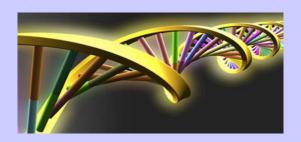


# Introduction to Bioinformatics

**Ulf Leser** 

#### **Bioinformatics**

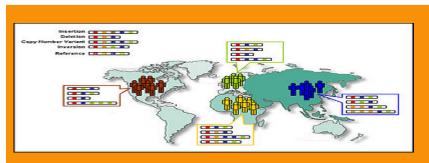


25.4.1953 Entdeckung der Doppelhelix durch Watson/Crick + Wilkins/Franklin





14.4.2003 Humanes Genom zu ~95% sequenziert mit ~99% Genauigkeit



2010 1000 Genomes Project

## Example: Int. Cancer Genome Cons.



Planned for 50 different

- Cancer types are
- First federate project [HAA+08]

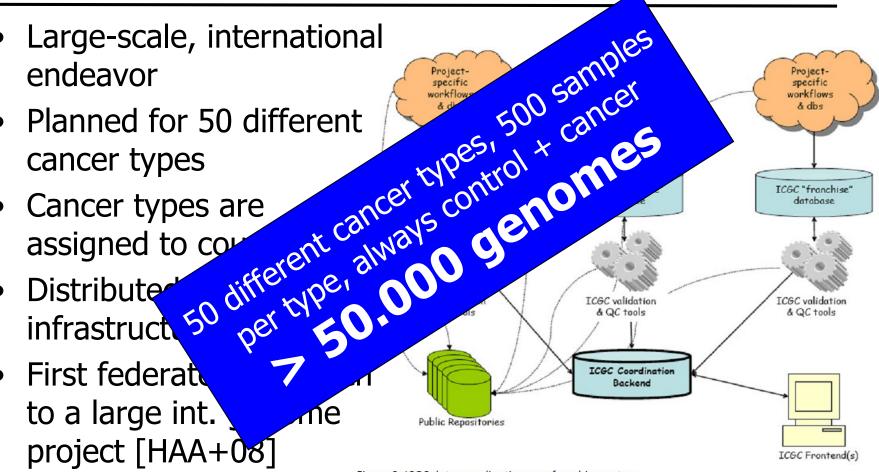
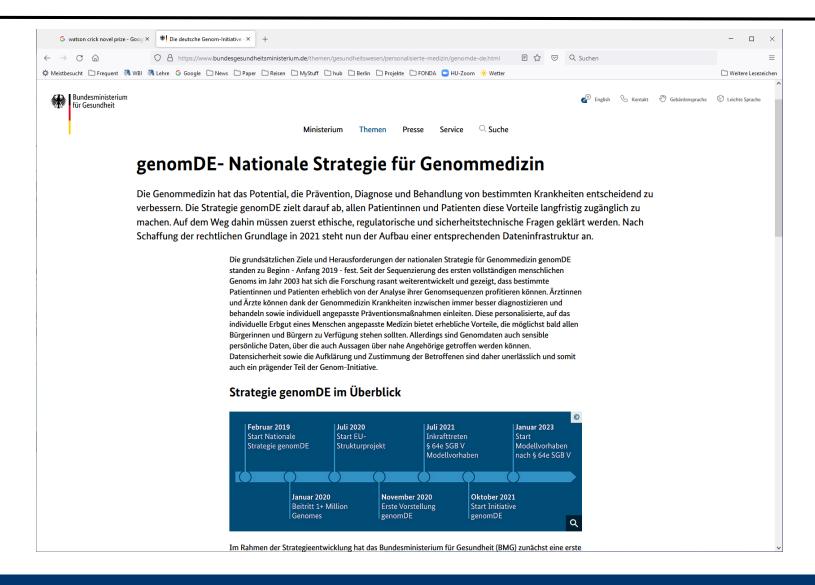
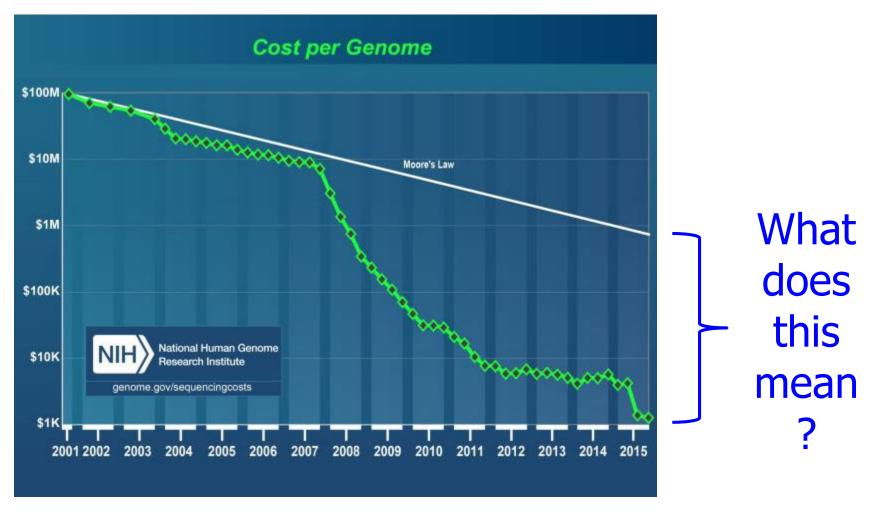


Figure 2: ICGC data coordination as a franchise system

### 2022: Deutschland



## Possible Through Cost Reduction



http://www.genome.gov

## Things you can do with it

- 2002
  - 2 companies
  - 32 Tests
  - Price: 100-1400€

	10			
	Tabelle  Gentests, die im Internet in Deuts	chland l	pestellbar sind (Stand: Juli 2002)	
	Indikation*	Anbieter**	Untersuchungsgegenstand	Preis (inkl. MwSt.)
	Alkoholverträglichkeit	2	keine Angaben (k. A.)	207,79 €
	Alzheimer	2	k. A.	134,06 €
	Alzheim "	1	E4-Allel des Apolipoprotein-E-Gens auf Chromosom 10	650,00 €
	Angelman-Syndrom <sup>21</sup>	1	Deletion auf dem Chromosom 15	850,00 €
	Anti-Aging-Risikoprofil	2	k. A.	653,61 €
J	Arteriosklerose/Herzinfarkt/Schlagapf	2	k. A.	512,81 €
	The state of the s	1	31 Mutationen einschließlich einer 5T-Variante auf dem CFTR-Gen auf dem Chromosom 7	850,00 €
	Bluthochdruck	2	k. A.	127,40 € 439,24 €
	hatas Typ	2	k. A.	127,40 € 194,39 €
	Dickdarmkrebs <sup>₃i</sup>	1	MLH1- und MSH2-Mutationen	1600,00 €
	Entgiftungsfähigkeit	2	k. A.	811,10 €
	Faktor V Leiden-Mutation	1	Gerinnungsfaktor-V auf dem langen Arm von Chromosom 1	400,00 €
	Familiäre Hypercholesterinämie	1	Mutationen im Low-Density-Lipoprotein-Rezeptor-Gen und im Exon 26 Apolipoprotein-B-Gen	850,00 €
	Familiäre Hyperlipoproteinämie Typ III	1	E2-Allel des Apolipoprotein-E-Gens auf Chromosom 19	500,00 €
	Familiärer Brustkrebs ®	1	BCRA1- und BCRA2-Mutationen	1400,00 €
	Fettgen/Adipositas	2	k. A.	241,35 € 576,44 €
	Fettstoffwechsel/Cholesterin	2	k. A.	395,48 €
	Fragiles X-Syndrom <sup>4</sup>	1	FMR1-(fragile X mental retardation-)Gen des X-Chromosoms (Region Xq27.3)	950,00 €
	Hämochromatose	2	k. A.	207,84 €
	Hämochromatose	1	Austausch der DNS-Basen Guanin zu Adenin an der Position 845 und von Cytosin zu Guanin an der Position 187 des HFE-Gens auf dem Chromosom 6	500,00 €
	Hyperhomocysteinämie	1	k. A.	550,00 €
	Mukoviszidose (Cystische Fibrose)	1	Mutation eines Gens auf Chromosom 7	850,00 €
	Muskeldystrophie	1	Deletionen (Verlust von DNA-Teilsequenzen) im Dystrophin-Gen auf dem X-Chromosom	850,00 €
	Osteoporose	2	k. A.	103,89 € 191,01 €
	Osteoporose	1	Mutation (Basenaustausch von Guanin zu Thymin) im Intron 1 des Kollagen Typ I Alpha 1-Gens	650.00 €
	Ovarialkarzinom <sup>®</sup>	1	BCRA1- und BCRA2-Mutationen	850,00 €
	Persönliches Ernährungsprofil	2	k. A.	841,32 €
	Prader-Willi-Syndrom	1	Deletion oder Translokation auf dem langen Arm des Chromosoms 15 (15q11)	850,00 €
	Prothes	1	Austausch der DNS-Basen Guanin zu Adenin an der Position 20210 des Prothrombingens auf dem Chromosom 11	550,00 €
	Risiko Alkohol- und Drogenabhängigkeit	2	k. A.	274,86 €
	Thrombose	2	k. A.	134,06 €

## Situation Today

- Precision oncology: Determine therapies depending on molecular characterization of an individual patient
- Tumors are driven by genomic variants ("mutations")
- Different variants different prognosis & treatment
- Targeted therapies: Drugs whose applicability depend on the presence / absence of certain variants
  - 1/3 if all new anti-cancer drugs in 2019 (FDA)
  - 90% of all current late-stage anti-cancer drugs in developments

## This Lecture

- Formal stuff
- A very short introduction in Molecular Biology
- What is Bioinformatics?
  - And an example
- Topics of this course

#### This course

- Bachelor computer science, Wahlpflichtbereich
- 5 SP, lecture / exercises are 2+2
- We assume 4<sup>th</sup> semester knowledge in computer science
  - Programming, algorithms, complexity
- We do not assume knowledge in biology
- Introductory many topics, often not much depth
  - Visit "Algorithmische Bioinformatik" afterwards ...
- Ask questions! leser (a) informatik.hu ... berlin...

#### **Exercises**

- Taught by Ulf Leser
- There will be 4-5 assignments
- We build teams
- System
  - First week: 2-3 presentations of results of previous assignment and discussion of new assignment
  - Next week: Questions
  - **–** ...
- Group needs to pass all assignments for exam admission

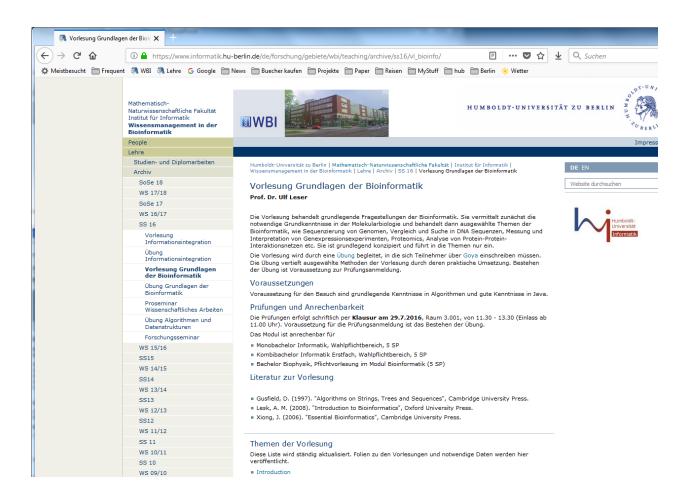
#### Exams

- Written examination
- Dates to be announced
  - July, October

#### Literature

- For algorithms and data structures
  - Gusfield (1997). "Algorithms on Strings, Trees, and Sequences",
     Cambridge University Press
  - Böckenhauer, Bongartz (2003). "Algorithmische Grundlagen der Bioinformatik", Teubner
- For other topics and overviews
  - Lesk (2005/2019). "Introduction to Bioinformatics", Oxford Press
  - Cristianini, Hahn (2007). "Introduction to Computational Genomics A Case Study Approach", Cambridge University Press
  - Merkl, Waack (2009). "Bioinformatik Interaktiv", Wiley-VCH Verlag.
  - Dandekar, Kunz (2017) "Bioinformatik: Ein einführendes Lehrbuch",
     Springer
- For motivation and relaxation
  - Gibson, Muse (2001). "A Primer of Genome Science", Sinauer Associates.
  - Krane, Raymer (2003). "Fundamental Concepts of Bioinformatics", Benjamine Cummings.

#### Web Side



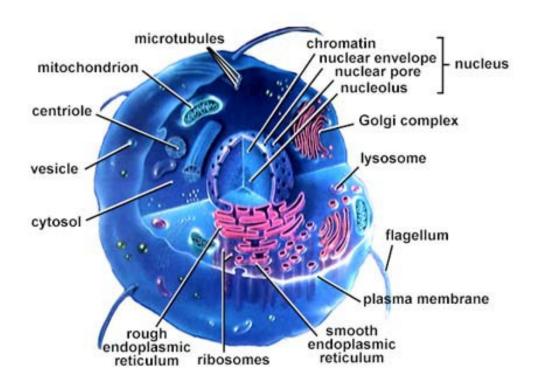
## My Questions

- Bachelor Informatik?
- Kombibachelor?
- Other?
- Semester?
- Prüfung?
- Spezielle Erwartungen?

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## Cells and Bodies



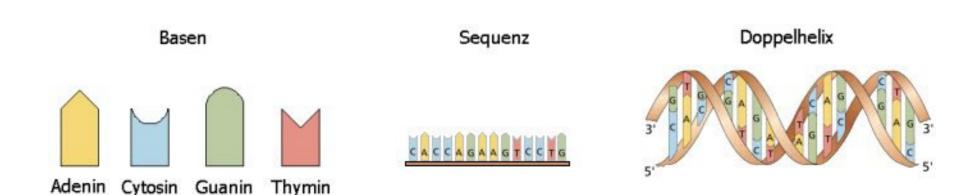
- App. 75 trillion cells in a human body
- App. 250 different types: nerve, muscle, skin, blood, ...

## **DesoxyriboNucleicAcid**



- DNA: Desoxyribonukleinsäure
  - Four different molecules
  - The DNA of all chromosomes in a cell forms its genome
  - All cells in a (human) body carry the same genome
  - All living beings are based on DNA for proliferation
  - There are always always always exceptions

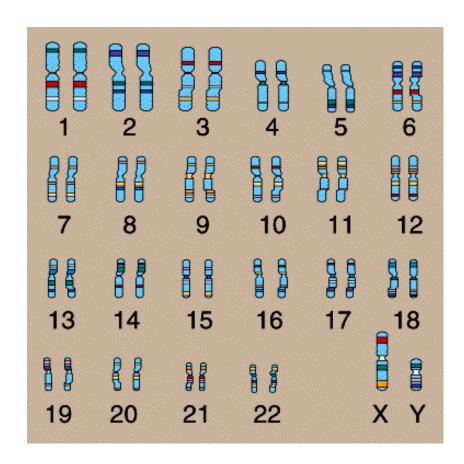
## **DesoxyriboNucleicAcid**



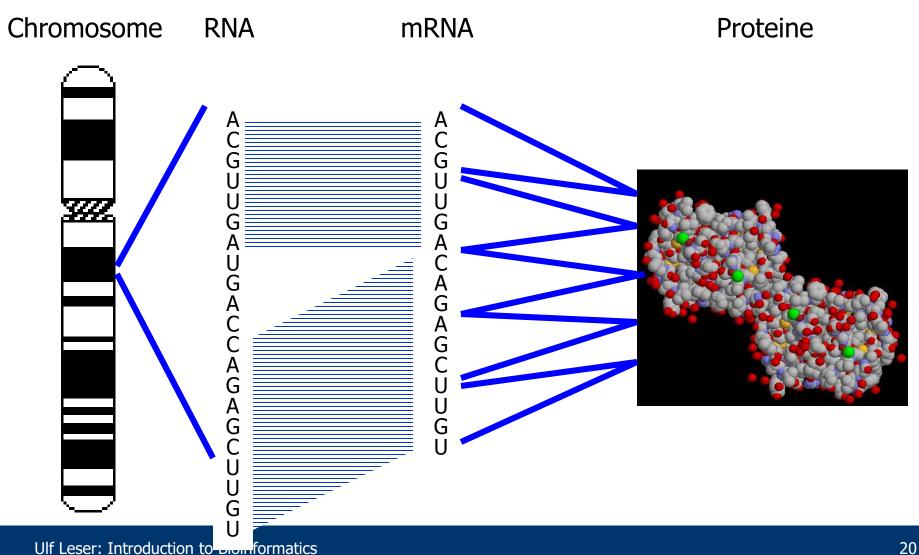
- DNA: Desoxyribonukleinsäure
  - Four different molecules (one replaced in RNA)
  - The DNA of all chromosomes in a cell together with the mitochondria-DNA forms its genome
  - Almost all cells in a (human) body carry almost the same genome
  - All living beings are based on DNA or RNA for proliferation

#### The Human Genome

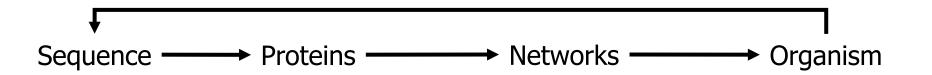
- 23 chromosomes
  - 22 in pairs
- ~3.000.000.000 letters
- ~50% are repetitions of 4 identical subsequences
  - ~100.000 genes
  - ~56.000 genes
  - ~30.000 genes
  - ~24.000 genes —
- ~22.000 genes

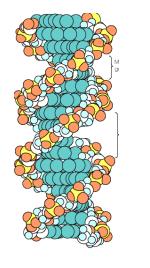


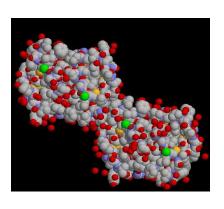
# (Protein-Coding) Genes

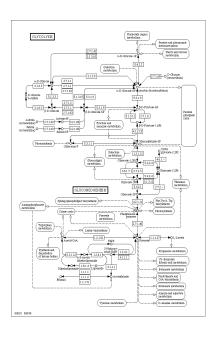


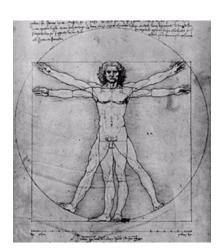
## **Proliferation**



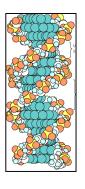


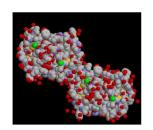


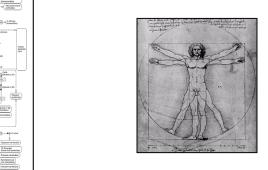




#### This Lecture







Genomics
Sequencing
Gene prediction
Evolutionary
relationships
Motifs - TFBS
Transcriptomics
RNA folding

Proteomics
Structure prediction
... comparison
Motives, active sites
Docking
Protein-Protein
Interaction
Proteomics

Systems Biology
Pathway analysis
Gene regulation
Signaling
Metabolism
Quantitative models
Integrative analysis

Medicine
Phenotype –
genotype
Mutations and risk
Population genetics
Adverse effects

• • •

#### This Lecture

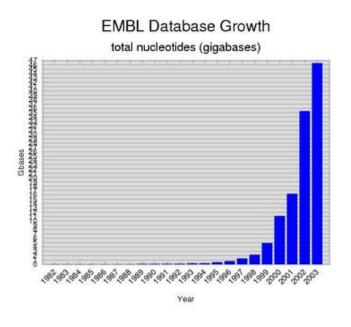
- Formal stuff on the course
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  - And an example
- Topics of this course

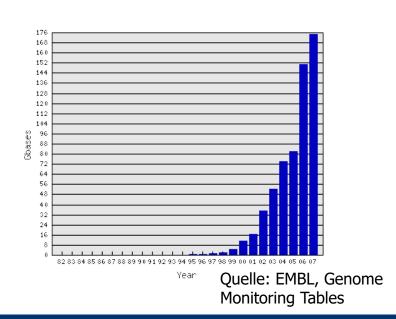
## Bioinformatics / Computational Biology

- Computer Science methods for
  - Solving biologically relevant problems
  - Analyzing and managing experimental data sets
- Empirical: Data from high throughput experiments
- Focused on algorithms and statistics
- Problems are typically complex, data full of errors importance of heuristics and approximate methods
- Strongly reductionist Strings, graphs, sequences
- Interdisciplinary: Biology, Computer Science, Physics, Mathematics, Genetics, ...

## History

- First protein sequences: 1951
- Sanger sequencing: 1972
- Exponential growth of available data since end of 70<sup>th</sup>
  - Bioinformatics is largely data-driven new methods yield new data requiring new algorithms



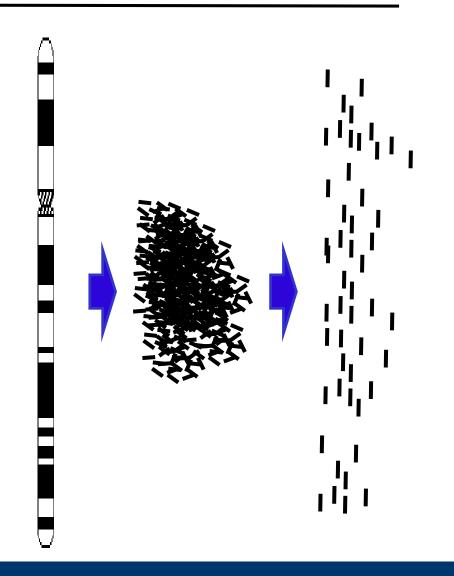


## History 2

- First papers on sequence alignment
  - Needleman-Wunsch 1970, Gibbs 1970, Smith-Waterman 1981,
     Altschul et al. 1990
- Large impact of the Human Genome Projekt (~1990)
- Only 14 mentions of "Bioinformatics" before 1995
- "Journal of Computational Biology" since 1994
- First professorships in Germany: end of 90's
- First university programs: ~2000
- First German book: 2001
- Commercial hype: 1999 2004
- Indispensable for medical research: 2010 –
- Regular sequencing for some cases (cancer): 2016 -

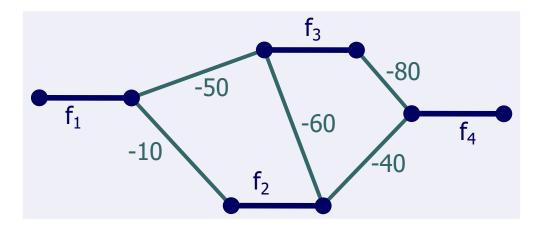
## A Concrete Example: Sequencing a Genome

- Chromosomes (still) cannot be sequenced entirely
  - Instead: Only small fragments can be sequenced
- But: Chromosomes cannot be cut at position X, Y, ...
  - Instead: Chromosomes only can be cut at certain subsequences
- But: We don't know where in a chromosome those subsequences are
  - Sequence assembly problem



#### **Problem**

- Given a large set of (sub)sequences from randomly chosen positions from a given chromosome of unknown sequence
- Assembly: Determine sequence of the original chromosome
  - Everything may overlap with everything to varying degrees
  - Let's forget about orientation and sequencing errors



#### **Abstract Formulation**

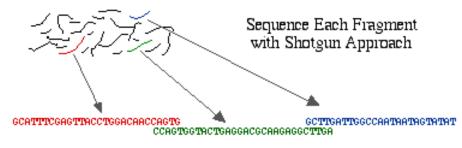
#### SUPERSTRING

- Given a set S of strings
- Find string t such that
  - (a) ∀s∈S: s∈t (all s are substrings of t)
  - (b)  $\forall$ t' for which (a) holds:  $|t| \le |t'|$  (t ist minimal)
- Problem is NP-complete
  - Very likely, there is no algorithm that solves the problem in less than  $k_1*k_22^n$  operations, where  $k_1,k_2$  are constants and n=|S|
- Bioinformatics: Find clever heuristics
  - Solve the problem "good enough"
  - Finish in reasonable time

#### **Dimension**

#### Whole Genome Shotgun Sequencing Method





Align Contiguous Sequences

GCATTTCGAGTTACCTGGACAACCAGTGGTACTGAGGACGCAAGAGGCCTTGATTGGCCAATAATAGTATAT

Generate Finished Sequence

- Whole genome shotgun
  - Fragment an entire chromosome in pieces of 1KB-100KB
- Sequence start and end of all fragments
  - Homo sap.: 28 million reads
  - Drosophila: 3.2 million reads
- Eukaryotes are very difficult to assemble because of repeats
  - A random sequence is easy

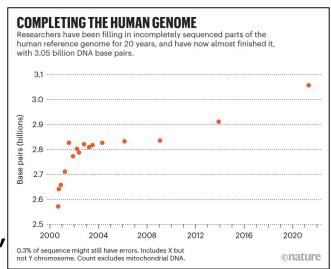
## Why is this "reductionist"?

- Real alphabet is larger: N, AorT, ...
- Errors need not be errors: Humans have two alleles
- Errors are not equally distributed but accumulate at begin / end of read
- Paired-end sequencing
- Substantial parts of a genome cannot be sequenced wholes in the genome
- Why sequence everything when only genes count?
  - Whole genome, whole exome, RNASeq, ...

## Sequencing Today

## A month ago!

- 2003: 1st human reference sequence
  - Continuously refined since then
- Two human genomes are
  - >99% identical
  - And ~98% identical to a mouse genome
- Today: Sequencing by "read mapping"
  - Create reads as before
    - 2<sup>nd</sup> generation: Many more yet shorter reads (~100bp)
    - 3<sup>rd</sup> generation: Much larger reads (15K bp); still highly error prone
  - "Mapping": Find position of reads in reference genome
    - String matching with few errors
  - Much faster and cheaper
  - Cannot detect larger ("structural") variations



Nature, 6/2022

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## Searching Sequences (Strings)

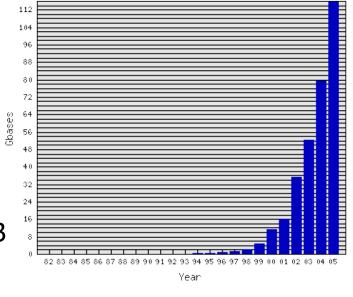
- A chromosome is a string
- Substrings may represent biologically important areas
  - Genes on a chromosome
  - Transcription factor binding sites
  - Similar gene in a different species
  - ...
- Exact or approximate string search

## Searching a Database of Strings

- Comparing two sequences is costly
- Given s, assume we want to find the most similar s' in a database of all known sequences
  - Naïve: Compare s with all strings in DB
  - Will take years and years

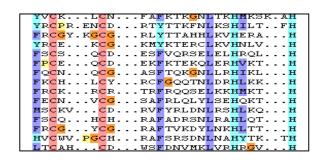


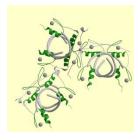
- Ranks all strings in DB according to similarity to s
- Similarity: High is s, s' contain substrings that are highly similar
- Heuristic: Might miss certain similar sequences
- Extremely popular: You can "blast a sequence"



## Multiple Sequence Alignment

- Given a set S of sequences: Find an arrangement of all strings in S in columns such that there are (a) few columns and (b) columns are maximally homogeneous
  - Additional spaces allowed



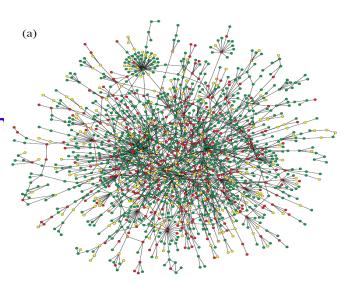


Source: Pfam, Zinc finger domain

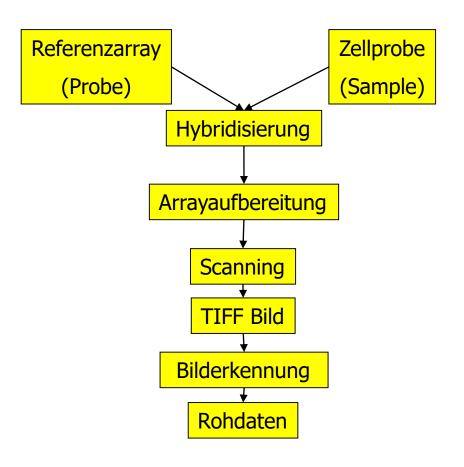
- Goal: Find commonality between a set of functionally related sequences
  - Proteins are composed of different functional domains
  - Which domain performs a certain function?

#### **Protein-Protein-Interactions**

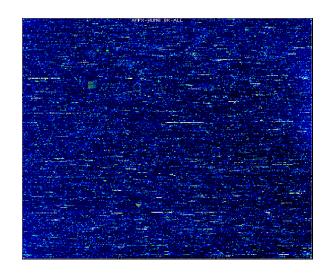
- Proteins do not work in isolation but interact with each other
  - Metabolism, complex formation, signal transduction, transport, ...
- PPI networks
  - Neighbors tend to have similar function
  - Interactions tend to be evolutionary conserved
  - Dense subgraphs (cliques) tend to perform distinct functions
  - Are not random at all



## **Transcriptomics**



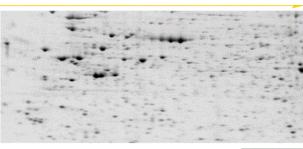




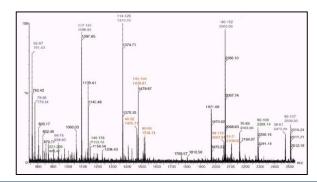
#### **Proteomics**

- The real workhorses in a cell are proteins
  - Differential splicing, post-translational modifications, degradation rates, various levels of regulation, ...
- But: Much more difficult to study (compared to mRNA)
- Separation of proteins
  - 2D page, GC / LC

- Identification of proteins
  - Mass-spectrometry

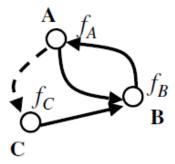


Drug Discovery Today



#### **Network Reconstruction**

- Molecules perform functions by means of interactions
- Regulation: Networks of genes regulating each other
- Reconstruction: Which gene regulates which other genes in which ways?
- One approach: Boolean networks



$$f_A(B) = B$$
  
 $f_B(A, C) = A$  and  $C$   
 $f_C(A) = \text{not } A$ 

Boolean Network