# HW4: Pairwise Alignments

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Source code downloads: [.Rmd] [pairwiseAlign Fct.R]

# **Rendering Instructions**

To render this R Markdown document, one needs to download the following files to the same directory.

- HW4\_key.Rmd: Rmd source file for this document
- pairwiseAlign Fct.R: R script defining pairwise alignment functions
- bibtex.bib: references cited in the text in BibTeX format

Next, one can render the report to HTML, PDF and other formats following the instructions below. Both the HTML and PDF versions are linked here: + HTML: this report in HTML format + PDF: corresponding PDF version

After this the HTML report can be rendered from the corresponding directory with rmarkdown::render() as follows.

```
rmarkdown::render('HW4_key.Rmd') # From R
Rscript -e "rmarkdown::render('HW4_key.Rmd')" # From command-line
```

To render a PDF file instead of HTML, one can instruct the rendering function to do so like this: rmarkdown::render('HW4\_key.Rmd', c('pdf\_document'). The corresponding PDF file of this HTML report is here. To render to several formats with a single command, one can concatenate the formatting values with c('html\_document', 'pdf\_document').

# A. Choice of Sequence Type

Task 1: Which sequence type - amino acid or nucleotide - is more appropriate to search databases for remotely related sequences? Provide at least three reasons for your decision.

Answer: When coding sequences are expected to have weak similarities then one should use protein sequences rather than DNA sequences for database searching, because of (1) their higher information content (20 versus 4 letter alphabet), as well as (2) the better scoring and (3) functional classification systems available for amino acids.

# B. Dynamic Programming for Pairwise Alignments

Task 2: Create manually (or write an R script for it) one global and one local alignment for the following two protein sequences using the Needleman-Wusch and Smith-Waterman algorithms, respectively (Smith and Waterman 1981; Needleman and Wunsch 1970).

015528: PFGFGKRSCMGRRLA P98187: FIPFSAGPRNCIGQK

# Source functions

All alignment functions used in the following sections are defined in the downloaded R script file that is named pairwiseAlign\_Fct.R. These functions are loaded with the source() command below.

```
source("pairwiseAlign_Fct.R")
```

# Input sequences

Define within R or import them (here former).

```
S1 <- "PFGFGKRSCMGRRLA"
S2 <- "FIPFSAGPRNCIGQK"
```

Additional test sequences

```
# S1 <- "HEAGAWGHEE"
# S2 <- "PAWHEAE"
```

# Global alignment

The alignment type choice is passed on to all following functions.

```
align_type <- "global"
# align_type <- "local"</pre>
```

## Dynamic programming matrices

```
dynMA <- dynProgMatrix(S1, S2, align_method=align_type, gap_penalty=8, substitutionMA="BLOSUM50")</pre>
```

The matrices are stored in a list and returned below. The path is indicated by three numbers in the glob\_ma\_path matrix. Their meaning is:

- 1: diagonal
- 2: vertical (up)
- 3: horizontal (left)

#### dynMA

```
## $glob_ma
##
        gp
               Ρ
                   F
                        G
                                     K
                                         R
                                              S
                                                  C
                                                           G
                                                                    R
                                                                          L
## gp
         0
              -8 -16 -24 -32 -40 -48 -56 -64 -72 -80 -88 -96 -104 -112 -120
## F
        -8
                       -8 -16 -24 -32 -40 -48 -56 -64 -72
                                                                  -88
                                                                        -96
                       -4
                           -8 -16 -24 -32 -40 -48 -54 -62
                                                                  -78
                                                                        -86
                                                                             -94
## T
       -16
             -11
                  -4
                                                            -70
       -24
                           -8 -10 -17 -25 -33 -41 -49 -56
                                                                        -80
                                                                             -87
                 -12
                       -6
                                                                  -72
## F
       -32
             -14
                   2
                       -6
                            2
                               -6 -14 -20 -28 -35 -41 -49
                                                             -57
                                                                  -65
                                                                        -71
                                                                             -79
       -40
             -22
                        2
                           -6
                                2
                                    -6 -14 -15 -23 -31 -39
                                                             -47
                                                                  -55
                                                                        -63
                                                                             -70
##
                  -6
       -48
            -30 -14
                      -6
                           -1
                                     1
                                        -7 -13 -16 -24 -31
                                                            -39
                                                                  -47
                                                                        -55
                                                                             -58
##
                               -6
       -56
             -38 -22
                      -6
                                7
                                        -2
                                            -7 -15 -19 -16 -24
                                                                        -40
                                                                             -48
## G
                           -9
                                    -1
                                                                  -32
                                        -2
                                                                  -27
## P
       -64
             -46 -30 -14 -10
                                     6
                                            -3 -11 -18 -21
                                                            -19
                                                                        -35
                                                                             -41
                               -1
## R
       -72
             -54 -38 -22 -17
                               -9
                                     2
                                        13
                                              5
                                                 -3 -11 -19
                                                            -14
                                                                  -12
                                                                        -20
                                                                             -28
       -80
            -62 -46 -30 -25 -17
                                                     -2 -10
                                                            -18
                                                                             -21
## N
                                    -6
                                         5
                                            14
                                                  6
                                                                  -15
                                                                        -16
##
  C
       -88
            -70 -54 -38 -32 -25 -14
                                        -3
                                              6
                                                 27
                                                     19
                                                         11
                                                               3
                                                                    -5
                                                                        -13
                                                                             -17
##
       -96
             -78 -62 -46 -38 -33 -22 -11
                                            -2
                                                 19
                                                     29
                                                         21
                                                              13
                                                                    5
                                                                         -3
                                                                             -11
      -104
             -86 -70 -54 -46 -30 -30 -19
                                           -10
                                                 11
                                                     21
                                                         37
                                                              29
                                                                    21
                                                                         13
                                                                               5
            -94 -78 -62 -54 -38 -28 -27 -18
                                                              38
      -112
                                                  3
                                                     13
                                                         29
                                                                    30
                                                                         22
                                                                              14
## K
      -120 -102 -86 -70 -62 -46 -32 -25 -26
                                                -5
                                                         21
                                                              32
                                                                    41
                                                                         33
                                                                              25
##
```

```
## $glob_ma_path
##
      gp P F G F G K R S C M G R R L A
       0 3 3 3 3 3 3 3 3 3 3 3 3 3 3 3
       2 1 1 3 1 3 3 3 3 3 3 3 3 3 3 3
## F
## I
       2 1 1 1 1 3 3 3 3 3 1 3 3 3 1 3
## P
       2 1 2 1 1 1 1 3 1 3 3 1 3 3 3 1
       2 2 1 3 1 3 1 1 1 1 1 3 3 3 1 3
       2 2 2 1 2 1 1 3 1 3 3 3 3 3 3 1
## S
## A
       2 2 2 1 1 1 1 3 1 1 1 1 3 3 3 1
       2 2 2 1 2 1 3 1 1 3 1 1 3 3 3 3
## G
       2 1 2 2 1 2 1 3 1 1 1 1 1 1 3 1
       2 2 2 2 1 2 1 1 3 3 3 3 1 1 3 3
## R
       2 2 2 2 2 1 2 2 1 3 3 3 3 1 1 1
## N
## C
       2 2 2 2 1 2 2 2 2 1 3 3 3 3 3 1
## I
       2 2 2 2 1 2 2 2 2 2 1 3 3 3 1 3
       2 2 2 1 2 1 2 2 2 2 2 1 3 3 3 3
## G
       2 2 2 2 2 2 1 2 2 2 2 2 1 1 3 3
## Q
       2 2 2 2 2 2 1 1 2 2 2 2 1 1 3 3
```

# Compute alignment

The following alignList stores all relevant results in a list, including dynamic programming matrices, as well as the coordinates (named path\_coor) to highlight path in dynamic programming matrix (see below).

```
alignList <- alignmentTraceback(ma=dynMA[[1]], ma_path=dynMA[[2]], align_method=align_type)
names(alignList)</pre>
```

```
## [1] "ma" "ma_path" "path_coor" "as1" "consensus" "as2"
## [7] "score"

# alignList$ma # dyn ma with scores
# alignList$ma_path # dyn ma with path
# alignList$path_coor # coordinates for path to auto highlight path in HTML/PDF table
```

#### Return results

**Traceback in matrix** The following prints the fully populated dynamic programming matrix where the traceback path is highlighted in color.

```
printColMa(alignList)
```

```
printAlign(x=alignList)
```

#### Alignment and score

## Local alignment

The alignment type choice is passed on to all following functions.

	gp	P	F	G	F	G	K	R	S	С	M	G	R	R	L	A
gp	0	-8	-16	-24	-32	-40	-48	-56	-64	-72	-80	-88	-96	-104	-112	-120
F	-8	-4	0	-8	-16	-24	-32	-40	-48	-56	-64	-72	-80	-88	-96	-104
I	-16	-11	-4	-4	-8	-16	-24	-32	-40	-48	-54	-62	-70	-78	-86	-94
P	-24	-6	-12	-6	-8	-10	-17	-25	-33	-41	-49	-56	-64	-72	-80	-87
F	-32	-14	2	-6	2	-6	-14	-20	-28	-35	-41	-49	-57	-65	-71	-79
S	-40	-22	-6	2	-6	2	-6	-14	-15	-23	-31	-39	-47	-55	-63	-70
A	-48	-30	-14	-6	-1	-6	1	-7	-13	-16	-24	-31	-39	-47	-55	-58
G	-56	-38	-22	-6	-9	7	-1	-2	-7	-15	-19	-16	-24	-32	-40	-48
Р	-64	-46	-30	-14	-10	-1	6	-2	-3	-11	-18	-21	-19	-27	-35	-41
R	-72	-54	-38	-22	-17	-9	2	13	5	-3	-11	-19	-14	-12	-20	-28
N	-80	-62	-46	-30	-25	-17	-6	5	14	6	-2	-10	-18	-15	-16	-21
С	-88	-70	-54	-38	-32	-25	-14	-3	6	27	19	11	3	-5	-13	-17
I	-96	-78	-62	-46	-38	-33	-22	-11	-2	19	29	21	13	5	-3	-11
G	-104	-86	-70	-54	-46	-30	-30	-19	-10	11	21	37	29	21	13	5
Q	-112	-94	-78	-62	-54	-38	-28	-27	-18	3	13	29	38	30	22	14
K	-120	-102	-86	-70	-62	-46	-32	-25	-26	-5	5	21	32	41	33	25

```
# align_type <- "global"
align_type <- "local"</pre>
```

# Dynamic programming matrices

```
dynMA <- dynProgMatrix(S1, S2, align_method=align_type, gap_penalty=8, substitutionMA="BLOSUM50")</pre>
```

The matrices are stored in a list and returned below.

 ${\tt dynMA}$ 

```
## $loc_ma
##
                               S
                                  С
                                                    Α
      gp
            F
                G
                   F
                      G
                         K
                            R
## gp
                            0
      0
          0
             0
                0
                   0
                      0
                         0
                               0
                                  0
                                     0
                                        0
## F
                                        0
       0
             8
                0
                   8
                      0
                         0
                            0
                               0
                                  0
                                     0
                                           0
                                                 1
                                                    0
## T
       0
          0
             0
                4
                   0
                      4
                         0
                            0
                               0
                                  0
                                     2
                                        0
                                           0
                                                    0
## P
                      0
                         3
                                        0
       0 10
             2
                   0
                            0
                               0
                                  0
                                           0
## F
          2 18 10
                   8
                      0
                         0
                            0
                               0
                                  0
                                     0
                                        0
                                           0 0
       0
                                                    0
          0 10 18 10
                      8
                                                    2
## S
       0
                         0
                            0
                               5
                                  0
                                     0
                                        0
                                           0
                         7
## A
       0
          0
            2 10 15 10
                            0
                                  4
                                     0
                                        0 0 0
                                                 0
                                                    5
                               1
                  7 23 15
                            7
## G
             0 10
## P
       0 10
             2
               2
                   6 15 22 14
                               6
                                  0
                                     0
                                        0
                                           5 0
                                                    0
## R
                0
                   0
                      7 18 29 21 13
                                     5
                                           7 12
## N
       0
          0
             0
                7
                   0
                      0 10 21 30 22 14
                                        6
                                                    3
                                           0
## C
       0
             0
                0
                   5
                      0
                         2 13 22 43 35 27 19 11
                         0
                           5 14 35 45 37 29 21 13
## I
       0
          0
             0
               0
                   0
                      1
                                                    5
## G
       0
             0
               8
                   0
                      8
                         0
                            0
                              6 27 37 53 45 37 29 21
## Q
       0
             0
               0
                  4
                      0 10 2
                              0 19 29 45 54 46 38 30
          0
## K
       0
                  0
                      2
                         6 13
                               5 11 21 37 48 57 49 41
##
## $loc_ma_path
      gp P F G F G K R S C M G R R L A
## gp 0000000000000000
## F
       0 1 1 3 1 3 1 1 1 1 1 1 1 1 1 1
## I
       0\ 1\ 1\ 1\ 1\ 1\ 1\ 1\ 1\ 1\ 1\ 1\ 1
```

```
## P
       0 1 3 1 1 1 1 1 1 1 1 1 1 1 1 1
## F
       0 2 1 3 1 3 1 1 1 1 1 1 1 1 1 1
       0 1 2 1 3 1 1 1 1 1 1 1 1 1 1 1
## S
       0 1 2 1 1 1 1 3 1 1 1 1 1 1 1 1
## A
## G
       0 1 1 1 2 1 3 3 1 1 1 1 3 1 1 1
       0 1 3 2 1 2 1 3 1 3 1 2 1 1 1 1
## P
       0 2 1 1 1 2 1 1 3 3 3 1 1 1 3 1
       0 1 2 1 3 1 2 2 1 3 3 3 1 1 1 1
## N
## C
       0 1 1 2 1 1 2 2 2 1 3 3 3 3 1 1
       0 1 1 1 1 1 1 2 2 2 1 3 3 3 1 3
## I
       0 1 1 1 3 1 3 1 2 2 2 1 3 3 3 3
       0 1 1 2 1 2 1 3 1 2 2 2 1 1 3 3
## Q
       0 1 1 1 1 1 1 1 3 2 2 2 1 1 3 3
```

## Compute alignment

Note: alignList stores all relevant results in a list, including dynamic programming matrices, as well as the coordinates (named path\_coor) to highlight the path in the dynamic programming matrix. This way one can easily generate a single dynamic programming matrix with the traceback path highlighted by colors or arrows in an HTML or PDF document (see below).

# Return results

**Traceback in matrix** The following prints the fully populated dynamic programming matrix where the traceback path is highlighted in color.

```
printColMa(alignList)
```

```
printAlign(x=alignList)
```

#### Alignment and score

# C. Different Substitution Matrices

Task 1: Load the Biostrings package in R, import the following two cytochrome P450 sequences O15528 and P98187 from NCBI (save as myseq.fasta), and create a global alignment with the pairwiseAlignment function from Biostrings as follows.

	gp	Р	F	G	F	G	K	R	S	С	M	G	R	R	L	A
gp	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
F	0	0	8	0	8	0	0	0	0	0	0	0	0	0	1	0
I	0	0	0	4	0	4	0	0	0	0	2	0	0	0	2	0
Р	0	10	2	0	0	0	3	0	0	0	0	0	0	0	0	1
F	0	2	18	10	8	0	0	0	0	0	0	0	0	0	1	0
$\overline{S}$	0	0	10	18	10	8	0	0	5	0	0	0	0	0	0	2
A	0	0	2	10	15	10	7	0	1	4	0	0	0	0	0	5
G	0	0	0	10	7	23	15	7	0	0	1	8	0	0	0	0
P	0	10	2	2	6	15	22	14	6	0	0	0	5	0	0	0
$\overline{R}$	0	2	7	0	0	7	18	29	21	13	5	0	7	12	4	0
N	0	0	0	7	0	0	10	21	30	22	14	6	0	6	8	3
С	0	0	0	0	5	0	2	13	22	43	35	27	19	11	4	7
I	0	0	0	0	0	1	0	5	14	35	45	37	29	21	13	5
G	0	0	0	8	0	8	0	0	6	27	37	53	45	37	29	21
Q	0	0	0	0	4	0	10	2	0	19	29	45	54	46	38	30
K	0	0	0	0	0	2	6	13	5	11	21	37	48	57	49	41

```
library(Biostrings)
myseq <- readAAStringSet("myseq.fasta", "fasta")
(p <- pairwiseAlignment(myseq[[1]], myseq[[2]], type="global", substitutionMatrix="BLOSUM50"))
writePairwiseAlignments(p)</pre>
```

Your answers should address the following items:

Record the scores for the scoring matrices BLOSUM50, BLOSUM62 and BLOSUM80. How and why do the scores differ for the three scoring matrices?

Answer 1: The scores for the three BLOSUM substitutions matrices are:

BLOSUM50: 227BLOSUM62: 54BLOSUM80: -52

Answer 2: Since the two sequences are relatively dissimilar (as determined by alignment view from writePairwiseAlignments(p)) it is expected that the BLOSUM matrices trained on more dissimilar sequences (e.g. BLOSUM50) result in higher scores than those trained on less similar sequences (e.g. BLOSUM80).

# Session Info

##

# ## R version 4.0.5 (2021-03-31) ## Platform: x86\_64-pc-linux-gnu (64-bit) ## Running under: Debian GNU/Linux 10 (buster) ## ## Matrix products: default ## BLAS: /usr/lib/x86\_64-linux-gnu/blas/libblas.so.3.8.0 ## LAPACK: /usr/lib/x86\_64-linux-gnu/lapack/liblapack.so.3.8.0

## locale:
## [1] LC\_CTYPE=en\_US.UTF-8

US.UTF-8 LC\_NUMERIC=C

## [3] LC\_TIME=en\_US.UTF-8 LC\_COLLATE=en\_US.UTF-8

```
##
    [5] LC MONETARY=en US.UTF-8
                                    LC_MESSAGES=en_US.UTF-8
##
    [7] LC_PAPER=en_US.UTF-8
                                    LC NAME=C
   [9] LC ADDRESS=C
                                    LC TELEPHONE=C
## [11] LC_MEASUREMENT=en_US.UTF-8 LC_IDENTIFICATION=C
##
## attached base packages:
## [1] stats4
                 parallel stats
                                      graphics grDevices utils
                                                                     datasets
## [8] methods
                 base
##
## other attached packages:
## [1] kableExtra_1.3.4
                           Biostrings_2.58.0
                                                XVector_0.30.0
## [4] IRanges_2.24.0
                           S4Vectors_0.28.0
                                                BiocGenerics_0.36.0
##
## loaded via a namespace (and not attached):
   [1] bslib_0.2.4
                          compiler_4.0.5
                                                                tools_4.0.5
                                             jquerylib_0.1.3
    [5] zlibbioc_1.36.0
                          digest_0.6.27
                                             jsonlite_1.7.1
                                                                evaluate_0.14
   [9] lifecycle_0.2.0
                          viridisLite_0.3.0 rlang_0.4.8
                                                                rstudioapi_0.13
##
## [13] yaml_2.2.1
                          xfun 0.22
                                             stringr 1.4.0
                                                                httr 1.4.2
## [17] knitr_1.30
                          xm12_1.3.2
                                             sass_0.3.1
                                                                systemfonts_1.0.1
## [21] webshot_0.5.2
                          svglite_2.0.0
                                             glue_1.4.2
                                                                R6 2.5.0
## [25] rmarkdown_2.7
                          magrittr_2.0.1
                                             scales_1.1.1
                                                                htmltools_0.5.1.1
## [29] rvest_0.3.6
                          colorspace_2.0-0
                                             stringi_1.5.3
                                                               munsell_0.5.0
## [33] crayon_1.3.4
```

# References

Needleman, S B, and C D Wunsch. 1970. "A general method applicable to the search for similarities in the amino acid sequence of two proteins." *J. Mol. Biol.* 48 (3): 443–53. https://doi.org/10.1016/0022-2836(70)90057-4.

Smith, T F, and M S Waterman. 1981. "Identification of common molecular subsequences." J. Mol. Biol. 147 (1): 195–97. http://www.ncbi.nlm.nih.gov/pubmed/7265238.