## **BLAST** for proteins, step 3

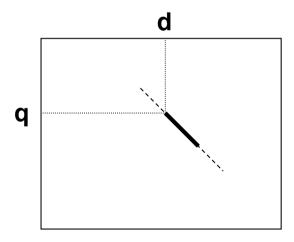
- Expand the hits into HSPs in both directions (no gaps) by adding score values from the substitution score matrix.
- In each direction, stop when the score decreases more than a threshold X from the highest score seen so far.

#### **Example**

Let the query q be CCAACCDACCACD, the database sequence d be ADAADACACA, with the scoring scheme as in the example in Section 2.4.2. Suppose we treat the second word, DA, which will first have a match at index three in the query with score 1.5 (AA DA). We will extend this hit (using only one hit in this example), and let the cut-off distance be 1. Extending to right gives the following:

From q:	A	Α	С	С	D	Α	C	C	Α	С	D
From d:	D	Α	Α	D	Α	С	Α	С	Α		
Pairwise sco	ore 0.5	1.0	-0.5	0.0	0.5	-0.5	-0.5				
Sum score		1.5	1.0	1.0	1.5	1.0	0.5				

The extension stops at the second (C, A) match, since the score has dropped below the threshold (1). Two segment pairs with score 1.5 are found (AA, DA) and (AACCD, DAADA). Note, however, that these are not (really) local maximals, since further extension (with CA, CA) would result in a higher score (2.5).  $\triangle$ 

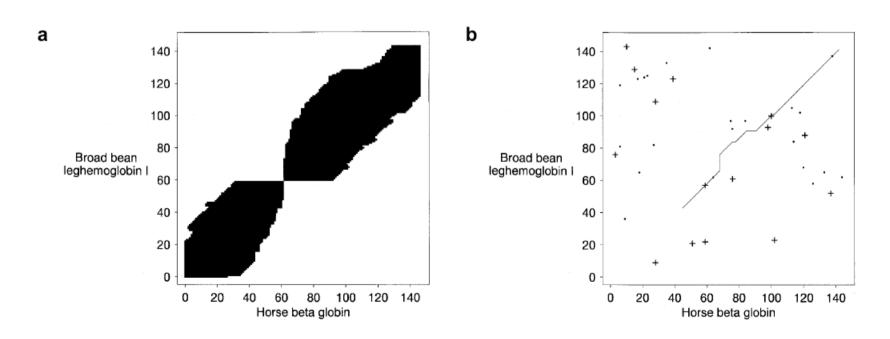


## **BLAST** for proteins, step 4

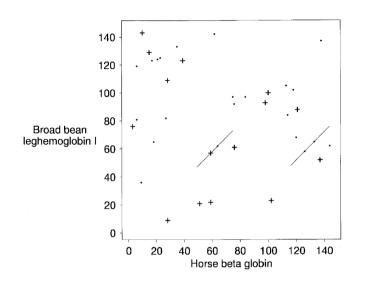
- Keep HSPs with score of at least S<sub>q</sub>.
- The threshold is set to corresponds to approximately 2% of the database sequences on average

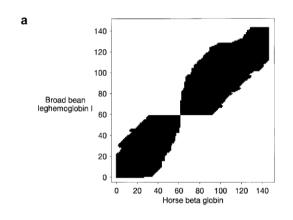
## **BLAST** for proteins, step 5

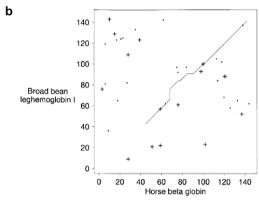
- Recalculate the score again by computing an optimal local alignment score within an area around a "seed" in the middle of the HSP.
- The area is limited by the H-value in the DP-matrix not dropping more than a certain value (X<sub>g</sub>) below the current optimal alignment score



#### **BLAST** example







#### **BLAST** hits in the alignment

- + Hits with score >= 13
- Hits with score >= 11

#### a) Areas explored by BLAST during final alignment

b) Graph of the alignment

```
Leghemoglobin 43 FSFLKDSAGVVDSPKLGAHAEKVFGMVRDSAVQLRATGEVV--LDGKDGS----- 9
F L + V+ +PK+ AH +KV L + GE V LD G+

Beta globin 45 FGDLSNPGAVMGNPKVKAHGKKV-------LHSFGEGVHHLDNLKGTFAALSE 9

Leghemoglobin 91 IHIQKGVLDP-HFVVVKEALLKTIKEASGDKWSEELSAAWEVAYDGLATAI 140
+H K +DP +F ++ L+ + G ++ EL A+++ G+A A+

Beta globin 91 LHCDKLHVDPENFRLLGNVLVVVLARHFGKDFTPELQASYQKVVAGVANAL 141
```

## Differences between nucleotide and protein searches

- The databases are often larger (e.g. several complete eukaryote genomes)
- The required sensitivity is usually lower (except when looking for ncRNA)
- Often we would like to find almost identical matches, allowing only a few mismatches or small gaps due to sequencing errors or a few mutations (polymorphisms)
- We have only four symbols: a, c, g and t
- We usually do not use a scoring matrix, we just use:
  - one single score for matches (e.g. +5)
  - one single penalty for mismatches (e.g. -4)
  - a gap penalty (e.g. 12-4k)

#### Typical usage of nucleotide searches

- Identify the genomic location of an mRNA, a cDNA, an exon or an EST (from the same species), i.e. mapping part of a transcript to the genome sequence
- Identify similar (corresponding) genomic regions in relatively closely related species (e.g. mouse and human genomes) (synteny)

#### Other examples:

 Identify homologous non-protein coding regions (e.g ribosomal RNA) (often requires more sensitivity)

## **BLASTN** and MegaBLAST

#### **BLASTN**

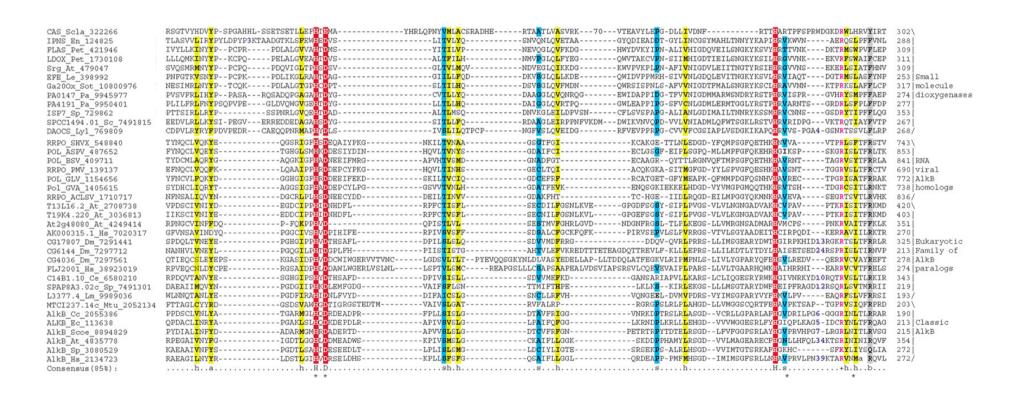
- Word length is W=11 by default
- Only identical words considered hits

#### MegaBLAST

- Similar to BLASTN
- Optimized for longer sequences and almost perfect matches
- Uses default word length W=28
- Requires 28 consecutive matching nucleotides between the query and a database sequence
- Much faster than BLASTN, but reduced sensitivity
- Reference:
   Zhang Z, Schwartz S, Wagner L, Miller W (2000)
   A greedy algorithm for aligning DNA sequences.
   J Comput Biol., 7 (1-2), 203-14.

## **Back to the example...**

How are all these sequences found? Ordinary BLAST is not enough...

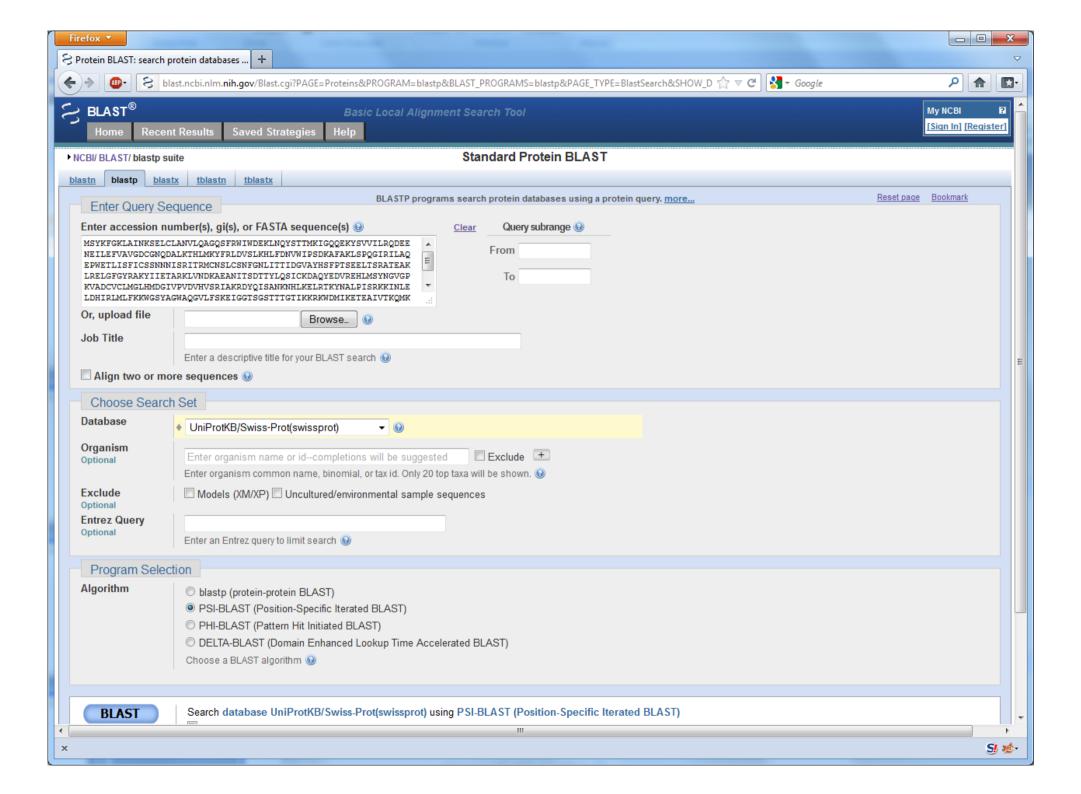


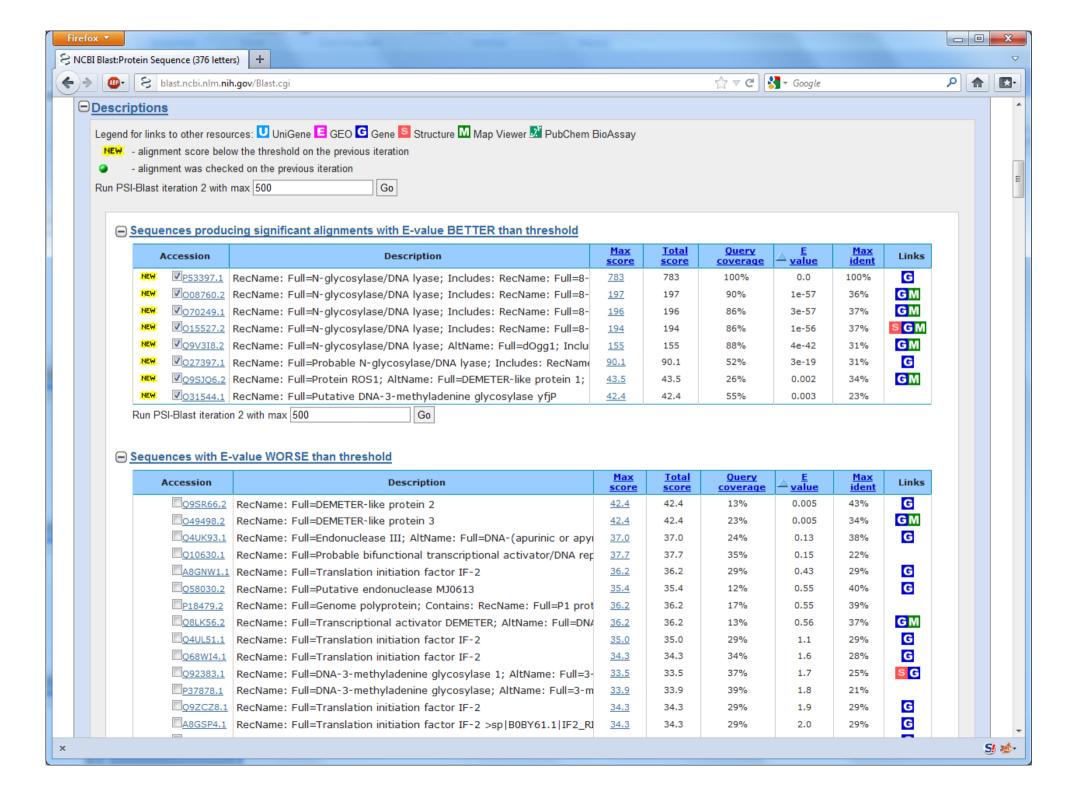
#### **Excerpt from the AlkB paper**

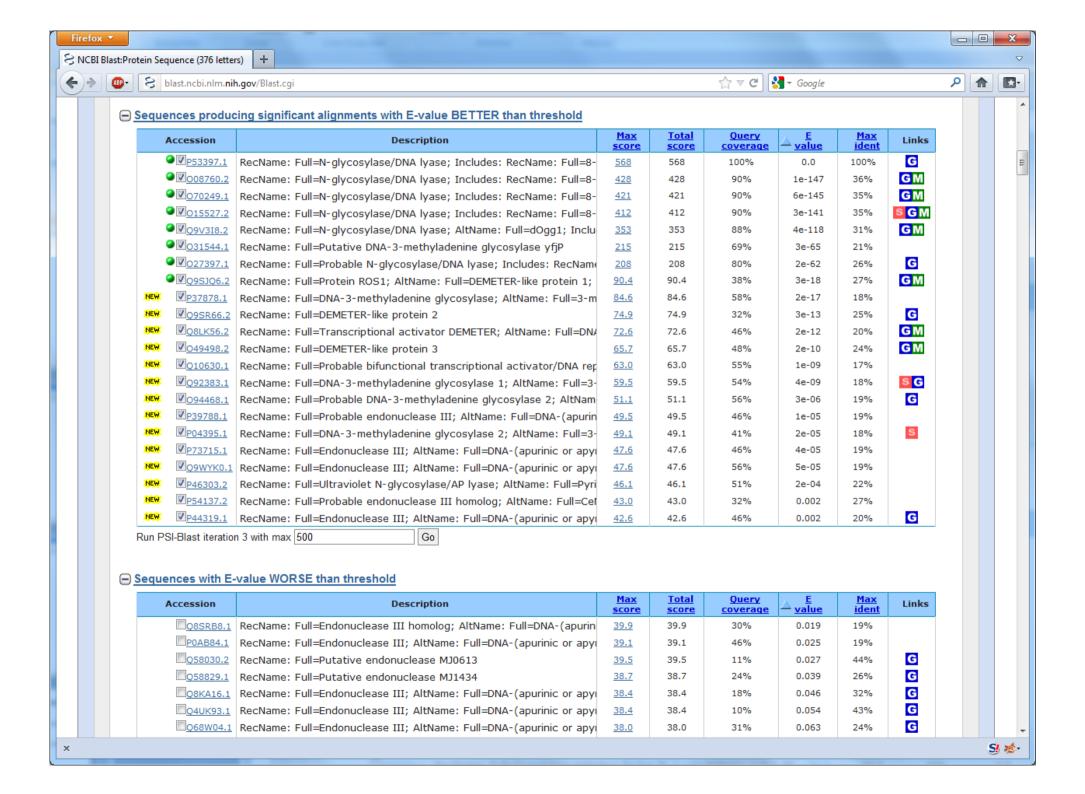
#### Results and discussion

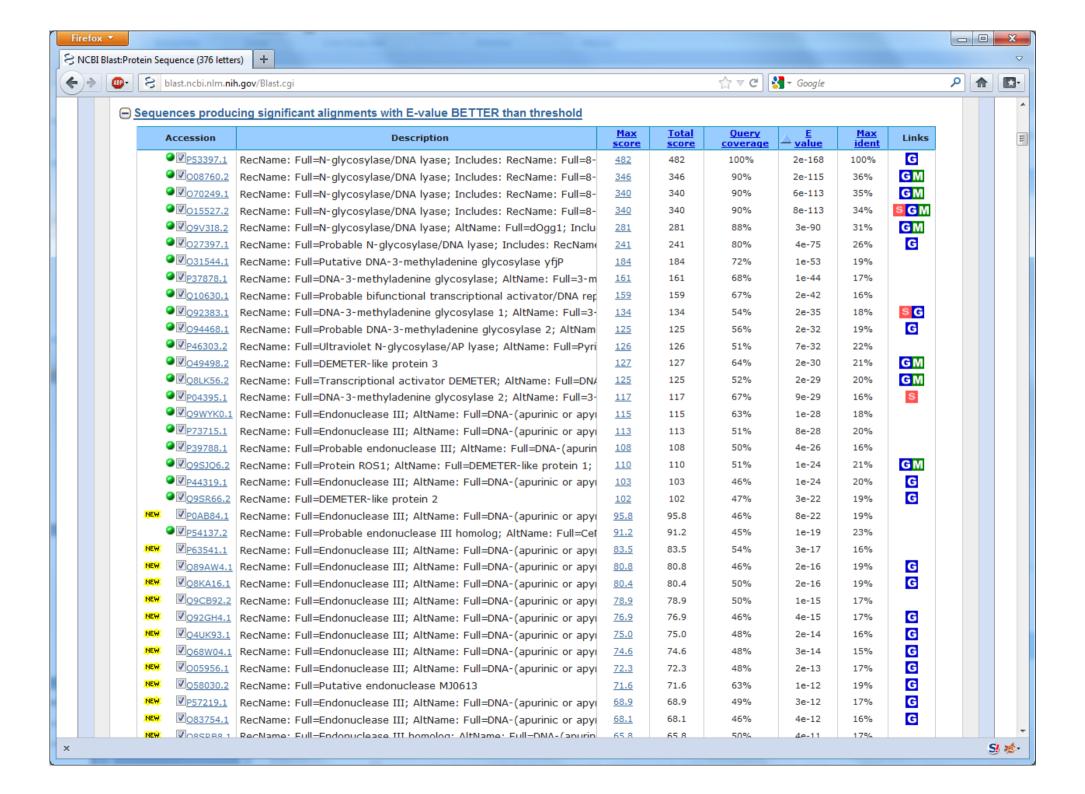
#### The 2OG-Fe(II) dioxygenase protein superfamily: classification and functional prediction

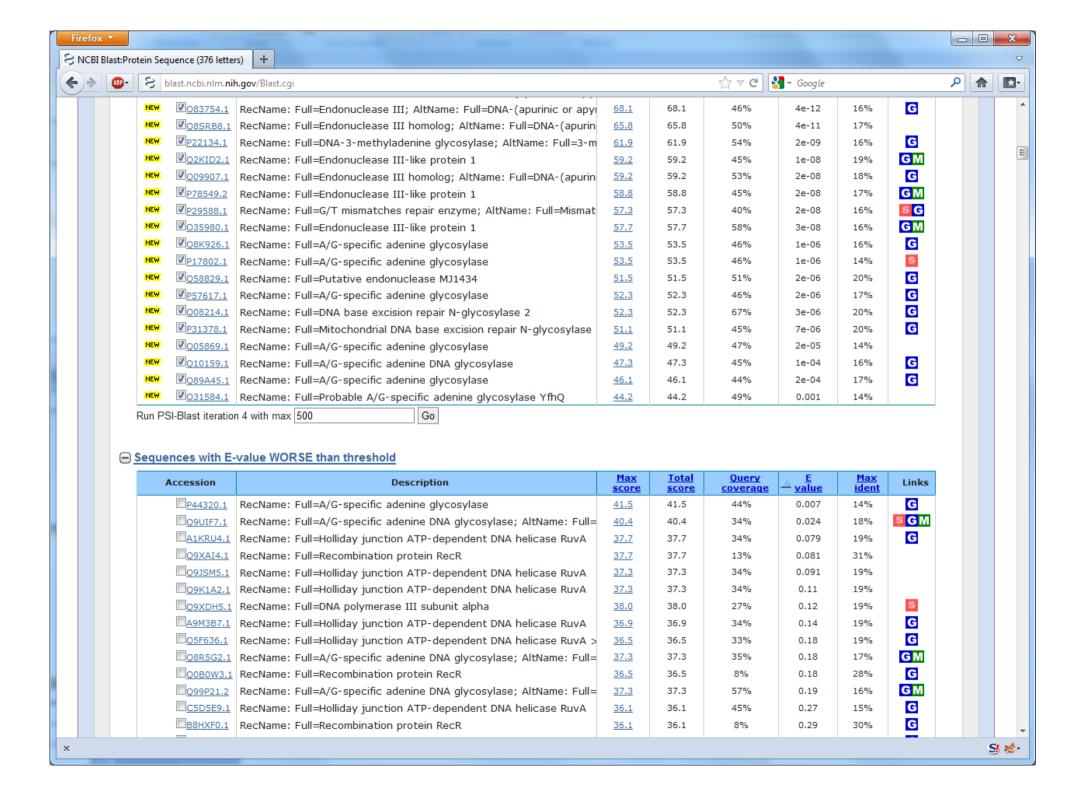
The Non-redundant Protein Sequence Database (NCBI) [21] was searched using the PSI-BLAST program [22] run to convergence, with a profile-inclusion threshold of 0.01 and AlkB protein sequences from various organisms as queries. In addition to the AlkB orthologs, these searches retrieved from the database, with statistically significant expectation (e) values, several other more distant homologs of AlkB, including uncharacterized eukaryotic proteins and fragments of the polyproteins of plant RNA viruses from the carla-, tricho- and potexvirus families. Examples of homologs found include: Leishmania L3377.4, iteration 5, e-value = 8 x 10<sup>-7</sup>; *Drosophila* CG17807, iteration 3, e-value = 4 x 10<sup>-6</sup>; papaya mosaic virus, iteration 3, e-value = 2 x 10<sup>-4</sup>. Further iterations of the search using each of the detected proteins as a new query resulted in the detection of several more eukaryotic proteins, including EGL-9 and leprecan, several uncharacterized bacterial proteins and prolyl and lysyl hydroxylases. Finally, another iteration of database searches initiated with the sequences of bacterial proteins, typified by E. coli YbiX, resulted in the unification of these proteins with plant dioxygenases such as leucoanthocyanidin oxidase and gibberellin-20 oxidase. In this context, it should be noted all a all a DNTA consideration and all all and a large and all all and a large and a large











## Using a family of proteins as query

Instead of searching with a simple sequence, we can search with a family of proteins, represented by a model.

Models for the representation of a family of protein sequences:

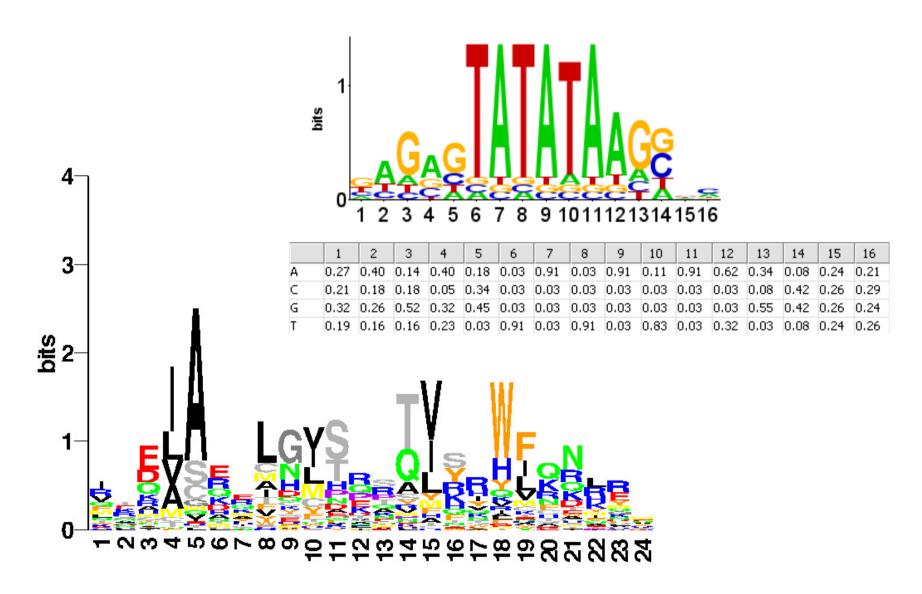
- Set of sequences
- Consensus sequence
- Patterns: Simplified "regular expressions"
- Profiles: position-specific scoring matrices (PSSMs) based on probabilities of amino acid substitutions (Gribskov et al. 1987)
- Hidden Markov models (HMMs): probabilistic model for linear sequences (Haussler et al. 1993)

A good multiple alignment of the sequences in the family is essential for most of these models.

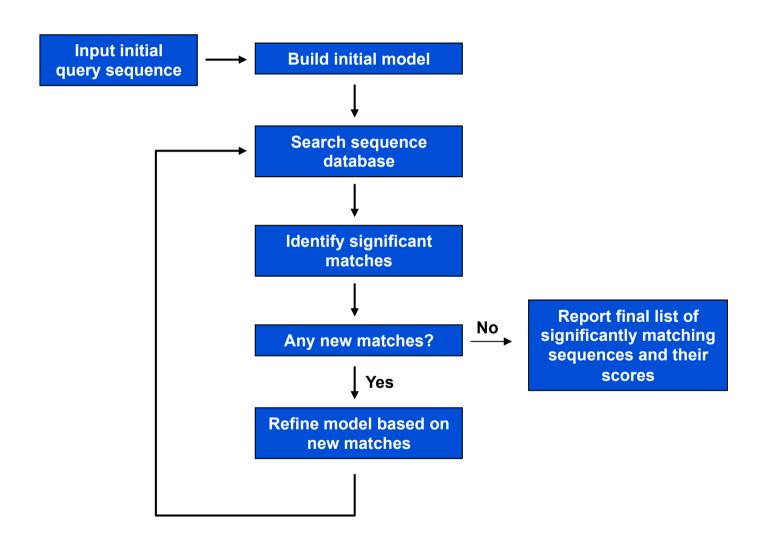
## **Sequence profiles (PSSMs)**

- Position-specific scoring matrices
- Based on a multiple alignment of proteins in a family
- A matrix of 21 x L cells, where L is the length of the alignment (21 for the 20 amino acids + gap)
- Scores in each cell are calculated as a weighted average of the scores from a substitution score matrix (e.g. BLOSUM62) for matching a certain amino acid with each of the amino acids present in the proteins in a specific position in the multiple alignment.
- Sequences are weighted in order to reduce the effect of many similar sequences.

#### **DNA** and protein sequences logos



#### **Iterated searches**



#### **BLAST** online resources

- NCBI BLAST website <u>http://www.ncbi.nlm.nih.gov/BLAST/</u>
- NCBI tutorial on BLAST <u>http://www.ncbi.nlm.nih.gov/Education/BLASTinfo/information3.html</u>
- NCBI Handbook, Chapter 16, BLAST <u>http://www.ncbi.nlm.nih.gov/books/bv.fcgi?rid=handbook.chapter.ch16</u>
- BLAST FAQ <u>http://www.ncbi.nlm.nih.gov/blast/blast\_FAQs.shtml</u>
- Wikipedia on BLAST <u>http://en.wikipedia.org/wiki/BLAST</u>

#### Literature

#### **PSI-BLAST** paper

Gapped BLAST and PSI-BLAST: a new generation of protein database search programs
 Altschul SF et al. (1997)
 Nucleic Acids Research, 25, 3389-3402.
 <a href="http://nar.oupjournals.org/cgi/content/abstract/25/17/3389">http://nar.oupjournals.org/cgi/content/abstract/25/17/3389</a>

#### AlkB paper

The DNA-repair protein AlkB, EGL-9, and leprecan define new families of 2-oxoglutarate- and iron-dependent dioxygenases Aravind L, Koonin EV (2001)
 Genome Biology, 2(3):RESEARCH0007.
 <a href="http://genomebiology.com/2001/2/3/RESEARCH/0007">http://genomebiology.com/2001/2/3/RESEARCH/0007</a>





## What is a multiple alignment (MSA)?

- Extension of pairwise alignments to three or more sequences
- Usually global alignments entire sequences included
- Indicates common conserved residues in all or most sequences – usually important for function / activity
- Indicates accepted residues in the different positions
- Indicates positions where gaps are more likely
- Basis for construction of phylogenetic trees
- Basis for sequence motifs and profiles
- Essential for evolutionary studies and phylogenetics

## **Example**

```
CAS Scla 322266
                  RSGTVYHDVYP-SPGAHHL-SSETSETLLEPHTBMA-------YHRLOPNYUMLACSRADHE-----RTANTLVASVRK---70---VTEAVYLEPG-DLLIVDNF-------RTTHARTPFSPRWDGKDRWLHRVWIRT 302\
IPNS En 124825
FLAS Pet 421946
LDOX Pet 1730108
Srg At 479047
EFE Le 398992
                                                                                                                                    253 Small
Ga200x Sot 10800976
                                                                                                                                    317 molecule
PA0147 Pa 9945977
                                                                                                                                    274 dioxygenases
PA4191_Pa_9950401
ISP7 Sp 729862
SPCC1494.01 Sc 7491815
                  CDPVLRYRYFPDVPBDR--CAECOPNINMAPHYDLS-----IVBLILDTPCP----NGFVSLOVSIDG-----RFVEVPPPPG-CVVVFCGSIAPLVSDKIKAPCHRVVS-PGA4-GSNRTSSVLFLRP
DAOCS Lyl 769809
                  TYNCCLVOKYB- OGSRIGFE-DEQAIYFKG- NKILTVNAA GSGTFGI KCAKGE-TILNLEDGD-YFQMFSGFQETHKENVVA- VTFRLEFTFRSTV
FYNCCLVOEYS- TGHGL-SMERODESIYDIN HOVLTVNYS GGAIFGI ECLGSGF-EIPLSGFQ-MLLMPFGFQKEHREGIKSP-SKGRISLTFRLIK
TYDCMLAQRYG- AQGKIGFHADNEEIFMRG- APVHTVSMD GNADFGT ECAAGR-QYTTRICHVGFTMFSGFQETHKEAVRNT- TAGRYSTFRRLA
EFNCLVQQFK- LQAAIFFHEDDEFCYFKG- HOVLI'NS GELTQI AQQKGKA-SITWGFGD-YYLSFVGFQESHKEAVSNT- TGGRYSLTFRCTV
RRPO SHVX 548840
POL_ASPV_487652
POL BSV 409711
RRPO PMV 139137
                  690 Wiral
POL GLV 1154656
Pol GVA 1405615
RRPO ACLSV 1710717
T13L16.2 At 2708738
T19K4.220 At 3036813
At2g48080 At 4249414
AK000315.1 Hs 7020317
CG17807 Dm 7291441
                                                                                                                                    325 Eukarvotic
CG6144_Dm_7297712
CG4036_Dm_7297561
                                                                                                                                    213 Family of
                  FLJ2001 Hs 38923019
C14B1.10_Ce_6580210
SPAP8A3.02c Sp 7491301
                 L3377.4 Lm 9989036
MTCI237.14c Mtu 2052134
AlkB Cc 2055386
ALKB Ec 113638
AlkB Scoe 8894829
AlkB At 4835778
AlkB Sp 3080529
                  RABAGI INIYR - LDSTLGI BVENSELDHS - KPLLSESFG - QSAIFILGGI - QRDEAF P-PMFMHSGD - IMIMSGFSRLLNBAYPRVLPN39KTARVNMA RQVL 272/
AlkB Hs 2134723
                  h.a. h.H.D. sh.h. s.h. s.h. H.s. +h.h.b.
Consensus (85%):
```

## Approaches to multiple alignment

Some of the major approaches used to construct MSAs:

- Brute force optimal alignment (very hard)
- Centre-star alignment (simple, used in PSI-BLAST)
- Progressive alignment (e.g. Clustal W)
- Iterative alignment (e.g. Muscle)

#### A lot of software...

- Clustal W progressive
- T-Coffee progressive
- MUSCLE iterative
- MAFFT various technques
- ProbCons probabilistic
- Dialign, Dialign2 blocks-based
- MSA full DP
- DCA divide and conquer
- DbClustal progressive
- Poa progressive
- PRALINE progressive
- PRRN iterative
- Match-Box blocks-based
- ...

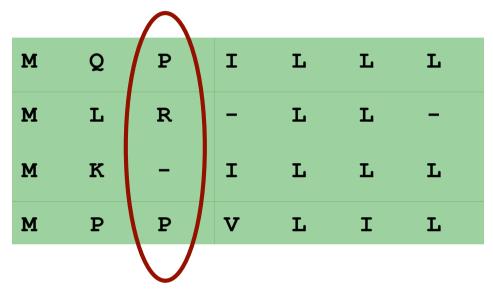
## Finding the best multiple alignment

- To find the best multiple sequence alignments the MSA programs will try to find the one with the highest score
- The score is usually the sum-of-pairs-score or similar
- Corresponds approximately to the sum of all pairwise alignment scores
- For the alignment A of m sequences s<sup>1</sup> til s<sup>m</sup> we have the sum-of-pairs score S(A):

$$S(A) = \sum_{i=1}^{m-1} \sum_{j=i+1}^{m} S(\bar{s}^i, \bar{s}^j).$$

• S(a,b) is the pairwise score of a and b, and  $s^{-i}$  is the projection of  $s^{i}$ , that is,  $s^{i}$  with inserted gaps

#### The sum-of-pairs score

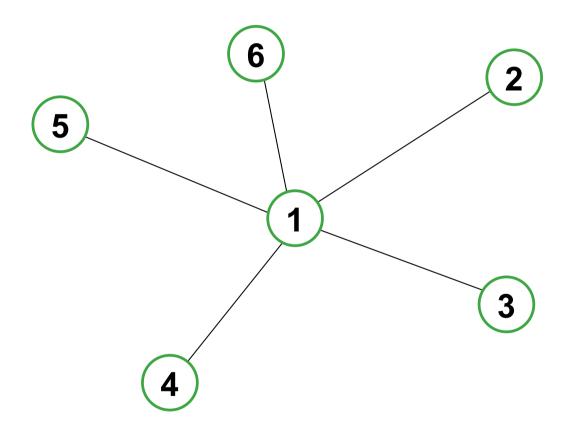


score(k) = 
$$S(P,R) + S(P,-) + S(P,P) + S(R,-) + S(R,P) + S(-,P)$$
  
score for column k = 3

We have  $S(-,-) = 0$ 

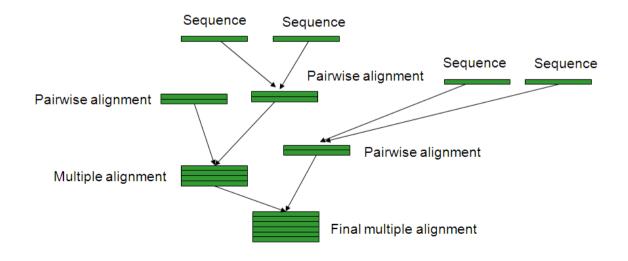
Total score = score(1) + score(2) + .... + score(N)

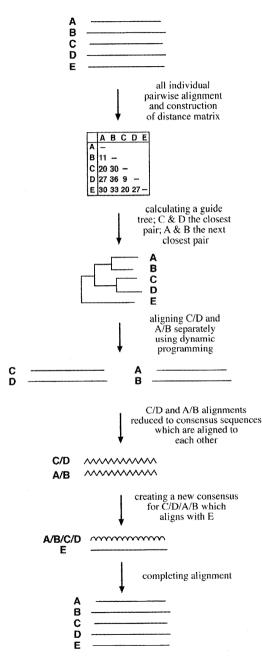
## **Centre star multiple alignment**



#### **Clustal W**

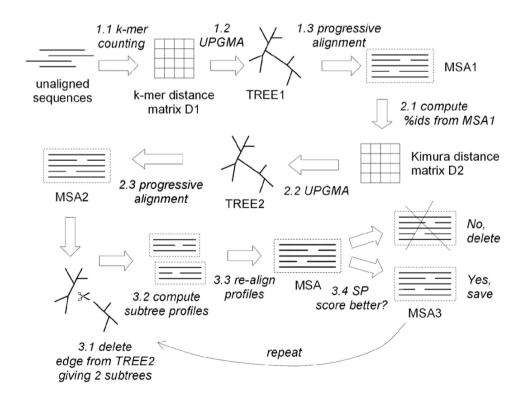
- One of the most commonly used and wellknown tools for multiple sequence alignment. Now somewhat outdated and surpassed by other tools.
- Uses a progressive algorithm: Always starts with the most similar sequences and then aligns less similar sequences with each other.





#### **MUSCLE**

- MUSCLE = Multiple Sequence Comparison by Log Expectation
- Iterative procedure: improves the alignment gradually until good enough by introducing random changes in the alignment
- Very high quality of alignments
- Much faster than Clustal W



#### **More here**

PROTOCOL

# Using the T-Coffee package to build multiple sequence alignments of protein, RNA, DNA sequences and 3D structures

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T-Coffee (Tree-based consistency objective function for alignment evaluation) is a versatile multiple sequence alignment (MSA) method suitable for aligning most types of biological sequences. The main strength of T-Coffee is its ability to combine third party aligners and to integrate structural (or homology) information when building MSAs. The series of protocols presented here show how the package can be used to multiply align proteins, RNA and DNA sequences. The protein section shows how users can select the most suitable T-Coffee mode for their data set. Detailed protocols include T-Coffee, the default mode, M-Coffee, a meta version able to combine several third party aligners into one, PSI (position-specific iterated)-Coffee, the homology extended mode suitable for remote homologs and Expresso, the structure-based multiple aligner. We then also show how the T-RMSD (tree based on root mean square deviation) option can be used to produce a functionally informative structure-based clustering. RNA alignment procedures are described for using R-Coffee, a mode able to use predicted RNA secondary structures when aligning RNA sequences. DNA alignments are illustrated with Pro-Coffee, a multiple aligner specific of promoter regions. We also present some of the many reformatting utilities bundled with T-Coffee. The package is an open-source freeware available from http://www.tcoffee.org/.