (Computational Biology)
  - <http://www.cs.washington.edu/education/courses/527/>
- ▀ Tel Aviv University School of Computer Science (Algorithms in Molecular Biology )
  - <http://www.cs.tau.ac.il/~rshamir/algmb/01/algmb01.html>
- ▀ Stanford (Representations and Algorithms for Computational Molecular Biology )
  - <http://www-helix.stanford.edu/courses/bmi214/>
- ▀ MIT(Foundations of Computational and Systems Biology)
  - <http://www.core.org.cn/OcwWeb/Biology/7-91JSpring2004/LectureNotes/index.htm>
- ▀ Imperial College (Introduction to Bioinformatics)
  - <http://www.doc.ic.ac.uk/~sgc/teaching/341/>

# Course website

- ④ [http://cbb.sjtu.edu.cn/~ccwei/pub/courses/2014/algorithms\\_in\\_bioinformatics/ab.php](http://cbb.sjtu.edu.cn/~ccwei/pub/courses/2014/algorithms_in_bioinformatics/ab.php)
- ④ If you have any questions, send me an email at: [ccwei@sjtu.edu.cn](mailto:ccwei@sjtu.edu.cn)