Algorithms and Tools in Bioinformatics

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Course Content

Part I

Data, Tools, and Technologies

- (1) Overview
- (2) Standard Datasets/Modern File Formats
- (3) Databases/Platforms
- (4) Data (Pre-) Processing
- (5) Tools
- (6) Machine Learning

Part II

Algorithms: Sequence Alignment

- (1) Motivation
- (2) Similarity of Sequences/ Scoring matrices
- (3) Global/Local Alignments
- (4) Heuristic Methods
- (5) Multiple Sequence Alignment
- (6) Phylogenetic Trees

Course Exam

- 2x Exercise Sheets
- Oral exam



(1) Overview

Definitions

Terminology

Why algorithms/tools in bioinformatics?

Data sources

Definition: Bioinformatics

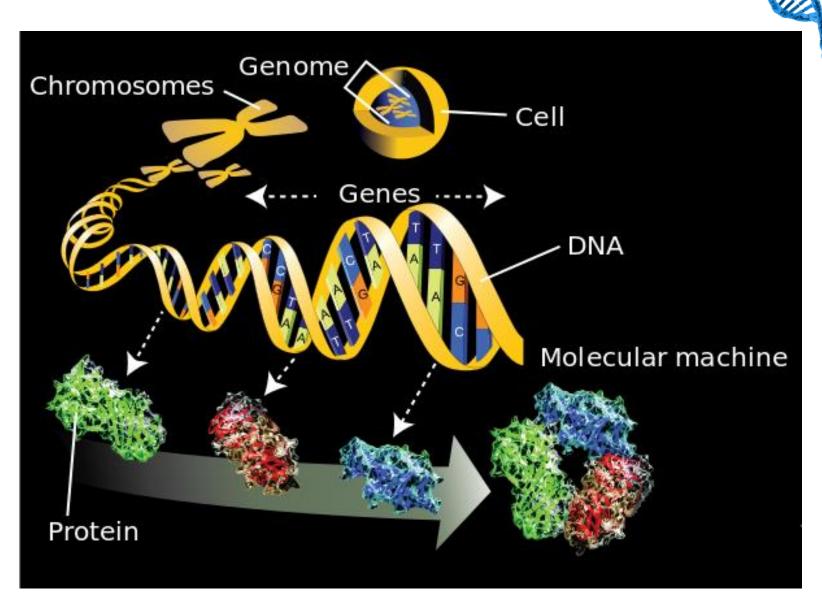
National Human Genome Research Institute (NIH):

"Bioinformatics is a subdiscipline of biology and computer science concerned with the acquisition, storage, analysis, and dissemination of biological data, most often DNA and amino acid sequences.

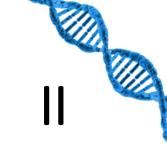
Bioinformatics uses computer programs for a variety of applications, including determining gene and protein functions, establishing evolutionary relationships, and predicting the three-dimensional shapes of proteins."

Terminology

- Genome
- Gene
- Genotype
- Phenotype
- Nucleic Acid
- Proteome
- Protein/Peptides
- Amino Acid







Term	Definition					
Genome	Whole genetic material of an organism					
Gene	Discrete unit of hereditary information located on the chromosomes and consisting of DNA					
Genotype	An individual's collection of genes					
Phenotype	The physical traits of an organism					
Nucleic Acid	= biologic molecules (DNA, RNA) that consists of bases (A, T/U, C, G); they are made of polymers of strings of repeating units; nucleic acids in the cell act to store information and allow organisms to reproduce					

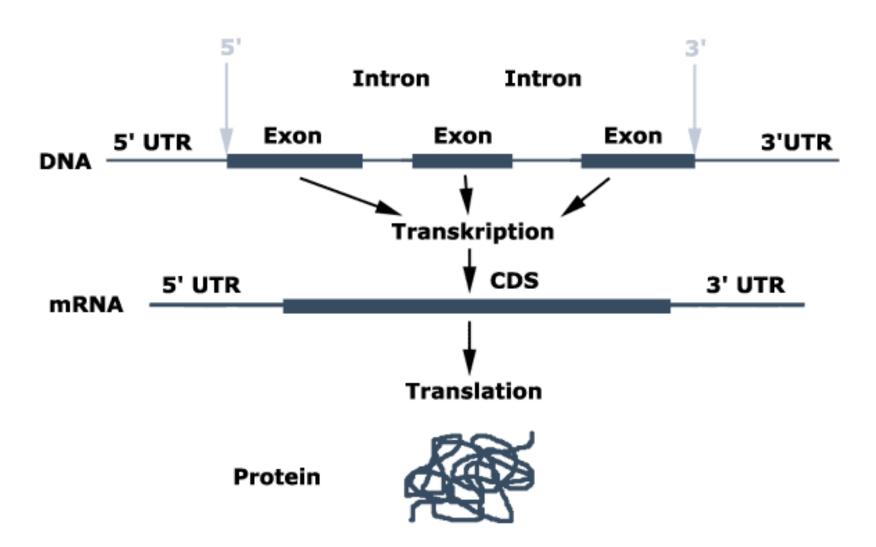


Terminology

Term	Definition
Proteome	Entire set of proteins within an organism
Protein/Peptides	Large biologic molecules which comprise one or more long chains of amino acid residues
Amino Acid	Simple organic compound consisting of an amino group (-NH $_2$) and and acidic carboxyl group (-COOH); 20 (21) different AA



Protein Biosynthesis



Bioinformatics

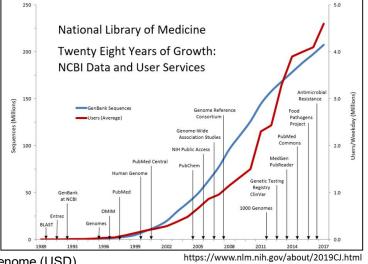
- Implementation and design of algorithms/tools for:
 - Biological data analysis (nt or aa sequence analysis)
 - Knowledge extraction from biological databases
 - Biological data categorization
 - Molecular modelling
 - Protein analysis
 - In-silico drug design



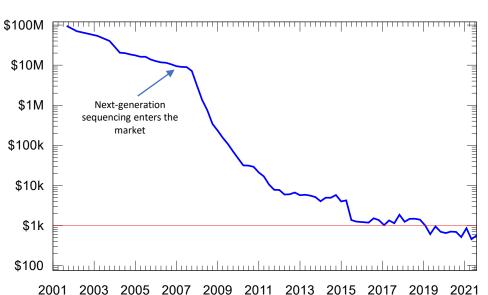
Why algorithms and tools are required?

GenBank Sequences

- Increasing data volume
 - Complete genome sequencing
 - Improved sequencing methods
- Public databases
- Performance possibilities
 - High performance data analytics (HPDA)
 - Big data
 - Cloud as a big data source
- Lower data generation costs



Cost to sequence a human genome (USD)



https://commons.wikimedia.org/wiki/File:Historic cost of sequencing a human genome.svg

Data Sources

• All life depends on 3 critical molecules: DNA, RNA, Proteins

DNA

Nucleic Acid Sequences	Amino Acid Sequences				
Source:DNA & RNA strandsGenes & Gene expressionGenome	Source:Raw AA sequencesProtein/Peptides (spatial information)Proteom				
 Analyses: (Point) Mutations Open reading frame (ORF) Phylogenetic analyses Drug development Primer design 	 Analyses: Missense mutations Protein structure (prediction) Protein-protein interactions Protein-ligand interactions Metabolism models 				
 Virtual translation 	12				

Protein

(2) Standard Datasets and Modern File Formats

Standard File Formats (FASTA, FASTQ, SAM/BAM, VCF, PDB)



- Store nucleotide sequence or amino acid biological information
- First line: >
- Can contain multiple sequences
- No spaces allowed within sequence(s)

FASTA file identifier Label Comment

NucleotideSequence | Proto-oncogene tyrosine-protein kinase ABL1 CONTROLL C

Data lines

Protein

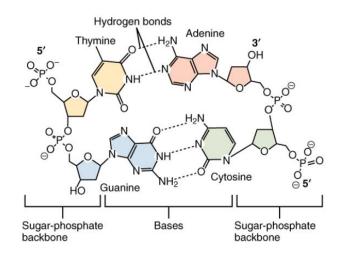
DNA

| Chains A, B|Proto-oncogene tyrosine-protein kinase ABL1|Homo sapiens (9606)
| GAMDPSSPNYDKWEMERTDITMKHKLGGGQYGEVYEGVWKKYSLTVAVKTLKEDTMEVEEFLKEAAVMKEIKHPNLVQLLGVC
| TREPPFYIITEFMTYGNLLDYLREC...KSDVWAFGVLLWEIATYGMSPYPGIDLSQVYELLEKDYRMERPEGCPEKVYELMRAC
| WQWNPSDRPSFAEIHQAFETMFQES

Nucleic Acid Notation: IUPAC Code

- A Adenosine
- C Cytidine
- **G** Guanine
- T Thymidine
- **U** Uridine
- R G or A (purine)
- Y T or C (pyrimidine)
- K G or T (keto)
- M A or C (amino)

- S C or G (strong)
- W A or T (weak)
- **B** G or T or C
- **D** G or A or T
- H A or C or T
- V G or C or A
- N A or G or C or T
- Gap

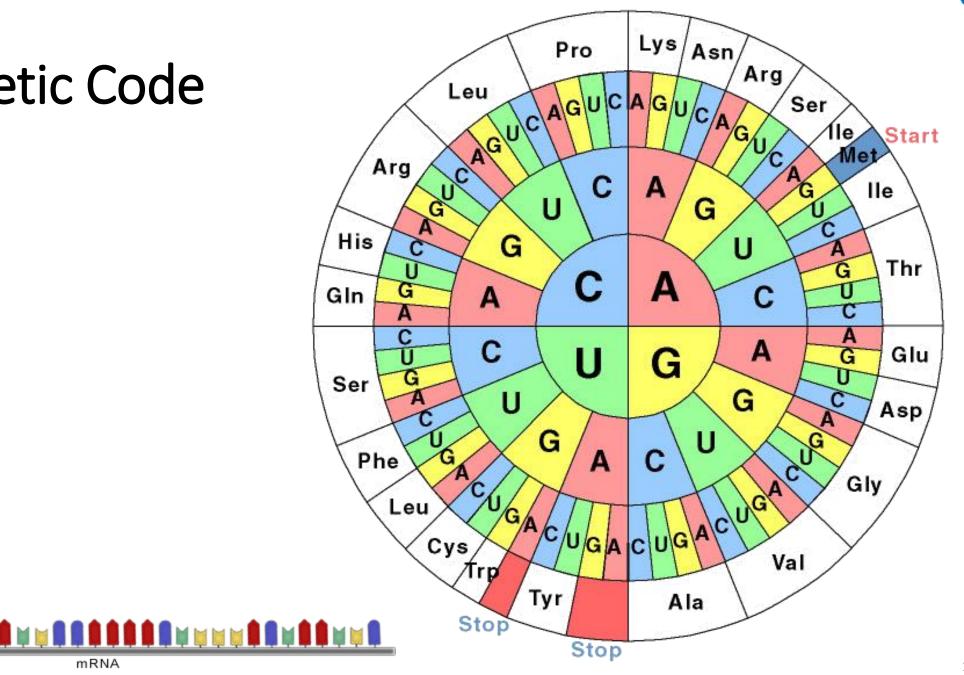


Amino Acid Notation: IUPAC Code

- A Alanine
- B Aspartate/Asparagine
- **C** Cystine
- D Aspartate
- **E** Glutamate
- F Phenylalanin
- **G** Glycin
- **H** Histidine
- l Isoleucine
- **K** Lysine
- **L** Leucine
- M Methionine
- N Asparagine

- P Proline
- **Q** Glutamine
- P Arginine
- Serine
- T Threonine
- **U** Selenocysteine
- V Valine
- W Tryptophan
- Y Tyrosine
- **Z** Glutamate/Glutamine
- X any
- * Translation stop
- Gap

Genetic Code





- Store **nucleotide sequence** biological information with **their quality** (Quality Score)
- First line: @
- Can contain multiple sequences
- Blocks are called "Reads"
- No spaces allowed within sequence(s)

FASTQ file identifier

Label

Comment

NucleotideSequence | Proto-oncogene tyrosine-protein kinase ABL1

Data lines

CACGGACATCACCATGAAGCACAAGCTGGGCGGGGGCCAGTACGGGG...TTGATGACAGGGGACACCTACACAGCCCATGCTGG`AGCCAAGTTCCCCATCAAATGGACTGCACC

Phred Quality Score

Phred Quality Score

 = a measure of the quality of the identification of the nucleobases generated by automated DNA sequencing

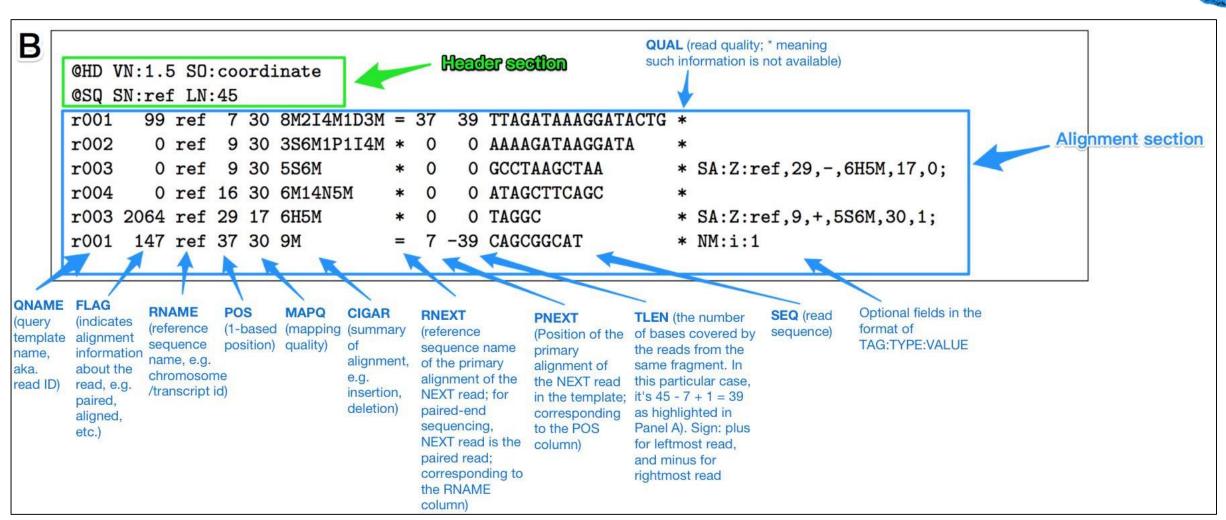
Phred Quality Score	Probability of incorrect base call	Base call accuracy
10	1 in 10	90%
20	1 in 100	99%
30	1 in 1000	99.9%
40	1 in 10,000	99.99%
50	1 in 100,000	99.999%
60	1 in 1,000,000	99.9999%

- Conversion:
 - Based on ASCII code (ASCII_BASE 33 (or ASCII_BASE 64))

ASCII_BASE=33 Illumina, Ion Torrent, PacBio and Sanger											
Q	P_error	ASCII	Q	P_error	ASCII	Q	P_error	ASCII	Q	P_error	ASCII
0	1.00000	33 !	11	0.07943	44 ,	22	0.00631	55 7	33	0.00050	66 B
1	0.79433	34 "	12	0.06310	45 -	23	0.00501	56 8	34	0.00040	67 C
2	0.63096	35 #	13	0.05012	46 .	24	0.00398	57 9	35	0.00032	68 D
3	0.50119	36 \$	14	0.03981	47 /	25	0.00316	58 :	36	0.00025	69 E
4	0.39811	37 %	15	0.03162	48 0	26	0.00251	59 ;	37	0.00020	70 F
5	0.31623	38 €	16	0.02512	49 1	27	0.00200	60 <	38	0.00016	71 G
6	0.25119	39 '	17	0.01995	50 2	28	0.00158	61 =	39	0.00013	72 H
7	0.19953	40 (18	0.01585	51 3	29	0.00126	62 >	40	0.00010	73 I
8	0.15849	41)	19	0.01259	52 4	30	0.00100	63 ?	41	0.00008	74 J
9	0.12589	42 *	20	0.01000	53 5	31	0.00079	64 @	42	0.00006	75 K
10	0.10000	43 +	21	0.00794	54 6	32	0.00063	65 A			

3. SAM/BAM

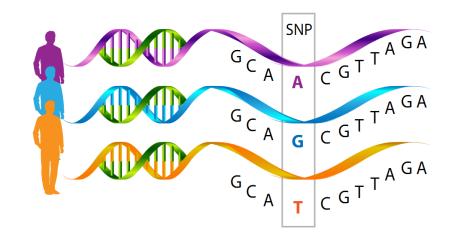
- SAM = Sequence Alignment/Map
- BAM = Binary Alignment/Map
- text-based format for storing biological sequences aligned to a reference sequence



http://zyxue.github.io/2017/09/26/sam-format-example.html

4. VCF

- = Variant Call Format
- Store gene sequence variations
 - SNVs = Single nucleotide variants
 - SNPs = Single-nucleotide polymorphisms
 - Insertions
 - Deletions
 - Mismatches



##fileforr	mat=VCFv4.0													
##fileDat	##fileDate=20110705													
##refere	##reference=1000GenomesPilot-NCBI37													
##phasin	##phasing=partial													
##INFO=	##INFC= <id=ns,number=1,type=integer,description="number data"="" of="" samples="" with=""></id=ns,number=1,type=integer,description="number>													
##INFO=	##INFO= <id=dp,number=1,type=integer,description="total depth"=""></id=dp,number=1,type=integer,description="total>													
##INFO=	= <id=af,number=< th=""><th>.,Type=Float,</th><th>Description=</th><th>="Allele Frequen</th><th>cy"></th><th></th><th></th><th></th><th></th><th></th><th></th></id=af,number=<>	.,Type=Float,	Description=	="Allele Frequen	cy">									
##INFO=	= <id=aa,number=< th=""><th>:1,Type=Strin</th><th>g,Descriptio</th><th>n="Ancestral Alle</th><th>ele"></th><th></th><th></th><th></th><th></th><th></th><th></th></id=aa,number=<>	:1,Type=Strin	g,Descriptio	n="Ancestral Alle	ele">									
	##INFO= <id=db,number=0,type=flag,description="dbsnp 129"="" build="" membership,=""></id=db,number=0,type=flag,description="dbsnp>													
	##INFO<(ID=H2,Number=0,Type=Flag,Description="HapMap2 membership">													
	##FILTER= <id=q10, description="Quality below 10"></id=q10,>													
	##FILTER= <id=s50,description="less 50%="" data"="" have="" of="" samples="" than=""></id=s50,description="less>													
##FORMAT= <id=gq,number=1,type=integer,description="genotype quality"=""></id=gq,number=1,type=integer,description="genotype>														
##FORMAT= <id=gt,number=1,type=string,description="genotype"></id=gt,number=1,type=string,description="genotype">														
	##FORMAT= <id=dp,number=1,type=integer,description="read depth"=""> ##FORMAT=<id=hq,number=2,type=integer,description="haplotype quality"=""></id=hq,number=2,type=integer,description="haplotype></id=dp,number=1,type=integer,description="read>													
			-											
#CHRON		ID	REF	ALT	QUAL	FILTER	INFO	FORMAT	Sample1	Sample2	Sample3			
2	4370	rs6057	G	A	29		NS=2;DP=13;AF=0.5;DB;H2			1 0:48:8:51,51				
2	7330		T	A	3	q10	NS=5;DP=12;AF=0.017		0 0:46:3:58,50		0/0:41:3			
2	110696	rs6055	A	G,T	67	PASS	NS=2;DP=10;AF=0.333,0.667;AA=T;DB		• •		2/2:35:4			
2	130237 134567		T GTCT	C CTACT	47	PASS	NS=2;DP=16;AA=T			0 0:48:4:56,51				
		microsat1	G	G,GTACT	50	PASS	NS=2;DP=9;AA=G	GT:GQ:DP	0/1:35:4	0/2:17:2	1/1:40:3			
chr1 chr1	45796269 45797509		C	C G										
chr1	4579855		T	С										
chr1	4579890:		C	T										
chr1	4580556		G	c										
chr2	47703379		C	T										
chr2	4801048		G	A										
chr2	4803083		A	T										
chr2	4803287		CTAT	-										
chr2	4803293		T	С										
chr2	4803327	3.	TTTTTGT	TTTA-										
chr2	4803355	1.	С	G										
chr2	48033910	0.	Α	Т										
chr2	21563204	8.	G	Т										
chr2	21563212	5.	TT	-										
chr2	21563215	5 .	Т	С										
chr2	21563219	2 .	G	Α										
chr2	21563225	5.	CA	TG						22				
chr2	21563405	5 .	С	T						22				

5. PDB

• = Protein Data Bank (pdb) file format

Textual file format describing three-dimensional structures of

molecules of the pdb



Hands-on...

Modern File Formats

Quality control

File conversion tools



Tools

- FastQC: https://www.bioinformatics.babraham.ac.uk/projects/fastqc/
- IGV: https://software.broadinstitute.org/software/igv/download
- PyMol: https://pymol.org/2/
- Galaxy: https://usegalaxy.org/
- samtools: http://www.htslib.org/download/

Algorithms and Tools in Bioinformatics

Data, Tools and Technologies in Bioinformatics

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Course Content

- (1) Overview
- (2) Standard Datasets/Modern File Formats
- (3) Databases/Platforms
- (4) Data (Pre-) Processing
- (5) Tools
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(3) Standard Databases

Institutions

Database Types



Institutions

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



EMBL-EBI: https://www.ebi.ac.uk/



Sanger Center: https://www.sanger.ac.uk/



Swiss Institute of Bioinformatics: https://www.sib.swiss/



DDBJ: https://www.ddbj.nig.ac.jp



etc.



Institutions: NCBI

- National Center for Biotechnology Information
- Department of the "National Library of Medicine" (NLM) at the "National Institute of Health" (NIH)
- Founded: 1988
- Tasks:
 - U.S. national resource for molecular biology information
 - Creating public databases
 - Conducts research in computational biology
 - Developing software for analyzing genome data
 - Disseminating biomedical information

Institutions: NCBI

• Databases:

- **PubMed** (Literature)
- OMIM (Online Mendelian Inheritance in Man)
- Taxonomy Browser
- GenBank
- SNP
- MMDB (Molecular Modeling Database)
- UniGene (Unique Human Gene Sequence Collection)
- Gene Expression Omnibus (GEO)

Institutions: NCBI

• Tools:

- Basic Local Alignment Search Tool (BLAST)
- Open Reading Frame Finder (ORFfinder)
- 1000 Genome Browser
- CDTree



Institutions: EMBL

- European Molecular Biology Laboratory
- Founded: 1974
- 21 + 3 + 2 Countries (Europe, Israel, Argentina, Australia)
- 5 main departments:
 - Heidelberg (D)
 - Hamburg (D)
 - Grenoble (F)
 - Hinxton (UK)
 - External "Research Programs" in Monterotondo (I)

Institutions: EMBL

- Main Tasks:
 - Basic research in molecular biology
 - Service provider for scientists in member states
 - Training provider for employees, students and visitors
 - Development of new methods for research
- Tools:
 - BLAST
 - Clustal Omega (multiple sequence alignment tool)
- Databases:
 - EMBL-ENA
 - Ensembl
 - Protein Data Bank (PDB)
 - ArrayExpress
 - UniProt
- EBI (European Bioinformatics Institute)

Institutions: Sanger Center

- = Wellcome Trust Sanger Institute
- Research center by Wellcome Genome Campus in Hinxton (UK)
- Main Tasks:
 - Mapping and sequencing of genomes
 - 1998: whole genome of *C. elegans*
 - Participation Human genome project



Database Types: based on <u>Source</u> Types

Primary Databases:

- = archival databases
- Store experimental results submitted by scientists
 - Sequencing data
 - Macromolecule structure
- Data have accession numbers
- e.g.: Protein Data Bank (PDB), GenBank, EMBL-EBI Nucleotide Sequence Database (EMBL-ENA), DNA Data Bank of Japan (DDBJ)

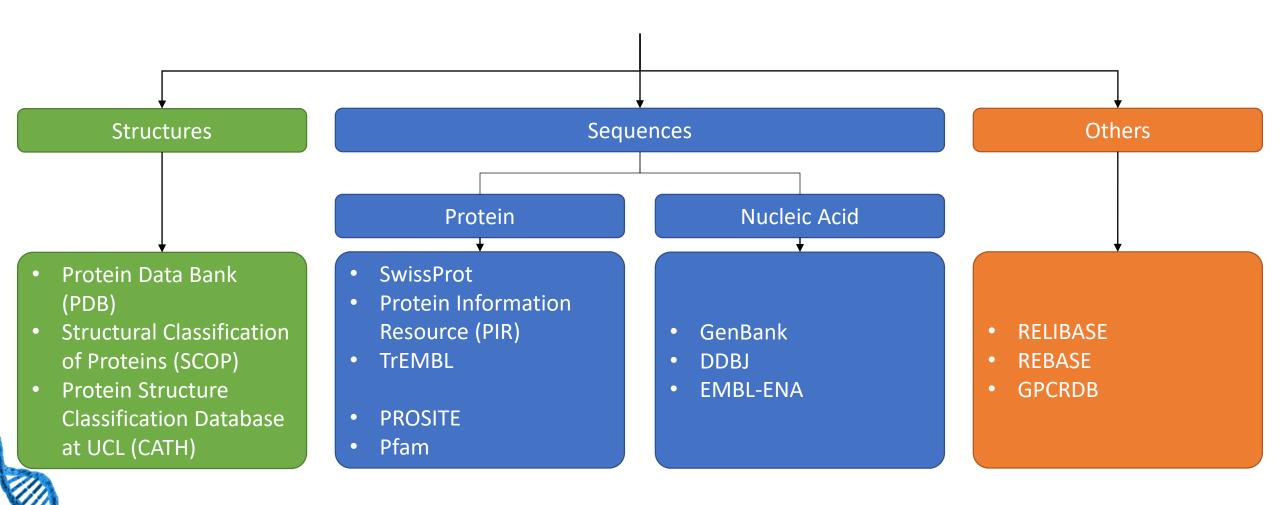
Secondary Databases:

- Analyzed results of primary databases -> computational algorithms have been applied
- Contain more valuable knowledge
- e.g.: UniProt Knowledgebase, InterPro

Composite Databases:

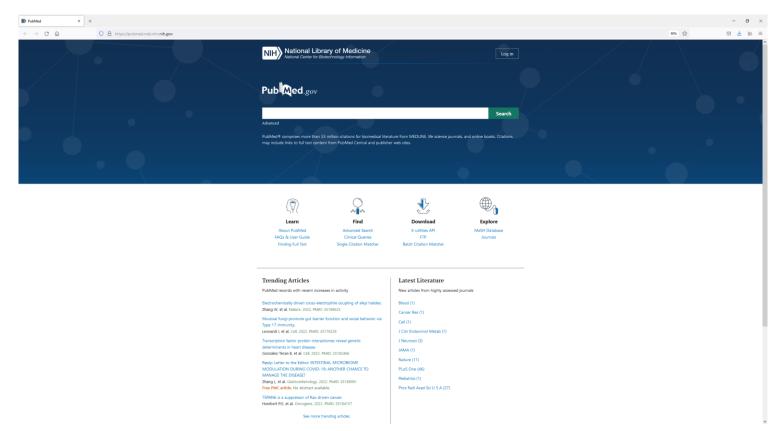
- Data is filtered and compared before
- Data is taken from primary database and then merged together
- BioGPS, OWL, NRDB, BioSilico

Database Types: based on <u>Data</u> Types



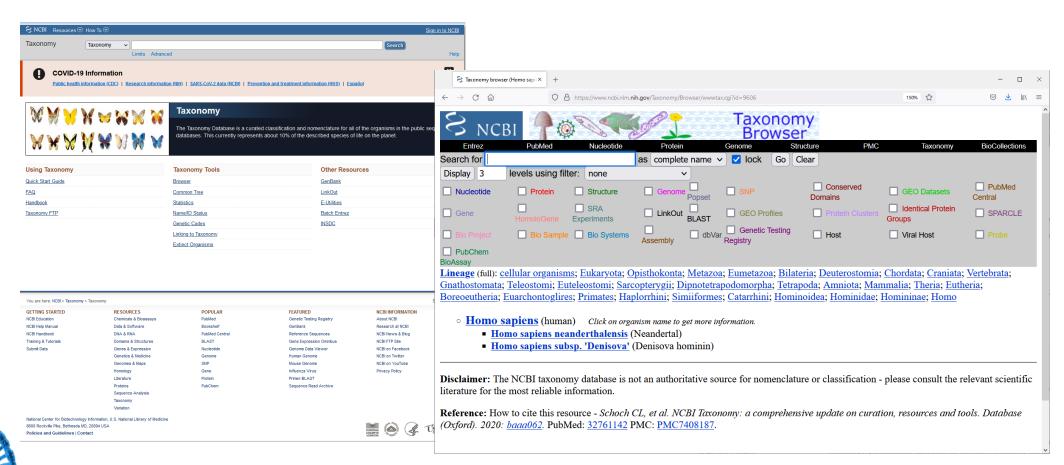
1. Bibliographic Databases

- NCBI PubMed: http://www.ncbi.nlm.nih.gov/PubMed/
- Google Scholar: https://scholar.google.com/



2. Taxonomic Databases

NCBI – Taxonomy: https://www.ncbi.nlm.nih.gov/taxonomy



3. Nucleic Acid Databases

- NCBI GenBank: https://www.ncbi.nlm.nih.gov/genbank/
- EMBL-ENA: https://www.ebi.ac.uk/ena/browser/
- DNA Data Bank of Japan (DDBJ): https://www.ddbj.nig.ac.jp/index-e.html
- NDB: http://ndbserver.rutgers.edu/

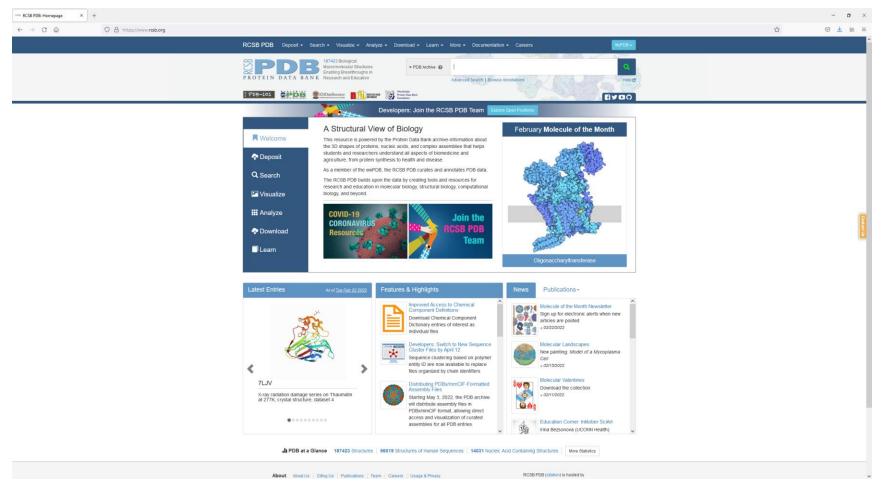


4. Genome Databases

- Gene Expression Omnibus (GEO): https://www.ncbi.nlm.nih.gov/geo/
- EMBL-EBI ArrayExpress: https://www.ebi.ac.uk/arrayexpress/
- Ensemble: http://www.ensembl.org/index.html
- NCBI Genome: https://www.ncbi.nlm.nih.gov/genome/
- NCBI dbVAR: https://www.ncbi.nlm.nih.gov/dbvar
- NCBI dbSNP: https://www.ncbi.nlm.nih.gov/snp/
- 1000Genomes: http://ftp.1000genomes.ebi.ac.uk/vol1/ftp/

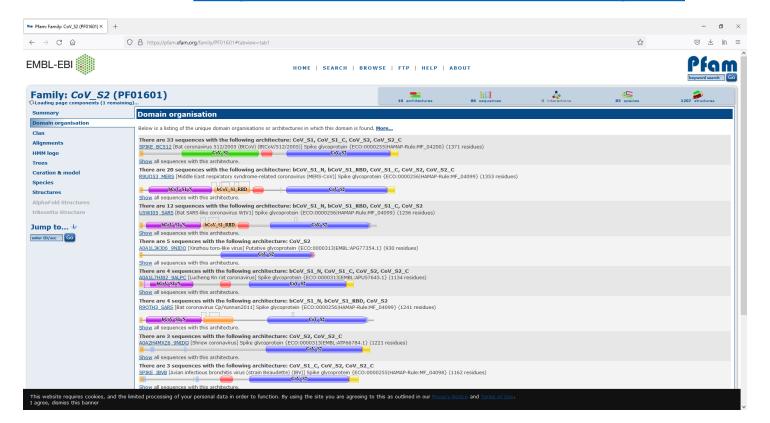
5. Protein Structure Databases

RSCB Protein Data Bank (PDB): https://www.rcsb.org/



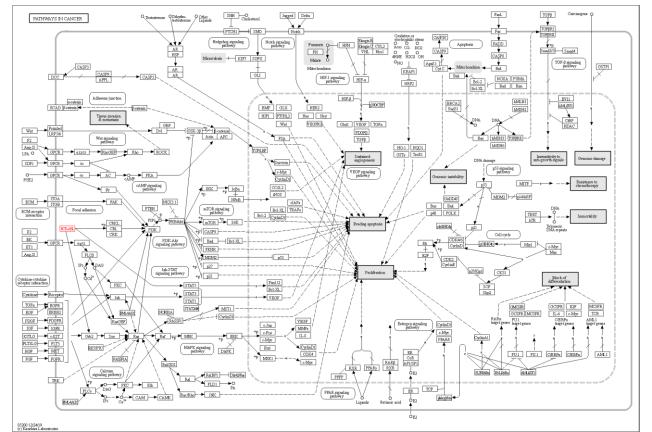
6. Protein Families, Domains, Functionality

- PFAM: http://pfam.xfam.org/
- EMBL-EBI InterPro: https://www.ebi.ac.uk/interpro/



7. Enzymes and Metabolic Pathways

- WikiPathways: https://www.wikipathways.org/index.php/WikiPathways
- KEGG: https://www.genome.jp/kegg/



8. ... and many more

- RNA specific databases:
 - Collection of different types of RNA data (e.g., tRNA)
 - e.g., Rfam: https://rfam.xfam.org/
- Cancer databases:
 - Collection of characterized cancer genomic data of different cancer types
 - e.g., The Cancer Genome Atlas (TCGA): https://cancer.gov/about-nci/organization/ccg/research/structural-genomics/tcga or Catalogue Of Somatic Mutations In Cancer (COSMIC): https://cancer.sanger.ac.uk/cosmic
- Phenotype databases
- Immunological databases
- Plant databases

• ..

Summary

	Database	Description	Examples
1.	Bibliographic Database	Collection of published literature such as journal and newspaper articles, conference proceedings, (case) reports, books etc.	PubMed, Google Scholar
2.	Taxonomic Database	Provides information about biological taxa – groups by species name. Important for biodiversity analyses.	NCBI Taxonomy
3.	Nucleic Acid Database	Provides sequencing data in FASTA and FASTQ file format – can be split into DNA and RNA databases	GenBank, EBI-ENA, DDBJ
4.	Genome Database	Collection of genome sequences – mostly annotated and analyzed	GEO, ArrayExpress, Ensembl
5.	Protein Structure Database	Collection of protein structure information	PDB
6.	Protein Families, Domains, Functionality	Provides information about (distant) protein relationships and for protein function analysis	InterPro, Pfam
7.	Enzymes and Metabolic Database	Database for understanding biological systems and pathways	Kegg, WikiPathways

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(4) Data (Pre-) Processing

"Real-Life" Examples:

Population Genetics

NGS Data

Genome Data

Protein Data



Most important...

... know your data!

... know the research question!



"Real-Life" Example I



Research Area: Genomics

Research Focus: Population genetics

Research Question:

"We have the following primer sequences:

GTGAAAAGCAAGGTCTACCAG and GACACCGAGTTCATCTTGAC. We want to find a so-called *Alu* sequence within the PLAT gene. Are the primers suitable for this problem?"

"Real-Life" Example I - Questions

- 1) What is the **PLAT gene**?
- 2) What (the hell) is a *Alu* sequence?
- 3) What are **primers**?
- 4) Where do the primers bind?
- 5) Evaluation: Is the desired *Alu* sequence covered by using these primers?



1) PLAT Gene

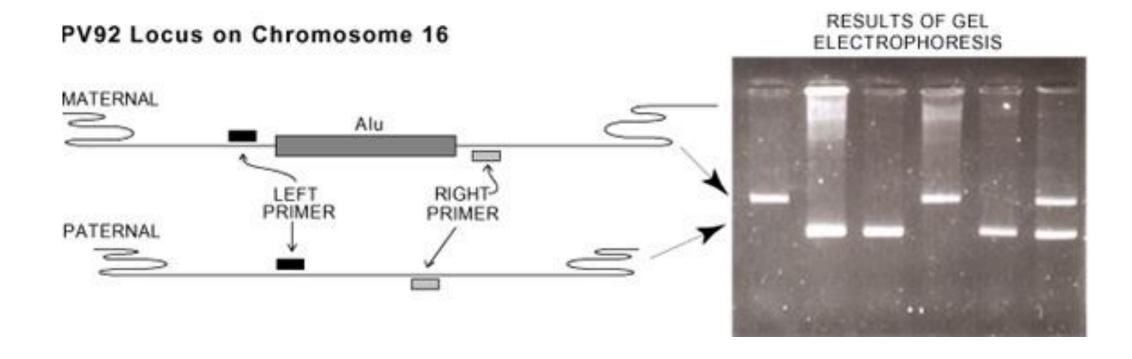
OMIM: https://www.omim.org/

- Gene:
- Location:
- Intron or Exon:
- Population genetics:

- ✓ PLASMINOGEN ACTIVATOR, TISSUE; PLAT
- ✓ Chromosome 8
- ✓ Intron 8
- ✓ insertion/deletion polymorphism of a 311-bp Alu sequence

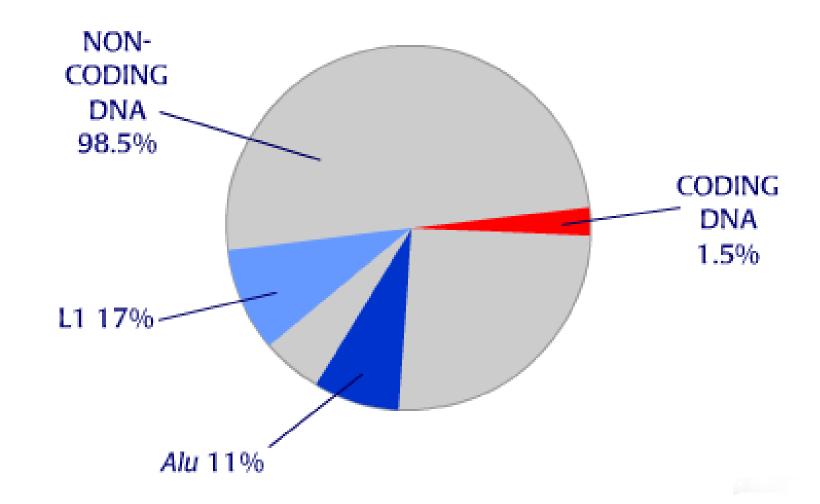
1) PLAT Gene





2) Alu Sequence





2) Alu Sequence





Alu Elements

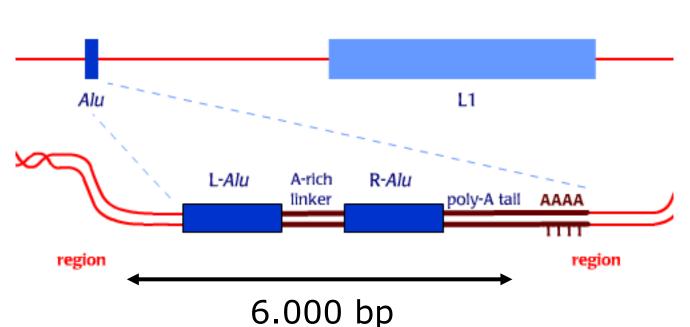
The Alu sequence family (name in humans (over a million copie polymerase III promoter. Transp Year introduced: 1999

PubMed search builder options

Subheadings:

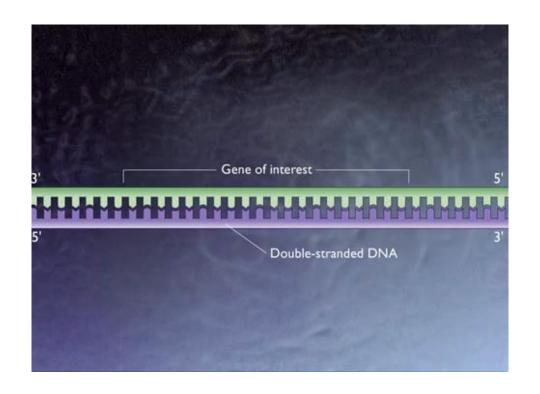
drug effects

etiology



repeat element ns an RNA diseases.

3) Primer





4) Primer Analysis

In-Silico PCR: https://genome.ucsc.edu/cgi-bin/hgPcr

Ensembl: https://www.ensembl.org/Multi/Tools/Blast?db=core

• Hits: ✓ 2 & 1

• Melting temperature: ✓ 56,6 °C & 55,4 °C

eLearning Task

```
# 1. go to: https://www.omim.org/ and search for PLAT
# 2. choose "Plasminogen Activator, Tissue; PLAT"
# 3. click on "DNA" and navigate to "Ensembl (MANE Select)"
# 4. click on "Download sequence" > "Preview" > search (CTRL+F) for "Intron 8" > copy the sequence to file (or as string to python
     script)
# 5. close this window and click on "Show transcript table" > click on "NM 000930.5" > you can see all genetic relevant
     information about the PLAT gene
# 6. search next to "Nucleotide" for "PLAT Alu sequence" in NCBI Nucleotides > select first entry (GenBank: K03021.1)
# 7. download FASTA sequence (use "Send to" + "File" + "FASTA" + "Create File") > save as "PLATwithALUsequence.fasta"
# 8. process raw sequences and extract sequence between primers: GTGAAAAGCAAGGTCTACCAG and GACACCGAGTTCATCTTGAC
     Hint: remember DNA strands - you won't find the second primer if you don't use the reverse complementary
           version: GTCAAGATGAACTCGGTGTC
# 9. go to https://dotlet.vital-it.ch/ > add both sequences > take a screenshot
# 10. go to https://www.ebi.ac.uk/jdispatcher/psa/emboss needle > enter the two sequences > submit
# 11. Note the following parameters: Number of Gaps, Alignment Score, Start position of the Gap
# 12. (optional) search for ORFs (using ORFfinder: https://www.ncbi.nlm.nih.gov/orffinder/) > insert
      sequence with Alu > how many ORFs are found?
# 13. (optional) go to https://alfred.med.yale.edu/ and enter PLAT > choose "Plasminogen
      activator, tissue"
```

> select "TPA25 Alu insertion" > click on "Frequency Display Formats: Graph"

> learn something about human migration ;)