

# Data Science, Séance 2 : rappels de R

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# R

language de haut niveau

support natif des valeur manquantes

programmation objet

éco-système vivant : beaucoup de packages

! plutôt permissif

[http://cran.r-project.org/doc/contrib/Lam-IntroductionToR\\_LHL.pdf](http://cran.r-project.org/doc/contrib/Lam-IntroductionToR_LHL.pdf)

...

# Les types de base

les vecteurs :

```
# vecteur d'entier  
a = c(1,5,10)  
class(a)
```

```
## [1] "numeric"
```

```
# de chaîne de caractère  
b = c("a","g","t","t","c","g","g")  
class(b)
```

```
## [1] "character"
```

permet de stocker des éléments de même type

opérations de bases c, length, seq, rep, indexation logique

## Les types de base

les vecteurs, manipulations de bases :

```
length(a)
```

```
## [1] 3
```

```
a[1:2]
```

```
## [1] 1 5
```

```
i = 1:2;a[i]
```

```
## [1] 1 5
```

```
i = seq(1,length(b),2);b[i]
```

```
## [1] "a" "t" "c" "g"
```

```
i = rep(1,5);b[i]
```

```
## [1] "a" "a" "a" "a" "a"
```

```
i = rep(c(1,2),5);b[i]
```

# Les types de base

les facteurs :

les vecteurs, manipulations de bases :

```
b = c("a", "g", "t", "t", "c", "g", "g")  
c = factor(b, levels=c("a", "t", "g", "c"))  
levels(c)
```

```
## [1] "a" "t" "g" "c"
```

```
unclass(c)
```

```
## [1] 1 3 2 2 4 3 3
```

```
## attr(,"levels")
```

```
## [1] "a" "t" "g" "c"
```

type particulier de vecteurs pour coder des catégories “les niveaux (levels)”

opérations de bases c, length, levels, unclass

! interprétation des chaînes de caractères comme des facteurs lors

# Les types de base

Les matrices :

```
# matrice d'entier  
a = matrix(c(1,5,10,10),2,2)  
# de chaine de caractère  
b = rbind(c("a","g"),c("t","t"),c("c","g"),c("t","g"))  
c = cbind(c("a","g"),c("t","t"),c("c","g"),c("t","g"))
```

permet de stocker des éléments de même type

opérations de bases dim, rbind, cbind, indexation logique

# Les types de base

Les matrices :

```
dim(b)
```

```
## [1] 4 2
```

```
t(b)
```

```
##      [,1] [,2] [,3] [,4]  
## [1,] "a"  "t"  "c"  "t"  
## [2,] "g"  "t"  "g"  "g"
```

```
dim(t(b))
```

```
## [1] 2 4
```

```
a[1,]
```

```
## [1] 1 10
```

```
b[,2]
```

```
## [1] "a" "t" "a" "a"
```

# Les types de base

Les arrays :

```
# tenseur de dimension 3
```

```
a = array(runif(50),dim=c(5,5,2))
```

```
a[1,,]
```

```
##           [,1]      [,2]
## [1,] 0.59250264 0.3788759
## [2,] 0.01461666 0.9791246
## [3,] 0.98855426 0.1024477
## [4,] 0.38479225 0.3306272
## [5,] 0.77685344 0.6458938
```

```
a[,5,]
```

```
##           [,1]      [,2]
## [1,] 0.7768534 0.6458938
## [2,] 0.8098877 0.5233838
## [3,] 0.1544904 0.6300769
## [4,] 0.1188639 0.3751761
```



# Les types de base

Les listes :

```
l = list(a,b,c)
length(l)
```

```
## [1] 3
```

```
l[[2]]
```

```
##      [,1] [,2]
## [1,] "a"  "g"
## [2,] "t"  "t"
## [3,] "c"  "g"
## [4,] "t"  "g"
```

```
l = list(a=a,b=b,c=c)
```

permet de stocker des éléments de type différents

opérations de bases length

# Les types de base

Les listes :

```
l$c
```

```
##           [,1] [,2] [,3] [,4]  
## [1,] "a"  "t"  "c"  "t"  
## [2,] "g"  "t"  "g"  "g"
```

```
l[[2]]
```

```
##           [,1] [,2]  
## [1,] "a"  "g"  
## [2,] "t"  "t"  
## [3,] "c"  "g"  
## [4,] "t"  "g"
```

permet de stocker des éléments de type différents

opérations de bases length

# Les types de base

Les data.frame :

```
d = data.frame(v1=rep("a",10),v2=1:10,v3=runif(10))
dim(d)
d$v1
d$v4 = factor(rep(c("a","b"),5),levels=c("a","b"))
d[d$v4=="a",]
d[, "v2"]
d[, c(3,1)]
d[, c("v2", "v4")]
names(d)
summary(d)
```

permet de stocker des éléments de type différents

= liste de vecteurs només indexable et manipulable comme une matrice

opérations de bases dim, cbind, rbind, names, summary

# Les fonctions

```
f = function(a,b){  
  return(a-b)  
}  
f(5,6)  
f(b=5,a=6)  
f = function(a=32,b=12){  
  a-b  
}  
f()  
f(5,6)  
f(b=5,a=6)
```

une variable comme une autre ?

argument nommé et valeur par défaut

pas besoin de return explicite

## Les structures de contrôle

```
for (i in 1:length(a)){  
while(i > 4){i=i-1}
```

! éviter les boucles for, while préférer les opérations vectorielle

```
a=runif(100000)  
t=Sys.time()  
for (i in 1:length(a)){a[i]=a[i]+5}  
t1=Sys.time()-t  
t1
```

## Time difference of 0.02120757 secs

Version vectorielle

```
t=Sys.time()  
a=a+5  
t2=Sys.time()-t  
t2
```

## Time difference of 0.01061177 secs

## Quelques fonctions vectorielles

somme (sum), somme cumulée (cumsum), différences finies (diff),  
max, min ...

```
a=data.frame(v1=runif(5000),v2=rnorm(5000),v3=rbinom(5000,5  
# opération algébrique de base  
a$v1+a$v2;a$v1*a$v2;a$v1/a$v2  
  
# produit matriciel  
t(a$v1)%*%a$v2  
  
# somme et somme cumulée  
sum(a$v2);cumsum(a$v1)  
  
# différence  
diff(a$v2)
```

## Quelques fonctions vectorielles

somme (sum), somme cumulée (cumsum), différences finies (diff),  
max, min ...

```
# max, min ...
```

```
max(a$v3)
```

```
which.max(a$v1)
```

```
which(a$v1>0.2)
```

```
# concatenation de chaine de caractères
```

```
paste(a$v1,a$v2);paste0(a$v1,a$v2)
```

```
# sommes sur les matrices
```

```
b=matrix(runif(100),10,10)
```

```
sum(b);rowSums(b);colSums(b)
```

## Apply, lapply, sapply

Appliquer une fonction à chaque élément d'un objet

```
a=data.frame(v1=runif(5000),v2=rnorm(5000),v3=rbinom(5000,5,0.2))  
# appliquer à chaque lignes  
r=apply(a,1,sum)  
head(r);class(r);dim(r)  
  
# appliquer à chaque colonnes  
r=apply(a,2,function(col){c(max(col),which.max(col))})  
r;class(r);dim(r)  
  
# appliquer à tous les éléments d'une liste  
b=list(v1=runif(5000),v2=rnorm(5000),v3=rbinom(5000,5,0.2))  
r=lapply(b,which.max)  
r;class(r)  
r=sapply(b,which.max)  
r;class(r)
```

à préférer aux boucles...



## Subset : sample, logical indexing

Sélectionner une partie des données

```
#logical indexing
```

```
a[a$v1>0.98 & a$v3==3,]
```

##		v1	v2	v3
##	300	0.9840597	0.1597652	3
##	1811	0.9834785	0.3147051	3
##	2179	0.9881766	-0.4846373	3
##	3595	0.9991476	-1.5718817	3

```
#fonction subset
```

```
subset(a,v1>0.98 & v3==3)
```

##		v1	v2	v3
##	300	0.9840597	0.1597652	3
##	1811	0.9834785	0.3147051	3
##	2179	0.9881766	-0.4846373	3
##	3595	0.9991476	-1.5718817	3

## Binning : cut

Prétraiter les variables pour construire des facteurs // intervalles

```
r=cut(a$v2,c(-Inf,-3,-2,2,1,Inf))  
class(r);head(r)
```

```
## [1] "factor"
```

```
## [1] (-2,1] (-2,1] (-2,1] (-2,1] (-2,1] (-2,1]
```

```
## Levels: (-Inf,-3] (-3,-2] (-2,1] (1,2] (2, Inf]
```

## Jointure : merge, %in%, match

```
a=data.frame(id=1:500,val1=runif(500))  
b=data.frame(id=sample(500,500),val2=runif(500))
```

```
# jointure par colonne de même nom  
c=merge(a,b)
```

```
# recherche des indices de correspondances  
match(a$id,b$id)[1:10]
```

```
## [1] 452 93 475 45 464 144 447 232 168 319
```

```
# jointure manuelle  
d=cbind(a,b$val2[match(a$id,b$id)])  
sum(d!=c)
```

```
## [1] 0
```

## Jointure : merge, %in%, match

```
# matching multiples
```

```
b=data.frame(id=sample(500,1000,replace=T),val2=runif(1000))  
length(match(a$id,b$id))
```

```
## [1] 500
```

```
length(match(b$id,a$id))
```

```
## [1] 1000
```

```
head(a$id %in% b$id)
```

```
## [1] FALSE FALSE  TRUE FALSE  TRUE  TRUE
```

```
length(a$id %in% b$id)
```

```
## [1] 500
```

```
c=merge(a,b)  
dim(c)
```

```
## [1] 1000    3
```

## Aggrégation : tapply, by, aggregate

```
a=data.frame(id=1:500, val1=runif(500), val2=factor(rbinom(500, 1, 0.5)))  
aggregate(a$val1, list(a$val2), sum)
```

```
##      Group.1          x  
## 1          0 17.631192  
## 2          1 62.029426  
## 3          2 84.793575  
## 4          3 55.891191  
## 5          4 29.779820  
## 6          5  1.999992
```

## Aggrégation : tapply, by, aggregate

```
tapply(a$val1,list(a$val2),summary)
```

```
## $`0`
```

```
##      Min.   1st Qu.   Median     Mean   3rd Qu.     Max.
## 0.002258 0.193739 0.504010 0.463979 0.729720 0.969246
##
```

```
## $`1`
```

```
##      Min.   1st Qu.   Median     Mean   3rd Qu.     Max.
## 0.003505 0.256001 0.515869 0.492297 0.735279 0.998377
##
```

```
## $`2`
```

```
##      Min.   1st Qu.   Median     Mean   3rd Qu.     Max.
## 0.002896 0.300564 0.508208 0.520206 0.757567 0.995150
##
```

```
## $`3`
```

```
##      Min.   1st Qu.   Median     Mean   3rd Qu.     Max.
## 0.006136 0.210672 0.481605 0.481821 0.742889 0.998449
##
```

```
## $`4`
```

## Aggrégation : tapply, by, aggregate

```
by(a$val1,list(a$val2),summary)
```

```
## : 0
```

##	Min.	1st Qu.	Median	Mean	3rd Qu.	Max.
##	0.002258	0.193739	0.504010	0.463979	0.729720	0.969246
##	-----					

```
## : 1
```

##	Min.	1st Qu.	Median	Mean	3rd Qu.	Max.
##	0.003505	0.256001	0.515869	0.492297	0.735279	0.998377
##	-----					

```
## : 2
```

##	Min.	1st Qu.	Median	Mean	3rd Qu.	Max.
##	0.002896	0.300564	0.508208	0.520206	0.757567	0.995150
##	-----					

```
## : 3
```

##	Min.	1st Qu.	Median	Mean	3rd Qu.	Max.
##	0.006136	0.210672	0.481605	0.481821	0.742889	0.998449
##	-----					

```
## : 4
```

## Comptage : table

```
table(a$val2)
```

```
##
```

```
##    0    1    2    3    4    5
```

```
##  38 126 163 116  53   4
```

```
a$val3=rep(c("a","t","g","c"),500/4)
```

```
table(a[,c('val2','val3')])
```

```
##      val3
```

```
## val2  a   c   g   t
```

```
##    0   9   9   7 13
```

```
##    1 37 27 27 35
```

```
##    2 33 41 51 38
```

```
##    3 31 34 28 23
```

```
##    4 14 13 11 15
```

```
##    5  1  1  1  1
```