

February, 2nd 2021 DU Bioinformatique intégrative Module 3: « R et statistiques »



Prérequis

A introduction to



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No conflict of interest to disclose

Un script reprenant l'ensemble du code présenté dans ce diaporama est fourni

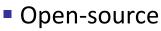
Plan des préreguis

- ersité de Paris Premiers pas avec R: diapos 1 à 24, 4 vidéos et leur quiz, SWIRL
 - 1. ouvrir et quitter R
- 2. exécution de commandes vidéo1.1
 - 3. utilisation d'une fonction built-in de R
- 1. Assigner des objets R vidéo1.2
 - 2. Gérer les objets R dans la session R
- 1. Gérer une session R et son répertoire de travail vidéo1.3
 - 2. Sauvegarder une session R, les objets et l'historique
- 1. Les lignes de commandes: utiliser un éditeur de texte et lancer un script vidéo1.4
 - 2. L'environemment Rstudio
- ==> tutoriel swirl (diapo 23-24): 5 exercices interactifs
- Les types de variables et d'objets dans R: diapos 25 à 28
- Les vecteurs: diapos 29 à 36 + exercices 1 à 10
- Les matrices: diapos 37 à 47

Premiers pas avec

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R – https://www.r-project.org







- statistical programming language available for Windows, Mac, Unix
- Widely used in academia, finance, pharma, social sciences...
- Core language, 'base' and > 3000 contributed packages
- Objectives:
 - Data manipulation: import, transform, export
 - Perform statistics
 - Generate advanced graphics
- Interactive sessions, scripts, packages in the CRAN ("Comprehensive R Archive Network")
- Possible interactions with other languages
- Project started in 1993; 12-12-2019: version R.3.6.2; version 4.0.3 (Bunny-Wunnies) Freak Out) on 2020-10-10
- Some useful links or documentation:
 - ✓ R for beginners d'E. Paradis (exists in English and in French)
 - ✓ QuickR: http://www.statmethods.net/index.html
 - And mostly the help menu: help.start()

Vidéo 1.1. Premiers pas avec



- 1. ouvrir et quitter R
- 2. exécution de commandes
- 3. utilisation d'une fonction built-in de R

lien vers la vidéo: https://youtu.be/KebToqxaEts

quizz d'autoévaluation: https://forms.gle/ppYtkBMzJzkXQbYn9

First contact with R

To start

Click on



ité de Pari. in Windows/Mac or tape R in Unix

prompt '>' at the beginning of your command line

To quit: > q()

-> you may save your current R session by typing q("yes") or not save your current R session by typing q("no")

Interaction with R:

You write a command and press « Enter »

R executes the command

R waits for another command

trick: use the \uparrow and \downarrow arrows to move to previous or next commands

Some very simple examples

Enter the commands (here in red) R answers (here in blue)

Some simple operations:

exp() or log() are built-in functions

What is a function?

Functions are a set of pre-programmed commands

A function is characterized by its:

- name
- arguments put within brackets to execute the command
- you enter the required parameters within the brackets
- to know the parameters of the function and their default settings:
 - "?" followed by the function name

```
>?exp # a help-window opens

# equivalent to either one of the following two command lines
> help(exp)
> help.search("exp")
```

The help associated to a function

Several sections:

- Description -> what is the purpose of the function?
- Usage -> how is the function used?
- Arguments -> which parameters are used by the function? Defaults

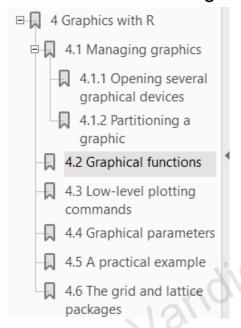
values mays be specified

- Details -> technical description of the function
- Value -> what are the output parameters returned by the function?
- See also -> are there some similar functions in R?
- Source/ References -> not always present...
- Example -> concrete examples to use the function
 - => the best way to learn how to use the function

Getting help

R for beginners E. Paradis

Chapter 4 for graphs quite exhaustive in moodle in French and English



QUICK R:

http://www.statmethods.net/basic and avdanced graphs with main parameters



R gallery

http://www.r-graph-gallery.com/all-graphs/ for specific kinds of graphs

And some blogs for specific questions

https://www.stat.ubc.ca/~jenny/STAT545A/block14_colors.html#using-colors-in-rhttps://danieljhocking.wordpress.com/2013/03/12/high-resolution-figures-in-r/

Vidéo 1. 2. Premiers pas avec

- 1. Assigner des objets R
- 2. Gérer les objets R dans la session R

- lien vers la vidéo: https://youtu.be/V4Fp0Nmfm3Q
- quizz d'autoévaluation: https://forms.gle/vyJ4H7c9bpDAFegr8

Assigning data into R objects, using and reading them

Use '<-' or '=' to assign values to R objects

```
> x <- 2 # equivalent to x = 2, assigns 2 to the variable x
> y <- x + 3
> s <- " this is a string of characters"
```

Using/reading values

```
# you call the object # its value is returned....note that an index is written betwen []
> X
[1] 2
[1] 5
[1] "this is a string of characters"
                # computes the operation knowing the value of x
> x + x
[1] 4
                # x to the power y
> x^y
[1] 32
> x < -4
                # change the value of x
                # y not dynamically changed!!!!
> y < - x + 3
                # need to reattribute y value to update for the new value x
```

Managing objects in your R session

List all objects present in the memory with the function Is()

```
> ls()
[1] "s" "x" "y"
```

Delete an object with the function rm()

```
> rm(y) # pour déléter y seulement
> ls()
[1] "s" "x"
> rm(list=ls()) # pour tout déléter
> ls()
```

Vidéo 1. 3. Premiers pas avec

- 1. Gérer une session R et son répertoire de travail
- 2. Sauvegarder une session R, les objets et l'historique

- lien vers la vidéo: https://youtu.be/7500g10me5A
- quizz d'autoévaluation: https://forms.gle/TL67MHavM3YDzEis8

Managing your session and working directory

Which R version are you using?

Getting your working directory
Setting a working directory

- > sessionInfo() # returns R version as well as the version of loaded packages
- > getwd()
- > setwd() # indicate the path inside the () and flanked by simple ' or double quotes"

trick: if ignoring the path, slide a text file from the directory where you want to work, there will be an error message but you will see the path of your directory

Creating a folder in your working directory

Listing all files and folders in your working directory

```
> list.files () # returns all files and folders within the working directory
add pattern= ".txt" uf you want to list only the .txt files
like ls in Unix
```

Connecting to a new file in your working directory (wd)

Opening a connection to a new file to write in

```
> zz <- file("mynewfile.txt", open="wt") # opens a new file to write in my working directory
> list.files ()
[1] "myfolder" "mynewfile.txt"
> close(zz)
```

diverting R console outputs with sink()

- > sink("myRoutputs.Rout") # diverts the console outputs to myRoutputs.Rout within the wd
- > 1+1
- > is.numeric(x)
- > sink() #to close -> open myRoutputs.Rout in a text editor to see how it looks like

or using file() before:

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Saving your session, data and history

Saving one object from your session

```
> save(x, file="x.RData")
```

Saving all objects

```
> save.image(file="AllMyData.RData")
```

Saving your history

> savehistory(file="MyHistory.Rhistory") # save all your commands in a text file

After closing R and restarting it, load your data in a new session

```
> load("x.RData") # load only x
```

> load("AllMyData.RData") # load all objects saved from the session

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Vidéo 1. 4. Premiers pas avec

- 1. Les lignes de commandes: utiliser un éditeur de texte et lancer un script
- 2. L'environnement Rstudio

- lien vers la vidéo: https://youtu.be/V-zO-hoi-WM
- quizz d'autoévaluation: https://forms.gle/WVfik1kJWMyFHap17

Saving your command lines in a text editor

R Studio

On windows:

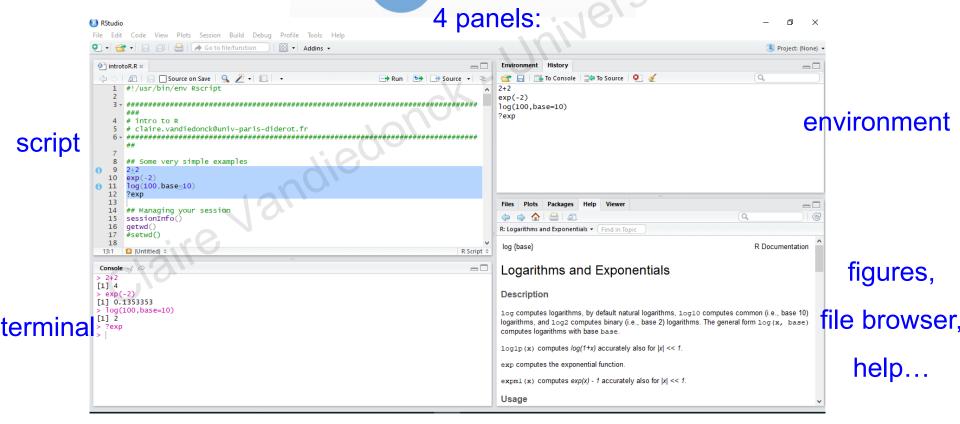
 R studio
 Notepad++ with NppToR
 EMACS
 vi

Tinn-R

On Mac:

 R studio
 EMACS
 Komodo edit

On linux:
 Rstudio
 Gedit
 Geany
 vi
 Emacs



R style and language rules

MUST READ:

https://google.github.io/styleguide/Rguide.xml

- Avoid any accent, space, special characters
- Comments
- # Any line starting with "#" will not be read by R
- # you may report some results as comments
- # you are highly advised to comment your command lines for your and other's usage
- To name your variables, do not use reservded letters or reserved words already used by R (names of functions or of data class):
 - eg. c, t, table, data, pi, TRUE, FALSE, T, F, letters, mean, var, ...
 - => A good text editor higlight them

Running a set of command lines

Save your commands in a text file: « myscript.R » in your working directory

In R, run automatically all the command lines:

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> source ("myscript.R")

Interactive tutorials



- install.packages("swirl") # this command has to be done only once
- > library(swirl) # this command has to be performed at each R session in which you # want to use swirl
- > swirl() # to start swirl

Then follow the instructions and practice with tutorials n°1 and 3 to 6 of the "R Programming" course (choice n°1 = "R programming: the basics of R programming" and "1: R programming").

To quit swirl: choose 0 several times or enter bye(). At any time during a lesson, the instructions are:

| You can exit swirl and return to the R prompt (>) at any time by pressing the Esc key. If you are | already at the prompt, type bye() to exit and save your progress. When you exit properly, you'll see | a short message letting you know you've done so.

```
| When you are at the R prompt (>):
| -- Typing skip() allows you to skip the current question.
| -- Typing play() lets you experiment with R on your own; swirl will ignore what you do...
| -- UNTIL you type nxt() which will regain swirl's attention.
| -- Typing bye() causes swirl to exit. Your progress will be saved.
| -- Typing main() returns you to swirl's main menu.
| -- Typing info() displays these options again.
```

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If it fails finding the "1: R programming" course

1. you may try to install the course with the following command:

```
> swirl::install_course("R_Programming")
```

2. The swirl website may also be temporary down and the "1: R programming" not accessible. If it happens, you can install the "R_Programming.swc" course manually from an archive repository:

https://web.archive.org/web/20200219034901/http://swirlstats.com/scn/R Programming.swc size (127 Ko)

Then, in R or Rstudio, install the course with this command:

> swirl::install_course()

and with Rstudio, select the "R_Programming.swc" file. If in R without Rstudio, enter the file name with its path.

You are now ready to start swirl and the R programming course (cf. previous slide)

Les types de variables et d'objets



Classes of R Objects

```
Main variable types
         numeric / integer
         character
         logical (FALSE / TRUE / NA)
         complex
         time, time series
         factors
wode() or typeof() returns the type of the object
class() returns the class of the object
is.logical() tells us if the object is a logical type.
   There is also is.character(), is.numeric(), is.integer(),
   is.null(), is.na() <
```

s.character(), as.numeric()...to coerce objects

from one type to another

```
> x <- c(3,7,1,2)
> x < 2
[1] FALSE FALSE TRUE FALSE
> x = = 2
[1] FALSE FALSE TRUE
> mode(x) # idem as class(x)
[1] "numeric"
> mode(s) # idem as class(s)
[1] "character"
> as.numeric( x < 2 )
[1] 0 0 1 0
```

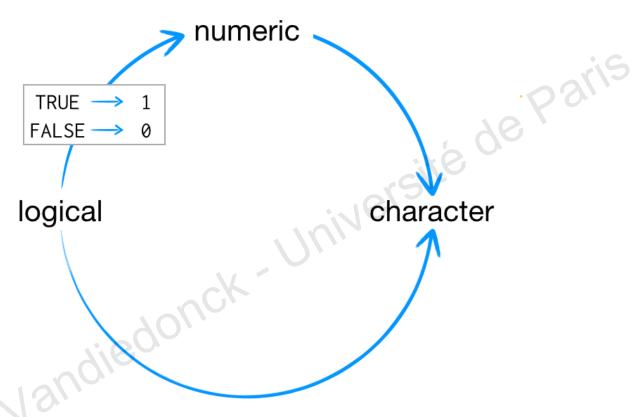
```
Special values: NA Not Available = missing data

NaN Not a Number = computation is not possible

-Inf/Inf positive and negative infinites

NULL 02/02/202the value does not exist (rather than being unknown)
```

Coercion rules



- if character strings are present, everything will be coerced to a character string.
- otherwise logical values are coerced to numbers: TRUE is converted to 1, FLASE to 0
- values are converted to the simplest type required to represent all information
- object attributes are dropped
- the ordering is roughly:

logical < integer < numeric < complex < character < list

Classes of R Objects

Main data structures

object	Heterogeneous = several types may coexist
vector	no
matrix	no
dataframe	yes
list	yes

Les vecteurs

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The most elementary R object

Some functions to create vectors: c(), seq(), x:y, rep(), append()...

```
> a <- c()
              # creates an empty vector that can be further filled
> a
NULL
> weight <- c(60, 72, 57, 90, 95, 72) #c() stands for concatenate
> weight
[1] 60 72 57 90 95 72
> 4:10
[1] 4 5 6 7 8 9 10
> seq(4,10) # returns all numeric values from 4 to 10 (with an increment of 1 =default)
[1] 4 5 6 7 8 9 10
> seg(2,10,2) # returns all numeric values from 1 to 10 with an increment of 2
[1] 2 4 6 8 10
> rep(4, 2) # repeats 4 twice
[1] 4 4
```

You may combine functions which are read from inside to the outside:

```
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> rep(seq(4,10),2)
[1] 4 5 6 7 8 9 10 4 5 6 7 8 9 10
> c(rep(1,4), rep(2,4))
[1] 1 1 1 1 2 2 2 2
```

A vector is homogeneous

```
> c(5,s)
[1] "5" "this is a string of characters" #5 is not read as an integer
                                   # it is converted/coerced into a character with " "
> mode(c(5,s))
[1] "character"
> class(c55,s))
[1] "character"
```

To get its size and data type, use fonctions length() and str() (for structure)

```
> length(1:10)
                                              # the vector is of size 10
[1] 10
                                              # the vector is of size 6
> length(weight)
[1] 6
                                              # the vector is of size 6 with numeric values
> str(weight)
num [1:6] 60 72 57 90 95 72
```

You may apply arithmetic operators on numeric values in vectors:

```
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   to add
   to substract
   to multiply
   to divide
   to raise to the power (or **)
%% to estimate the remainder of a division (modulo)
```

```
>size <- c(1.75, 1.8, 1.65, 1.9, 1.74, 1.91)
>size^2
[1] 3.0625 3.2400 2.7225 3.6100 3.0276 3.6481
>bmi <- weight/size^2 # creates a vector with the computed body mass index
>bmi
[1] 19.59184 22.22222 20.93664 24.93075 31.37799 19.73630
```

You may apply pre-computed functions, in particular some descriptive stat functions

```
> size
[1] 1.75 1.80 1.65 1.90 1.74 1.91
                                       # sorts the data
> sort(size)
[1] 1.65 1.74 1.75 1.80 1.90 1.91
> mean(size)
[1] 1.791667
                                       # returns the standard deviation
> sd(size)
[1] 0.1002829
> median(size)
[1] 1.775
> min(size)
[1] 1.65
> max(size)
[1] 1.91
> range(size)
[1] 1.65 1.91
> summary(size)
 Min. 1st Qu. Median
                        Mean 3rd Qu.
 1.650
       1.742 1.775
                              1.875
```

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Retrieving a value within a vector using its index (R is 1-based)

```
> size
[1] 1.75 1.80 1.65 1.90 1.74 1.91
                        # returns the 1st value within vector "size"
> size[1]
[1] 1.75
> size[2]
                        # returns the 2<sup>nd</sup> value within vector "size"
[1] 1.8
                        # returns the 6<sup>th</sup> value within vector "size"
> size[6]
[1] 1.91
                        # returns the 2<sup>nd</sup> and the 6<sup>th</sup> value within vector "size"
> size[c(2,6)]
[1] 1.80 1.91
> size[c(6,2)]
                        # returns the 6<sup>th</sup> and the 2<sup>nd</sup> value within vector "size"
[1] 1.91 1.80
> min(size[c(6,2)]) # returns the min between the 6<sup>th</sup> and the 2<sup>nd</sup> value
[1] 1.80
```

Attributing names to values of a vector after or at the creation of the vector

```
> names(size)
[1] NULL
                   # there are currently no names
> names(size) <- c("Fabien", "Pierre", "Sandrine", "Claire", "Bruno", "Delphine")
                   # names the values of the vector "size"
> size
Fabien Pierre Sandrine Claire Bruno Delphine
  1.75
         1.80
                1.65
                       1.90
                              1.74
> str(size)
Named num [1:6] 1.75 1.8 1.65 1.9 1.74 1.91
- attr(*, "names")= chr [1:6] "Fabien" "Pierre" "Sandrine" "Claire" ...
> my vector <- c("one"=1, "two"=2, "three"=3) # or giving the names at the vector creation
> my vector
 one two three
> str(my_vector)
Named num [1:3] 1 2 3
- attr(*, "names")= chr [1:3] "one" "two" "three"
```

Summary on vectors

Format	one-dimension
Datatype	homogeneous: only one type of character, numeric, logical, factor> ceorcion if heterogeneous - check with class() or mode() - checking type with is.num(), is.charachter(), conversion with as.num(), as.charachter(),

Creation	c(),:,seq(), rep(),sample(),rnorm(),

```
Adding new items c()
```

```
Size length()
```

Filling

Naming

Les matrices

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Matrix

Matrix: 2-dimension object (rows x columns) contains only one kind of variables (eg. numeric) = homogeneous

\$\top \text{fonctions to create a matrix}\$

rbind() to append rows

matrix()

```
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    cbind() to bind columns
> myData <- matrix(c(1,2,3, 11,12,13), nrow = 2, ncol = 3, byrow = TRUE)
> myData
    [,1] [,2] [,3]
                  # returns a matrix of 2 rows and 3 columns
[1,] 1 2 3
                  # it is filled by rows with the data provided in vector c(1,2,3, 11,12,13)
[2,] 11 12 13
> myData <- matrix(c(1,2,3, 11,12,13), nrow = 2, ncol = 3, byrow = FALSE)
> myData
    [,1] [,2] [,3]
                   # same but filling the matrix by columns = the default
[1,] 1 3 12
[2,] 2 11 13
> length(myData) # total number of elements (like a vector, elements read by columns)
[1] 6
                   # returns the 4th element read by columns
> myData[4]
[1] 11
```

Matrix indexes

Indexes and dimensions:

```
> myData

[,1] [,2] [,3]

[1,] 1 3 12

[2,] 2 11 13

Dim(myData)

[1] 2 3
```

```
Note the indexes separated by a comma:

[i,] indicates the i<sup>th</sup> row
```

[,j] indicates the jth column

Subsetting matrices into vectors:

```
# returns the value of the 1st row and 2<sup>nd</sup> column
> myData[1,2]
[1] 3
                    # returns the value of the 2nd row and 1st column
> myData[2,1]
[1] 2
> myData[,1]
                     # returns the values of the vector corresponding to the 1st column
[1] 1 2
> myData[2,]
                     # returns the values of the vector corresponding to the 2<sup>nd</sup> row
[1] 2 11 13
> myData[,2:3]
                     # subsets the initial matrix returning a sub-matrix
                     # with all rows of the 2<sup>nd</sup> and 3<sup>rd</sup> columns from the initial matrix
    [,1] [,2]
                    # the generated matrix has 2 rows and 2 columns
    3 12
[2,] 11 13
> dim(myData[,2:3]) # the generated matrix has 2 rows and 2 columns
```

Matrix structure and dimension

Getting dimension and structure of a matrix:

```
> dim(myData)
[1] 2 3
> mode(myData) # returns the type of data
[1] "numeric"
> class(myData) # returns the kind of object
[1] "matrix"
> class(myData[,1]) # reminder for vectors, class returns the type of data and not vector itself
[1] "numeric"
> str(myData)
num [1:2, 1:3] 1 2 3 11 12 13 # data type and dimensions
```

Or look at the length of the rows and of the columns

```
> nrow(myData)
[1] 2
> ncol(myData)
[1] 3
> length(myData[1,])  # length of the first row = hence number of columns
[1] 3
> length(myData[,1])  # length of the first column = hence number of rows
[1] 2
> dim(myData)[1]  # the first dimension = hence number of columns
[1] 2
```

Creating an empty matrix

```
> newmatrix <- matrix(NA, 2,3) # or matrix(, 2,3) with NA by default
                      lonck Université de Paris
> newmatrix
      [,1] [,2] [,3]
[1,]
       NA
             NA
                  NA
[2,]
       NA
             NA
                  NA
> dim(newmatrix)
[1] 2 3
> is.na(newmatrix)
    [,1] [,2] [,3]
[1,] TRUE TRUE TRUE
[2,] TRUE TRUE TRUE
> mode(newmatrix)
[1] "logical"
> class(newmatrix)
[1] matrix
> str(newmatrix)
logi [1:2, 1:3] NA NA NA NA NA NA
```

Filling a matrix

```
> newmatrix[2,3] <- "toto" # filling the 2nd row and 3rd column value
                                                    té de Paris
> newmatrix
[,1] [,2] [,3]
[1,] NA
           NA
                 NA
[2,] NA
           NA "toto"
                              # filling the 1st column with same values
> newmatrix[,1] <- "tutu"</pre>
> newmatrix
     [,1] [,2] [,3]
[1,] "tutu" NA
                   NA
[2,] "tutu" NA "toto"
> newmatrix[,2] <- c("titi" ,"tata"</pre>
                               # filling the 2nd column with different values
> newmatrix
     [,1] [,2]
[1,] "tutu" "titi" NA
[2,] "tutu" "tata" "toto"
                         #testing whether the values in the matrix are missing values
> is.na(newmatrix)
[,1]
      [,2] [,3]
                                #only the 3 values in first row was NA
[1,] FALSE FALSE
                    TRUE
    FALSE FALSE FALSE
```

Creating a matrix with cbind/rbind

with cbind(): binding vectors by columns

```
> myData2 <- cbind(weight, size, bmi) # creates another matrix binding vectors as columns
>row.names(myData2)
[1] "Fabien"
              "Pierre" "Sandrine" "Claire"
                                                            "Delphine"
                                                 "Bruno"
                                   Université de
> myData2
           weight size bmi
Fabien
             60 1.75 19.59184
             72 1.80 22.22222
Pierre
Sandrine
             57 1.65 20.93664
           90 1.90 24.93075
Claire
Bruno
          95 1.74 31.37799
Delphine 72 1.91 19.73630
```

- with rbind(): binding vectors by rows
- > myData3 <- rbind(weight, size, bmi)
- > myData3

```
Fabien Pierre Sandrine Claire Bruno Delphine weight 60.00000 72.00000 57.00000 90.00000 95.00000 72.0000 size 1.75000 1.80000 1.65000 1.90000 1.74000 1.9100 bmi 19.59184 22.22222 20.93664 24.93075 31.37799 19.7363
```

> t(myData2) # transpose myData2 -> we obtain the same matrix as myData3!

```
Note: t() is a function, so do not call an R object t!
Use a color-case text editor for R to know reserved words
```

Row/column names of matrices

Names of rows and columns are stored in a vector:

```
> rownames(myData2)
                                # returns the vector of the names of the rows
[1] "Fabien" "Pierre" "Sandrine" "Claire" "Bruno" "Delphine"
> colnames(myData2)
                                # returns the vector of the names of the column
[1] "weight" "size" "bmi"
> rownames(myData)
                                # the vector is empty for this other object
NULL
                                # the vector is empty for this other object
> colnames(myData)
NULL
```

Giving names to rows and columns:

```
> colnames(myData) <- c("one", "two", "three") # gives names to columns
> rownames(myData) <- c("A", "B")</pre>
                                              # gives names to rows
> myData
one two three
A 1 3 12
B 2 11 13
```

<u>Subsetting matrices using row/column names:</u>

```
> myData["B",]
                       # gets row called "B"
one two three
    11 13
> myData[,"two"]
                       # gets column called "two"
A B
3 11
                           02/02/2021
```

Functions on matrices

As expected, operators work on numeric matrices:

All columns of a matrix can be explored at once with some functions

But most functions need to specify the vector corresponding to the column of interest

```
> mean(myData2)
[1] 33.08587 # mean of all data
> mean(myData2[,1]) # mean of the vector corresponding to
[1] 74.33333 # the first column only
```

Summary on matrices

Format two-dimensions

Datatype class() to check it is a matrix

homogeneous: only one type of character, numeric, logical, factor

-> ceorcion if heterogeneous -> check with mode()

Creation matrix(), cbind(), rbind()

Adding new items cbind(), rbind()

Size length() -> nb of items

Dim dim(), str()

Slicing my_vector[i,j]

Filling my_vector[i,j] <- "toto"

Naming colnames(), rownames()

Saving data...

I can save the whole data in a single .Rdata object:

```
> save.image(file="Prerequis.RData")
```

Or I can save only some anthropometric data (weigth, size and bmi):

```
> save(weight, size, bmi, file=" anthropo.Rdata")
```

I can load them in a new R session with the following command:

```
> load("anthropo.Rdata")
> ls()
[1] "bmi" "size" "weight"
```