# Programming for Biololgy Similarity Searching II –

## Practical search strategies

# Bill Pearson wrp@virginia.edu

CSHL Programming for Biology

1

# Why is this material important?

- · You might be asked to find a homolog
- You might be asked to what your gene/protein does
  - Annotated homologs are missed because databases are large and redundant
  - Short domains and short exons are missed because the "standard" matrix needs long alignments
  - Sometimes, alignments include non-homologous regions

**CSHL** Programming for Biology

#### Effective Similarity Searching

- Always search protein databases (possibly with translated DNA)
- 2. Use E()-values, not percent identity, to infer homology
  - E() < 0.001 is significant in a single search
- 1. Search smaller (comprehensive) databases
- 2. Change the scoring matrix for:
  - short sequences (exons, reads)
  - short evolutionary distances (mammals, vertebrates, aproteobacteria)
  - high identity (>50% alignments) to reduce over-extension
- 3. Is every aligned residue homologous?
  - alignment overextension
- 4. (Tomorrow) All methods (pairwise, HMM, PSSM) miss homologs, and find homologs the other methods miss

CSHL Programming for Biology

3

3

## Review – Sequence Similarity - Conclusions

- <u>Homologous</u> sequences share a common ancestor, but most sequences are <u>non-</u> <u>homologous</u>
- Always compare Protein Sequences
- Sequence Homology can be reliably inferred from statistically significant similarity (non-homology cannot from non-similarity)
- Homologous proteins share common structures, but not necessarily common functions
- Sequence statistical significance estimates are accurate (verify this yourself)10<sup>-6</sup> < E() < 10<sup>-3</sup> is statistically significant

CSHL Programming for Biology

#### Similarity Searching II

- 1. What question to ask?
- 2. What program to use?
- 3. What database to search?
- 4. When to do something different (changing scoring matrices)
- 5. Is every aligned domain homologous?
- 6. (Tomorrow) more sensitive methods (PSI-BLAST, HMMER)

CSHL Programming for Biology

5

5

#### 1. What question to ask?

- Is there an homologous protein (a protein with a similar structure)?
- Does that homologous protein have a similar function?
- Does XXX genome have YYY (kinase, GPCR, ...)?

#### Questions not to ask:

- Does this DNA sequence have a similar regulatory element (too short – never significant)?
- Does (non-significant) protein have a similar function/modification/antigenic site?

CSHL Programming for Biology

6

# 2. What program to run?

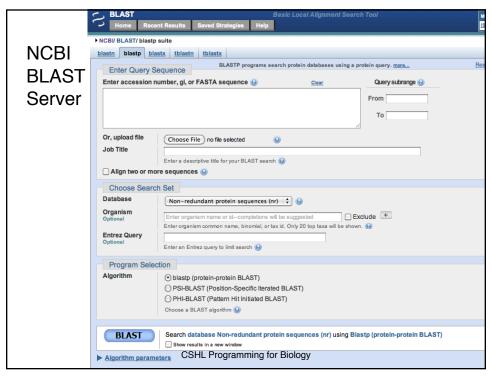
- · What is your query sequence?
  - protein BLASTP (NCBI), SSEARCH (EBI)
  - protein coding DNA (EST) –
     BLASTX (NCBI), FASTX (EBI)
  - DNA (structural RNA, repeat family) –
     BLASTN (NCBI), FASTA (EBI)
- Does XXX genome have YYY (protein)?
  - TBLASTN YYY vs XXX genome
  - TFASTX YYY vs XXX genome
- Does my protein contain repeated domains?
  - LALIGN (UVa http://fasta.bioch.virginia.edu, EBI)

CSHL Programming for Biology

7

7

#### NCBI BLAST Server blast.ncbi.nlm.nih.gov NCBI National Center for Biotechnology Information BLAST ® Recent Results Saved Strategies Help **Basic Local Alignment Search Tool BLAST** finds regions of similarity between biological sequences. Try QuickBLASTP for a fast protein search of nr. The program compares nucleotide or protein sequences to sequence databases and calculates the statistical significance. Tue, 23 May 2017 13:00:00 EST More BLAST news Yes Yes Web BLAST **Nucleotide BLAST Protein BLAS** tblastn Always compare protein sequences Search **CSHL** Programming for Biology



#### 3. What database to search?

- Search the smallest comprehensive database likely to contain your protein
  - vertebrates human proteins (40,000)
  - NCBI Landmark sequences (human, mouse, no rat)
  - Quest for Orthologs reference proteomes (1,000,000)
- Search a richly annotated protein set (SwissProt, 500,000)
- Always search NR (> 50 million) LAST
- Never Search "GenBank" (DNA)

CSHL Programming for Biology

# Effective Similarity Searching

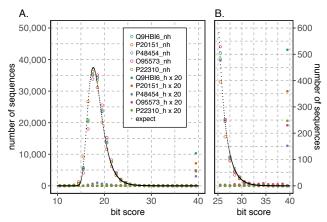
- Always search protein databases (possibly with translated DNA)
- 2. Use E()-values, not percent identity, to infer homology
   E() < 0.001 is significant in a single search
- 1. Search smaller (comprehensive) databases
- 2. Change the scoring matrix for:
  - short sequences (exons, reads)
  - short evolutionary distances (mammals, vertebrates, aproteobacteria)
  - high identity (>50% alignments) to reduce over-extension
- Is every aligned residue homologous?
  - alignment overextension
- 4. (Tomorrow) All methods (pairwise, HMM, PSSM) miss homologs, and find homologs the other methods miss

CSHL Programming for Biology

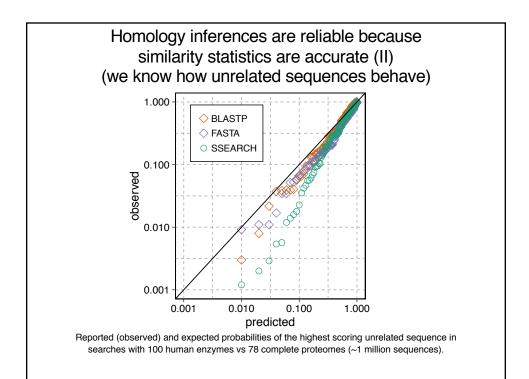
11

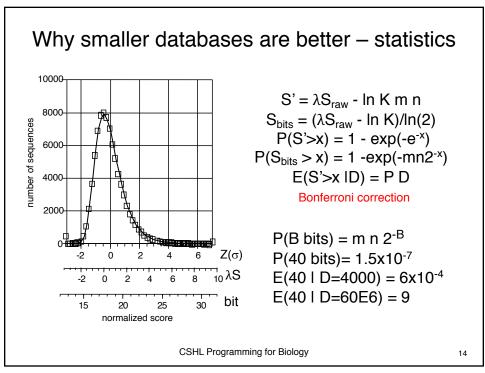
11

# Homology inferences are reliable because similarity statistics are accurate (I) (we know how unrelated sequences behave)



Distributions of similarity scores in searches with 5 human enzymes. Open circles (\_nh) show scores for non-homologs. Closed circles show homolog (\_h) scores.

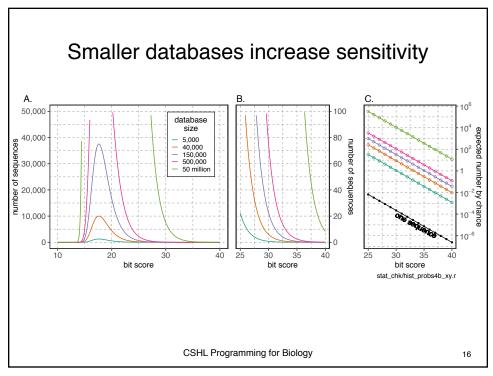


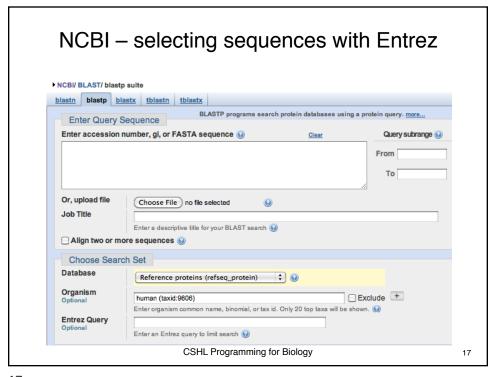


# Local similarity statistics

```
\begin{split} S' &= \lambda S_{raw} \text{ - In K m n } \text{ m: query length, n: subj length} \\ S_{bit} &= (\lambda S_{raw} \text{ - In K)/ln(2)} \\ P(S'>x) &= 1 \text{ - exp(-e^{-x})} \\ P(S'>x) &= e^{-x} \text{ (for P < 0.1)} \\ \\ P(S_{bits} > \text{bits}) &= 1 \text{ -exp(-mn2}^{-x}) \\ P(S_{bits} > \text{bits}) &= \text{mn2}^{-\text{bits}} \text{ (for P < 0.1)} \\ \\ E(S', S_{bits} \text{ ID}) &= \text{PD} \\ E(S_{bits} \text{ ID}) &= \text{D mn2}^{-\text{bits}} \text{ Bonferroni correction} \\ \\ \text{dblength} &= \text{D n} \\ E(S_{bit}) &= \text{m dblength 2}^{-\text{bits}} \text{ (BLAST)} \\ \\ \\ CSHL \text{ Programming for Biology} \end{split}
```

15





# What is a "bit" score (I)?

- Scoring matrices (PAM250, BLOSUM62, VTML40) contain "log-odds" scores:
  - $-s_{i,j}$  (bits) =  $log_2(q_{i,j}/p_ip_j)$  ( $q_{i,j}$  freq. in homologs /  $p_ip_j$  freq. by chance)
  - $-s_{i,j}$  (bits) = 2 -> a residue is  $2^2$ =4-times more likely to occur by homology compared with chance (at one residue)
  - s<sub>i,j</sub> (bits) = -1 -> a residue is  $2^{-1}$  = 1/2 as likely to occur by homology compared with chance (at one residue)
- 2. An alignment score is the maximum sum of s<sub>i,j</sub> bit scores across the aligned residues.
  - $-\,$  A 40-bit score is  $2^{40}$  more likely to occur by homology than by chance.
- 3. How often should a score occur by chance? In a 400 \* 400 alignment, there are ~160,000 places where the alignment could start by chance, so we expect a score of 40 bits would occur:  $P(S_{bit} > x) = 1 exp(-mn2^{-x}) \sim mn2^{-x}$ 
  - $-400 \times 400 \times 2^{-40} = 160,000 / 2^{40} (10^{13.3}) = 1.5 \times 10^{-7}$  times
  - Thus, the probability of a 40 bit score in ONE alignment is ~ 10<sup>-7</sup>

CSHL Programming for Biology

#### What is a "bit" score (II)?

- 4. But we did not ONE alignment, we did 4,000, 40,000, 500,000, or 20 million alignments when we searched the database:
  - $E(S_{bit} \mid D) = p(40 \text{ bits}) \text{ x database size}$
  - $E(40 \mid 4,000) = 10^{-7} \times 4,000 = 4 \times 10^{-4}$  (significant)
  - $E(40 \mid 40,000) = 10^{-7} \times 4 \times 10^{4} = 4 \times 10^{-3}$  (not significant)
  - E(40 | 500,000) =  $10^{-7}$  x 5 x  $10^5$  = 0.05 (not significant)
  - E(40 | 20 million) =  $10^{-7}$  x 2.0 x  $10^{7}$  = 2.0 (not significant)

#### Not significant does not mean not-homologous

CSHL Programming for Biology

19

19

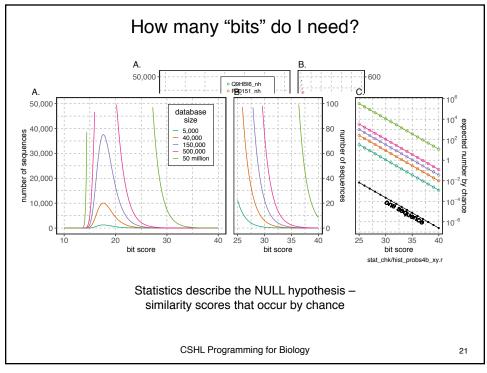
#### How many "bits" do I need?

E() = p() x database size

 $E(40 \mid 4,000) = 10^{-7} \times 4,000 = 4 \times 10^{-4}$  (significant)  $E(40 \mid 40,000) = 10^{-7} \times 4 \times 10^{4} = 4 \times 10^{-3}$  (not significant)  $E(40 \mid 500,000) = 10^{-7} \times 5 \times 10^{5} = 0.05$  (not significant)

To get E()  $\sim 10^{-3}$ , how many bits do I need? p = m n 2  $^{-bits}$  bits = -log2(p/(m n)) =  $-log2(E()/(database\_size m n))$  genome (10,000) p  $\sim 10^{-3}/10^4$  =  $10^{-7}/160,000$  = 40 bits SwissProt (500,000) p  $\sim 10^{-3}/10^6$  =  $10^{-9}/160,000$  = 47 bits Uniprot/NR (108) p  $\sim 10^{-3}/10^8$  =  $10^{-11}/160,000$  = 53 bits

CSHL Programming for Biology



#### Effective Similarity Searching

- Always search protein databases (possibly with translated DNA)
- 2. Use E()-values, not percent identity, to infer homology
   E() < 0.001 is significant in a single search
- 1. Search smaller (comprehensive) databases
- Change the scoring matrix for:
  - short sequences (exons, reads)
  - short evolutionary distances (mammals, vertebrates, aproteobacteria)
  - high identity (>50% alignments) to reduce over-extension
- Is every aligned residue homologous?
  - alignment overextension
- 4. (Tomorrow) All methods (pairwise, HMM, PSSM) miss homologs, and find homologs the other methods miss

CSHL Programming for Biology

#### Scoring matrices

- Scoring matrices can set the evolutionary lookback time for a search
  - Lower PAM (PAM10/VT10 ... PAM/VT40) for closer (10% ... 50% identity)
  - Higher BLOSUM for higher conservation (BLOSUM50 distant, BLOSUM80 conserved)
- Shallow scoring matrices for short domains/short queries (metagenomics)
  - Matrices have "bits/position" (score/position), 40 aa at 0.45 bits/position (BLOSUM62) means 18 bit ave. score (50 bits significant)
- Deep scoring matrices allow alignments to continue, possibly outside the homologous region

**CSHL Programming for Biology** 

23

23

#### Scoring matrices and alignment length

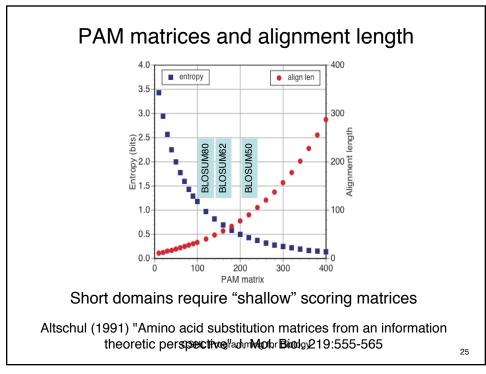
Pam40			Pam250
A R	N D E	I L	A R N D E I L
A 8			A 2
R -9 12			R -2 6
N - 4 - 7	11		N 0 0 2
D -4 -13	3 11		D 0 -1 2 4
E -3 -11	-2 4 11		E 0 -1 1 3 4
I -6 -7	-7 -10 -7 1	12	I -1 -2 -2 -2 5
L - 8 - 11	-9 -16 -12 -	-1 10	L -2 -3 -3 -4 -3 2 6

$$\lambda S_{i,j} = \log_b(\frac{q_{i,j}}{p_i p_j})$$

```
q_{ij}: homolog frequency wat PAM40, 250 q_{R:N(40)} = 0.000435 p_R = 0.051 q_{R:N(250)} = 0.002193 p_N = 0.043 \lambda_2 S_{ij} = \lg_2 (q_{ij}/p_ip_j) \lambda_e S_{ij} = \ln(q_{ij}/p_ip_j) p_Rp_N = 0.002193 \lambda_2 S_{R:N(40)} = \lg_2 (0.000435/0.00219) = -2.333 \lambda_2 = 1/3; S_{R:N(40)} = -2.333/l_2 = -7 \lambda S_{R:N(250)} = \lg_2 (0.002193/0.002193) = 0
```

CSHL Programming for Biology

24



# Empirical matrix performance (median results from random alignments)

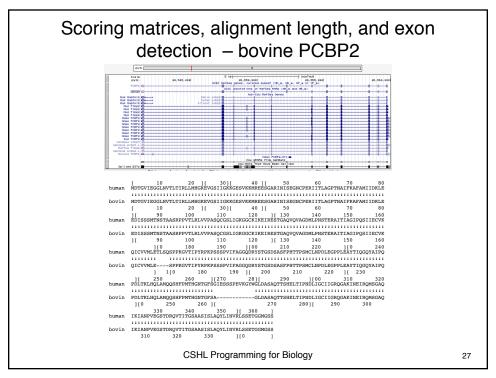
Matrix	target % ident	bits/position	aln len (50 bits)
VT160 -12/-2	23.8	0.26	192
BLOSUM50 -10/-2	25.3	0.23	217
BLOSUM62* -11/-1	28.9	0.45	111
VT120 -11/-1	27.4	1.03	48
VT80 -11/-1	51.9	1.55	32
PAM70* -10/-1	33.8	0.64	78
PAM30* -9/-1	45.5	1.06	47
VT40 -12/-1	72.7	2.76	18
VT20 -15/-2	84.6	3.62	13
VT10 /16/-2	90.9	4.32	12

HMMs can be very "deep"

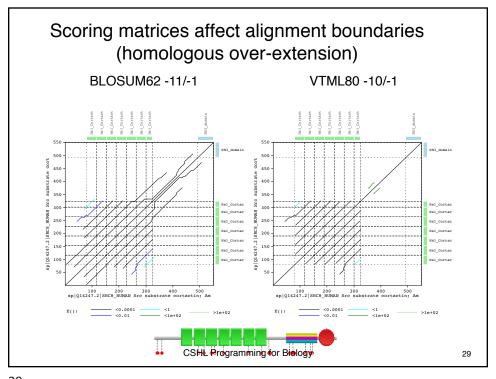
Pearson (2013) Curr. Prot. Bioinformatics 3.5.1

CSHL Programming for Biology

26



	name	start	end	len	MD10	bits	BP62	bits	ı
	ex 1	1	23	23	=	58	+5	45	ı
	ex 2	24	31	8	_	30	-	<25	
	ex 3	32	42	11	=	36	+1	27	
	ex 4	43	81	39	=	88	=	61	
	ex 5	82	125	44	=	96	=	66	
	ex 6	126	168	43	_	96	+5	65	
	ex 7	169	197	29	=	69	+2	50	
	ex 8	198	228	31	=	76	+43	53	
	ex_9	229	242	14	+4	40	+4	32	
	ex_10	243	266	24	+5	60	+87	45	
	ex_11	267	280	14	=	42	+38	32	
	ex_12	281	297	17	=	49	+2	34	
	ex_13	298	354	57	=	120	=	78	
	ex_14	355	365	11	=	37	=	32	
### BP62   gRegion: 181-197: bits=1.6; Id=0.500: exon_7-7     gRegion: 198-228: bits=52.7; Id=1.000: exon_8-8     gRegion: 292-242: bits=0.0; Id=0.333; exon_9-9     1100									



#### Scoring Matrices - Summary

- PAM and BLOSUM matrices greatly improve the sensitivity of protein sequence comparison – low identity with significant similarity
- PAM matrices have an evolutionary model lower number, less divergence – lower=closer; higher=more distant
- BLOSUM matrices are sampled from conserved regions at different average identity – higher=more conservation
- Shallow matrices set maximum look-back time
- Short alignments (domains, exons, reads) require shallow (higher information content) matrices

CSHL Programming for Biology

#### Effective Similarity Searching

- Always search protein databases (possibly with translated DNA)
- Use E()-values, not percent identity, to infer homology
  - E() < 0.001 is significant in a single search</li>
- 1. Search smaller (comprehensive) databases
- 2. Change the scoring matrix for:
  - short sequences (exons, reads)
  - short evolutionary distances (mammals, vertebrates, aproteobacteria)
  - high identity (>50% alignments) to reduce over-extension
- 3. Is every aligned residue homologous?
  - alignment overextension
- (Tomorrow) All methods (pairwise, HMM, PSSM) miss homologs, and find homologs the other methods miss

**CSHL** Programming for Biology

31

31

#### Over-extension into random sequence



> pf26|15978520|E6SGT6|E6SGT6\_THEM7 Heavy metal translocating P-type ATPase EC=3.6.3.4 Length=88

Score = 299 bits (766), Expect = 1e-90, Method: Compositional matrix adjust. Identities = 170/341 (50%), Positives =  $\frac{224}{341}$  (66%), Gaps =  $\frac{19}{341}$  (6%)

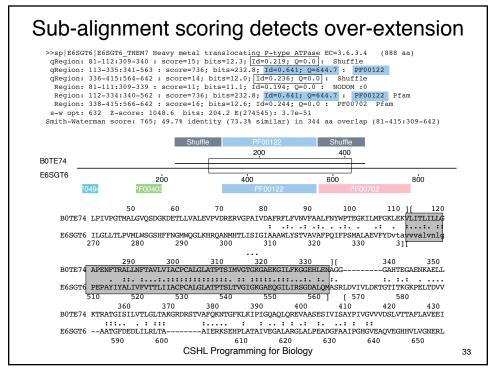
- Query 84 FLFVNVFAALFNYWPTEGKILMFGKLEKVLITLILLGKTLEAVAKGRTSEAIKKLMGLKA 143

  Sbjct 312 WLYSTVAVAFPQIFPSMALAEVFYDVTAVVVALVMLGLALELRARGRTSEAIKKLIGLQA 371

  Query 144 KRARVIRGGRELDIPVEAVLAGDLVVVRPGEKFPVDGVVEEGASAVDESMLTGESLPVDK 203
- Query 144 KRARVIRGGRELDIPVEAVLAGDLVVVÄRPGEKIPVDGVVEEGASAVDESMLTGESLPVDK 203 + ARV+R G E+DIPVE VL GD+VVVNPGEKIPVDGVV EG S+VDESM+TGESS+PV+ Sbjct 372 RTARVKROGTEVDIPVEEVLVGDIVVVRPGEKIPVDGVVIEGTSSVDESMITGESIPVEM 433
- Query 204 QPGDTVIGATLNKQGSFKFRATKVGRDTALAQIISVVEEAQGSKAPIQRLADTISGYFVP 263
  +PGD VIGAT+N+ GSF+FRATKVG+DTAL+QII +V++AQGSKAPIQR+ D +S YFVP
  Sbjct 432 KPGDEVIGATINQTGSFRFRATKVGKDTALSQIIRLVQDAQGSKAPIQRIVDRVSHYFVP 491
- Query 264 VVVSLAVITFFVWYAVPANETRALLNFTAVLVIACPCALGLATPTSIMVGTGKGAEKG 323 V+ LA++ VWY + AL+ F L+IACPCALGLATPTS+ VG GKGAE+G Sbjct 492 AVLILAIVAAVVWYVFGPEPAYIYALIVFVTTLIIACPCALGLATPTS+UVGIGKGAEQG 551
- Query 324 ILFKGGEHENGG------GGAHTEGAENKAELLKTRATGISILVTLGLTAKGRDRS 374
  IL + G+ L+ A G T+G +++ ATG + L LTA
  Sbjct 552 IIRSGDALQMASRLDVIVLDKTGTITKGKPELTDVVA—ATGFDEDLILRLTA------ 603
- | \$\frac{562}{90} \] \$\frac{562}

CSHL Programming for Biology

Mills and Pearson (2013) Bioinformatics 29:3007<sub>2</sub>



r	name	start	end	len	MD10	bits	BP62	bits
	ex_1	1	23	23	=	58	+5	45
_	ex_2	24	31	8	=	30	-	<25
	ex_3	32	42	11	=	36	+1	27
	ex_4	43	81	39	=	88	=	61
	ex_5	82	125	44	=	96	=	66
		126	168	43	=	96	+5	65
_	ex_7	169	197	29	=	69	+2	50
	ex_8	198	228	31	=	76	+43	53
	ex_9	229	242	14	+4	40	+4	32
	ex_10	243	266	24	+5	60	+87	45
	ex_11	267	280	14	=	42	+38	32
	ex_12	281	297	17	=	49	+2	34
	ex_13	298	354	57	=	120	=	78
e	ex_14	355	365	11	=	37	=	32
BP62								

#### Homology, non-homology, and over-extension

- Sequences that share statistically significant sequence similarity are homologous (simplest explanation)
- But not all regions of the alignment contribute uniformly to the score
  - lower identity/Q-value because of non-homology (overextension) ?
  - lower identity/Q-value because more distant relationship (domains have different ages) ?
- · Test by searching with isolated region
  - can the <u>distant domain (?)</u> find closer (significant) homologs?
- Similar (homology) or distinct (non-homology) structure is the gold standard
- Multiple sequence alignment can obscure over-extension
  - if the alignment is over-extended, part of the alignment is NOT homologous

CSHL Programming for Biology

35

35

#### Effective Similarity Searching

- Always search protein databases (possibly with translated DNA)
- 2. Use E()-values, not percent identity, to infer homology
  - E() < 0.001 is significant in a single search
- 1. Search smaller (comprehensive) databases
- 2. Change the scoring matrix for:
  - short sequences (exons, reads)
  - short evolutionary distances (mammals, vertebrates, aproteobacteria)
  - high identity (>50% alignments) to reduce over-extension
- 3. Is every aligned residue homologous?
  - alignment overextension
- 4. (Tomorrow) All methods (pairwise, HMM, PSSM) miss homologs, and find homologs the other methods miss

CSHL Programming for Biology

# workshop II – parsing blast results

#### Goto:

fasta.bioch.virginia.edu/mol\_evol/pfb\_python\_matrices.html

Your goal is to reproduce a version of this table:

Matrix	target % ident	align_len	evalue
VT160	29.7	67	2.1
BLOSUM50	34.0	121	1.2
BLOSUM62* -11/-1	31.2	90	0.37
VT80	66.7	50	1.8
VT40	72.7	11	1.3

CSHL Programming for Biology

37