



SCBT401 BIOINFORMATICS

GENE FUNCTION & TRANSCRIPTION

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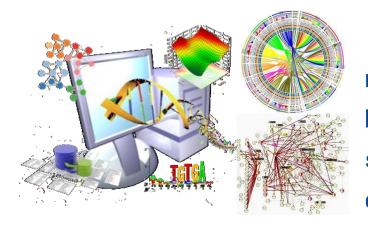
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Bioinformatics





An interdisciplinary field that develops methods and software tools for studying biological data, which combine computer science, statistics, mathematics and engineering.



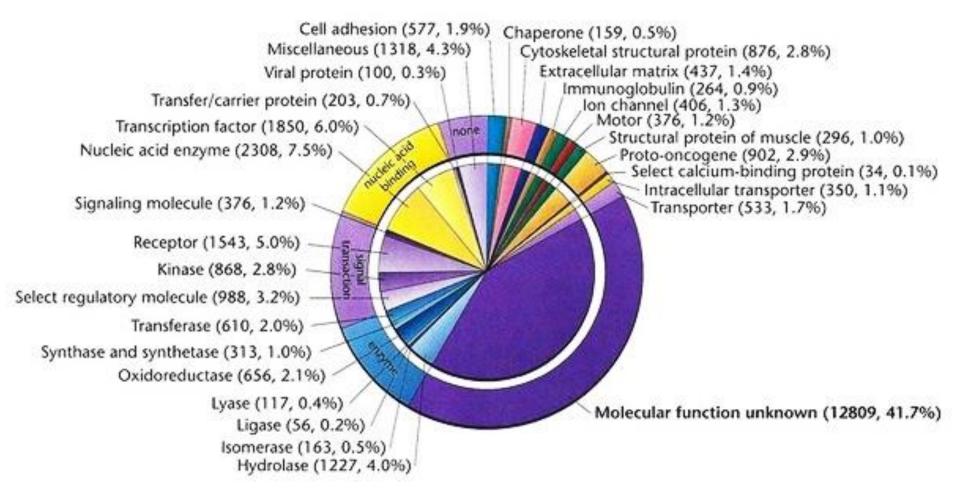
Sequence analysis
Gene and protein expression
Structural bioinformatics
Network and systems biology
Databases
Software and tools

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Gene Function in Human



Its not difficult to introduce mutations, but its extremely difficult to bring desired powers through mutations.





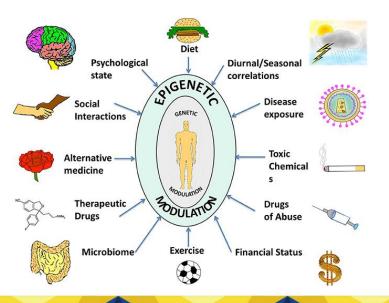
Transcription

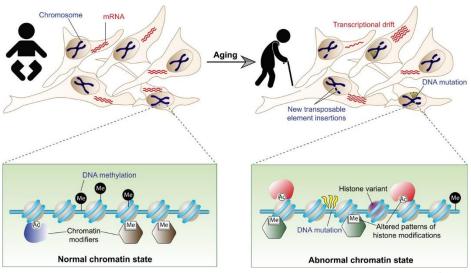
Why is important?



There are around 4000,000,000 base pairs in the human genome, so you would expect between 10 and 100 new mutations per person that occur early enough in embryonic development to be present in most cells in the body.

Twins share the same genes but their environments become more different as they age.









Objectives

Students are able to...

- To explain currently molecular techniques for analyze gene expression and function
- To apply the most suitable techniques for analyze the gene expression and function in different research areas
- To synthesize the proper experimental procedures for working on research related to study the gene function and expression

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Outline

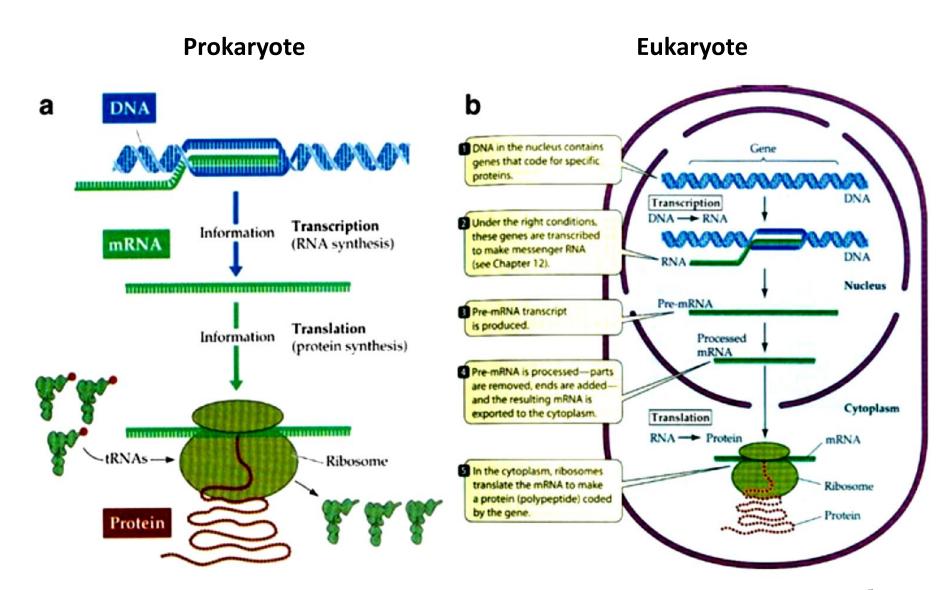
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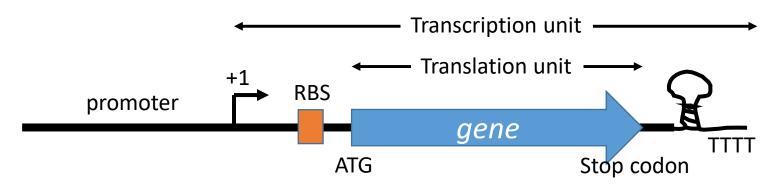
The Central Dogma







Gene prediction in Prokaryote



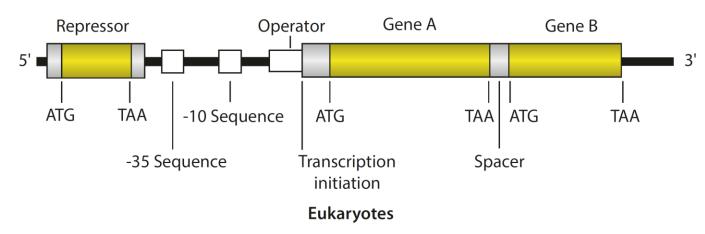
- Translational start codon:
 - ATG (alternatives as GTG or TTG)
- Shine-Delgarno sequence
 - purine-rich sequence complementary to 16S rRNA
 - Slightly upstream of translational start codon
 - Consensus sequence of AGGAGGT
- Stop codon
 - TGA, TAG, and TAA in DNA (UGA, UAG, and UAA in RNA)
- Transcriptional termination signal
 - Rho-independent terminator
 - stem loop structure followed by a string of Ts





Gene prediction in Eukaryote

Prokaryotes



Flanking Flanking region region Exon I Exon III Exon II Intron I Intron II 3' GC GC **GT** GT AG AG Box Box **ATG** TAA Poly (A) tail Transcription CAAT **TATA AATAA** Box initiation Box

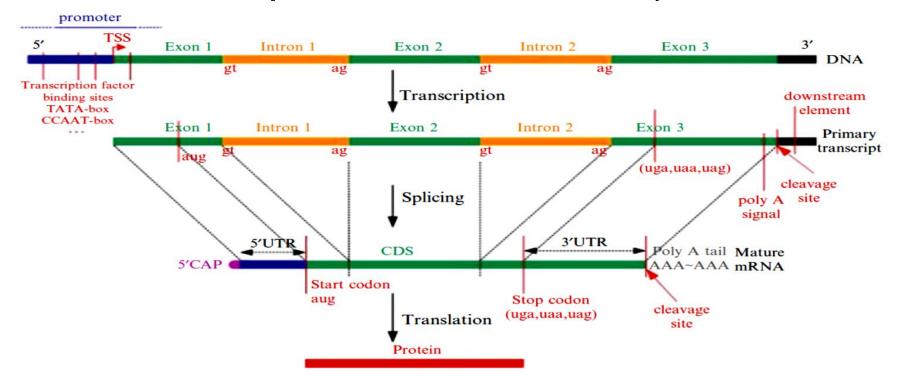
■ Fig. 1.5 The structure of gene regions of prokaryotes and eukaryotes

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Gene prediction in Eukaryote



Further Reading

Amino acids. https://en.wikipedia.org/wiki/Amino_acid

Biochemistry. https://en.wikipedia.org/wiki/Biochemistry

NCBI Books. http://www.ncbi.nlm.nih.gov/entrez/query.fcgi?db=Books

Protein structures. http://www.rcsb.org/





Gene prediction in Eukaryote

- \bullet Large nuclear genomes \rightarrow Very low gene density
 - In humans, only 3% of the genome codes for genes, with about 1 gene per 100 kbp on average
 - Space between genes is very large and rich in repetitive sequences and transposable elements
- Mosaic organization
 - Gene is split into pieces (exons) by intervening noncoding sequences (introns)
- 5' capping for methylated initial residue of RNA
- Polyadenylation at 3' end with a consensus of CAATAAA(T/C)
- Splicing junctions of introns and exons: GT-AG rule
- Most vertebrate genes:
 - ATG as translation start codon with conserved flanking sequence (Kozak sequence, CCGCCATGG)
 - ullet high density of CG dinucleotides near transcription start site (CpG island, ullet refers to the phosphodiester bond connecting two nucleotides)





Gene prediction program

- Homology-based programs
 - Exon structures and exon sequences of related species are highly conserved
 - Many homologous sequences to be compared with are derived from cDNA or expressed sequence tags (ESTs) of the same species
 - Novel genes in a new species cannot be discovered without matched in the database
 - GenomeScan (http://genes.mit.edu/genomescan.html)
 - EST2Genome (http://emboss.bioinformatics.nl/cgibin/emboss/est2genome)
 - TwinScan (http://mblab.wustl.edu/)





Gene prediction program

- Consensus-based programs
 - Integrated approach: use several different programs to generate lists of predicted exons
 - Common predictions agreed by most programs and removing inconsistent predictions
 - GeneComber: combined HMMgene with GenScan
 - (<u>http://www.bioinformatics.ubc.ca/gencombver/index.php</u>)
 - DIGIT (http://digit.gsc.riken.go.jp/cgi-bin/index.cgi)
 - Combines FGENESH, GENSCAN and HMMgene





ORF Finder and BLAST

https://www.ncbi.nlm.nih.gov/orffinder/

Open Reading Frame Finder

ORF finder searches for open reading frames (ORFs) in the DNA sequence you enter. The program returns the range of each ORF, along with its protein translation. Use ORF finder to search newly sequenced DNA for potential protein encoding segments, verify predicted protein using newly developed SMART BLAST or regular BLASTP.

This web version of the ORF finder is limited to the subrange of the query sequence up to 50 kb long. Stand-alone version, which doesn't have query sequence length limitation, is available for Linux x64.

Examples (click to set values, then click Submit button):

- NC_011604 Salmonella enterica plasmid pWES-1; genetic code: 11; 'ATG' and alternative initiation codons; minimal ORF length: 300 nt
- NM_000059; genetic code: 1; start codon: 'ATG only'; minimal ORF length: 150 nt



Enter Query Sequer	nce ber, gi, or nucleotide sequenc	e in FASTA format:		
Littor addoddion main	bor, gr, or nacrocado coqueno	o iii i Ao iA ioimac.		
From:	To:			





Confirmation of gene prediction?

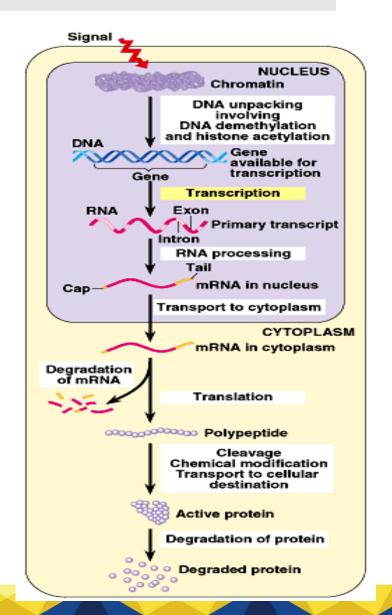
- Transcribe as mRNA
 - Gene expression analysis
 - Transcription start site
 - RNA detection
- Translate as protein
 - In vitro translation
 - Protein detection
- Protein activity (function)
 - Protein activity assay





Gene expression and regulation

- Gene expression:
 - house-keeping (always express in the similar level)
 - inducible (regulated by regulatory elements)
- Gene regulation:
 - Prokaryote: Mainly transcriptional regulation and indirect regulation: small RNAs, tRNAs, and proteins
 - For eukaryote, many levels of control include chromatin packing, transcription, RNA processing, translation, and various alterations to the protein product.







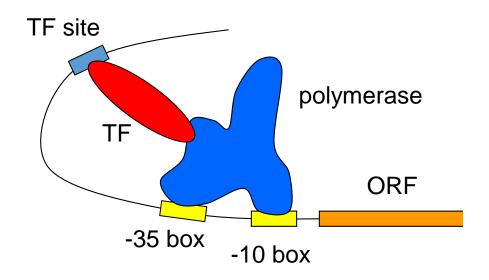
Transcriptional regulation

- Direct transcriptional regulation
 - Protein-DNA binding affects the level of gene expression
 - Promoter analysis: sequence and motif
 - Regulatory elements
 - RNA polymerase and sigma factor
 - Regulatory proteins
 - Binding motif and structure of protein
 - Binding affinity and sequence homology
 - Sensor and response
- Indirect regulation
 - Change in gene expression via intermediates





Promoter prediction: Prokaryotic gene



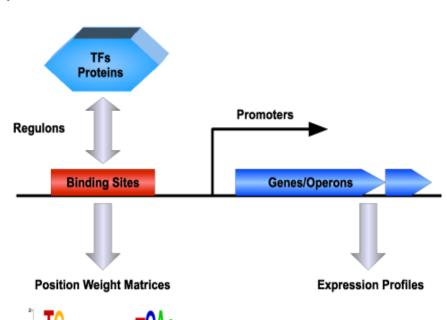
- σ^{70} factor binds to -35 and -10 boxes and recruit full polymerase enzyme
- 35 box consensus sequence: TTGACA
- 10 box consensus sequence: TATAAT
- Transcription factors that activate or repress transcription
- Bind to regulatory elements
- DNA loops to allow long-distance interactions



YEARS MAHIDOL U N 1 Y E R S 1 T Y SCIENCE

Promoter prediction: Prokaryotic gene

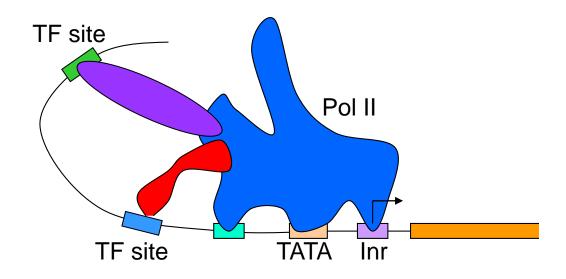
- Find operon and upstream of-first gene is promoter
- Wang rules (distance between genes, no ρ-independent termination, number of genomes that display linkage)
- BPROM (http://www.softberry.com)
- Based of arbitrary setting of operon epen distances
- 200bop upstream of first gene
- many FPs
- FindTerm (http://sun1.softberry.com)
- Searches for ρ -independent termination signals
- Prodoric (http://prodoric.tu-bs.de/)
- A comprehensive database about gene regulation and gene expression in prokaryotes







Promoter prediction: Eukaryotic gene structure



Polymerase I, II and III
Basal transcription factors (TFIID, TFIIA, TFIIB, etc.)
TATA box (TATA(A/T)A(A/T)
"Housekeeping" genes often do not contain TATA boxes
Initiatior site (Inr) (C/T) (C/T) CA(C/T) (C/T) coincides with transcription start
Many TF sites
Activation/repression





Promoter prediction: Eukaryotic gene structure

- Searching for consensus sequences in databases (TransFac)
- Increase specuificity by searching for CpG islands
- High density fo trasncription factor binding sitres
- CpGProD (http://pbil.univ-lyon1.fr/software/cpgprod.html)
- CG% inmoving window
- Eponine (http://servlet.sanger.ac.uk:8080/eponine/)
- Matches TATA box, CCAAT box, CpG island to PSSM
- Cluster-Buster (http://zlab.bu.edu/cluster-buster/cbust.html)
- Detects high concentrations of TF sites
- FirstEF (http://rulai.cshl.org/tools/FirstEF/)
- QDA of fisrt exonboundary
- McPromoter (http://genes.mit.edu/McPromoter.html)
- Neural net of DNA bendability, TAT box, initator box
- Trained for *Drosophila* and human sequences





Transcriptional regulators

- ➤ <u>Tfsitescan</u> (Institute for Transcriptional Informatics, Pittsburgh, U.S.A.) This tool is intended for promoter sequence analysis and works best with sequences of ~500 nt.
- PLACE (National Institute of Agrobiological Sciences, Japan) Plant cis-acting regulatory DNA elements. PInTFDB Plant Transcriptional Factor Database allows BLAST searching (Reference:P. Pérez-Rodríguez et al. 2009 Nucl. Acids Res. 38: D822-D872) or here for related site.
- ▶ DBD: Transcription factor prediction database (Gesellschaft für Biotechnologische Forschung mbH (GBF), Braunschweig, Germany) (Reference: D. Wilson et al. 2010. Nucl. Acids Res. 36: D88-D92)
- ➤ <u>rVista 2.0</u> (Comparative Genomics Center, Lawrence Livermore National Laboratory, U.S.A.) High-throughput discovery of functional regulatory elements in sequence alignments. Excluding up to 95% false positive transcription factor binding sites predictions while maintaining high sensitivity of the search.
- ➤ <u>TESS</u> (Transcription Element Search System) is a web tool for predicting transcription factor binding sites in DNA sequences. It can identify binding sites using site or consensus strings and positional weight matrices from the TRANSFAC, JASPAR, IMD, and our CBIL-GibbsMat database. This resource is best for scanning short DNA sequences.
- PlantTFDB Plant Transcription Factor Database (Peking University, China) provides search and Blast search capability.
- ➤ Bmicc (http://www.bmicc.org/web/english/home) National Scientific Data Sharing Platform for Population and Health Biolicine Information Center





Protein-DNA binding motif

Gateway site	URL
NCBI Genomic Biology	http://www.ncbi.nlm.nih.gov/Genomes/index.html
GOLD (Genomes OnLine Database)	http://www.genomesonline.org/
TIGR Microbial Database	http://cmr.jcvi.org/tigr-scripts/CMR/CmrHomePage.cgi
Bacterial genomes	http://genolist.pasteur.fr/
Yeast databases	http://genome-www.stanford.edu/Saccharomyces/yeast_info.html
EnsEMBL Genome Database Project	http://www.ensembl.org/
MIPS (Munich Information Center for Protein	http://mips.gsf.de
Sequences)	

•TRANSFAC Matrix models

- •One important point to know is that not all the matrix models are experimentally curated or good. So not all models can be used from TRANSFAC.
- •JASPAR is another one mentioned above with high quality matrix models.
- •UniPROBE
- •Human Protein-DNA Interactome (hPDI)
- Factorbook

http://www.gene-regulation.com/pub/databases.html

MAPPER₂ - Multi-genome Analysis of Positions and Patterns of Elements of Regulation

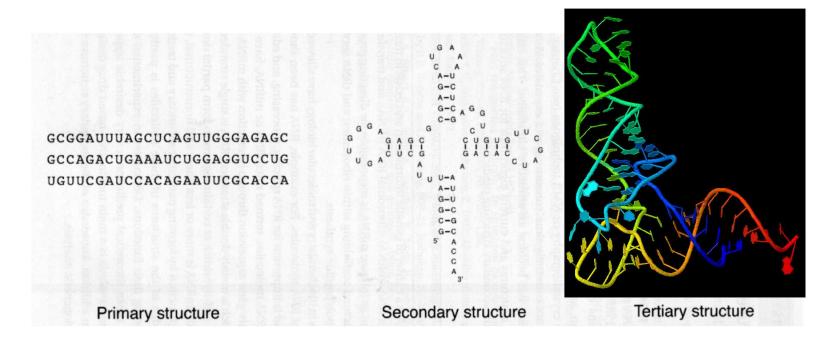
MotifMap: genome-wide maps of regulatory elements





Gene expression: RNA structure

- RNA is single stranded, although some parts can self-hybridize to form partial double-stranded structures.
- mRNA is more or less linear and nonstructured, whereas rRNA and tRNA can only function by forming particular secondary and tertiary structures.

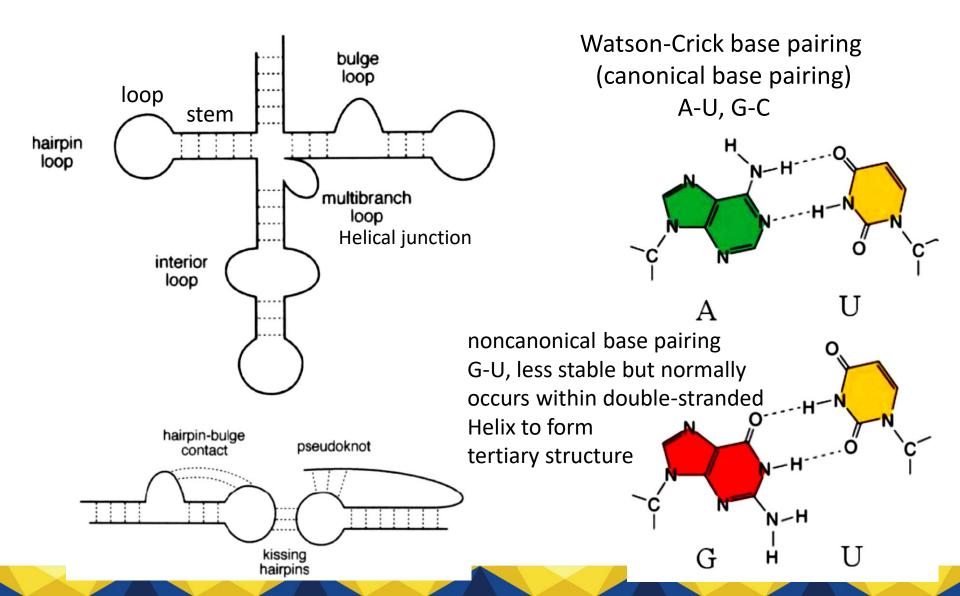


- RNA can act as enzymes (ribozymes) to speed chemical reactions. tRNA structure is responsible!
- The secondary structures of rRNA is key for RNA-based phylogenetic analysis.





Type of RNA structures





RNA structure prediction



Prediction based on a single RNA sequence Search for RNA structure with lowest energy Free energy calculated from G-C < A-U < G-U < unpaired pairs Stacking between aromatic rings (van der Waals interactions) gives rise to cooperativity

Neighboring loops or bulges impose unfavorable entropic change Find all possible base-pairing interaction Calculate the energy of each and choose the lowest energy configuration

1. Dot Matrices

Plot all interactions in self alignment plot Find diagonals after applying sliding window

2. Dynamic Programming

Find the single optimal match
Use Watson-Crick and wobble base pairing scores
Conformations with slightly higher energies may exist without optimal base pairing





RNA structure prediction program

3. Partition function

Use a probability distribution to generate sub-optimal structures within a given energy range

Mfold

http://mfold.bioinfo.rpi.edu/applications/mfold/ Dynamic programming and thermodynamic calculation

RNAfold

http://rna.tbi.univie.ac.at/cgi-bin/RNAfold.cgi Extend alignment to more than one diagonal in dotplot to calculate thermodynamic stability of structures





RNA structure prediction program

4. Comparative Approach

- Assumption that homologous RNA sequences fold into same structure
- Covariant regions in homologous sequences are likely to be base-paired
- Predict consensus structure based on predictions for all aligned sequences

RNAalifold

http://rna.tbi.univie.ac.at/cgi-bin/RNAalifold.cgi

Prealignment

Predictions based on covariance, minimum free energy, dynamic programming finds optimal structure for entire alignment

Foldalign

http://foldalign.ku.dk/

No prealignment

Clustal alignment and dynamic programming





SOFT BERRY

http://www.softberry.com/berry.phtml?topic=index&group=programs&subgroup=gfindb

BP-ROM

http://www.softberry.com/berry.phtml?topic=bprom&group=programs&subgroup=gfindb

FIND-TERM

http://www.softberry.com/berry.phtml?topic=findterm&group=programs&subgroup=gfindb





Virtual Footprint

http://www.prodoric.de/vfp/





Transcriptomics

Global expression analysis and DNA microarrays

RNA expression can be measured by hybridizing the RNA to other oligonucleotides. Analyzing signal intensities under different conditions can identify the levels of differential gene expression.

DNA microarrays

There are many types of microarray that are appropriate for different types of analysis. DNA microarray technology uses a grid of oligonucleotides on a chip that hybridize to the complementary target RNA. The level of transcript is determined by the hybridization signal of either Affymetrix-or Agilent-based microarrays. Affymetrix microarrays comprise 25-mer oligonucleotides and there are 11–20 probe-pairs per probe-set per gene. Agilent microarrays have longer oligonucleotide probes, which are more specific, but this method has only one probe per gene.

Tiling arrays

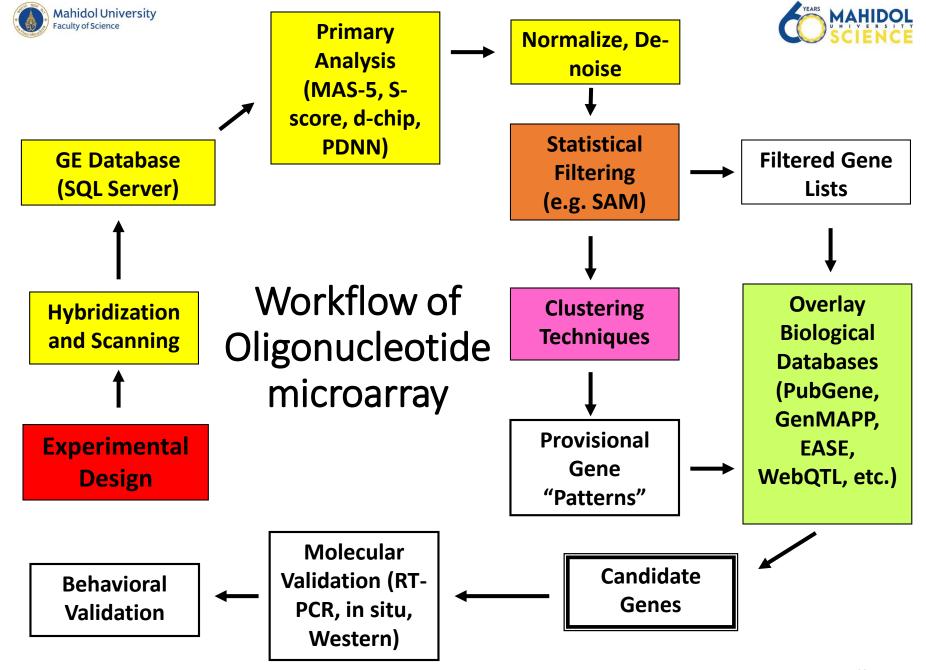
Tiling arrays have probes that target sections of the genome at a very high resolution. The tiling probes can be overlapping or have a short gap between them. Tiling arrays are used in ChIP-chip, MeDIP-chip, and DNase-chip studies.

SNP microarrays

SNP microarrays measure single nucleotide polymorphisms that occur in different diseases, or a comparison of tissues or treatments. They are the key technology in human disease genome-wide association studies and drug development studies.

Next generation sequencing

Next generation sequencing encompasses new technologies that provide fast and accurate sequence reads. The number of sequencing reads can be converted into levels of differential gene expression.







Global gene expression analysis

Gene expression matrices

The raw data from microarray experiments is converted into tables known as gene expression matrices. The rows represent genes and the columns represent experimental conditions. The values in the matrices are measurements of signal intensities, representing relative levels of gene expression.

Grouping expression data

Each gene in a gene-expression matrix has an expression profile, relative to the changes in expression measurement over a range of conditions. The analysis of microarray data involves grouping these data on the basis of similar expression profiles. If a pre-defined classification system is used to group the genes, the analysis is described as supervised. If there is no pre-defined classification, the analysis is described as unsupervised.

Tools for microarray data analysis

Many software applications are available for the analysis of microarray data and these can be downloaded and installed on local computers. Two examples of microarray analysis software platforms include GeneSpring and Bioconductor. There are also several resources available for the analysis of microarray data over the internet; Expression Profiler is the most widely used. Several gene expression databases have been constructed for the storage and dissemination of microarray data. These include the NCBI Gene Expression Omnibus and the EBI ArrayExpress database.

Differential expression

Differential expression refers to the up- and down-regulated genes a microarray experiment. The levels of expression are commonly determined by a fold-change at a set cutoff value. Volcano plots are a common representation of genes that are selected by fold-change and p value.

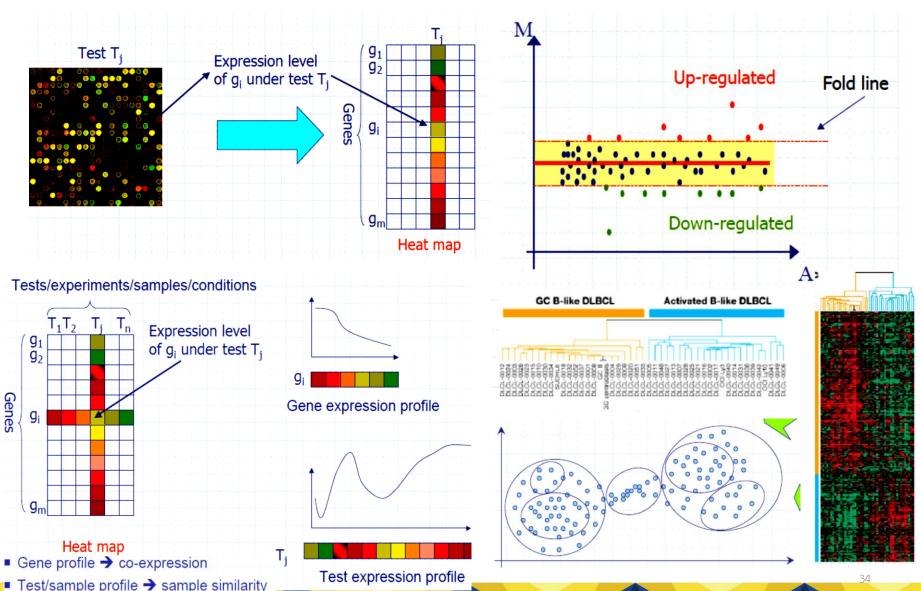
Mapping of expression data onto networks

Gene expression data can be mapped onto a network, which can be protein interaction, gene regulatory, or metabolic networks. Cytoscape is the main network visualization and analysis tool.





Microarray data interpretation







Stepwise Analysis of Microarray Data

- Low-level analysis -- image analysis, expression quantitation
- Primary analysis -- is there a change in expression?
- Secondary analysis -- what genes show correlated patterns of expression? (supervised vs. unsupervised)
- Tertiary analysis -- is there a phenotypic "trace" for a given expression pattern?

and quit

Table 1. Microarray analysis software tools and internet resources for microarray expression analysis

Product	Features	URL
Microarray analys	is software tools	
GeneSpring GX	Very popular and powerful tool for biologists. Full support for most microarray platforms, Affymetrix and Agilent are examples. Extensive analysis including clustering, PCA, and pathway analysis. License required	http://www.chem.agilent.com/ en-US/products/software/ lifesciencesinformatics/pages/ gp35082.aspx
Bioconductor	R-based tool with many libraries for microarray analysis including extensive Affy and Agilent support. Free	http://www.bioconductor.org/
DChip	Analysis and visualization of gene expression and SNP arrays	http://biosun1.harvard.edu/complab/dchip/
Examples of sites	with extensive links to microarray analysis softwar	e and resources
Gene Pattern	Extensive list of software resources from Stanford University and other sources, both downloadable and WWW-based	http://www.broad.mit.edu/cancer/ software/genepattern/

Microarray **Analysis** software tools

Examples of WWW-based microarray data analysis Expression profiler

Very powerful suite of programs from the EBI for

analysis and clustering of expression data

Generic data clustering, visualization, and analysis

tool

Genevestigator Provides gene expression meta-profiles for

animals and plants (e.g., human, mouse, rat, and

Standard microarray database consisting of plant

and other species data. Data mining tools and

arabidopsis)

and analyze the data

experiment search functions

http://www.ebi.ac.uk/

expressionprofiler/index.html

http://www.bioinf.ebc.ee/EP/EP/

EPCLUST/

https://www.genevestigator.ethz.ch/qv/

index.jsp

The major microarray databases

EPClust

NASCArrays

NCBI GEO (Gene GEO is a gene expression and hybridization array http://www.ncbi.nlm.nih.gov/geo/ Expression Omnibus) database, which can be searched by accession number, through the contents page, or through the Entrez ProbeSet search interface ArrayExpress EBI microarray gene expression database. http://www.ebi.ac.uk/microarray-as/ae/ Developed by MGED and supports MIAME Stanford Microarray Microarray database that provides a resource for http://genome-www5.stanford.edu/ Database the scientific community. Many tools to explore

http://affymetrix.arabidopsis.info/ narrays/experimentbrowse.pl

Resources of gene expression analysis

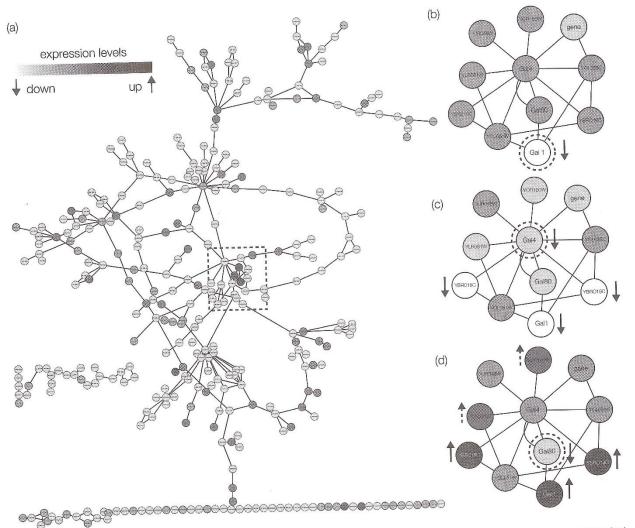


Fig. 4. This figure is based upon a yeast gene-regulatory network, where each node is a gene or protein, color-coded in the case of genes on the basis of their transcript levels, with darker shades representing higher expression levels. (a) The overall network of 331 nodes and 362 edges with key genes denoted in the black rectangle; (b), (c), and (d) show the same subnetwork when Gal1, Gal4, and Gal80 are knocked out, respectively. The dashed circle shows which gene has been knocked out, and the arrows indicate whether the result is a slight (dashed) or major (solid) increase (upward arrow) or decrease (downward arrow) in gene expression compared to the wild-type. (Permission to use the Cytoscape tutorial to produce this figure was kindly given by Trey Ideker, UCSD.)

Mapping of expression data on networks

"Cytoscape"
Online program
http://cytoscape.org/





GEO PROFILE, NCBI

https://www.ncbi.nlm.nih.gov/geoprofiles/



Genome technology

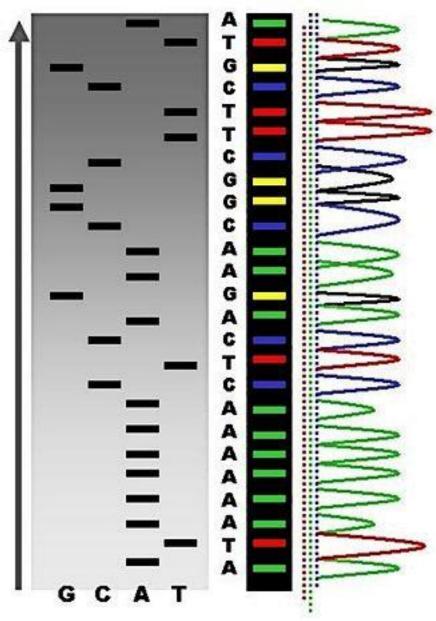
The **canonical structure of DNA** has four bases: thymine (T), adenine (A), cytosine (C), and guanine (G). Bacteriophage: hydroxy methyl or hydroxy methyl glucose cytosine. Mammalian DNA, variant bases with methyl groups or phosphosulfate may be found i.e. 5mC (5 methyl cytosine)

The chain-termination method developed by <u>Frederick</u> <u>Sanger</u> and coworkers in 1977 soon became the method of choice, owing to its relative ease and reliability:

Sanger Method

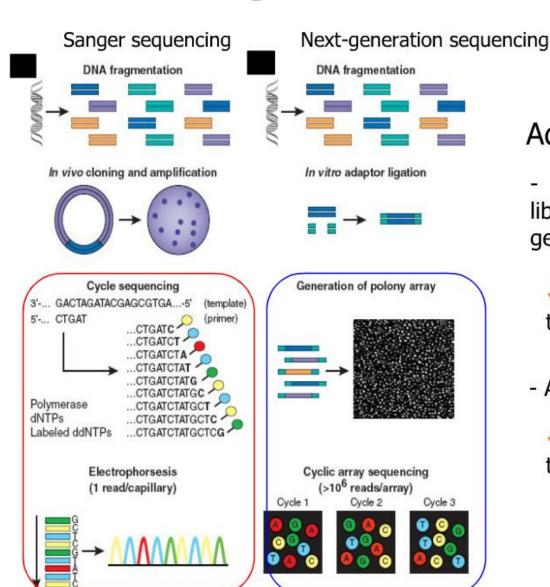
- Dominant for last ~30 years
- 1000bp longest read
- Based on primers so not good for repetitive or SNPs sites

The term "de novo sequencing" specifically refers to methods used to determine the sequence of DNA with no previously known sequence. Gaps in the assembled sequence may be filled by primer walking.



An example of the results of automated chain-termination DNA sequencing.

Next-generation DNA sequencing



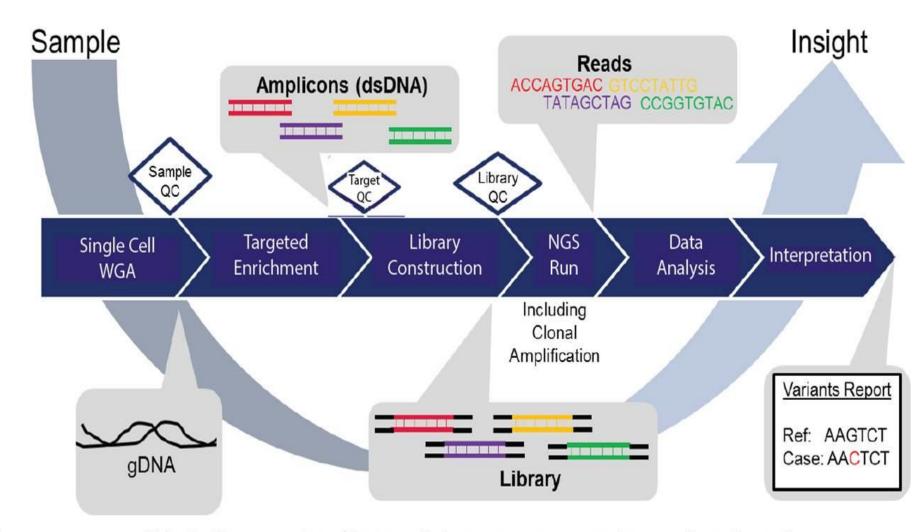
Advantages:

- Construction of a sequencing library → clonal amplification to generate sequencing features
 - ✓ No in vivo cloning, transformation, colony picking...
- Array-based sequencing
 - ✓ Higher degree of parallelism than capillary-based sequencing





Example of NGS Work Flow

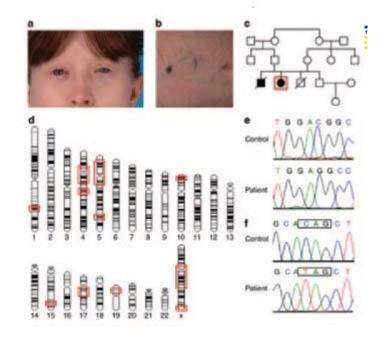


Biological interpretation of human whole genome, exome, and targeted panel samples



Next Generation Sequencing

https://www.youtube.com/watch?v=MxkYa9X CvBQ&feature=player_embedded



re-sequence the genome of previously sequenced organisms (re-sequencing) sequence the genomes of organisms with unknown sequences (de novo sequencing) determine RNA abundance levels (RNA-seq) determine protein—DNA binding regions (ChIP-seq) determine protein—RNA binding sequences (CLIP-seq) homozygosity mapping then whole-exome seq: disease-causing mutations in a patient Targeted sequencing: more affordable, yields much higher coverage of genomic regions of interest, and reduces sequencing cost and time in population genetic study/the status quo of integrative cancer genomic approaches Having aligned the fragments of one or more individuals to a reference genome, 'SNP calling' identifies variable sites, whereas 'genotype calling' determines the genotype for each individual at each site.

Applications of Next-Generation

DNA Level

Whole genome resequencing (WGS)

 Discover the genetic variations in a genome-wide range.

Exome Seq

- Discover the causative, susceptibility loci
- Discover rare/novel variants
- More economical and efficient

Target Region Seq

 Find the novel variants or validate the candidate variants in the target regions

Genotyping

- SNP and CNV detection in a genome-wide range
- Customized array for personal usage which is more flexible
- Validation of candidate pathogenetic genes or loci in large amount of samples

Single Cell Seq

- Genetic variation research at single cell level
- Explore cancer cells evolution during tumor progression

RNA Level

Transcriptome Seq

- Comprehensive analysis of differential gene expression
- Discover novel genes
- RNA editing analysis(such as alternative splicing, cSNP, gene fusion, etc)

RNA-Seq (Quantification)

- Precise quantification of gene expression analysis that is suitable for large samples
- Discover disease-related functional genes

Small RNA Seq

- Gene expression analysis of miRNA
- Gene regulatory networks and targets study of mi RNA
- Discover disease-specific biomarkers

Non-coding RNA Seq

- Identify novel non-coding RNA
- Discover disease-specific biomarkers

Cell Line Seq

- Obtain a clear and comprehensive genetic patterns of the cell lines
- Obtain mutation information of high accuracy

Epigenetic Level

Whole Genome Bisulfite Seq (WGBS)

- DNA methylation research at whole genome-wide level
- High accuracy and high resolution(single-based)

MeDIP Seq

- Based on immunoprecipitation for methylated DNA enrichment
- Whole genome-wide DNA methylation research and costeffective

RRBS Seq

- Methylation analysis of promoter regions with substantial genome coverage
- Based on enzyme digestion and bisulfite treatment
- Good repeatability

ChIP Seq

- Genome-wide protein-DNA interaction studies
- Higher resolution, more precise and abundant than ChIP-chip

Protein Level

Proteome Profiling

- Analyze the component of protein mixtures
- Obtain comprehensive information of protein category, metabolic pathways, etc

Quantitative Proteomics

 Fast and accurate protein differential analysis for multiple samples

Modification Proteomics

 Fast and comprehensive analysis of protein modification spectrum for multiple samples

Target Proteomics

- Based on the technology of Multiple Reaction Monitoring(MRM)
- Validate the discovered biomarkers
- Identify protein modification and low abundant proteins





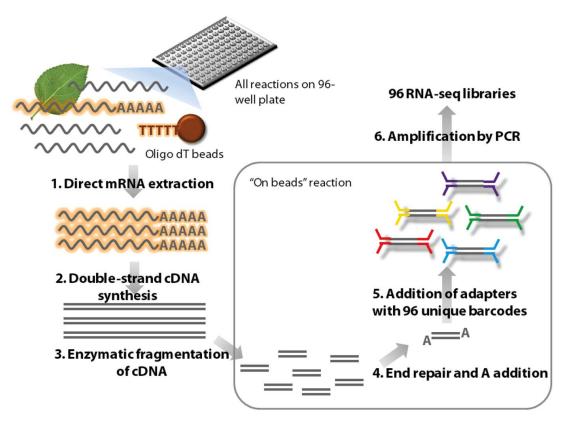
NGS by using RNA seq

Population of RNA (poly A+) converted to a library of cDNA fragments with adaptors attached to one or both ends

Solid Phase Amplification performed

Molecules sequenced from one end (Single End) or both ends (Pair End)

Reads are typically 30-400bp depending on sequence technology used





Article history:
Received 8 April 2015
Received in revised form 7 June 2015
Accepted 9 June 2015
Available online xxxx

Methods. 2015 Jun 16. pii: S1046-2023(15)00254-6.

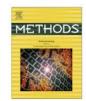
Differential RNA-seq (dRNA-seq) for annotation of transcriptional start sites and small RNAs in *Helicobacter pylori*.

Bischler T, Tan HS, Nieselt K, Sharma CM.

Research Center for Infectious Diseases (ZINF), University of Würzburg, Josef-Schneider-Str. 2 / Bau D15, 97080 Würzburg, Germany.



NGS by using ChIP seq



Review Article

Defining bacterial regulons using ChIP-seq

Kevin S. Myers a,b, Dan M. Park C, Nicole A. Beauchene D, Patricia J. Kiley d,b,*

Table 1File formats used in ChIP-seq analysis.

File type	Brief description	Use in analysis
FASTQ	Illumina sequencing file from experimental run	Raw ChIP-seq data
FASTQC	Illumina quality control file for each Illumina sequencing run	Evaluating ChIP-seq sequencing data
SAM	Alignment file from Bowtie2 or BWA	Aligned ChIP-seq file
BAM	Binary SAM file	Aligned ChIP-seq file
Wiggle (WIG)	File containing results of enumerating read hits at each base location	Visualization file
ELAND	Another alignment file format, used as input in MOSAiCS	For peak calling

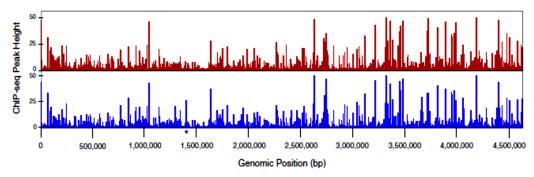
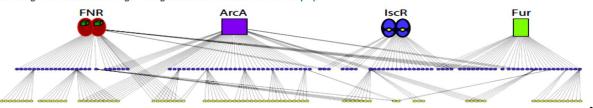
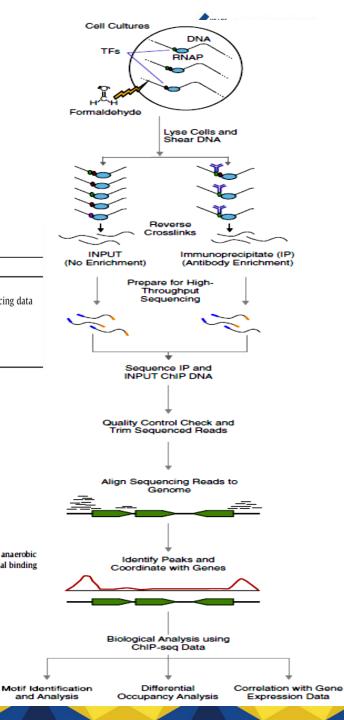


Fig. 2. Comparing ChIP-seq data between growth conditions. Shown are RNAP (σ^{70}) ChIP-seq data traces collected from cultures grown under aerobic (red) or anaerobic (blue) conditions [2]. ChIP-seq IP/INPUT ratio is shown on the *y*-axis and genomic position is shown on the *x*-axis. The asterisk indicates an example of differential binding between growth conditions. This figure was generated in the MochiView browser [53].









Confirmation of Transcriptional Control?

- Expression analysis
- Indirect control
 - Intermediate regulator
 - Sensor and response, enhancer or repressor
- Direct binding
 - Protein (Transcriptional regulator)
 - Protein-DNA binding
 - Foot-printing
 - Site-directed mutagenesis
 - Complementation
 - DNA (gene promoter)
 - Promoter analysis
 - Reporter enzyme activity assay
 - Site-directed mutagenesis





Article Data Analysis

Transcriptomics analysis

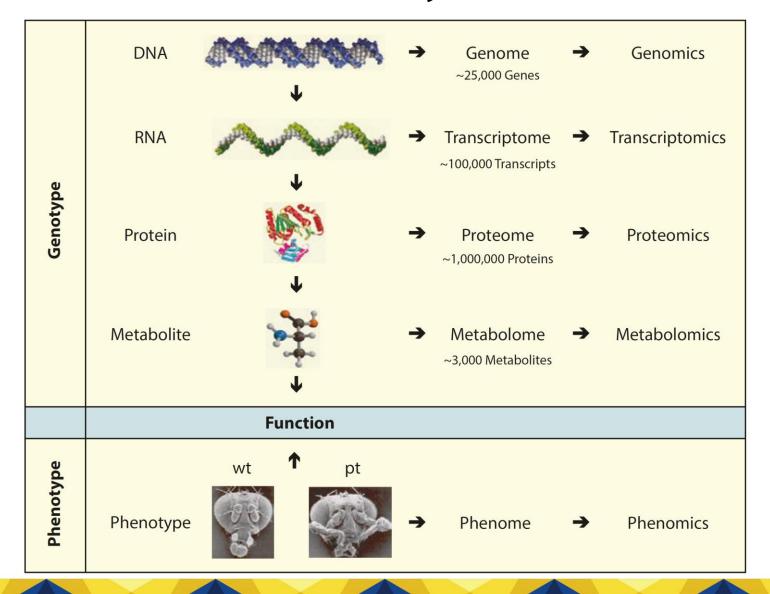
https://journals.plos.org/plosone/article?id=10.1371/journal.pone.0137762

https://www.ncbi.nlm.nih.gov/pubmed/21749987





The Functional Analysis of Genomes







Gene function

- 1. Functional genomics is the study of the function of genes and their products: Gene annotation, Gene ontology, and prediction of gene function
- Functional genomics analysis of genome wide gene expression and gene functions

DNA microarrays ("gene chips") enable the analysis of gene expression at the whole-genome level;

- -DNA fragments are deposited on a slide
- -Probed with labeled mRNA from different sources
- -Active/inactive genes are identified

Next generation Sequencing:

- "RNAseq" for Transcriptiomic study
- "ChIPseq" for identifying the regulator's targets





Genome Annotation

- Ab initio, i.e. based on sequence alone
 - INFERNAL/rFAM (RNA genes), miRBase (miRNAs), RepeatMasker (repeat families), many gene prediction algorithms (e.g. AUGUSTUS, Glimmer, GeneMark, ...)
- Evidence-based
 - Require transcriptome data for the target organism (the more the better)
 - Align cDNA sequences to assembled genome and generate gene models: TopHat/Cufflinks, Scripture

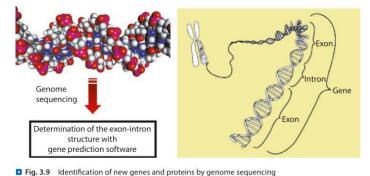
- 1. Sequence
- 2. Gene structures (GenScan, FgenesH)
- 3. Predictions verified by BLAST against sequence database, cDNA and EST (GeneWise, Spidey, SIM4, EST2Genome)
- 4. Manually verified by human curators
- 5. Functional assignment of proteins by BLAST searches of protein database
- 6. Further functional description from Pfam and InterPro and literature
- BLAST of gene models against protein databases
 - Sequence similarity to known proteins
- InterProScan of predicted proteins against databases of protein domains (Pfam, Prosite, HAMAP, PANTHER, ...)
- Mapping against Gene Ontology terms (BLAST2GO)





DATABASES and DATA Sources

- DNA sequencing
 - Sanger method, chain termination sequencing (dideoxy)
 - Shotgun sequencing and clone contig approach
 - Pyrosequencing (immobilized on beads)
 - Next generation sequencing



RNA sequencing

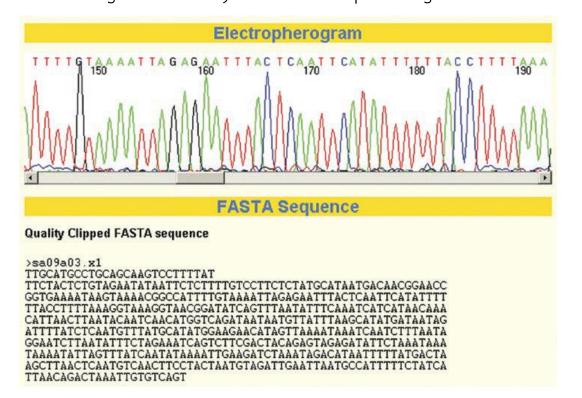
- Not well due to minor nucleotides and RNA editing
- Next generation sequencing
- Protein sequencing
 - Edman degradation with labelled terminal residues
 - Mass spectrometry (MS, m/z ratio): Soft ionization methods (without degradation)
 - ESI (electrospray ionization)
 - MALDI (Matrix assisted laser desorption/ionization)

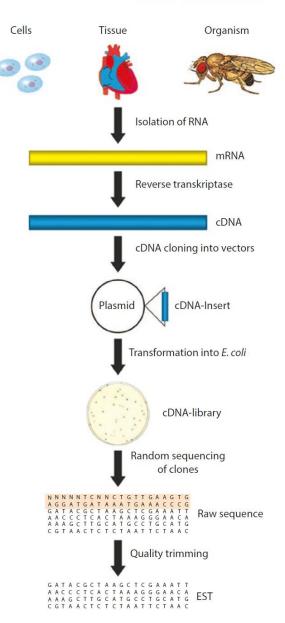




Expressed Sequence Tags

 partial sequences of cDNA clones could also be used in the discovery of new genes (Adams et al. 1991). Because cDNA clones are derived from expressed genes, the sequences were called expressed sequence tags (ESTs). ESTs are generated by the end-sequencing of cDNAs









Pharmacogenetics (or pharmacogenomics)

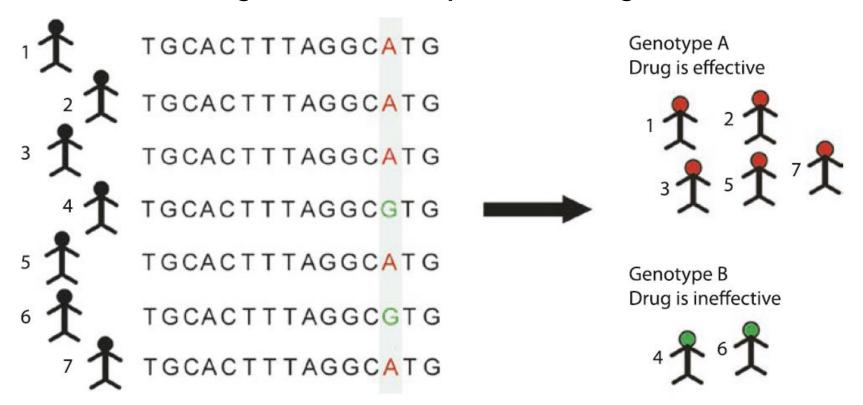


Fig. 4.9 Genotyping of patients by detecting SNPs

Personalized Medicine and Biomarkers
Next-Generation Sequencing (NGS)
Proteogenomics





Further Reading

```
cap. http://doua.prabi.fr/software/cap3
dbest. https://www.ncbi.nlm.nih.gov/dbEST/
dbgss. https://www.ncbi.nlm.nih.gov/dbGSS/
dbsnp. https://www.ncbi.nlm.nih.gov/SNP/
dbsts. https://www.ncbi.nlm.nih.gov/dbSTS/
ebi-gwas. http://www.ebi.ac.uk/gwas/
grailexp. http://compbio.ornl.gov/grailexp/
gwas. http://www.gwascentral.org/
helix-nebula. http://www.helix-nebula.eu/usecases/embl-use-case
homologene. http://www.ncbi.nlm.nih.gov/homologene/
hts-mapper. http://www.ebi.ac.uk/~nf/hts_mappers/
humatrix. https://www.humatrix.de/
image. http://imageconsortium.org/
nematode. http://www.nematode.net/
ngs-knowledge-base. https://goo.gl/HIaY1W
ngs-movie. https://www.youtube.com/watch?v=jFCD8Q6qSTM
```





DATABASES and DATA Sources

- Primary sequence databases (raw sequence data)
 - GenBank by National Center for Biotechnology Information (NCBI)
 - Nucleotide sequence database by European Molecular Biology Laboratory (EMBL)
 - Nucleotide sequence database by DNA Databank of Japan (DDBJ)
- Subsidiary sequencing databases
 - dbEST is a part of GenBank (EST = Expressed sequence tag)
 - dbGSS: GSS = genome survey sequences, single-pass genomic sequences
 - dbSTS : STS = sequence tagged sites (unique sequence for physical markers)
 - HTG = high-throughput genomic, unfinished genomic sequence data
- Protein sequence databases
 - SWISS-PROT (features table & sequence) + TrEMBL (Translated EMBL) = UniPort
 - UniPort (Universal protein resources): function, classification, and cross references
 - 1. UniRef combined similar sequences together in a single records
 - 2. UniParc keep a record of the history of the sequences
 - 3. UniMes a record of metagenomics and environmental data



TABLE 5.1 Three-Letter Abbreviations of	GenBank Division	IS
---	------------------	----

IIIDD	L Sti Till	better ribble viacions of Cenbank Divisions
1	PRI	Primate sequences
2	ROD	Rodent sequences
3	MAM	Other mammalian sequences
4	VRT	Other vertebrate sequences
5	INV	Invertebrate sequences
6	PLN	Plant, fungal, and algal sequences
7	BCT	Bacterial sequences
8	VRL	Viral sequences
9	PHG	Bacteriophage sequences
10	SYN	Synthetic sequences
11	UNA	Unannotated sequences
12	EST	Expressed sequence tag sequences
13	PAT	Patent sequences
14	STS	Sequence tagged sites sequences
15	GSS	Genome survey sequences
16	HTG	High-throughput genomic sequences
17	HTC	Unfinished high-throughput cDNA sequences
18	ENV	Environmental sampling sequences

5.4.5 Sequence Accession Numbers and Redundancy in Primary Databases

Nucleotide: 1 letter + 5 numerals (e.g. J00750) or 2 letters + 6 numerals (e.g. AF208545)

Protein: 3 letters + 5 numerals (e.g. AAG60350,

CAB92299).

SWISS-PROT features table is started with 2 letters as means as:

ID identity

AC accession number

DT date

DE description

GN gene name

CC comment

! as continuation line

DR reference

Key words

FT features





DATABASES and DATA Sources

Organism-specific resources

Table 1. A small selection of organism-specific genomic databases available on the WWW. These databases are curated actively by members of the research community working on the particular organism of interest, and generally include links to organism-specific resources such as clone sets and mutant strains

Organism	Database/Resource	URL
Escherichia coli	EcoGene	http://ecogene.org/
	EcoCyc (Encyclopedia of <i>E. coli</i> genes and metabolism)	http://www.ecocyc.org/
	Colibri	http://genolist.pasteur.fr/Colibri/
Bacillus subtilis	SubtiList	http://genolist.pasteur.fr/SubtiList/
Saccharomyces cerevisiae	Saccharomyces Genome Database (SGD)	http://genome-www.stanford.edu/ Saccharomyces/
Plasmodium falciparum	PlasmoDB	http://PlasmoDB.org
Arabidopsis thaliana	MIPS <i>Arabidopsis</i> thaliana Database (MAtDB)	http://mips.gsf.de/proj/thal/db
	The <i>Arabidopsis</i> Information Resource (TAIR)	http://www.arabidopsis.org/
Drosophila melanogaster	FlyBase	http://flybase.bio.indiana.edu/
Caenorhabditis elegans	A C. elegans DataBase (ACeDB)	http://www.acedb.org/
Mouse	Mouse Genome Database (MGD)	http://www.informatics.jax.org/
Human	OnLine Mendeilan Inheritance in Man (OMIM)	http://www.ncbi.nlm.nih.gov/omim



DATABASES and DATA Sources

Table 2. Useful gateway sites providing information and links to multiple, organism-specific, and genomic resources

Gateway site	URL
NCBI Genomic Biology	http://www.ncbi.nlm.nih.gov/Genomes/index.html
GOLD (Genomes OnLine Database)	http://www.genomesonline.org/
TIGR Microbial Database	http://cmr.jcvi.org/tigr-scripts/CMR/CmrHomePage.cgi
Bacterial genomes	http://genolist.pasteur.fr/
Yeast databases	http://genome-www.stanford.edu/Saccharomyces/yeast_info.html
EnsEMBL Genome Database Project	http://www.ensembl.org/
MIPS (Munich Information Center for Protein Sequences)	http://mips.gsf.de

Table 3. Database tools for displaying and annotating genomic sequence data

Viewer format	URL for further information and tutorials
Artemis	http://www.sanger.ac.uk/Software/Artemis
ACeDB	http://www.acedb.org/Tutorial/brief-tutorial.shtml
Apollo	http://apollo.berkeleybop.org/current/install.html
EnsEMBL	http://www.ensembl.org
NCBI map viewer	http://www.ncbi.nlm.nih.gov/mapview/
GoldenPath	http://genome.ucsc.edu/



NCBI database: "Entrez"

Entrez is the common front-end to all the databases maintained by the NCBI and is an extremely easy system to use. The Entrez main page, as with all NCBI pages, is undemanding in its browser requirements and downloads quickly. Part of the front page is illustrated in *Fig. 8*. The databases available for searching can be accessed by hyperlinks, or by using the search box as shown. The search term

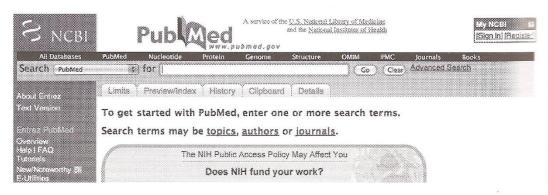


Table 4. The databases covered by Entrez, listed by category

Category	Database
Nucleic acid sequences	Entrez nucleotides: sequences obtained from Genbank, RefSeq, and PDB. Also UniGene, PopSet, Probe, Trace Archive, PA, UniST, dbEST, dbGSS, dbSNP, dbST, HomoloGene, and MGC
Protein sequences	Entrez protein: sequences obtained from SWISS-PROT, PIR, PRF, PDB, and translations from annotated coding regions in GenBank and RefSeq. Also 3D domains, Protein Clusters, and PROW
3D structures	Entrez Molecular Modeling Database (MMDB). Also 3D domains
Genomes	Complete genome assemblies from many sources
OMIM	OnLine Mendelian Inheritance in Man
Taxonomy	NCBI Taxonomy Database
Books	Bookshelf
Expression databases	Gene Expression Omnibus (GEO), SAGE
Literature	PubMed



DATABASES and DATA Sources

DBGET/LinkDB

DBGET is an integrated data retrieval system developed and jointly maintained by the Institute for Chemical Research (Kyoto University) and the Human Genome Center (University of Tokyo). It is integrated with more than 30 databases (*Table 5*), which can be searched one at a time or in combination. Hits are presented as a list of results together with any available associated information. LinkDB is an associated database of links (binary relationships) between entries in the different databases available to DBGET and also further organism-specific databases, such as AceDB, Flybase, and SGD. DBGET is associated closely with KEGG, the Kyoto Encyclopedia of Genes and Genomes, which is maintained by the same group.

Table 5. The databases covered by DBGET/LinkDB, listed by category

Category	Database
Nucleic acid sequences	GenBank, EMBL, RefSeq
Protein sequences	SWISS-PROT, PIR, PRF, PDBSTR, UniProt
3D structures	PDB
Sequence motifs	PROSITE, EPD, TRANSFAC, BLOCKS, PRODOM, PRINTS, PFAM
Enzyme reactions	LIGAND
Metabolic pathways	KEGG
Amino acid mutations	PMD
Amino acid indices	AAindex
Genetic diseases	OMIM
Literature	LITDB Medline
Organism-specific gene catalogs	E. coli, H.influenzae, M.genitalium, M.pneumoniae, M.jannaschii, Synechocystis, S.cerevisiae



DATABASES and **DATA** Sources

Table 6. The databases covered by the SRS at http://srs6.ebi.ac.uk, listed by category

SRS description	Examples
Literature	MEDLINE TAXONOMY, OMIM
Nucleotide sequence databases	EMBL, RefSeq,
Nucleotide sequence related	TFSITE, TFFACTOR, REBASE
Protein sequence databases	UNIPROT, REFSEQ, IPI
Protein function, structure and interaction databases	INTERPRO, PRODOM, PRINTS, BLOCKS, PFAMHMMFS, PROSITE, PDB, FSSP, EXPERIMENT, INTERACTION, INTERACTOR
TransFac	TFSITE, TFFACTOR, TFCELL, TFCLASS, TFMATRIX ,TFGENE
Enzymes reactions and metabolic pathways	ENZYME, UPATHWAYM UENZYME, UREACTION, UPATHWAY
Mutation and SNP databases	HGVBASE
User-owned databanks	USERDNA, USERPROTEIN
Application results	FASTA, FASTX, FASTY, NFASTA, BLASTP, BLASTN, CLUSTALW, NCLUSTALW, PPSEARCH, RESTRICTIONMAP, PSIBLAST, HMMPFAM
EMBOSS result databases	Including: ANTIGENIC, BACKTRANSEQ, BIOSEDN, RESTRICT, MERGER, ETC.



Primary Databases

Nucleotide Sequence Databases

.1 GenBank

GENBANK

```
SCU49845
LOCUS
                                     5028 bp
                                                DNA
                                                                  PLN 14-JUL-2016
                                                         linear
DEFINITION
            Saccharomyces cerevisiae TCP1-beta gene, partial cds; and Axl2p
            (AXL2) and Rev7p (REV7) genes, complete cds.
ACCESSION
            U49845
VERSION
            U49845.1 GI:1293613
KEYWORDS
SOURCE
            Saccharomyces cerevisiae (baker's yeast)
            Saccharomyces cerevisiae
  ORGANISM
            Eukaryota; Fungi; Dikarya; Ascomycota; Saccharomycotina;
            Saccharomycetes; Saccharomycetales; Saccharomycetaceae;
            Saccharomyces.
REFERENCE
            1 (bases 1 to 5028)
  AUTHORS
            Roemer, T., Madden, K., Chang, J. and Snyder, M.
  TITLE
            Selection of axial growth sites in yeast requires Axl2p, a novel
            plasma membrane glycoprotein
[..]
FEATURES
                     Location/Qualifiers
                      1..5028
     source
                     /organism="Saccharomyces cerevisiae"
                      /mol_type="genomic DNA"
                     /db_xref="taxon:4932"
                      /chromosome="IX"
                      <1..>206
     mRNA
                     /product="TCP1-beta"
     CDS
                      <1..206
                     /codon start=3
                      /product="TCP1-beta"
                     /protein id="AAA98665.1"
                      /db_xref="GI:1293614"
                      /translation="SSIYNGISTSGLDLNNGTIADMRQLGIVESYKLKRAVVSSASEA
                     AEVLLRVDNIIRARPRTANRQHM"
[...]
ORIGIN
        1 gatcctccat atacaacggt atctccacct caggtttaga tctcaacaac ggaaccattg
       61 ccgacatgag acagttaggt atcgtcgaga gttacaagct aaaacgagca gtagtcagct
```

• Fig. 2.1 Database record of GenBank database. The entry was shortened at some points, as indi-

cated by [...]





ENTREZ

 Query of the GenBank database is carried out via the NCBI Entrez system [entrez], which is used to query all NCBI-associated databases (NCBI Resource Coordinators 2016).

■ Table 2.1 Field IDs to restrict search terms to certain database fields in the Entrez system

Field ID	Database field
ACC	Accession number
AU	Author name
DP	Publication date
GENES	Gene name
ORGN	Scientific and common name of the organism
PT	Publication type, e.g., review, letter, technical publication
TA	Journal name, official abbreviation, or ISSN number

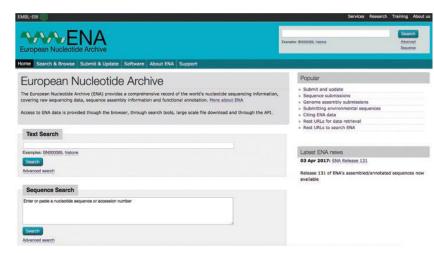


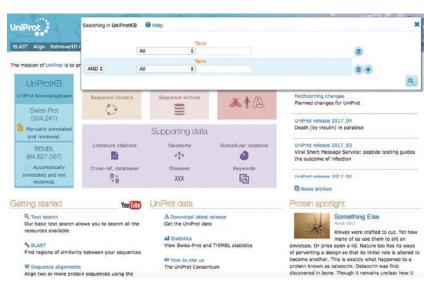


Other Primary Databases

- EMBL and DDBJ
- ENA Online Retrieval

- Protein sequence databases
 - UniProt
 - NCBI Protein Database









Secondary Databases

- Prosite
- PRINTS
- Pfam
- Interpro
- Genotype-Phenotype Databases
 - PhenomicDB
 - Molecular Structure Databases
 - Protein Data Bank
 - CATH
 - PubChem







Further Reading

bankit. http://www.ncbi.nlm.nih.gov/WebSub/?tool=genbank cath. http://www.cathdb.info/ dbgap. http://www.ncbi.nlm.nih.gov/gap ddbj. http://www.ddbj.nig.ac.jp/ ebi. http://www.ebi.ac.uk/ ebi-manual. http://www.ebi.ac.uk/embl/Documentation/User manual/ usrman.html ena. http://www.ebi.ac.uk/ena/ entrez. http://www.ncbi.nlm.nih.gov/nucleotide entrez-help. http://www.ncbi.nlm.nih.gov:80/entrez/query/static/help/ helpdoc.html expasy. http://www.expasy.org/ flybase. http://www.flybase.org/ gb-sample. http://www.ncbi.nlm.nih.gov/Sitemap/samplerecord.html genbank. http://www.ncbi.nlm.nih.gov/Genbank/ homologene. http://www.ncbi.nlm.nih.gov/homologene interpro. http://www.ebi.ac.uk/interpro/ mgd. http://www.informatics.jax.org/ nar. http://nar.oxfordjournals.org/

```
ncbi. http://www.ncbi.nlm.nih.gov/
nig. https://www.nig.ac.jp/nig/
omia. http://omia.angis.org.au/home/
omim.
http://www.ncbi.nlm.nih.gov/entrez/query.fcgi?db=OMIM
pdb. http://www.rcsb.org/pdb/home/home.do
pdb-models.
http://www.rcsb.org/pdb/search/searchModels.do
pfam. http://pfam.xfam.org/
phenomicdb. http://www.phenomicdb.de/
pir.
http://pir.georgetown.edu/pirwww/dbinfo/pir psd.shtml
prints. http://bioinf.man.ac.uk/dbbrowser/PRINTS/
prosite. http://prosite.expasy.org/
prosite-manual. http://prosite.expasy.org/prosuser.html
pubchem. http://pubchem.ncbi.nlm.nih.gov/
scop. http://scop.mrc-lmb.cam.ac.uk/scop/
scop2. http://scop2.mrc-lmb.cam.ac.uk/
sequin. http://www.ncbi.nlm.nih.gov/Sequin/
swissprot. http://www.expasy.org/sprot/
tigr. http://maize.jcvi.org/
uniprot. http://www.uniprot.org/
wormbase. http://www.wormbase.org/
wwpdb. http://www.wwpdb.org/
```

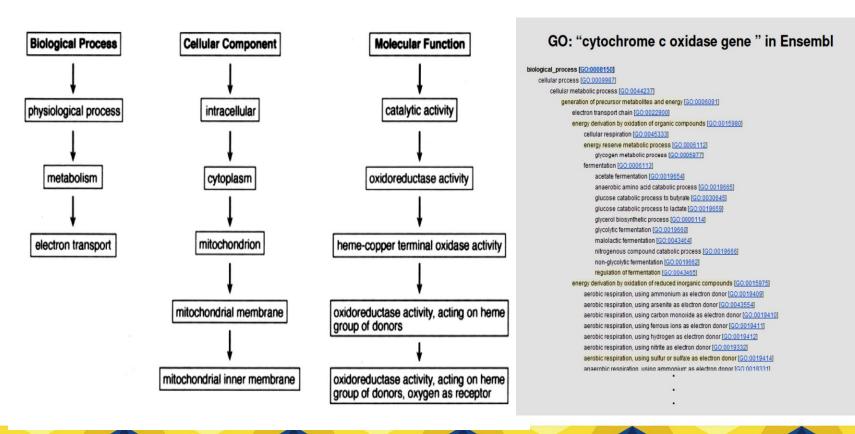




Gene Ontology

- Uses limited vocabulary to describe: cellular components, biological processes, and molecular functions
- Vocabulary arranged in a hierarchical manner from widest to most specific description

Cytochrome c oxidase



607 gene(s)

14 gene(s)

34 gene(s)

61 gene(s)

3 gene(s)

3 gene(s)

9 gene(s)

7 gene(s)

23 gene(s)





DATABASES and DATA Sources

■ Table	Further Reading	
Algorithr	bioedit. http://www.mbio.ncsu.edu/bioedit/bioedit.html	
blastp	blast. https://blast.ncbi.nlm.nih.gov clustalomega. http://www.ebi.ac.uk/Tools/msa/clustalo/	
blastn	ddbj-blast. http://ddbj.nig.ac.jp/blast/blastn?lang=en	
blastx	embnet. http://www.embnet.org/ embl-blast. https://www.ebi.ac.uk/Tools/sss/ncbiblast/nucleotide.html emboss. http://emboss.sourceforge.net/	six
tblastn	expasy. https://www.expasy.org/ genscan. http://genes.mit.edu/GENSCAN.html glimmer. http://ccb.jhu.edu/software/glimmer/index.shtml	ding
tblastx	ncbi. http://www.ncbi.nlm.nih.gov/ ncbi-blast. http://www.ncbi.nlm.nih.gov/blast/	

ncbi-blast. http://www.ncbi.nlm.nih.gov/blast/





Annotation of hypothetical proteins

In newly sequences, genome as much as 40% of protein are "hypothetical"

To assign function:

- Homology searches in databases
- Search for similar motifs, domains and secondary structures
- Identify conserved functional sites by HMM
- Predict structure with fold recognition or threading
- Assign broad function to protein
- Test assigned function experimentally

YEL008W BASIC INFORMATION

Systematic Name	YEL008W
Feature Type	ORF, Dubious
Description	Hypothetical protein predicted to be involved in metabolism (1)
GO Annotations	All YEL008W GO evidence and references
	View Computational GO annotations for YEL008W





Genome Economy

One gene \rightarrow one protein is not true EST suggests >100,000 proteins in humans (from 25,000 genes)

Alternative splicing

• Joining different exons from a single transcript to form different proteins

Exon shuffling

- Joining exons from different genes
- *Drosophila* Dscam gene contains 115 exons, 20 of which are constitutively spliced and 95 of which are alternatively spliced
- Expresses 38,016 different mRNAs by virtue of alternative splicing

Trans-splicing

- Drosophila mdg4 gene
- Joins 4 exons on sense strand and 2 exons on anti-sense strand
- Single transcript of encodes dentin phosphoprotein and sialoprotein. Protein is cleaved to form two different proteins





Comparative Genomics Compare genomes from different organisms

•Whole Genome Alignment

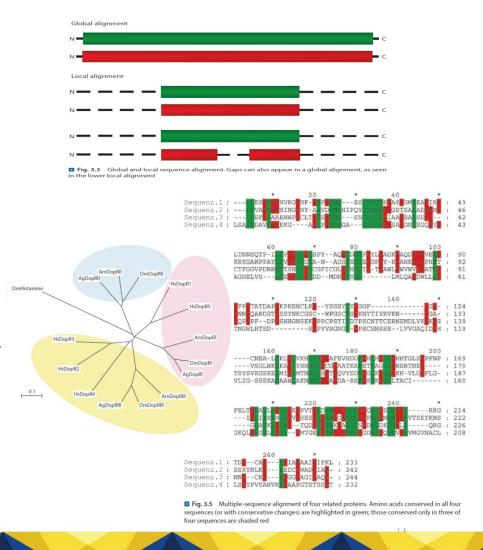
- Extent of genome conservation
- Mechanism of genome evolution
- MUMer and BLASTZ
- Modified BLAST to align long genome sequences

Finding a minimal genome

- •What are the minimum number of genes to support a free-living cellular entity?
- •Useful to identify genes constituting essential metabolic pathways

•Lateral Gene Transfer

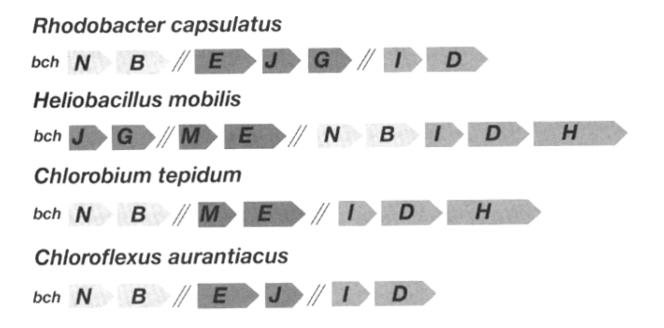
- •Identify by G-C skew
- •GC%
- Codon bias







Gene order comparisons



- Where gene order is conserved between genomes, it is called synteny
- Synteny may indicate functional relationships and physical interaction of proteins
- Genes encoding proteins catalyzing consecutive steps of metabolic pathway sometimes are ordered – co-regulation of "operon"?
- MAL cluster in yeast: multigene complex that encodes the MAL23 trans-acting MAL-activator, MAL21 maltose permease, and MAL22 maltase in order on chromosomes 2, 3, 7, 9 and 10





Confirmation of Gene Function?

- Gene mutation
 - Gene knock-out
 - Gene deletion
 - Transposable element
- Alteration of gene expression
 - Gene overexpression
 - Expression plasmid/vector
 - Integrated chromosomal expression
 - Gene silencing
 - RNAi: microRNA, siRNA
- Protein activity assay (enzyme/cofactor/complex)
- Physiological function analysis (direct and indirect)



...further reading...

NCBI Home

Resource List (A-Z)

All Resources

Chemicals & Bioassays

Data & Software

DNA & RNA

Domains & Structures

Genes & Expression

Genetics & Medicine

Genomes & Maps

Homology

Literature

Proteins

Sequence Analysis

Taxonomy

Training & Tutorials

Variation

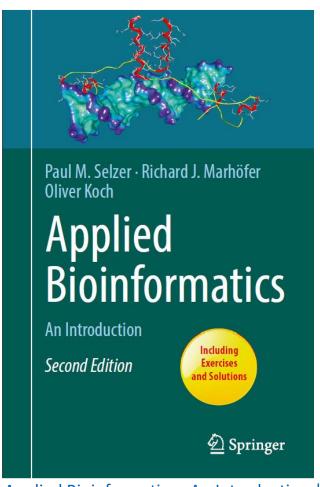
- 1. Choudhuri S. Bioinformatics for beginners: Gene, Genome, Molecular Evolution, Databases, and Analytical tools. Elsevier Inc, 2014, 225 pp.
- 2. Jin Xiong. Essential Bioinformatics. Cambridge University Press, 2006, 339 pp.
- 3. Hodgman TC, French A, and Westhead DR. Bioinformatics. Taylor & Francis Group, 2010, 340 pp.





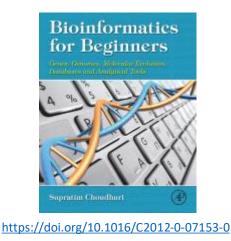


Recommended Reference Books



Applied Bioinformatics - An Introduction Paul M. Selzer | Springer

- Use for educational purpose only in SCBT401, MUSC-BT
- https://drive.google.com/drive/folders/10IhG8 HWxuPhPUtjFAT6NNVXVuzV7dz2l?usp=sharing



https://doi.org/10.1016/C2020-0-03935-6

