

BIOS 477/877 Bioinformatics and Molecular Evolution

Instructor: Etsuko Moriyama
(School of Biological Sciences)

Spring 2026 Lecture 17

BIOS477/877 L17 - 1

1

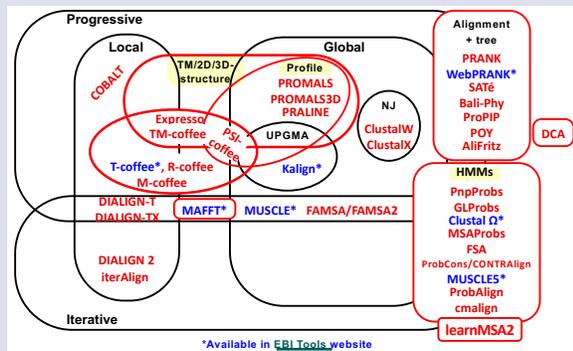
Today's topics

- Phylogeny-aware gap placement methods (PRANK, etc.)
- Alignment trimming/filtering
- MSA evaluation
- Conserved domain, pattern, profile
 - Pattern and Profile (PSSM)
- Assignment 8

BIOS477/877 L17 - 2

2

Multiple sequence alignment methods



For reviews: Katoh (2021) and more available on CANVAS

BIOS477/877 L17 - 3

3

PRANK, WebPRANK

Mind the gaps: Progress in progressive alignment

D. G. Higgins*, G. Blackshields, and I. M. Wallace
Conway Institute, University College Dublin, Belfield, Dublin 4, Ireland (2005 PNAS commentary)

"CLUSTALW attempts to compensate by using an elaborate scoring scheme to encourage gaps to end up on top of each other. ... results in alignments that are very "block-like"..."

"... there may be a price for this prettiness and detachment from phylogenetic reality. CLUSTALW (and other programs) may be guilty of "overalignment", that is where sequences that should not go together are forced into neat-looking blocks. These overaligned regions may be neat looking but misleading."

"There is an understandable tendency for users of multiple alignment software to want their residues neatly aligned in blocks and columns. This is fine when such blocks are biologically accurate as will happen in parts of protein alignments. In cases where insertions or deletions have happened in a less organized manner, as will happen in many noncoding DNA sequences and in less organized parts of protein sequences, such block-like alignments may be biologically meaningless. Perhaps we need to reeducate our eyes to see beauty in what actually happened rather than what looks nice on paper."

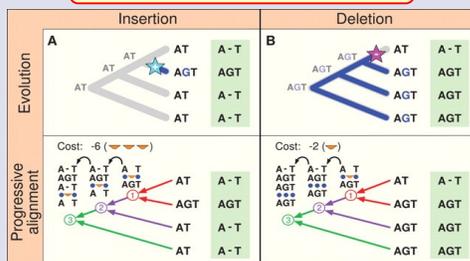
BIOS477/877 L17 - 4

4

PRANK, WebPRANK

Löytynoja & Goldman (2008)

Insertions are more penalized than deletions in progressive sequence alignment.



BIOS477/877 L17 - 5

5

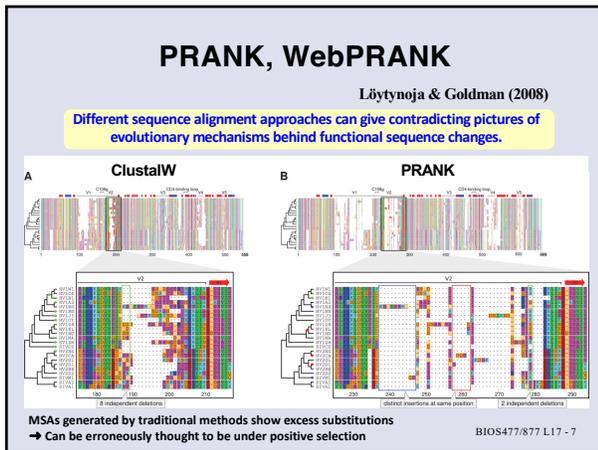
PRANK, WebPRANK

Available at EBI website Löytynoja & Goldman (2005, 2008, 2010)

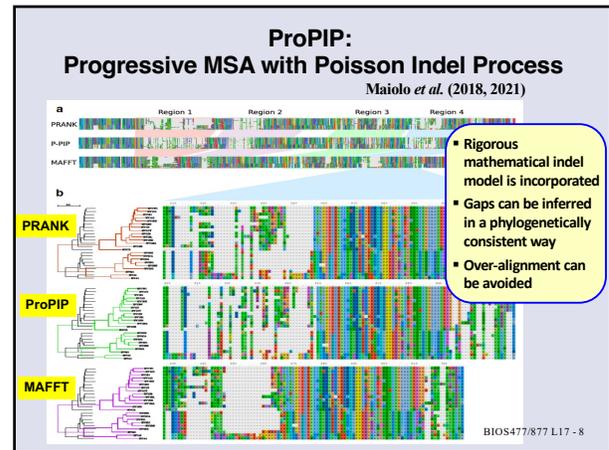
- PRANK: Probabilistic Alignment Kit
 - A probabilistic multiple alignment program for DNA, codon, and amino-acid sequences.
 - Treats insertions correctly.
 - Avoids over-estimation of the number of deletion events.
 - Not meant for the alignment of very diverged protein sequences.

BIOS477/877 L17 - 6

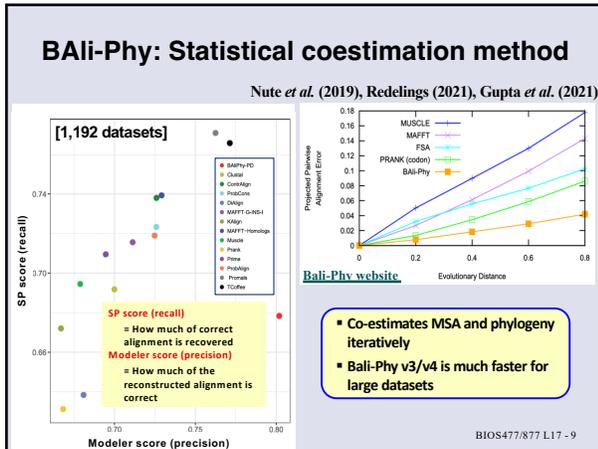
6



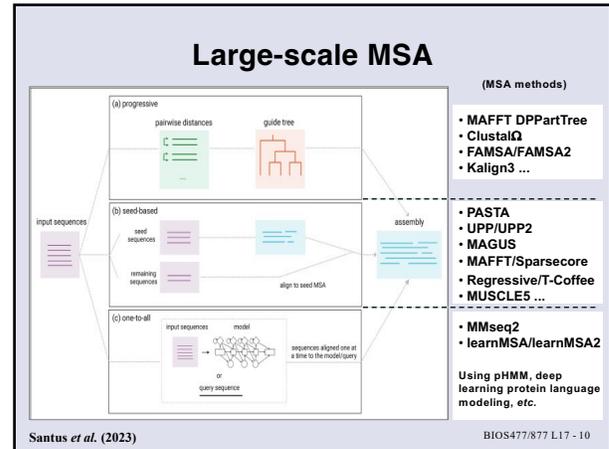
7



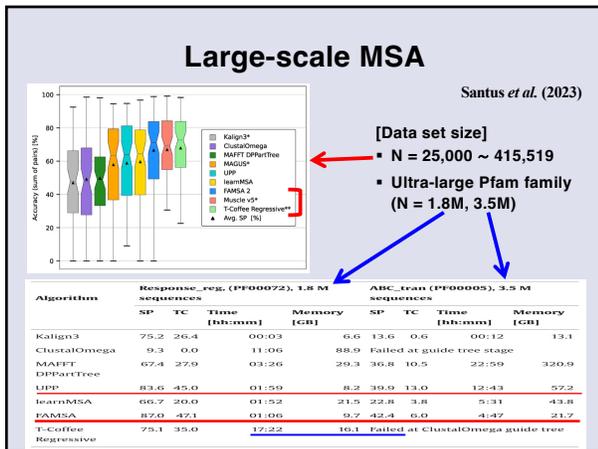
8



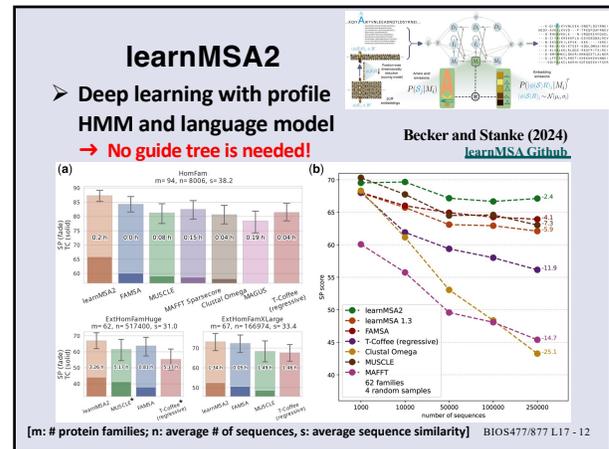
9



10



11



12

Ensemble MSA by Muscle5 **Muscle5**

"Picking a single best protocol disregards the possibility that the best may not be good enough. ... Even if alternative protocols are ... less accurate, a thoughtful comparison of the results provides a useful indication of whether the preferred protocol can be trusted."
Edgar (2022)

"Dispersion" = average dist. between alignments
dist. = nr. diff. cols.

Small dispersion → Easy dataset – unchanged/minor changes → accurate

Large dispersion → Hard dataset – varies with parameters → errors/ambiguous

- Easy alignment → Fewer alignment errors → Ensemble MSA less dispersed
- Difficult alignment → More alignment errors → Ensemble MSA more dispersed

BIOS477/877 L17 - 19

19

Muscle5 + CLOAK: Cleaning on Alignment (K)onsensus

Wheeler *et al.* (2025); integrated into Muscle5

- Likely alignment errors are identified as departure from consensus among alternative MSAs (Muscle5 ensemble MSAs) → Gentle but effective removal of likely alignment errors
- Recall: proportion of aligned pairs in the reference MSA recovered
- Precision: proportion of aligned pairs that are correct

BIOS477/877 L17 - 20

20

How to measure MSA quality

- **Sum of pairs score (SPS) and total column score (CS or TCS)**
 - SPS: Proportion of correctly aligned AA pairs
 - TCS (CS): Proportion of correctly aligned columns [available programs]
- ball_score (from BALiBASE website)
- qscore: <http://drive5.com/qscore> SPS, CS, Shift Score, etc.
- Veralign: <https://www.ibi.vyu.nl/programs/veralign/www/>
- T-coffee consistency based evaluation
 - TCS, IRMSD-APDB, Strike
- MUMSA: average overlap score <https://msa.sbc.su.se/cgi-bin/msa.cgi>
- GUIDANCE2: guide-tree based alignment confidence
- Muscle5: ensemble MSA based accuracy <https://www.drive5.com/muscle/>
- AlignStat: MSA similarity/dissimilarity <https://github.com/TS404/AlignStat>
- QianTest2: secondary structure prediction based <http://www.bioinf.ucd.ie/download/QianTest2ex/download.html>
- Sequence logo: graphical representation of a multiple alignment
 - Weblogo 3: <https://weblogo.threeplusone.com/>

Ref	Test	TCS=1/3
VA-T	-VA-T-	=33.3%
VA-G	-VA-G-	or 25% (w/ gap col.)
MGTG	M-GTG	SPS=5/9 =55.6%

BIOS477/877 L17 - 21

21

Benchmark alignment database: BALiBASE

Thompson *et al.* (1999); Bahr *et al.* (2001); Thompson *et al.* (2005)
[BALiBASE website](http://www.ebi.ac.uk/Tools/Balibase/)

- 9 reference alignment sets → can be used to evaluate multiple alignment programs
- Reference 1: equidistant sequences with various levels of conservation
- Reference 2: families aligned with a highly divergent "orphan" sequence
- Reference 3: subfamilies with <25% residue identity between groups
- Reference 4: sequences with N/C-terminal extension
- Reference 5: internal insertions
- References 6, 7, 8: various protein families containing internal repeats, inversions, transmembrane regions, etc.
- Reference 9: linear motifs
- Reference 10: mixed

BIOS477/877 L17 - 22

22

Assessing MSA quality using BALiBASE

Pais *et al.* (2014)

SP score: Sum-of-Pairs score
TC score: Total-Column score
BBS: Short version of BALiBASE

BIOS477/877 L17 - 23

23

Other benchmark alignment databases

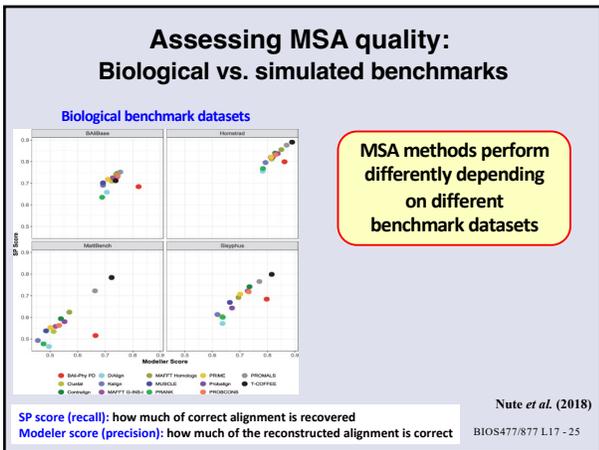
- **HOMSTRAD: Homologous Structure Alignment Database** → Curated database of structure-based alignments for protein families <https://homstrad.mizuguchi-lab.org/homstrad/>
- **PREFAB: Protein Reference Alignment Benchmark** → Automatically generated from structural pairwise alignment expanded with PSI-Blast → Collection of benchmark alignment database is also available (**BENCH**)

BALiBASE, HOMSTRAD, and PREFAB are all → biological benchmark datasets (actual protein sequences) → based on protein structural alignment → supposed to be highly accurate

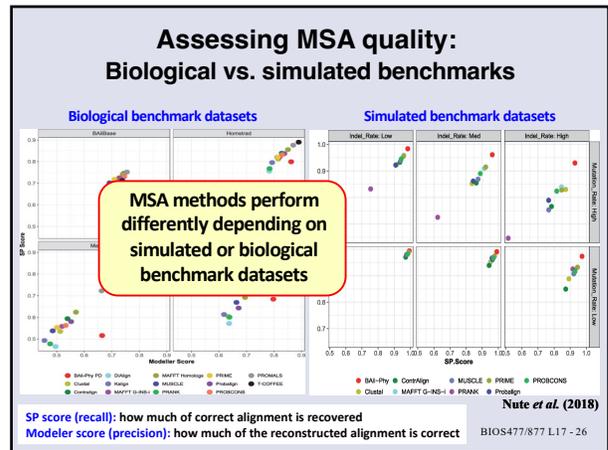
[References]
 • Edgar (2019) "Quality measures for protein alignment benchmarks" [BENCH @ Muscle website](https://www.biorxiv.org/content/10.1101/2019.05.21.257111v1)
 • Iantorno *et al.* (2014) "Who watches the watchman? An appraisal of benchmarks for multiple sequence alignment."
 • Warnow (2021) "Revisiting evaluation of multiple sequence alignment methods" → Discusses the challenges in evaluating MSA methods using biological vs. simulated benchmark datasets

BIOS477/877 L17 - 24

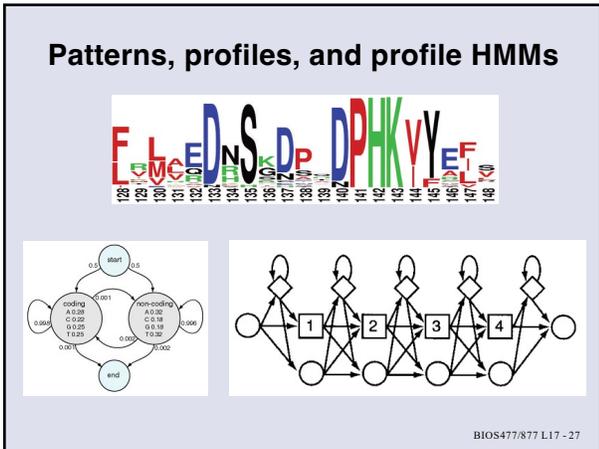
24



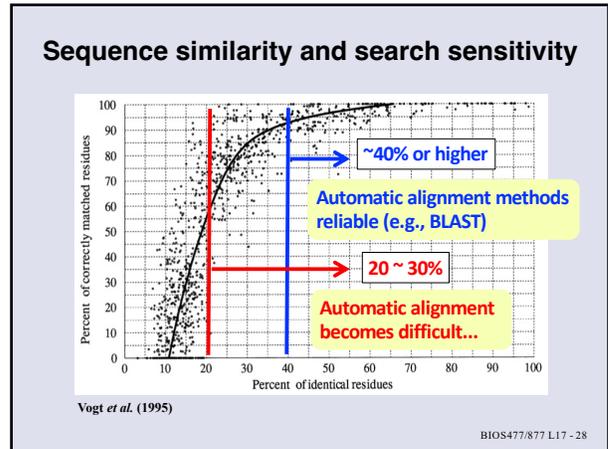
25



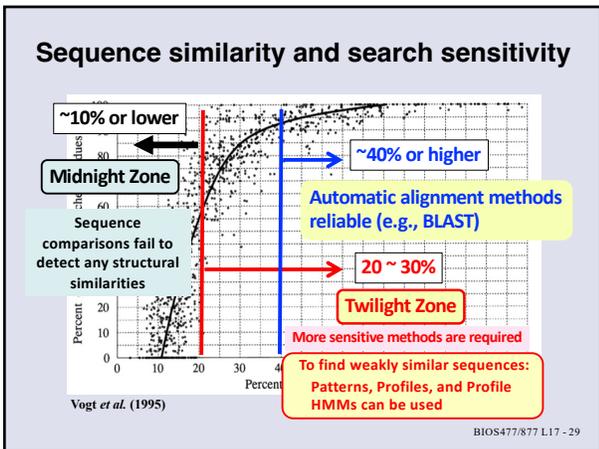
26



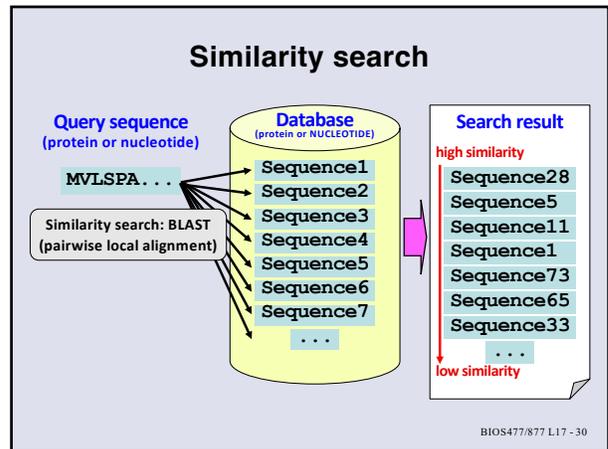
27



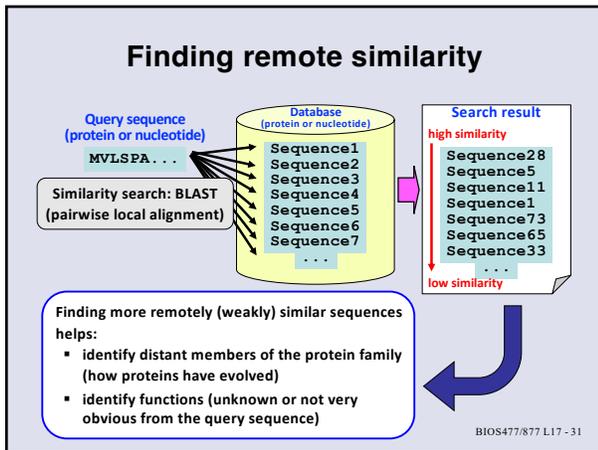
28



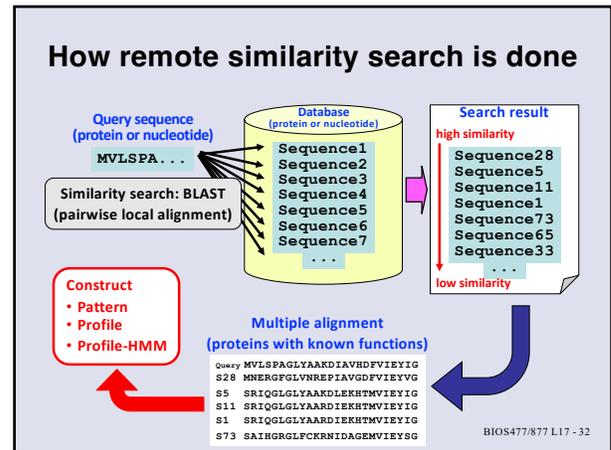
29



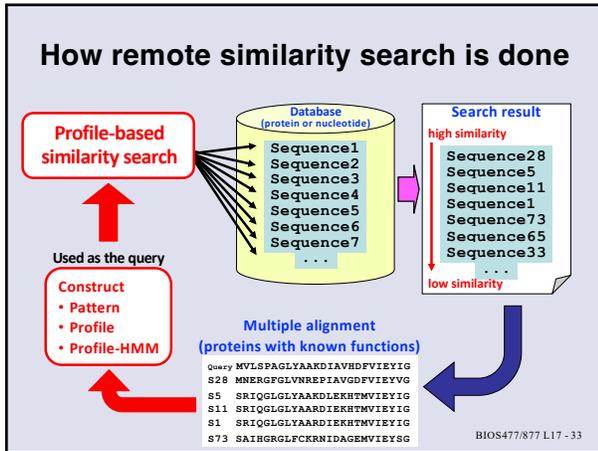
30



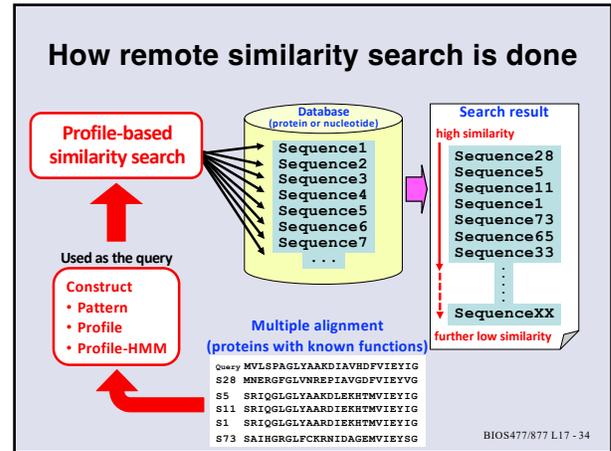
31



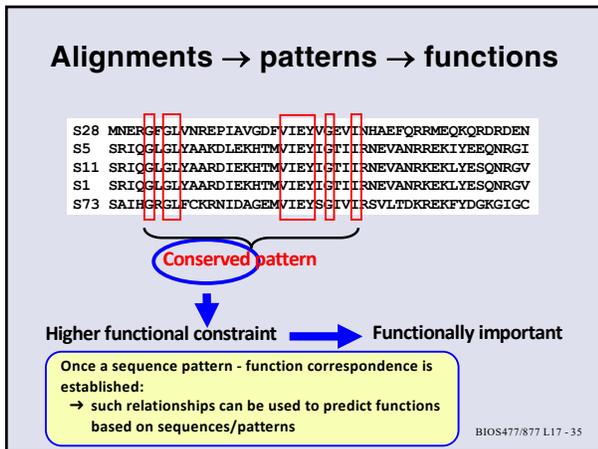
32



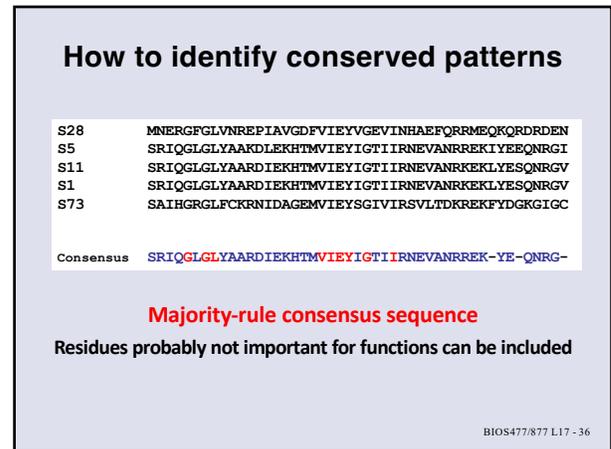
33



34



35



36

Conserved pattern

```

S28 MNERGFLVNRPIAVGDFVIEYVSEVINHAEFQRRMEQQRDRDEN
S5  SRIQGLGLYAARDLEKHTMVEIYIETIIIRNEVANRREKIYEEQNRGI
S11 SRIQGLGLYAARDIEKHTMVEIYIETIIIRNEVANRREKIYEEQNRGV
S1  SRIQGLGLYAARDIEKHTMVEIYIETIIIRNEVANRREKIYEEQNRGV
S73 SAIHGRGLFCKRNIDAGEMVIEYSSVIVRSVLTDKREKFDGKGIGC
  
```

Pattern **GxGLXXXXXXXXXXXXVIEYxGxxI** (x: any amino acid)

Conserved pattern including only identical sites
 → **Very (too) strict**

BIOS477/877 L17 - 37

37

Regular expression pattern

```

S28 MNERGFLVNRPIAVGDFVIEYVSEVINHAEFQRRMEQQRDRDEN
S5  SRIQGLGLYAARDLEKHTMVEIYIETIIIRNEVANRREKIYEEQNRGI
S11 SRIQGLGLYAARDIEKHTMVEIYIETIIIRNEVANRREKIYEEQNRGV
S1  SRIQGLGLYAARDIEKHTMVEIYIETIIIRNEVANRREKIYEEQNRGV
S73 SAIHGRGLFCKRNIDAGEMVIEYSSVIVRSVLTDKREKFDGKGIGC
  
```

G-[FLR]-G-L-X10-[FM]-V-I-E-Y-[VIS]-G-[ETI]-[VI]-I
 (10 any amino acids)

Regular expression
 → **More flexible than strict conserved pattern**

BIOS477/877 L17 - 38

38

PROSITE Pattern Database



Database of protein domains, families and functional sites

→ consists of biologically significant sites, patterns, and profiles

<https://prosite.expasy.org/>

- PROSITE pattern syntax is described in: <https://prosite.expasy.org/prosuser.html> - meth1

BIOS477/877 L17 - 39

39

PROSITE Pattern

PROSITE: PS00237 (G-protein coupled receptors family 1 signature)

[GSTALIVMFYWC]-[GSTANCPDE]-[EDPKRH]-x(2)-[LIVMNQGA]-x(2)-[LIVMFT]-[GSTANC]-[LIVMFYWSTAC]-[DENH]-R-[FYWCSH]-x(2)-[LIVM]

SH1A_FUGRU/131-147	SSIhh	caIALR	rwaI
SH1A_HUMAN/122-138	SSIhh	caIALR	rwaI
SH1A_MOUSE/122-138	SSIhh	caIALR	rwaI
SH1A_PANTR/122-138	SSIhh	caIALR	rwaI
SH1A_RAT/122-138	SSIhh	caIALR	rwaI
SH1B_CAVPO/134-150	ASImh	cvIALR	rwaI
SH1B_CRIGR/131-147	ASImh	cvIALR	rwaI
SH1B_DIDMA/134-150	ASImh	cvIALR	rwaI
SH1B_FUGRU/119-135	SSIhh	caIALR	rwaI
SH1B_HUMAN/135-151	ASImh	cvIALR	rwaI
SH1B_MOUSE/131-147	ASImh	cvIALR	rwaI
SH1B_RABIT/135-151	ASImh	cvIALR	rwaI
SH1B_RAT/131-147	ASImh	cvIALR	rwaI
SH1B_SPABH/131-147	ASImh	cvIALR	rwaI
SH1D_CANFA/124-140	ASImh	cvIALR	rwaI
SH1D_CAVPO/124-140	ASImh	cvIALR	rwaI
SH1D_FUGRU/122-138	ASImh	cvIALR	rwaI
SH1D_HUMAN/124-140	ASImh	cvIALR	rwaI
SH1D_MOUSE/121-137	ASImh	cvIALR	rwaI
SH1D_PIG/44-60	ASImh	cvIALR	rwaI
SH1D_RABIT/124-140	ASImh	cvIALR	rwaI
SH1D_RAT/121-137	ASImh	cvIALR	rwaI
SH1E_HUMAN/108-124	CSIhh	cvIALR	rwaI
SH1E_PANTR/108-124	CSIhh	cvIALR	rwaI
SH1E_PIG/55-71	CSIhh	cvIALR	rwaI

BIOS477/877 L17 - 40

40

PROSITE Pattern

PROSITE: PS00237 (G-protein coupled receptors family 1 signature)

[GSTALIVMFYWC]-[GSTANCPDE]-[EDPKRH]-x(2)-[LIVMNQGA]-x(2)-[LIVMFT]-[GSTANC]-[LIVMFYWSTAC]-[DENH]-R-[FYWCSH]-x(2)-[LIVM]

SH1A_FUGRU/131-147	SSIhh	caIALR	rwaI
SH1A_HUMAN/122-138	SSIhh	caIALR	rwaI
SH1A_MOUSE/122-138	SSIhh	caIALR	rwaI
SH1A_PANTR/122-138	SSIhh	caIALR	rwaI
SH1A_RAT/122-138	SSIhh	caIALR	rwaI
SH1B_CAVPO/134-150	ASImh	cvIALR	rwaI
SH1B_CRIGR/131-147	ASImh	cvIALR	rwaI
SH1B_DIDMA/134-150	ASImh	cvIALR	rwaI
SH1B_FUGRU/119-135	SSIhh	caIALR	rwaI
SH1B_HUMAN/135-151	ASImh	cvIALR	rwaI
SH1B_MOUSE/131-147	ASImh	cvIALR	rwaI
SH1B_RABIT/135-151	ASImh	cvIALR	rwaI
SH1B_RAT/131-147	ASImh	cvIALR	rwaI
SH1B_SPABH/131-147	ASImh	cvIALR	rwaI
SH1D_CANFA/124-140	ASImh	cvIALR	rwaI
SH1D_CAVPO/124-140	ASImh	cvIALR	rwaI
SH1D_FUGRU/122-138	ASImh	cvIALR	rwaI
SH1D_HUMAN/124-140	ASImh	cvIALR	rwaI
SH1D_MOUSE/121-137	ASImh	cvIALR	rwaI
SH1D_PIG/44-60	ASImh	cvIALR	rwaI
SH1D_RABIT/124-140	ASImh	cvIALR	rwaI
SH1D_RAT/121-137	ASImh	cvIALR	rwaI
SH1E_HUMAN/108-124	CSIhh	cvIALR	rwaI
SH1E_PANTR/108-124	CSIhh	cvIALR	rwaI
SH1E_PIG/55-71	CSIhh	cvIALR	rwaI

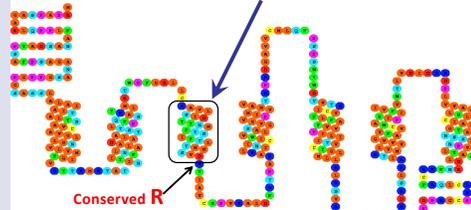
BIOS477/877 L17 - 41

41

PROSITE Pattern

PROSITE: PS00237 (G-protein coupled receptors family 1 signature)

[GSTALIVMFYWC]-[GSTANCPDE]-[EDPKRH]-x(2)-[LIVMNQGA]-x(2)-[LIVMFT]-[GSTANC]-[LIVMFYWSTAC]-[DENH]-R-[FYWCSH]-x(2)-[LIVM]



Conserved R

Only short regions can be represented in regular expression patterns

[OPRD_HUMAN]

BIOS477/877 L17 - 42

42

Gribskov profile

(Gribskov et al. 1987)

$$M(p,a) = \sum_{b=1}^{20} W(p,b) * Y(a,b) \text{ for amino acid } a \text{ at position } p$$

Multiple alignment

Seq1 RCQAH
Seq2 HCEGH
Seq3 RCEGN

BLOSUM62

A	R	N	D	C	Q	E	G	H	I	L
A	4	-2	-2	0	-1	0	-2	-1	-1	-1
R	-1	5	0	-2	-3	1	0	-2	0	-3
N	-2	0	6	1	-3	0	0	0	1	-3
D	-2	-2	1	6	-3	0	2	-1	-1	-3
C	0	-3	-3	9	-3	-4	-3	-3	-1	-1
Q	-1	1	0	0	-3	5	2	-2	0	-3
E	-1	0	0	2	-4	2	5	-2	0	-3
G	0	-2	0	-1	-3	-2	-2	6	-2	-4
H	-2	0	1	-1	-3	0	0	-2	8	-3
I	-1	-3	-3	-1	-3	-3	-4	-3	4	2
L	-1	-3	-3	-4	-1	-3	-3	-4	3	2

$M(1,A) = 0 * 4 + 0.67 * (-1) + 0 * (-2) + 0 * (-2) + \dots + 0.33 * (-2) + 0 * (-1) + \dots$ [sum up for all 20 amino acids]

1	-2.33	0.00	-2.33	1.33	...	8.33	...	11.67	...
2	3.00	0.00	15.00	-5.00	...	-1.00	...	-3.00	...
3	2.67	0.00	-6.00	8.67	...	4.67	...	1.33	...
4	9.00	0.00	2.33	5.00	...	-1.67	...	-3.00	...
5	0.00	0.00	-1.67	4.67	...	11.67	...	3.67	...

BIOS477/877 L17 - 49

49

Gribskov profile

(Gribskov et al. 1987)

$$M(p,a) = \sum_{b=1}^{20} W(p,b) * Y(a,b) \text{ for amino acid } a \text{ at position } p$$

Multiple alignment

Seq1 RCQAH
Seq2 HCEGH
Seq3 RCEGN

BLOSUM62

A	R	N	D	C	Q	E	G	H	I	L
A	4	-1	-2	0	-1	0	-2	-1	-1	-1
R	-1	5	0	-2	-3	1	0	-2	0	-3
N	-2	0	6	1	-3	0	0	0	1	-3
D	-2	-2	1	6	-3	0	2	-1	-1	-3
C	0	-3	-3	9	-3	-4	-3	-3	-1	-1
Q	-1	1	0	0	-3	5	2	-2	0	-3
E	-1	0	0	2	-4	2	5	-2	0	-3
G	0	-2	0	-1	-3	-2	-2	6	-2	-4
H	-2	0	1	-1	-3	0	0	-2	8	-3
I	-1	-3	-3	-1	-3	-3	-4	-3	4	2
L	-1	-3	-3	-4	-1	-3	-3	-4	3	2

But many amino acids have 0 counts! Should we just ignore them?

$M(1,A) = 0 * 4 + 0.67 * (-1) + 0 * (-2) + 0 * (-2) + \dots + 0.33 * (-2) + 0 * (-1) + \dots$ [sum up for all 20 amino acids]

1	-2.33	0.00	-2.33	1.33	...	8.33	...	11.67	...
2	3.00	0.00	15.00	-5.00	...	-1.00	...	-3.00	...
3	2.67	0.00	-6.00	8.67	...	4.67	...	1.33	...
4	9.00	0.00	2.33	5.00	...	-1.67	...	-3.00	...
5	0.00	0.00	-1.67	4.67	...	11.67	...	3.67	...

BIOS477/877 L17 - 50

50

Gribskov profile

(Gribskov et al. 1987)

$$M(p,a) = \sum_{b=1}^{20} W(p,b) * Y(a,b) \text{ for amino acid } a \text{ at position } p$$

Multiple alignment

Seq1 RCQAH
Seq2 HCEGH
Seq3 RCEGN

BLOSUM62

A	R	N	D	C	Q	E	G	H	I	L
A	4	-1	-2	0	-1	0	-2	-1	-1	-1
R	-1	5	0	-2	-3	1	0	-2	0	-3
N	-2	0	6	1	-3	0	0	0	1	-3
D	-2	-2	1	6	-3	0	2	-1	-1	-3
C	0	-3	-3	9	-3	-4	-3	-3	-1	-1
Q	-1	1	0	0	-3	5	2	-2	0	-3
E	-1	0	0	2	-4	2	5	-2	0	-3
G	0	-2	0	-1	-3	-2	-2	6	-2	-4
H	-2	0	1	-1	-3	0	0	-2	8	-3
I	-1	-3	-3	-1	-3	-3	-4	-3	4	2
L	-1	-3	-3	-4	-1	-3	-3	-4	3	2

Instead of 0, a very small weight (e.g., 0.025/#seq) can be used.

Why not 0?

$M(1,A) = 0.008 * 4 + 0.67 * (-1) + 0.008 * (-2) + 0.008 * (-2) + \dots + 0.33 * (-2) + 0.008 * (-1) + \dots$ [sum up for all 20 amino acids]

1	-2.33	0.00	-2.33	1.33	...	8.33	...	11.67	...
2	3.00	0.00	15.00	-5.00	...	-1.00	...	-3.00	...
3	2.67	0.00	-6.00	8.67	...	4.67	...	1.33	...
4	9.00	0.00	2.33	5.00	...	-1.67	...	-3.00	...
5	0.00	0.00	-1.67	4.67	...	11.67	...	3.67	...

BIOS477/877 L17 - 51

51