

Sequence Alignment Practical

Presented by

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Talk Structure

- Introduction to sequence alignments
- Methods / Logistics
 - Global Alignment: Needleman-Wunsch
 - Local Alignment: Smith-Waterman
- Illustrations of two types of alignments
 - step by step local alignment
- Computational implementation of alignment
 - Retrieval of sequences using R
 - Alignment of sequences using R
- Homework – HW2

Sequence Alignments

Comparing two objects is intuitive. Likewise sequence pairwise alignments provide info on:

- evolutionary distance between species (e.g. homology)
- new functional motifs / regions
- genetic manipulation (e.g. alternative splicing)
- new functional roles of unknown sequence
- identification of binding sites of primers / TFs
- *de novo* genome assembly
 - alignment of the short “reads” from high-throughput sequencer (e.g. Illumina or Roche platforms)

Comparing two sequences

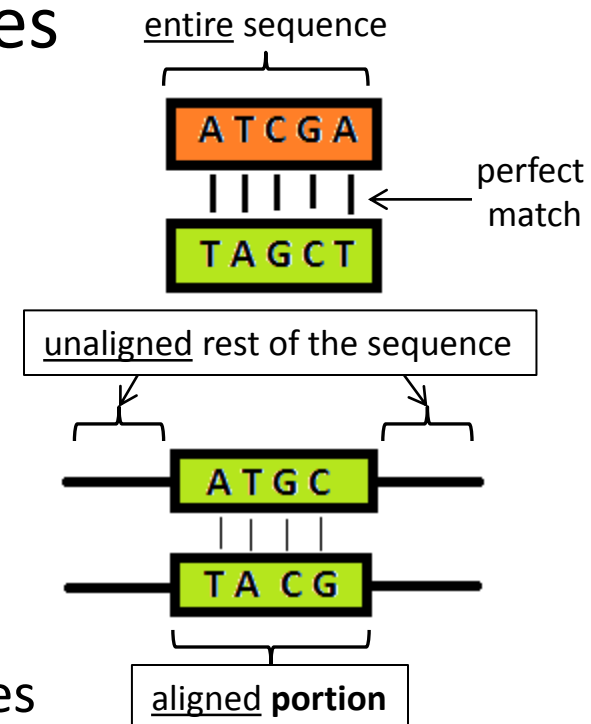
- There are two ways of pairwise comparison
 - Global using **Needleman-Wunsch algorithm (NW)**
 - Local using **Smith-Waterman algorithm (SW)**
- Both approaches use similar methodology, but have completely different objectives

- Global alignment (NW)

- tries to align the “whole” sequence
- more restrictive than local alignment

- Local alignment (SW)

- tries to align portions (e.g. motifs) of given sequences
- more flexible as considers “parts” of the sequence
- works well on highly divergent sequences



Global alignment (NW)

- Sequences are aligned end-to-end along their entire length
- Many possible alignments are produced
 - The alignment with the highest score is chosen
- Naïve algorithm is very inefficient (O^{exp})
 - To align sequence of length 15, need to consider
 - Possibilities # = (insertion, deletion, gap)¹⁵ = $3^{15} = 1,4 * 10^7$
 - Impractical for sequences of length >20 nt
- Used to analyze homology/similarity of entire:
 - genes and proteins
 - assess gene/protein overall homology between species

Methodology of global alignment (1 of 4)

- Define scoring scheme for each event
 - mismatch between a_i and b_j
 - $s(a_i, b_j) = -1$ if $a_i \neq b_j$
 - gap (insertion or deletion)
 - $s(a_i, -) = s(-, b_j) = -2$
 - match between a_i and b_j
 - $s(a_i, b_j) = +2$ if $a_i = b_j$
- Provide no restrictions on minimal score
- Start completing the alignment $M \times N$ matrix

Methodology of global alignment (2 of 4)

- The matrix should have extra column and row
 - $M+1$ columns , where M is the length sequence M
 - $N+1$ rows, where N is the length of sequence N
- Initialize the matrix by introducing **gap penalty** at every **initial** position along rows and columns
- Scores at each cell are **cumulative**

		W	H	A	T
	0	-2 → -2	-2 → -4	-2 → -6	-2 → -8
W	-2 ↓				
H	-4 ↓				
Y	-6 ↓				

Methodology of global alignment (3 of 4)

- For each cell consider all three possibilities

1) Gap (horiz/vert)

		W	H
	0	-2	-4
W	-2	-4	

2) Match (W-W diag.)

		W	H
	0	-2	-4
W	-2	+2	

3) Mismatch (W-H diag)

		W	H
	0	-2	-4
W	-2	+2	-3

- Select the maximum score for each cell and fill the matrix

		W	H	A	T
	0	-2	-4	-6	-8
W	-2	2	0	-2	-4
H	-4	0	4	2	0
Y	-6	-2	2	3	1

Methodology of global alignment (4 of 4)

- Select the most **very bottom right** cell
- Consider different path(s) going to **very top left cell**
 - Path is constructed by finding **the source cell** w.r.t. the current cell
 - How the current cell value was generated? From where?

		W	H	A	T
	0	-2	-4	-6	-8
W	-2	2	0	-2	-4
H	-4	0	4	2	0
Y	-6	-2	2	3	1

WHAT
WHY-

Overall score = 1

		W	H	A	T
	0	-2	-4	-6	-8
W	-2	2	0	-2	-4
H	-4	0	4	2	0
Y	-6	-2	2	3	1

WHAT
WH-Y

Overall score = 1

- Select the best alignment(s)

Local alignment (SW)

- Sequences are aligned to find regions where **the best** alignment occurs (i.e. highest score)
- Assumes a **local** context (aligning parts of seq.)
- Ideal for finding short motifs, DNA binding sites
 - **helix-loop-helix (bHLH)** - motif
 - TATAAT box (a famous promoter region) – DNA binding site
- Works well on highly divergent sequences
 - Sequences with highly variable introns but highly conserved and sparse exons

Methodology of local alignment (1 of 4)

- The scoring system is similar with one exception
 - The **minimum** possible score in the matrix is **zero**
 - **There are no negative scores in the matrix**
- Let's define the same scoring system as in global
 - 1) mismatch between a_i and b_j 2) gap (insertion or deletion)
 $s(a_i, b_j) = -1$ if $a_i \neq b_j$ $s(a_i, -) = s(-, b_j) = -2$
 - 3) match between a_i and b_j
 $s(a_i, b_j) = +2$ if $a_i = b_j$

Methodology of local alignment (2 of 4)

- Construct the $M \times N$ alignment matrix with $M+1$ columns and $N+1$ rows
- Initialize the matrix by introducing **gap penalty** at 1st row and 1st column

		W	H	A	T
		0	0	0	0
W		0			
H		0			
Y		0			

The table illustrates the initialization of an alignment matrix. The top row and the first column are highlighted in yellow, representing the gap penalty. The top row contains the sequence 'W', 'H', 'A', 'T' and the first column contains 'W', 'H', 'Y'. The cells at the intersection of the first row and first column (excluding the top-left cell) contain the value '0', indicating the gap penalty. Red arrows point from these '0' cells to the adjacent cells in the matrix, showing the direction of the gap penalty application.

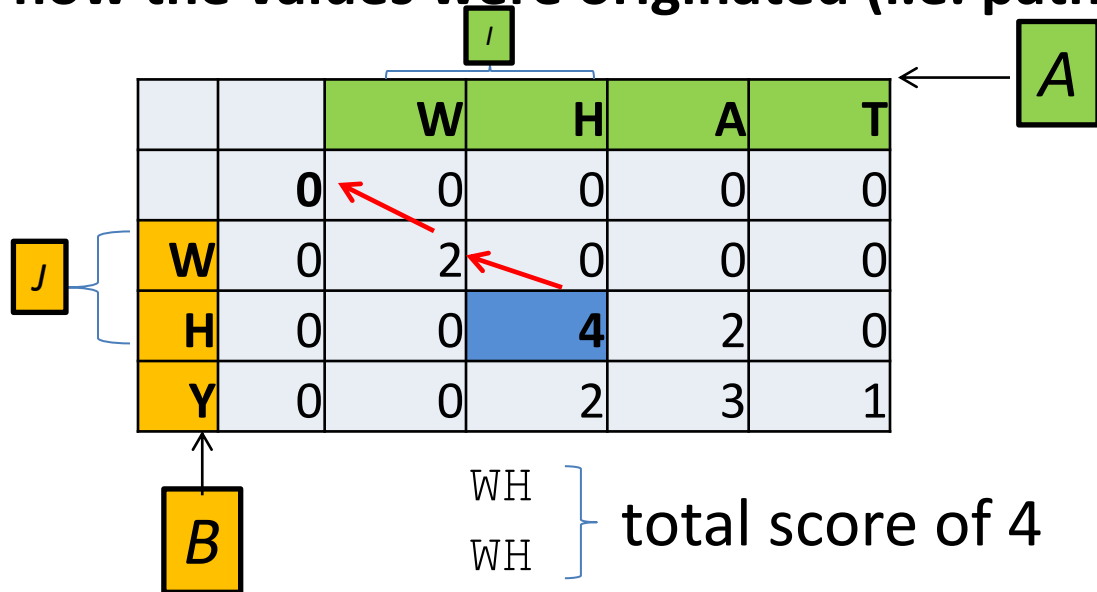
Methodology of local alignment (3 of 4)

- For each subsequent cell consider all possibilities (i.e. motions)
 - 1) Vertical
 - 2) Horizontal
 - 3) Diagonal
- For each cell select the highest score
 - If score is negative → assign **zero**

		W	H	A	T
	0	0	0	0	0
W	0	2	0	0	0
H	0	0	4	2	0
Y	0	0	2	3	1

Methodology of local alignment (4 of 4)

- Select the initial cell with the **highest score(s)**
- Consider different path(s) leading to score of **zero**
 - Trace-back the cell values
 - Look how the values were originated (i.e. path)



- Mathematically $M(A, B) = \max\{S(I, J) : I \subset A, J \subset B\}$
 - where $S(I, J)$ is the score for **sub-sequences** I and J

Local alignment illustration (1 of 2)

- Determine the best **local** alignment and the maximum alignment score for
- **Sequence A:** ACCTAAGG
- **Sequence B:** GGCTCAATCA
- Scoring conditions:
 - $s(a_i, b_j) = +2$ if $a_i = b_j$,
 - $s(a_i, b_j) = -1$ if $a_i \neq b_j$ and
 - $s(a_i, -) = s(-, b_j) = -2$

Local alignment illustration (2 of 2)

		G	G	C	T	C	A	A	T	C	A
	0	0	0	0	0	0	0	0	0	0	0
A	0	0	0	0	0	0	2	2	0	0	2
C	0	0	0	2	0	2	0	1	1	2	0
C	0	0	0	2	1	2	1	0	0	2	1
T	0	0	0	0	4	2	1	0	2	0	1
A	0	0	0	0	2	3	4	3	1	1	2
A	0	0	0	0	0	1	5	6	4	2	3
G	0	2	2	0	0	0	3	4	5	3	1
G	0	2	4	1	0	0	1	2	3	4	2

Local alignment illustration (3 of 3)

		G	G	C	T	C	A	A	T	C	A
	0	0	0	0	0	0	0	0	0	0	0
A	0	0	0	0	0	0	2	2	0	0	2
C	0	0	0	2	0	2	0	1	1	2	0
C	0	0	0	2	1	2	1	0	0	2	1
T	0	0	0	0	4	2	1	0	2	0	1
A	0	0	0	0	2	3	4	3	1	1	2
A	0	0	0	0	0	1	5	6	4	2	3
G	0	2	2	0	0	0	3	4	5	3	1
G	0	2	4	1	0	0	1	2	3	4	2

CTCAA

GGCTCAATCA

CT-AA

ACCT-AAGG

Best score:

6



in the whole seq. context

Aligning proteins Globally and Locally

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Protein Alignment

- Protein local and global alignment follows the same rules as we saw with DNA/RNA
- Differences
 - alphabet of proteins is 22 residues long
 - special scoring/substitution matrices used
 - conservation and protein properties are taken into account
 - E.g. residues that are totally different due to charge such as polar Lysine and apolar Glycine are given a low score

Substitution matrices

- Since protein sequences are more complex, matrices are collection of scoring rules
- These are 2D matrices reflecting comparison between sequence A and B
- Cover events such as
 - mismatch and perfect match
- Need to define gap penalty separately
- Popular **BLO**cks **SU**bstitution **M**atrix (**BLOSUM**)

BLOSUM-x matrices

- Constructed from aligned sequences with specific x% similarity
 - matrix built using sequences with no more than 50% similarity is called **BLOSUM-50**
- For highly mutating / dissimilar sequences use
 - BLOSUM-45 and lower
- For highly conserved / similar sequences use
 - BLOSUM -62 and higher

BLOSUM 62

	C	S	T	P	A	G	N	D	E	Q	H	R	K	M	I	L	V	F	Y	W	
C	9																				C
S	-1	4																			S
T	-1	1	5																		T
P	-3	-1	-1	7																	P
A	0	1	0	-1	4																A
G	-3	0	-2	-2	0	6															G
N	-3	1	0	-2	-2	0	6														N
D	-3	0	-1	-1	-2	-1	1	6													D
E	-4	0	-1	-1	-1	-2	0	2	5												E
Q	-3	0	-1	-1	-1	-2	0	0	2	5											Q
H	-3	-1	-2	-2	-2	-2	1	-1	0	0	8										H
R	-3	-1	-1	-2	-1	-2	0	-2	0	1	0	5									R
K	-3	0	-1	-1	-1	-2	0	-1	1	1	-1	2	5								K
M	-1	-1	-1	-2	-1	-3	-2	-3	-2	0	-2	-1	-1	5							M
I	-1	-2	-1	-3	-1	-4	-3	-3	-3	-3	-3	-3	-3	1	4						I
L	-1	-2	-1	-3	-1	-4	-3	-4	-3	-2	-3	-2	-2	2	2	4					L
V	-1	-2	0	-2	0	-3	-3	-3	-2	-2	-3	-3	-2	1	3	1	4				V
F	-2	-2	-2	-4	-2	-3	-3	-3	-3	-3	-1	-3	-3	0	0	0	-1	6			F
Y	-2	-2	-2	-3	-2	-3	-2	-3	-2	-1	2	-2	-2	-1	-1	-1	-1	3	7		Y
W	-2	-3	-2	-4	-3	-2	-4	-4	-3	-2	-2	-3	-3	-1	-3	-2	-3	1	2	11	W

- What diagonal represents? perfect match between a.a.
- What is the score for substitution $E \rightarrow D$ (acid a.a.)? Score = 2
- More drastic substitution $K \rightarrow I$ (basic to non-polar)? Score = -3

Practical problem:

Align following sequences both globally and locally using BLOSUM 62 matrix with gap penalty of -8

Sequence A: AAEEKKLAAA

Sequence B: AARRIA



Aligning globally using BLOSUM 62

		A	A	E	E	K	K	L	A	A	A
	0	-8	-16	-24	-32	-40	-48	-56	-64	-72	-80
A	-8	4	-4	-12	-20	-28	-36	-44	-52	-60	-68
A	-16	-4	8	0	-8	-16	-24	-32	-40	-48	-56
R	-24	-12	0	8	0	-6	-14	-22	-30	-38	-46
R	-32	-20	-8	0	8	2	-4	-12	-20	-28	-36
I	-40	-28	-16	-8	0	5	-1	-2	-10	-18	-26
A	-48	-36	-24	-16	-8	-1	4	-2	2	-6	-14

AAEEKKLAAA

AA--RRIA--

Score: -14

Other alignment options? Yes

Aligning locally using BLOSUM 62

		A	A	E	E	K	K	L	A	A	A
	0	0	0	0	0	0	0	0	0	0	0
A	0	4	4	0	0	0	0	0	4	4	4
A	0	4	8	3	0	0	0	0	4	8	8
R	0	0	3	8	3	2	2	0	0	3	7
R	0	0	0	3	8	5	4	0	0	0	2
I	0	0	0	0	0	5	2	6	0	0	0
A	0	4	4	0	0	0	4	1	10	4	4

KKLA

RRIA

Score: 10

Using R for:

- Sequence Retrieval and Analysis



Protein database UniProt

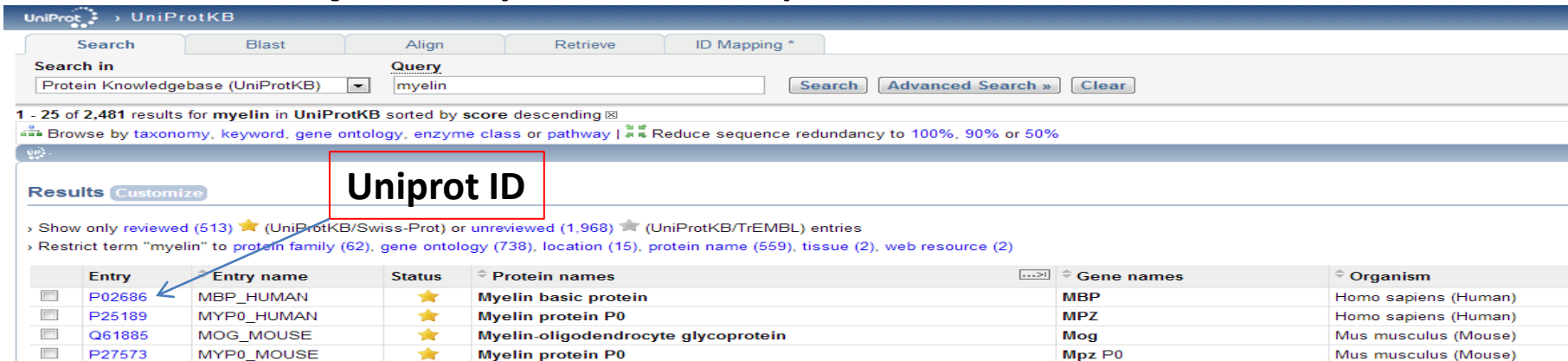
- UniProt database (<http://www.uniprot.org/>) has high quality protein data **manually** curated
- It is manually curated
- Each protein is assigned **UniProt ID**



The screenshot shows the UniProt search interface. At the top left is the UniProt logo. Below it are navigation tabs for Search, Blast, Align, Retrieve, and ID Mapping. The Search tab is active. Under the Search tab, there is a dropdown menu labeled "Search in" with "Protein Knowledgebase (UniProtKB)" selected. To the right is a text input field labeled "Query" containing the text "Q9CD83". Below the input field are buttons for "Search", "Clear", and "Advanced Search »". A blue arrow points from the "UniProt ID" text in the list above to the "Query" input field.

Retrieving data from UniProt

- In search field one can enter either use UniProt ID or common protein name
 - **example:** myelin basic protein



The screenshot shows the UniProt search interface. The search query is 'myelin' in the 'Protein Knowledgebase (UniProtKB)'. The results are sorted by score descending, showing 25 of 2,481 results. A red box highlights the 'Uniprot ID' column header in the results table. An arrow points from this box to the 'P02686' entry in the first row of the table.

Entry	Entry name	Status	Protein names	Gene names	Organism
P02686	MBP_HUMAN	★	Myelin basic protein	MBP	Homo sapiens (Human)
P25189	MYP0_HUMAN	★	Myelin protein P0	MPZ	Homo sapiens (Human)
Q61885	MOG_MOUSE	★	Myelin-oligodendrocyte glycoprotein	Mog	Mus musculus (Mouse)
P27573	MYP0_MOUSE	★	Myelin protein P0	Mpz P0	Mus musculus (Mouse)

- We will use retrieve data for **P02686**

Understanding UniProt fields

- Information is divided into categories

P02686 (MBP_HUMAN) ★ Reviewed, UniProtKB/Swiss-Prot
 Last modified October 3, 2012. Version 154. History...

Clusters with 100%, 90%, 50% identity | Documents (4) | Third-party data

Names · Attributes · General annotation · Ontologies · Alt products · Sequence annotation · **Sequences** · References · Web links

- Click on ‘**Sequences**’ category and then **FASTA**

Sequences

Sequence	Length	Mass (Da)	Tools
<input type="checkbox"/> Isoform 1 (Golli-MBP1) (HOG7) [UniParc]. FASTA	304	33,117	Blast <input type="button" value="go"/>
Last modified October 18, 2001. Version 3. Checksum: 4AD7305C1D5434C4			


```

10      20      30      40      50      60
MGNHAGKREL NAEKASTNSE INRGESEKKR NLGELSRTTS EDNEVFGEAD ANQNGTSSQ

70      80      90      100     110     120
DTAVTDSKRT ADPKNAWQDA HPADEGSRPH LIRLFSRDAP GREDNTFKDR PSEDELQTI
    
```

FASTA format

- FASTA format is widely used and has the following parameters
 - Sequence name start with > sign
 - The first line corresponds to protein name

 >sp|P02686|MBP_HUMAN Myelin basic protein OS=Homo sapiens GN=MBP PE=1 SV=3
MGNHAGKRELNAEKASTNSETNRGESEKRN LGELSR TTSEDNEVFGEADANQNNGTSSQ
DTAVTDSKRTADPKNAWQDAHPADPGSRPHLIRLFSRDAPGREDNTFKDRPSE SDELQTI
QEDSAATSESLDVMASQKRPSQRHGSKYLATASTMDHARHGFLPRHRDTGILDSIGRFFG
GDRGAPKRGSGKDSHHPARTAHYGSLPQKSHGRTQDENPVVHFFKNIVTPRTPPPSQGKG
RGLSLSRFSWGAEGQRPFGYGGRASDYKSAHKGFKGVDAQGTLSKIFKLGGRDSRSGSP
MARR

Actual protein
sequence starts
from 2nd line

Retrieving protein data with R and SeqinR

- Can “talk” programmatically to UniProt database using R and *seqinR* library
 - *seqinR* library is suitable for
 - “Biological Sequences Retrieval and Analysis”
 - Detailed manual could be found [here](#)
 - Install this library in your R environment

```
install.packages("seqinr")
library("seqinr")
```
 - Choose database to retrieve data from

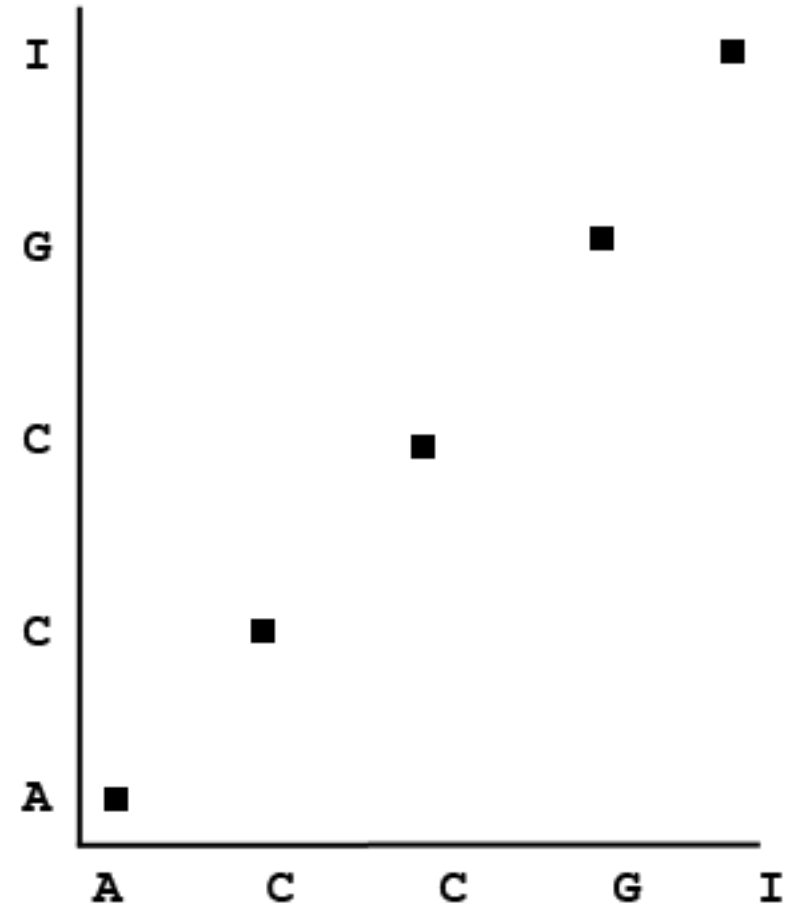
```
choosebank("swissprot")
```
 - Download data object for target protein (**P02686**)

```
query("MBP_HUMAN", "AC=P02686")
```
 - **See sequence of the object MBP_HUMAN**

```
MBP_HUMAN_seq = getSequence(MBP_HUMAN); MBP_HUMAN_seq
```

Dot Plot (comparison of 2 sequences) (1of2)

- 2D way to find regions of similarity between two sequences
 - Each sequence plotted on either vertical or horizontal dimension
 - If **two a.a.** from two sequences at given positions are **identical** the **dot** is plotted
 - **matching** sequence **segments** appear as **diagonal lines** (that could be parallel to the absolute diagonal line if insertion or gap is present)



Dot Plot (comparison of 2 sequences) (2of2)

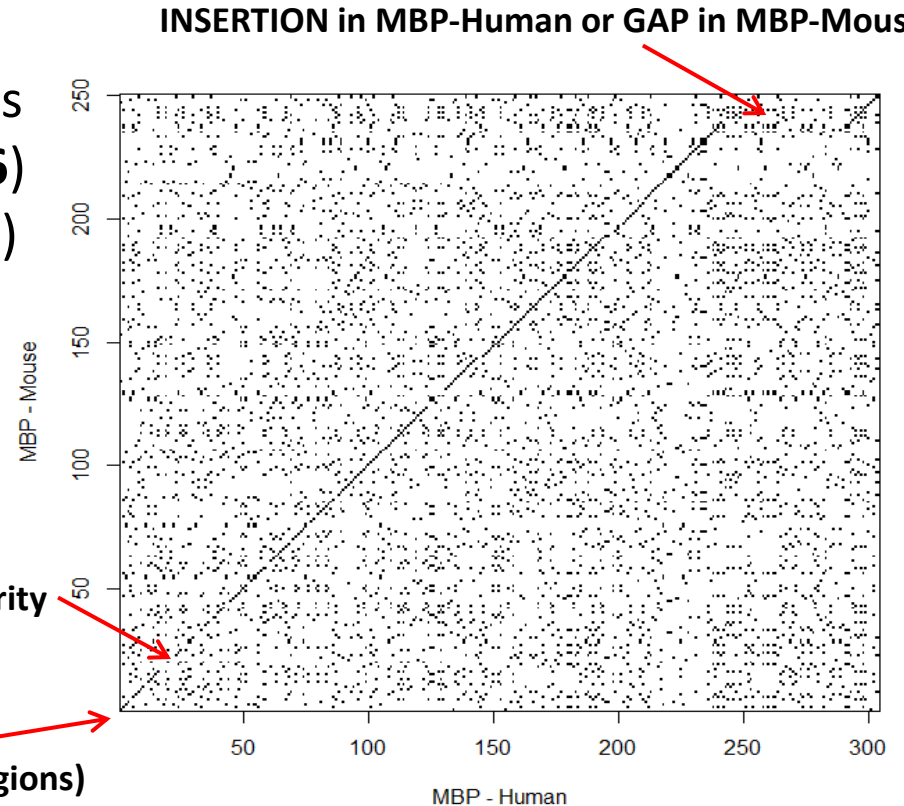
- Let's compare two protein sequences
 - Human MBP (Uniprot ID: **P02686**)
 - Mouse MBP (Uniprot ID: **P04370**)

- Download 2nd mouse sequence

```
query("MBP_MOUSE", "AC=P04370");
MBP_MOUSE_seq = getSequence(MBP_MOUSE);
```

Breaks in diagonal line = regions of dissimilarity

Shift in diagonal line (identical regions)



- Visualize dot plot

```
dotPlot(MBP_HUMAN_seq[[1]], MBP_MOUSE_seq[[1]], xlab="MBP - Human", ylab = "MBP - Mouse")
```

- Is there similarity between human and mouse form of MBP protein?
- Where is the difference in the sequence between the two isoforms?

Using R and `Biostings` library for:

- Pairwise **global** and **local** alignments



Installing Biostrings library

- Install library from Bioconductor

```
source("http://bioconductor.org/biocLite.R")
biocLite("Biostrings")
library(Biostrings)
```

- Define substitution matrix (e.g. for DNA)

```
DNA_subst_matrix = nucleotideSubstitutionMatrix(match = 2,
                                                mismatch = -1, baseOnly = TRUE)
```

- The scoring rules

- Match: $s(a_i, b_j) = 2$ if $a_i = b_j$
- Mismatch : $s(a_i, b_j) = -1$ if $a_i \neq b_j$
- Gap: $s(a_i, -) = -2$ or $s(-, b_j) = -2$

DNA_subst_matrix

	A	C	G	T
A	2	-1	-1	-1
C	-1	2	-1	-1
G	-1	-1	2	-1
T	-1	-1	-1	2


Global alignment using R and Biostrings

- Create two sting vectors (i.e. sequences)

```
seqA = "GATTA"  
seqB = "GTTA"
```

- Use `pairwiseAlignment()` and the defined rules

```
globalAlignAB = pairwiseAlignment(seqA, seqB,  
  substitutionMatrix = DNA_subst_matrix, gapOpening = -2,  
  scoreOnly = FALSE, type="global")
```



- Visualize best paths (i.e. alignments)

```
globalAlignAB
```

```
Global PairwiseAlignedFixedSubject (1 of 1)  
pattern: [1] GATTA  
subject: [1] G-TTA  
score: 2
```

Local alignment using R and Biostrings

- Input two sequences

```
seqA = "AGGATTTTAAAA"  
seqB = "TTTT"
```

- The scoring rules will be the same as we used for global alignment

```
globalAlignAB = pairwiseAlignment(seqA, seqB,  
  substitutionMatrix = DNA_subst_matrix, gapOpening = -2,  
  scoreOnly = FALSE, type="local")
```

- Visualize alignment

```
globalAlignAB  
Local PairwiseAlignedFixedSubject (1 of 1)  
pattern: [5] TTTT  
subject: [1] TTTT  
score: 8
```

Aligning protein sequences

- Protein sequences alignments are very similar except the substitution matrix is specified

```
data(BLOSUM62)  
BLOSUM62
```

- Will align sequences

```
seqA = "PAWHEAE"  
seqB = "HEAGAWGHEE"
```

- Execute the global alignment

```
globalAlignAB <- pairwiseAlignment(seqA, seqB,  
  substitutionMatrix = "BLOSUM62", gapOpening = -2,  
  gapExtension = -8, scoreOnly = FALSE)
```

Summary

- We had touched on practical aspects of
 - Global and local alignments
- Thoroughly understood both algorithms
- Applied them both on DNA and protein seq.
- Learned on how to retrieve sequence data
- Learned on how to retrieve sequences both with R and using UniProt
- Learned how to align sequences using R

Resources

- Online Tutorial on Sequence Alignment
 - <http://a-little-book-of-r-for-bioinformatics.readthedocs.org/en/latest/src/chapter4.html>
- Graphical alignment of proteins
 - <http://www.itu.dk/~sestoft/bsa/graphalign.html>
- Pairwise alignment of DNA and proteins using your rules:
 - http://www.bioinformatics.org/sms2/pairwise_align_dna.html
- Documentation on libraries
 - Biostings: <http://www.bioconductor.org/packages/2.10/bioc/manuals/Biostrings/man/Biostrings.pdf>
 - SeqinR: http://seqinr.r-forge.r-project.org/seqinr_2_0-7.pdf

Homework – HW2



Homework 2 – literature style (type 1)

You are asked to **analyze critically** by writing a report and **present one** of the following papers in a group:

1. *Day-Williams AG, Zeggini E The effect of next-generation sequencing technology on complex trait research. Eur J Clin Invest. 2011 May;41(5):561-7*
 - A review paper on popular NGS under the context of genetics of complex diseases
2. *Do R, Exome sequencing and complex disease: practical aspects of rare variant association studies. Hum Mol Genet. 2012 Oct 15;21(R1):R1-9*
 - A more technical paper on how deep sequencing can help in association studies of rare variants to disease phenotypes under context of statistical genetics
3. *Hurd PJ, Nelson CJ. Advantages of next-generation sequencing versus the microarray in epigenetic research. Brief Funct Genomic Proteomic. 2009 May;8(3):174-83*
 - An overview paper describing on how NGS technology can be used in the context of epigenetic research. NGS technology described in detail
4. *Goldstein DB. Sequencing studies in human genetics: design and interpretation. Nat Rev Genet. 2013 Jul;14(7):460-70 (password protected)*
 - This paper describes on how NGS could be interpreted and contrasted to GWAS. The paper focuses on functional interpretation of genetic variants found in the data

Homework 2 – computer style (type 2)

- You would implement the Needleman–Wunsch global alignment algorithm in R
 - Follow the pseudo-code provided
 - Will translate it into R
 - Will understand alignment in-depth
 - Provide copy of your code and write a short report
 - Report should contain information on scoring matrix and rules used
 - Example sequences used for alignment
 - In code use comments (# comment)

Homework 2 – Q&A style (type 3)

- Here you would need to answer questions
 - Complete the local and global alignment of DNA and protein sequences graphically
 - Use seqinR library to retrieve protein sequences
 - Use Biostrings library to do alignment of sequences
 - Complete missing R code
 - Copy output from R as a proof
 - Calculate alignment scores

Feedback on HW1



HW 1a feedback

- Some almost confused the name of **the disease abbreviation** with the **disease associated genes** (e.g. HDL syndromes has no HDL1 gene but PRNP gene is associated with HDL1)
- Some printed the whole genome sequence **around** the disease gene, but your were asked to print only the **protein coding region (CDS)**
- Would be nice to get more screen snapshots and see the search query used to find articles
 - From HW1a: “Provide below the search **key words** used to obtain the results”

HW 2b feedback

- Computer style (type 2):
 - Good analysis on gene level with literature searches
 - Could of addressed results variation before and after cleaning data. What is overlap in results before and after QC?
 - Would be nice to have top 10 SNPs and **corresponding p-values before and after** cleaning
 - Overall, well done
- Q&A style (type 2)
 - The issue of loading *.phe and *.raw files
 - Set working directory in R where these files are located via
 - **setwd()**
 - Check current location by **getwd()**