

# Sequence Similarity

## Protein Sequence Comparison and Protein Evolution

(What BLAST does/Why BLAST works)

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## *Sequence Similarity - Conclusions*

- 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)  $10^{-6} < E() < 10^{-3}$  is statistically significant
- Scoring matrices set evolutionary look back horizons - not every discovery is distant
- PSI-BLAST can be more sensitive, but with lower statistical accuracy

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*Establishing homology from  
statistically significant similarity*

**Why BLAST works**

- For most proteins, homologs are easily found over long evolutionary distances (500 My – 2 By) using standard approaches (BLAST, FASTA)
- Difficult for distant relationships or very short domains
- Most default search parameters are optimized for distant relationships and work well

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**This talk is not about:**

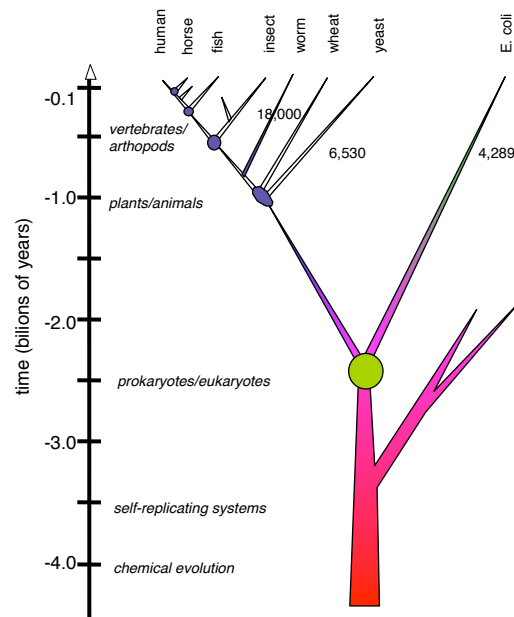
- *Alignment*
  - Alignment quality may be more sensitive to parameter choice
  - Multiple sequences for biologically accurate alignments
- *Inferring Protein Function*
  - Homology (common ancestry) implies common structure (guaranteed), not necessarily common function
  - Homologs have different functions
  - Non-homologs have similar (or identical) functions
- *The best sequences for building trees*
  - Protein sequences are clearly best for establishing homology, but DNA sequences may be better for resolving recent divergence

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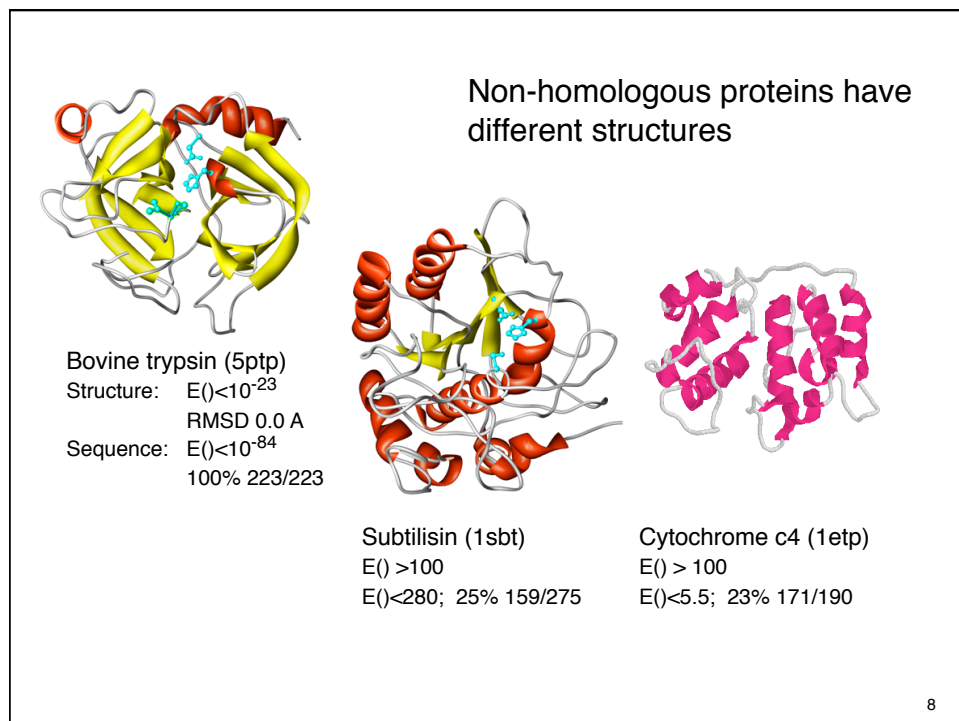
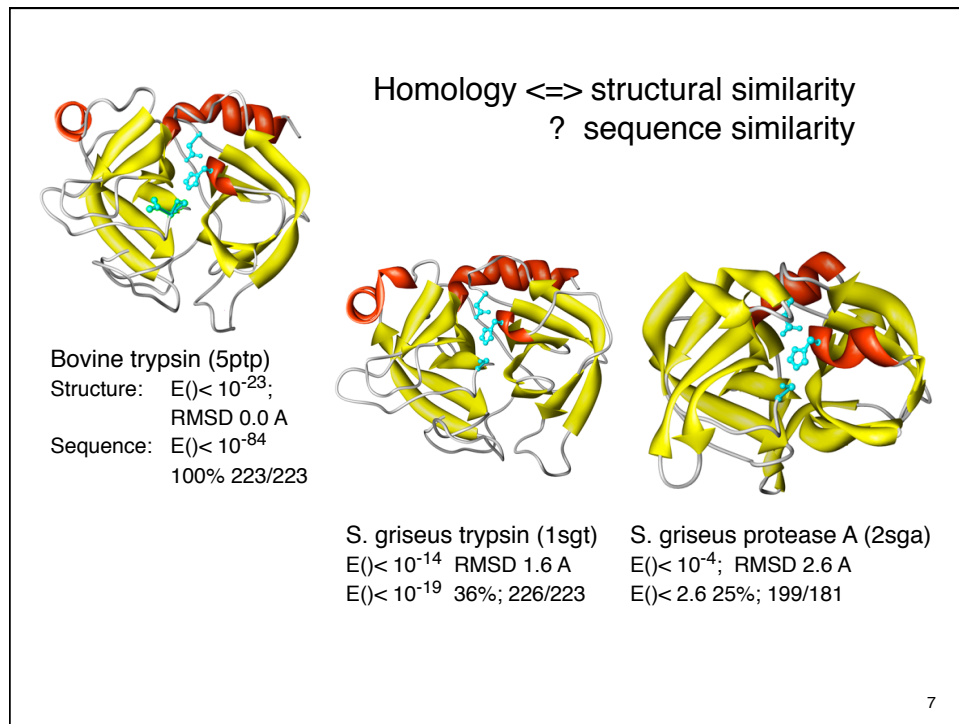
## Protein Evolution and Sequence Similarity

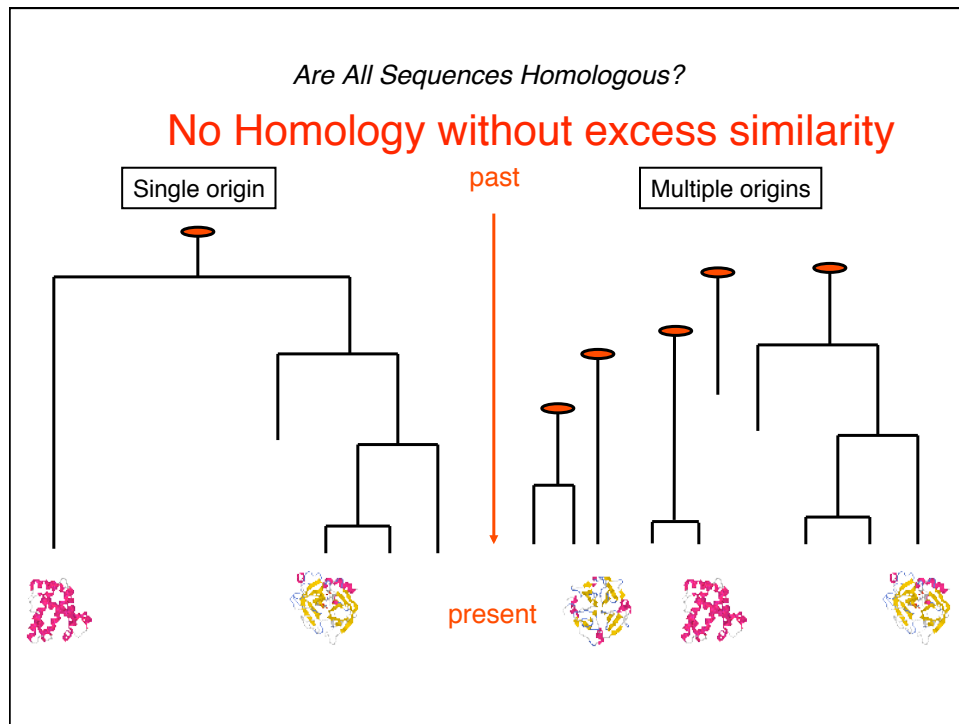
- What is Homology and how do we recognize it?
- How do we measure sequence similarity – alignments and scoring matrices?
- DNA vs protein comparison
- Alignment Algorithms/Local sequence alignments
- Similarity scoring matrices
- When are we certain that an alignment is significant - similarity score statistics?
- When to trust similarity statistics?
- Improving sensitivity with PSI-BLAST

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**What BLAST does:**

Similarity  $\stackrel{?}{\rightleftharpoons}$  Homology

**Why BLAST works:**

Statistical  $\stackrel{?}{\rightleftharpoons}$  Biological  
Significance  $\rightleftharpoons$  Significance

Divergence  $\stackrel{?}{\rightleftharpoons}$  Convergence

### Some important dates in history

Origin of the universe	-13.7 <sup>a</sup>
Formation of the solar system	-4.6 ±0.4
First self-replicating system	-3.5 ±0.5
Prokaryotic-eukaryotic divergence	-2.5 ±0.3
Plant-animal divergence	-1.0
Invertebrate-vertebrate divergence	-0.5
Mammalian radiation beginning	-0.1

<sup>a</sup>Billions of years ago

Protein Family	PAMs <sup>a</sup> /100 res. /10 <sup>8</sup> years	Protein Lookback time <sup>b</sup>	
Pseudogenes	400	45 <sup>c</sup>	Primates, Rodents
Fibrinopeptides	90	200	Mammalian Radiation
Lactalbumins	27	670	Vertebrates
Ribonucleases	21	850	Animals
Hemoglobins	12	1.5 <sup>d</sup>	Plants/Animals
Acid Proteases	8	2.3	Prokaryotic/Eukaryotic
Triphosphate isomerase	3	6	Archaea
Glutamate dehydrogenase	1	18	?

<sup>a</sup>PAMs, point accepted mutations. <sup>b</sup>Useful lookback time, 360 PAMs, 15% identity.

<sup>c</sup>Millions of years. <sup>d</sup>Billions of years.

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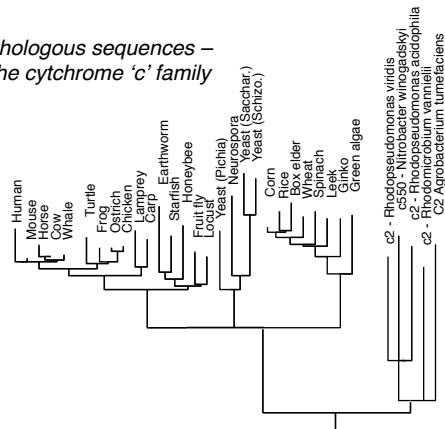
### E. coli proteins vs Human – Ancient Protein Domains

expect	%_id	alen	E coli descr	Human descr	sp_name
2.7e-206	53.8	944	glycine decarboxylase, P	Glycine dehydrogenase [de	GCSP_HUMAN
1.2e-176	59.5	706	methylmalonyl-CoA mutase	Methylmalonyl-CoA mutase,	MUTA_HUMAN
3.8e-176	50.6	803	glycogen phosphorylase [E	Glycogen phosphorylase, l	PHS1_HUMAN
9.9e-173	55.6	1222	B12-dependent homocystein	5-methyltetrahydrofolate-	METH_HUMAN
1.8e-165	41.8	1031	carbamoyl-phosphate synth	Carbamoyl-phosphate synth	CPSM_HUMAN
5.6e-159	65.7	542	glucosephosphate isomeras	Glucose-6-phosphate isome	G6PI_HUMAN
8.1e-143	53.7	855	aconitate hydratase 1 [Esch	Iron-responsive element b	IRE1_HUMAN
2.5e-134	73.0	459	membrane-bound ATP syntha	ATP synthase beta chain,	ATPB_HUMAN
3.3e-121	55.8	550	succinate dehydrogenase,	Succinate dehydrogenase [	DHSA_HUMAN
1.5e-113	60.6	401	putative aminotransferase	Cysteine desulfurase, mit	NFS1_HUMAN
4.4e-111	60.9	460	fumarase C= fumarate hydr	Fumarate hydratase, mitoc	FUMH_HUMAN
1.5e-109	56.1	474	succinate-semialdehyde de	Succinate semialdehyde de	SSDH_HUMAN
3.6e-106	44.7	789	maltodextrin phosphorylas	Glycogen phosphorylase, m	PHS2_HUMAN
1.4e-102	53.1	484	NAD+-dependent betaine al	Aldehyde dehydrogenase, E	DHAG_HUMAN
3.8e-98	53.0	449	pyridine nucleotide trans	NAD(P) transhydrogenase,	NNTM_HUMAN
5.8e-96	49.9	489	glycerol kinase [Escheric	Glycerol kinase, testis s	GKP2_HUMAN
2.1e-95	66.8	328	glyceraldehyde-3-phosphat	Glyceraldehyde 3-phosphat	G3P2_HUMAN
9.2e-91	62.5	368	alcohol dehydrogenase cla	Alcohol dehydrogenase cla	ADHX_HUMAN
6.7e-91	56.5	393	protein chain elongation	Elongation factor Tu, mit	EFTU_HUMAN
9.5e-91	56.6	392	protein chain elongation	Elongation factor Tu, mit	EFTU_HUMAN
2.2e-89	59.1	369	methionine adenosyltransf	S-adenosylmethionine synt	METK_HUMAN
6.5e-88	53.3	422	enolase [Escherichia coli	Alpha enolase (2-phospho-	ENOA_HUMAN
9.2e-88	43.3	536	NAD-linked malate dehydro	NADP-dependent malic enzy	MAOX_HUMAN
7.3e-86	55.5	389	2-amino-3-ketobutyrate Co	2-amino-3-ketobutyrate co	KBL_HUMAN
5.2e-83	44.4	543	degrades sigma32, integra	AFG3-like protein 2 (Para	AF32_HUMAN

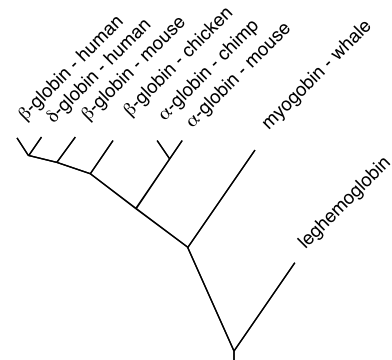
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## Orthologs and Paralogs – Inferring Function

### Orthologous sequences – the cytochrome 'c' family



*Paralogous genes – globins*

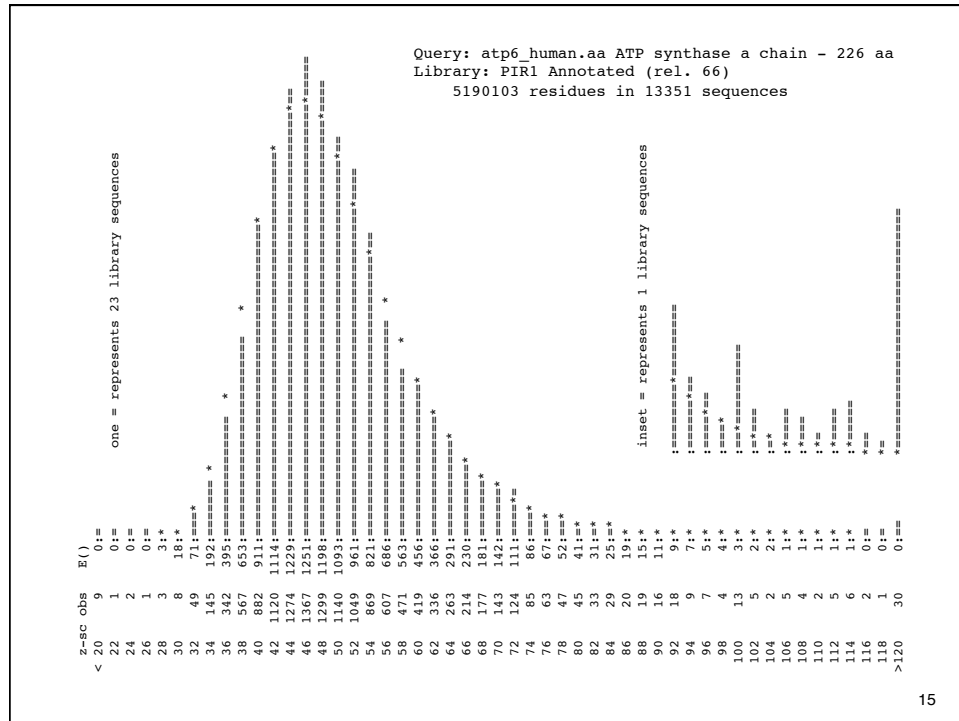


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# Protein Evolution and Sequence Similarity

- What is Homology and how do we recognize it?
- **How do we measure sequence similarity – alignments and scoring matrices?**
- DNA vs protein comparison
- Alignment Algorithms/Local sequence alignments
- Similarity scoring matrices
- When are we certain that an alignment is significant - similarity score statistics?
- When to trust similarity statistics?
- Improving sensitivity with PSI-BLAST

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## Inferring Homology from Statistical Significance

- Real **UNRELATED** sequences have similarity scores that are indistinguishable from **RANDOM** sequences
- If a similarity is NOT **RANDOM**, then it must be NOT **UNRELATED**
- Therefore, NOT **RANDOM** (statistically significant) similarity must reflect **RELATED** sequences



Query: atp6 human.aa ATP synthase a chain - 226 aa  
Library: 5190103 residues in 13351 sequences

The best scores are:

		( len)	s-w bits	E(13351)	% id	% sim	alen	
sp P00846	ATP6_HUMAN	ATP synthase a chain (AT ( 226)	1400	325.8	5.8e-90	1.000	1.000	226
sp P00847	ATP6_BOVIN	ATP synthase a chain (AT ( 226)	1157	270.5	2.5e-73	0.779	0.951	226
sp P00848	ATP6_MOUSE	ATP synthase a chain (AT ( 226)	1118	261.7	1.2e-70	0.757	0.916	226
sp P00849	ATP6_XENLA	ATP synthase a chain (AT ( 226)	745	176.8	4.0e-45	0.533	0.847	229
sp P00851	ATP6_DROYA	ATP synthase a chain (AT ( 224)	473	115.0	1.7e-26	0.378	0.721	222
sp P00854	ATP6_YEAST	ATP synthase a chain pre ( 259)	428	104.7	2.3e-23	0.353	0.694	232
sp P00852	ATP6_EMENI	ATP synthase a chain pre ( 256)	365	90.4	4.8e-19	0.304	0.691	230
sp P14862	ATP6_COACHE	ATP synthase a chain (AT ( 257)	353	87.7	3.2e-18	0.313	0.650	214
sp P68526	ATP6_TRITI	ATP synthase a chain (AT ( 386)	309	77.6	5.1e-15	0.289	0.651	235
sp P05499	ATP6_TOBAC	ATP synthase a chain (AT ( 395)	309	77.6	5.2e-15	0.283	0.635	233
sp P07925	ATP6_MAIZE	ATP synthase a chain (AT ( 291)	283	71.7	2.3e-13	0.311	0.667	180
sp P0AB98	ATP6_ECOLI	ATP synthase a chain (AT ( 271)	178	47.9	3.2e-06	0.233	0.585	236
sp P0C2Y5	ATPI_ORYSA	Chloroplast ATP synth (A ( 247)	144	40.1	0.00062	0.242	0.580	231
sp P06452	ATPI_PEA	Chloroplast ATP synthase a ( 247)	143	39.9	0.00072	0.250	0.586	232
sp P27178	ATP6_SYNY3	ATP synthase a chain (AT ( 276)	142	39.7	0.00095	0.265	0.571	170
sp P06451	ATPI_SPIOL	Chloroplast ATP synthase ( 247)	138	38.8	0.0016	0.242	0.580	231
sp P08444	ATP6_SYNP6	ATP synthase a chain (AT ( 261)	127	36.3	0.0095	0.263	0.557	167
sp P69371	ATPI_ATRBE	Chloroplast ATP synthase ( 247)	126	36.0	0.01	0.221	0.571	231
sp P06289	ATPI_MARPO	Chloroplast ATP synthase ( 248)	126	36.0	0.011	0.240	0.575	167
sp P30391	ATPI_EUGGR	Chloroplast ATP synthase ( 251)	123	35.4	0.017	0.257	0.579	214
sp P19568	TLCA_RICPR	ADP,ATP carrier protein ( 498)	122	35.0	0.043	0.243	0.579	152
sp P24966	CYB_TAYTA	Cytochrome b ( 379)	113	33.0	0.13	0.234	0.532	158
sp P03892	NU2M_BOVIN	NADH-ubiquinone oxidored ( 347)	107	31.7	0.31	0.261	0.479	211
sp P68092	CYB_STEAT	Cytochrome b ( 379)	104	31.0	0.54	0.277	0.547	137
sp P03891	NU2M_HUMAN	NADH-ubiquinone oxidored ( 347)	103	30.8	0.58	0.201	0.537	149
sp P00156	CYB_HUMAN	Cytochrome b ( 380)	102	30.5	0.74	0.268	0.585	205
sp P15993	AROP_ECOLI	Aromatic amino acid tr ( 457)	103	30.7	0.78	0.234	0.622	111
sp P24965	CYB_TRANA	Cytochrome b ( 379)	101	30.3	0.87	0.234	0.563	158
sp P29631	CYB_POMTE	Cytochrome b ( 308)	99	29.9	0.95	0.274	0.584	113
sp P24953	CYB_CAPHI	Cytochrome b ( 379)	99	29.8	1.2	0.236	0.564	140

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```
>>sp|P0AB98|ATP6_ECOLI ATP synthase a chain (ATPase protein 6) g (271 aa)
s-w opt: 178 Z-score: 218.2 bits: 47.9 E(): 3.2e-06
Smith-Waterman score: 178; 23.3% identity (58.5% similar) in 236 aa overlap (8-222:45-264)
```

```

              10      20      30      40
human      MNENLFASFIAPTILGLPAAVLIILFPPLLIPTSKYLINNRLITTTQQ
              ... ..:::  ....::  .   ...  .   ...  :.
E coli NMTPQDYIGHHLNNLQLDLRTFSLVDPQNPPATFWTINIDSMFFSVVLGL---LFLVLFRSVAKKATSG-VPGKFQTAIE
              10      20      30      40      50      60      70      80

              50      60      70      80      90      100     110
human      WLIKLTSKQMMTMHNTKGRWSLMLVSLIIFIATTNLLGLLP-----HSF-----TPTTQLSMNLAMAIPLWAG
              .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .:
E coli LVIGFVNGSVKDMYHGKSKLIAPLALTIFVWVFLMNLMDLLPIDLLPYIAEHVGLPALRVVPSADVNVTLTSMALGVF--
              90      100     110     120     130     140     150

              120     130     140     150     160     170     180
human      TVIMGFRSRIKKNALAHFLPQGTPTPL-----IPMLVIEITISLLIQPMALAVRLTANITAGHLLMHLIGSATLAMSTINL
              ... : :  .... :  :  :  :  :  :  :  :  :  :  :  :  :  :  :  :  :  :  :  :  :  :  :  :  :  :
E coli -LILFYSIKMKGIGGFTKELTLQFPNHWAFIPVNLILEGVSLLSKPVSLGLRLFGNMYAGELIFILIAGLLPWWSQWIL
              160     170     180     190     200     210     220     230

              190     200     210     220
human      PSTLIIFTILILLTILEIAVALIQAYVFTLLVSLYLDHNT
              : :  : :  :  :  :  :  :  :  :  :  :  :  :  :  :  :  :  :  :  :  :  :  :  :  :  :
E coli NVPWAIFHILIT-----LQAFIFMVLTIYVLSMASEEH
              240     250     260     270
```

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## The PAM250 matrix

	C	S	T	P	A	G	N	D	E	Q	H	R	K	M	I	L	V	F	Y	W
Cys	12																			
Ser	0	2																		
Thr	-2	1	3																	
Pro	-1	1	0	6																
Ala	-2	1	1	1	2															
Gly	-3	1	0	-1	1	5														
Asn	-4	1	0	-1	0	0	2													
Asp	-5	0	0	-1	0	1	2	4												
Glu	-5	0	0	-1	0	0	1	3	4											
Gln	-5	-1	-1	0	0	-1	1	2	2	4										
His	-3	-1	-1	0	-1	2	2	1	1	3	6									
Arg	-4	0	-1	0	-2	-3	0	-1	-1	1	2	6								
Lys	-5	0	0	-1	-1	-2	1	0	0	1	0	3	5							
Met	-5	-2	-1	-2	-1	-3	-2	-3	-2	-1	-2	0	0	6						
Ile	-2	-1	0	-2	-1	-3	-2	-2	-2	-2	-2	-2	-2	2	5					
Leu	-6	-3	-2	-3	-2	-4	-3	-4	-3	-2	-2	-3	-3	4	2	6				
Val	-2	-1	0	-1	0	-1	-2	-2	-2	-2	-2	-2	-2	2	4	2	4			
Phe	-4	-3	-3	-5	-4	-5	-4	-6	-5	-5	-2	-4	-5	0	1	2	-1	9		
Tyr	0	-3	-3	-5	-3	-5	-2	-4	-4	-4	-4	-4	-4	-2	-1	-1	-2	7	10	
Trp	-8	-2	-5	-6	-6	-7	-4	-7	-7	-5	-3	2	-3	-4	-5	-2	-6	0	0	1

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## Where do scoring matrices come from?

$$\lambda S = \log \left( \frac{q_{ij}}{p_i p_j} \right)$$

- Scoring matrices can be designed for different evolutionary distances (less=shallow; more=deep)
- Deep matrices allow more substitution

## Pam40

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

Pam250

	A	R	N	D	E	I	L
A	2						
R	-2	6					
N	0	0	2				
D	0	-1	2	4			
E	0	-1	1	3	4		
I	-1	-2	-2	-2	-2	5	
L	-2	-3	-3	-4	-3	2	6

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```

>>sp|P30391|ATPI_EUGGR Chloroplast ATP synthase a chain precursor (251 aa)
s-w opt: 123 Z-score: 151.3 bits: 35.4 E(): 0.017
Smith-Waterman score: 123; 25.7% identity (57.9% similar) in 214 aa overlap (21-222:50-243)

          10      20      30      40      50      60
human      MNENLFASFIAPITILGLPAAVLIILFPPLLIPTSKYLNNRLITTQQWLKILTSKQMMTM
          .:.: : : : : : : : : : : : : : : : : :
Euglena VNMFISGIFQIANVEVGQHFYWSILGFQIHGQVLNSWIVILIIGF--LSIYTTKNL--TLVPANKQIFIELVTEFITDI
          10      20      30      40      50      60      70      80

          70      80      90      100     110     120
human      HNTK-GRT---WSLMLVSLIIFIATTNLLG-LLPHSFT--PTTQL---SMNLAMAIPLWAGTVIMGFRSKI-KNALAHF
          .:. :. : : : : : : : : : : : : : : : : : : : : : : : : : : : : :
Euglena SKTQIGKEYSKWVPYIGTMFLFIFVSNWSGALIPWKIIELPNGELGAPTNDINTTAGLAILTSLAYFYAGLNKKGLTYF
          90      100     110     120     130     140     150     160

          130     140     150     160     170     180     190     200
Human      LPQGTPTPLIPMLVIEIETISLLIQPMALAVRLTANITAGHLLMHLIGSATLAMSTINLPSTLIIFTILILLTILEIAVAL
          .:.: . :. : . : : : : : : : : : : : : : : : : : : : : : : : :
Euglena KKYVQPTPILLPINILEDFT---KPLSLSFRLFGNILADELVVAVLVSL-----VP--LIVPVPLIFLGLF---TSG
          170     180     190     200     210     220

          210     220
human      IQAYVFTLLVSLYLHDNT
          :. :. : . :.
Euglena IQALIFATLSGSYIGEAMEGHH
          230     240     250

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```

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Library: 5190103 residues in 13351 sequences

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sp|P19568|TLCA_RICPR ADP,ATP carrier protein ( 498) 122 35.0 0.043 0.243 0.579 152

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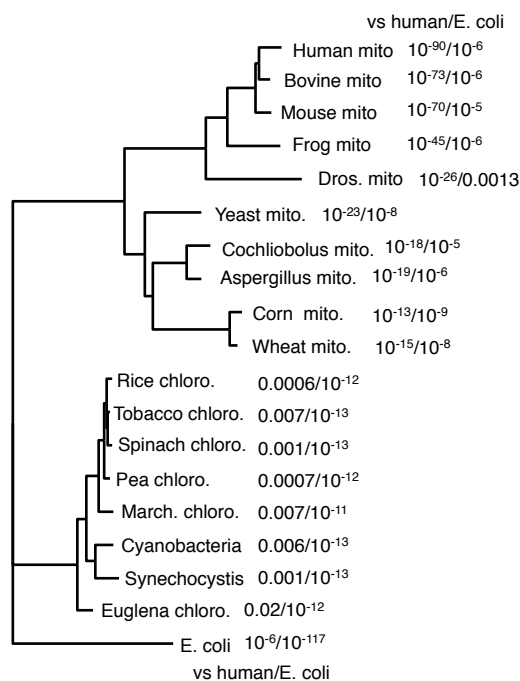
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sp P69371	ATPI_ATRBE	Chloroplast ATP synthase	( 247)	271	69.7	9.3e-13	0.270	0.607	211
sp P08444	ATP6_SYNP6	ATP synthase a chain (AT	( 261)	271	69.7	9.9e-13	0.267	0.600	240
sp P06452	ATPI_PEA	Chloroplast ATP synthase a	( 247)	266	68.5	2.1e-12	0.274	0.614	223
sp P30391	ATPI_EUGGR	Chloroplast ATP synthase	( 251)	265	68.3	2.5e-12	0.298	0.596	225
sp P0C2Y5	ATPI_ORYSA	Chloroplast ATP synthase	( 247)	260	67.2	5.4e-12	0.259	0.603	239
sp P27178	ATP6_SYNY3	ATP synthase a chain (AT	( 276)	260	67.1	6.1e-12	0.264	0.578	258
sp P06289	ATPI_MARPO	Chloroplast ATP synthase	( 248)	250	64.8	2.7e-11	0.261	0.621	211
sp P07925	ATP6_MAIZE	ATP synthase a chain (AT	( 291)	215	56.7	8.7e-09	0.259	0.578	232
sp P68526	ATP6_TRITI	ATP synthase a chain (AT	( 386)	209	55.3	3.1e-08	0.259	0.603	239
sp P00854	ATP6_YEAST	ATP synthase a chain pre	( 259)	204	54.2	4.5e-08	0.235	0.578	277
sp P05499	ATP6_TOBAC	ATP synthase a chain (AT	( 395)	189	50.7	7.8e-07	0.220	0.582	268
sp P00846	ATP6_HUMAN	ATP synthase a chain (AT	( 226)	178	48.2	2.5e-06	0.237	0.589	236
sp P00852	ATP6_EMENI	ATP synthase a chain pre	( 256)	178	48.2	2.8e-06	0.209	0.590	244
sp P00849	ATP6_XENLA	ATP synthase a chain (AT	( 226)	173	47.1	5.5e-06	0.261	0.630	165
sp P00847	ATP6_BOVIN	ATP synthase a chain (AT	( 226)	172	46.8	6.5e-06	0.233	0.581	236
sp P14862	ATP6_COACHE	ATP synthase a chain (AT	( 257)	171	46.6	8.7e-06	0.204	0.608	265
sp P00848	ATP6_MOUSE	ATP synthase a chain (AT	( 226)	166	45.5	1.7e-05	0.259	0.617	193
sp P00851	ATP6_DROYA	ATP synthase a chain (AT	( 224)	139	39.2	0.0013	0.225	0.549	253
sp P24962	CYB_STELO	Cytochrome b	( 379)	125	35.9	0.021	0.223	0.575	193
sp P09716	US17_HCMVA	Hypothetical protein HVL	( 293)	109	32.3	0.21	0.260	0.565	131
sp P68092	CYB_STEAT	Cytochrome b	( 379)	109	32.2	0.27	0.211	0.562	194
sp P24960	CYB_ODOHE	Cytochrome b	( 379)	104	31.1	0.61	0.210	0.555	200
sp P03887	NU1M_BOVIN	NADH-ubiquinone oxidored	( 318)	98	29.7	1.3	0.287	0.545	167
sp P24992	CYB_ANTAM	Cytochrome b	( 379)	99	29.9	1.4	0.192	0.565	193

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## Protein Evolution and Sequence Similarity

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### *DNA vs protein sequence comparison*

The best scores are:		DNA E(188,018)	tfastx3 E(187,524)	prot. E(331,956)
DMGST	D.melanogaster GST1-1	1.3e-164	4.1e-109	1.0e-109
MDGST1	M.domestica GST-1 gene	2e-77	3.0e-95	1.9e-76
LUCGLTR	Lucilia cuprina GST	1.5e-72	5.2e-91	3.3e-73
MDGST2A	M.domesticus GST-2 mRNA	9.3e-53	1.4e-77	1.6e-62
MDNF1	M.domestica nf1 gene. 10	4.6e-51	2.8e-77	2.2e-62
MDNF6	M.domestica nf6 gene. 10	2.8e-51	4.2e-77	3.1e-62
MDNF7	M.domestica nf7 gene. 10	6.1e-47	9.2e-77	6.7e-62
AGGST15	A.gambiae GST mRNA	3.1e-58	4.2e-76	4.3e-61
CVU87958	Culicoides GST	1.8e-41	4.0e-73	3.6e-58
AGG3GST11	A.gambiae GST1-1 mRNA	1.5e-46	2.8e-55	1.1e-43
BMO6502	Bombyx mori GST mRNA	1.1e-23	8.8e-50	5.7e-40
AGSUGST12	A.gambiae GST1-1 gene	2.3e-16	4.5e-46	5.1e-37
MOTGLUSTRA	Manduca sexta GST	5.7e-07	2.5e-30	8.0e-25
RLGSTARGN	R.leguminosarum gsta	0.0029	3.2e-13	1.4e-10
HUMGSTT2A	H. sapiens GSTT2	0.32	3.3e-10	2.0e-09
HSGSTT1	H.sapiens GSTT1 mRNA	7.2	8.4e-13	3.6e-10
ECAE000319	E. coli hypothet. prot.	—	4.7e-10	1.1e-09
MYMDCMA	Methyl. dichlorometh. DH	—	1.1e-09	6.9e-07
BCU19883	Burkholderia maleylacetate red.	—	1.2e-09	1.1e-08
NFU43126	Naegleria fowleri GST	—	3.2e-07	0.0056
SP505GST	Sphingomonas paucim	—	1.8e-06	0.0002
EN1838	H. sapiens maleylaceto. iso.	—	2.1e-06	5.9e-06
HSU86529	Human GSTZ1	—	3.0e-06	8.0e-06
SYCCPNC	Synechocystis GST	—	1.2e-05	9.5e-06
HSEF1GMR	H.sapiens EF1g mRNA	—	9.0e-05	0.00065

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Table 3: DNA and translated DNA similarity searches

Taxonomic Group	blastx	blastn	blastn	
	+3/-3	+1/-3		
Bacteria eubacteria				
. Proteobacteria proteobacteria				
. . Gammaproteobacteria g-proteo.				
. . . Enterobacteriaceae entero.				
. . . . Shigella enterobacteria				
. . . . . Shigella flexneri2a	979	2165	2595	enterobacteria
. . . . . Escherichia coli CFT073	976	2130	2508	enterobacteria
. . . . . Escherichia coli O157:H7	959	2184	2642	enterobacteria
. . . . . Escherichia coli	758	2253	2817	enterobacteria
. . . . . Edwardsiella tarda	784	1102	180	enterobacteria
. . Brucella melitensis 16M	496	854	113	a-proteobacter
. . Mesorhizobium loti	60			a-proteobacter
. . Bordetella bronchiseptica RB	330	217		b-proteobacter
. . Geobacter metallireducens ..	53			d-proteobacter
. . Geobacter sulfurreducens PCA	53			d-proteobacter
. Prochlorococcus marinus MIT	517	458		cyanobacteria
. Synechocystis sp. PCC 6803 ...	466	284		cyanobacteria
. Clostridium perfringens str. 13	427			eubacteria
. Streptomyces coelicolor A3(2).	417			high GC Gram+
. Mycobacterium tuberculosis ...	414	311		high GC Gram+
. Listeria innocua .....	414	257		eubacteria
. Listeria monocytogenes .....	414	234		eubacteria
. Enterococcus faecium .....	411			eubacteria
. Streptomyces avermitilis MA4680	409			high GC Gram+
. Lactococcus lactis .....	405	183		eubacteria
. Lactobacillus plantarum WCF51.	390	231		eubacteria
. Bacteroides thetaiotaomicronVPI	387	233		CFB group bact
. Chloroflexus aurantiacus .....	72			GNS bacteria
. Gloeobacter violaceus PCC 7421	48			cyanobacteria
. Streptomyces viridifaciens ...	45			high GC Gram+
. Clostridium tetani E88 .....	45			eubacteria

Bit scores from a blastx and blastn searches presented using the BLAST taxonomy summary option. The DNA sequence (M84025) encoding *E. coli* glutamate decarboxylase used to search the bacterial division of Genbank or Genpept. Species that contain a homolog with a bit score  $\geq 45$  ( $E() < 10^{-3}$  for blastx) are shown. The numbers under the blastx and blastn columns indicate the highest bit-score obtained for that taxonomic group.

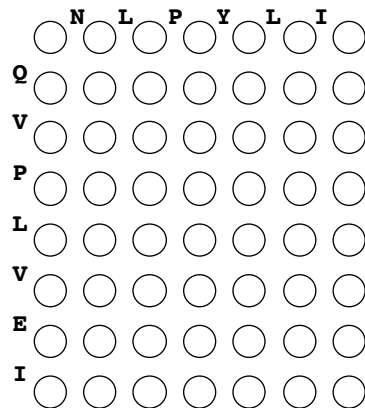
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## Protein Evolution and Sequence Similarity

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## Smith-Waterman

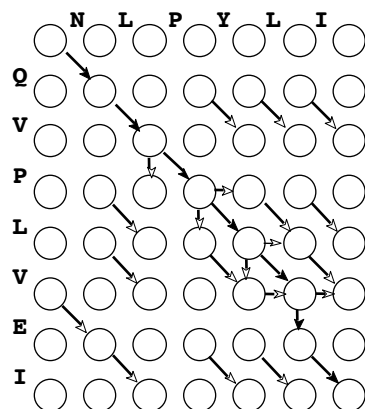


1. score every cell:

$$S_{x,y} = \max \left\{ \begin{array}{l} S_{x-1,y-1} + \text{match}_{xy} \\ S_{x,y-1} - \text{gap} \\ S_{x-1,y} - \text{gap} \\ 0 \end{array} \right\}$$

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## Smith-Waterman



1. score every cell:

$$S_{x,y} = \max \left\{ \begin{array}{l} S_{x-1,y-1} + \text{match}_{xy} \\ S_{x,y-1} - \text{gap} \\ S_{x-1,y} - \text{gap} \\ 0 \end{array} \right\}$$

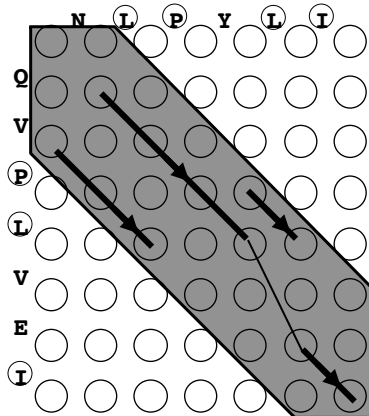
2. follow "traceback"

```
NLPYL-I
..:..:
QVPLVEI
```

Outcome: one continuous, optimal gapped alignment

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## FASTA



1. Identify identical matches  
(length =  $ktup$ )
2. Extend along diagonal  
(local maximum)
3. Join diagonal segments (DP)  
(maintain linearity)  
(optimal sum score)

4. Banded Smith-Waterman

```

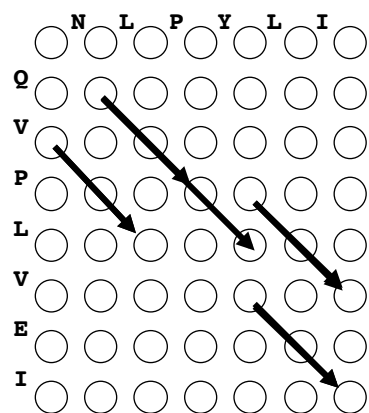
NLPYL-I
..:..:
QVPLVEI

```

Outcome: one continuous, near-optimal gapped alignment

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## BLAST



1. neighborhood word hits  
(word length)
2. extend from diagonal ends  
(X-drop threshold)
3. report HSP linkages  
(maintain linearity)  
(probability)

```

NL    NLP    LI
.:    .:.    .:
PL    QVP    EI

```

Outcome: multiple HSPs, multiple linkages; only partially aligned

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## Local alignments - calmodulin

```

46.1% identity in 76 aa overlap (1-76:77-149); score: 222 E(10000): 2.7e-10
      10      20      30      40      50      60
mchu  MADQLTEEQIAEFKEAFSLFDKDGDTITTKELGTVMRSLGQNPTAEALQDMINEVDADG
      : : .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .:
mchu  MKDTSDEEEI---REAFRVFDKDGNGYISAAELRHVMTNLGEKLTDEEVDEMIREADIDG
      80      90      100      110      120      130

      70
mchu  NGTIDFPPEFLTMMARK
      .: .: .: .: .: .:
mchu  DGQVNYEEFVQMMTAK
      140

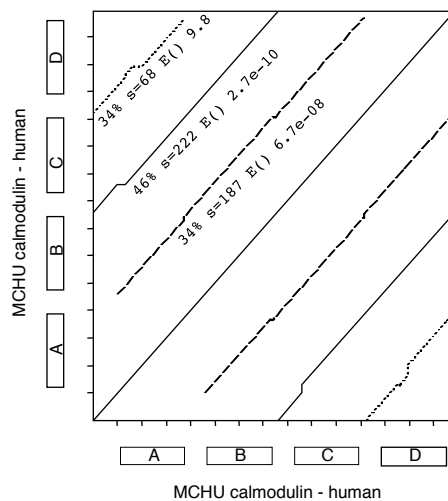
34.3% identity in 105 aa overlap (11-111:47-147); score: 187 E(10000): 6.7e-08
      20      30      40      50      60
mchu  AEFKEAFSLFDKDGDTITTKELGTVM-RSLGQNPTAEALQDMINEVDADGNGTIDFPEF
      : : .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .:
mchu  AELQDMINEVDADGNGTIDFPEFLTMMARKMKDTSDEEEIREAFRVFDKDGNGYISAAEL
      50      60      70      80      90      100
      70      80      90      100      110
mchu  ---LTMMARKMKDTSDEEEIREAFRVFDKDGNGYISAAELRHVMT
      .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .:
mchu  RHVMTNLGEKLTDEEVDEMIREA---DIDGDGQVNYEEFVQMMT
      110      120      130      140

34.2% identity in 38 aa overlap (1-37:113-146); score: 68 E(10000): 9.8
      10      20      30
mchu  MADQLTEEQIAEF-KEAFSLFDKDGDTITTKELGTVM
      .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .: .:
mchu  LGEKLTDEEVDEMIREA---DIDGDGQVNYEEFVQMM
      120      130      140

```

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## Repeated domains with local alignments



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## Protein Evolution and Sequence Similarity

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## More about scoring matrices ...

### PAM series:

- Evolutionary model - extrapolated from PAM1
- PAM20: 20% change (mammals)
- PAM250: 250% change (<20% identity)
- Gap penalties should vary
- shallow matrices (PAM10-40) for short sequences and short distances

### BLOSUM series

- Empirically determined, no extrapolation (no model)
- BLOSUM45-50 - distant (1/3 bits)
- BLOSUM80 -very highly conserved (not small change), high info/position
- BLOSUM62 - 1/2 bits

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## Where do scoring matrices come from?

### Pam40

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

### Pam250

	A	R	N	D	E	I	L
A	2						
R	-2	6					
N	0	0	2				
D	0	-1	2	4			
E	0	-1	1	3	4		
I	-1	-2	-2	-2	-2	5	
L	-2	-3	-3	-4	-3	2	6

$q_{ij}$  : replacement frequency at PAM40, 250

$$q_{R:N(40)} = 0.000435$$

$$p_R = 0.051$$

$$q_{R:N(250)} = 0.002193$$

$$p_N = 0.043$$

$$\lambda_2 S_{ij} = \lg_2 (q_{ij}/p_i p_j) \quad \lambda_e S_{ij} = \ln (q_{ij}/p_i p_j) \quad p_R p_N = 0.002193$$

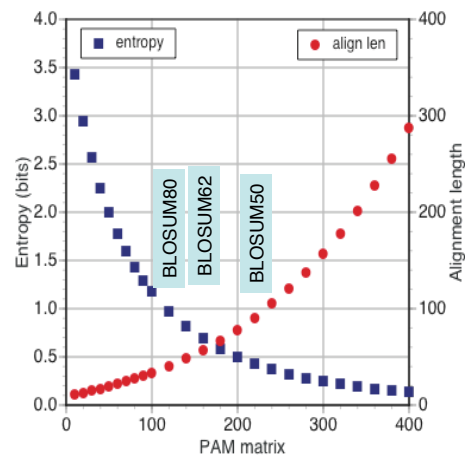
$$\lambda_2 S_{R:N(40)} = \lg_2 (0.000435/0.00219) = -2.333$$

$$\lambda_2 = 1/3; S_{R:N(40)} = -2.333/\lambda_2 = -7$$

$$\lambda S_{R:N(250)} = \lg_2 (0.002193/0.002193) = 0$$

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## PAM matrices and alignment length

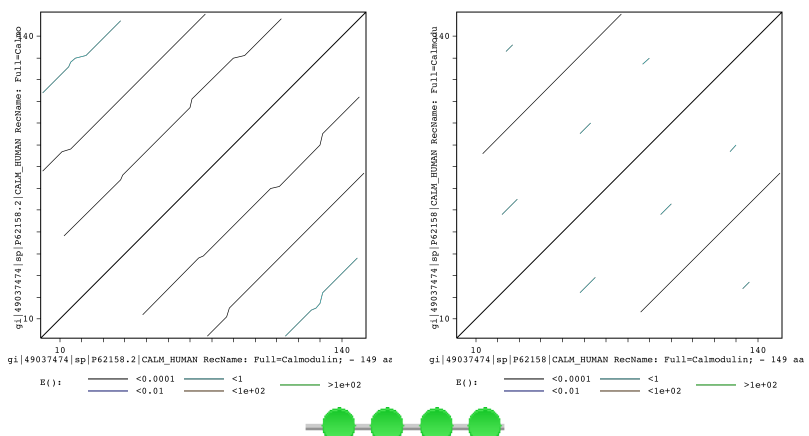


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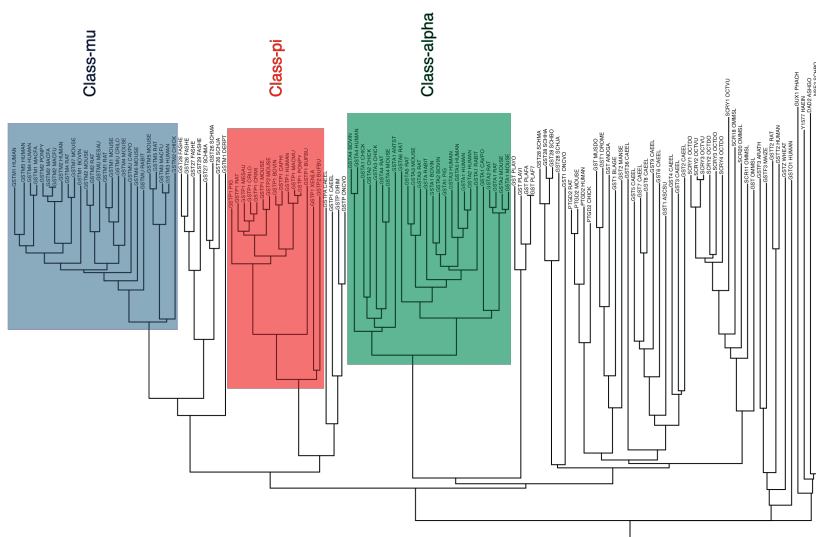
## Scoring matrices set look back time

BLOSUM50 -10/-2

MD20 -26/-4



## Glutathione Transferases (gstm1\_human)



		BLOSUM50-10/-		BLOSUM62-11/-		MD40 -21/-		MD10 -23/-4	
		E(320363)	f_id	E(320363)	f_id	E(320363)	f_id	E(320363)	f_id
Class-mu	GSTM1_HUMAN	1.3e-101	1.00	5.1e-132	1.000	0	1.000	0	1.000
	GSTM4_HUMAN	1.9e-89	0.867	1.1e-115	0.867	2.2e-188	0.867	1.9e-193	0.867
	GSTM2_MOUSE	3.0e-87	0.839	3.6e-113	0.839	1.4e-184	0.847	2.5e-187	0.847
	GSTM5_HUMAN	4.9e-87	0.876	6.9e-114	0.876	4.7e-187	0.876	7.2e-195	0.912
	GSTM2_HUMAN	8.2e-87	0.844	8.2e-113	0.844	2.6e-182	0.844	1.3e-184	0.844
	GSTM1_MOUSE	7.0e-83	0.780	2.5e-107	0.780	4.7e-169	0.780	1.5e-162	0.780
	GSTM6_MOUSE	1.9e-82	0.775	1.0e-106	0.775	5.1e-168	0.779	1.3e-161	0.779
	GSTM4_MOUSE	8.7e-82	0.769	4.7e-105	0.769	7.7e-166	0.769	2.1e-158	0.769
	GSTM5_MOUSE	6.9e-73	0.727	3.5e-94	0.727	1.3e-142	0.727	3.7e-128	0.727
	GSTM3_HUMAN	8.2e-73	0.731	6.7e-95	0.731	3.4e-143	0.731	8.2e-129	0.731
Class-pi	GSTM2_CHICK	9.8e-65	0.656	4.7e-84	0.656	3.0e-117	0.656	1.4e-93	0.675
	GST26_FASHE	2.9e-44	0.495	1.3e-56	0.491	2.7e-59	0.502	3.2e-18	0.510
	GSTM1_DERPT	5.2e-42	0.467	1.6e-53	0.487	5.1e-57	0.505	2.4e-29	0.651
	GST27_SCHMA	2.4e-37	0.467	9.5e-49	0.458	4.7e-42	0.470	5.1e-20	0.607
	GSTY1_PIG	2.9e-9	0.327	1.2e-2	0.327	0.00031	0.409		
	GSTY1_XENLA	5.2e-9	0.333	6.0e-2	0.330	0.12	0.464		
	GSTY2_MOUSE	8.0e-7	0.294	1.3e-2	0.294	1.1	0.395		
	GSTY1_CAEEL	1.1e-6	0.324	4.3e-2	0.319	1.1	0.706		
	GSTY1_HUMAN	3.0e-6	0.284	2.2e-2	0.284	0.29	0.467		
	GSTY1_BUFBU	1.2e-4	0.285	7.2e-1	0.272	9.7	0.588		
Class-alpha	GSTY1_CAEEL	1.1e-3	0.298	2.8e-1	0.284	0.002	0.400		
	PTGD2_MOUSE			4.8e-12	0.302	2.6e-14	0.293		
	PTGD2_RAT			4.8e-12	0.302	1.5e-14	0.293		
	PTGD2_HUMAN			1.1e-11	0.292	4.0e-13	0.281		
	PTGD2_CHICK			9.8e-11	0.304	6.9e-13	0.302		
	GSTP2_BUFBU			2.0e-10	0.288	2.2e-12	0.307		
	GST_MUSDO			5.8e-09	0.257	2.3e-11	0.251		
	GST1_DROME			1.0e-08	0.255	2.9e-10	0.237		
	GSTA1_MOUSE			1.5e-08	0.279	4.9e-11	0.264		
	GSTA2_HUMAN			6.6e-08	0.286	1.2e-08	0.273		

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## Scoring matrices influence alignment lengths

### A. Search with MJ0050

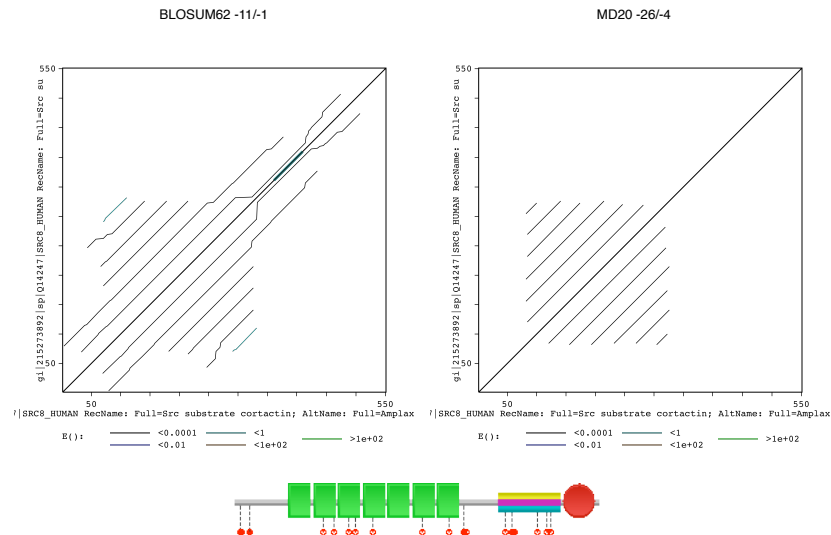
	BLOSUM50 -10/-2				BLOSUM62 -7/-1				BLOSUM62 -11/-1			
	s-w	E()	%_id	alen	s-w	E()	%_id	alen	s-w	E()	%_id	alen
<b>The best scores are:</b>												
NP_416010 glutamate decarb.	250	e-11	24.9	401	216	e-7	25.3	415	137	e-8	22.9	332
NP_417379 glycine decarb.	169	e-05	22.1	420	163	0.001	23.3	430	88	0.004	22.1	331
NP_417025 aminotransferase	122	0.02	23.6	254	119	0.12	24.5	257	76	0.04	23.7	118
NP_414772 aminoacyl-his.	110	0.15	23.4	188	108	0.74	23.2	311	57	6.9	23.4	188
NP_415139 alkyl hydroperoxide	99	1.1	26.9	156	104	1.5	24.5	233	62	2.0	28.9	97

### B. Search with MJ1633

	BLOSUM50 -10/-2				BLOSUM62 -7/-1				BLOSUM62 -11/-1			
	s-w	E()	%_id	alen	s-w	E()	%_id	alen	s-w	E()	%_id	alen
<b>The best scores are:</b>												
NP_417809 KefB	196	e-06	28.2	177	162	0.02	27.3	176	143	e-8	34.4	96
NP_414589 K+ antiporter	175	e-04	25.4	142	141	0.2	24.7	166	131	e-7	25.4	142
NP_415011 transport protein	133	0.03	23.2	142	113	4.4	23.2	142	89	0.005	23.2	142
NP_417748 TrkA	128	0.04	23.7	135	114	2.9	22.2	176	99	e-3	21.8	133
NP_416807 NAD(P) binding	103	0.98	26.1	92					70	0.29	26.1	92

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## Scoring matrices influence alignment lengths



## Similarity Scoring Matrices - Summary

- Similarity scoring matrices are “log-odds” matrices, reporting the “odds” that an alignment reflects homology rather than chance
- One can predict evolutionary changes using a simple random model, which can generate mutation frequencies at any evolutionary distance
- The optimal scoring matrix has an evolutionary distance that matches that of the alignment. Matrices that are shallower than the true distance produce short alignments, while matrices that are deeper produce long alignments.
- Shallower scoring matrices have more information content, or “bits/residue”, and thus can be used to find shorter domains
- Scoring matrices set evolutionary look back times

### *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
- Short alignments require shallow matrices
- Shallow matrices set maximum look-back time

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- When to trust similarity statistics?
- Improving sensitivity with PSI-BLAST

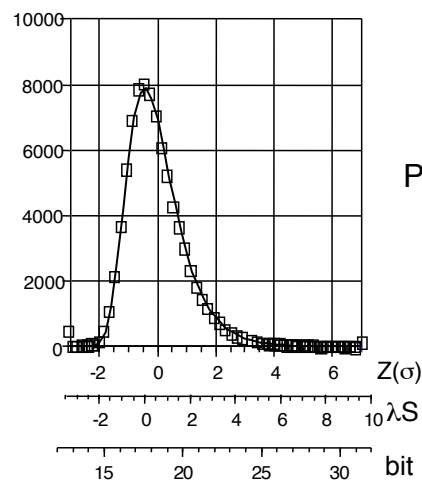
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## Inferring Homology from Statistical Significance

- Real **UNRELATED** sequences have similarity scores that are indistinguishable from **RANDOM** sequences
- If a similarity is NOT **RANDOM**, then it must be NOT **UNRELATED**
- Therefore, NOT **RANDOM** (statistically significant) similarity must reflect **RELATED** sequences

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### Extreme value distribution



$$S' = \lambda S_{\text{raw}} - \ln K m n$$

$$S_{\text{bit}} = (\lambda S_{\text{raw}} - \ln K) / \ln(2)$$

$$P(S' > x) = 1 - \exp(-e^{-x})$$

$$P(S_{\text{bit}} > x) = 1 - \exp(-mn2^{-x})$$

$$E(S' > x \text{ ID}) = P D$$

$$P(B \text{ bits}) = m n 2^{-B}$$

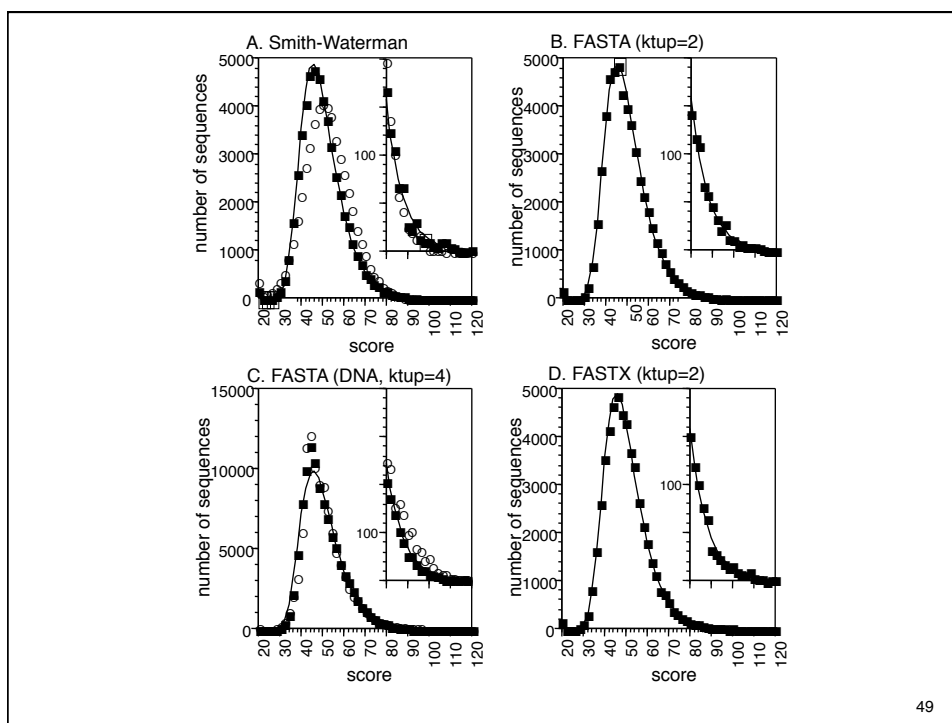
$$P(40 \text{ bits}) = 1.5 \times 10^{-7}$$

$$E(40 \mid D=4000) = 6 \times 10^{-4}$$

$$E(40 \mid D=4E6) = 0.6$$

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## Smith-Waterman (ssearch)

The best scores are:

			s-w	bits	E(115640)	%_id	alen
GTM1_MOUSE	Glutathione S-trans	( 218)	1497	363.5	2e-100	1.000	218
GTM2_CHICK	Glutathione S-trans	( 220)	958	234.9	1.1e-61	0.619	218
GTP_HUMAN	Glutathione S-trans	( 210)	356	91.2	1.8e-18	0.308	211
PGD2_MOUSE	Glutathione-reg.	( 199)	262	68.8	9.7e-12	0.319	204
GTA1_MOUSE	Glutathione S-trans	( 223)	229	60.9	2.6e-09	0.284	225
SC1_OCTDO	S-crystallin 1 OLI	( 215)	228	60.7	3.0e-09	0.269	219
GTS_MUSDO	Glutathione S-trans	( 241)	228	60.6	3.4e-09	0.264	201
GTS1_CAEEL	Prob. Glut. S-trans	( 210)	220	58.8	1.1e-08	0.284	225
GTS_OMMSL	Glutathione S-trans	( 203)	196	53.0	5.5e-07	0.258	209
GTH3_ARATH	Glutathione S-trans	( 215)	142	40.1	0.0045	0.310	126
GTT2_HUMAN	Glutathione S-trans	( 244)	132	37.7	0.027	0.257	167
GT24_DROME	Glutathione S-trans	( 216)	131	37.5	0.028	0.255	153
YFCG_ECOLI	Hypothetical GST	( 215)	112	33.0	0.64	0.235	187
YJY1_YEAST	hypothetical 30.5	( 261)	110	32.4	*1.1*	0.248	149
DCMA_METS1	dichloromethane DM	( 267)	103	30.8	3.7	0.214	210
YA42_HAEIN	Hypothetical prot.	( 617)	108	31.7	*4.6*	0.283	120
GTO1_RAT	Glutathione trans	( 241)	100	30.1	5.4	0.234	158
DP41_BACHD	DNA polymerase I	( 413)	104	30.8	*5.4*	0.234	184
GTH1_WHEAT	Glutathione S-trans	( 229)	98	29.6	7.0	0.246	171
LGUL_SOYBN	Lactoylglutathione	( 219)	97	29.4	7.8	0.200	190
VP2_AHSV3	outer capsid prot	(1057)	108	31.5	*8.9*	0.205	200
GTH5_ARATH	Glutathione S-trans	( 218)	96	29.2	9.2	0.258	66
DCMA_METSP	dichloromethane DM	( 288)	98	29.5	9.3	0.195	200
GTXA_ARATH	Glutathione S-trans	( 224)	96	29.1	9.5	0.248	125
SLT_HAEIN	Putative soluble 1	( 593)	103	30.5	*9.9*	0.227	185

## Low gap penalties can reduce sensitivity

The best scores are:

			s-w	bits	E(115640)	%_id	alen
GTM1_MOUSE	Glutathione S-tran	( 218)	1497	164.0	2.3e-40	1.000	218
GTM2_CHICK	Glutathione S-tran	( 220)	958	107.5	2.4e-23	0.619	218
GTP_HUMAN	Glutathione S-tran	( 210)	378	46.8	4.2e-05	0.308	211
PGD2_MOUSE	Glutathione-req.	( 199)	311	39.9	0.0048	0.319	204
GTA1_MOUSE	Glutathione S-tran	( 223)	296	38.1	0.019	0.313	233
SC1_OCTDO	S-crystallin 1 OL1	( 215)	286	37.2	0.035	0.272	224
GTS_MUSDO	Glutathione S-tran	( 241)	279	36.2	0.077	0.274	219
GTS_OMMSL	Glutathione S-tran	( 203)	241	32.6	0.81	0.261	222
GTH3_ARATH	Glutathione S-tran	( 215)	190	27.1		0.293	198
GTT2_HUMAN	Glutathione S-tran	( 244)	189	26.7		0.271	210
GTT1_MUSDO	Glutathione S-tran	( 208)	183	26.4		0.276	199
MAAI_VIBCH	Probable maleylace	( 215)	184	26.5		0.235	247
YFCG_ECOLI	Hypothetical GST-	( 215)	184	26.5		0.246	224
GTXA_TOBAC	prob. Glutathione	( 220)	184	26.4		0.250	204
GTH1_WHEAT	Glutathione S-tran	( 229)	185	26.4		0.246	236
GTH7_ARATH	Glutathione S-tran	( 214)	180	26.1		0.254	228
T1MH_METJA	Putative type I r	( 558)	210	27.3	*85*	0.255	275
DP41_BACHD	DNA polymerase I	( 413)	200	26.8	*86*	0.244	234
GTH2_WHEAT	Glutathione S-tran	( 291)	188	26.3		0.247	251

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## FASTA search – low complexity regions

Search with complete grou\_drome:

The best scores are:

			opt	bits	E(14548)
RGHUB1	GTP-binding regulatory protein beta-1 chai	( 341)	237	46.6	3.5e-05
RGBOB1	GTP-binding regulatory protein beta-1 chai	( 341)	237	46.6	3.5e-05
RGHUB3	GTP-binding regulatory protein beta-3 chai	( 341)	233	46.0	5.2e-05
RGMSB4	GTP-binding regulatory protein beta-4 chai	( 341)	232	45.8	5.7e-05
PIHUPF	salivary proline-rich glycoprotein precurs	( 252)	224	44.5	*0.00010*
RGFFB	GTP-binding regulatory protein beta chain	( 347)	223	44.5	0.00014
PIRT3	acidic proline-rich protein precursor - rat	( 207)	199	40.8	*0.0011*
PIHUB6	salivary proline-rich protein precursor PR	( 393)	203	41.6	*0.0012*
CGBO2S	collagen alpha 2(I) chain - bovine (fragme	( 403)	195	40.5	*0.0027*
WMBEW6	capsid protein - human herpesvirus 1 (stra	( 636)	192	40.2	*0.0051*
W4WLB5	E4 protein - human papillomavirus type 5b	( 246)	170	36.6	*0.024*
OZZQMY	circumsporozoite protein precursor - Plasm	( 368)	172	37.1	*0.026*
FOMVME	gag polyprotein - murine leukemia virus (s	( 537)	161	35.6	*0.10*

Search with seg-ed grou\_drome: (low complexity regions removed)

The best scores are:

			opt	bits	E(14548)
RGHUB3	GTP-binding regulatory protein beta-3 chai	( 341)	233	56.5	3.6e-08
RGMSB4	GTP-binding regulatory protein beta-4 chai	( 341)	232	56.3	4.1e-08
RGHUB2	GTP-binding regulatory protein beta-2 chai	( 341)	228	55.5	7.2e-08
RGBOB1	GTP-binding regulatory protein beta-1 chai	( 341)	225	54.9	1.1e-07
RGFFB	GTP-binding regulatory protein beta chain	( 347)	223	54.5	1.5e-07
BVBVMS	MSI1 protein - yeast (Saccharomyces cerevi	( 423)	135	37.0	*0.033*
ERHUAH	coatomer complex alpha chain homolog - hum	(1225)	134	37.1	*0.088*
A28468	chromogranin A precursor - human	( 458)	122	34.4	*0.21*
RGOOBE	GTP-binding regulatory protein beta chain	( 342)	120	33.9	0.22

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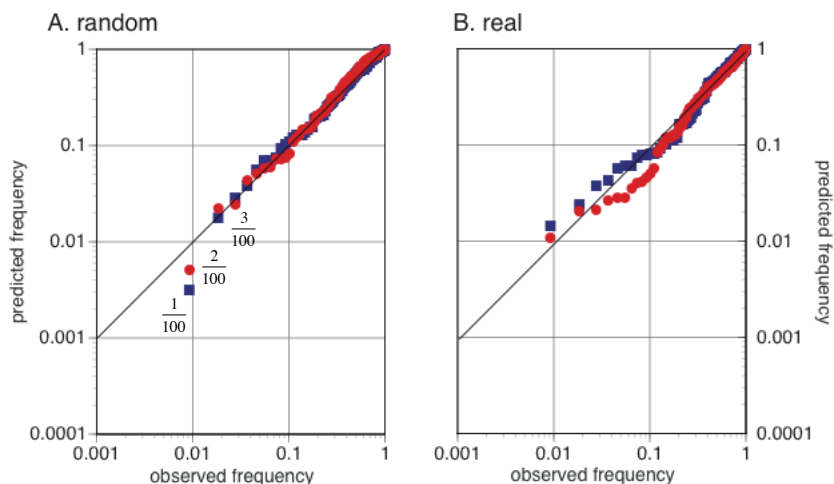
## pseg removes low-complexity regions

>gi|17380405|sp|P16371|GROU\_DROME Groucho protein (Enhancer of split M9/10)

	1-8	MYSPVVRH
paagggpppggp	9-19	
	20-131	IKFTIADTLERIKEEFNFLQAQYHSIKLEC EKLSNEKTEMQRHYVVMYEMSYGLNVMHK QTEIAKRLNTLINQLLPFLQADHQQQLQA VERAKQVTMQELNLIIGQQIHA
qqvpggppqpmg	132-143	
	144-281	ALNPFALGATMGLPHGPQGLLNKPEHHR PDIKPTGLEGPAAAEERLNSVSPADREKY RTRSPLDIENDSKRRKDEKLQEDGEGKSDQ DLVVDVANEMESHSPRNGEHVSMEVRDRE SLNGERLEKPSSSGIKQE
rppsrsgsssrstps	282-297	
	298-310	LKTKDMEKPGTPG
akartptpnaaapagvnpk	311-330	
qmmpqggpppagypgapyqrpa	331-351	
	352-719	DPYQRPPSDPAYGRPPMPYDPHAHVRTNG IPHPSALTGGKPAYSFHMNGESLQPVFPF PDALVGVGIPRHARQINTLSHGEVVCVTI SNPTKYVYTGGKGVKVDISQPGNKNPVS QLDCLQRDNYIRSVKLLPDGRTLIVGGEAS NLSIWDLASPTPRIKAELTSAAACYPALAI SPDSKVCFCSCSDGNIAVWDLHNEILVRQF QGHTDGASCIDISPDGSRLLWTGGLDNTVRS WDLREGRLQQHDFSSQIFSLGYCPTGDWL AVGMENSHVEVLHASKPKYQLHLHESCVL SLRFAACGKWFVSTGKDNLLNAWRTPYGAS IFQSKETSSVLSCDISTDDKYIVTSGSGDKK ATVYEVII

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## Protein Sequence Comparison Statistics are Accurate



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## Statistical estimates from random shuffles

- BLAST estimates statistical significance from simulations of “normal” (average composition) proteins
- FASTA estimates statistical significance from the distribution of similarity scores obtained during the database search (selects 60,000 unrelated sequence scores from the database of *real* proteins)
- What if the sequences are different from most proteins, but similar to each other, e.g. membrane proteins?
- PRSS estimates statistical significance by producing hundreds of shuffled (random) sequences with the same length and composition, and then estimates  $\lambda$  and  $K$  from comparisons against those proteins

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## prss - uniform and window shuffle

```

>lweec6 H+-transporting ATP synthase (EC 3.6.1.34) protein 6 - Escherichia coli
MASENMTPOD YIGHHLNNLQ LDLRTFSLVD PQNPATFWT INIDSMFFSV VLGLLFLVLF
RSVAKKATSG VPGKFQTAIE LVIGFVNGSV KDMYHGKSKL IAPLALTIFV WVFLMNLMDL
LPIDLLPYTA EHVGLPALR VVPSADVNT LSMALGVFIL ILFYSIKMKG IGGFTKELTL
QPFHMAFIP VNTILEGVSL LSKPVSLGLR LFGNMYAGEL IFILIAGLLP WWSQWILNVP
WAIFHILIT LQAFNEMVLT IVYLSMASEE H

>lweec6_0 shuffled
GMPISVLLFK PPEVLLVFL LSVGMTNPPAW GGFIMKGFKI VSFVGWVRV AVAGHLALYK
ITRDVNIVKS AVFGSALLHP LLLQLSELNI VFNLLNIKI RTAYVHGRTL LSHIFLPFAS
GEGVFSMDML IITWNSASVL SGLDMFANIA LLGNPLMTN IVIILQRKFI ATTKFSLADI
HLHKQYSWDG MMSHTLIIFS ALELWVQNGD IFIPLNEYIL PFTLYVPNW LITQALVVALV
ELPGQQIDAE PLFLPIPPS EKTWYGDIMF L

PRSS34 - 1000 shuffles; uniform shuffle
unshuffled s-w score: 178; bits(s=178|n_l=271): 34.8 p(178) < 2.005e-06
For 10000 sequences, a score >= 178 is expected 0.02005 times

>lweec6_0 shuffled window: 10
EDSMANTMPO HONILGYHLN DLRTSDFVLL FTQAPWPTPN SMNIDIVFSF VLLVLLFFGL
SRGAVKATKS EQVTGIKFAP VVSGVILGFN HDKGMSLYKK VLPFIFLAAT DWLMNFVLLM
IIDLYLLAPP ERVGHPLAL APNVVSVDT MLFLIGSALV IFSLMKGIKY TTFGLEKGL
QAWNFFPHIP NLSVEVGLLI GLPVRSSLKL MFLELAGNGY PFGILILILA SLINVWPQWQ
IAIWTIFHL VQMTFFLAIL VSESELMIYA H

PRSS34 - 1000 shuffles; window shuffle, window size: 20
unshuffled s-w score: 178; bits(s=178|n_l=271): 34.5 p(178) < 2.601e-06
For 10000 sequences, a score >= 178 is expected 0.02602 times

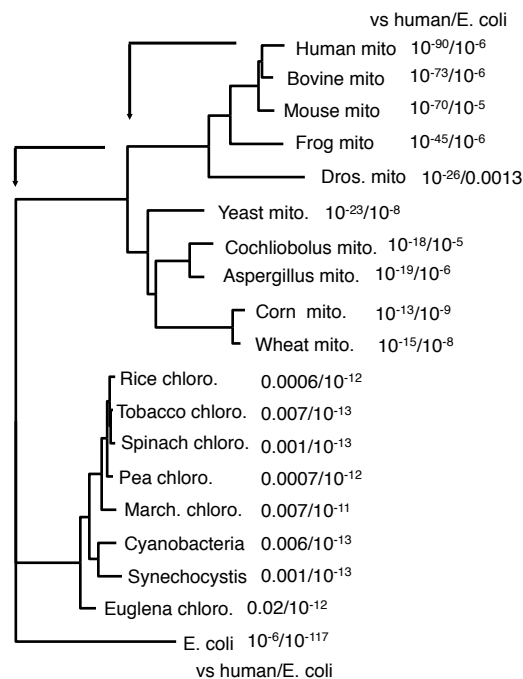
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## Protein Evolution and Sequence Similarity

- What is Homology and how do we recognize it?
- How do we measure sequence similarity – alignments and scoring matrices?
- DNA vs protein comparison
- Alignment Algorithms/Local sequence alignments
- Similarity scoring matrices
- When are we certain that an alignment is significant - similarity score statistics?
- When to trust similarity statistics?
- Improving sensitivity with PSI-BLAST

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[illegible]

## PSI-BLAST ATP6\_HUMAN - 4 iterations

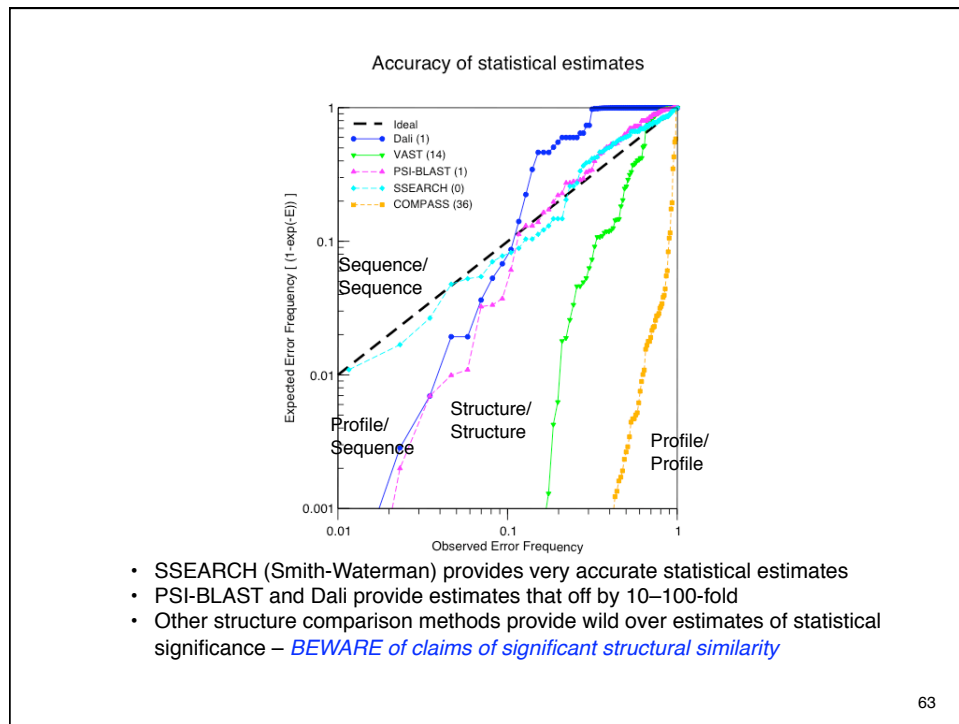
Results from round:		(1)		(2)		(3)		(4)	
Sequences producing significant alignments:		Score	E	Score	E	Score	E	Score	E
		(bits)	Value	(bits)	Value	(bits)	Value	(bits)	Value
ATP6_HUMAN	ATP synthase a chain (ATPase protein 6)	296	3e-81	257	1e-69	241	2e-62	222	5e-59
ATP6_BOVIN	ATP synthase a chain (ATPase protein 6)	253	2e-68	257	2e-69	239	8e-65	230	2e-61
ATP6_MOUSE	ATP synthase a chain (ATPase protein 6)	245	5e-66	247	3e-66	234	4e-64	225	6e-60
ATP6_XENLA	ATP synthase a chain (ATPase protein 6)	142	9e-35	227	1e-60	189	3e-49	177	2e-45
ATP6_DROYA	ATP synthase a chain (ATPase protein 6)	101	2e-22	206	3e-54	209	5e-55	196	4e-51
(2)									
ATP6_YEAST	ATP synthase a chain precursor (ATPase prot	93	5e-20	97	3e-21	199	4e-52	191	2e-49
ATP6_TRITI	ATP synthase a chain (ATPase protein 6)	83	5e-17	96	5e-21	218	1e-57	236	4e-63
(3)									
ATP6_TOBAC	ATP synthase a chain (ATPase protein 6)	80	3e-16	90	4e-19	200	2e-52	230	3e-61
ATP6_MAIZE	ATP synthase a chain (ATPase protein 6)	76	5e-15	88	1e-18	198	1e-51	219	5e-58
ATP6_COCHE	ATP synthase a chain (ATPase protein 6)	75	1e-14	86	9e-18			197	2e-51
ATP6_EMENI	ATP synthase a chain precursor (ATPase prot	75	2e-14	84	3e-17	123	5e-29	181	2e-46
(4)									
ATP6_ECOLI	ATP synthase a chain (ATPase protein 6)	42	1e-04	40	5e-04	46	8e-06	49	1e-06
ATPI_SPIOL	Chloroplast ATP synthase a chain precursor			32	0.12	36	0.006	39	0.001
ATP6_SYNY3	ATP synthase a chain (ATPase protein 6)	28	1.9	32	0.16	44	5e-05	45	1e-05
ATPI_MARPO	Chloroplast ATP synthase a chain precursor			31	0.21	44	4e-05	44	3e-05
ATPI_PEA	Chloroplast ATP synthase a chain precursor			31	0.32	37	0.005		
LAMAZ_MOUSE	Laminin subunit alpha-2 precursor (Laminin			31	0.34				
ATPI_ATRBE	Chloroplast ATP synthase a chain precursor			31	0.39	41	2e-04		
ATP6_SYNP6	ATP synthase a chain (ATPase protein 6)			28	1.7	41	2e-04		
ATPI_EUGGR	Chloroplast ATP synthase a chain precursor					39	0.001		
ATPI_ORYSA	Chloroplast ATP synthase a chain precursor			28	1.9	36	0.008		
ATPI_ATRBE	Chloroplast ATP synthase a chain precursor					36	0.009	38	0.002
ATP6_ASPAM	ATP synthase a chain (ATPase protein 6)							36	0.008
POLG_KUNJM	Genome polyprotein [Contains: Capsid protei...	27	5.0						
POL_HTLIC	Gag-Pro-Pol polyprotein [Pr160Gag-Pro-Pol] [...	27	5.0						
POLG_DEN2J	Genome polyprotein [Contains: Capsid protei...	27	5.2	26	7.0				

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Position-Specific Scores  
ATP Synthase, 4 iterations

	A	R	N	D	C	Q	E	G	H	I	L	K	M	F	P	S	T	W	Y	V	bits/pos
BL62 Q	-1	1	0	0	-3	5	2	-2	0	-3	-2	1	0	-3	-1	0	-1	-2	-1	-2	0.70
46 Q	-2	-1	-2	-2	-4	6	0	1	0	-4	-3	-1	-2	-1	-3	-1	-2	6	4	-3	0.74
%	0	0	0	0	0	54	0	12	0	0	0	0	0	0	0	0	0	13	20	0	
47 Q	-1	-1	3	3	-3	3	3	-2	3	-4	-4	-1	-3	-4	-2	2	-1	-4	-2	-3	0.51
%	0	0	13	20	0	16	19	0	8	0	0	0	0	0	0	24	0	0	0	0	
56 Q	-2	-1	-2	-2	-3	5	2	-4	-1	4	-1	-1	-1	-2	-3	-2	-2	-3	-2	0	0.51
%	0	0	0	0	0	46	13	0	0	41	0	0	0	0	0	0	0	0	0	0	
97 Q	-2	-1	0	-2	-4	4	0	-3	8	-4	-4	-1	-2	-3	-3	-1	-2	-3	0	-4	1.11
%	0	0	0	0	0	35	0	0	65	0	0	0	0	0	0	0	0	0	0	0	
131 Q	3	-1	-1	-1	-2	5	2	-2	-1	-3	-3	0	-2	-4	-2	1	-1	-3	-3	-2	0.52
%	44	0	0	0	0	36	11	0	0	0	0	0	0	0	0	9	0	0	0	0	
152 Q	-2	6	-1	-2	-4	4	0	-3	-1	-4	-3	1	-2	-4	-3	-1	-2	-4	-3	-3	1.00
%	0	77	0	0	0	23	0	0	0	0	0	0	0	0	0	0	0	0	0	0	
210 Q	-2	0	-1	-1	-4	7	1	-3	0	-4	-3	1	-1	-4	-2	-1	-2	-3	-2	-3	1.13
%	0	0	0	0	0	100	0	0	0	0	0	0	0	0	0	0	0	0	0	0	

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## Sensitive searches with PSI-BLAST

- PSI-BLAST improves sensitivity by building a Position Specific Scoring Matrix (PSSM)
  - models ancestral sequence (consensus distribution)
  - similar to PFAM HMM (but less sophisticated weights, gaps)
- Sensitivity improves with additional iterations
  - model moves to base of tree
- Statistical estimates are difficult
  - once a sequence is in, it is “significant” - validation must be done before a sequence is included
- Very diverse families may not produce a well defined PSSM
  - similar problems with HMMs have lead to “clans”



## Sequence Similarity - Conclusions

- 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)  $10^{-6} < E() < 10^{-3}$  is statistically significant
- Scoring matrices set evolutionary look back horizons - not every discovery is distant
- PSI-BLAST can be more sensitive, but with lower statistical accuracy

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## Discussion (exam) questions

1. What is the difference between similarity and homology? When does high identity not imply homology? What conclusions can be drawn from homology?
2. What is the range of an expectation value ( $E()$ -value)? If you compare a sequence to 50,000 random(unrelated) sequences, what should the expectation value for the highest of the 50,000 similarity scores be (on average)?
3. In a sequence similarity database search, you identify a statistically significant similarity ( $E() < 0.005$ ), but the alignment is relatively short (50 aa). How might you determine whether the alignment reflects a genuine homology, or a random sequence match?
4. What scoring matrix should be used to identify protein orthologs that have diverged over the past 100 My (e.g. human/mouse)?
5. When the *M. janaschii* genome was first sequenced, Venter and his colleagues stated that almost 60% of the open reading frames (proteins or genes) were novel to this organism. (For bacteria like *E. coli* or *H. influenzae*, a similar number would be 20 - 40%.) On what would they base such a statement? Is it likely to be correct?

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