


*Sequence Analysis  
(part III)*

BBSI 2006: Lecture #( $\chi$ +3)  
*Takis Benos (2006)*



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*Outline*

- Sequence variation
- Distance measures
- Scoring matrices
- Pairwise alignments (global, local)
- Database searches (BLAST, FastA)
- Multiple sequence alignments



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*Database Searches*



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### Database search: why?

- Database searching is the first step in characterizing a newly discovered gene.
- It helps determining the function and the evolutionary relationships.
- It answers the question: “*Has anyone seen anything like that before?*”



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### Database search

- Database searching consists of **many** pairwise alignments combined in one search.
- Heuristic algorithms are used instead of DP.  
*Why?*
  - Size of SWISS-PROT + TrEMBL: 1M entries or 344M residues.
  - Exact algorithms are  $O(nm)$  fast.
- The goal of the heuristic methods is to look at a small fraction of the searching space that will include all (or most) of the high scoring pairs.



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### BLAST algorithm

- Basic Local Alignment Search Tool - The method:
  - For each (fixed-length) “word” in the query sequence, make a list of all neighbouring “words” that score above some threshold.
  - Scan the database for these words.
  - Perform (ungapped) “hit extension”.
  - Stop at maximum scoring extension.



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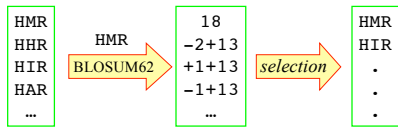
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### BLAST algorithm (cntd)

- An example:

Query: CPICHRAFHRLEHQTRHMRRIHTGKPHAC



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### BLAST algorithm (cntd)

- An example:

Query: CPICHRAFHRLEHQTRHMRRIHTGKPHAC

H+R

Sbjct: CPLCDKAFHRLEHQTRHIRTHHTGKPHAC



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### BLAST algorithm (cntd)

- An example:

Query: CPICHRAFHRLEHQTRHMRRIHTGKPHAC

CP+C +AFHRLEHQTRH+R HTGKPHAC

Sbjct: CPLCDKAFHRLEHQTRHIRTHHTGKPHAC



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## BLAST algorithm (cntd)

- The idea: a high scoring match alignment is very likely to contain a short stretch of very high scoring matches.
- Word length: 3 (proteins) and 11 (DNA).
- HSSP: multiple HSSPs can be reported for each database entry.
- Gapped alignments: more recently, BLAST versions perform gapped alignments.



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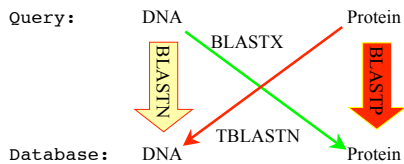
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## BLAST flavours



TBLASTX: DNA Query to DNA Database *via* translation



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## Database searching programs

Program	Query	Database	Examples of usage
1. BLASTN	DNA	DNA	identical/closely related genes
2. BLASTP	Prot	Prot	general use program ( <i>recom.</i> )
3. BLASTX	DNA <sup>(*)</sup>	Prot	find exons in your genomic seq.
4. TBLASTN	Prot	DNA <sup>(*)</sup>	find the location/structure of your gene in the genome
5. TBLASTX	DNA <sup>(*)</sup>	DNA <sup>(*)</sup>	<i>nothing really....</i>

(\*) translated query/database



BLAST tutorial:  
<http://www.ncbi.nlm.nih.gov/Education/BLASTinfo/information3.html>

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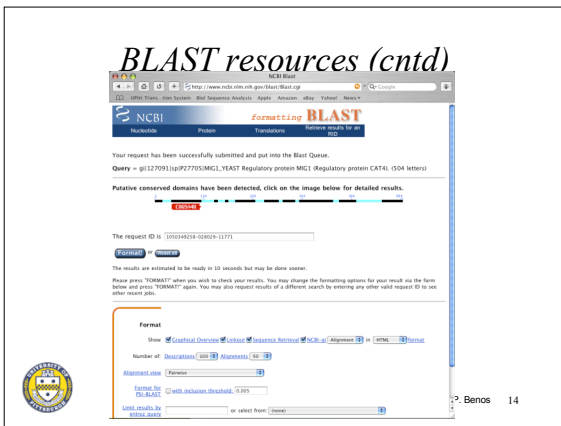
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### *BLAST output*

**BLASTP 2.2.5 [Nov-16-2002]**  
**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.

RID: 1050176602-03205-14137

**Query=** gi|127091|sp|P27705|MIG1\_YEAST Regulatory protein MIG1 (Regulatory protein CAT4).  
 (504 letters)

**Database:** All non-redundant GenBank CDS translations+PDB+SwissProt+PIR+PRF  
 1,411,415 sequences; 454,141,287 total letters

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### *FASTA algorithm*

- The method:
  - For each pair of sequences (query, subject), identify all identical “word” matches of (fixed) length.
  - Look for diagonals with many mutually supporting “word” matches.
  - The best diagonals are used to extend the word matches to find the maximal scoring (ungapped) regions.



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### *FASTA algorithm (cntd)*

- The method:
  - Join ungapped regions, using gap costs.
  - Align the two (sub)regions using full dynamic programming techniques.



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### *FASTA algorithm (cntd)*

- The idea: a high scoring match alignment is very likely to contain a short stretch of identities.
- Word length: 2 (proteins) and 4-6 (DNA).
- HSSP: usually one (extended) gapped alignment is presented.



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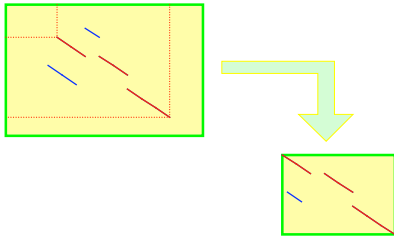
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## FASTA algorithm (cntd)



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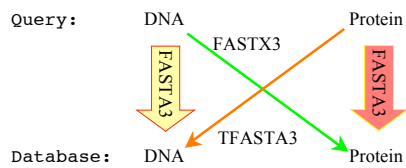
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## FASTA flavours



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## DNA or protein?

- It depends...

*Question:* What is more conserved?

```
ATG aat cgt ctt att gaa
M N R L I E
ATG aag agg ttg ata gag
```



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## DNA or protein?

- It depends...

*Question:* What is more conserved?

```
ATG aat cgt ctt att gaa
||| || | | || ||
ATG aag agg ttg ata gag
```



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## DNA or protein? (cntd)

- Some facts:
  - DNA sequences generally change quicker than the protein sequences.
  - DNA databases are larger than the protein ones (e.g. human genome: 2.9 billion bases; SWISS-PROT+TrEMBL: 1 million a.a.)
  - DNA: 4 symbols; a.a.: 20 symbols



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## DNA or protein? (cntd)

- So...
  - DNA searches have lower signal to noise ratio.
- However...
  - ...they can still be useful in searching for closely related genes and establishing evolutionary relationships.
  - More sensitive in EST hunting.



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### *Some links...*

- BLAST programs on the web (NCBI), includes PSI-BLAST and PHI-BLAST:  
<http://www.ncbi.nlm.nih.gov/BLAST/>
- BLAST parameters:  
<http://www.ncbi.nlm.nih.gov/BLAST/newoptions.html>  
<http://blast.wustl.edu/blast/parameters.html>
- BLAST help:  
<http://www.ncbi.nlm.nih.gov/blast/html/BLASThomehelp.html>



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### *Some links...(cntd)*

- BLAST program selection guide:  
<http://www.ncbi.nlm.nih.gov/BLAST/producttable.html>
- BLAST tutorials:  
<http://www.ncbi.nlm.nih.gov/Education/BLASTinfo/information3.html>



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### *Some links...(cntd)*

- FASTA programs on the web (EMBL-EBI and DDBJ):  
<http://www.ebi.ac.uk/fasta33/>  
<http://gib.genes.nig.ac.jp/single/fasta3/main.php>
- FASTA parameters/help:  
[http://fasta.genome.ad.jp/dbget-bin/show\\_man?fasta3](http://fasta.genome.ad.jp/dbget-bin/show_man?fasta3)



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## Multiple sequence alignments - sequence evolution



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### Background

- Proteins are related to each other through evolution.
- There is a unique true underlying evolutionary tree...
- ...but we do not know it!
- There is no objective way to define the “correct” alignment, for the interesting cases (i.e. ~30% average a.a. identity pairwise).



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### Background (cntd)

- Different parts of the proteins have different evolutionary constraints.
- Multiple alignment methods, in principle, can identify the better conserved regions.
- Ideally, the amino acids in a multiple alignment column occupy similar three-dimensional positions in the folded protein.



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## Background (cntd)

```
CYB_ASCSU HFNGASLFFIFLYLHLFK
CYB6_MARPO HRWSASMMVLMMLLHIFR
CYB_TRYBB HICFTSLLYLLLYIHIFK
*   :*:: ::: :*:*:

CYB_ASCSU GLF...FMSY..RLKK..VWVS
CYB6_MARPO VYL...TGGFKKPREL..TWVT
CYB_TRYBB SITLILFDTH..IL...VWFI
          .*.


```

Manually curated (Pfam):



[http://pfam.wustl.edu/cgi-bin/getdesc?name=cytochrome\\_b\\_N](http://pfam.wustl.edu/cgi-bin/getdesc?name=cytochrome_b_N)

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## Multiple alignment scoring

- Complete probabilistic model:  
Impractical (very complex; not enough data).
- Simplifying assumptions:
  1. Individual columns are statistically independent.
  2. Residues *within* the column are considered independent (i.e. information on phylogeny is ignored).



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## Multiple alignment scoring (cntd)

Method-1: minimum entropy

$$Sc(\text{alignment}) = Sc(\text{gaps}) + \sum_i Sc(\text{col}_i)$$

$$Sc(\text{col}_i) = - \sum_a c_a(i) \log p_a(i)$$

$$p_a(i) = c_a(i) / N(i)$$



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### Multiple alignment scoring(cntd)

Method-2: sum of pairs (SP)

$$SP(i) = Sc(col_i) = \sum \sum_{k < l} Sc_i(k, l)$$

Problem: Compare SP scores

BLOSUM

- N sequences with *Arg* at position *i*.
- N-1 sequences with *Arg* and one with *Lys*.



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### Multiple alignment scoring(cntd)

N sequences with *Arg* at position *i*.

- BLOSUM62:  $Sc(Arg, Arg) = 5$
- $SP1 = 5 \times N(N - 1) / 2$

N-1 sequences with *Arg*, one with *Lys*.

- BLOSUM62:  $Sc(Arg, Lys) = 2$
- $SP2 = SP1 - 3 \times (N - 1)$
- $(SP1 - SP2) / SP1 = 6/5N !!$



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### Methods

- A naïve approach:  
Use dynamic programming to calculate all possible alignments of the *N* sequences of length *L* and choose the best.
- Problem:
  - Memory complexity  $O(L^N)$ , time complexity  $O(2^N L^N)$ .



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### Methods (cntd)

- Example:
  - Aligning  $N$  sequences requires  $(2L)^{N-2}$  pairwise comparisons.
  - You have 15 sequences, 50 a.a. long.
  - Your computer needs 1 sec for each pairwise comparison.
  - How many sequences you'll align until the end of our sun? (i.e. approx. 5 billion years)



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### Progressive algorithms

- General idea:
  - Calculate all pairwise alignments.
  - Cluster the sequences according to some scoring scheme.
  - Align the two closest sequences; fix their alignment.
  - Continue with next sequence and/or alignment, until all sequences are aligned.



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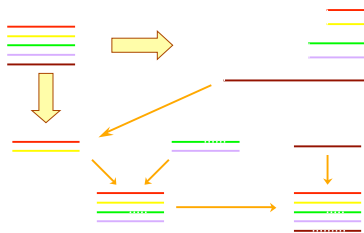
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### Progressive algorithms (cntd)



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## *Feng-Doolittle*

- [Feng & Doolittle, 1987]:
  - Calculate a “distance matrix”, using all pairwise scores.
  - Construct a *guide tree* from this distance matrix.
  - Starting from the first node added to the guide tree, align the child nodes.



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## *Feng-Doolittle (cntd)*

- [Feng & Doolittle, 1987]:
  - Repeat for other nodes in the order they were added to the tree.
  - Each new sequence is added after compared to *every* sequence in the current alignment.
  - When an alignment is added, there is an all-to-all comparison.



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## *CLUSTALW*

- [Thompson, Higgins & Gibson, 1994]:
  - Similar to Feng-Doolittle.
  - Uses Kimura’s model for the evolutionary distance and NJ algorithm to construct the tree.
  - Builds profiles and aligns the profiles.
  - Sequences are weighted to compensate for biased representation.



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### *CLUSTALW (cntd)*

- [Thompson, Higgins & Gibson, 1994]:
- Uses a variety of scoring substitution matrices, depending on the expected similarity.
- Penalties for gaps and mismatches are varying, depending on the position of the alignment that they occur.
- The guide tree can be re-adjusted on the fly, if the score of the alignment becomes very low.



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### *Barton-Sternberg*

- [Barton & Sternberg, 1987]:
- Find the two sequences with the highest pairwise score; build a profile.
- Find the sequence that is closest to this profile; align it to it.
- Repeat until all sequences have been aligned to a single profile.



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### *Barton-Sternberg (cntd)*

- [Barton & Sternberg, 1987]:
- Remove sequence-1 and re-align it to the profile; calculate the new score.
- Repeat with sequence-2, etc.
- Repeat the procedure a fixed number of times, or until convergence occurs (i.e. score doesn't change).



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## Comments

- Unlike pairwise alignments, multiple alignment methods are not guaranteed to find the optimal alignments.



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## Multiple alignments: general (cntd)

```
CYB_ASCSU HFNGASLFFIFLYLHLFK
CYB6_MARPO HRWSASMMVLMMLIHIFR
CYB_TRYBB HICFTSLLYLLLYIHIFK
*   :*: : : : :*:*:
```

```
CYB_ASCSU GLF...FMSY..RLKK..VWVS
CYB6_MARPO VYL...TGGFKKPREL..TWVT
CYB_TRYBB SITLILFDTH..IL...VWFI
*   .*. .
```

Manually curated (Pfam):



[http://pfam.wustl.edu/cgi-bin/getdesc?name=cytochrome\\_b\\_N](http://pfam.wustl.edu/cgi-bin/getdesc?name=cytochrome_b_N)

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## Multiple alignments: general (cntd)

```
CYB_ASCSU HFNGASLFFIFLYLHLFKGLFFMSYR--LKKVWVS
CYB6_MARPO HRWSASMMVLMMLIHIFRVYLTGGFKKPREL TWVT
CYB_TRYBB HICFTSLLYLLLYIHIFKSITLILFDTHILVWEI
*   :*: : : : :*:*: .*
```

Automatically aligned: CLUSTALW



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### *Comments*

- Unlike pairwise alignments, multiple alignment methods are not guaranteed to find the optimal alignments.
- Multiple alignments are used to calculate profiles characteristic for protein families.
- These profiles can be used to identify new (distant) members of these families.



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### *Comments (cntd)*

- E.g., if your BLAST searches yield many poor(ish) results, profile searches might hint the function of your newly sequenced gene.
- Also, you can align all the top hits of your BLAST search, to create a profile and check if your sequence belongs to this profile.



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### *Resources*

- CLUSTALW servers:
  - EBI: <http://www.ebi.ac.uk/clustalw/>
  - Baylor College of Medicine: <http://searchlauncher.bcm.tmc.edu/multi-align/multi-align.html>



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### Resources (cntd)

- Multiple alignments are the primary source of information for the *motif* databases:

- PROSITE: <http://us.expasy.org/prosite/>
- Pfam: <http://pfam.wustl.edu/>
- PRINTS: <http://www.bioinf.man.ac.uk/dbbrowser/PRINTS/>



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### Additional Reference

- Durbin, Eddy, Krogh & Mitchison, “*Biological Sequence Analysis*”, 1998, Cambridge University Press



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