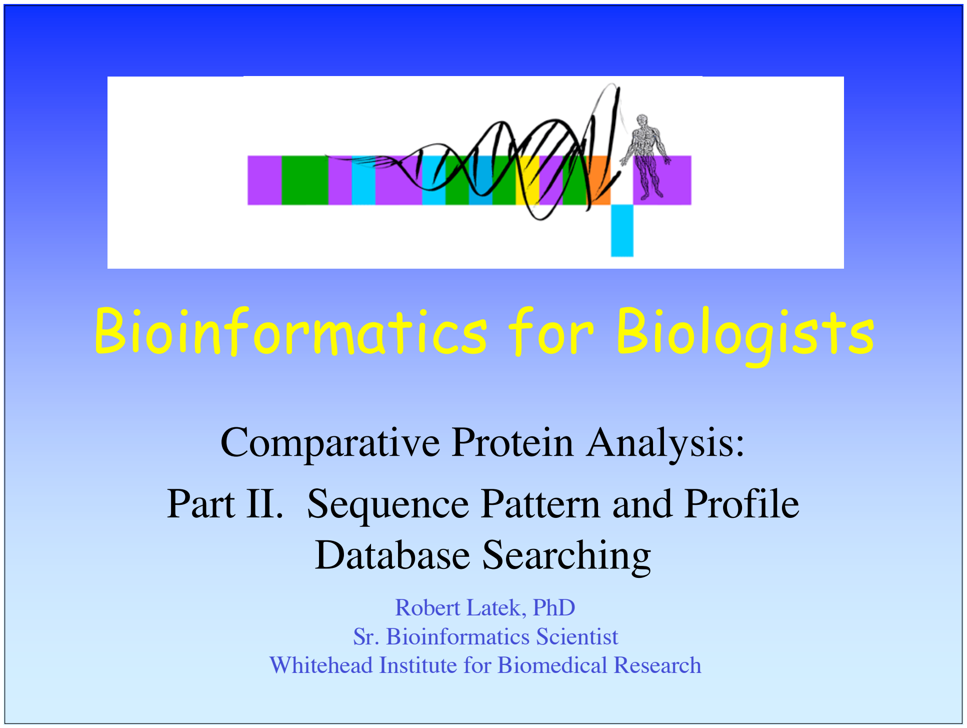

Bioinformatics for Biologists

Comparative Protein Analysis:

Part II. Sequence Pattern and Profile Database Searching

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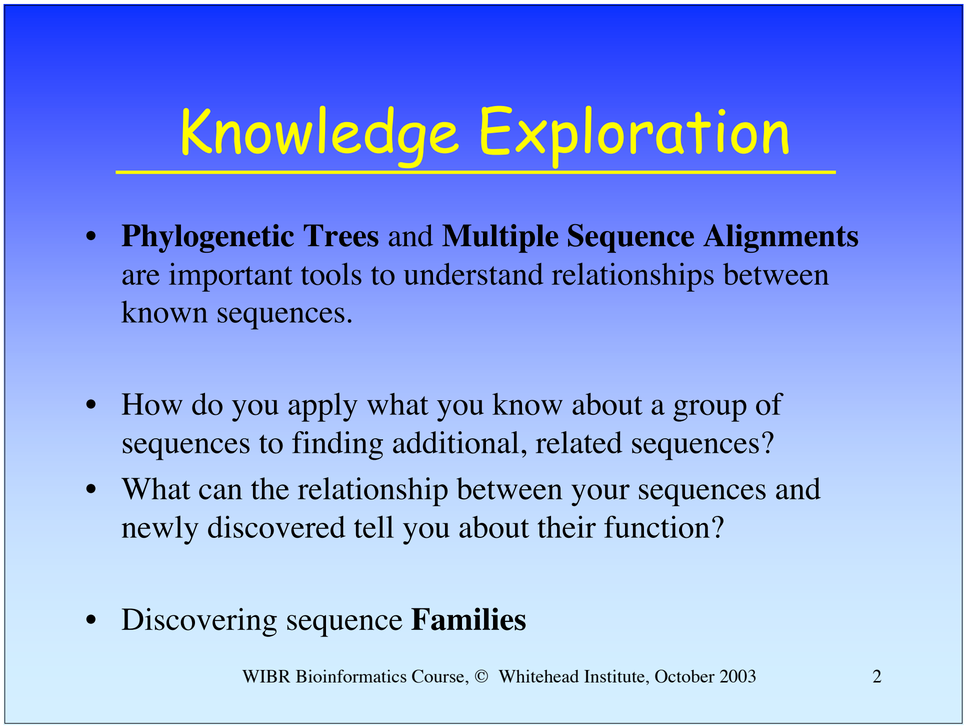
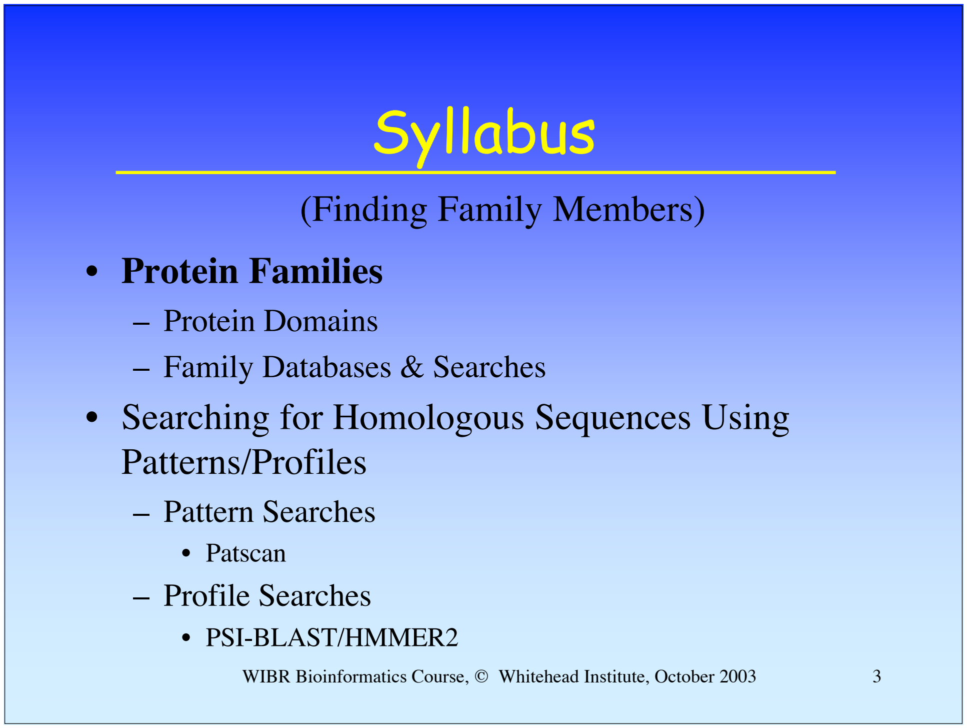


Knowledge Exploration

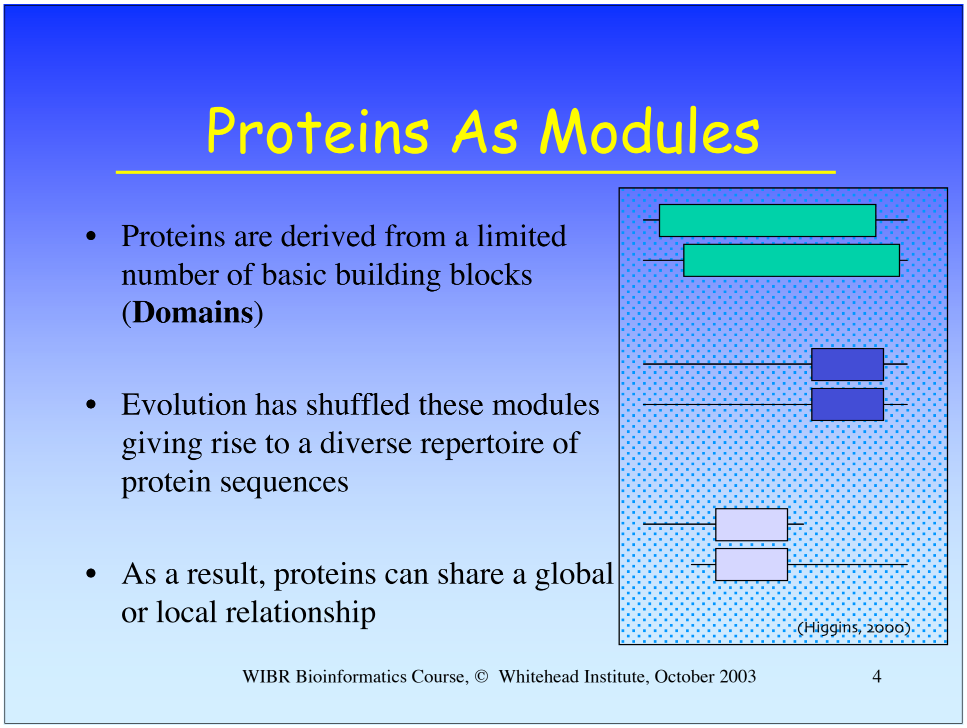
- **Phylogenetic Trees** and **Multiple Sequence Alignments** are important tools to understand relationships between known sequences.
- How do you apply what you know about a group of sequences to finding additional, related sequences?
- What can the relationship between your sequences and newly discovered tell you about their function?
- Discovering sequence **Families**



Syllabus

(Finding Family Members)

- **Protein Families**
  - Protein Domains
  - Family Databases & Searches
- Searching for Homologous Sequences Using Patterns/Profiles
  - Pattern Searches
    - Patscan
  - Profile Searches
    - PSI-BLAST/HMMER2



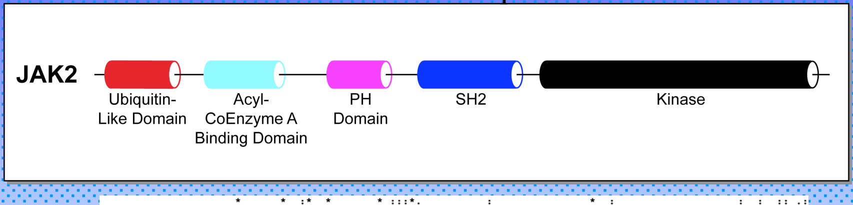
Proteins As Modules

- Proteins are derived from a limited number of basic building blocks (**Domains**)
- Evolution has shuffled these modules giving rise to a diverse repertoire of protein sequences
- As a result, proteins can share a global or local relationship

(Higgins, 2000)

Protein Domains

Janus Kinase 2 Modular Sequence Architecture



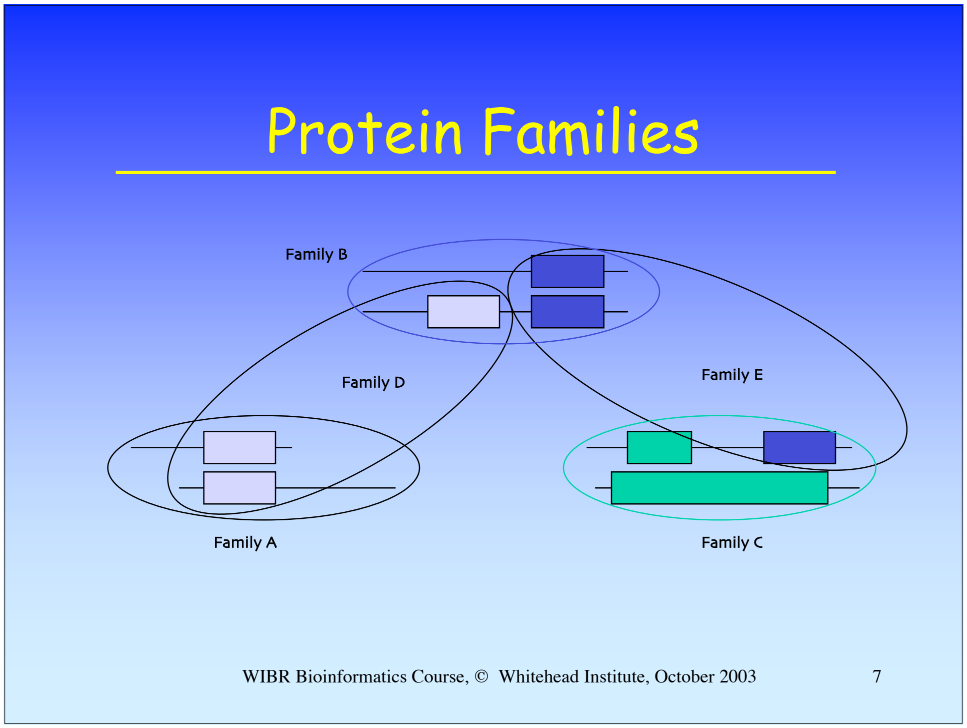
SH2 Motif

```
                   *      *  :*  *       * :::*.          :               *  :                   :  :  :: .:
 BLK_MOUSE_117-198 WFFRTISRKDAERQLLAPMNKAGSFLIRESESNKGAFSLSVKDIT-TQGEV--VKHYKIRSLDNG--GYYISPRIT--FPTLQALVQHY
 LCK_MOUSE_126-208 WFFKNLSRKDAERQLLAPGNTHGSFLIRESESTAGSFSLSVRDFDQNQGEV--VKHYKIRNLDNG--GFYISPRIT--FPGLHDLVRHY
 LYN_MOUSE_128-210 WFFKDITRKDAERQLLAPGNSAGAFLIRESETLKGSFSLSVRDYDPMHGDV--IKHYKIRSLDNG--GYYISPRIT--FPCISDMIKHY
 FGR_HUMAN_144-226 WYFGKIGRKDAERQLLSPGNPQGAFLIRESETTKGAYSLSIRDWDQTRGDH--VKHYKIRKLDMG--GYYITTRVQ--FNSVQELVQHY
  SRC_RSVP_148-230 WYFGKITRRESERLLLNPENPRGTFLVRKSETAKGAYCLSVSDFDNAKGPN--VKHYKIYKLYSG--GFYITSRTQ--FGSLQQLVAYY
NCK1_HUMAN_282-356 WYYGKVTRHQAEMALNERG-HEGDFLIRDSESSPNDFSVSL----KAQGK---NKHFKVQLKET----VYCIGQRK--FSTMEELVEHY
 VAV_MOUSE_671-745 WYAGPMERAGAEGILTNR--SDGTYLVRQRVKDTAEFAISI----KYNVE---VKHIKIMTSEG----LYRITEKKA-FRGLLELVEFY
ABL2_HUMAN_173-248 WYHGPVSRSAAEYLLSSL--INGSFLVRESESSPGQLSISL----RYEGR---VYHYRINTTADG--KVYVTAESR--FSTLAELVHHH
P85A_HUMAN_624-698 WNVGSSNRNKAENLLRGK--RDGTFLVRES-SKQGCYACSV----VVDGE---VKHCVINKTATG----YGFAEPYNLYSSLKELVLHY
 SHC_HUMAN_488-559 WFHGKLSRREAEALLQLN----GDFLVRESTTTPGQYVLTG----LQSGQ---PKHLLLVDPEG----VVRTKDHR--FESVSHLISYH
 ITK_HUMAN_239-323 WYNKSISRDKAEKLLLDTG-KEGAFMVRDS-RTAGTYTVSVFTKAVVSENNPCIKHYHIKETNDNPKRYYVAEKYV--FDSIPLLINYH
 BTK_HUMAN_281-362 WYSKHMTRSQAEQLLKQEG-KEGGFIVRDS-SKAGKYTVSVFAKSTGDPQG-VIRHYVVCSTPQS--QYYLAEKHL--FSTIPELINYH
```

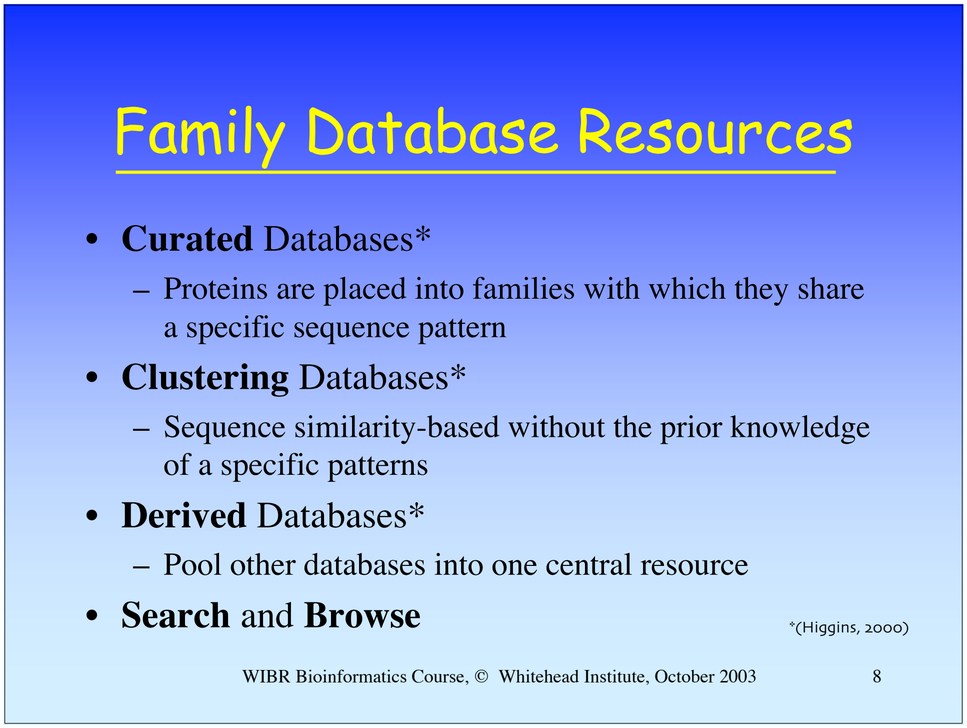
Motifs describe the domain

Protein Families

- **Protein Family** - a group of proteins that share a common function and/or structure, that are potentially derived from a common ancestor (set of homologous proteins)
- **Characterizing a Family** - Compare the sequence and structure patterns of the family members to reveal shared characteristics that potentially describe common biological properties
- **Motif/Domain** - sequence and/or structure patterns common to protein family members



Protein Families



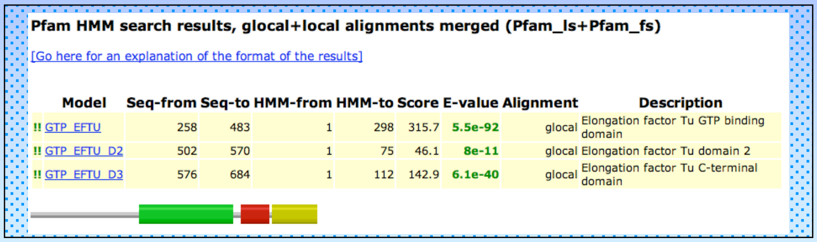
Family Database Resources

- **Curated** Databases*
  - Proteins are placed into families with which they share a specific sequence pattern
- **Clustering** Databases*
  - Sequence similarity-based without the prior knowledge of a specific patterns
- **Derived** Databases*
  - Pool other databases into one central resource
- **Search** and **Browse**

*(Higgins, 2000)

Curated Family Databases

- **Pfam** (http://pfam.wustl.edu/hmmsearch.shtml/) **
  - Uses manually constructed seed alignments and PSSM to automatically extract domains
  - db of protein families and corresponding profile-HMMs
  - Searches report e-value and bits score
- **Prosite** (http://www.expasy.ch/tools/scanprosite/)
  - Hit or Miss -> no stats
- **PRINTS** (http://www.bioinf.man.ac.uk/fingerPRINTScan/)



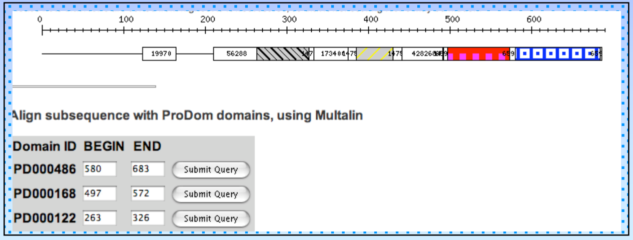
Pfam HMM search results, glocal+local alignments merged (Pfam_ls+Pfam_fs)

[Go here for an explanation of the format of the results]

Model	Seq-from	Seq-to	HMM-from	HMM-to	Score	E-value	Alignment	Description
!! GTP_EFTU	258	483	1	298	315.7	5.5e-92	glocal	Elongation factor Tu GTP binding domain
!! GTP_EFTU_D2	502	570	1	75	46.1	8e-11	glocal	Elongation factor Tu domain 2
!! GTP_EFTU_D3	576	684	1	112	142.9	6.1e-40	glocal	Elongation factor Tu C-terminal domain

Clustering Family Databases

- Search a database against itself and cluster similar sequences into families
- **ProDom** (http://prodes.toulouse.inra.fr/prodom/doc/prodom.html)
  - Searchable against MSAs and consensus sequences
- **Protomap** (http://protomap.cornell.edu/)
  - Swiss-Prot based and provides a tree-like view of clustering

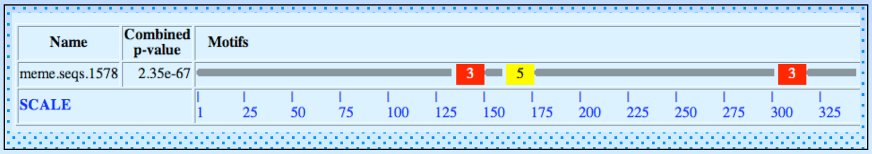


Align subsequence with ProDom domains, using Multalin

Domain ID	BEGIN	END	
PD000486	580	683	Submit Query
PD000168	497	572	Submit Query
PD000122	263	326	Submit Query

Derived Family Databases

- Databases that utilize protein family groupings provided by other resources
- **Blocks** - Search and Make (http://blocks.fhcrc.org/blocks/)
  - Uses Protomap system for finding blocks that are indicative of a protein family (GIBBS/MOTIF)
- **Proclass** (http://pir.georgetown.edu/gfserver/proclass.html)
  - Combines families from several resources using a neural network-based system (relationships)
- **MEME** (http://meme.sdsc.edu/meme/website/intro.html)



Name	Combined p-value	Motifs
meme.seqs.1578	2.35e-67	3 5 3
SCALE		1 25 50 75 100 125 150 175 200 225 250 275 300 325

Searching Family Databases

- BLAST searches provide a great deal of information, but it is difficult to select out the important sequences (listed by score, not family)
- Family searches can give an immediate indication of a protein's classification/function
- Use Family Database search tools to identify domains and family members

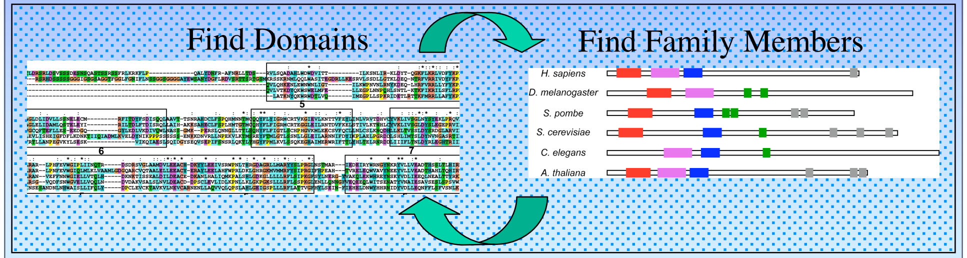
Syllabus

(Finding Family Members)

- Protein Families
  - Protein Domains
  - Family Databases & Searches
- **Searching for Homologous Sequences** (Finding Family Members)
  - Pattern Searches
    - Patscan
  - Profile Searches
    - PSI-BLAST/HMMER2

Creating Protein Families

- Use domains to identify family members
  - Use a sequence to search a database and characterize a pattern/profile
  - Use a specific pattern/profile to identify homologous sequences (family members)



Find Domains

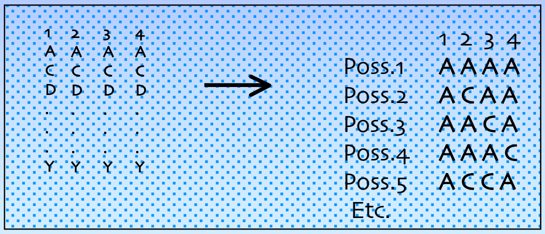
Find Family Members

Patterns & Profiles

- Techniques for searching sequence databases to uncover common domains/motifs of biological significance that categorize a protein into a family
- **Pattern** - a deterministic syntax that describes multiple combinations of possible residues within a protein string
- **Profile** - probabilistic generalizations that assign to every segment position, a probability that each of the 20 aa will occur

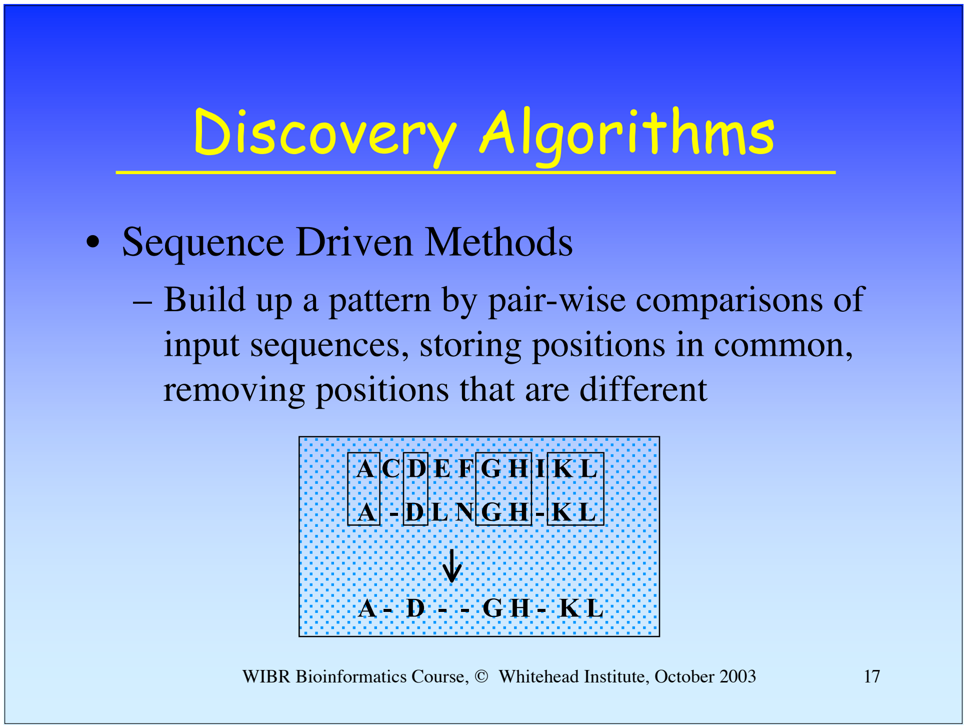
Discovery Algorithms

- Pattern Driven Methods
  - Enumerate all possible patterns in solution space and try matching them to a set of sequences



1	2	3	4
A	A	A	A
C	C	C	C
D	D	D	D
.	.	.	.
.	.	.	.
.	.	.	.
Y	Y	Y	Y

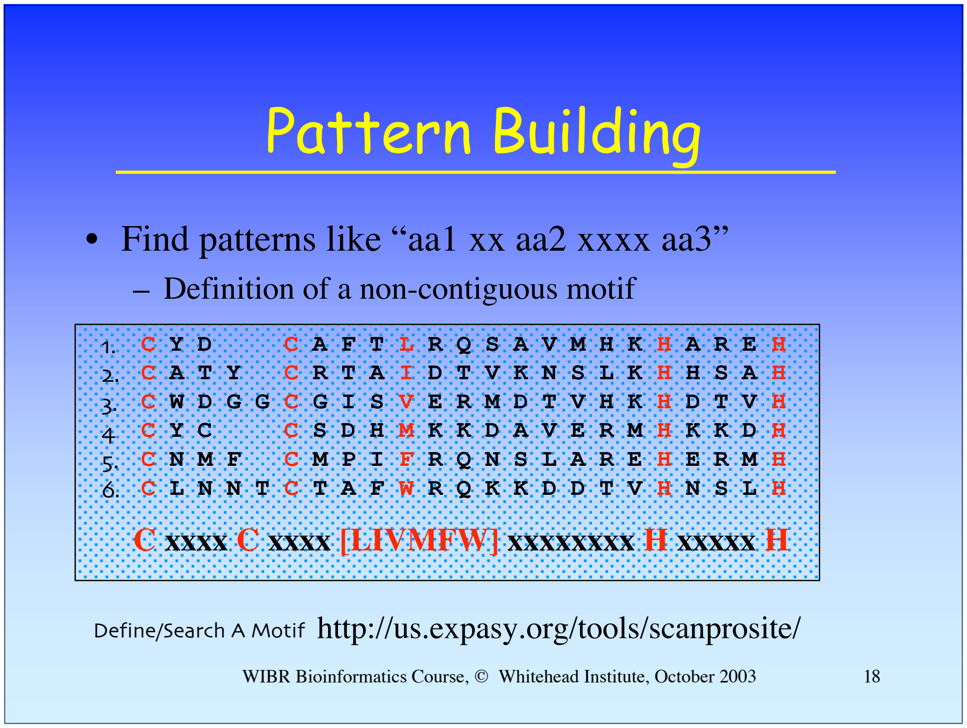
	1	2	3	4
Poss.1	A	A	A	A
Poss.2	A	C	A	A
Poss.3	A	A	C	A
Poss.4	A	A	A	C
Poss.5	A	C	C	A
Etc.				



Discovery Algorithms

- Sequence Driven Methods
  - Build up a pattern by pair-wise comparisons of input sequences, storing positions in common, removing positions that are different

```
A C D E F G H I K L
A - D L N G H - K L
        ↓
A - D - - G H - K L
```



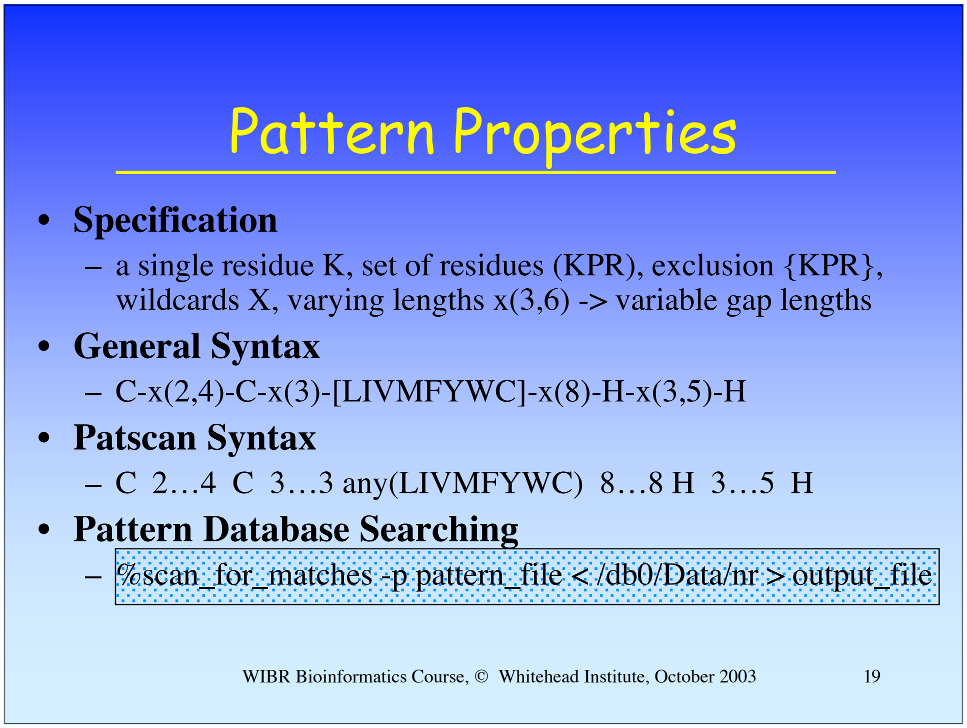
Pattern Building

- Find patterns like “aa1 xx aa2 xxxx aa3”
  - Definition of a non-contiguous motif

```
1. C Y D     C A F T L R Q S A V M H K H A R E H
2. C A T Y   C R T A I D T V K N S L K H H S A H
3. C W D G G C G I S V E R M D T V H K H D T V H
4  C Y C     C S D H M K K D A V E R M H K K D H
5. C N M F   C M P I F R Q N S L A R E H E R M H
6. C L N N T C T A F W R Q K K D D T V H N S L H
```

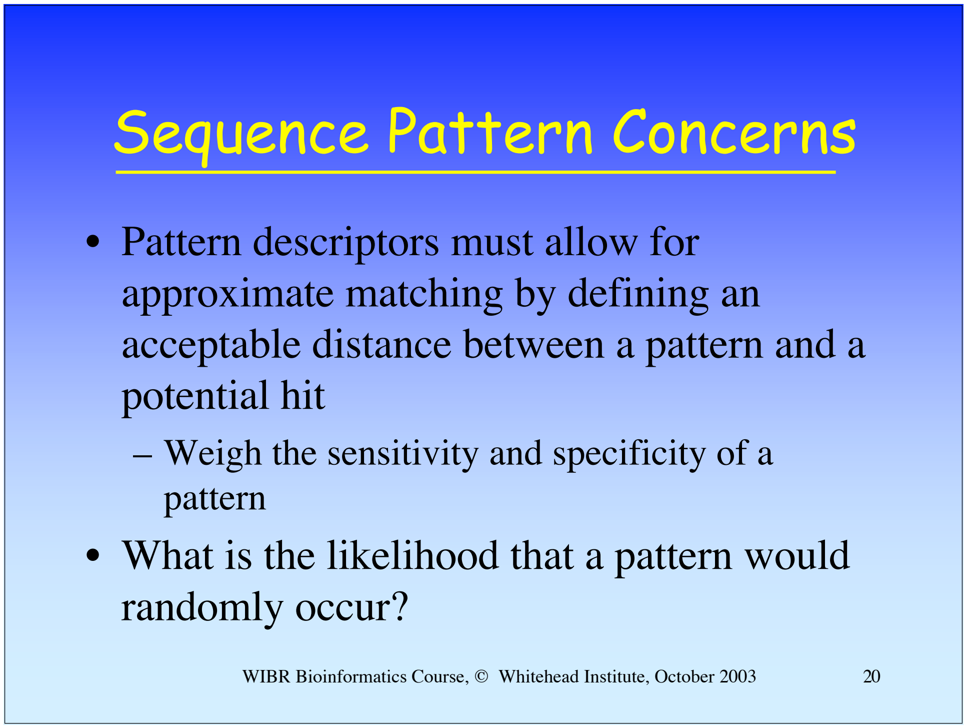
C xxxx C xxxx [LIVMFW] xxxxxxxx H xxxxx H

Define/Search A Motif http://us.expasy.org/tools/scanprosite/



Pattern Properties

- **Specification**
  - a single residue K, set of residues (KPR), exclusion {KPR}, wildcards X, varying lengths x(3,6) -> variable gap lengths
- **General Syntax**
  - C-x(2,4)-C-x(3)-[LIVMFYWC]-x(8)-H-x(3,5)-H
- **Patscan Syntax**
  - C 2…4 C 3…3 any(LIVMFYWC) 8…8 H 3…5 H
- **Pattern Database Searching**
  -
```
%scan_for_matches -p pattern_file < /db0/Data/nr > output_file
```



Sequence Pattern Concerns

- Pattern descriptors must allow for approximate matching by defining an acceptable distance between a pattern and a potential hit
  - Weigh the sensitivity and specificity of a pattern
- What is the likelihood that a pattern would randomly occur?

Sequence Profiles

- **Consensus** - mathematical probability that an aa will be located at a given position
- **Probabilistic** pattern constructed from a MSA
- Opportunity to assign penalties for insertions and deletions, but not well suited for variable gap lengths
- **PSSM** - (Position Specific Scoring Matrix)
  - Represents the sequence profile in tabular form
  - Columns of weights for every aa corresponding to each column of a MSA

```
1. I T I S
2. T D L S
3. V T M G
4. I T I G
5. V G F S
6. I E L T
7. T T T S
8. I T L S
```

PSSM Example

(i.e. Distribution of aa in an MSA column)

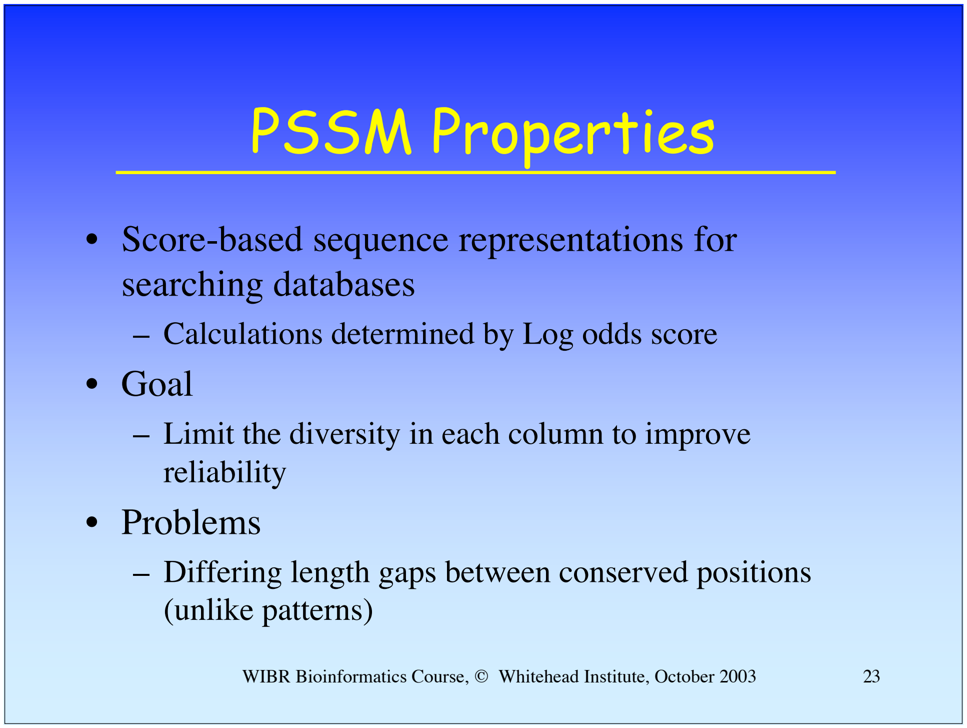
← Target sequences

Resulting Consensus: I T L S

PSSM

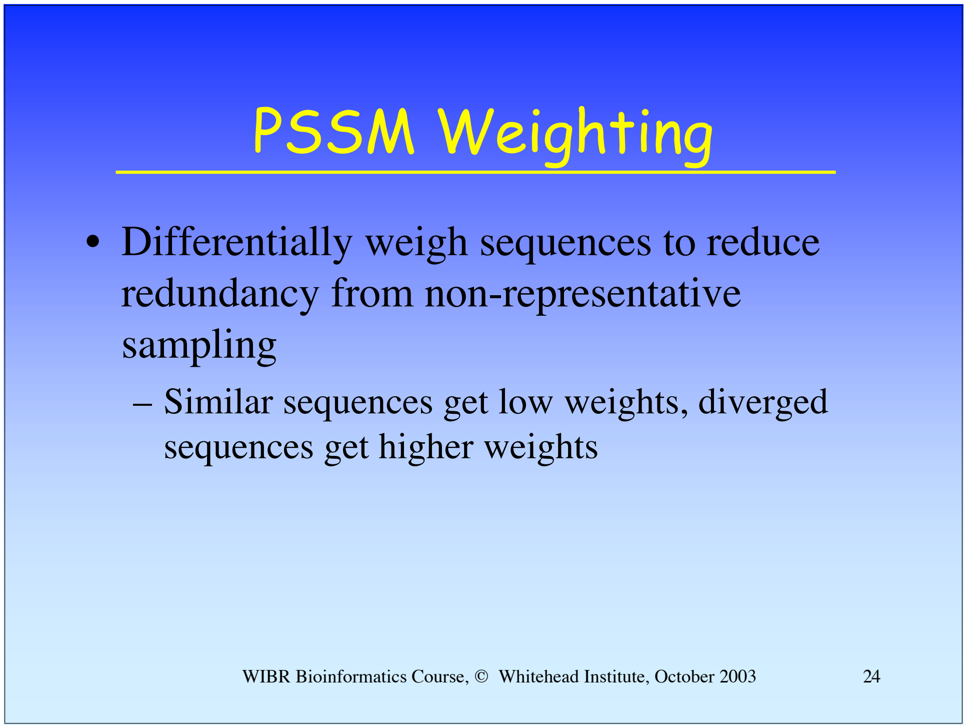
↓

P O S	A	C	D	E	F	G	H	I	K	L	M	N	P	Q	R	S	T	V	W	Y
1	8	-2	5	4	5	5	-4	24	0	15	13	1	1	1	-7	2	22	21	-18	-6
2	13	-5	24	18	-18	19	7	1	7	-7	-4	14	11	10	-1	9	29	3	-28	-14
3	5	-5	3	4	13	4	2	8	-4	14	12	8	-5	0	-10	0	10	10	-1	5
4	17	17	13	10	-12	29	-5	-5	6	-14	-9	12	10	0	-2	34	19	1	-8	-15



PSSM Properties

- Score-based sequence representations for searching databases
  - Calculations determined by Log odds score
- Goal
  - Limit the diversity in each column to improve reliability
- Problems
  - Differing length gaps between conserved positions (unlike patterns)



PSSM Weighting

- Differentially weigh sequences to reduce redundancy from non-representative sampling
  - Similar sequences get low weights, diverged sequences get higher weights

PSI-BLAST Implementation

- **PSI-BLAST**

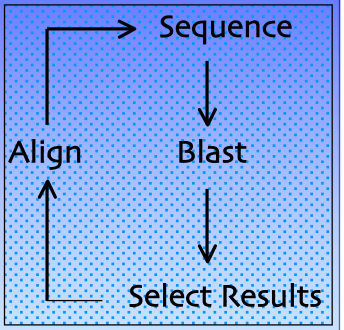
  http://www.ncbi.nlm.nih.gov/BLAST/

  – Start with a sequence, BLAST it, align select results to query sequence, estimate a profile with the MSA, search DB with the profile - constructs PSSM

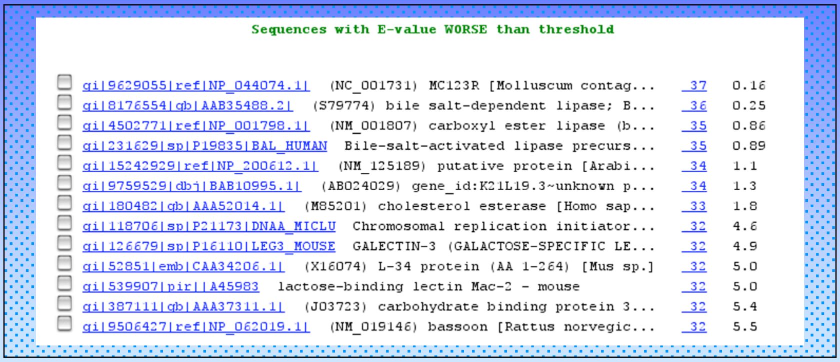
  – Iterate until process stabilizes

  – Focus on domains, not entire sequences

  – Greatly improves sensitivity

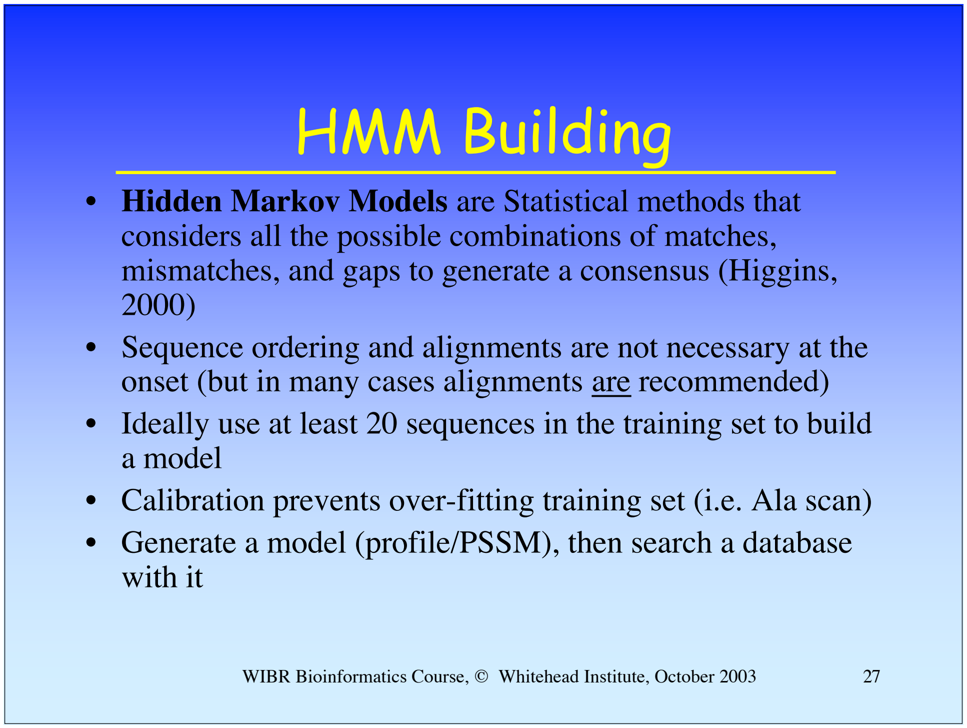


PSI-BLAST Sample Output



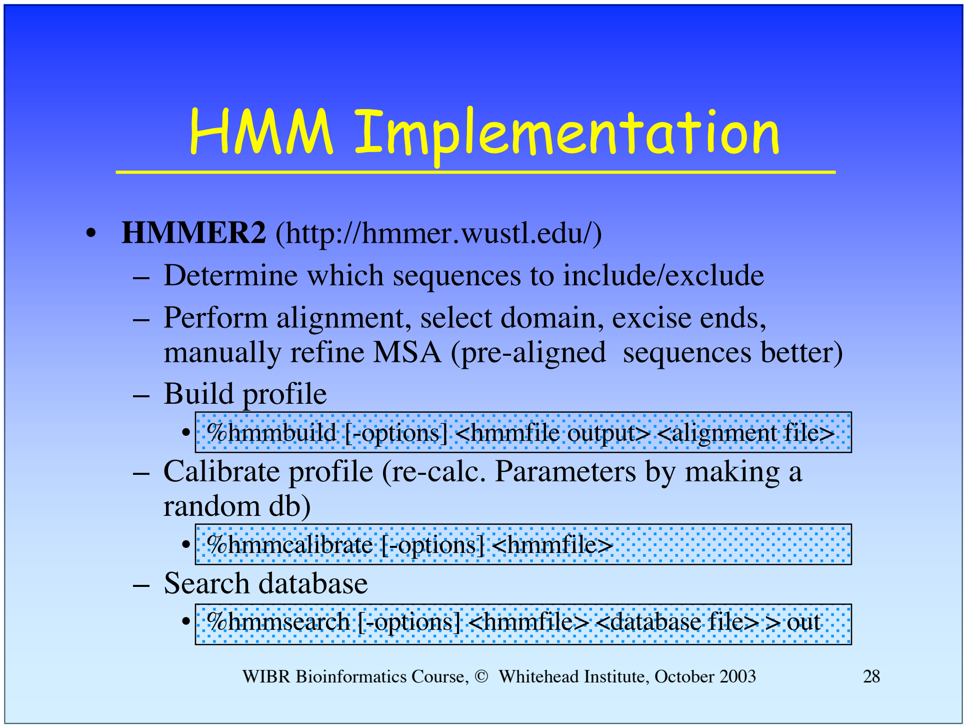
```
                 Sequences with E-value WORSE than threshold

□ gi|9629055|ref|NP_044074.1|  (NC_001731) MC123R [Molluscum contag...   37   0.16
□ gi|8176554|gb|AAB35488.2|  (S79774) bile salt-dependent lipase; B...   36   0.25
□ gi|4502771|ref|NP_001798.1|  (NM_001807) carboxyl ester lipase (b...   35   0.86
□ gi|231629|sp|P19835|BAL_HUMAN  Bile-salt-activated lipase precurs...   35   0.89
□ gi|15242929|ref|NP_200612.1|  (NM_125189) putative protein [Arabi...   34   1.1
□ gi|9759529|dbj|BAB10995.1|  (AB024029) gene_id:K21L19.3~unknown p...   34   1.3
□ gi|180482|gb|AAA52014.1|  (M85201) cholesterol esterase [Homo sap...   33   1.8
□ gi|118706|sp|P21173|DNAA_MICLU  Chromosomal replication initiator...   32   4.6
□ gi|126679|sp|P16110|LEG3_MOUSE  GALECTIN-3 (GALACTOSE-SPECIFIC LE...   32   4.9
□ gi|52851|emb|CAA34206.1|  (X16074) L-34 protein (AA 1-264) [Mus sp.]   32   5.0
□ gi|539907|pir||A45983  lactose-binding lectin Mac-2 - mouse            32   5.0
□ gi|387111|gb|AAA37311.1|  (J03723) carbohydrate binding protein 3...   32   5.4
□ gi|9506427|ref|NP_062019.1|  (NM_019146) bassoon [Rattus norvegic...   32   5.5
```



HMM Building

- **Hidden Markov Models** are Statistical methods that considers all the possible combinations of matches, mismatches, and gaps to generate a consensus (Higgins, 2000)
- Sequence ordering and alignments are not necessary at the onset (but in many cases alignments are recommended)
- Ideally use at least 20 sequences in the training set to build a model
- Calibration prevents over-fitting training set (i.e. Ala scan)
- Generate a model (profile/PSSM), then search a database with it

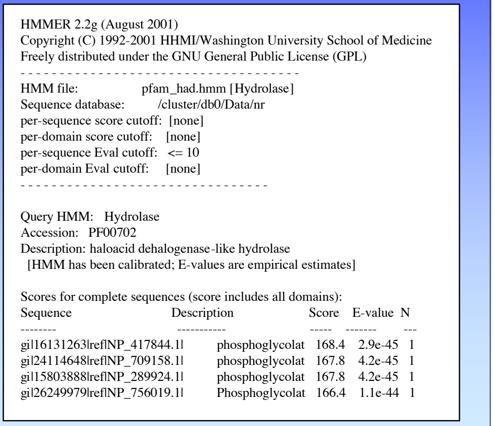


HMM Implementation

- **HMMER2** (http://hmmer.wustl.edu/)
  - Determine which sequences to include/exclude
  - Perform alignment, select domain, excise ends, manually refine MSA (pre-aligned sequences better)
  - Build profile
    -
      ```
      %hmmbuild [-options] <hmmfile output> <alignment file>
      ```
  - Calibrate profile (re-calc. Parameters by making a random db)
    -
      ```
      %hmmcalibrate [-options] <hmmfile>
      ```
  - Search database
    -
      ```
      %hmmsearch [-options] <hmmfile> <database file> > out
      ```

HMMER2 Output

- Hmmsearch returns e-values and bits scores
- Repeat process with selected results
  - Unfortunately need to extract sequences from the results and manually perform MSA before beginning next round of iteration



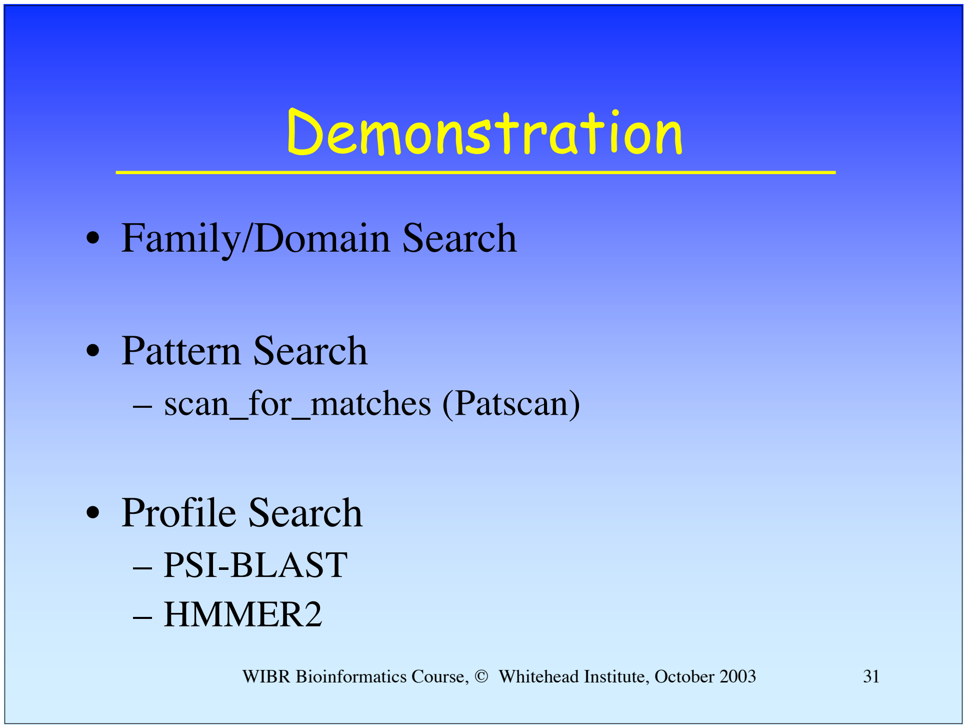
```
HMMER 2.2g (August 2001)
Copyright (C) 1992-2001 HHMI/Washington University School of Medicine
Freely distributed under the GNU General Public License (GPL)
- - - - - - - - - - - - - - - - - - - - - - - - - - - - - - - - - - - -
HMM file:                pfam_had.hmm [Hydrolase]
Sequence database:          /cluster/db0/Data/nr
per-sequence score cutoff:  [none]
per-domain score cutoff:    [none]
per-sequence Eval cutoff:   <= 10
per-domain Eval cutoff:     [none]
- - - - - - - - - - - - - - - - - - - - - - - - - - - - - - - -

Query HMM:   Hydrolase
Accession:   PF00702
Description: haloacid dehalogenase-like hydrolase
  [HMM has been calibrated; E-values are empirical estimates]

Scores for complete sequences (score includes all domains):
Sequence                          Description                Score   E-value  N
--------                           ----------                -----   -------  ---
gi|16131263|ref|NP_417844.1|       phosphoglycolat  168.4   2.9e-45   1
gi|24114648|ref|NP_709158.1|       phosphoglycolat  167.8   4.2e-45   1
gi|15803888|ref|NP_289924.1|       phosphoglycolat  167.8   4.2e-45   1
gi|26249979|ref|NP_756019.1|       Phosphoglycolat  166.4   1.1e-44   1
```

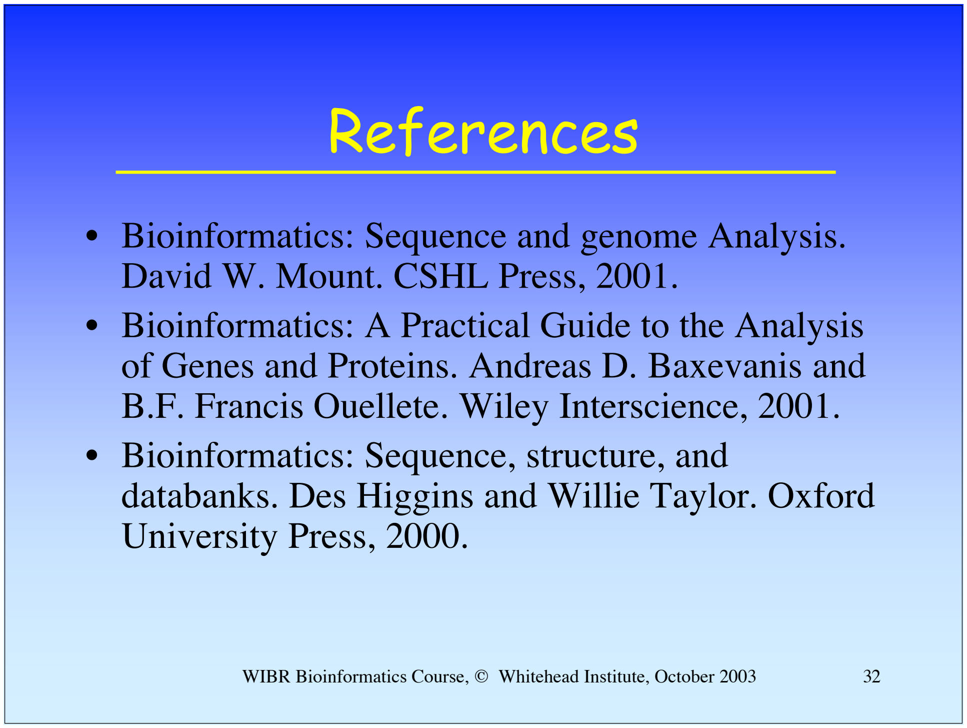
Patterns vs. Profiles

- **Patterns**
  - Easy to understand (human-readable)
  - Account for different length gaps
- **Profiles**
  - Sensitivity, better signal to noise ratio
  - Teachable



Demonstration

- Family/Domain Search
- Pattern Search
  - scan_for_matches (Patscan)
- Profile Search
  - PSI-BLAST
  - HMMER2



References

- Bioinformatics: Sequence and genome Analysis. David W. Mount. CSHL Press, 2001.
- Bioinformatics: A Practical Guide to the Analysis of Genes and Proteins. Andreas D. Baxevanis and B.F. Francis Ouellete. Wiley Interscience, 2001.
- Bioinformatics: Sequence, structure, and databanks. Des Higgins and Willie Taylor. Oxford University Press, 2000.