

Alignment of biological sequences

INSA 2010-2011

Laurent Duret

Laboratoire de Biométrie et Biologie Evolutive (CNRS, INRIA), Université de Lyon

<http://pbil.univ-lyon1.fr/alignment.html>

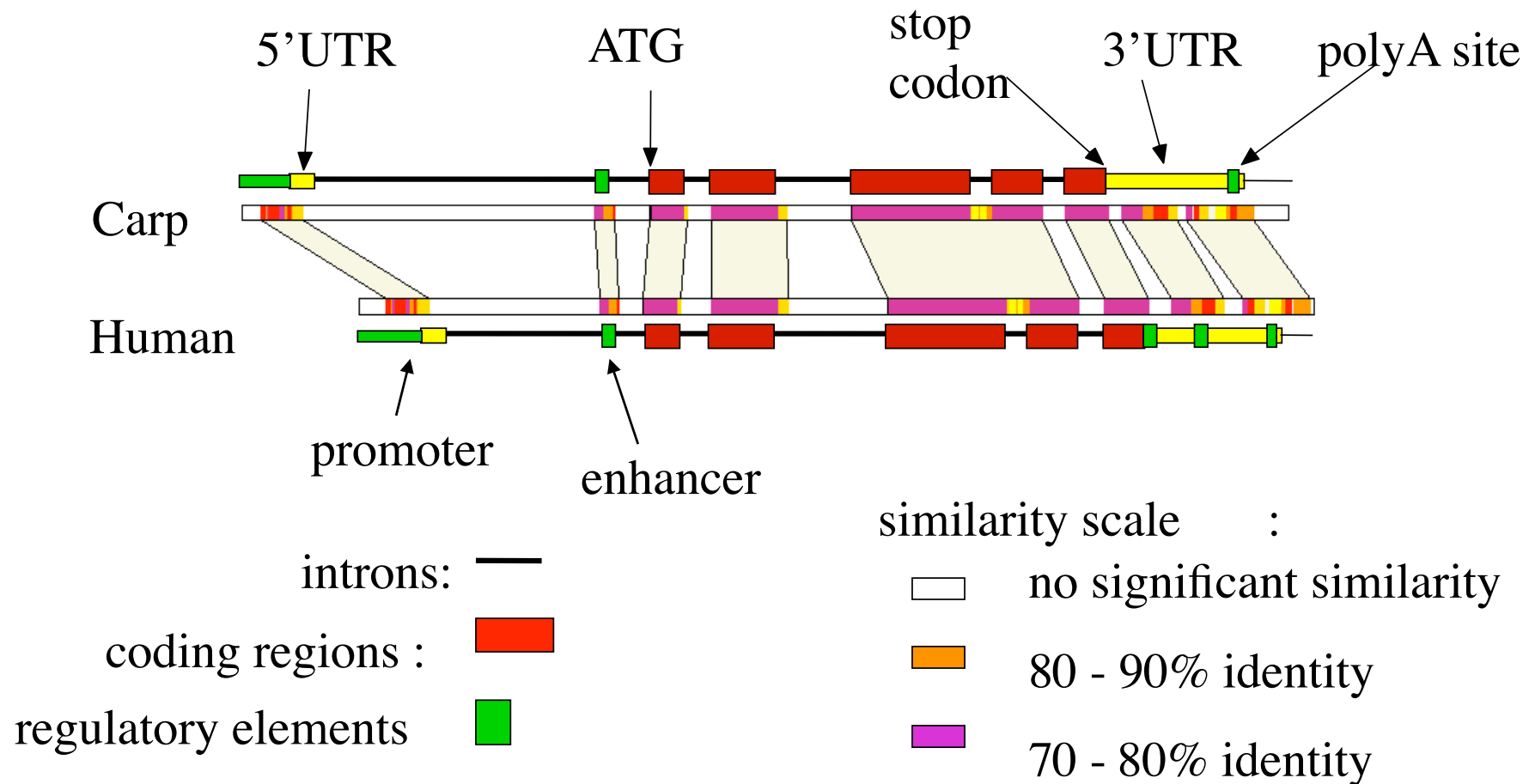
Sequence alignment

- Objectives
- General concepts
- Pairwise sequence alignment
- Database similarity search
 - standard (BLAST)
 - advanced (profile, PSI-BLAST)
- Multiple sequence alignment

Objectives

- Alignments allow the **comparison** of biological sequences. such comparisons are necessary for different studies :
 - Identification of homologous genes
 - Search for **functional constraints** in a set of genes or proteins.

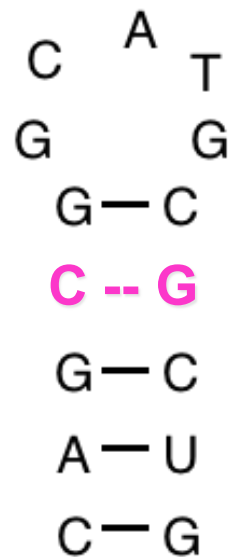
Comparative analysis of human and carp β -actin genes



Objectives

- Alignments allow the **comparison** of biological sequences. such comparisons are necessary for different studies :
 - Identification of homologous genes
 - Search for **functional constraints** in a set of genes or proteins.
 - Function prediction
 - Structure prediction

Prediction of RNA structure

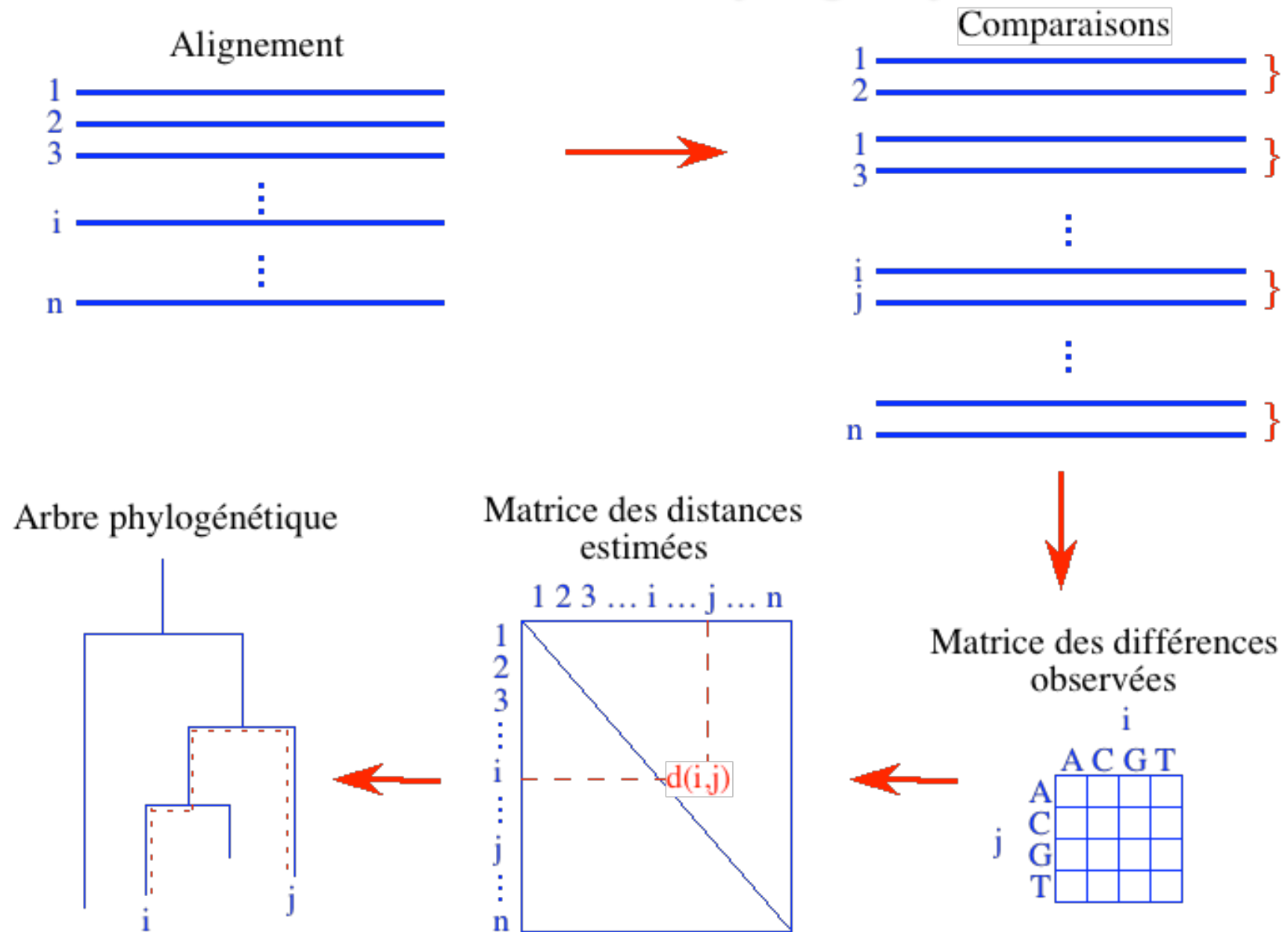


C	A	G	U	G	G	C	A	U	G	C	A	C	U	G
C	A	G	C	G	G	C	G	U	G	C	G	C	U	G
C	A	G	C	G	G	T	A	U	G	C	G	C	U	G
C	A	A	U	G	G	T	A	U	G	C	A	U	U	G
C	A	G	U	G	G	C	A	U	G	C	A	C	U	G
*	*			*	*			*	*	*			*	*

Objectives

- Alignments allow the **comparison** of biological sequences. such comparisons are necessary for different studies :
 - Identification of homologous genes
 - Search for **functional constraints** in a set of genes or proteins.
 - Function prediction
 - Structure prediction
 - Reconstruct **evolutionary relationships** between sequences (phylogeny)

Molecular Phylogeny



Objectives

- Alignments allow the **comparison** of biological sequences. such comparisons are necessary for different studies :
 - Identification of homologous genes
 - Search for **functional constraints** in a set of genes or proteins.
 - Function prediction
 - Structure prediction
 - Reconstruct **evolutionary relationships** between sequences (phylogeny)
 - Design of PCR primers
 - Sequence assembly
 - ...

Alignment: representation

- Residues (nucleotides, amino-acids) are superposed so that to maximise the similarity between sequences.

G	T	T	A	A	G	G	C	G	—	G	G	A	A	A
G	T	T	—	—	—	G	C	G	A	G	G	A	C	A
*	*	*				*	*	*		*	*	*		*

- Mutations :
 - Substitution (*mismatch*)
 - Insertion
 - Délétion
- Insertions or deletions : indels (*gap*).

Which one is the good alignment ?

G	T	T	A	C	G	A
G	T	T	-	G	G	A
*	*	*			*	*

G	T	T	A	C	G	A
G	T	T	G	-	G	A
*	*	*			*	*

OR

G	T	T	A	C	-	G	A
G	T	T	-	-	G	G	A
*	*	*				*	*

- ❑ For the biologist, the good alignment is the one that corresponds to the most likely evolutionary process

How do we measure sequence similarity ?

G	T	T	A	A	G	G	C	G	-	G	G	A	A	A
G	T	T	-	-	-	G	C	G	A	G	G	A	C	A
*	*	*				*	*	*		*	*	*		*

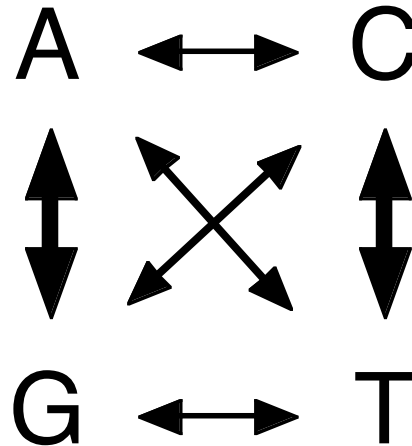
- $$\text{Score} = \sum_{begin}^{end} \text{SubstitutionWeight} - \sum_{begin}^{end} \text{GapPenalty}$$

- Example:

- identity = 1
- mismatch = 0
- gap = -1

- $\text{Score} = 10 - 4 = 6$

Models of evolution (DNA)



- Transition: $A \leftrightarrow G$ $T \leftrightarrow C$
- Transversions : other substitutions
- $p(\text{transition}) > p(\text{transversion})$

G T T A C G A
 G T T - G G A
 * * * * *

G T T A C G A
 G T T G - G A
 * * * . * *

Substitution Matrix (DNA)

	A	C	G	T
A	1	0	0.5	0
C	0	1	0	0.5
G	0.5	0	1	0
T	0	0.5	0	1

Examples :

$$\delta(A,A) = 1$$

$$\delta(A,C) = 0$$

$$\delta(C,T) = 0.5$$

- Gap = -1

G	T	T	A	C	G	A
G	T	T	-	G	G	A
1	1	1	-1	0	1	1

score = 4

G	T	T	A	C	G	A
G	T	T	G	-	G	A
1	1	1	.5	-1	1	1

score = 4.5

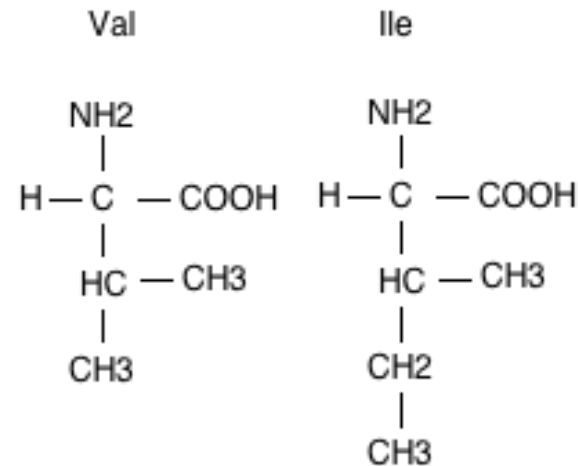
Models of evolution (proteins)

■ Genetic code

- Asp (GAC, GAU) -> Tyr (UAC, UAU) : 1 mutation
- Asp (GAC, GAU) -> Cys (UGC, UGU) : 2 mutations
- Asp (GAC, GAU) -> Trp (UGG) : 3 mutations

■ Physico-chemical properties of amino-acids (acidity, hydrophobicity, etc.)

conservative
substitutions



Substitution matrix

- Dayhoff (PAM), BLOSUM: measure the frequency of substitutions in alignments of homologous proteins
 - PAM 60, PAM 120, PAM 250 (extrapolations from PAM 15)
 - BLOSUM 80, BLOSUM 62, BLOSUM 40 (based on blocks alignments)

	D	E	F	G	...
D	4	4	-6	1	...
E	4	4	-6	1	...
F	-6	-6	13	-6	...
G	1	1	-6	5	...
...	...	...	...	...	...

Weighting of gaps

TGATATCGCCA

TGATATCGCCA

TGAT---TCCA

TGAT-T--CCA

* * * *

* * *

* * * *

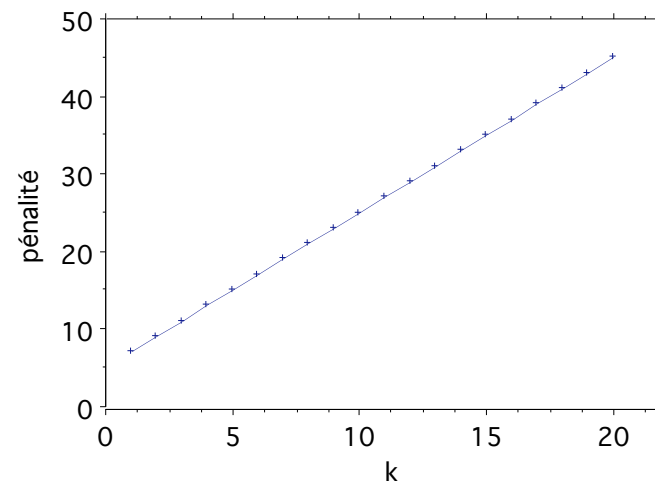
*

* * *

- Gap of length k : Linear penalties: $w = \delta_o + \delta_e k$

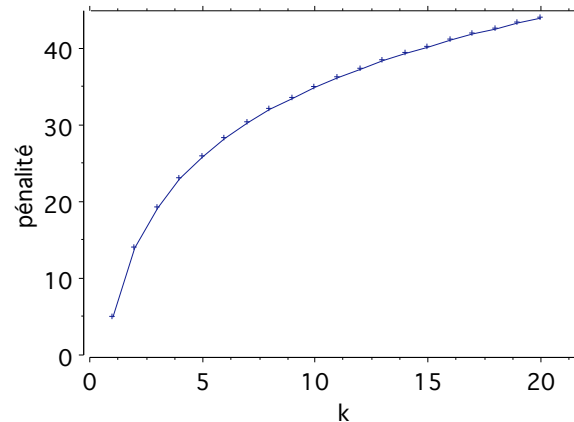
δ_o : penalty for gap opening

δ_e : penalty for gap extension



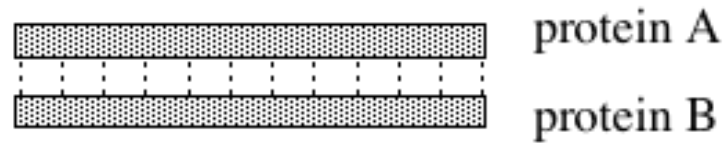
Weighting of gaps (more realistic)

- Estimation of parameters with true alignments (e.g. based on known structures)
- Gap of length k :
 - Logarithmic penalty: $w = \delta_o + \delta_e \log(k)$

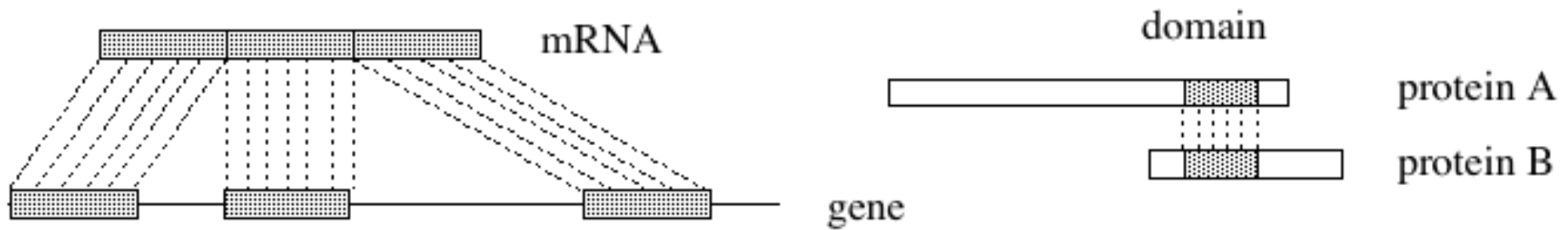


- $w = f(\log(k), \log(PAM), residue, structure)$
 - *PAM: the probability of a gap increases with the evolutionary distance*
 - *Resides, structure: the probability of a gap is higher in a loop (hydrophilic) than in the hydrophobic core of proteins*

Similarity: global, local



global similarity



local similarity

Similarity, homology

- *Two sequences are homologous if (and only if) they derive from a common ancestor*
- *30% identity between two proteins => homology, except if:*
 - *Short block of similarity (< 100 aa)*
 - *Compositional biases (low-complexity regions, e.g. Pro-rich, Ala-rich regions)*

The number of alignments

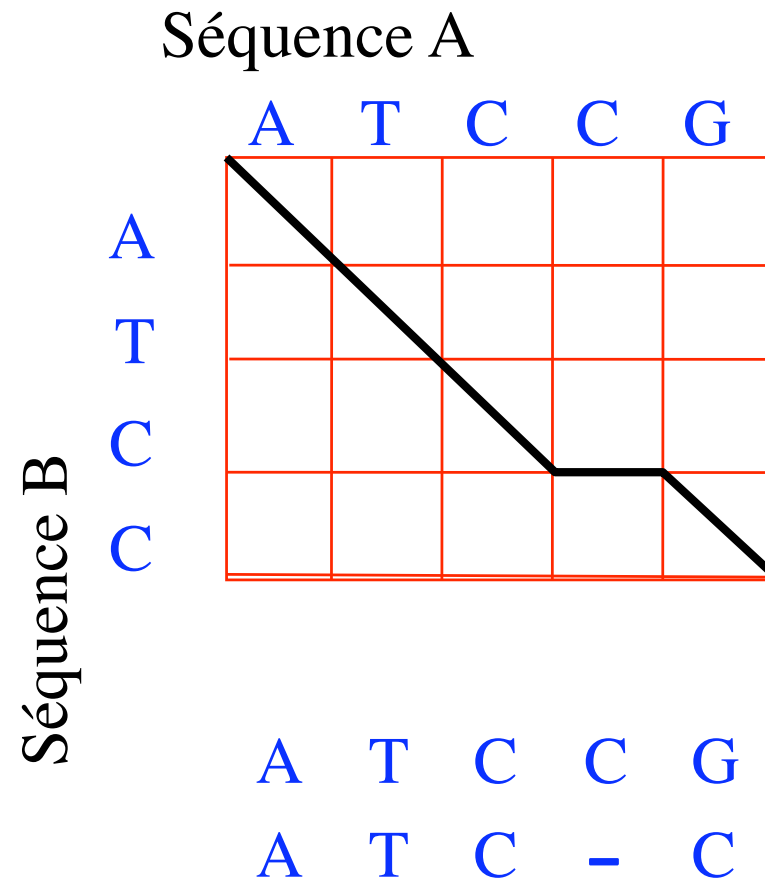
AT	A-T	AT-	-AT	-AT	--AT	...
AC	AC-	A-C	AC-	A-C	AC--	...

- Objective: for a given scoring scheme, find the best alignment(s), i.e. the optimal alignment(s)
- Problem: the number of possible alignments between two sequences increases exponentially with the length of sequences. For example:
 - $Lg1 = 3, Lg2 = 4$: 129 possible alignments
 - $Lg1 = 6, Lg2 = 8$: 40,081 possible alignments

Algorithms for aligning two sequences

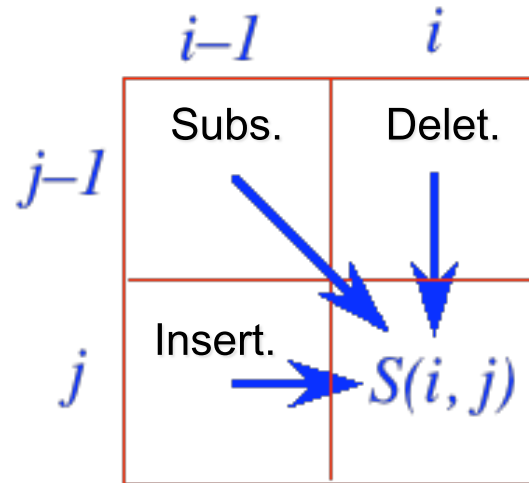
- Dynamic programming
 - Global alignment : Needleman & Wunsch
 - Local alignment : Smith & Waterman

Alignment representation: a path in a matrix



Recursive computation of the matrix

- Needleman & Wunsch, 1970



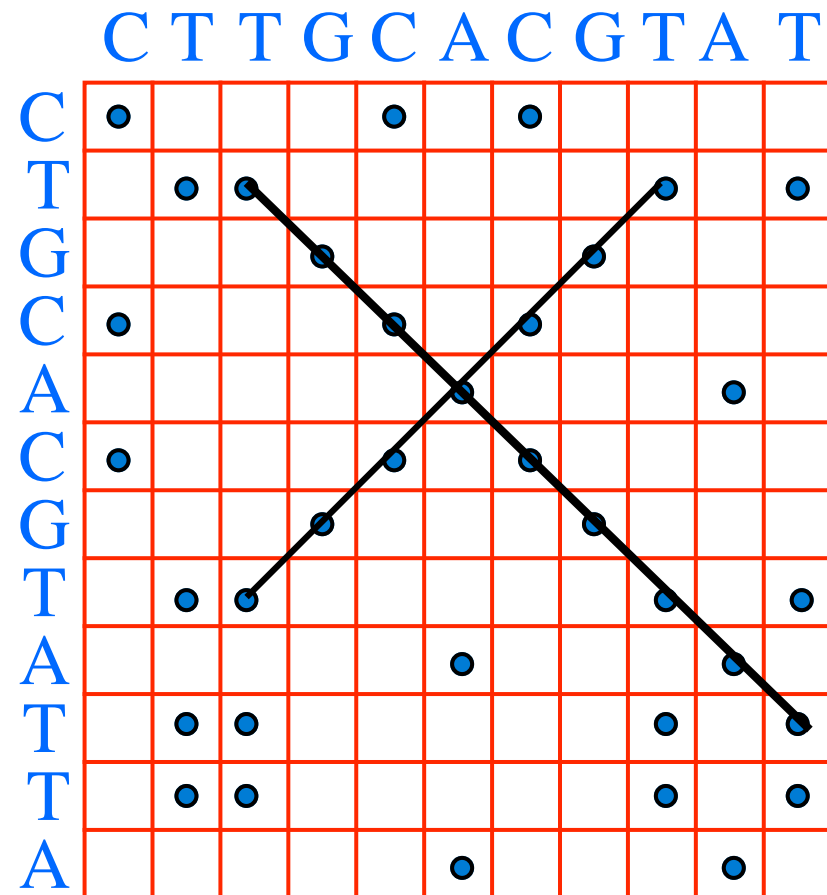
$$S(i, j) = \max \begin{bmatrix} S(i-1, j) + \delta(gap), \\ S(i-1, j-1) + \delta(a_i, b_j), \\ S(i, j-1) + \delta(gap) \end{bmatrix}$$

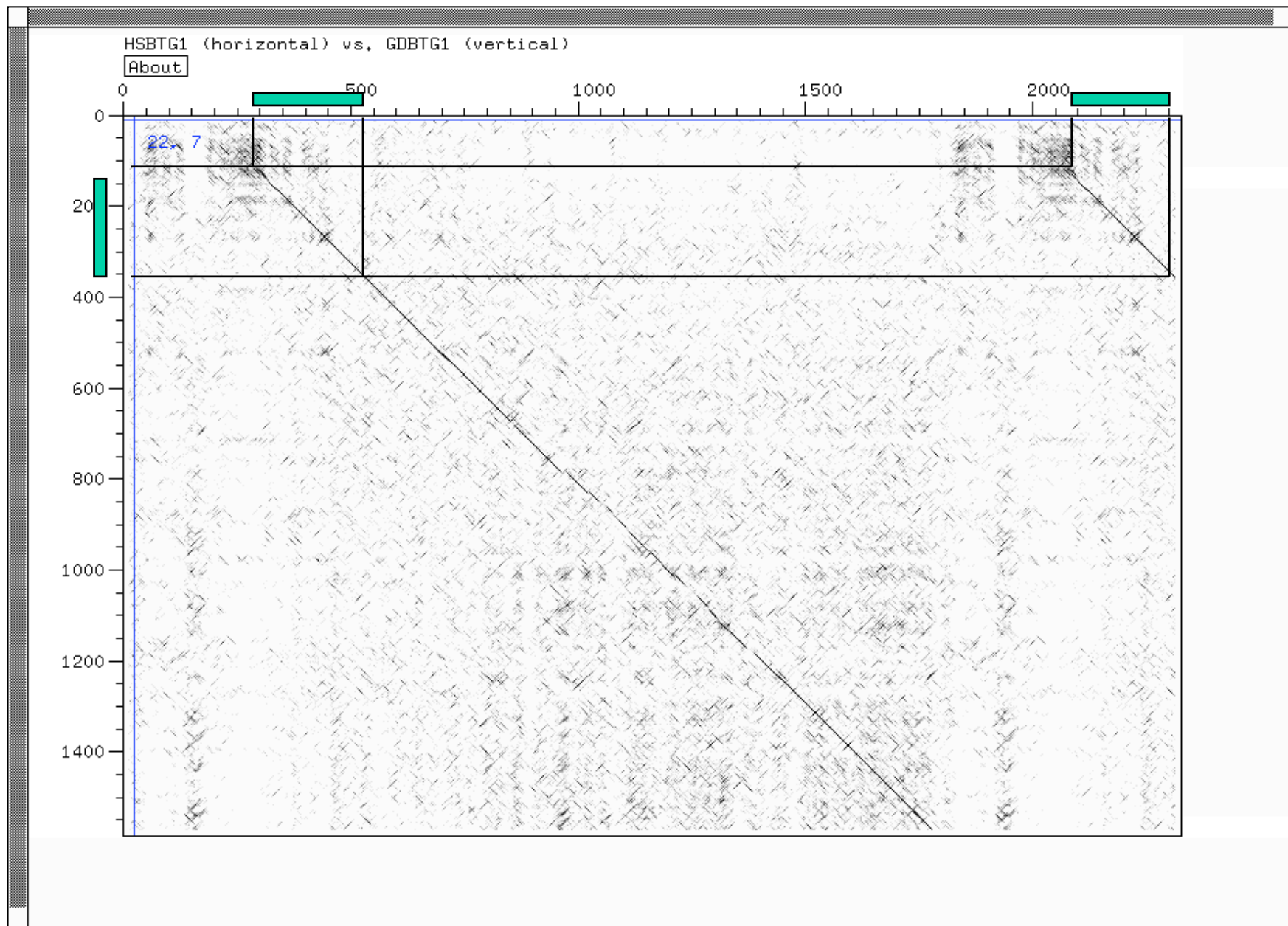
Dynamic programming: time and memory requirements

- Alignment of two sequences of length M and N
- Needleman-Wunsh (global alignments), Smith-Waterman (local alignments):
 - Time: $O(N \cdot M)$
 - Memory: $O(N \cdot M)$
- Improvement of Smith-Waterman (Huang & Miller 1991):
 - Time: $O(N \cdot M)$
 - Memory: $O(N + M)$
- SIM, LALIGN

Dot Plot

- Graphical representation of similarities between two sequences
- Inversion, duplications





DOTTER: <http://www.sanger.ac.uk/Software/Dotter/>

Searching for similarities in sequence databases

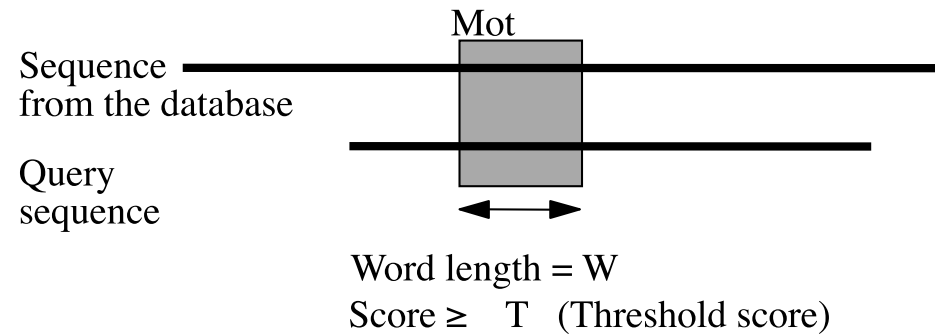
- Objective: compare one sequence to a database of sequences, compare two databases, ...
- e.g. :
 - I have identified a new gene; does this gene have any homologue (known or unknown) in sequence databases ?
 - I want to identify all the genes that belong to a same gene family
 - I want to identify all homologous genes between the genomes of species A and species B

Searching for similarities in sequence databases

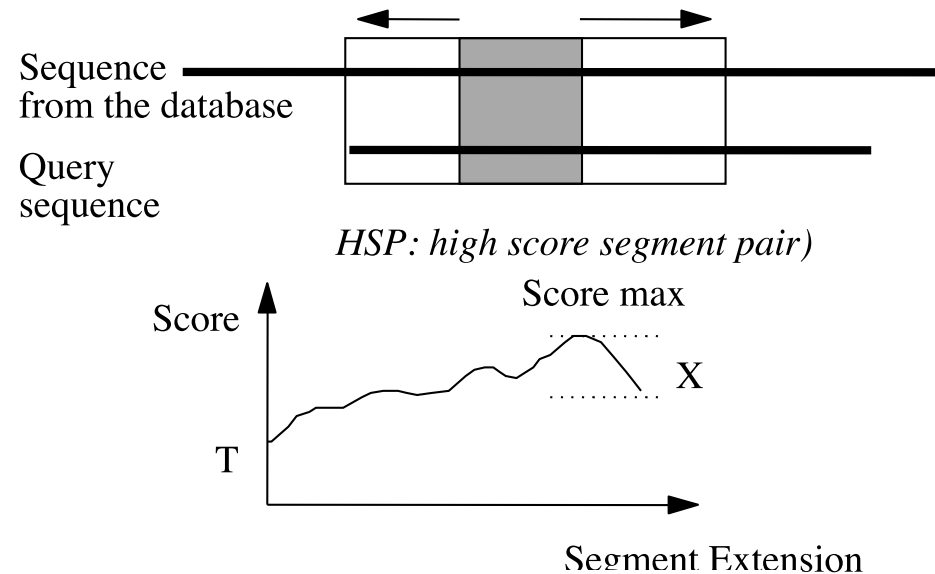
- Exact Algorithms (Smith-Waterman)
 - SIM, LALIGN, SSEARCH, ...
- Heuristics
 - FASTA
 - 1 -search for identical ‘ k-tuples ’
 - 2 - global alignment, anchored on the region of similarity
 - BLAST
 - 1 - search for similar ‘words’
 - 2 - extend blocks of similarity

BLAST

Step 1: detect similar 'words'



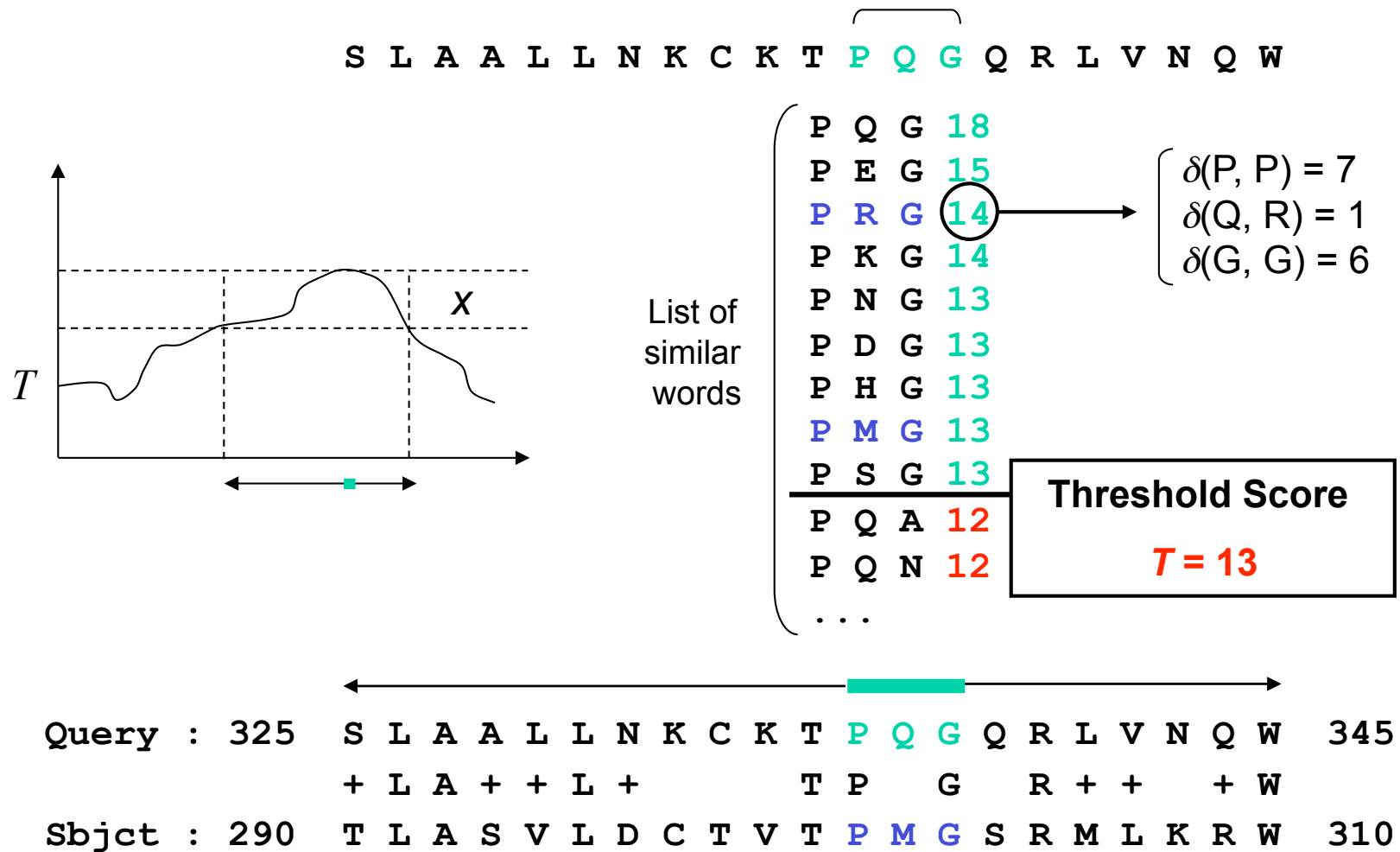
Step 2: extend blocks of similarity



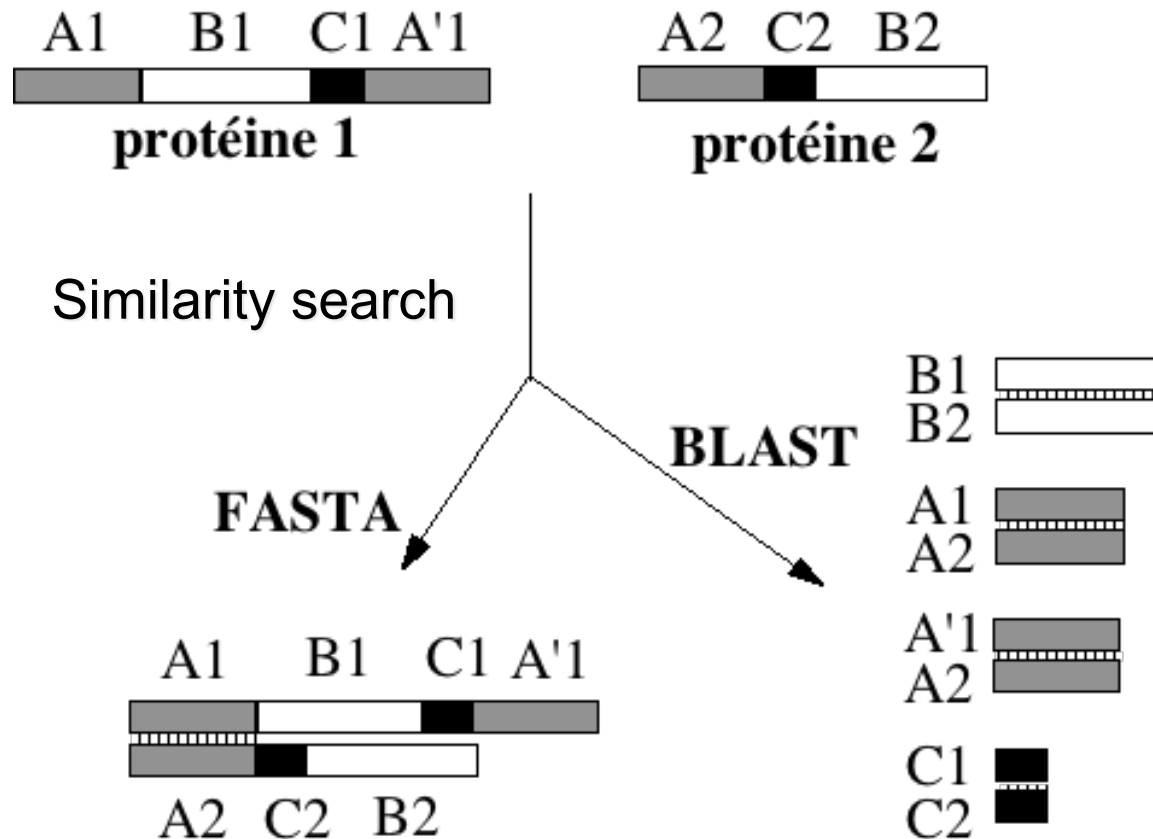
Stop extension if:

- reach the end of a sequence
- score ≤ 0
- score $\leq \text{score_max} - X$

Example

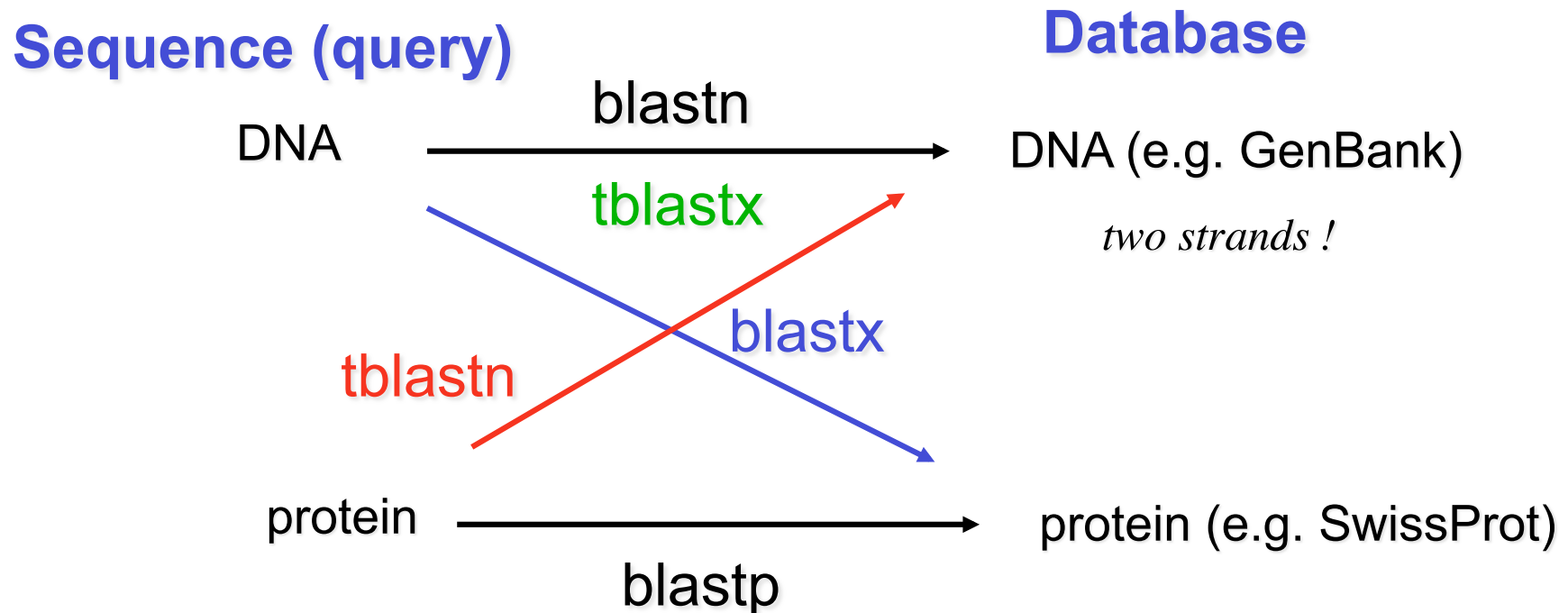


Block alignment or global alignment : comparison BLAST / FASTA



What to compare: DNA or protein ?

- Limits of DNA similarity search
 - Reduced alphabet (4 letters)
 - Degeneracy of the genetic code
- But ... some sequences are non-coding
 - regulatory regions, structural RNAs, ...



Different versions of BLAST for different problems

- `blastp`: protein/protein
- `blastn`: DNA/DNA (useful for non-coding sequences)
- `blastx`: DNA-translated/protein (useful for query sequences with unidentified coding regions; more sensitive than `blastn`)
- `tblastn`: protein/DNA-translated (useful for database sequences with unidentified coding regions; e.g. search for homologues of a protein gene in an unannotated genome ; more sensitive than `blastn`)

BLASTP 2.0.14 [Jun-29-2000]

Query= MyProtein
(213 letters)

Database: sptrembl: SWISSPROT + TREMBL database (Sep 23, 2002)
897,714 sequences; 282,774,038 total letters

Searching.....done

Sequences producing significant alignments:			Score	E
			(bits)	Value
G6PD_ECOLI	491	Glucose-6-phosphate 1-dehydrogenase (...)	432	e-120
Q8XPS9	489	Probable glucose-6-phosphate 1-dehydrogen...	257	1e-37
Q9SUJ9	515	Glucose-6-phosphate 1-dehydrogenase (EC 1...	121	1e-26
AAM51346	625	Putative glucose-6-phosphate dehydr...	93	4e-18
P95611	97	Orf9 protein (Fragment).	72	9e-12
Q9VNW4	581	CG7140 protein.	69	4e-11
Q8T8Z3	526	AT14419p.	50	4e-05
O53176	435	Hypothetical protein Rv2449c.	33	3.6

>G6PD_BUCAI 491 Glucose-6-phosphate 1-dehydrogenase (EC 1.1.1.49) (G6PD) .
Length = 491

Score = 239 bits (603), Expect = 3e-62
Identities = 110/211 (52%), Positives = 156/211 (73%)

Query: 3 VTQTAQACDLVIFGAKGDLARRKLLPSLYQLEKAGQLNPDTRIIGVGRADWDKAAYTKVV 62
+ +T ACDLVIFGAKGDL +RKLLP+LY+LEK+ +++ TRII GRADW Y + +
Sbjct: 2 IIETNHACDLVIFGAKGDLTKRKLLPALYKLEKSKKIHKYTRIIASGRADWSTEDYIEKI 61

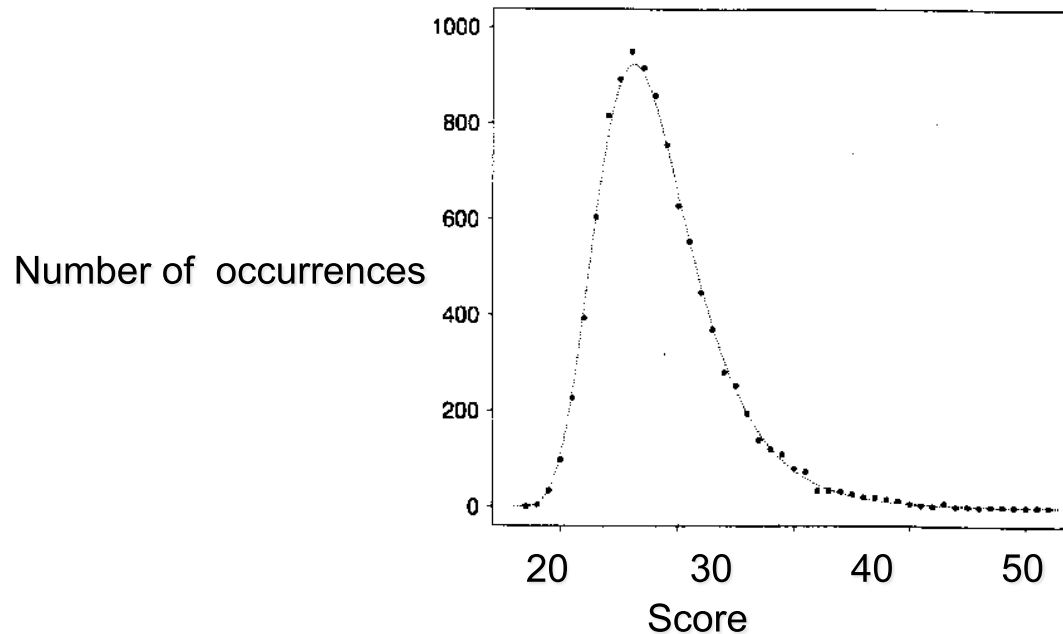
Query: 63 REALETFMKETIDEGWLDTLSARLDFCNLDVNDTAAFSRLGAMLDQKNRITINYFAMPPS 122
+ ++ F+ E I++ +W LS+R+ FCN+DV++ F RL +L QK I + Y A+P +
Sbjct: 62 KTEVKNFLNEEINDLIWKNLSSRIFFCNIDVHEPLHFFRLKTILKQKKNIIVYYCAVPSN 121

Query: 123 TFGAICKGLGEAKLNAKPARVVMKPLGTSLATSQEINDQVGEYFEECQVYRIDHYLGKE 182
T +I GLG A LN+ P+R+V+EKPLG L TS++INDQ+ +YF E Q++RIDHYLGKE
Sbjct: 122 TLNSIFIGLGNAHLNSVPSRIVLEKPLGVCLKTSKKINDQISKYFLESQIFRIDHYLGKE 181

Query: 183 TVLNLLALRFANSLFVNNWDNRRTIDHVEITV 213
++LNL ALRF+N+ NW+N+TIDH++ITV
Sbjct: 182 SILNLFALRFSNTCLFYNNWNKTIDHIQITV 212

Statistical significance of similarities

- Among the similarities that have been detected, which are the ones that reflect biologically meaningful relationships ? which are the ones that are observed simply by chance ?
- Frequency distribution of similarity scores of local alignments between unrelated sequences



- Probability that a similarity of score S be observed by chance

Filtering low complexity sequences and repeated elements

- *Low complexity sequences (proteins, DNA):*

40% of proteins

DNA: microsatellites

15% of residues

example: CACACACACACACACA

Ala, Gly, Pro, Ser, Glu, Gln

Filtering programs: SEG, XNU, DUST

```
RSPPR--KPQGPPQQEGNNPQGPPPPAGGNPQQPQAPPAGQPQGPP
.  ::::      :  ::  :  :  :::::  :  ::  :::  ::  :  :::::
QGPPRPGNQQCPPPQGG--PQGPPRP--GNQQRP--PPQGGPQGPP
```

- *Repeated sequences: e.g. transposable elements*

10^6 Alu, 10^5 L1 in the human genome

Filtering program: RepeatMasker



Searching for homologues: summary

- algorithm
 - substitution matrix, weighting of gaps
 - search strategy (DNA, protein)
 - filtering of low complexity or repeated sequences
 - completeness of sequence databases
-
- 1 -rapid software, default parameters
 - 2 - filtering (if necessary)
 - 3 - change parameters (matrix, W , k , etc.)
 - 4 - change algorithm
 - 5 - repeat the search regularly

Special cases

- Search for similarities with very short DNA sequences (e.g. PCR primers):
 - decrease W ($11 \rightarrow 7$)
- Very rapid search for strong similarities (e.g. cDNA to genome, human vs. chimp, ...) :
 - megablast

BLAST au NCBI (1)

The screenshot shows the NCBI BLAST search interface. It is divided into several sections: 'Enter Query Sequence', 'Choose Search Set', 'Program Selection', and a 'BLAST' button. Annotations with arrows point to specific elements: 'Séquence requête' points to the query sequence text area; 'Choix de la base de données' points to the 'Database' dropdown menu; 'Choix du taxon, requête Entrez' points to the 'Organism' text input; 'Choix de l'algorithme' points to the 'Algorithm' radio buttons; and 'Paramètres' points to the 'BLAST' button and the 'Show results in a new window' checkbox.

Enter Query Sequence

Enter accession number, gi, or FASTA sequence [Clear](#) [Query subrange](#)

>Interleukin-1
MKVLLRLICFIALLISSLEADKCKEREKIIIVSSANEIDVRPCPLNPNEHKGTTITWYKD
DSKTPVSTEQASRIHQHKEKLWFPVPAKVEDSGHYVCVVRNSSYCLRIKISAKFVENEPNL
CYNAQAIFKQKLPVAGDGGGLVCPYMEFFKNENNELPKLOWYKDKPLLLDNIHPSGVKDR
LIVMNVAEKHRGNYTCHASYTYLGKQYPITRVIEPTITLEENKPTRPVIIVSPANETMEVDL
GSQIQLICNVITGQLSDIAYWKWNGSVIEDDDPVLGEDYYSVENPANKRRSTLITVLNISE
TREDPVVNDMPKAKMBSCTAAATOTTVRUMBSAPMTCTAUMTMYTTACDPTVETDE

From
To

Or, upload file [Parcourir...](#)

Job Title
Enter a descriptive title for your BLAST search

Choose Search Set

Database

Organism [Optional](#)
Enter organism common name, binomial, or tax id. Only 20 top taxa will be shown.

Entrez Query [Optional](#)

Program Selection

Algorithm ☒ blastp (protein-protein BLAST) ☐ PSI-BLAST (Position-Specific Iterated BLAST) ☐ PHI-BLAST (Pattern Hit Initiated BLAST)
Choose a BLAST algorithm

BLAST ☐ Show results in a new window

[Algorithm parameters](#) Note: Parameter values that differ from the default are highlighted in yellow

Séquence requête

Choix de la base
de données

Choix du taxon,
requête Entrez

Choix de
l'algorithme

Paramètres

BLAST au NCBI (2)

▼ Algorithm parameters Note: Parameter values that differ from the default are highlighted in yellow

General Parameters

Max target sequences Select the maximum number of aligned sequences to display

Short queries ☒ Automatically adjust parameters for short input sequences

Expect threshold ?

Word size ?

Scoring Parameters

Matrix ?

Gap Costs ?

Compositional adjustments ?

Filters and Masking

Filter ☐ Low complexity regions ?

Mask ☐ Mask for lookup table only ?
☐ Mask lower case letters ?

BLAST Search database **nr** using **Blastp (protein-protein BLAST)**
☐ Show results in a new window

Nb. maximum de
séquences à visualiser

E-value limite

Taille du mot

Choix de la matrice

Pénalités des *gaps*

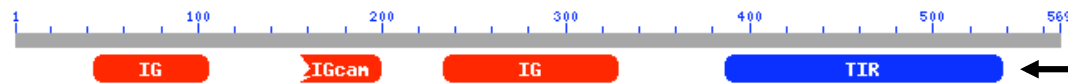
Filtrage (séquences
de faible complexité)

BLAST au NCBI (3)

Job Title: Interleukin-1

[▼ Show Conserved Domains](#)

Putative conserved domains have been detected, click on the image below for detailed results.



Domaines
conservés

BLASTP 2.2.16 (Mar-25-2007)

Reference:

Altschul, Stephen F., Thomas L. Madden, Alejandro A. Schäffer, Jinghui Zhang, Zheng Zhang, Webb Miller, and David J. Lipman (1997), "Gapped BLAST and PSI-BLAST: a new generation of protein database search programs", Nucleic Acids Res. 25:3389-3402.

Reference:

Schäffer, Alejandro A., L. Aravind, Thomas L. Madden, Sergei Shavirin, John L. Spouge, Yuri I. Wolf, Eugene V. Koonin, and Stephen F. Altschul (2001), "Improving the accuracy of PSI-BLAST protein database searches with composition-based statistics and other refinements", Nucleic Acids Res. 29:2994-3005.

RID: 6P3FH4UM012

Database: All non-redundant GenBank CDS translations+PDB+SwissProt+PIR+PRF excluding environmental samples from WGS projects
5,035,465 sequences; 1,742,204,576 total letters

Banque de
données

If you have any problems or questions with the results of this search please refer to the [BLAST FAQs](#) [Taxonomy reports](#)

Résultats
par taxon

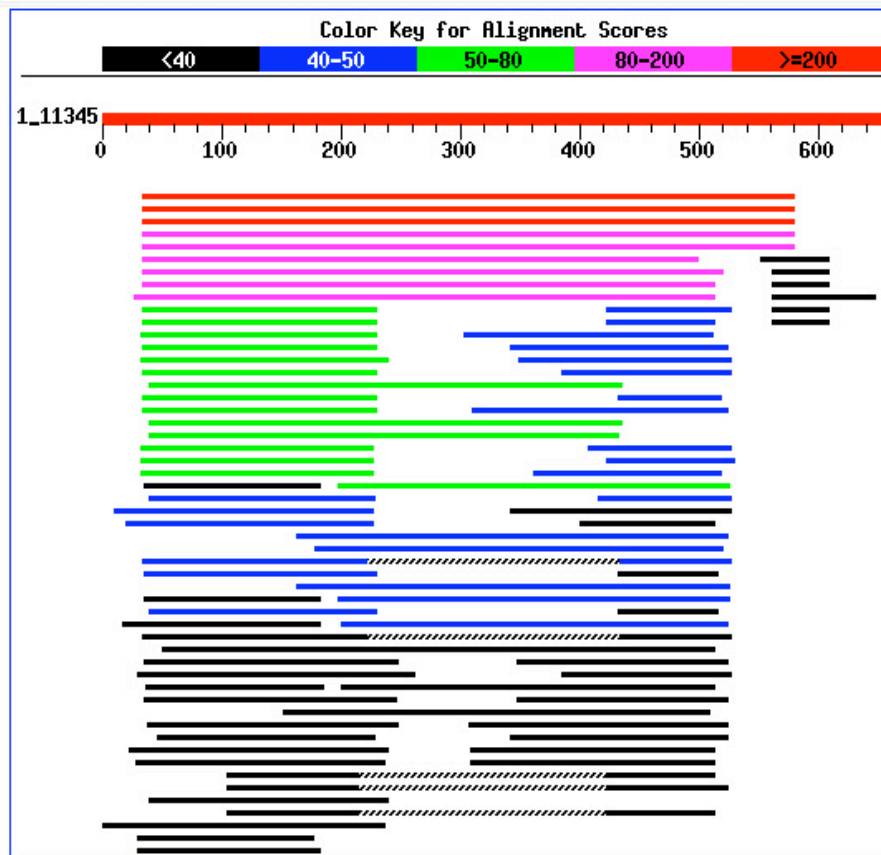
Query= Interleukin-1
Length=569

BLAST au NCBI (4)

[Distribution of 134 Blast Hits on the Query Sequence](#)

Nombres de *hits*

Mouse-over to show defline and scores. Click to show alignments



Répartition des *hits*
en fonction du score

BLAST au NCBI (5)

[Distance tree of results](#) [NEW](#) [Related Structures](#)

Sequences producing significant alignments:		Score (Bits)	E Value	
ref NP_000868.1 	interleukin 1 receptor, type I precursor [Ho...	1189	0.0	UG
gb AAH67508.1 	Interleukin 1 receptor, type I [Homo sapiens]	1185	0.0	UG
gb AAH67507.1 	Interleukin 1 receptor, type I [Homo sapiens]	1181	0.0	UG
ref XP_001107510.1 	PREDICTED: interleukin 1 receptor, type I [M	1147	0.0	UG
ref XP_001162875.1 	PREDICTED: hypothetical protein isoform 1 [P	1144	0.0	G
gb AAR88996.1 	interleukin-1 receptor type I precursor [Macaca f	1130	0.0	U
ref XP_538449.2 	PREDICTED: similar to Interleukin-1 receptor...	932	0.0	UG
ref NP_001075263.1 	interleukin 1 receptor, type I [Equus cab...	923	0.0	G
emb CAH90532.1 	hypothetical protein [Pongo pygmaeus]	908	0.0	
ref XP_593695.3 	PREDICTED: hypothetical protein [Bos taurus]	852	0.0	UG
ref NP_032388.1 	interleukin 1 receptor, type I [Mus musculus...	837	0.0	UG
dbj BAC33372.1 	unnamed protein product [Mus musculus]	837	0.0	UG
dbj BAC35666.1 	unnamed protein product [Mus musculus]	835	0.0	UG
ref NP_037255.2 	interleukin 1 receptor, type I [Rattus norve...	825	0.0	UG
dbj BAF34664.1 	interleukin 1 bete receptor type 1 long trans...	825	0.0	UG
sp Q02955 IL1R1_RAT	Interleukin-1 receptor type I precursor (...)	825	0.0	G
dbj BAF34665.1 	interleukin 1 beta receptor type 1 short tran...	825	0.0	UG
ref XP_001162910.1 	PREDICTED: hypothetical protein isoform 2...	799	0.0	G
dbj BAF34663.1 	interleukin 1 beta receptor type 1 soluble fo...	747	0.0	UG
pdb 1IRA Y	Chain Y, Complex Of The Interleukin-1 Receptor Wit...	675	0.0	S
pdb 1ITB B	Chain B, Type-1 Interleukin-1 Receptor Complexed W...	666	0.0	S
pdb 1G0Y R	Chain R, Il-1 Receptor Type 1 Complexed With Antag...	661	0.0	S
emb CAH93030.1 	hypothetical protein [Pongo pygmaeus]	620	6e-176	
ref XP_001371210.1 	PREDICTED: similar to interleukin-1 recep...	562	2e-158	G
ref NP_990816.1 	interleukin 1 receptor, type I [Gallus gallu...	442	4e-122	UG
gb AAA50243.1 	soluble IL-1 receptor type I	410	1e-112	UG
ref NP_573456.1 	interleukin 1 receptor-like 2 [Mus musculus]...	395	3e-108	G
gb EDL14573.1 	interleukin 1 receptor-like 2, isoform CRA_a [Mus	395	3e-108	

Séquences
similaires

BLAST au NCBI (6)

Alignments

Get selected sequences Select all Deselect all Distance tree of results

> [gb|AAH67508.1](#) **UG** Interleukin 1 receptor, type I [Homo sapiens]
Length=569

Score = 1185 bits (1065), Expect = 0.0, Method: Composition-based stats.
Identities = 567/569 (99%), Positives = 567/569 (99%), Gaps = 0/569 (0%)

Query	1	MKVLLRLICFIALLISSLEADCKKEREKIIIVSSANEIDVRPCPLNPNEHKGTTITWYKD	60
		MKVLLRLICFIALLISSLEADCKKEREKIIIVSSANEIDVRPCPLNPNEHKGTTITWYKD	
Sbjct	1	MKVLLRLICFIALLISSLEADCKKEREKIIIVSSANEIDVRPCPLNPNEHKGTTITWYKD	60
Query	61	DSKTPVSTEQASRIHQHKEKLWFVPKVEDSGHYVCVVRNSSYCLRIKISAKFVENEPNL	120
		DSKTPVSTEQASRIHQHKEKLWFVPKVEDSGHYVCVVRNSSYCLRIKISAKFVENEPNL	
Sbjct	61	DSKTPVSTEQASRIHQHKEKLWFVPKVEDSGHYVCVVRNSSYCLRIKISAKFVENEPNL	120
Query	121	CYNAQAIFKQKLPVAGDGGLVCPYMEFFKNENNELPKLQWYKDCPLLLDNIHFSGVKDR	180
		CYNAQAIFKQ LPVAGDGGLVCPYMEFFKNENNELPKLQWYKDCPLLLDNIHFSGVKDR	
Sbjct	121	CYNAQAIFKQNLFPVAGDGGLVCPYMEFFKNENNELPKLQWYKDCPLLLDNIHFSGVKDR	180
Query	181	LIVMNVAEKHRGNYTCHASYTYLGKQYPITRVIEFITLEENKPTRPVIVSPANETMEVDL	240
		LIVMNVAEKHRGNYTCHASYTYLGKQYPITRVIEFITLEENKPTRPVIVSPANETMEVDL	
Sbjct	181	LIVMNVAEKHRGNYTCHASYTYLGKQYPITRVIEFITLEENKPTRPVIVSPANETMEVDL	240
Query	241	GSQIQLICNVTGQLSDIAYWKWNGSVIDEDDPVLGEDYYSVENPANKRRSTLITVLNISE	300
		GSQIQLICNVTGQLSDIAYWKWNGSVIDEDDPVLGEDYYSVENPANKRRSTLITVLNISE	
Sbjct	241	GSQIQLICNVTGQLSDIAYWKWNGSVIDEDDPVLGEDYYSVENPANKRRSTLITVLNISE	300
Query	301	IESRFYKHPFTCFKANTHGIDAAYIQLIYPVTNFQKHMIGICVTLTVIIVCSVFIYKIFK	360
		IESRFYKHPFTCFKANTHGIDAAYIQLIYPVTNFQKHMIGICVTLTVIIVCSVFIYKIFK	
Sbjct	301	IESRFYKHPFTCFKANTHGIDAAYIQLIYPVTNFQKHMIGICVTLTVIIVCSVFIYKIFK	360
Query	361	IDIVLWYRDSYDFLPIKASDGKTYDAYILYPKTVGEGSTSDCDIFVFKVLPEVLEKQCG	420
		IDIVLWYRDSYDFLPIKASDGKTYDAYILYPKTVGEGSTSDCDIFVFKVLPEVLEKQCG	
Sbjct	361	IDIVLWYRDSYDFLPIKASDGKTYDAYILYPKTVGEGSTSDCDIFVFKVLPEVLEKQCG	420

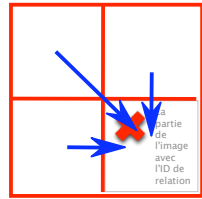
Récupération
des séquences

Liens vers des
banques NCBI

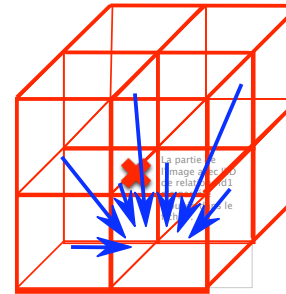
Multiple sequence alignment

Multiple alignments: impossible to use exact algorithms

- The Needleman&Wunsh algorithm can in theory be used for more than two sequences, but it is impossible to use it in practice .



Pairwise Alignment:
three possibilities

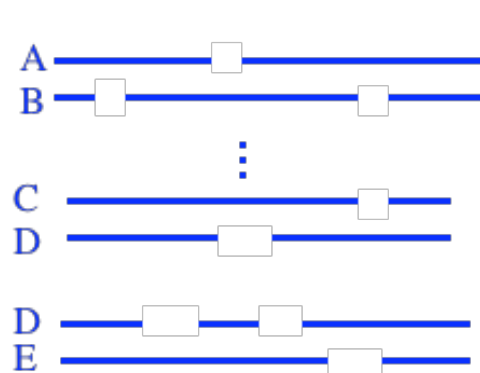


Alignment of three
sequences : seven possibilities

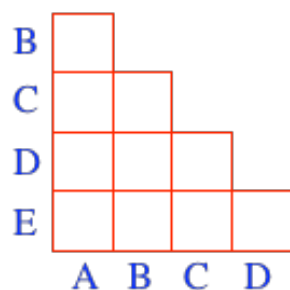
- The number of possible paths for aligning n sequences is proportional to $2^n - 1$.
- Computer time and memory increases exponentially with the number of sequences
⇒ Use **heuristic methods**.

Progressive Alignment

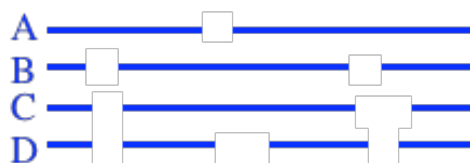
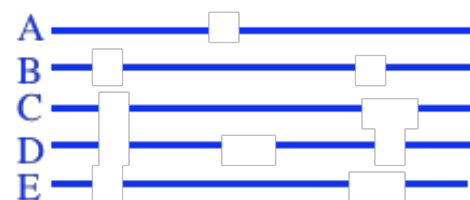
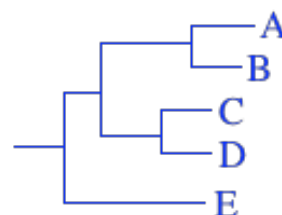
- **Iterative** approach to compute multiple alignments, by grouping pairwise alignments.
- Three steps :
 - Alignment of sequence pairs.
 - Guide tree
 - Grouping of alignments (progressive alignment).
- **CLUSTAL** (Higgins, Sharp 1988, Thompson *et al.*, 1994), the most cited multiple alignment program.
- MULTALIN, PILEUP, T-Coffee, Muscle



Compute distance matrix



Compute guide tree



Grouping alignments

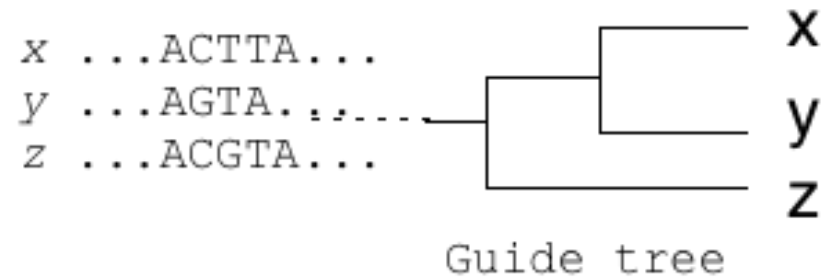


Position specific gap penalty

- Decrease gap penalty in **hydrophilic** regions (≥ 5 residues).
- Amino-acid specific gap penalty (*e.g.* lower gap penalty for Gly, Asn, Pro).

Progressive alignment : not always optimal

Alignment of three sequences



Step 1: alignment xy

x ACTTA	x ACTTA	x ACTTA
y A-GTA	y AGT-A	y AG-TA

Step 2: alignment xyz

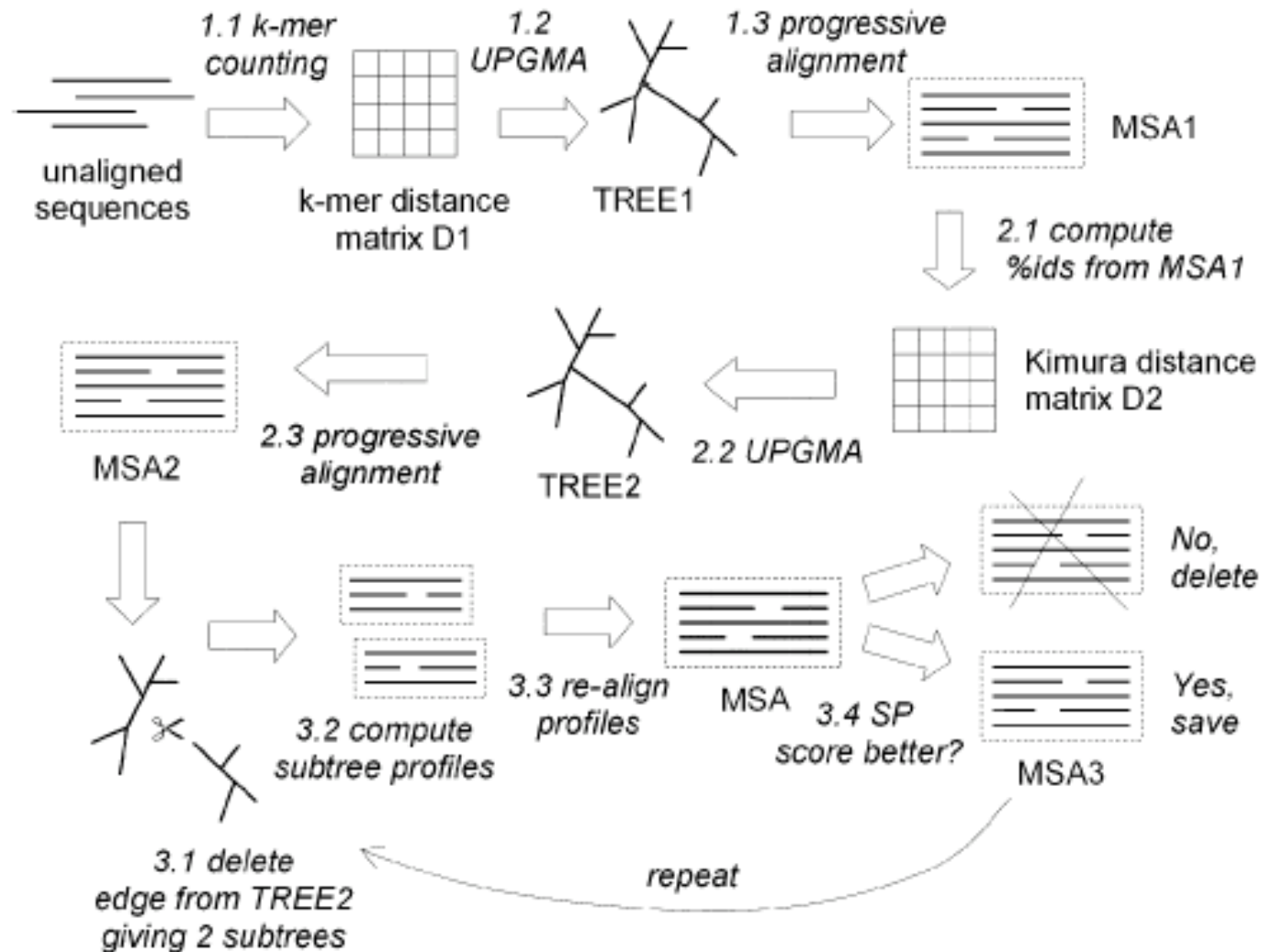
x ACTTA	x ACTTA	x ACTTA
y A-GTA	y AGT-A	y AG-TA
z ACGTA	z ACGTA	z ACGTA

- Only one of these three alignments is optimal

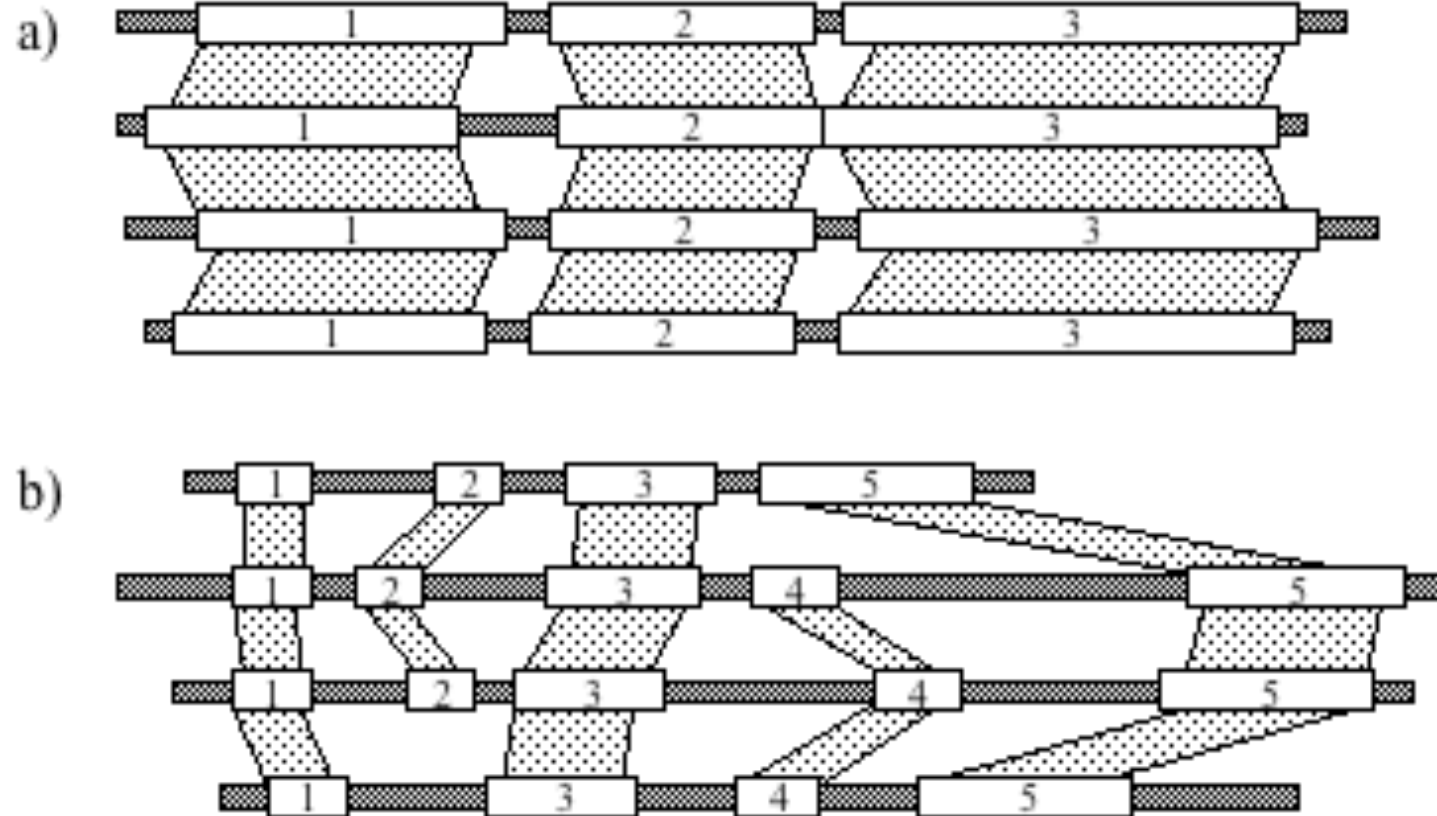
Muscle

Edgar (2004) Nucleic Acids Res. 32:1792

<http://www.drive5.com/muscle/>



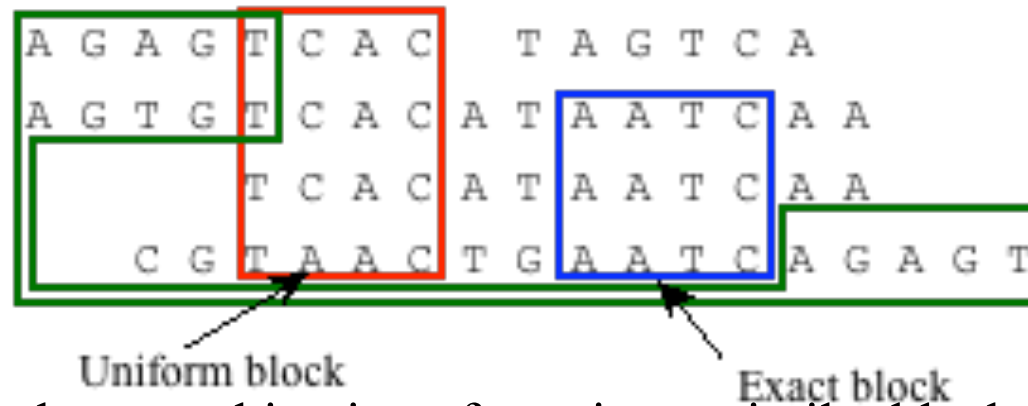
Global Alignments, Block alignments



Dialign

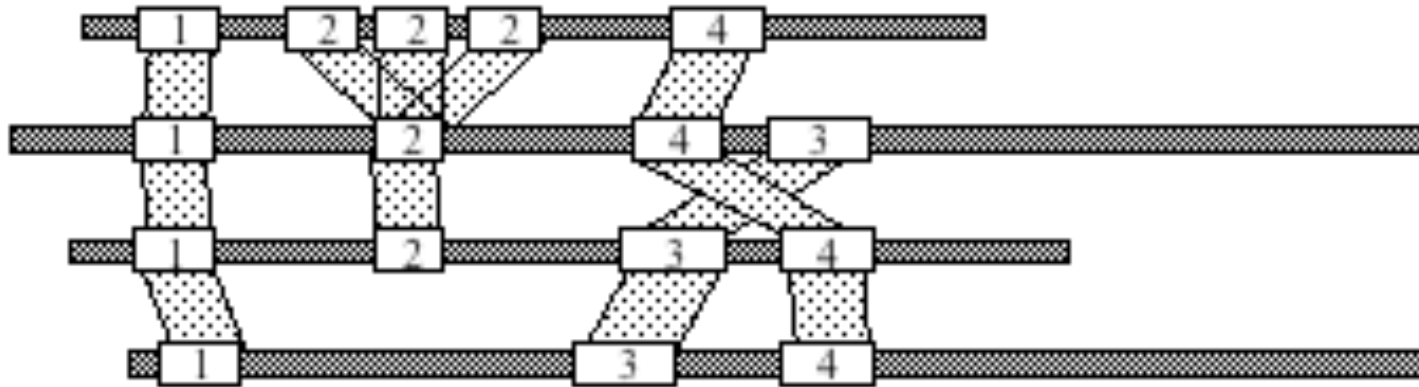
Morgenstern et al. 1996 PNAS 93:12098

- Search for similar blocks without gap



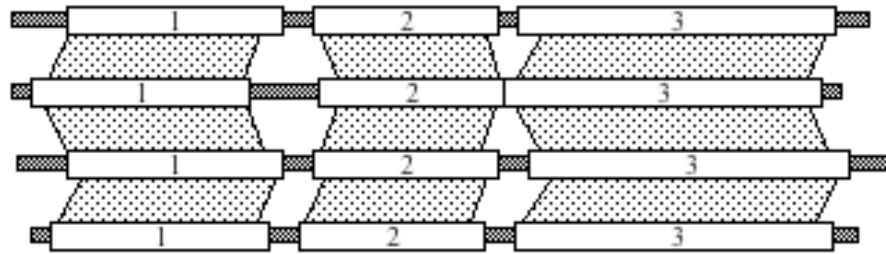
- Select the best combination of consistent similar blocks (uniforms or not) : heuristic (Abdeddaim 1997)
- Alignment anchored on blocks
- Slower than progressive alignment, but better when sequences contain large indels
- Do not try to align non-conserved regions

Local Multiple Alignments

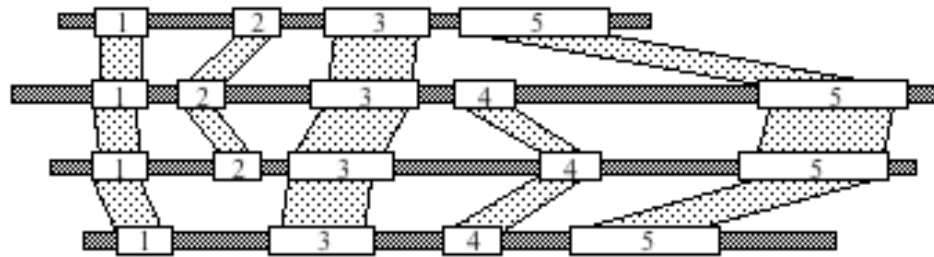


- MEME
- MATCH-BOX
- PIMA

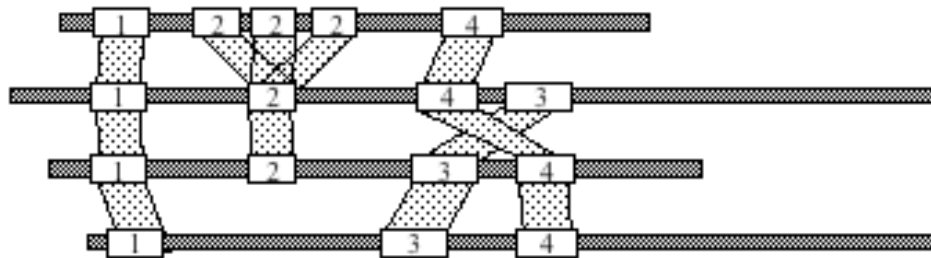
Overview



- Muscle
- ClustalW



- Dialign
- T-coffee



- MEME

Multiple alignment editor

insulin.mase

File Props Sites Species Footers Search: Goto: Edit Help

seq:1 Pos:1 |0 [BAA82315] 95

sel=0

BAA82315 MAALNLQSVSLVLLVLMVWPGSQAVLPQHLCSHLVDALYLVCG-ERGFFYTPKRDVDQLLCLFLPAKSGGAAG-G

INS_LOPPI MAALNLQSVSLVLLVLMVWPGSQAVAPQHLCSHLVDALYLVCG-DRGFFYNPKRDVDQLLCLFLPKSGGAAAGA

AAD22742 MAALNLQAFSLVLMVMWPGSQAVGQHLCSHLVDALYLVCG-DRGFFYNPKRDVDQLLCLFLPKAGGAVVQ

INS_CYPCA MAVNIQAGALLFLLAVSVNINAG-APQHLCSHLVDALYLVCG-PTGFFYNPKRDVDQLLCLFLPKSAQETEV

O73727 MAVNLQAGALLVLLVWSSVSTNPG-TPQHLCSHLVDALYLVCG-PTGFFYNPKRDVDQLLCLFLPKSAQETEV

INS_ONCKE MAFWLQAASLLVLLALSPGVDAQAQHLCSHLVDALYLVCG-EKGFFYTPKRDVDQLLCLFLSPKSAKENEE

AAC77920 PSQTSQVPRPPASRSPPPMALNTRLRLPLLALLALWAPAPAFVFNQHLCSHLVEALYLVCG-ERGFFYTPKARREAEHQAGAVELGGGLG

INS_PIG FVNQHLCSHLVEALYLVCG-ERGFFYTPKARREAEHQAGAVELGGGLG

INS_BOVIN MALNTRLRLPLLALLALWAPPPAFVFNQHLCSHLVEALYLVCG-ERGFFYTPKARREAEHQVGALELAGGPG

INS_SHEEP MALNTRLVPLLALLALWAPAPAFVFNQHLCSHLVEALYLVCG-ERGFFYTPKARREAEHQVGALELAGGPG

INS_CANFA MALWMRLPLLALLALWAPAPAFVFNQHLCSHLVEALYLVCG-ERGFFYTPKARREAEHQVQVELAGAPG

INS_HUMAN MALWMRLPLLALLALWGPDPAPAFVFNQHLCSHLVEALYLVCG-ERGFFYTPKARREAEHQVQVELGGGPG

INS_PANTR MALWMRLPLLALLALWGPDPAPAFVFNQHLCSHLVEALYLVCG-ERGFFYTPKARREAEHQVQVELGGGPG

INS_CERAE MALWMRLPLLALLALWGPDPAPAFVFNQHLCSHLVEALYLVCG-ERGFFYTPKARREAEHQVQVELGGGPG

INS_MACFA MALWMRLPLLALLALWGPDPAPAFVFNQHLCSHLVEALYLVCG-ERGFFYTPKARREAEHQVQVELGGGPG

INS_AOTTR MALWMRLPLLALLALWGPDPAPAFVFNQHLCSHLVEALYLVCG-ERGFFYTPKARREAEHQVQVELGGGPG

INS1_MOUSE MALLVHFLPLLALLALWEPKPTQAFVKQHLCSHLVEALYLVCG-ERGFFYTPKARREAEHQVQVELGGSP

INS1_RAT MALWMRFLPLLALLVLEWEPKPTQAFVKQHLCSHLVEALYLVCG-ERGFFYTPKARREAEHQVQVELGGGPE

INS2_MOUSE MALWMRFLPLLALLVLEWEPKPTQAFVKQHLCSHLVEALYLVCG-ERGFFYTPKARREAEHQVQVELGGGPG

INS2_RAT MALWIRFLPLLALLVLEWEPKPTQAFVKQHLCSHLVEALYLVCG-ERGFFYTPKARREAEHQVQVELGGGPG

INS_CRILO MALWMRLPLLALLVLEWEPKPTQAFVKQHLCSHLVEALYLVCG-ERGFFYTPKARREAEHQVQVELGGGPG

INS_PSAOB MALWMRLPLLALLVLEWEPKPTQAFVKQHLCSHLVEALYLVCG-ERGFFYTPKARREAEHQVQVELGGGPG

INS_RODSP MALWILLPLLALLVLEWEPKPTQAFVKQHLCSHLVEALYLVCG-ERGFFYTPKARREAEHQVQVELGGGPG

INS_RABIT MASLALLPLLALLVLCRLDPAQAFVFNQHLCSHLVEALYLVCG-ERGFFYTPKARREAEHQVQVELGGGPG

INS_CAVPO MALWMHLLTVLALLALWGPNTQAFVSRHLCSNLVEALYLVCG-DDGFFYTPKDRRELEHQVEQTELGMLG

INS_OCTDE MAFWMHLLTVLALLALWGPNTQAFVSRHLCSNLVEALYLVCG-RS-GFYRPHDRRELEHQVEQTELGMLG

INS1_XENLA MALWMQCLPLVLVLEFFSTPN-TEALVNQHLCSHLVEALYLVCG-DRGFFYTPKARREAEHQVQVELGGGPG

INS2_XENLA MALWMQCLPLVLVLEFFSTPN-TEALVNQHLCSHLVEALYLVCG-DRGFFYTPKARREAEHQVQVELGGGPG

INS_CHICK MALWIRSLPLLALLVLEWEPKPTQAFVKQHLCSHLVEALYLVCG-ERGFFYTPKARREAEHQVQVELGGGPG

INS_SELRF IQSLPLLALLALSGPSTSHAVNQHLCSSHLVEALYLVCG-ERGFFYTPKARREAEHQVQVELGGGPG

INS_ANAPL AANQHLCSSHLVEALYLVCG-ERGFFYTPKARREAEHQVQVELGGGPG

INS_MXGL MALSEFLAAVPLVLLLRAPPSADTRTCHLCCKDLVNLALYLVCG-VRGFFYDPTKMKRDVGLAAFLPLAYAED

Some special cases of sequence alignments

Alignment of protein-coding DNA sequences

L	F
CTT	TTC
CTC	---
L	-

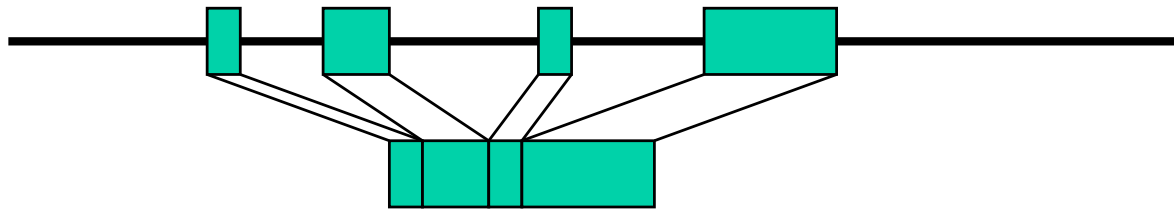
L	F
CTT	TTC
---	CTC
-	L

- (1) alignment of protein sequences
- (2) back-translation of the protein alignment into a DNA alignment

protal2dna: <http://bioweb.pasteur.fr/seqanal/interfaces/protal2dna.html>

Spliced alignment (1)

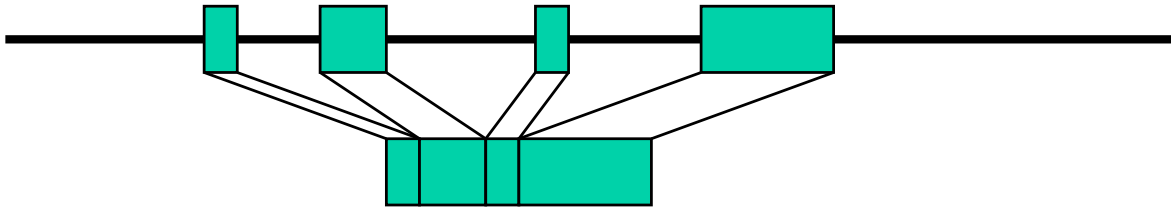
- Align an mRNA with its cognate genomic DNA => gene finding



- No gap penalty at introns => search for splice sites
- sim4, est2genome

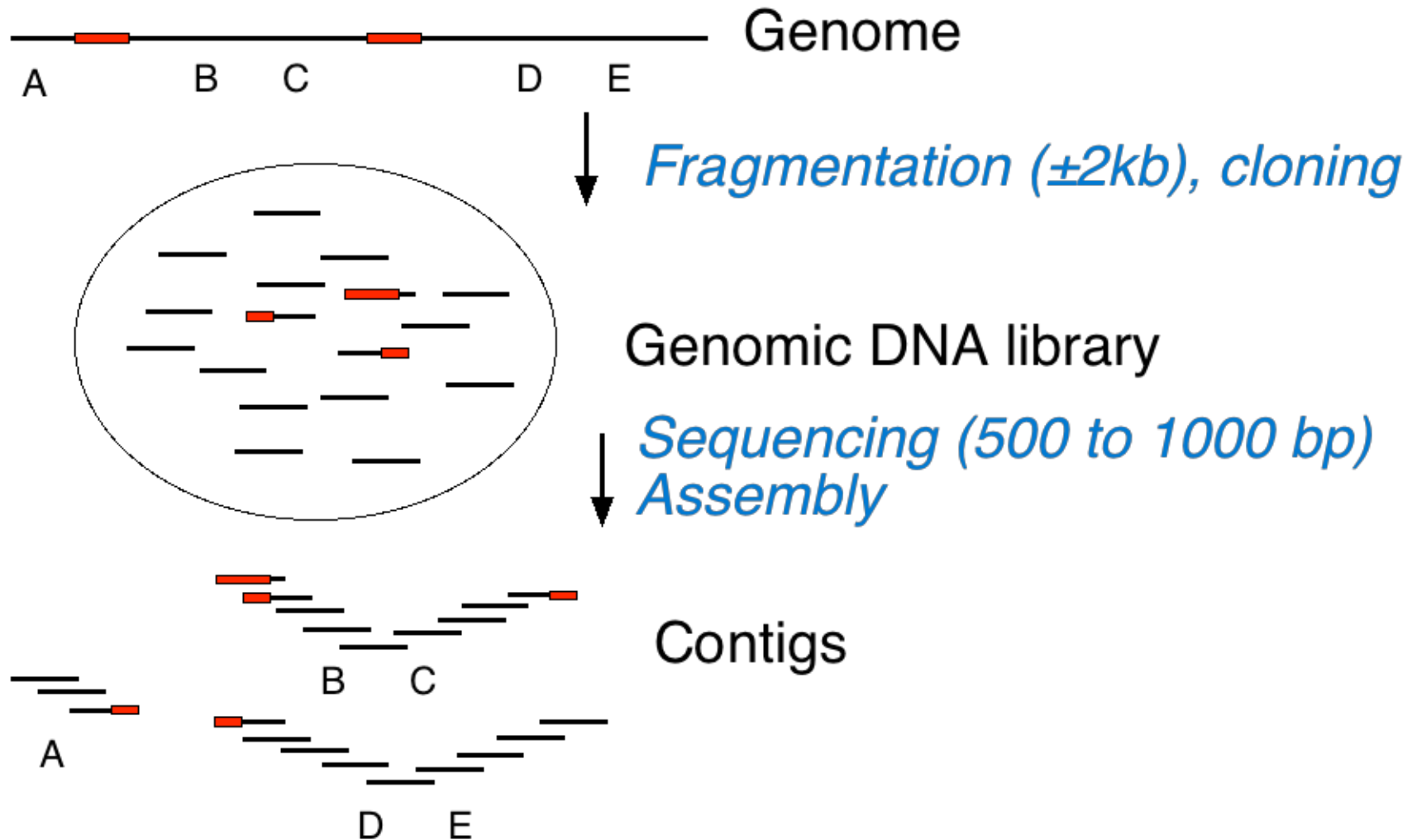
Spliced alignment (2)

- Align a protein with genomic DNA => gene prediction



- No gap penalty at introns => search for splice sites
- genewise

Shotgun sequencing



Sequence assembly

- Search for overlaps between sequence reads
- Allow for sequencing errors (or polymorphism)
- Take into account sequence quality
- cap3, phred/phrap (more complex tools for whole genome assembly)

Sequence similarity search:
advanced methods

Searching for weak similarities
between distantly related
homologs

Limits of pairwise comparison (BLAST, FASTA, ...)

Seq A	CGRRLILFMLATCGECDTDSSE ... HICCIKQCDVQDIIRVCC
	:: : ::: :: :
Insulin	CGSHLVEALYLVCGERGFFYTP ... EQCCTSICSLYQLENYCN
	::: : : : :: :
Seq B	YQSHLLIVLLAITLECFFSDRK ... KRQWISIFDLQTLRPMTA

Pairwise comparison:

Insulin / Seq A : 25% identity

Insulin / Seq B : 25% identity

Insulin gene family: sequence alignment

		B-chain	A-chain
INSL4	Q14641	ELRG CG PRFGKHLLS Y CPMPEKTFTTTPGG... [x] 58	SGRHRFDPF CCE VI C DDGT SV KL CT
INSL3	P51460	REKL CG HHFVRALVR V CGGPRWSTE... [x] 51	AAATNPARY CCL SG CT QD LL TL CPY
RLN1	P04808	VIKL CG RELVRAQIA I CGMSTWS... [x] 109	PYVALFEK CCL IG CT KRS LAKY C
BBXA	P26732	VHTY CG RHLARTLAD L CWEAGVD... [x] 25	GIVDE CCL RP CS VD VLL SY C
BBXB	P26733	ARTY CG RHLADTLAD L CF--GVE... [x] 23	GVVDE CC FRP CT LD VLL SY CG
BBXC	P26735	SQFY CG DFLARTMS I L C WPDPMP... [x] 25	GIVDE CC YRP CT TD VLL KLY CDKQI
BBXD	P26736	GHIY CG RYLAYKMAD L CWRAGFE... [x] 25	GIADE CCL QP CT ND VLL SY C
LIRP	P15131	VARY CG EKLSNALK L V C RGNYNTMF... [x] 58	GVFDE CCR K S C S ISE LQ TY CGRR
MIP I	P07223	RRGV CG SALADLVDF A CSSSNQPAMV... [x] 29	QGTTNIVCE CC MKP CT LSE LRQY CP
MIP II	P25289	PRGI CG SNLAGFRA F I C SNQNSPSMV... [x] 44	QRTTNLVCE CC FNY CT PD VVRKY CY
MIP III	P80090	PRGL CG STLANMVQW L CSTYTTSSKV... [x] 30	ESRPSIVCE CC FNQ CT VQ ELLAY C
MIP V	P31241	PRGI CG SDLADLRAF I C S RRNQPAMV... [x] 44	QRTTNLVCE CC YNV CT VD VFY EY CY
MIP VII	P91797	PRGL CG NRLARAHAN L C F LLRNTYPDIFPR... [x] 86	..EVMAEPSLVCD CC YNE CS VRK LATY C
ILP	P22334	AEYL CG STLADVLS F V C GNRGYNSQP... [x] 31	GLVEE CC YNV CD YSQ LESY CNPYS
INS	P01308	NQHL CG SHLVEALY L V C GERGFFYTPKT... [x] 35	GIVEQ CC TS I C S LYQ LENY CN
IGF1	P01343	PETL CG AELVDALQ F V C GDRGFYF... [x] 12	GIVDE CC FRS CD LRR LEMY CAPLK
IGF2	P01344	SETL CG GELVDTLQ F V C GDRGFYF... [x] 12	GIVEE CC FRS CD LAL LETY CATPA
		* . . *	** * . *

Biomolecular Sequence Motif Descriptors

- Consensus: e.g. TATA box: TATAWAWR
- Regular expression: e.g. insulins PROSITE pattern
C-C-{P}-x(2-4)-C-[STDNEKPI]-x(3)-[LIVMFS]-x(3)-C
- Position-specific weight matrix (profiles, hidden markov models) :
position-specific weighting of substitutions and indels

Matrix of position-specific amino-acid frequency (A-chain of insulin)

	A	C	D	E	F	G	H	I	K	L	M	N	P	Q	R	S	T	V	W	Y	-
1	0	0	0	1	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	16
2	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	1	0	0	16
3	1	0	0	1	0	0	0	0	0	0	1	0	0	3	0	1	0	0	0	0	10
4	2	0	0	0	0	2	0	0	0	0	0	0	1	0	2	1	0	0	0	0	9
5	1	0	0	1	0	0	0	0	0	0	0	0	0	0	2	0	3	0	0	1	9
6	0	0	0	0	0	0	1	0	0	0	0	0	2	0	0	0	4	1	0	0	9
7	1	0	0	0	0	9	0	0	0	0	0	4	0	0	1	2	0	0	0	0	0
8	0	0	0	0	1	0	0	8	0	0	5	0	1	0	0	0	0	2	0	0	0
9	2	0	1	0	2	0	0	0	0	0	0	0	0	0	0	0	0	12	0	0	0
10	0	5	6	4	0	0	0	0	0	0	0	0	1	0	1	0	0	0	0	0	0
11	0	0	1	12	1	0	0	0	1	0	0	0	0	1	0	0	0	0	0	1	0
12	0	17	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
13	0	17	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
14	0	0	0	1	5	0	0	0	0	4	1	0	0	0	1	0	1	0	0	4	0
15	0	0	0	0	0	0	0	1	2	0	0	5	0	1	5	2	0	1	0	0	0
16	0	0	0	1	0	2	0	2	0	0	0	0	5	1	0	3	0	2	0	1	0
17	0	17	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
18	0	0	4	0	0	0	0	0	0	0	0	0	0	0	0	4	9	0	0	0	0
19	0	0	1	0	0	0	0	1	1	5	0	1	1	1	0	0	1	4	0	1	0
20	1	0	6	0	0	1	0	0	0	0	0	0	0	2	3	3	0	0	0	1	0
21	0	0	1	3	0	0	0	0	1	1	0	0	0	2	1	1	1	6	0	0	0
22	0	0	0	0	1	0	0	0	0	14	0	0	0	0	0	1	0	1	0	0	0
23	2	0	0	4	0	0	0	0	1	5	0	0	0	1	2	0	0	1	0	1	0
24	1	0	0	1	0	0	0	0	3	1	1	1	0	1	0	4	4	0	0	0	0
25	0	0	0	0	0	0	0	0	0	2	0	0	0	0	0	0	0	0	0	15	0
26	0	17	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
27	2	0	1	0	0	2	0	0	0	0	0	2	2	0	0	0	1	0	0	2	5
28	0	0	0	0	0	0	0	0	1	0	0	0	2	0	1	0	1	0	0	1	11
29	0	0	0	0	0	0	0	0	0	1	0	0	1	1	1	0	0	0	0	1	12
30	1	0	0	0	0	0	0	1	1	0	0	0	0	0	0	1	0	0	0	0	13

Alignment of SeqA with the matrix of position-specific amino-acid frequency

	A	C	D	E	F	G	H	I	K	L	M	N	P	Q	R	S	T	V	W	Y	-	SeqA
1	0	0	0	1	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	16	-
2	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	1	0	0	16	-
3	1	0	0	1	0	0	0	0	0	0	1	0	0	3	0	1	0	0	0	0	10	-
4	2	0	0	0	0	2	0	0	0	0	0	0	1	0	2	1	0	0	0	0	9	-
5	1	0	0	1	0	0	0	0	0	0	0	0	0	0	2	0	3	0	0	1	9	-
6	0	0	0	0	0	0	1	0	0	0	0	0	2	0	0	0	4	1	0	0	9	-
7	1	0	0	0	0	9	0	0	0	0	0	4	0	0	1	2	0	0	0	0	0	-
8	0	0	0	0	1	0	0	8	0	0	5	0	1	0	0	0	0	2	0	0	0	-
9	2	0	1	0	2	0	0	0	0	0	0	0	0	0	0	0	0	12	0	0	0	-
10	0	5	6	4	0	0	0	0	0	0	0	0	1	0	1	0	0	0	0	0	0	H
11	0	0	1	12	1	0	0	0	1	0	0	0	0	1	0	0	0	0	0	1	0	I
12	0	17	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	C
13	0	17	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	C
14	0	0	0	1	5	0	0	0	0	4	1	0	0	0	1	0	1	0	0	4	0	I
15	0	0	0	0	0	0	0	1	2	0	0	5	0	1	5	2	0	1	0	0	0	K
16	0	0	0	1	0	2	0	2	0	0	0	0	5	1	0	3	0	2	0	1	0	Q
17	0	17	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	C
18	0	0	4	0	0	0	0	0	0	0	0	0	0	0	0	4	9	0	0	0	0	D
19	0	0	1	0	0	0	0	1	1	5	0	1	1	1	0	0	1	4	0	1	0	V
20	1	0	6	0	0	1	0	0	0	0	0	0	0	2	3	3	0	0	0	1	0	Q
21	0	0	1	3	0	0	0	0	1	1	0	0	0	2	1	1	1	6	0	0	0	D
22	0	0	0	0	1	0	0	0	0	14	0	0	0	0	0	1	0	1	0	0	0	I
23	2	0	0	4	0	0	0	0	1	5	0	0	0	1	2	0	0	1	0	1	0	I
24	1	0	0	1	0	0	0	0	3	1	1	1	0	1	0	4	4	0	0	0	0	R
25	0	0	0	0	0	0	0	0	0	2	0	0	0	0	0	0	0	0	0	15	0	V
26	0	17	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	C
27	2	17	1	0	0	2	0	0	0	0	0	2	2	0	0	0	1	0	0	2	5	C
28	0	0	0	0	0	0	0	0	1	0	0	0	2	0	1	0	1	0	0	1	11	-
29	0	0	0	0	0	0	0	0	0	1	0	0	1	1	1	0	0	0	0	1	12	-
30	1	0	0	0	0	0	0	1	1	0	0	0	0	0	0	1	0	0	0	0	13	-
																					Score:	100

Alignment of SeqB with the matrix of position-specific amino-acid frequency

	A	C	D	E	F	G	H	I	K	L	M	N	P	Q	R	S	T	V	W	Y	-	SeqB
1	0	0	0	1	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	16	-
2	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	1	0	0	16	-
3	1	0	0	1	0	0	0	0	0	0	1	0	0	3	0	1	0	0	0	0	10	-
4	2	0	0	0	0	2	0	0	0	0	0	0	1	0	2	1	0	0	0	0	9	-
5	1	0	0	1	0	0	0	0	0	0	0	0	0	0	2	0	3	0	0	1	9	-
6	0	0	0	0	0	0	1	0	0	0	0	0	2	0	0	0	4	1	0	0	9	-
7	1	0	0	0	0	9	0	0	0	0	0	4	0	0	1	2	0	0	0	0	0	-
8	0	0	0	0	1	0	0	8	0	0	5	0	1	0	0	0	0	2	0	0	0	-
9	2	0	1	0	2	0	0	0	0	0	0	0	0	0	0	0	0	12	0	0	0	-
10	0	5	6	4	0	0	0	0	0	0	0	0	1	0	1	0	0	0	0	0	0	K
11	0	0	1	12	1	0	0	0	1	0	0	0	0	1	0	0	0	0	0	1	0	R
12	0	17	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	Q
13	0	17	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	W
14	0	0	0	1	5	0	0	0	0	4	1	0	0	0	1	0	1	0	0	4	0	I
15	0	0	0	0	0	0	0	1	2	0	0	5	0	1	5	2	0	1	0	0	0	S
16	0	0	0	1	0	2	0	2	0	0	0	0	5	1	0	3	0	2	0	1	0	I
17	0	17	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	F
18	0	0	4	0	0	0	0	0	0	0	0	0	0	0	0	4	9	0	0	0	0	D
19	0	0	1	0	0	0	0	1	1	5	0	1	1	1	0	0	1	4	0	1	0	L
20	1	0	6	0	0	1	0	0	0	0	0	0	0	2	3	3	0	0	0	1	0	Q
21	0	0	1	3	0	0	0	0	1	1	0	0	0	2	1	1	1	6	0	0	0	T
22	0	0	0	0	1	0	0	0	0	14	0	0	0	0	0	1	0	1	0	0	0	L
23	2	0	0	4	0	0	0	0	1	5	0	0	0	1	2	0	0	1	0	1	0	R
24	1	0	0	1	0	0	0	0	3	1	1	1	0	1	0	4	4	0	0	0	0	P
25	0	17	0	0	0	0	0	0	0	2	0	0	0	0	0	0	0	0	0	15	0	M
26	0	17	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	T
27	2	0	1	0	0	2	0	0	0	0	0	2	2	0	0	0	1	0	0	2	5	A
28	0	0	0	0	0	0	0	0	1	0	0	0	2	0	1	0	1	0	0	1	11	-
29	0	0	0	0	0	0	0	0	0	1	0	0	1	1	1	0	0	0	0	1	12	-
30	1	0	0	0	0	0	0	1	1	0	0	0	0	0	0	1	0	0	0	0	13	-
																				Score:	34	

Position-specific weight matrix

- Matrix of position-specific amino-acid frequency
- log transformation $\Rightarrow$ position-specific weight matrix = profile
- Similar approach using HMM

DNA weight matrix

- Splice donor sites of vertebrates: frequency (%) of the four bases at each position

Base	Position								
	-3	-2	-1	+1	+2	+3	+4	+5	+6
A	33	60	8	0	0	49	71	6	15
C	37	13	4	0	0	3	7	5	19
G	18	14	81	100	0	45	12	84	20
T	12	13	7	0	100	3	9	5	46
Cons.	M	A	G	G	T	R	A	G	T

Searching for distantly related homologues in sequence databases

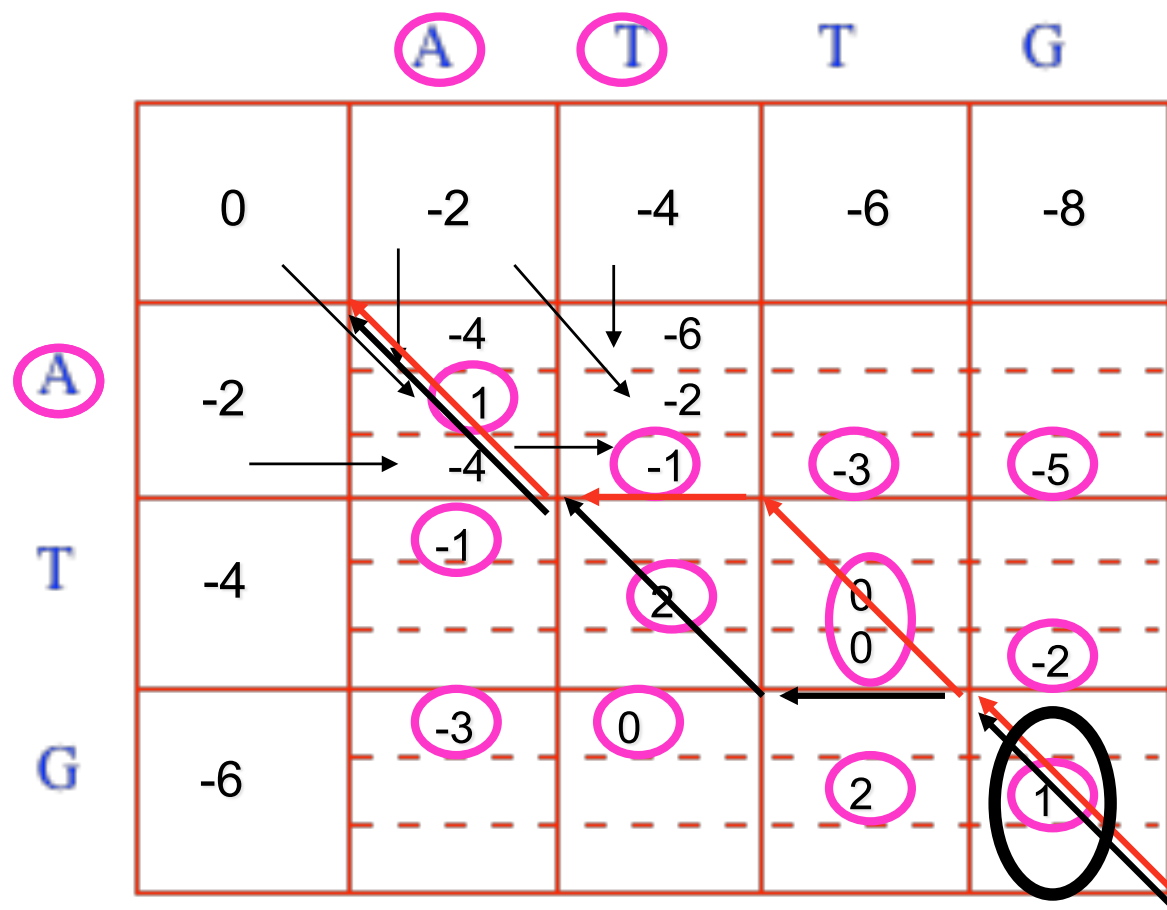
- 1- search for homologues (e.g. BLAST)
 - 2- align homologues (e.g. MUSCLE, MEME)
 - 3- compute a profile from the multiple alignment
 - 4- compare the profile to a sequence database (e.g. MAST, pfsearch)
-
- pfsearch: <http://www.isrec.isb-sib.ch/profile/profile.html>
 - MEME/MAST: <http://meme.sdsc.edu/meme/website/>

PSI-BLAST

- Position-Specific Iterated BLAST
 - 1- classical BLAST search
 - 2- compute a profile with significant BLAST hits
 - 3- BLAST search based on the profile
 - 4 -repeat steps 2-3 up to convergence
- More sensitive than Smith-Waterman
- 40 times faster

Comparison of a sequence to a database of protein motifs

- Databases: PROSITE, PFAM, PRODOM, ..., INTERPRO
- Search tools:
 - ProfileScan : <http://hits.isb-sib.ch/cgi-bin/PFSCAN>



Identité : +1
 Mismatch : +0
 Gap : -2

A	T	T	G
A	T	-	G

$$S = 1 + 1 - 2 + 1 = 1$$

A	T	T	G
A	-	T	G

$$S = 1 - 2 + 1 + 1 = 1$$

- Needleman & Wunsch, 1970

	A	T	T	G
A				
T				
G				

Identité : +1
Mismatch : +0
Gap : -2

N=129 possible alignments

		A	G	C	T	A	
A		-	-	-	-	-	Identité : +1
		-	-	-	-	-	Mismatch : 0
T		-	-	-	-	-	Gap : -2
		-	-	-	-	-	
T		-	-	-	-	-	
		-	-	-	-	-	
A		-	-	-	-	-	

N=681 possible alignments

		C	T	A	C	G	T	A
C								
T								
A								
T								
A								

Identité : +1
 Mismatch : +0
 Gap : -2

N=7183 possible alignments