# Az R adatelemzési nyelv alapjai I. 

Egészségügyi informatika és biostatisztika

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## What $R$ is and what it is not

- $R$ is
- a programming language
- a statistical package
- an interpreter
- Open Source
- R is not
- SPSS, Statistica, etc.
- a collection of "black boxes"
- a spreadsheet software package
- commercially supported


## What $R$ is

- data handling and storage: numeric, textual
- matrix algebra
- regular expressions
- high-level data analytic and statistical functions
- classes ("OO")
- graphics
- programming language: loops, branching, functions


## What R is not

- has no click-point user interfaces
- language interpreter can be very slow, but allows to call own C/C++ code
- no spreadsheet view of data, but connects to Excel/MsOffice
- no professional /commercial support


## $R$ and statistics

- Packaging: a crucial infrastructure to efficiently produce, load and keep consistent software libraries from (many) different sources / authors
- Statistics: most packages deal with statistics and data analysis
- State of the art: many statistical researchers provide their methods as R packages


## History of R

- Statistical programming language $S$ developed at Bell Labs since 1976 (at the same time as UNIX)
- Intended to interactively support research and data analysis projects
- Exclusively licensed to Insightful ("S-Plus")
- R: Open source platform similar to $S$ developed by R. Gentleman and R. Ihaka (U of Auckland, NZ) during the 1990s
- Since 1997: international "R-core" developing team
- Updated versions available every couple months


## Getting started

- To obtain and install $R$ on your computer
- Go to http://cran.r-project.org/mirrors.html to choose a mirror near you
- Click on your favorite operating system (Linux, Mac, or Windows)
- Download and install the "base"
- To install additional packages
- Start R on your computer
- Choose the appropriate item from the "Packages" menu

- ${ }^{-1}$


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Version 1.7.0 (2003-04-16)
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R is a collaborative project with many contributors.
Type contributors()' for more information.

Type 'demo()' for some demos, 'help ()' for on-line help, or help.start()' for a HTML browser interface to help.
Type 'q()' to quit $R$.
$>$ library("MASS"
Type 'q()' to quit $R$
-

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R is a collaborative project wi Type＇contributors（）＇for more

Type＇demo（）＇for some demos， ＇help．start（）＇for a HTML brows Type＇q（）＇to quit $R$ ．
$>$ library（＂MASS＂）
$>$ data（！）
$>$

1

## R R data sets

Body Temperature Series of Beaver 1
Body Temperature Series of Beaver 2
Biopsy Data on Breast Cancer Patients
Risk Factors Associated with Low Infant Birth \＄ Housing Values in Suburbs of Boston
Data from a cabbage field trial
Colours of Eyes and Hair of People in Caithness Data from 93 Cars on Sale in the USA in 1993
Anatomical Data from Domestic Cats
Heat Evolved by Setting Cements
Copper in Wholemeal Flour
Co－operative Trial in Analytical Chemistry Performance of Computer CPUs
Morphological Measurements on Leptograpsus Cra\＄ Diagnostic Tests on Patients with Cushing＇s Sy\＄ DDT in Kale
Monthly Deaths from Lung Diseases in the UK

Topographic Information on Auckland＇s Maunga w\＄ The Number of Breaks in Yarn during Weaving Average Heights and Weights for American Women

Determinations of Nickel Content
Accidental Deaths in the US 1973－1978
Australian AIDS Survival Data
Brain and Body Weights for 28 Species Anorexia Data on Weight Change
Quarterly Time Series of the Number of Austral\＄ Presence of Bacteria after Drug Treatments

```
volcano
warpbreaks
women
Data sets in package 'MASS':
abbey
accdeaths
Aids2
Animals
anorexia
austres
bacteria
beav1
beav2
biopsy
birthwt
Boston
cabbages
caith
Cars93
cats
cement
chem
coop
cpus
crabs
Cushings
DDT
deaths
Average Heights and Weights for American Women
```

v
biopsy
birthwt
Boston
caith
Cars93
cats
chem
coop
cpus
crabs

DDT
deaths
volcano women

Data sets in package＇MASS＇：

## abbey

deaths
Aids2
Animals

1
$\square$


```
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```

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Type contributors()' for more information.
Type 'demo()' for some demos, 'help()' for on-line help, or
'help.start ()' for a HTML browser interface to help.
Type 'q()' to quit $R$.
> library("Mass")
$>$ data ()
data(Cars93)
> Cars93

| Manufacturer | Model | Type | Min. Price | Price | Max. Price | MPG.city |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Acura | Integra | Small | 12.9 | 15.9 | 18.8 | 25 |
| Acura | Legend | Midsize | 29.2 | 33.9 | 38.7 | 18 |
| Audi | 90 | Compact | 25.9 | 29.1 | 32.3 | 20 |
| Audi | 100 | Midsize | 30.8 | 37.7 | 44.6 | 19 |
| BMW | $535 i$ | Midsize | 23.7 | 30.0 | 36.2 | 22 |
| Buick | Century | Midsize | 14.2 | 15.7 | 17.3 | 22 |
| Buick | LeSabre | Large | 19.9 | 20.8 | 21.7 | 19 |
| Buick | Roadmaster | Large | 22.6 | 23.7 | 24.9 | 16 |
| Buick | Riviera | Midsize | 26.3 | 26.3 | 26.3 | 19 |
| Cadillac | DeVille | Large | 33.0 | 34.7 | 36.3 | 16 |
| Cadillac | Seville | Midsize | 37.5 | 40.1 | 42.7 | 16 |
| Chevrolet | Cavalier | Compact | 8.5 | 13.4 | 18.3 | 25 |
| Chevrolet | Corsica | Compact | 11.4 | 11.4 | 11.4 | 25 |
| Chevrolet | Camaro | Sporty | 13.4 | 15.1 | 16.8 | 19 |
| Chevrolet | Lumina | Midsize | 13.4 | 15.9 | 18.4 | 21 |
| Chevrolet | Lumina_APV | Van | 14.7 | 16.3 | 18.0 | 18 |
| Chevrolet | Astro | Van | 14.7 | 16.6 | 18.6 | 15 |
| Chevrolet | Caprice | Large | 18.0 | 18.8 | 19.6 | 17 |

## RStudio

## An IDE that wraps R



## RStudio

## An IDE that wraps R



## Getting help... and quitting

- Getting information about a specific command

```
> help(rnorm)
> ?rnorm
```

- Finding functions related to a keyword
> help.search("boxplot")
- Starting the R installation help pages
> help.start()
- Quitting R

$$
\text { > } q()
$$

## Basic data types

## Objects

- variables = objects
- types of objects: vector, factor, array, matrix, data.frame, ts, list
- attributes
- mode: integer, numeric, character, complex, logical
- length: number of elements in object
- creation
- assign a value
- create a blank object


## Naming Convention

- must start with a letter (A-Z or a-z)
- can contain letters, digits (0-9), and/or
- periods "."
- underscore "_"
- case-sensitive
- mydata different from MyData


## Assignment

- "<-" used to indicate assignment

$$
\begin{aligned}
& x<-c(1,2,3,4,5,6,7) \\
& x<-c(1: 7) \\
& x<-1: 7
\end{aligned}
$$

- note: as of version 1.4 "=" is also a valid assignment operator


## $R$ as a calculator

$$
\begin{aligned}
& >5+(6+7) \star \mathrm{pi}^{\wedge} 2 \\
& {[1] \operatorname{l33.3049}} \\
& >\log (\exp (1)) \\
& {[1] 1} \\
& >\log (1000,10) \\
& {[1] 3} \\
& >\sin (\mathrm{pi} / 3)^{\wedge} 2+\cos (\mathrm{pi} / 3)^{\wedge} 2 \\
& {[1] 1} \\
& >\operatorname{Sin}(\mathrm{pi} / 3)^{\wedge} 2+\cos (\mathrm{pi} / 3)^{\wedge} 2 \\
& \text { Error: couldn't find function "Sin" }
\end{aligned}
$$

## $R$ as a calculator

> $\log 2(32)$
[1] 5
> sqrt(2)
[1] 1.414214
> seq(0, 5, length=6)
[1] 012345

> plot(sin(seq(0, 2*pi, length=100)))

## Basic (atomic) data types

- Logical

```
> x <- T; y <- F
> X; Y
[1] TRUE
[1] FALSE
```

- Numerical

$$
\begin{aligned}
& >a<-5 ; b<-\operatorname{sqrt}(2) \\
& >a ; b \\
& {[1] 5} \\
& {[1] 1.414214}
\end{aligned}
$$

- Character

$$
\begin{aligned}
& >a<- \text { "1"; } b<-1 \\
& >a ; b \\
& \text { [1] "1" } \\
& \text { [1] } 1 \\
& >a<- \text { "character" } \\
& >b<- \text { "a"; c <- a } \\
& >a ; ~ b ; ~ c ~ \\
& {[1] \text { "character" }} \\
& {[1] \text { "a" }} \\
& {[1] \text { "character" }}
\end{aligned}
$$

## Data Type Conversion

- Type conversions in R work as you would expect. For example, adding a character string to a numeric vector converts all the elements in the vector to character.
- Use is.foo to test for data type foo. Returns TRUE or FALSE
Use as.foo to explicitly convert it.
- is.numeric(), is.character(), is.vector(), is.matrix(), is.data.frame()
as.numeric(), as.character(), as.vector(), as.matrix(), as.data.frame)


## Vectors, Matrices, Arrays

- Vector
- Ordered collection of data of the same data type
- Example:
- last names of all students in this class
- Mean intensities of all genes on an oligonucleotide microarray
- In R, single number is a vector of length 1
- Matrix
- Rectangular table of data of the same type
- Example
- Intensities of all genes measured during a microarray experiment
- Array
- Higher dimensional matrix


## Vectors

- Vector: Ordered collection of data of the same data type

```
> x <- c(5.2, 1.7, 6.3)
> log(x)
[1] 1.6486586 0.5306283 1.8405496
> y <- 1:5
> z <- seq(1, 1.4, by = 0.1)
> y + z
[1] 2.0 3.1 4.2 5.3 6.4
> length(y)
[1] 5
> mean(y + z)
[1] 4.2
```


## Vectors

```
> Mydata <- c(2,3.5,-0.2) Vector (c="concatenate")
> Colors <-
    c("Red","Green","Red") Character vector
> x1 <- 25:30
> x1
[1] 25 26 27 28 29 30
> Colors[2]
[1] "Green"
> x1[3:5]
[1] 27 28 29
One element (1-index!)
Various elements
```


## Operation on vector elements

> Mydata
[1] $23.5-0.2$
> Mydata > 0
[1] TRUE TRUE FALSE
> Mydata[Mydata>0]
[1] 23.5
> Mydata[-c (1, 3)]
[1] 3.5

- Test on the elements
- Extract the positive elements
- Remove elements
Vector operations
$>x<-c(5,-2,3,-7)$
$>y<-c(1,2,3,4) * 10$
$>$ Y
[1] $10020 \quad 30 \quad 40$
$>$ sort (x)
[1] -7 -2 35
$>$ order (x)
[1] 4231
> y[order(x)]
[1] $40 \quad 203010$
$>$ rev $(x)$
[1] $-7 \begin{array}{llll} & 3 & -2 & 5\end{array}$
Operation on all the elements
Sorting a vector
Element order for sorting
Operation on all the components
Reverse a vector


## Matrices

- Matrix: Rectangular table of data of the same type

```
> m <- matrix(1:12, 4, byrow = T); m
    [,1] [,2] [,3]
[1,] 1
[2,] 4 5
[3,] 7 8 9
[4,] 10 11 12
> y <- -1:2
> m.new <- m + Y
> t(m.new)
    [,1] [,2] [,3] [,4]
[1,] 0
[2,] 1
[3,] 2 % 6 10 14
> dim(m)
[1] 4 3
> dim(t(m.new))
[1] 3 4
```


## Matrices <br> Matrix: Rectangular table of data of the same type

$\begin{array}{lrr}>x<-c(3,-1,2 \\ >x . m a t & <- & m a t r \\ > & x . m a t \\ {[1,1]} & {[, 2]} \\ {[2,]} & -1 & -3 \\ {[3,]} & 2 & 6\end{array}$
$>$ x.mat $<-$ matrix(x, ncol=2, byrow=T)

By row creation
> x.mat

|  | $[, 1]$ | $[, 2]$ |
| :--- | ---: | ---: |
| $[1]$, | 3 | -1 |
| $[2]$, | 2 | 0 |
| $[3]$, | -3 | 6 |

## Dealing with matrices

```
> x.mat[,2]
[1] -1 0 6
> x.mat[c(1, 3),]
1st and 3 rd lines
\begin{tabular}{lrr} 
& {\([, 1]\)} & {\([, 2]\)} \\
{\([1]\),} & 3 & -1 \\
{\([2]\),} & -3 & 6
\end{tabular}
> x.mat[-2,]
No \(2^{\text {nd }}\) line
\begin{tabular}{lrr} 
& {\([, 1]\)} & {\([, 2]\)} \\
{\([1]\),} & 3 & -1 \\
{\([2]\),} & -3 & 6
\end{tabular}
```


## Dealing with matrices

> dim(x.mat)
[1] 32
$>$ t(x.mat)
$[, 1][, 2][, 3]$
$\left[\begin{array}{llll}{[1,]} & 3 & 2 & -3\end{array}\right.$
$\left[\begin{array}{llll}{[2,]} & -1 & 0 & 6\end{array}\right.$
> x.mat $\% * \% t(x . m a t)$

|  | $[, 1]$ | $[, 2]$ | $[, 3]$ |
| :--- | ---: | ---: | ---: |
| $[1]$, | 10 | 6 | -15 |
| $[2]$, | 6 | 4 | -6 |
| $[3]$, | -15 | -6 | 45 |

$>$ solve() solves the equation $\mathrm{A} \% * \% \mathrm{X}=\mathrm{B}$ for X ,
$>$ eigen() Eigenvectors and eigenvalues

## Missing values

- R is designed to handle statistical data and therefore predestined to deal with missing values
- Numbers that are "not available"
$>x<-c(1,2,3, N A)$
$>x+3$
[1] 456 NA
- Testing for Missing Values

```
> is.na(x) # returns TRUE if x is missing
> Y <- C (1,2,3,NA)
> is.na(y) # returns a vector (F F F T)
```

- "Not a number"

```
> log(c(0, 1, 2))
```

[1] -Inf 0.00000000 .6931472
> $0 / 0$
[1] NaN

## Missing values

- Excluding Missing Values from Analyses
- Arithmetic functions on missing values yield missing values.

```
> x <- c(1,2,NA,3)
> mean(x) # returns NA
> mean(x, na.rm=TRUE) # returns
```

- The function complete.cases() returns a logical vector indicating which cases are complete.

```
# list rows of data that have missing values
> mydata[!complete.cases(mydata),]
```

- The function na.omit() returns the object with listwise deletion of missing values.

```
# create new dataset without missing data
> newdata <- na.omit(mydata)
```


## Subsetting

- It is often necessary to extract a subset of a vector or matrix
- R offers a couple of neat ways to do that

$$
\begin{aligned}
& >x \text { >- c c("a", "b", "c", "d", "e", "f", } \\
& \text { "g", "h") } \\
& >x[1] \\
& >x[3: 5] \\
& >x[-(3: 5)] \\
& >x[c(T, F, T, F, T, F, T, F)] \\
& >x[x<=\text { "d" }] \\
& >m[, 2] \\
& >m[3,]
\end{aligned}
$$

## Lists, data frames, and

 factors
## Lists

vector: an ordered collection of data of the same type.
$>a=c(7,5,1)$
$>a[2]$
[1] 5
list: an ordered collection of data of arbitrary types.
$>$ doe $=$ list (name="john", age=28, married=F)
> doe\$name
[1] "john"
> doe\$age
[1] 28

Lists 1

- A list is an object consisting of objects called components.
- The components of a list don't need to be of the same mode or type and they can be a numeric vector, a logical value and a function and so on.
- A component of a list can be referred as aa [ [i] ] or aa\$times, where aa is the name of the list and times is a name of a component of aa.


## Lists 2

- The names of components may be abbreviated down to the minimum number of letters needed to identify them uniquely.
- aa [ [1] ] is the first component of aa, while aa [1] is the sublist consisting of the first component of a a only.
- There are functions whose return value is a List.


## Lists are very flexible

```
> my.list <- list(c(5,4,-1),c("X1","X2","X3"))
> my.list
[[1]]:
[1] 5 4 -1
[[2]]:
[1] "X1" "X2" "X3"
> my.list[[1]]
[1] 5 4 -1
> my.list <- list(c1=c(5,4,-1),c2=c("X1","X2","X3"))
> my.list$c2[2:3]
[1] "X2" "X3"
```


## Lists 3

Empl <- list(employee="Anna", spouse="Fred", children=3, child.ages=c (4,7,9))

Empl[[4]]
Empl\$child.a
Empl[4] \# a sublist consisting of the $4^{\text {th }}$ component of Empl
names(Empl) <- letters[1:4]
Empl <- c(Empl, service=8)
unlist (Empl) \# converts it to a vector. Mixed types will be converted to character, giving a character vector.

## More lists

| x.mat |  |  |
| :--- | ---: | ---: |
|  | $[, 1]$ | $[, 2]$ |
| $[1]$, | 3 | -1 |
| $[2]$, | 2 | 0 |
| $[3]$, | -3 | 6 |

> dimnames(x.mat) <- list(c("L1","L2","L3"), C("R1","R2"))
> x.mat
R1 R2
L1 3-1
L2 20
L3 -3 6

## Data frames

data frame: represents a spreadsheet.
Rectangular table with rows and columns; data within each column has the same type (e.g. number, text, logical), but different columns may have different types.
Example:
> cw = chickwts
$>\mathrm{CW}$

|  | weight | feed |
| :--- | :---: | :--- |
| 1 | 179 | horsebean |
| 11 | 309 | linseed |
| 23 | 243 | soybean |
| 37 | 423 | sunflower |

## Data frames

Creating a data frame
$>d<-c(1,2,3,4)$
$>$ e <- c("red", "white", "red", NA)
$>\mathrm{f}<-\mathrm{c}($ TRUE,TRUE,TRUE,FALSE)
$>$ mydata <- data.frame (d,e,f)
> names (mydata) <- c("ID","Color","Passed")
Adding a new column
> mydata\$Height <- c (100,120,120,130)
> mydata\$Shape <- "circle"

## Subsetting

Individual elements of a vector, matrix, array or data frame are accessed with "[ ]" by specifying their index, or their name
$>c w=$ chickwts
$>\mathrm{CW}$

|  | weight | feed |
| :--- | :---: | :--- |
| 1 | 179 | horsebean |
| 11 | 309 | linseed |
| 23 | 243 | soybean |
| 37 | 423 | sunflower |

```
> cw [3,2]
[1] horsebean
6 Levels: casein horsebean linseed ... sunflower
> CW [3,]
    weight feed
3 136 horsebean
```


## Subsetting

Other ways to subset...
\# columns 3,4,5 of dataframe
> myframe[3:5]
\# columns ID and Age from dataframe
> myframe[c("ID","Age")]
\# variable ID in the dataframe
> myframe\$ID
\# using subset function
> subset( myframe, Age < 35, c("ID","Age") )

## Merging

To merge two dataframes (datasets) horizontally, use the merge function. In most cases, you join two dataframes by one or more common key variables (i.e., an inner join).
\# merge two dataframes by ID
total <- merge(dataframeA, dataframeB,by="ID")
\# merge two dataframes by ID and Country
total <- merge (dataframeA, dataframeB, by=c("ID","Country"))

## Merging

## ADDING ROWS

To join two dataframes (datasets) vertically, use the rbind function. The two dataframes must have the same variables, but they do not have to be in the same order.

```
total <- rbind(dataframeA, dataframeB)
```

If dataframeA has variables that dataframeB does not, then either:

- Delete the extra variables in dataframeA or
- Create the additional variables in dataframeB and set them to NA (missing) before joining them with rbind.


## Aggregating

- It is relatively easy to collapse data in R using one or more BY variables and a defined function.
- \# aggregate dataframe mtcars by cyl, returning means for numeric variables
> attach(mtcars)
> aggdata <- aggregate( mtcars,
by=list (cyl),
FUN=mean,
na.rm=TRUE )
> print(aggdata)


## Factors

Tell $\mathbf{R}$ that a variable is nominal by making it a factor. The factor stores the nominal values as a vector of integers in the range [ $1 . . . \mathrm{k}$ ] (where k is the number of unique values in the nominal variable), and an internal vector of character strings (the original values) mapped to these integers.
variable gender with 20 "male" entries and 30 "female" entries gender <- c(rep("male",20), rep("female", 30)) gender <- factor(gender)
stores gender as 201 s and 302 s and associates
1=female, 2=male internally (alphabetically)
$R$ now treats gender as a nominal variable
summary (gender)

## Control structures

Control structures in R allow you to control the flow of execution of the program, depending on runtime conditions. Common structures are

- if, else: testing a condition
- for: execute a loop a fixed number of times
- while: execute a loop while a condition is true
- repeat: execute an infinite loop
- break: break the execution of a loop
- next: skip an interation of a loop
- return: exit a function

Most control structures are not used in interactive sessions, but rather when writing functions or longer expresisons.

```
if(<condition>) {
    ## do something
} else {
    ## do something else
}
if(<condition1>) {
    ## do something
} else if(<condition2>) {
    ## do something different
} else {
    ## do something different
}
```

This is a valid if/else structure.


So is this one.

$$
\begin{gathered}
y<-i f(x>3)\{ \\
10
\end{gathered}
$$

\} else \{
0
\}

```
if(x > 1) {
    print("x is big")
} else if(x > 0) {
    print("x is positive")
} else {
    print("x is negative or zero")
```

How are these two conditionals different?
if( $x>1$ ) \{
print("x is big")
\}
if(x > 0) \{
print("x is positive")
\}
print("x is negative or zero")
for loops take an interator variable and assign it successive values from a sequence or vector. For loops are most commonly used for iterating over the elements of an object (list, vector, etc.)
for(i in 1:10) \{
print(i)
\}
This loop takes the i variable and in each iteration of the loop gives it values $1,2,3$, $\ldots, 10$, and then exits.

These three loops have the same behavior.

$$
x<-c\left(" a{ }^{\prime}, \quad " b ", \quad " c\right. \text { ", "d") }
$$

$$
\text { for }(i \text { in } 1: 4)\{
$$

print(x[i])
\}
for (i in seq_along(x)) \{ print(x[i])
\}

## seq_along creates a list of indices

for(i in 1:4) print(x[i])

While loops begin by testing a condition. If it is true, then they execute the loop body. Once the loop body is executed, the condition is tested again, and so forth.

```
count <- 0
while(count < 10) {
    print(count)
    count <- count + 1
}
```

While loops can potentially result in infinite loops if not written properly. Use with care!

## while

Sometimes there will be more than one condition in the test.

$$
\begin{aligned}
& \text { z <- } 5 \\
& \text { while(z >= } 3 \& \& z<=10 \text { ) \{ } \\
& \text { print(z) } \\
& \text { coin <- rbinom(1, 1, 0.5) } \\
& \text { if(coin == 1) \{ \#\# random walk } \\
& \text { z <- z + } 1 \\
& \text { \} else \{ } \\
& \text { z <- z-1 } \\
& \text { \} } \\
& \text { \} }
\end{aligned}
$$

Conditions are always evaluated from left to right.

## repeat

Repeat initiates an infinite loop; these are not commonly used in statistical applications but they do have their uses. The only way to exit a repeat loop is to call break.

```
x0 <- 1
tol <- 1e-8
repeat {
    x1 <- computeEstimate()
    if(abs(x1 - x0) < tol) {
        break
    } else {
        x0 <- x1
    }
}
```


## next, return

next is used to skip an iteration of a loop

```
for(i in 1:100) {
    if(i <= 20) {
                                    ## Skip the first 20 iterations
                                    next
    }
    ## Do something here
}
```

return signals that a function should exit and return a given value

## Arithmetic Operators

| Operator | Description |
| :--- | :--- |
| + | addition |
| - | subtraction |
| $*$ | multiplication |
| $/$ | division |
| ^ $\mathbf{o r}$ ** | exponentiation |
| $\mathbf{x \% \%} \mathbf{y}$ | modulus (x mod y) 5\%\%2 is 1 |
| $\mathbf{x ~ \% / \% ~ y ~}$ | integer division 5\%/\%2 is 2 |

## Arithmetic Operators

Functions:

```
abs(), sign(), log(), log10(), sqrt(),
exp(), sin(), cos(), tan()
gamma(), lgamma(), choose()
```

Rounding: round (x,3)
Rounding: floor(2.5) => 2, ceiling(2.5) => 3

## Vector functions

$>\operatorname{vec}<-c(5,4,6,11,14,19)$
$>$ sum (vec)
[1] 59
> prod (vec)
[1] 351120
$>$ mean (vec)
[1] 9.833333

```
And also:min() max()
    cummin() cummax()
    cumsum() cumprod()
    range()
```

    \(>\) median (vec)
    [1] 8.5
    \(>\operatorname{var}(\mathrm{vec})\)
    [1] 34.96667
    \(>\) sd (vec)
    [1] 5.913262
    \(>\) summary (vec)
        Min. 1st Qu. Median Mean 3rd Qu. Max.
        \(4.000 \quad 5.250 \quad 8.500 \quad 9.833 \quad 13.250 \quad 19.000\)
    
## Logical Operators

| Operator | Description |
| :--- | :--- |
| $<$ | less than |
| $<=$ | less than or equal to |
| $>$ | greater than |
| $>=$ | greater than or equal to |
| $==$ | exactly equal to |
| $!=$ | not equal to |
| !x | Not x |
| $\mathbf{x \| y}$ | x OR y |
| $\mathbf{x ~ \& ~ y ~}$ | x AND y |
| isTRUE(x) | test if x is TRUE |

## Statistical functions

Normal distr

$$
f(x \mid \mu, \sigma)=\frac{1}{\sigma \sqrt{2 \pi}} e^{-\frac{1}{2}\left(\frac{x-\mu}{\sigma}\right)^{2}}
$$

> dnorm(2,mean=1,sd=2)
[1] 0.1760327
> qnorm(0.975)
[1] 1.959964
> pnorm(c $(2,3)$,mean=2)

PDF in point 2
for $\mathrm{X} \sim \mathrm{N}(1,4)$


Quantile for the 0.975 for $\mathrm{N} \sim(0,1)$
$=\mathrm{P}(\mathrm{X}<2)$ and $\mathrm{P}(\mathrm{X}<3)$, where $\mathrm{X} \sim \mathrm{N}(2,1)$
[1] 0.50000000 .8413447
> norm.alea <- rnorm(1000) Pseudo-random normally distributed numbers
$>$ summary (norm.alea)
Min. 1st Qu. Median Mean 3rd Qu. Max.
$-3.418-0.6625-0.0429-0.01797 \quad 0.63773 .153$
> sd(norm.alea)
[1] 0.9881418

## How to remember functions

For a normal distribution, the root is norm. Then add the letters

| d | density (dnorm () ) |
| :--- | :--- |
| p | probability (pnorm () ) |
| q | quantiles (qnorm () ) |
| $\mathbf{r}$ | pseudo-random (rnorm()) |


| Distribution | Root | Argument |
| :--- | :--- | :--- |
| normal | norm | mean, sd, log |
| $t$ (Student) | t | df, log |
| uniform | unif | min, max, log |
| $F$ (Fisher) | f | df1, df2 |
| $\chi^{2}$ | chisq | df, ncp, log |
| Binomial | binom | size, prob, log |
| exponential | exp | rate, log |
| Poisson | pois | lambda, log |


| Function | Description |
| :---: | :---: |
| dnorm( $x$ ) | normal density function (by default m=0 sd=1) |
|  | \# plot standard normal curve |
|  | $\mathrm{x}<-\operatorname{pretty}(\mathrm{c}(-3,3), 30)$ |
|  | $\mathrm{y}<-\operatorname{dnorm}(\mathrm{x})$ |
|  | plot(x, y, type='l', xlab="Normal Deviate", ylab="Density", yaxs="i") |
| pnorm( $q$ ) | cumulative normal probability for q . |
|  | (area under the normal curve to the right of q ) pnorm(1.96) is 0.975 |
| qnorm( $p$ ) | normal quantile. |
|  | value at the p percentile of normal distribution |
|  | qnorm( .9 ) is 1.28 \# 90th percentile |
| $\operatorname{rnorm}(n, \mathbf{m}=0, \mathbf{s d}=1)$ | n random normal deviates with mean m |
|  | and standard deviation sd. |
|  | \#50 random normal variates with mean $=50, \mathrm{sd}=10$ |
|  | $\mathrm{x}<-\operatorname{rnorm}(50, \mathrm{~m}=50, \mathrm{sd}=10)$ |
| dbinom ( $x$, size, prob) | binomial distribution where size is the sample size |
| pbinom ( $q$, size, prob) | and prob is the probability of a heads (pi) |
| qbinom ( $p$, size, prob) | \# prob of 0 to 5 heads of fair coin out of 10 flips |
| rbinom(n, size, prob) | dbinom( $0: 5,10, .5$ ) |
|  | \# prob of 5 or less heads of fair coin out of 10 flips |
|  | pbinom( $5,10, .5$ ) |
| dpois( , lamda) | poisson distribution with m=std=lamda |
| ppois( (, lamda) | \#probability of 0,1 , or 2 events with lamda=4 |
| qpois ( $p$, lamda) | dpois(0:2, 4) |
| rpois(n, lamda) | \# probability of at least 3 events with lamda=4 |
|  | 1 - $\operatorname{ppois}(2,4)$ |
| dunif( $x, \min =0, \max =1$ ) | uniform distribution, follows the same pattern |
| punif $(q, \min =\mathbf{0}, \max =1$ ) | as the normal distribution above. |
| qunif $(p, \boldsymbol{m i n}=0, \boldsymbol{m a x}=1)$ | \#10 uniform random variates |
| $\operatorname{runif}(n, \min =0, \max =1)$ | x <- runif(10) |

# Importing/ Exporting Data 

## Importing/Exporting Data

- Importing data
- R can import data from other applications
- Packages are available to import microarray data, Excel spreadsheets etc.
- The easiest way is to import tab delimited files

```
> SimpleData <- read.table(
file = "http://eh3.uc.edu/SimpleData.txt",
header = "TRUE,
quote = ""''
sep = "\t",
comment.char="")
```

- Exporting data
- R can also export data in various formats
- Tab delimited is the most common
> write.table(x, "filename") *)
*) make sure to include the path or to first change the working directory


## Credits

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