

#### March, 04<sup>th</sup> 2020 DU Bioinformatique intégrative Module 3: « R et statistiques »





### Bases de R et Rmd

Teachers: Claire Vandiedonck, Antoine Bridier-Nahmias

Helpers: Jacques van Helden, Anne Badel

Le script "DUBii\_R\_Session1.R" reprenant l'ensemble du code présenté dans ce diaporama est disponible sur github

### Plan du module et intervenants

Responsables: Claire Vandiedonck et Jacques van Helden

Autres intervenants: Guillaume Achaz, Anne Badel, Magali Berland, Antoine Bridier-Nahmias, Olivier Sand,

Natacha Cerisier,

Site Web: <a href="https://du-bii.github.io/module-3-Stat-R/">https://du-bii.github.io/module-3-Stat-R/</a>

Jour	Horaire	Description		
4 mars	9h30 - 12h30	Bases de R et Rmd Claire Vandiedonck, Antoine Bridier-Nahmias		
5 mars	13h30 - 16h30	Statistiques descriptives, tests d'hypothèses, Figures et Paquets Claire Vandiedonck, Guillaume Achaz		
10 mars	14h30 - 17h30	Statistiques pour les données à haut débit Jacques van Helden, Claire Vandiedonck		
12 mars	9h00 - 12h00	Classification non supervisée Anne Badel, Jacques van Helden		
30 mars	10h00 - 13h00	Analyses exploratoires (ACP/MDS) et analyses d'enrichissement Magali Berland, Jacques van Helden		
30 mars	14h30 - 17h30	Classification supervisée et apprentissage Jacques van Helden, Olivier Sand		

#### Plan de la session

- 1. Start-R: connexion au serveur Rstudio de l'IFB
- 2. Vérification et consolidation des pré-recquis
- 3. Dataframes

Facteurs Listes

4. Programmation

**Executions conditionnelles** 

**Boucles** 

**Fonctions** 

5. Rmarkdown

### Poll: www.wooclap.com

Comment participer?







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**WEB** 

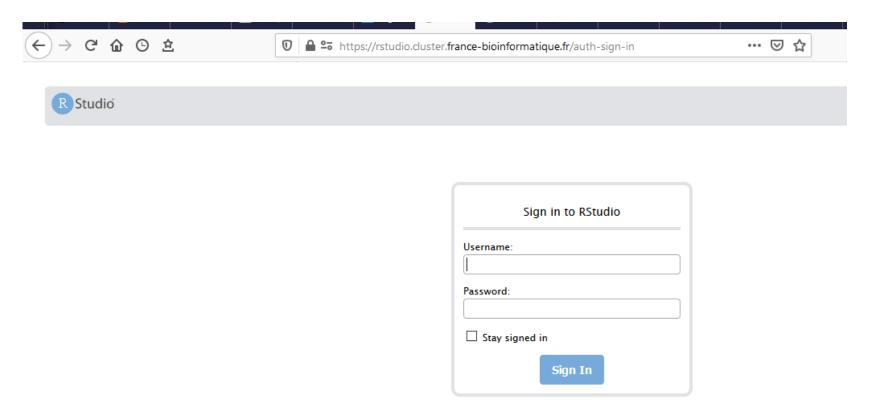
Vous pouvez participer

### 1. Start-R

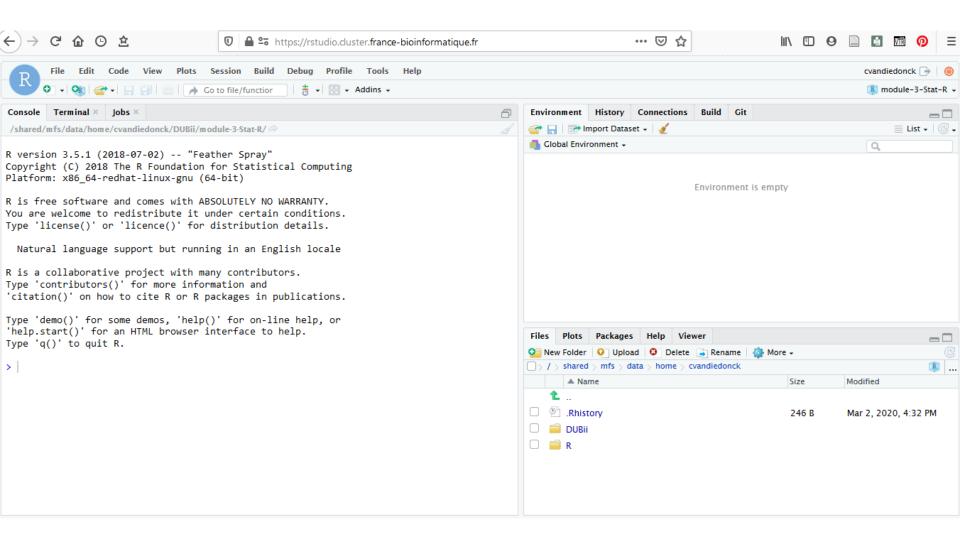
## First steps with R and Rstudio

### Connexion au serveur Rstudio de l'IFB

#### https://rstudio.cluster.france-bioinformatique.fr/



### Connexion au serveur Rstudio de l'IFB



### Tutorial start-R.html

#### For the next 10 minutes:

start-R activity with the Rstudio server of the IFB cluster by following the instructions of the start-R.html file

- > at the end of this activity, you must have uploaded in a dedicated folder:
- the « anthropo.Rdata » generated during the prerequisites activity
- the script of the slides of this R session 1

# 2. Prérecquis acquis?

### Let's check with a quizz!

#### Quizz on moodle:

- Si vous avez un compte ENT:

https://moodlesupd.script.univ-paris-diderot.fr/course/view.php?id=10629

- Si vous n'avez pas encore de compte ENT:

https://moodlesupd.script.univ-paris-diderot.fr/course/view.php?id=13420

mot de passe: dubii2020

### Summary on vectors

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

one-dimension

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

```
Size length()
```

**Format** 

Filling

**Naming** 

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names()

### 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()

# 3. dataframes



### Dataframe

Dataframe = two-dimensional object that can be heterogeneous,

Create a dataframe with function data.frame()

### Dataframe created with existing vectors

### Create a dataframe with function data.frame()

#### **Important:**

If vectors are character chains, use stringsAsFactors= FALSE to avoid their conversion into factors

- > class(myDataf) # but this is well a dataframe and not a matrix
- [1] "data.frame"
- > str(myDataf) # this one is a homogeneous dataframe with numeric vectors

```
'data.frame': 6 obs. of 3 variables:
```

\$ weight: num 60 72 57 90 95 72

\$ size : num 1.75 1.8 1.65 1.9 1.74 1.91

\$ bmi : num 19.6 22.2 20.9 24.9 31.4 ...

> dim(myDataf)

[1] 6 3

### A dataframe can be heterogeneous

create a new vector with characters and include it in the dataframe

```
> gender <- c("Man","Man","Woman","Woman","Man","Woman")</pre>
> gender
[1] "Man" "Man" "Woman" "Woman" "Man" "Woman"
> myDataf$sex <- gender # or use cbind
           # IMPORTANT: note that I directly specify the name by using a "$«
           # AND this method do not transform the vector as a factor!
> myDataf
         weight size bmi
                                 sex
Fabien
             60 1.75 19.59184
                                 Man
Pierre 72 1.80 22.22222 Man
Sandrine 57 1.65 20.93664 Woman
Claire 90 1.90 24.93075 Woman
Bruno 95 1.74 31.37799
                               Man
Delphine 72 1.91 19.73630 Woman
> str(myDataf) # this data.frame is heterogeneous with numeric and character values
'data.frame': 6 obs. of 4 variables:
 $ weight: num 60 72 57 90 95 72
 $ size : num 1.75 1.8 1.65 1.9 1.74 1.91
 $ bmi : num 19.6 22.2 20.9 24.9 31.4 ...
 $ sex
         : chr "Man" "Woman" "Woman"
```

### Creating an empty dataframe

```
creating an empty dataframe?
    > d <- data.frame()
    > d
    data frame with 0 columns and 0 rows
    > dim(d)
                                               BUT USELESS: impossible to fill!
    [1] 0 0
Better way: converting a matrix in a dataframe with function as.data.frame()
  > d <- as.data.frame(matrix(NA,2,3))</pre>
                                                       > class(myData2)
  > d
                                                       [1] "matrix"
   V1 V2 V3 # by default, col names are V1, V2, etc...
                                                       > class(as.data.frame(myData2))
  1 NA NA NA # while if you are using the function
                                                       [1] "data.frame"
  2 NA NA NA # data.frame() and not as.dataframe(),
                                                      You may also use data.frame on a
               #col names are called X1, X2, etc...
                                                      matrix generated by binding rows or
  > dim(d)
  [1] 2 3
                                                      columns
  > str(d)
                                                       > d2 <- as.data.frame(cbind(1:2, 10:11)
  'data.frame': 2 obs. of 3 variables:
                                                       > str(d2)
   $ V1: logi NA NA
                                                       'data.frame': 2 obs. of 2 variables:
   $ V2: logi NA NA
                                                       $ V1: int 12
   $ V3: logi NA NA
                                                       $ V2: int 10 11
```

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#### Row/Column names of dataframes

⇔ Either use same fonctions as for matrices rownames() and colnames()

Or better use the ones dedicated to dataframes row.names() and names()

```
> row.names(d)
[1] "1" "2"
> names(d)
[1] "V1" "V2" "V3"
```

Important: each row name must be unique!

Note: data.frames are a special case of a list of variables of the same number of rows with unique row names

### Extracting vectors from dataframes

Getting the vector corresponding to a column from a dataframe:

\$\text{\text{\$\\$}}\$ either by specifying its index

```
> myDataf[,2]
[1] 1.75 1.80 1.65 1.90 1.74 1.91
```

♦ Or by giving its name within the " " inside the squared brackets

```
> myDataf[,"size"]
[1] 1.75 1.80 1.65 1.90 1.74 1.91
```

♦ Or by giving its name after the character « \$ »

```
> myDataf$size
[1] 1.75 1.80 1.65 1.90 1.74 1.91
```

### Extracting rows from dataframes

Getting a « dataframe » corresponding to a row from a dataframe:

specifying its index

♦ Or by giving its name within the " " inside the squared brackets

### Let's summarize and give it a try

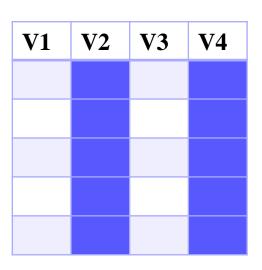
How do we create a dataframe?

Which are the three methods to slice datrames?

Which command should I use to extract the blue cells of the 3 dataframes below?

V1	V2	V3	V4

V1	V2	V3	V4



How to extract the even columns if I have 500 000 columns?

### Filtering dataframes on criteria

It generates a new dataframe

\$\times\$ use which() that returns the index of what is TRUE in the condition.

```
> which ( myDataf$sex == "Woman")
[1] 3 4 6
> myDataf [ which ( myDataf$sex == "Woman") , ]
         weight size bmi
             57 1.65 20.93664 Woman
Sandrine
Claire 90 1.90 24.93075 Woman
Delphine 72 1.91 19.73630 Woman
> str(myDataf [ which ( myDataf$sex == "Woman") , ])
'data.frame': 3 obs. of 4 variables:
 $ weight: num 57 90 72
 $ size : num 1.65 1.9 1.91
 $ bmi : num 20.9 24.9 19.7
 $ sex : chr "Woman" "Woman" "Woman"
```

#### **Important:**

you may enter
this without
including
« which »
BUT this would
not deal with NA
values
=> safer to use
which

Or what does not match using "!=" for "different" or "!" for "not" before the test

```
> which ( myDataf$sex != "Man")
[1] 3 4 6
> which (! myDataf$sex == "Man")
[1] 3 4 6
```

### Filtering dataframes on criteria

\$\times\$ use grep() that returns the index of what matches (even partially)

```
> grep("Wom", myDataf$sex)
[1] 3 4 6
> grep("Woman", myDataf$sex)
[1] 3 4 6
> myDataf [grep("Woman", myDataf$sex), ]
       weight size bmi
Sandrine 57 1.65 20.93664 Woman
Claire 90 1.90 24.93075 Woman
Delphine 72 1.91 19.73630 Woman
> grep("a", row.names(myDataf)) # returns indexes of rows with an "a" in its name
[1] 1 3 4
> myDataf [grep("a", row.names(myDataf)),]
         weight size bmi
                                 sex
Fabien 60 1.75 19.59184 Man
Sandrine 57 1.65 20.93664 Woman
Claire
             90 1.90 24.93075 Woman
```

### Filtering dataframes on criteria

Subsetting the rows on the columns:

\$\to\$ use subset(): the easiest and most efficient way!

```
> WomenDataf <- subset(myDataf, sex== "Woman")
```

> WomenDataf

```
      weight size
      bmi sex

      Sandrine
      57 1.65 20.93664
      Woman

      Claire
      90 1.90 24.93075
      Woman

      Delphine
      72 1.91 19.73630
      Woman
```

### Filtering dataframes on several criteria

#### Or more easily with subset()

Sandrine

```
> subset( myDataf, sex == "Woman" & weight < 80 & bmi > 20)

weight size bmi sex

Sandrine 57 1.65 20.93664 Woman
```

Woman

57 1.65 20.93664

### Tuto on logical values



#### Let's use the « swirl » library

- > 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()

Then follow the instructions and do tuto  $n^8$  Logic of the course "R Programming" => To study on your own

already at the prompt, type bye() to exit and save your progress. When you exit properly, you'll see

| You can exit swirl and return to the R prompt (>) at any time by pressing the Esc key. If you are

```
| 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.
```

### Adding new vectors to a dataframe

Either enter one vector at a time as a new variable

my\_dataframe\$new\_variable <- my\_variable

Or several vectors or subsets of dataframes at once

♥ Using data.frame()

mynew\_dataframe <- data.frame(data.frame1, data.frame2)
# this method will keep the data types of each data.frame</pre>

♥ Using cbind()

mynew\_dataframe <- cbind(data.frame1, data.frame2)
# BE CAREFULL: this method will keep the data types only if the
data.frames 1 and 2 had several variables.

If they have only one, these variables are converted as vectors and cbind will convert charcater strings as factors.

#### Merge two dataframes with a key

> myDataf\$index <- 1:6 #in this example I create a new column for the key, # but I may use an existing one

> myDataf

```
weight size
                       bmi
                                   index
                             sex
Fabien
            60 1.75 19.59184
                              Man
                                      1
Pierre
            72 1.80 22.22222
                              Man
Sandrine
            57 1.65 20.93664 Woman
            90 1.90 24.93075 Woman
Claire
          95 1.74 31.37799
                                      5
Bruno
                              Man
Delphine
            72 1.91 19.73630 Woman
                                      6
```

- > OtherData <- data.frame(c(1:5, 7),rep(c("right-handed","left-handed"),3))
- > names(OtherData) <- c("ID","handedness")</pre>
- > OtherData

ID handedness

- 1 1 right-handed
- 2 2 left-handed
- 3 3 right-handed
- 4 4 left-handed
- 5 5 right-handed
- 6 7 left-handed

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#### Merge two dataframes with a key

- > myDataf\$index <- 1:6
- > myDataf



	weight size	bmi	sex	<u>index</u>
Fabien	60 1.75	19.59184	Man	1
Pierre	72 1.80	22.2222	Man	2
Sandrine	57 1.65	20.93664	Woman	3
Claire	90 1.90	24.93075	Woman	4
Bruno	95 1.74	31.37799	Man	5
Delphine	72 1.91	19.73630	Woman	6

- > OtherData <- data.frame(c(1:5, 7),rep(c("right-handed","left-handed"),3))
- > names(OtherData) <- c("ID","handedness")</pre>
- > OtherData



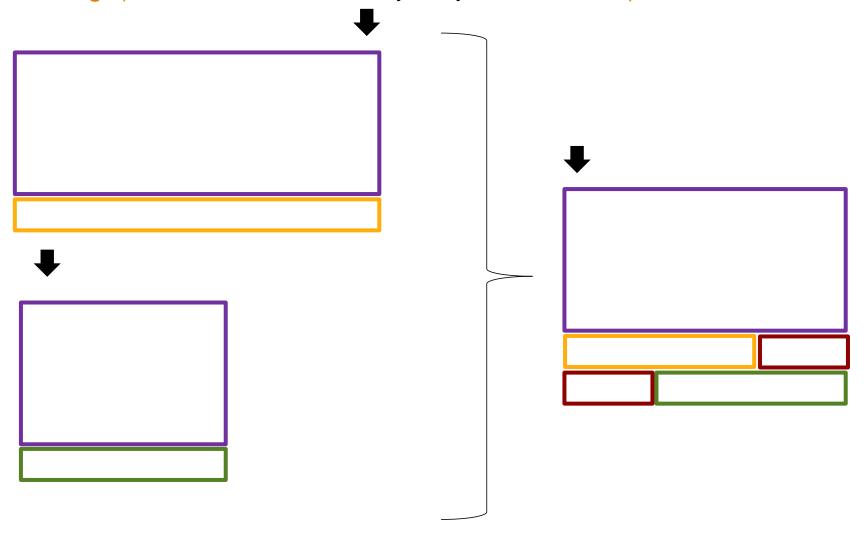
#### ID handedness

- 1 1 right-handed
  2 2 left-handed
- 3 | 3 right-handed
- 4 4 left-handed
- 5 right-handed
- 6 7 left-handed

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Merge two dataframes with a key

with merge(dataframe1,dataframe2,by="key" , all=T, sort=F)



#### Merge two dataframes with a key

```
> myMergedDataf <- merge(myDataf, OtherData, by.x="index", by.y="ID", all.x=T, all.y=T, sort=F)
```

> myMergedDataf



	index	weight	t size	e bm:	i sex	handedness
1	1	60	1.75	19.59184	Man	right-handed
2	2	72	1.80	22.2222	Man	left-handed
3	3	57	1.65	20.93664	Woman	right-handed
4	4	90	1.90	24.93075	Woman	left-handed
5	5	95	1.74	31.37799	Man	right-handed
6	6	72	1.91	19.73630	Woman	<na></na>
7	7	NA	NA	NA	<na></na>	left-handed

- ✓ unless the merge is done on the row.names(), the row.names of initial data.frames are lost -> the new data.frame has its own row names
- ✓ if two columns had the same name, a « .x » or a « .y » is added to the first/second

### Reading a text file into R

#### Read a text file using read.table():

```
> temperatures <- read.table("Temperatures.txt", sep="\t", header=T, stringsAsFactors=F)
>temperatures
    Month Mean_Temp
                                      specify the field
       January 2.0
                                      separator of the
    2 February 2.6
                                          text file
    3
      March 7.9
    4 April 11.2
                                                      TRUE if
    5 May 15.3
    6 June 22.2
                                                     header in
                                                     the text file
    7 July 22.9
    8 August 22.5
                                                                  FALSE to avoid
    9 September 17.3
                                                                  factorisation of
    10 October 11.7
                                                                 character vectors
    11 November 5.2
    12 December 2.8
> str(temperatures)
                                            # the R object is a dataframe !!!!
    'data.frame': 12 obs. of 2 variables:
    $ Month : chr "January" "February" "March" "April" ...
    $ Mean_Temp: num 2 2.6 7.9 11.2 15.3 22.2 22.9 22.5 17.3 11.7 ...
```

### Reading a text file into R

Warning: use stringsAsFactors=F otherwise vectors of character values converted into factors -> see below, the Months were factorized!!!!

```
> temperatures <- read.table("Temperatures.txt", sep="\t", header=T, stringsAsFactors=T)
> str(temperatures)
    'data.frame': 12 obs. of 2 variables:
     $ Month : Factor w/ 12 levels "April", "August", ..: 5 4 8 1 9 7 6 2 12 11 ...
     $ Mean_Temp: num 2 2.6 7.9 11.2 15.3 22.2 22.9 22.5 17.3 11.7 ...
> levels(temperatures$Month) # the levels of the factor are in alphabetic order
[1] "April" "August" "December" "February" "January" "July"
[7] "June" "March" "May" "November" "October" "September"
                                                                 TRUE is by
                                                                    default
```

### Factors in R

See tutorial Factors\_in\_R.html

Much care on:

- levels order
- coercion

=> To study on your own

### Reading a text file into R

#### Caution if:

- fewer names than columns in the header
- fewer columns than names in the header -> add argument fill=T to overcome the issue
- some rows with fewer columns -> add argument fill = T to overcome the issue
- using row.names=1 -> this cannot be used when several rows have the same name

#### Check the data.frame is as expected using:

```
str()
```

head() : displays the first 6 rows

tail(): displays the last 6 rows

and by displaying some rows in the middle of the file using their index

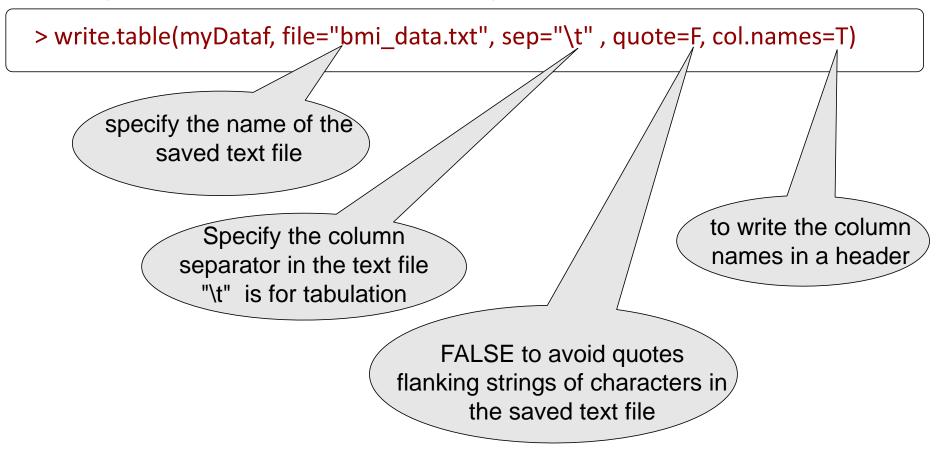
-> a general habit with any programmation language

Other functions: read.csv(), scan()

or read.xlsx() to read worksheet from an exel file with library « xlsx »

### Saving a dataframe as a text file in the working directory

Saving a dataframe into a text file using write.table()



Tutorial = basic\_R-structures.html

# Lists



# => To study on your own

#### Lists

A list is an R object that can contains:

- heterogeneous elements including other lists unlike vectors
- all elements do not need to be of same dimensions unlike dataframes

We have already seen a list when looking at the names of the matrix 'myData2'

#### > str(myData2)

```
num [1:6, 1:3] 60 72 57 90 95 72 1.75 1.8 1.65 1.9 ...
- attr(*, "dimnames")=List of 2
..$ : chr [1:6] "Fabien" "Pierre" "Sandrine" "Claire" ...
..$ : chr [1:3] "weight" "size" "bmi"
```

## Creating a list

♦ Use list() to create an empty list

```
> L0 <- list()
> class(L0)
[1] "list
```

♦ Use list() to create a non-empty list filling it with other R objects

```
> x <- c("A", "B", "C")
> y <- 8:15
> L1 <- list(x, y)
> str(L1)
                               # the list L1 contains two elements
List of 2
 $ : chr [1:3] "A" "B" "C"
 $ : int [1:8] 8 9 10 11 12 13 14 15
> L1
                               # the first element's name
[1] "A" "B" "C"
                               # the first element's content
                               # the second element's name
[[2]]
     8 9 10 11 12 13 14 15 # the second element's content
```

# Creating a list

#### ♦ Add names to elements

```
> names(L1)
NULL
> names(L1) <- c("ID1","ID2")
> L1
$ID1
[1] "A" "B" "C"

$ID2
[1] 8 9 10 11 12 13 14 15
```

Or add names to elements when creating the list:

```
> L2 <- list("ID1"=x,"ID2"=y)
> L2
$ID1
[1] "A" "B" "C"

$ID2
[1] 8 9 10 11 12 13 14 15
```

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# Accessing to list elements

Use [[ i ]] to get the i<sup>th</sup> element of the list

```
>L1[[2]]
[1] 8 9 10 11 12 13 14 15
```

\$\times\$ or using the name of the element

```
> L1[["ID2"]]
[1] 8 9 10 11 12 13 14 15
```

\$\times\$ or using \$ followed by the name of the element if there is one

```
> L1$ID2
[1] 8 9 10 11 12 13 14 15
```

# Adding a new element to a list

```
♥ Use [[ i ]]
> L1[[3]] <- matrix(1:4,2,2)
> L1
$ID1
[1] "A" "B" "C"
$ID2
[1] 8 9 10 11 12 13 14 15
[[3]]
     [,1] [,2]
[1,] 1 3
[2,] 2 4
```

```
♦ or give a name
```

```
> L1[["m1"]] <- matrix(1:4,2,2)
```

♦ or using \$ followed by the name of the element if there is one

```
> L1$m2 <- matrix(1:4,2,2)
```

# Removing an element from a list

#### ♥ Use NULL

```
> L1[[3]] <- NULL
> L1
$ID1
[1] "A" "B" "C"
$ID2
[1] 8 9 10 11 12 13 14 15
$m1
    [,1] [,2]
[1,] 1 3
[2,] 2 4
$m2
    [,1] [,2]
[1,] 1 3
[2,] 2 4
```

4. Programming

# 4.1 Conditional executions

=> To study on your own

#### Conditional executions: the basis

#### Aim:

- To perform a test with a logical outcome
  - comparison: ==, != (different), >, < , >=, <=
  - what is included in a vector using : %in%
  - etc...
- And if the outcome is « TRUE » to execute the commands between { and }

#### Syntax:

using if(« the condition ») followed by {«commands to be performed if TRUE»}

```
if (condition){
   instruction 1
   instruction 2
   ...
}
```

```
> a <- 0
+ if (a == 0) {
+ print ("hello")
+ }
[1] "hello"

> if (a != 0) {
+ print ("a is different from zero")
+}

> # here R did not execute print ("a is different from zero")
# since the condition was FALSE)
```

#### Conditional executions: alternative conditions

#### Syntax:

using if(« the condition ») followed by {«commands to be performed if TRUE»} adding else() followed by {«alternative commands if condition was FALSE»} adding else if() followed by {«alternative commands if new condition is TRUE»}

```
a <- 3
if (a < 3.14) {
    print ("a is < 3.14 ")
    } else {
    print ("a is > 3.14")
}
[1] "a is < 3.14 "
```

```
a <- 3.14

if (a < 3.14) {
    print ("a is < 3.14 ")
    } else if (a > 3.14){
    print ("a is > 3.14")
    } else {print ("a is equal to 3.14")
}

[1] "a is equal to 3.14 "
```

# Conditional executions: multiple conditions (1)

#### Example with multiple conditions:

```
using « & » = et, « | » = or
```

```
a <- 11
if ( (a < 2) & (a < 10) ) {
  print ("both conditions are true")
} else if ( (a < 2) | (a < 10) ) {
  print ("one of the two conditions is true")
} else {
  print ("none of the conditions is verified")
}
[1] "none of the conditions is verified"</pre>
```

```
if ( (a < 2) & (a < 10) ) {
  print ("both conditions are true")
} else if ( (a < 2) | (a < 10) ) {
  print ("one of the two conditions is true")
} else {
  print ("none of the conditions is verified")
}
[1] "one of the two conditions is true"</pre>
```

# Conditional executions: multiple conditions (2)

● If your conditions are not mutually exclusive, order carefully your conditions

```
a <- 1
if ( (a < 2) & (a < 10) ) {
  print ("both conditions are true")
} else if ( (a < 2) | (a < 10) ) {
  print ("one of the two conditions is true")
} else {
  print ("none of the conditions is verified")
}
[1] "both conditions are verified"</pre>
```

```
if ( (a < 2) | (a < 10) ) {
  print ("one of the two conditions is true")
} else if ( (a < 2) & (a < 10) ) {
  print ("both conditions are true")
} else {
  print ("none of the conditions is verified")
}
[1] "one of the two conditions is true"</pre>
```

R executes the command of the 1<sup>rst</sup> condition which is TRUE

# Fonction ifelse()

#### ifelse()

- returns a vector of same length as the length of the tested vector
- for each element of the tested vector, the elements of the returned vector are defined depending on whether the condition is TRUE or FALSE

```
syntax: ifelse( test, yes, no )
```

```
a <- 3
ifelse(a == 3.14, "a is equal to pi", "a is different from pi" )
[1] "a is different from pi"
a <- 3.14
ifelse(a == 3.14, "a is equal to pi", "a is different from pi" )
[1] "a is equal to pi"</pre>
```

```
norm_values <- rnorm(10, 0, 1)
below_median <- ifelse(norm_values < median(norm_values), TRUE, FALSE)
table(below_median)
below_median
FALSE TRUE
5 5
```

# 4.2. Loops

## Loops / iterations

Aim: repeat a command or a set of commands several times for each value of the variable

```
for(i in 1:6){
    print(i)
}
[1] 1
[1] 2
[1] 3
[1] 4
[1] 5
[1] 6
```

```
counter <- 0
for (i in seq(5,8)) {
          counter <- counter + i
          cat(counter, "\n")
}
5
11
18
26</pre>
```

```
teachers <- c("Pierre","Claire")
for (t in teachers) {
      cat(t,"was one of my bioinformatics teachers \n")
}
Pierre was one of my bioinformatics teachers
Claire was one of my bioinformatics teachers</pre>
```

# Loops and condition

#### Fonction while()

executes the instruction as long as the condition is TRUE, stops as soon as the condition is FALSE

#### syntax:

```
i <- 0
while (i < 5) {
    i <- i + 1
    print(i)
}
[1] 1
[1] 2
[1] 3
[1] 4
[1] 5</pre>
```

# 4.3. Vectorization

#### Vectorization instead of iterations

Unlike in other programming languages, in R vectorization makes some loops implicit and is computationnally more efficient

```
Exemple: weight <- c(60, 72, 57, 90, 95, 72)

computing the BMI size <- c(1.75, 1.8, 1.65, 1.9, 1.74, 1.91)
```

Using loops

```
bmi <- numeric(length(weight))
for (i in 1:length(bmi)) {
          bmi[i] <- weight[i] / size[i]^2
}
bmi
[1] 19.59184 22.22222 20.93664 24.93075 31.37799 19.73630</pre>
```

Using vectorization (to be preferred): only if vectors of same length!

```
bmi <- weight/size^2
bmi
[1] 19.59184 22.22222 20.93664 24.93075 31.37799 19.73630
```

## Vectorization again!

# Vectorization is more efficient to replace values in a vector than conditional executions in loops

Using loops and condition

```
for (i in 1:length(bmi)){
   if (bmi[i] > 30) {
      bmi[i] <- "obesity"
   } else if ( bmi[i] < 25) {
      bmi[i] <- "normal"
   } else (bmi[i] <- "overweight")
   }
   bmi
[1] "normal" "normal" "normal" "obesity" "normal"</pre>
```

Using logical indexing of vectors (to be preferred)

```
bmi[which(bmi > 30)] <- "obesity"
bmi[which(bmi < 25)] <- "normal"
bmi[which(bmi <= 30 & bmi >= 25 )] <- "overweight"
bmi
[1] "normal" "normal" "normal" "obesity" "normal"</pre>
```

# 4.4. Writing your own functions

#### Your own R functions?

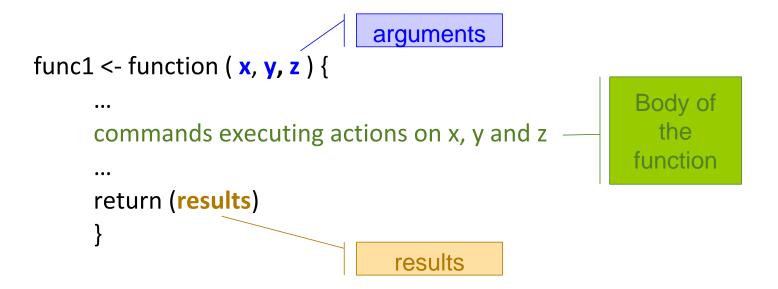
#### Why?

Allows efficient, flexible and rational use of R, if you want to redo an operation in different situations

#### **Properties**

Similar structure as native R functions, except there is no help menu

- name
- arguments put within brackets to execute the command



#### **Functions**

#### **Syntax** uses two functions:

```
myFunction <- function (argument1, argument2) {
    myResult <- « what you want to do with arguments 1 and 2 »
    return(myResult)
}
```

- 1. function() followed by {}
  - assign the function to the name of the function (not already implemented in R)
  - specify the names of the created function parameters as « arguments » within the ();
     you may specify default values with =

**2. return()** inside the **{}** of the function so that the output of the function can be saved outside of the function space; if multiple results, they must be stored in a single output in a list format

1. The name of your own function must not be a native R function, otherwise the native R function is overwritten

#### exemple not to do:

```
mean <- function (x) {
return (x^2)
}
mean(c(3,4))
[1] 9 16  # it returns the squared values of 3 and 4 and not the mean of 3 and 4
rm(mean)  # if you run the above command to restore the native mean function!
```

#### 2. The function space is closed

The argument names, all the variables created inside the functions and the results exist only within the enclosed function space!

- All the required objects must be arguments of the function or they must be defined in the body of the function
- Risk to call an R object that is outside your function: by default, if the object is not defined in your function, R looks for it outside the function

```
rm(a)
func <- function (x) {
    x <- x+a
    return(x^2)
}

func(2)
Error in x + a : non-numeric argument to binary operator</pre>
```

```
a <- 2
func <- function (x) {
        x <- x+a
        return(x^2)
}

func(2)
[1] 16

# can also be run on a vector
func(c(2,3,10))
[1] 16 25 144</pre>
```

#### 2. The function space is closed

The argument names, all the variables created inside the functions and the results exist only within the enclosed function space!

- By defaults, R uses the object defined in your function

```
a <- 2
func2 <- function (x, a) {
    x <- x+a
    return(x^2)
func2(2,3)
              # it uses a defined as an argument in the enclosed function
              #and not a=2 which is in your R workspace
[1] 25
func2(2,10)
               # idem
[1] 144
func2(2)
Error in func2(2): argument "a" is missing, with no default
# a is a required argument and is not passed to the function
# it cannot use a=2 which is in your workspace instead
```

# Arguments in your own functions

- Several arguments can be passed to your function
- They can be of different types: numeric, logical, factors, vectors, matrices, dataframes, lists...and even functions!
- They are defined by their name or by their order

```
func3 <- function (x, a) {
     x < -x + 2*a
     return(x^2)
func3(2,5)
[1] 144
func3(x=2, a=5)
[1] 144
func3(a=5, x=2)
[1] 144
func3(5,2)
[1] 81
```

#### 3. Do not hesitate to assign default values to the arguments

- > more robust function

```
func4 <- function (x, a=4) {
        x <- x+a
        return(x^2)
}

func4(2,5)
[1] 49

func4(2)  # since there is a default value for a, there is no need to
[1] 36  # specify it</pre>
```

#### Function results

By default, the returned result is the last object of the function body

It is recommanded to return the result with the function return()

If more than one result has to be returned, use a list to store results and return the list

```
func <- function (x) {
    temp <- x ^2
    return(temp)
}
func(2)
[1] 4
```

```
func <- function (x) {
     temp1 <- x ^2
     temp2 <- temp1^x
     results <- list(res1=temp1, res2=temp2)
     return(results)
     }
  func(2)
  $res1
  [1] 4

$res2
  [1] 16</pre>
```

#### **Functions**

#### > Examples

```
rm ( list=ls() )
f1 <- function( a,b ){
    Op <- a + b
}
f1(a = 6, b = 20) # the result is not shown
ls()
[1] "f1" # the results is not saved in R</pre>
```

#### Add return()

```
rm ( list=ls() )
f1 <- function( a,b ){
    Op <- a + b
    return(Op)
}
f1(a = 6, b = 20)
[1] 26
ls()
[1] "f1" # the results is not saved in R</pre>
```

Assign the result of the function



```
rm ( list=ls() )
f1 <- function( a,b ){
    Op <- a + b
    return(Op)
}
res1 <- f1(a = 6, b = 20)
ls()
[1] "f1" "res1" # the results is saved in R
res1
[1] 26</pre>
```

#### **Functions**

#### > Examples

```
rm(list=ls())
a <- 27
f1 <- function(a, b){
   Op <- a + b
   return(Op)
f1(a = 6, b = 20) # it uses the a value you
                 # assign within the function
[1] 26
ls()
[1] "a" "f1"
          # a within the R session is not
[1] 27 # modified by the function
```



It is thus highly recommanded to use different names for your R objects within function space and within your R session to avoid any confusion!

# Exemple: writing a function to compute the bmi

➤ How?

Tutorial: R-programing\_intro.html

# 4.5. To go further: writing an R programm

=> To study on your own

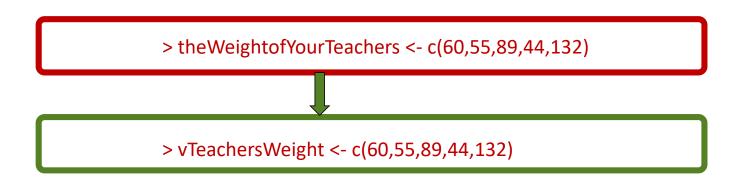
- ✓ Use a text editor with R syntactic coloration: eg TinnR, notepad++
- Pairing (), {}, " ", []...
- With a clear indentation for functions, loops,...

```
all.cp.signif = NULL
acp.eig = PCA(desc.prox.sle, graph = FALSE)$eig[,1]
for (i in 1:nbrSimul){
    #random matrix
    mat.alea = NULL
   for (i in 1:dim(desc.sle.lig)[2]){
        desc.perm = sample(desc.sle.lig[,i])
       mat.alea = cbind(mat.alea, desc.perm)
   colnames(mat.alea) = colnames(mat.desc)
   #compute the CP
   acp.Alea.eig = PCA(mat.alea, graph = FALSE)$eig[,1]
   mat.cp = cbind(acp.eig , acp.Alea.eig)
   vCP.signif = NULL
   for (i in 1:dim(mat.cp)[1]){
        if( mat.cp[i,1] >= mat.cp[i,2]) {
           vCP.signif = c(vCP.signif, i)
    all.cp.signif = c(all.cp.signif, vCP.signif)
countCP = table( all.cp.signif)
signifCP.sle = names(which(countCP>= nseuil))
```

```
all.cp.signif = NULL
acp.eig = PCA(desc.prox.sle, graph = FALSE)$eig[,1]
for (i in 1:nbrSimul){
    #random matrix
    mat.alea = NULL
   for (i in 1:dim(desc.sle.lig)[2]){
        desc.perm = sample(desc.sle.lig[,i])
       mat.alea = cbind(mat.alea, desc.perm)
    colnames(mat.alea) = colnames(mat.desc)
    #compute the CP
    acp.Alea.eig = PCA(mat.alea, graph = FALSE)$eig[,1]
    mat.cp = cbind(acp.eig , acp.Alea.eig)
   vCP.signif = NULL
    for (i in 1:dim(mat.cp)[1]){
        if( mat.cp[i,1] >= mat.cp[i,2]) {
            vCP.signif = c(vCP.signif, i)
    all.cp.signif = c(all.cp.signif, vCP.signif)
countCP = table( all.cp.signif)
signifCP.sle = names(which(countCP>= nseuil))
```

#### ✓ Explicitly name the variables:

- avoid reserved terms = prebuilt R functions or parameters -> identified by proper text editors
- strings of characters in Camel type: starts with small letters, caps for the first letter of each new word, may be separated by « . » or « \_ »
- never start with a number
- no special characters
- try to use a letter defining the type of variable: v for vector, ma for matrix, d for datafarme, I for list, f for factor...



- ✓ An understandable script for you and others
- one command per line, leave blank lines between blocks
- using clear indentations

```
> valCount <- 0; randomVal <- rnorm(1000,3,5) ; for (i in randomVal) {if (i >=3) { valCount <- valCount +1 }}
```

```
> valCount <- 0
randomVal <- rnorm(1000,3,5)
for (i in randomVal) {
    if (i >= 3)
    { valCount <- valCount +1 }
}
```

- well-organized: group paths for inputs and outputs in the same section, group variable assignations together, structure scripts with modular functions that can be reused rather than writing a single very large function
- easy to modify
- easy to understand inclunding later by you!

  Output

  Output

  Output

  Divinity Service DU Bii R Session 1 Vandiedonck C.

- An understandable script for you and others
- annotate your script by functions...but not every single command!

```
#computes the mean value of each UE
> vMeanMarkUE <- NULL
> for (i in 1:dim(mM1MEGMarks)[2]){
            valMean <- mean(mM1MEGMarks)[,i]
            vMeanMarkUE<- c(vMeanMarkUE,valMean)
}
>names(vMeanMarkUE) <- colnames(mM1MEGMarks)
```

- ✓ An understandable script for you and others
- Explain the usage of your script at the beginning, including the format of the input files
- Provide a command line example
- ✓ For Unix usage without opening R:
- At the fisrt line of your script, add the shebang:
  - #!/usr/bin/env Rscript -> to allow executing your script
- There are 3 ways to run an R script without opening R in Unix:
  - 1. R CMD BATCH [options] /path/myscript.R [path/out.file]
  - 2. R --vanilla < myscript.R
     or R --vanilla --args arg1 arg2 ... < /path/myscript.R if you
     want to pass arguments that you can get in the R code using the fonction
     commandArgs()</pre>
  - 3. Rscript /path/myscript.R arg1 arg2 path/out.file

#### Some further help in:

Genolini-RBonnesPartiques.pdf

Google's R Style Guide: https://google.github.io/styleguide/Rguide.xml

# 5. Rmarkdown

#### Markdown and R Mardown

#### Simple Markdown

https://dillinger.io/

https://stackedit.io/

https://www.tablesgenerator.com/markdown\_tables)

#### R code in markdown

➤ A live session!

Result file in COVID-19\_HK.nb.html

# Poll: www.wooclap.com

### Comment participer?







Connectez-vous sur www.wooclap.com/YYLPQH



Vous pouvez participer