Programming and frameworks for ML

Introduction to R

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Presentation

Big Data Consultant at Indra / Big Data Lecturer

- More than 20 years of experience in different environments, technologies, customers, countries ...
- Passionate data and technology
- Enthusiastic Big Data world and NoSQL

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What is R?

- R is a programming language and environment with the aim of displaying information, statistics and analysis computations.
- R is an open implementation source S programming language, developed by Bell Laboratories in 1976
- R has a very active user community
  - More than 10,000 packages CRAN

Pros and cons

- In favor:
  - Free
  - Many packages, very flexible.
  - It can run on virtually any combination of hardware / operating system (even in a PlayStation 3)

- Against:
  - The objects are to be stored in the physical memory of the computer
  - Much more oriented programming
  - Minimum interface

Functionalities in R

- Classification and Regression
- Mining and text analysis
- Models of scoring and ranking
- Clustering
- Graph analysis
- Interactive data analysis
- Data handling and cleaning
- Data Visualization
- General purpose statistics
- Advanced predictive models (SVM, NN, ...)

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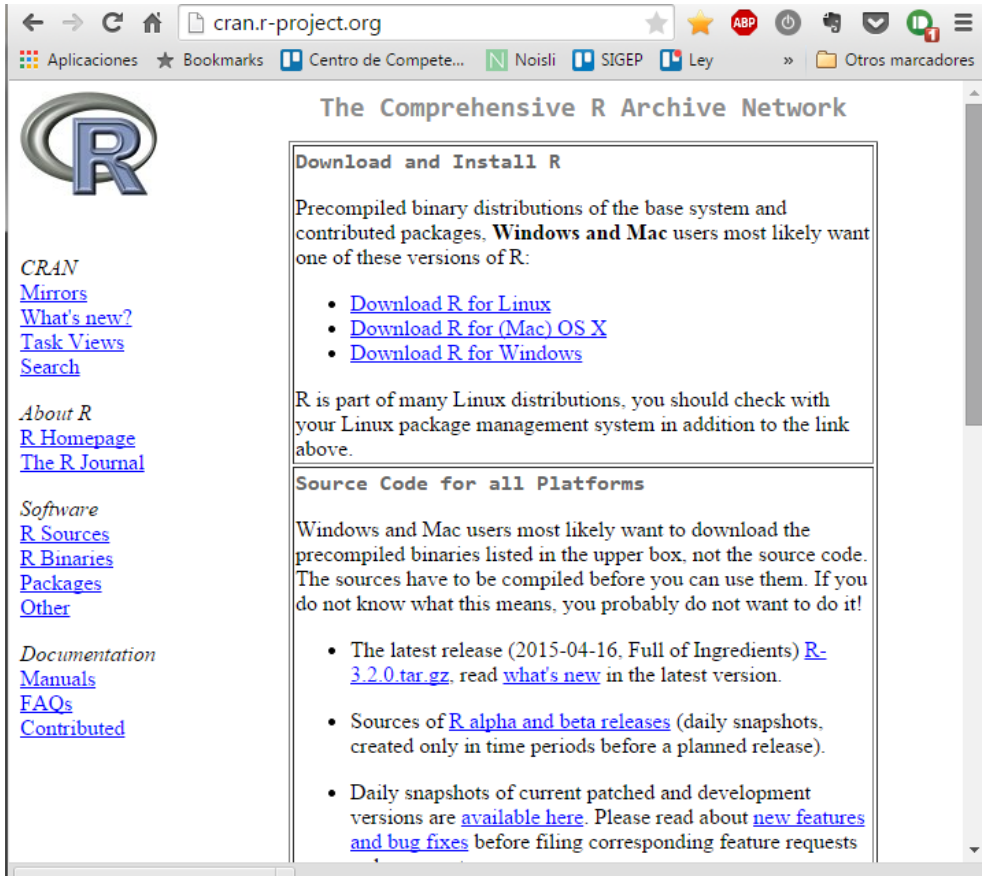
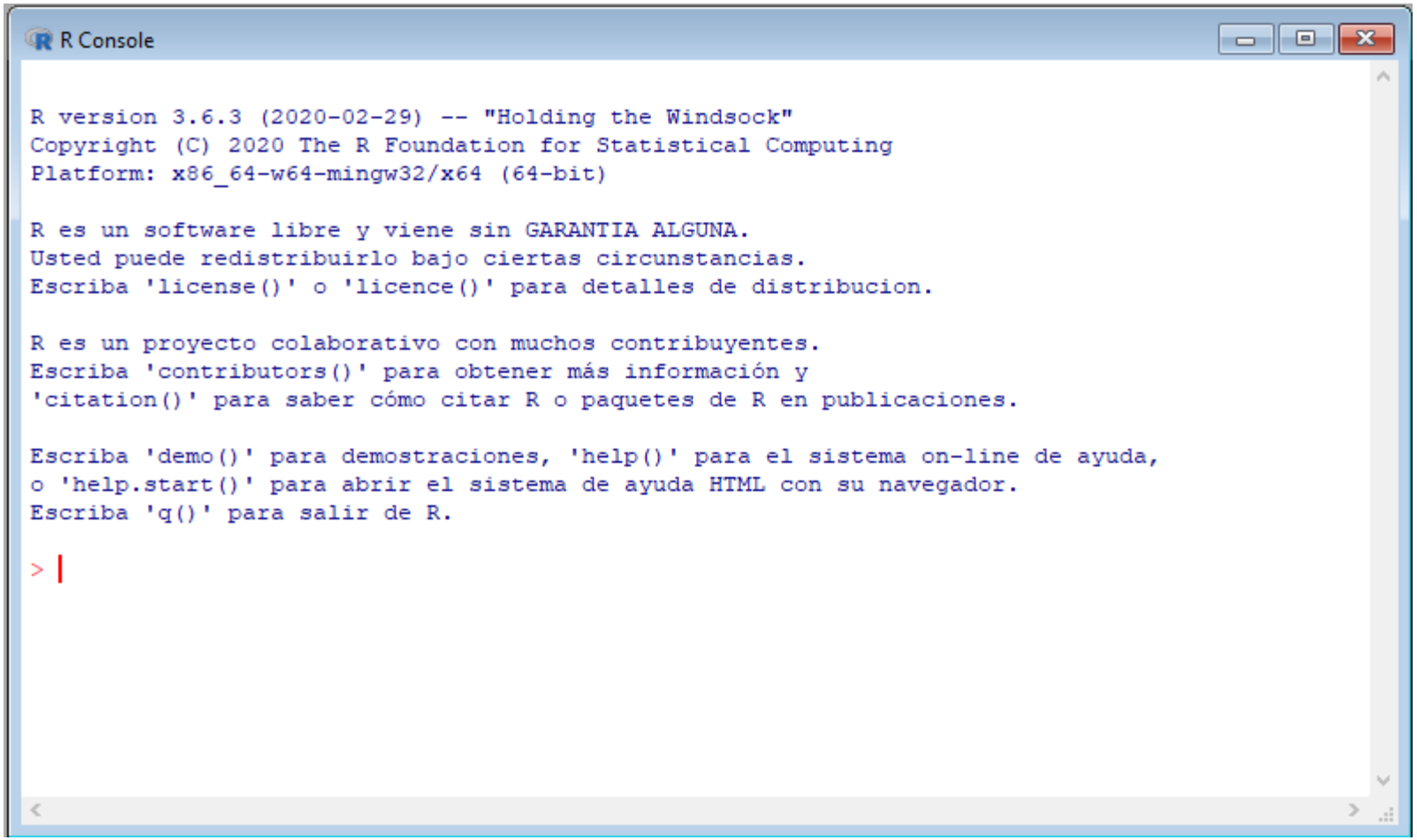
Exercise 1

- Install R (http: //cran.r-project.org/)

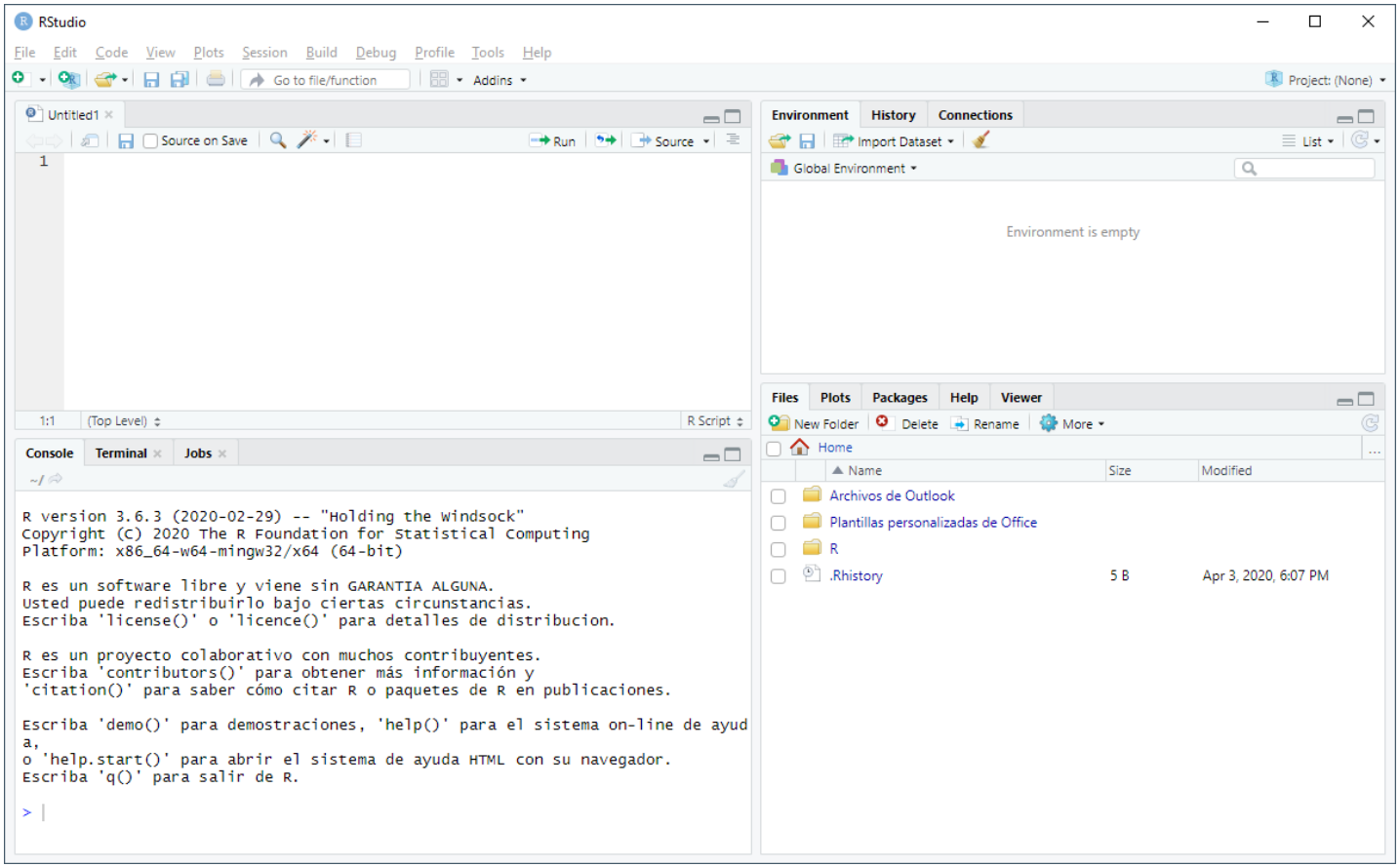


Interface R


R Console
R version 3.6.3 (2020-02-29) -- "Holding the Windsock"
Copyright (C) 2020 The R Foundation for Statistical Computing
Platform: x86_64-w64-mingw32/x64 (64-bit)
R es un software libre y viene sin GARANTIA ALGUNA.
Usted puede redistribuirlo bajo ciertas circunstancias.
Escriba 'license()' o 'licence()' para detalles de distribucion.
R es un proyecto colaborativo con muchos contribuyentes.
Escriba 'contributors()' para obtener más información y
'citation()' para saber cómo citar R o paquetes de R en publicaciones.
Escriba 'demo()' para demostraciones, 'help()' para el sistema on-line de ayuda,
o 'help.start()' para abrir el sistema de ayuda HTML con su navegador.
Escriba 'q()' para salir de R.
>

Exercise 2

- R Studio installs (http://www.rstudio.com/)

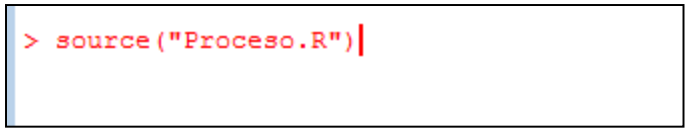


Interface R

- Console: Interactive Commands are entered directly
  - Good to look the way they look data
  - Try things
  - Display graphics

Interface R

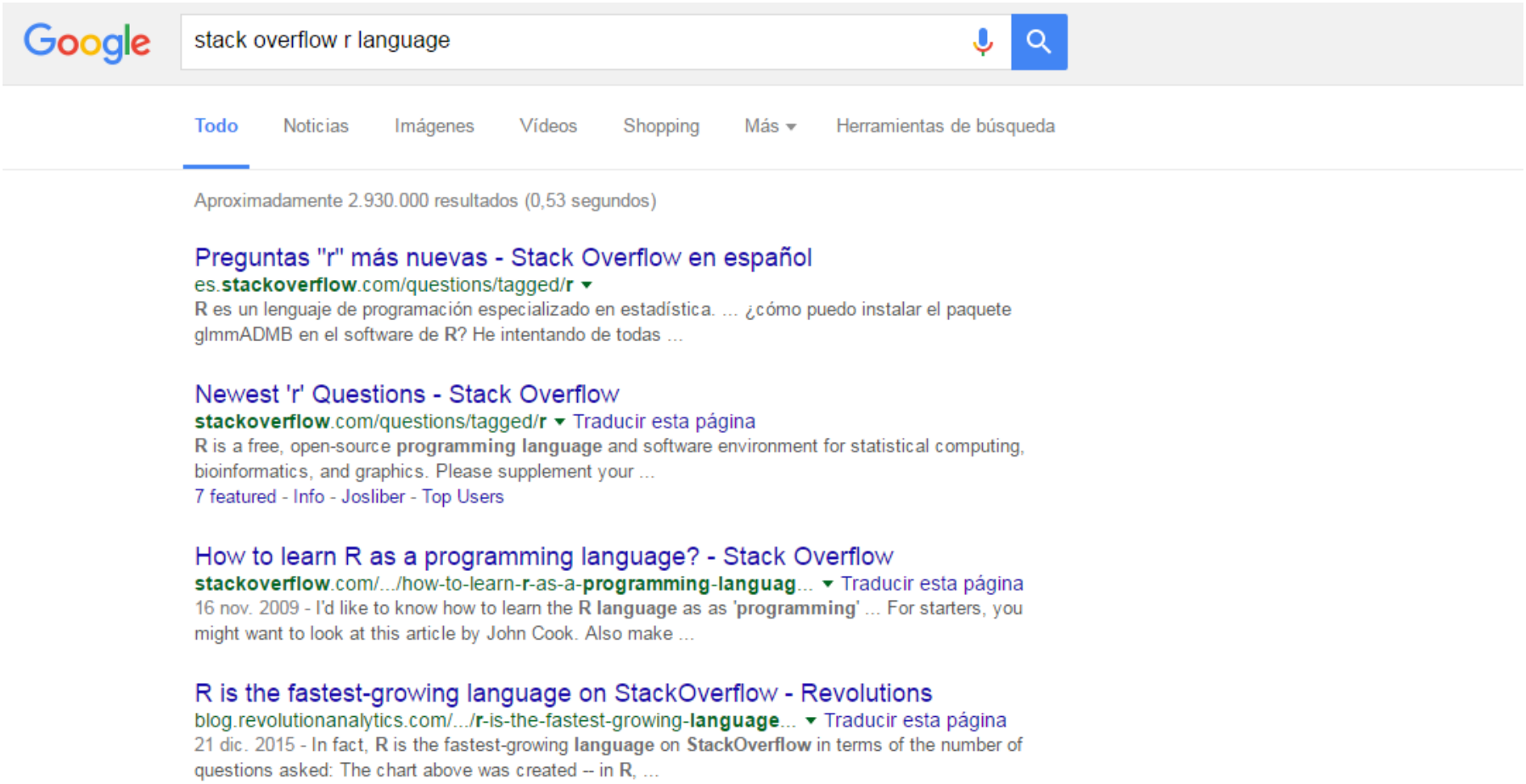
- Scripts: Files containing reproducible R code in the console
  - Files with extension .R



Getting Help

- **help.start**()
  - General Help
- **help**("mean")
  - specific help function
  - ? Mean
- **help.search**(“mean")
  - Find a function on any page Help
  - ?? mean
- **example**(mean)
  - Mostar an example of use of a function

Help - StackOverflow



Exercise 3

- Ask for help about ‘help' function
- Find the help pages where reference is made to this function
- Try write in the console help(
- Try write in the console "help

NOTE: Press the key **ESCAPE** in case of problems!

Exercise 3 (Solution)

```
> ?help
>
> ??help
>
> help(
+
+ )
>
> "help
+
+ "
[1] "help\n\n"
>
```

Packages

- Packages are collections of functions and data in R
- R comes with a standard set of packages
- Many more are available for download and installation
- Once installed, they must be charged before we can use them

Locate a Package

- It is easy to search packages through the tasks view CRAN

CRAN
Mirrors
What's new?
Task Views
Search

About R
R Homepage
The R Journal

Software
R Sources
R Binaries
Packages
Other

Documentation
Manuals
FAQs
Contributed

CRAN Task Views

Bayesian	Bayesian Inference
ChemPhys	Chemometrics and Computational Physics
ClinicalTrials	Clinical Trial Design, Monitoring, and Analysis
Cluster	Cluster Analysis & Finite Mixture Models
DifferentialEquations	Differential Equations
Distributions	Probability Distributions
Econometrics	Econometrics
Environmetrics	Analysis of Ecological and Environmental Data
ExperimentalDesign	Design of Experiments (DoE) & Analysis of Experimental Data
Finance	Empirical Finance
Genetics	Statistical Genetics
Graphics	Graphic Displays & Dynamic Graphics & Graphic Devices & Visualization
HighPerformanceComputing	High-Performance and Parallel Computing with R
MachineLearning	Machine Learning & Statistical Learning
MedicalImaging	Medical Image Analysis
MetaAnalysis	Meta-Analysis
Multivariate	Multivariate Statistics
NaturalLanguageProcessing	Natural Language Processing
NumericalMathematics	Numerical Mathematics
OfficialStatistics	Official Statistics & Survey Methodology
Optimization	Optimization and Mathematical Programming

https://cran.r-project.org/

Installing a new package

- The function **install.packages()** It is used to install new packages

```
> install.packages("ggplot2")
Warning in install.packages :
  downloaded length 227 != reported length 227
Installing package into 'C:/Users/se47351/Documents/R/win-library/3.1'
(as 'lib' is unspecified)
trying URL 'http://cran.rstudio.com/bin/windows/contrib/3.1/ggplot2_1.0.1.zip'
Content type 'application/zip' length 2676646 bytes (2.6 Mb)
opened URL
downloaded 2.6 Mb

package 'ggplot2' successfully unpacked and MD5 sums checked

The downloaded binary packages are in
 C:\Users\se47351\AppData\Local\Temp\RtmpURskAn\downloaded_packages
```

Using a package

- You need to use the function **library()** before using a package that is not within the package base R
- In this way all functions and data contained in the library are loaded into memory

```
>
> library(ggplot2)
Warning message:
package 'ggplot2' was built under R version 3.1.3
>
```

Exercise 4

- Install a package called “tidyverse”
- Load into memory functions contained in this library

https://www.tidyverse.org/

Exercise 4 (Solution)

```
> install.packages("tidyverse")
also installing the dependencies ‘mnormt’, ‘psych’, ‘DBI’, ‘selectr’, ‘broom’, ‘dplyr’,
s’, ‘haven’, ‘hms’, ‘modelr’, ‘purrr’, ‘readr’, ‘readxl’, ‘rvest’, ‘tidyr’, ‘xml2’

trying URL 'https://cran.rstudio.com/bin/windows/contrib/3.3/mnormt_1.5-5.zip'
Content type 'application/zip' length 101019 bytes (98 KB)
downloaded 98 KB

trying URL 'https://cran.rstudio.com/bin/windows/contrib/3.3/psych_1.6.12.zip'
Content type 'application/zip' length 3479216 bytes (3.3 MB)
downloaded 3.3 MB

> library(tidyverse)
Loading tidyverse: ggplot2
Loading tidyverse: tibble
Loading tidyverse: tidyr
Loading tidyverse: readr
Loading tidyverse: purrr
Loading tidyverse: dplyr
Conflicts with tidy packages ----------------------------------------------------------
filter(): dplyr, stats
lag():    dplyr, stats
>
```

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R as a calculator

- R console functions as a calculator
- R has the following arithmetic operators:

Operador	Descripción	Ejemplo
+	Suma	4 + 2 = 6
-	Resta	4 - 2 = 2
*	Multiplicación	4 * 2 = 8
/	División	4 / 2 = 2
^	Exponente	4 ^ 2 = 16
%%	Modulo	4 %% 2 = 0
%/%	División Entera	4 %/% 2 = 2

Exercise 5

- Prints the result of the following operations:
  - 1 plus 20 minus 5 (16)
  - 30 multiplied by 40 (1200)
  - 10 to the 4th power (10,000)
  - Multiply the result of substracting 34 from 340 by 50 (15,300)
  - Add the remainder of dividing 30 by 4 to the result of dividing 40 by 9 (using the integer division) (6)

Exercise 5 (Solution)

```
> 1 + 20 - 5
[1] 16
> 30 * 40
[1] 1200
> 10^4
[1] 10000
```

```
> (340-34)*50
[1] 15300
> (30 %% 4) + (40 %/% 9)
[1] 6
```

Variables

- A variable allows us to use a name to store a value
- The assignment operator **<-** assigns a value to a variable
- If a variable name is capitalized is not the same in lower case (case R is sensitive)

```
> x <- 1
> 
```

Type of data

- R has 5 types of data:
  - decimal values as 4.5
  - integers such as 4
    - You can specify that a value is an integer with the suffix L
  - complex numbers as (5 + 3i)
  - boolean values (TRUE or FALSE)
    - It may be abbreviated to T or F
  - Text values
    - Quotation marks are used to indicate that a value is text

Finding out the type of a variable

- The function **typeof()** gives information on the particular type

```
> a <- 4.5
> b <- 4L
> c <- (5 + 3i)
> d <- TRUE
> e <- "VALOR"
```

```
> print(a)
[1] 4.5
> print(b)
[1] 4
> print(c)
[1] 5+3i
> print(d)
[1] TRUE
> print(c)
[1] 5+3i
```

```
> typeof(a)
[1] "double"
> typeof(b)
[1] "integer"
> typeof(c)
[1] "complex"
> typeof(d)
[1] "logical"
> typeof(e)
[1] "character"
```

Exercise 6

- Assigns the value 5 to the variable “**a**”
- Subtract 4 to the variable “**A**”
- Prints the value of the variable “**a**”
- Prints its type
- Assign your name to the variable “**name**”

Exercise 6 (Solution)

```
> a <- 5
> A - 4
Error: object 'A' not found
> print(a)
[1] 5
> typeof(a)
[1] "double"
> name <- "Daniel"
```

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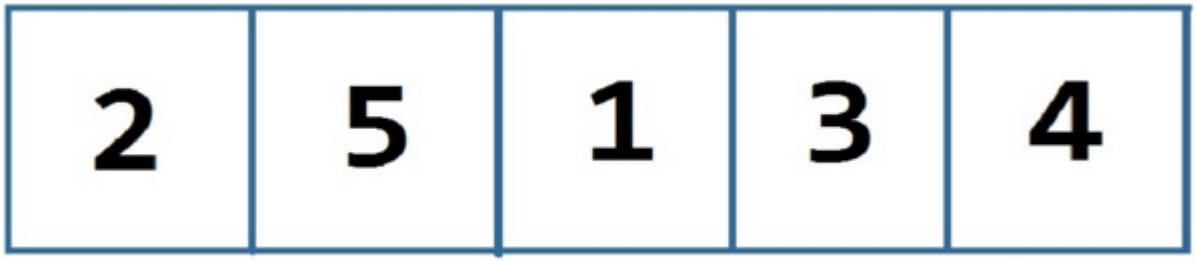
Vectors

- The most basic structure data with which operates R is a **vector**
- A vector is a collection of data of the same type



Create a vector

- The operator **:** is used to create vectors number sequences

```
> x <- 1:10
> x
 [1]  1  2  3  4  5  6  7  8  9 10
>
> x <- 1:100
> x
  [1]   1   2   3   4   5   6   7   8   9  10  11  12  13  14  15  16
 [17]  17  18  19  20  21  22  23  24  25  26  27  28  29  30  31  32
 [33]  33  34  35  36  37  38  39  40  41  42  43  44  45  46  47  48
 [49]  49  50  51  52  53  54  55  56  57  58  59  60  61  62  63  64
 [65]  65  66  67  68  69  70  71  72  73  74  75  76  77  78  79  80
 [81]  81  82  83  84  85  86  87  88  89  90  91  92  93  94  95  96
 [97]  97  98  99 100
>
```

Create a vector

- The function **c()** It is used to create a vector with a list of elements of the same type

```
> x <- 1:5
>
> x
[1] 1 2 3 4 5
>
> x <- c(1, 2, 3, 4, 5)
> x
[1] 1 2 3 4 5
```

Create a vector

- The function **seq()** is used to create sequences of numbers
- But if you need a table with a repetition of values use **rep()**

```
> seq(from = 10, to = 20, by = 2)
[1] 10 12 14 16 18 20
>
> rep("A", 100)
  [1] "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A"
 [17] "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A"
 [33] "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A"
 [49] "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A"
 [65] "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A"
 [81] "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A" "A"
 [97] "A" "A" "A" "A"
>
```

Length of a vector

- The function **length()** It allows for the elements of a vector

```
> x <- 1:10
> x
 [1]  1  2  3  4  5  6  7  8  9 10
>
> length(x)
[1] 10
>
```

Exercise 7

- Create a vector of numbers from 1 to 10
- Create a vector with the numbers 4, 5, 1, -1 and 0
- Create a vector of numbers from 10 to 1
- Create a vector of words with your full name
- Create a vector with 2 sentences
- Create a vector with numbers from 5 to 100 containing only multiples of 5
- Create a table of 10 elements all filled with the number 1 and print its size

Exercise 7 (Solution)

```
> 1:10
 [1]  1  2  3  4  5  6  7  8  9 10
> c(4, 5, -1, 0)
[1]  4  5 -1  0
> 10:1
 [1] 10  9  8  7  6  5  4  3  2  1
> c("Daniel", "Villanueva", "Jimenez")
[1] "Daniel"     "Villanueva" "Jimenez"
> c("Hola que tal?", "Te gusta R")
[1] "Hola que tal?" "Te gusta R"
> seq(5, 100, 5)
 [1]   5  10  15  20  25  30  35  40  45  50  55  60  65  70  75  80  85
[18]  90  95 100
> rep(1,10)
 [1] 1 1 1 1 1 1 1 1 1 1
```

Operate with a vector

- R operations are vectorized
- If an operation is performed with a vector, the operation is applied to all elements

```
> x
[1] 1 2 3 4 5
>
> x + 1
[1] 2 3 4 5 6
>
> x * 2
[1]  2  4  6  8 10
>
> x == 4
[1] FALSE FALSE FALSE  TRUE FALSE
>
> x >= 4
[1] FALSE FALSE FALSE  TRUE  TRUE
>
```

Exercise 8

- Create a table with numbers 1 through 10 and assign it to the variable "x"
- Add 1 to the vector "x"
- Compare the vector "x" with the number 5 and assign the result to vector "z"
- Create a vector with numbers from 10 to 5 and assign it to the variable "y"
- Add the vector "x" and the vector "y" (+)

Exercise 8 (Solution)

```
>
> x <- 1:10
> x
 [1]  1  2  3  4  5  6  7  8  9 10
> x + 1
 [1]  2  3  4  5  6  7  8  9 10 11
> z <- x == 5
> z
 [1] FALSE FALSE FALSE FALSE  TRUE FALSE FALSE FALSE FALSE FALSE
> y <- 10:5
> y
[1] 10  9  8  7  6  5
> x + y
 [1] 11 11 11 11 11 11 17 17 17 17
Warning message:
In x + y : longer object length is not a multiple of shorter object length
>
```

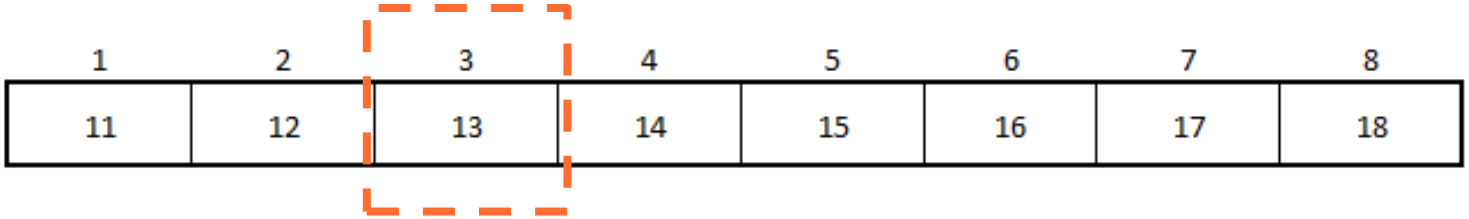
Selecting from a vector

- To select a vector element through its index symbols are used **[Y]**

1	2	3	4	5	6	7	8
11	12	13	14	15	16	17	18

Selecting from a vector

- To select a vector element through its index symbols are used [Y]



Selecting from a vector

- To select a vector element through its index symbols are used **[Y]**

```
> x <- 11:18
>
> x
[1] 11 12 13 14 15 16 17 18
>
> x[3]
[1] 13
```

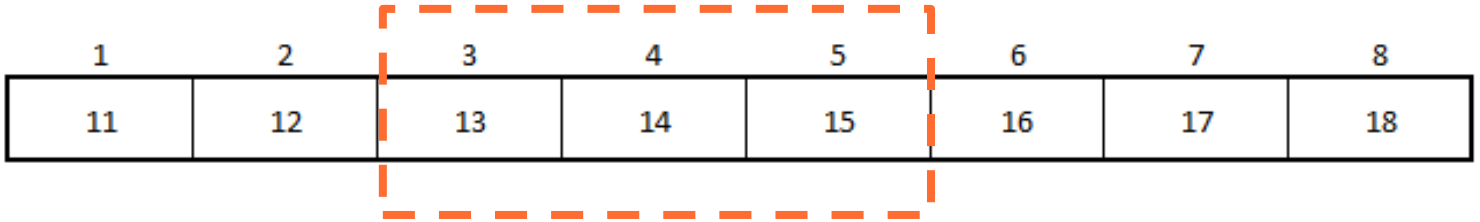
Selecting from a vector

- You can select more than one item ..

1	2	3	4	5	6	7	8
11	12	13	14	15	16	17	18

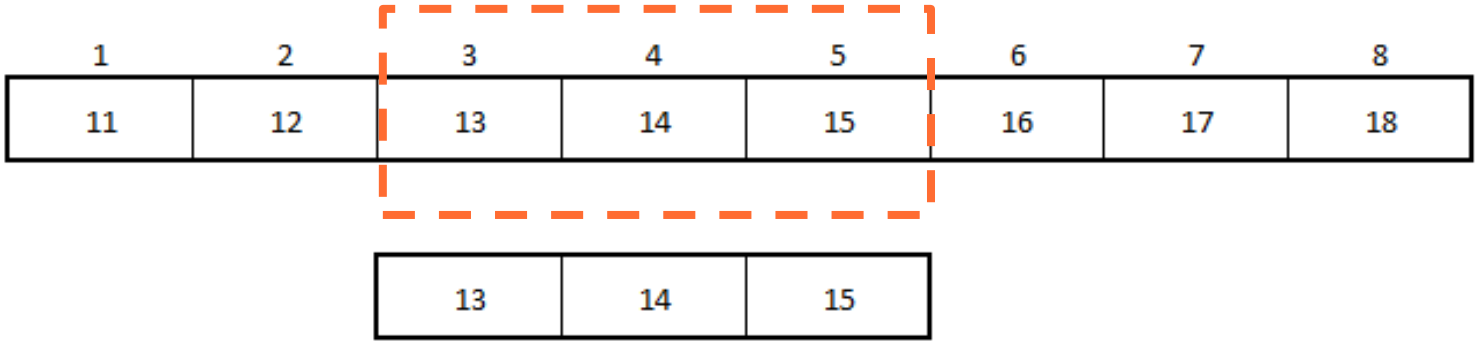
Selecting from a vector

- You can select more than one item ...



Selecting from a vector

- You can select more than one item ...



Selecting from a vector

- You can select more than one item ...

```
> x <- c(11:18)
> x
[1] 11 12 13 14 15 16 17 18
>
> x [ 3:5 ]
[1] 13 14 15
>
```

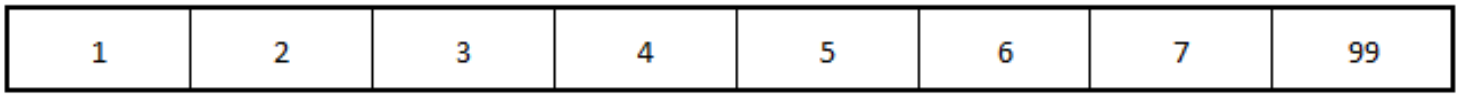
Selecting from a vector

- If we put a negative number instead of a positive one, we are asking R to exclude a position (but include all the others)

```
> x <- 1:10
> x
 [1]  1  2  3  4  5  6  7  8  9 10
> x[c(-1, -10)]
[1] 2 3 4 5 6 7 8 9
> 
```

Selecting from a vector

- R can be selected elements of a vector through another vector of logic values



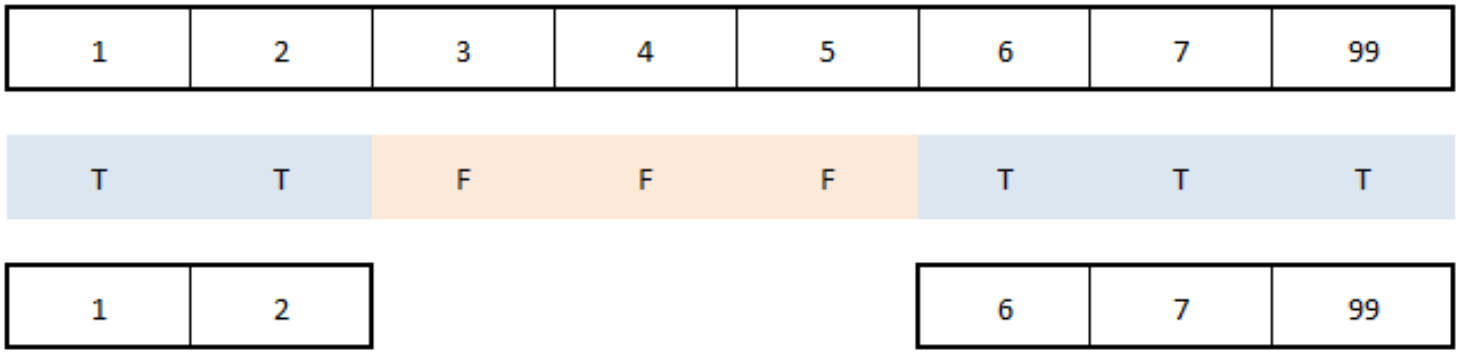
Selecting from a vector

- In R can be selected elements of a vector through another vector of logic values

1	2	3	4	5	6	7	99
T	T	F	F	F	T	T	T

Selecting from a vector

- In R can be selected elements of a vector through another vector of logic values



Selecting from a vector

- In R can be selected elements of a vector through another vector of logic values

```
> x <- c(1, 2, 3, 4, 5, 5, 6, 7, 99)
>
> y <- c(T, T, F, F, F, T, T, T, T)
>
> x[y]
[1]  1  2  5  6  7 99
>
```

Logical operations

- R has the following logical operators:

Operador	Descripción	Ejemplo
<	Menor	4 < 2 (Falso)
>	Mayor	4 > 2 (Cierto)
<=	Menor o igual	4 <= 2 (Falso)
>=	Mayor o igual	4 >= 2 (Cierto)
==	Igual	4 == 2 (Falso)
!=	No igual	4 != 2 (Cierto)
!	Negación	! (4 < 2) (Cierto)
&	AND Lógico	4 > 2 & 4 == 4 (Cierto)
|	OR Lógico	4 < 2 | 4 == 4 (Cierto)
%in%	Identifica si un elemento pertenece a un vector	2 %in% 1:5 (Cierto)

Exercise 9

- Create a vector called "x" with the numbers: 5, 9, 100, -1 and 10
- Print the numbers found in the first and last position
- Print 3 central positions "x"
- Print the numbers are greater than 9
- Print numbers less than 0
- Print numbers other than 100
- Print numbers equal to 100 or less than 0
- Check whether the number 9 is on the table "x"

Exercise 9 (Solution)

```
> x <- c(5, 9, 100, -1, 10)
> x
[1]   5   9 100  -1  10
> x[c(1, length(x))]
[1]  5 10
> x[2:4]
[1]   9 100  -1
> x[ x > 9 ]
[1] 100  10
> x[ x < 0 ]
[1] -1
> x[ x != 100]
[1]  5  9 -1 10
>
> x [x == 100 | x < 0]
[1] 100  -1
> 9 %in% x
[1] TRUE
>
```

Replacing elements in a vector

- To replace a particular position of a vector assignment operator is used (**<-**) Along with the selection **[]**

```
> x <- 1:5
> x
[1] 1 2 3 4 5
>
> x[1] <- 99
> x
[1] 99  2  3  4  5
>
```

Exercise 10

- Create a vector of numbers 5, 9, 100, -1 and 10 and assign it to the variable "x"
- Add at the end of this vector a new element with the number 1000
- Add an element with the number 0 at the beginning
- Modify position 7 so that its value is -23
- Modify 2, 3 and 4 positions of the vector, so all these positions have 1

```
[1]   0   1   1   1  -1  10 -23
```

Exercise 10 (Solution)

```
> x <- c(5, 9, 100, -1 , 10)
> x
[1]   5   9 100  -1  10
> x <- c(x, 1000)
> x
[1]    5    9  100   -1   10 1000
> x <- c(0, x)
> x
[1]    0    5    9  100   -1   10 1000
> x[7] = -23
> x
[1]   0   5   9 100  -1  10 -23
> x[2:4] <- 1
> x
[1]   0   1   1   1  -1  10 -23
>
```

Tables with names

- R may assign a name to each vector element and select items by name
  - Similar to a dictionary

```
> x <- 1:3
> x
[1] 1 2 3
> names(x) <- c("Uno", "Dos", "Tres")
> x
 Uno  Dos Tres
   1    2    3
> names(x)
[1] "Uno"  "Dos"  "Tres"
> x["Uno"]
Uno
  1
> unname(x)
[1] 1 2 3
> |
```

Vector with names

- Once a vector has elements name can be selected through this name

```
> x <- c("Uno" = 1, "Dos" = 2, "Tres" = 3)
> x
 Uno  Dos Tres
   1    2    3
>
> x["Uno"]
Uno
  1
```

Exercise 11

- Print the value of the vector called "letters"
- Create a table called "x" with the numbers 1 to 26
- Name the elements of the vector "x" with the letters of the alphabet
- Print the value that is in the “d” position
- Assign to a vector called “y" the names of vector "x"

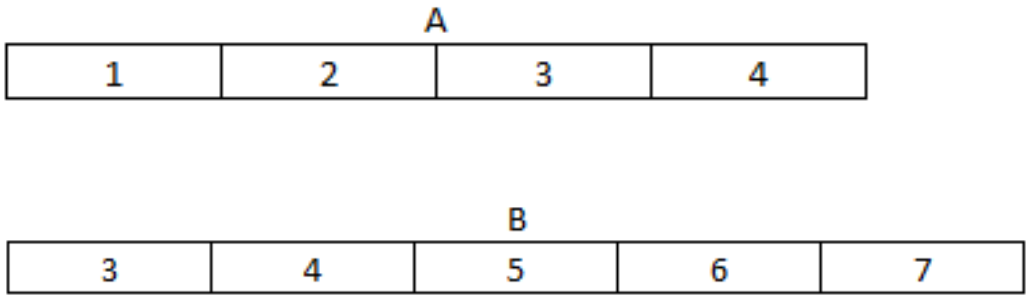
Exercise 11 (Solution)

```
> letters
 [1] "a" "b" "c" "d" "e" "f" "g" "h" "i" "j" "k" "l" "m" "n" "o" "p" "q"
[18] "r" "s" "t" "u" "v" "w" "x" "y" "z"
> x <- 1:26
> x
 [1]  1  2  3  4  5  6  7  8  9 10 11 12 13 14 15 16 17 18 19 20 21 22
[23] 23 24 25 26
> names(x) <- letters
> x
 a  b  c  d  e  f  g  h  i  j  k  l  m  n  o  p  q  r  s  t  u  v  w  x
 1  2  3  4  5  6  7  8  9 10 11 12 13 14 15 16 17 18 19 20 21 22 23 24
 y  z
25 26
> x["d"]
d
4
> y <- names(x)
> y
 [1] "a" "b" "c" "d" "e" "f" "g" "h" "i" "j" "k" "l" "m" "n" "o" "p" "q"
[18] "r" "s" "t" "u" "v" "w" "x" "y" "z"
>
```

Set operations

- R has a series of operations to perform operations on vector sets

```
> a <- 1:4
> b <- 3:7
> union(a,b)
[1] 1 2 3 4 5 6 7
> intersect(a,b)
[1] 3 4
> setdiff(a,b)
[1] 1 2
> setdiff(b,a)
[1] 5 6 7
> 2 %in% a
[1] TRUE
```



Exercise 12

- Create a vector called "x" with the numbers from 1 to 10
- Create another vector called «and» with the numbers from 5 to 15
- Print the union of "x" and "y"
- Print intersection
- Print the elements that are in «x» but not in «y»
- Print the elements that are in «y» but not in «x»
- Check if the number 2 is in the vector "x"

Exercise 12 (Solution)

```
> x <- 1:10
> x
 [1]  1  2  3  4  5  6  7  8  9 10
> y <- 5:15
> y
 [1]  5  6  7  8  9 10 11 12 13 14 15
> union(x,y)
 [1]  1  2  3  4  5  6  7  8  9 10 11 12 13 14 15
> intersect(x, y)
[1]  5  6  7  8  9 10
> setdiff(x, y)
[1] 1 2 3 4
> setdiff(y, x)
[1] 11 12 13 14 15
> 2 %in% x
[1] TRUE
>
```

Ordering a vector

- The **sort**() function is used to sort the elements of a vector

```
> x <- c(3, 1, 3, 4, 5, 2, 3, 2, 1, 3, 4, 5)
>
> x
 [1] 3 1 3 4 5 2 3 2 1 3 4 5
>
> sort(x)
 [1] 1 1 2 2 3 3 3 3 4 4 5 5
>
> sort(x, decreasing = T)
 [1] 5 5 4 4 3 3 3 3 2 2 1 1
>
```

Exercise 13

- Create a vector called "x" with the numbers 10, 3, 1, 4 and -1
- Sort in ascending order
- Sort in descending order

Exercise 13 (Solution)

- Create a vector called "x" with the numbers 10, 3, 1, 4 and -1
- Sort in ascending order
- Sort in descending order

```
>
> x <- c(10, 3, 1, 4, -1)
> x
[1] 10  3  1  4 -1
> sort(x)
[1] -1  1  3  4 10
> sort(x, decreasing = TRUE)
[1] 10  4  3  1 -1
>
```

Counting elements in a vector

- The **table**() function is used to obtain the frequency of the elements of a vector

```
> x <- c(3, 1, 3, 4, 5, 2, 3, 2, 1, 3, 4, 5)
> x
 [1] 3 1 3 4 5 2 3 2 1 3 4 5
>
> sort(x)
 [1] 1 1 2 2 3 3 3 3 4 4 5 5
>
> table(x)
x
1 2 3 4 5
2 2 4 2 2
>
```

Exercise 14

- Create a vector "x" with elements 1, 4, 2, 2, 4, 1, 5, 5, 5, 1, 5 and 7
- Create a vector "t" with the frequency of the elements of the vector "x"
- Create a vector "n" with the names of the vector "t"
- Show vector "n" in descending order
- Displays the descending ordered table:

```
7 5 4 2 1
1 4 2 2 3
```

Exercise 14 (Solution)

```
> x <- c(1, 4, 2, 2, 4, 1, 5, 5, 5, 1, 5 , 7)
> x
 [1] 1 4 2 2 4 1 5 5 5 1 5 7
> t <- table(x)
> t
x
1 2 4 5 7
3 2 2 4 1
> n <- names(t)
> n
[1] "1" "2" "4" "5" "7"
> sort(n, decreasing = TRUE)
[1] "7" "5" "4" "2" "1"
> t[sort(n, decreasing = TRUE)]
x
7 5 4 2 1
1 4 2 2 3
>
```

Special numbers

- **Inf** represents infinite / -**Inf** represents minus infinity
- **NaN** represents an undefined value (Not a Number)
- **NA** It represents a nonexistent value

```
> 1 / 0
[1] Inf
> 0 / 0
[1] NaN
> c(1, NA, 2)
[1]  1 NA  2
>
```

Special numbers

- The **is.na ()** function is used to verify the data that is **NA** in a vector
- In the same way **is.nan ()** can be used for **NaN** data

```
> x <- c(2, 32, NA, 43, 2, 1, 23, NaN)
> is.na(x)
[1] FALSE FALSE  TRUE FALSE FALSE FALSE FALSE  TRUE
>
> is.nan(x)
[1] FALSE FALSE FALSE FALSE FALSE FALSE FALSE  TRUE
> |
```

Exercise 15

- Create a vector called «x» with the following elements: 1, NA, 0, 0, 12, 34, NaN, 21
- Create a logical vector called "y" indicating that positions are not filled in the vector "x" (TRUE if the value is NA or NaN)
- Show values of "x" that are empty
- Show values of "x" that are filled (Not empty)

NOTE: Use the vector "y" to help you

Exercise 15 (Solution)

```
> x <- c(1, NA, 0, 0, 12, 34, NaN, 21)
> y <- is.na(x)
> y
[1] FALSE  TRUE FALSE FALSE FALSE FALSE  TRUE FALSE
> x[y]
[1]  NA NaN
> x[!y]
[1]  1  0  0 12 34 21
>
```

Factors

- The factors are used to represent categories in R

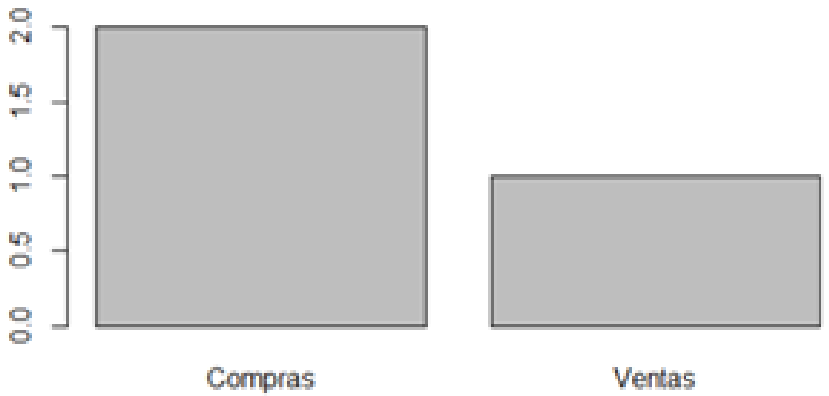
```
> x <- c("Yes", "No", "Yes")
> x
[1] "Yes" "No"  "Yes"
> f <- factor(x)
>
> f
[1] Yes No  Yes
Levels: No Yes
>
> unclass(f)
[1] 2 1 2
attr(,"levels")
[1] "No"  "Yes"
> |
```

Exercise 16

- Create a vector called "x" with the elements "Purchases", "Sales" and "Purchases"
- Create a factor called "f" with the content of "x"
- Print the frequency of the variable «f»
- Use the plot function show f graphically

Exercise 16 (Solution)

```
> x <- c("Compras", "Ventas", "Compras")
> x
[1] "Compras" "Ventas"  "Compras"
> f <- factor(x)
> f
[1] Compras Ventas  Compras
Levels: Compras Ventas
> table(f)
f
Compras  Ventas
      2       1
> plot(f)
>
```



Index

Descriptive statistics

- **sum ()** returns the sum of all vector elements
- **length()** returns the length of a vector
- **min ()** the minimum value
- **max()** the maximum value

```
> ages <- c(25, 22, 18, 20, 22)
> ages
[1] 25 22 18 20 22
> sum(ages)
[1] 107
> min(ages)
[1] 18
> max(ages)
[1] 25
> length(ages)
[1] 5
>
```

Descriptive statistics

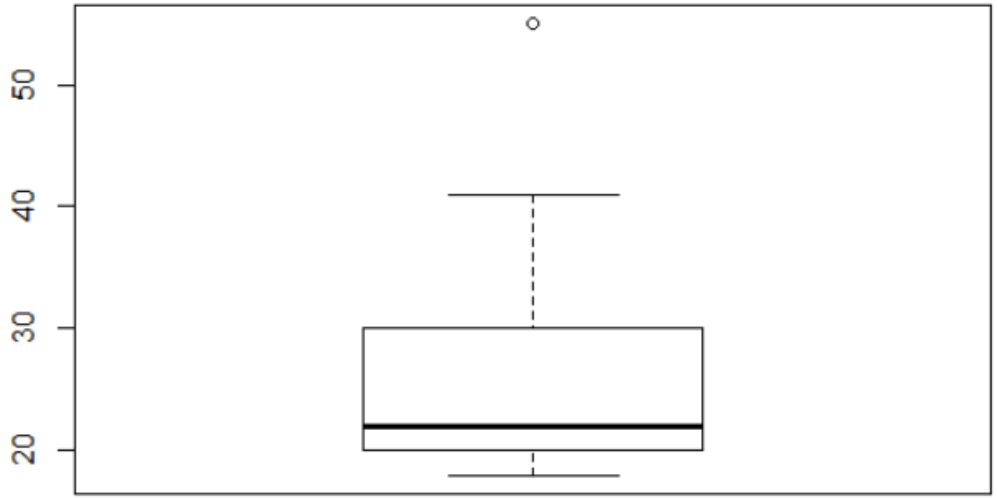
- **mean ()** returns the average of the values of a vector
- **median ()** the median
- **sd()** standard deviation
- **var()** variance

```
> ages <- c(25, 22, 18, 20, 22)
> mean(ages)
[1] 21.4
> median(ages)
[1] 22
> sd(ages)
[1] 2.607681
> var(ages)
[1] 6.8
```

Descriptive statistics

- **summary()** It shows data distribution

```
> ages <- c(19, 25, 22, 18, 20, 22, 30, 22, 55, 41)
> summary(ages)
   Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
  18.00   20.50   22.00   27.40   28.75   55.00
>
```



Exercise 17

- Creates a vector named "x" with the following values: 36, 28, 19, 22, 27, 28, NA, 28, 39, 46, 43, 27, 30, 54 and NA
- Calculate the average vector. What happen?
- Now calculate the mean using the function **mean** with function **is.na** to remove nulls
- Is it possible to calculate the average without using the is.na function?

Exercise 17 (Solution)

```
> x <- c(36, 28, 19, 22, 27, 28, NA, 28, 39, 46, 43, 27, 30, 54, NA)
> mean(x)
[1] NA
> mean(x[!is.na(x)])
[1] 32.84615
> help(mean)
> mean(x, na.rm = TRUE)
[1] 32.84615
>
```

Exercise 18

- Create a vector called "x" with the following values: 36, 28, 19, 22, 27, 28, NA, 28, 39, 46, 43, 27, 30, 54 and NA
- Prints the vector size
- Print your average (without using the mean function)
- Print your range (maximum value minus minimum)
- Prints its variance (without using the var function)

$$\frac{1}{n-1}\sum_{i=1}^{n}(x_i - \bar{x})^2$$

- Based on the previous calculation it prints the standard deviation
- Calculate the median (without using median)
- Calculate the mode (value that is most repeated from the vector

Index

Probability distributions in R

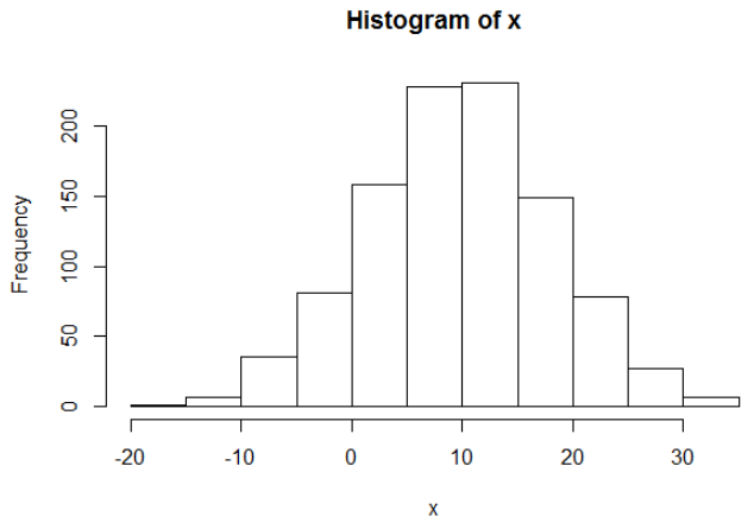
- R comes with a series of standard probability distributions, such as the normal distribution
- This allows us to generate random numbers according to a certain distribution
- Use the **help (distributions)** function to see them

```
> help(Distributions)
>
```

Normal distribution

- To generate random numbers according to the normal distribution, use **rnorm()**

```
> x <- rnorm(1000, mean = 10, sd = 8)
> x[1:10]
 [1]  0.03286958  7.26519636 10.50557568  4.54998383  2.41240307
 [6] 14.75232535 -4.17608221 -7.72921943  5.31683759  5.43566948
>
```



Random seed

- The **set.seed()** function allows you to set the random seed for all functions that generate random values
- In this way you can get reproducible examples

```
> set.seed(100)
> rnorm(10)
 [1] -0.50219235  0.13153117 -0.07891709  0.88678481  0.11697127  0.31863009
 [7] -0.58179068  0.71453271 -0.82525943 -0.35986213
>
> set.seed(100)
> rnorm(10)
 [1] -0.50219235  0.13153117 -0.07891709  0.88678481  0.11697127  0.31863009
 [7] -0.58179068  0.71453271 -0.82525943 -0.35986213
>
```

Sampling

- The **sample ()** function is used to obtain an example of a vector of numbers

```
>
> set.seed(10)
>
> sample(1:10, 2, prob = rep(0.1, 10), replace = F)
[1] 7 4
>
> sample(1:10, 20, prob = c(0.25, 0.25, rep(0.05, 8)), replace = T)
 [1] 1 6 2 2 2 2 5 1 5 3 2 3 1 1 2 2 1 8 8 5
>
```

Exercise 19

- Set the random seed to 2017
- Create a vector called a of 20 random numbers according to the uniform distribution
- Create a vector called «b» of 20 random numbers with values between 0 and 1
- Create a vector called «c» of 20 random numbers between 1 and 3 where the probability of a 1 coming out is 60%, 2 is 30% and 3 is 10%
- Create a vector called “d” of 20 random letters based on the vector letters

Exercise 19 (Solution)

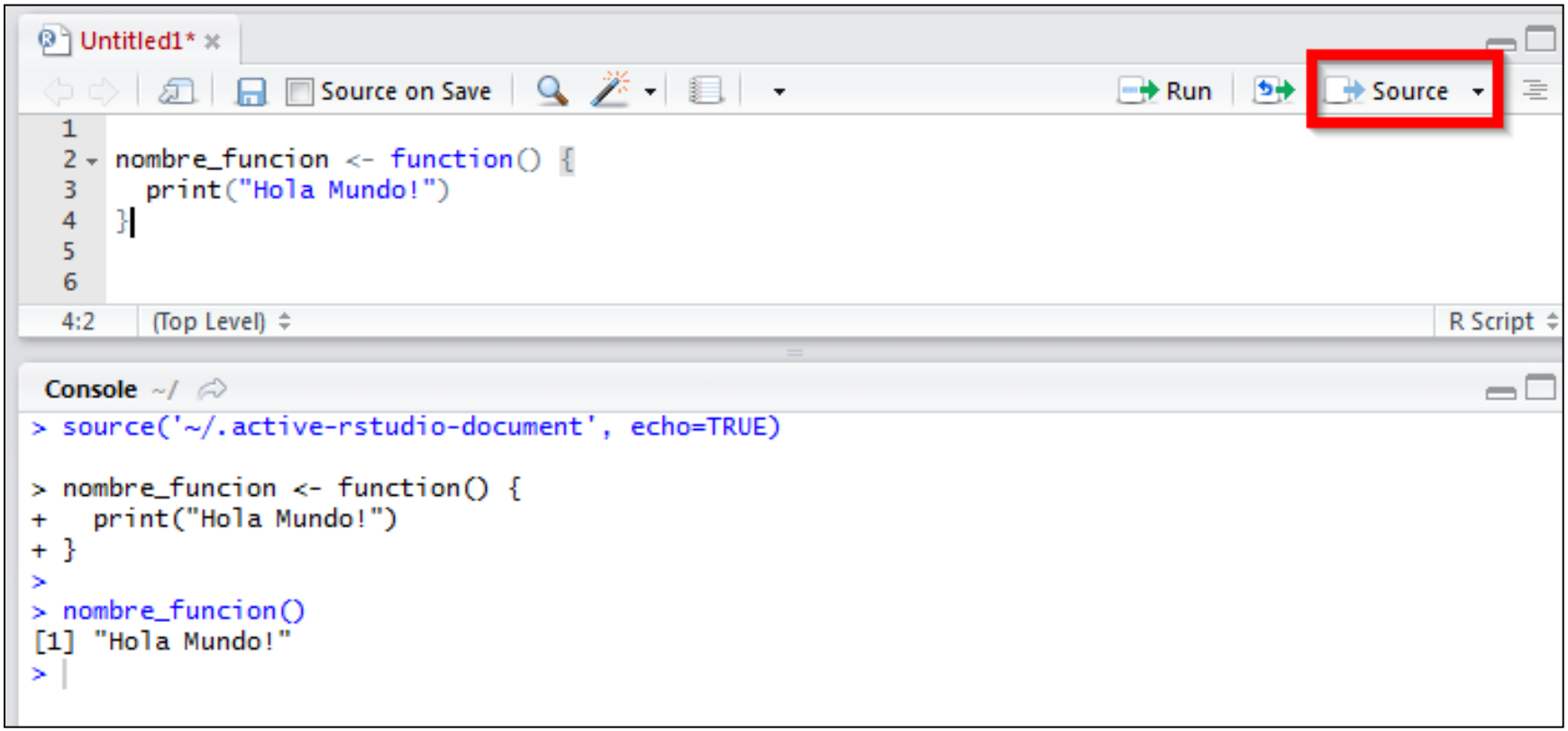
```
> set.seed(2017)
> a <- runif(20)
> b <- sample(0:1, 20, replace = T)
> c <- sample(1:3, 20, prob = c(0.6, 0.3, 0.1), replace = T)
> d <- letters[sample(1:length(letters), 20, replace=T)]
>
> sum(a)
[1] 9.883234
> sum(b)
[1] 9
> sum(c)
[1] 32
> d
 [1] "g" "j" "p" "t" "s" "m" "e" "c" "q" "r" "z" "r" "d" "w" "z" "j" "k" "n" "k" "y"
>
```

Index

Functions in R

- Everything you use in R is a function
- The libraries allow you to use additional features
- R can easily write new features

Functions in R



Functions in R

- When writing the code of a function without parentheses in the console, the function code is shown

```
> nombre_funcion
function() {
  print("Hola Mundo!")
}
> 
```

Functions in R

- The function **return**() allows the function to return a value

```
nombre_funcion <- function() {
  return(27)
}

> nombre_funcion()
[1] 27
>
> nombre_funcion() + 3
[1] 30
>
```

Functions in R

- In the case of no use of **return**() is always returned the result of the last expression

```
nombre_funcion <- function() {
  9 * 3
}

> nombre_funcion()
[1] 27
>
```

Functions in R

- The function returns a value that can be stored in a new variable

```
> x = nombre_funcion()
> print(x)
[1] 27
> 
```

Functions in R

- Within a function we can use new variables ...

```
nombre_funcion <- function() {
  x = 20
  y = 30
  x + y
}

> nombre_funcion()
[1] 50
>
```

Functions in R

- We can even use a variable that has been previously declared without affecting its value

```
nombre_funcion <- function() {
  x = 32
  print(x)
}

> x = 0
> nombre_funcion()
[1] 32
>
> print(x)
[1] 0
>
```

Parameters

- To specify the input data to a function used parameters
- Note: You could use any variable name

```
nombre_funcion <- function(input) {
  input + 1
}

> nombre_funcion(10)
[1] 11
>
> nombre_funcion()
Error in nombre_funcion() : argument "input" is missing, with no default
>
```

Parameters

- We can use any number of parameters ...

```
nombre_funcion <- function(x, y) {
  (x * 3) + y
}

> nombre_funcion(10, 5)
[1] 35
>
```

Solving problems

- A common tactic in case of problems is to print intermediate results

```
nombre_funcion <- function(x) {
  y = x * 3
  z = y * x + 5
  z + 5
}

 > nombre_funcion(15)
 [1] 685
 >
```

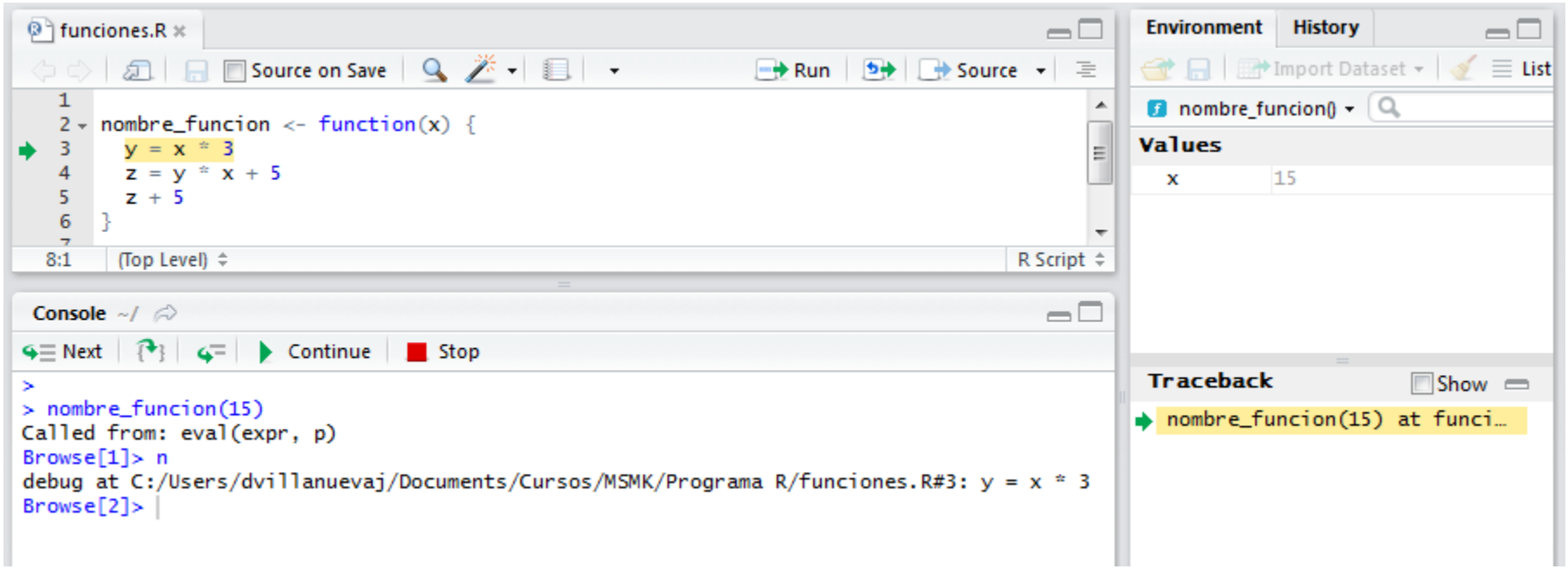
Solving problems

- A common tactic in case of problems is to print intermediate results

```
nombre_funcion <- function(x) {
  y = x * 3
  print(c("y =", y))
  z = y * x + 5
  print(c("z =", z))
  z + 5
}

> nombre_funcion(15)
[1] "y =" "45"
[1] "z =" "680"
[1] 685
>
```

Solving problems

- Another tactic is to set breakpoints and do "debug“ inside the function



Exercise 20

- Write a function called "**operation**“ that accepts a single numeric parameter
- The purpose of the function is to add all the vector values
- Test function with the vector [1, 2, 3, 4, 5]

```
> operacion(1:5)
[1] 15
>
```

Exercise 20 (Solution)

```
> operacion <- function(input) {
+     return(sum(input))
+ }
>
> operacion(1:5)
[1] 15
>
```

Control Structures

- Control structures allow control of command execution

```
> ?Control
>
```

Control {base} R Documentation

Control Flow

Description

These are the basic control-flow constructs of the R language. They function in much the same way as control statements in any Algol-like language. They are all reserved words.

Usage

```
if(cond) expr
if(cond) cons.expr  else  alt.expr

for(var in seq) expr
while(cond) expr
repeat expr
break
next
```

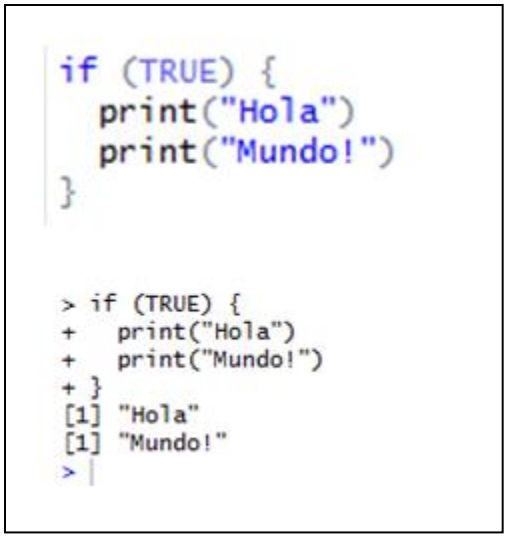
Control Structures

- **If()** allows only run a block of code if a condition is met

```
if (condición) {
  bloque código
}
```

Control Structures

- **If()** allows only run a block of code if a condition is met



Control Structures

- **If()** allows only run a block of code if a condition is met

```
if (FALSE) {
  print("Hola")
  print("Mundo!")
}

> if (FALSE) {
+   print("Hola")
+   print("Mundo!")
+ }
>
```

Control Structures

- **If()** can include a block **else** to run a block of code if the condition is not met

```
if (condición) {
  bloque código
} else {
  bloque código
}
```

Control Structures

- **If()** can include a block **else** to run a block of code if the condition is not met

```
if (TRUE) {
  print("Se cumple la condición")
} else {
  print("NO se cumple la condición")
}
```

```
> if (TRUE) {
+   print("Se cumple la condición")
+ } else {
+   print("NO se cumple la condición")
+ }
[1] "Se cumple la condición"
>
```

Logical operators

- R has the following logical operators

Operador	Descripción	Ejemplo
<	Menor	4 < 2 (Falso)
>	Mayor	4 > 2 (Cierto)
<=	Menor o igual	4 <= 2 (Falso)
>=	Mayor o igual	4 >= 2 (Cierto)
==	Igual	4 == 2 (Falso)
!=	No igual	4 != 2 (Cierto)
!	Negación	! (4 < 2) (Cierto)
&	AND Lógico	4 > 2 & 4 == 4 (Cierto)
|	OR Lógico	4 < 2 | 4 == 4 (Cierto)
%in%	Identifica si un elemento pertenece a un vector	2 %in% 1:5 (Cierto)

Exercise 21

- Modifies the function "**operation**" to check the type of its argument
- For other value than a number, you must display the following error "parameter must be numeric!"
  - Use the **stop ()** function
- In the event that the argument is numeric must show the sum of its parts

```
> operacion("323")
Error in operacion("323") : El parámetro debe de ser númerico!
> operacion(323:3)
[1] 52323
> |
```

Exercise 21 (Solution)

```
> operacion <- function(input) {
+
+     if (!is.numeric(input)) {
+         stop("El parámetro debe de ser númerico!")
+     }
+
+     return(sum(input))
+ }
>
> operacion("323")
Error in operacion("323") : El parámetro debe de ser númerico!
> operacion(323:3)
[1] 52323
>
```

Exercise 22

- Modifies the function "**operation**" to allow the function to accept an argument that performs the operation

```
> operacion(1:10, mean)
[1] 5.5
> operacion(1:10, sum)
[1] 55
```

Exercise 22 (Solution)

```
>
> operacion <- function(input, f) {
+
+     if (!is.numeric(input)) {
+         stop("El parámetro debe de ser número!")
+     }
+
+     f(input)
+ }
> operacion(12:2, sum)
[1] 77
> operacion(12:2, mean)
[1] 7
>
```

Parameters with default values

- In a function, when a parameter is declared, you can specify a default value

```
nombre_funcion <- function(input = 1:10) {
  # Cuerpo de la función
  sum(input)
}

> nombre_funcion(1:1000)
[1] 500500
>
> nombre_funcion()
[1] 55
>
```

Exercise 23

- Modifies the behavior of the function "**operation**" so if it is not supplied any function, the **sum** function will be used

```
> operacion(1:10, mean)
[1] 5.5
> operacion(1:10, sum)
[1] 55
> operacion(1:10)
[1] 55
>
```

Exercise 23 (Solution)

```
> operacion <- function(input, f = sum) {
+     if (!is.numeric(input)) {
+         stop("El parámetro debe de ser número!")
+     }
+     f(input)
+ }
> operacion(1:10, mean)
[1] 5.5
> operacion(1:10, sum)
[1] 55
> operacion(1:10)
[1] 55
>
```

Loop for

- Loop **for**() traverses a vector executing the commands found between the braces:

```
> for (k in 1:5){
+     print(1:k)
+ }
[1] 1
[1] 1 2
[1] 1 2 3
[1] 1 2 3 4
[1] 1 2 3 4 5
> 
```

Exercise 24

- Create a function called "**print_vector**"Print on screen all the odd elements of vector passed as an argument

```
> print_vector(1:10)
[1] 1
[1] 3
[1] 5
[1] 7
[1] 9
>
```

Exercise 24 (Solution)

```
> print_vector <- function(input) {
+
+     if (length(input) == 0) {
+         stop("El parámetro tiene que tener datos!")
+     }
+
+     for (elemento in input) {
+         if (elemento %% 2 == 0) {
+             next
+         }
+         print(elemento)
+     }
+ }
> print_vector(1:10)
[1] 1
[1] 3
[1] 5
[1] 7
[1] 9
>
```

Exercise 25

- Write a function in R implementing the QuickSort algorithm

```
function quicksort(array):

    si el array está vacio salir y devolver un array vacio

    pivots = elementos del array iguales al primer elemento
    lesser = elementos del array menores al primer elemento
    greatter = elementos del array mayores al primer elemento

    devolver quicksort(lesser) + pivots + quicksort(greater)
```

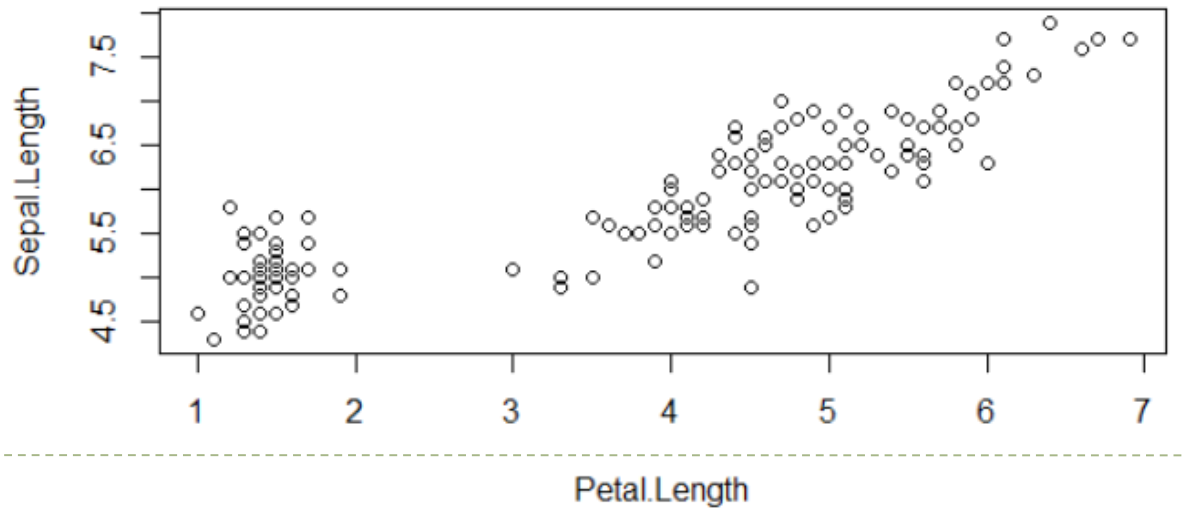
```
> set.seed(100)
> quicksort(sample(1:100, 10))
 [1]  6 16 26 31 35 45 46 51 55 77
```

Index

Graphics in R - The Base System

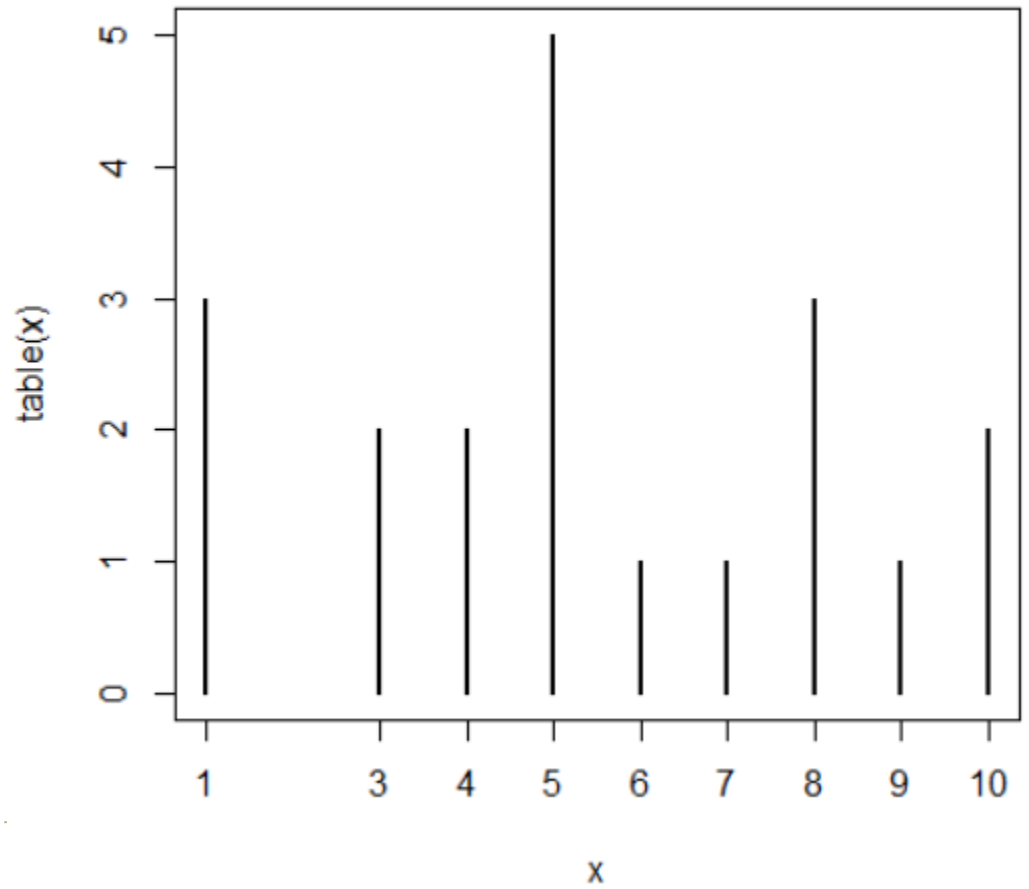
- It is the original R system and no additional packages need to be installed
- The idea is that you start with an empty canvas and from there graphic elements are added
- It is the most convenient for exploratory analysis of information

```
> plot(Sepal.Length~Petal.Length, data=iris)
> |
```



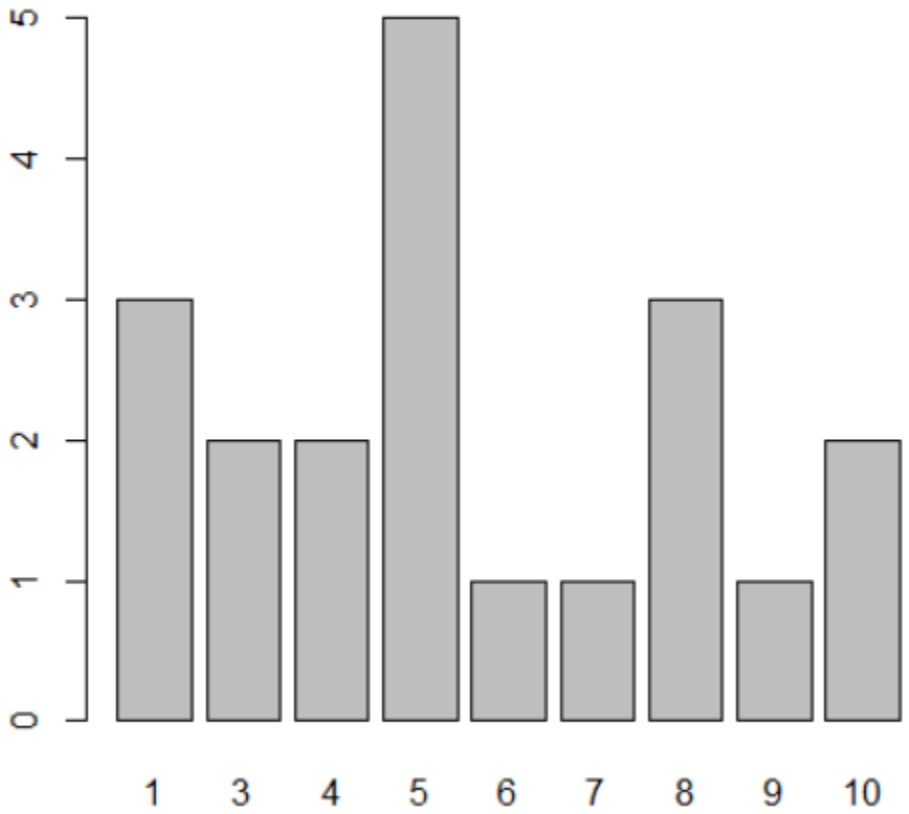
Bars

```
> set.seed(2017)
> x <- sample(1:10, 20, replace = TRUE)
> x
 [1] 10  6  5  3  8  8  1  5  5  3  7  1  1  5  5  4  4  8 10  9
> table(x)
x
 1  3  4  5  6  7  8  9 10
 3  2  2  5  1  1  3  1  2
> plot(table(x))
>
```



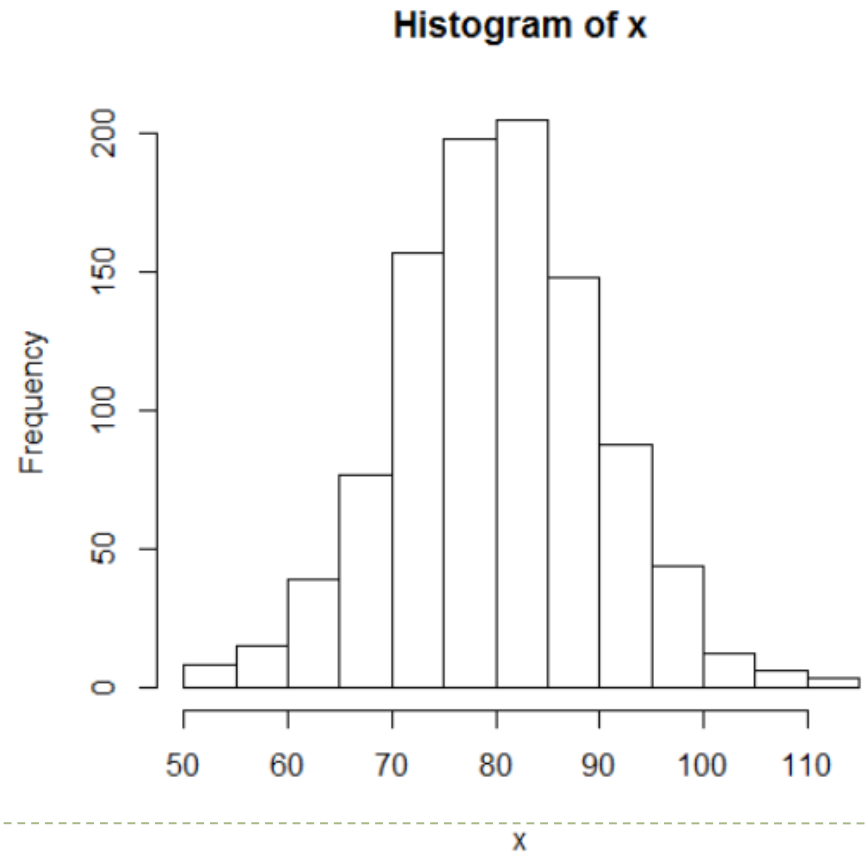
Bars

```
> set.seed(2017)
> x <- sample(1:10, 20, replace = TRUE)
> table(x)
x
 1  3  4  5  6  7  8  9 10
 3  2  2  5  1  1  3  1  2
> barplot(table(x))
>
```



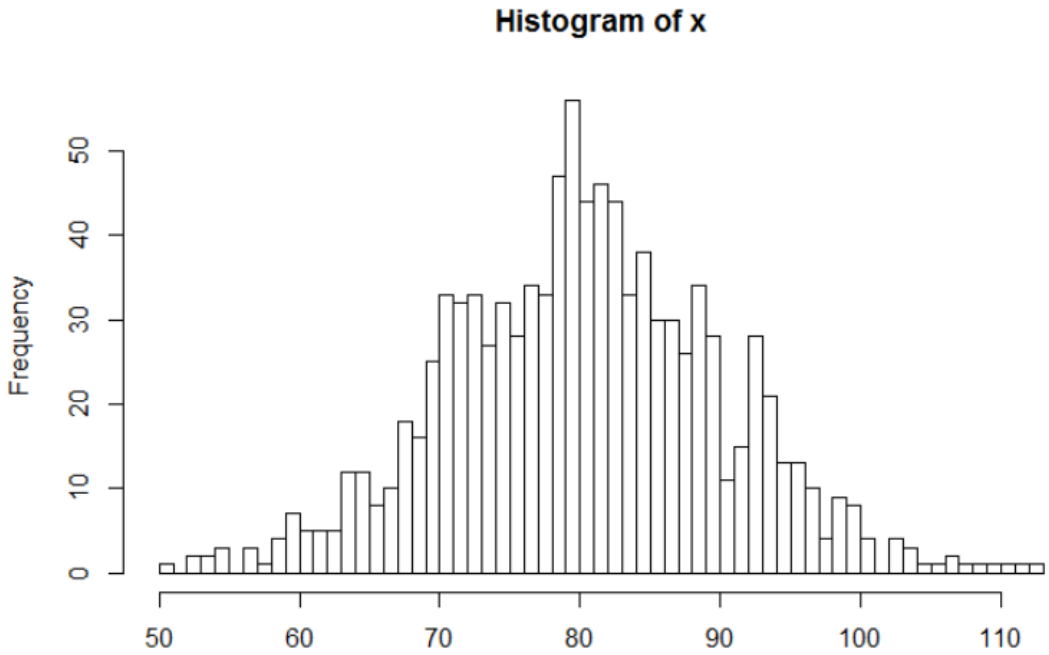
Histogram

```
> set.seed(2017)
> x <- rnorm(1000, mean = 80, sd = 10)
> summary(x)
   Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
  50.35   73.54   80.12   80.27   86.67  112.90
> hist(x, breaks = 50)
>
```



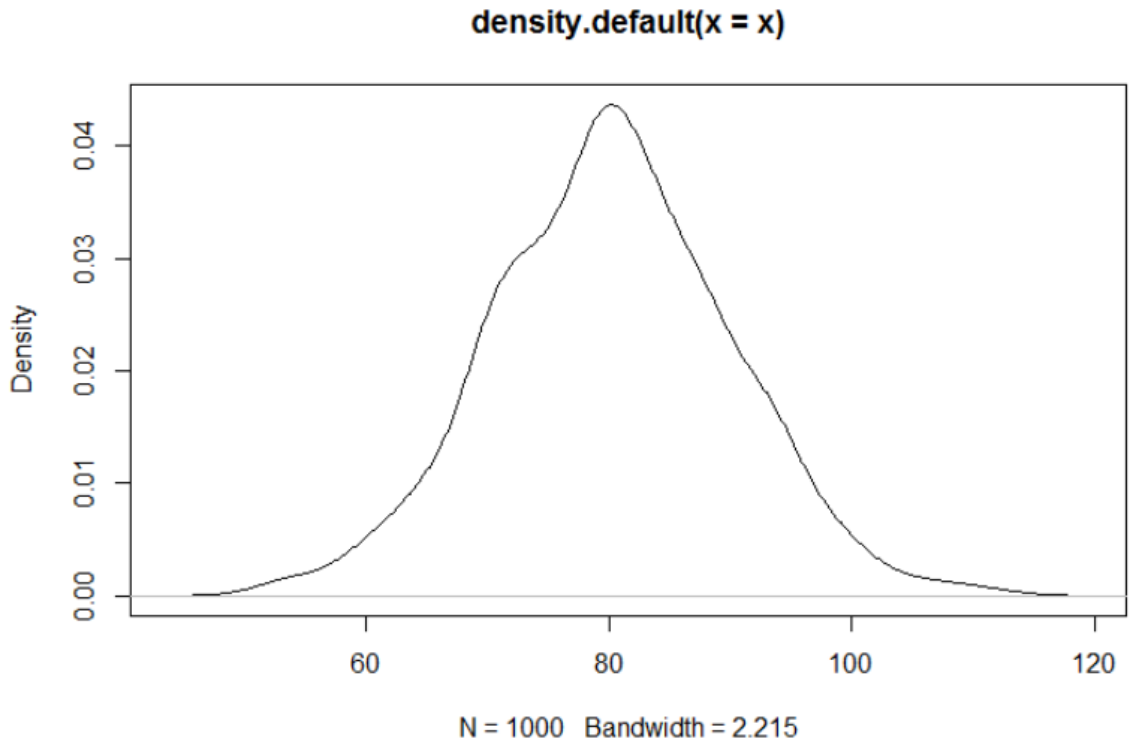
Histogram

```
> set.seed(2017)
> x <- rnorm(1000, mean = 80, sd = 10)
> summary(x)
   Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
  50.35   73.54   80.12   80.27   86.67  112.90
> hist(x, breaks = 50)
>
```



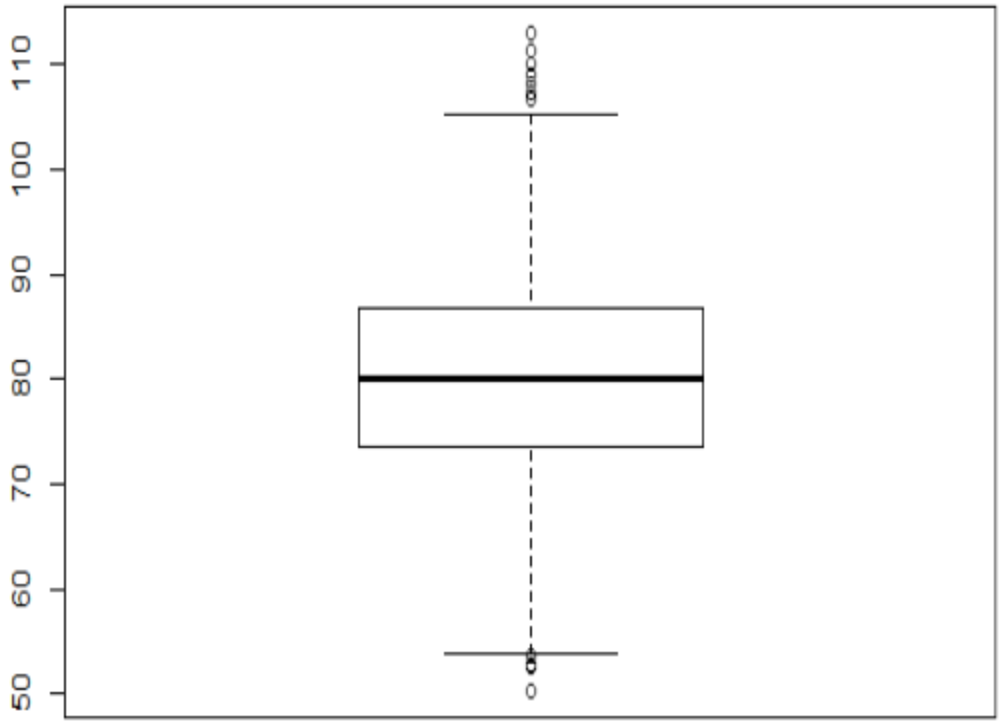
Density graph

```
> set.seed(2017)
> x <- rnorm(1000, mean = 80, sd = 10)
> summary(x)
   Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
  50.35   73.54   80.12   80.27   86.67  112.90
> plot(density(x))
>
```



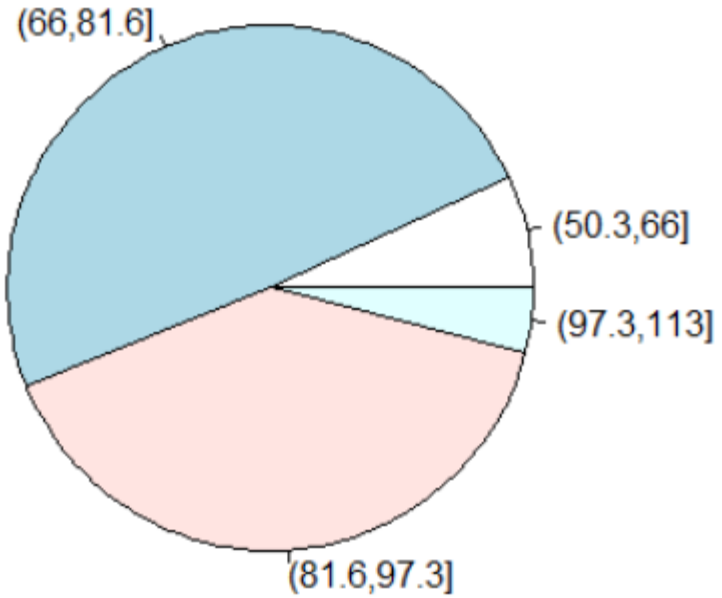
Box Plot

```
> set.seed(2017)
> x = rnorm(1000, mean = 80, sd = 10)
> summary(x)
   Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
  50.35   73.54   80.12   80.27   86.67  112.90
> boxplot(x)
>
```



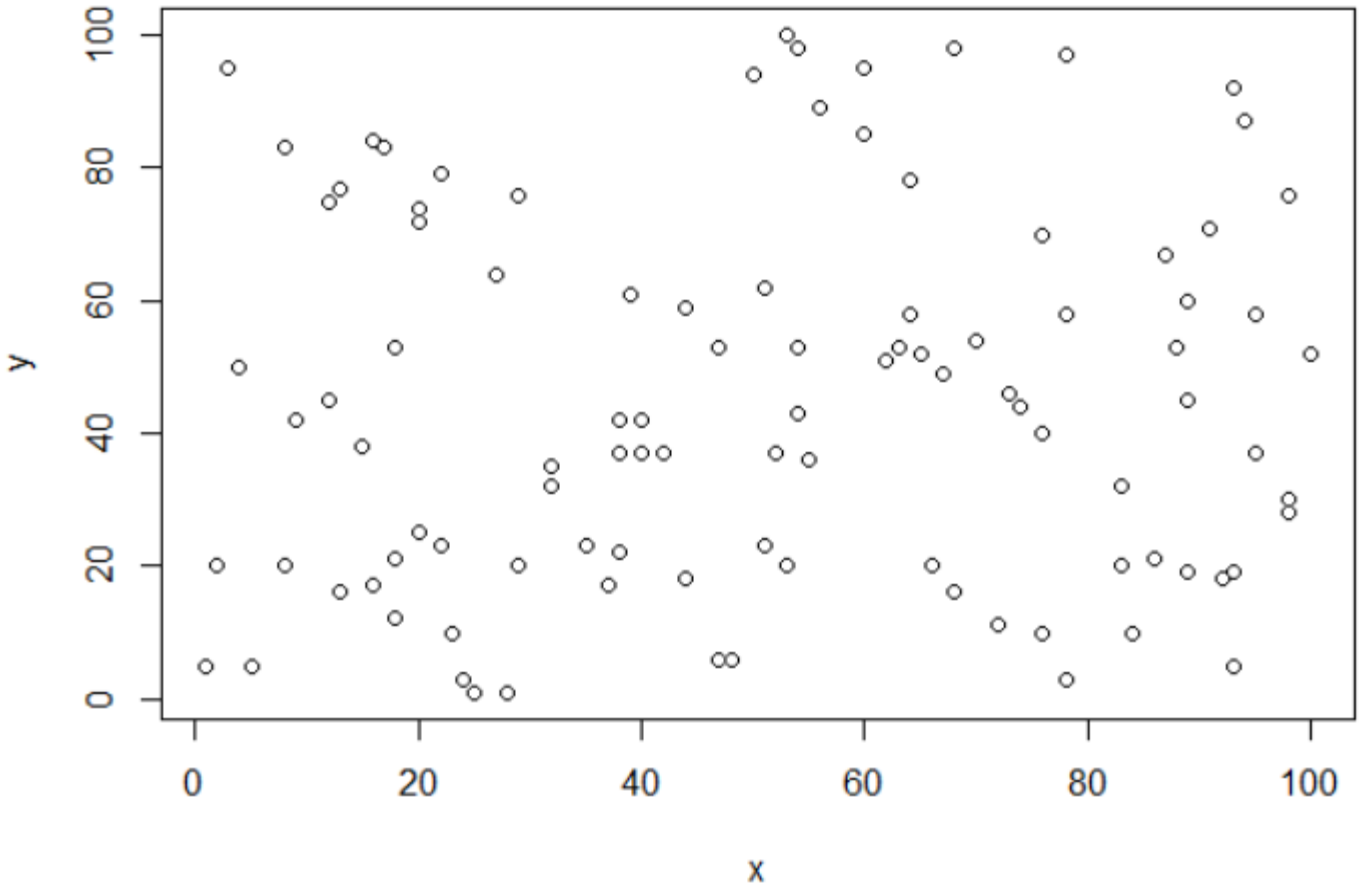
Pie Grapth

```
> set.seed(2017)
> x <- rnorm(1000, mean = 80, sd = 10)
> summary(x)
   Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
  50.35   73.54   80.12   80.27   86.67  112.90
> c <- cut(x, breaks = 4)
> table(c)
c
  (50.3,66]   (66,81.6] (81.6,97.3]  (97.3,113]
         70         491         399          40
> pie(table(c))
>
```



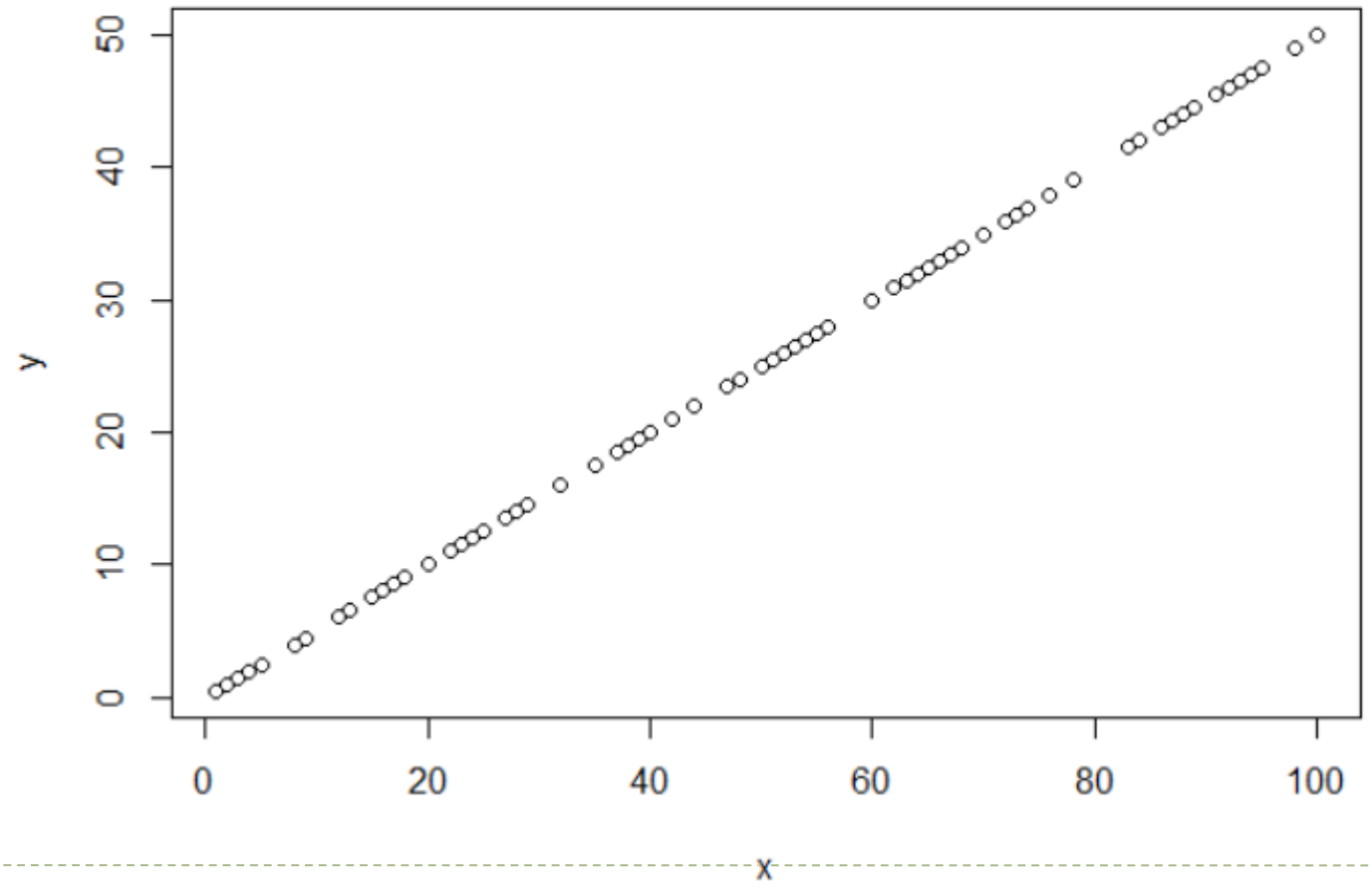
Scatter Plot

```
> set.seed(2017)
> x <- sample(1:100, 100, replace = TRUE)
> y <- sample(1:100, 100, replace = TRUE)
> plot(x, y)
>
```



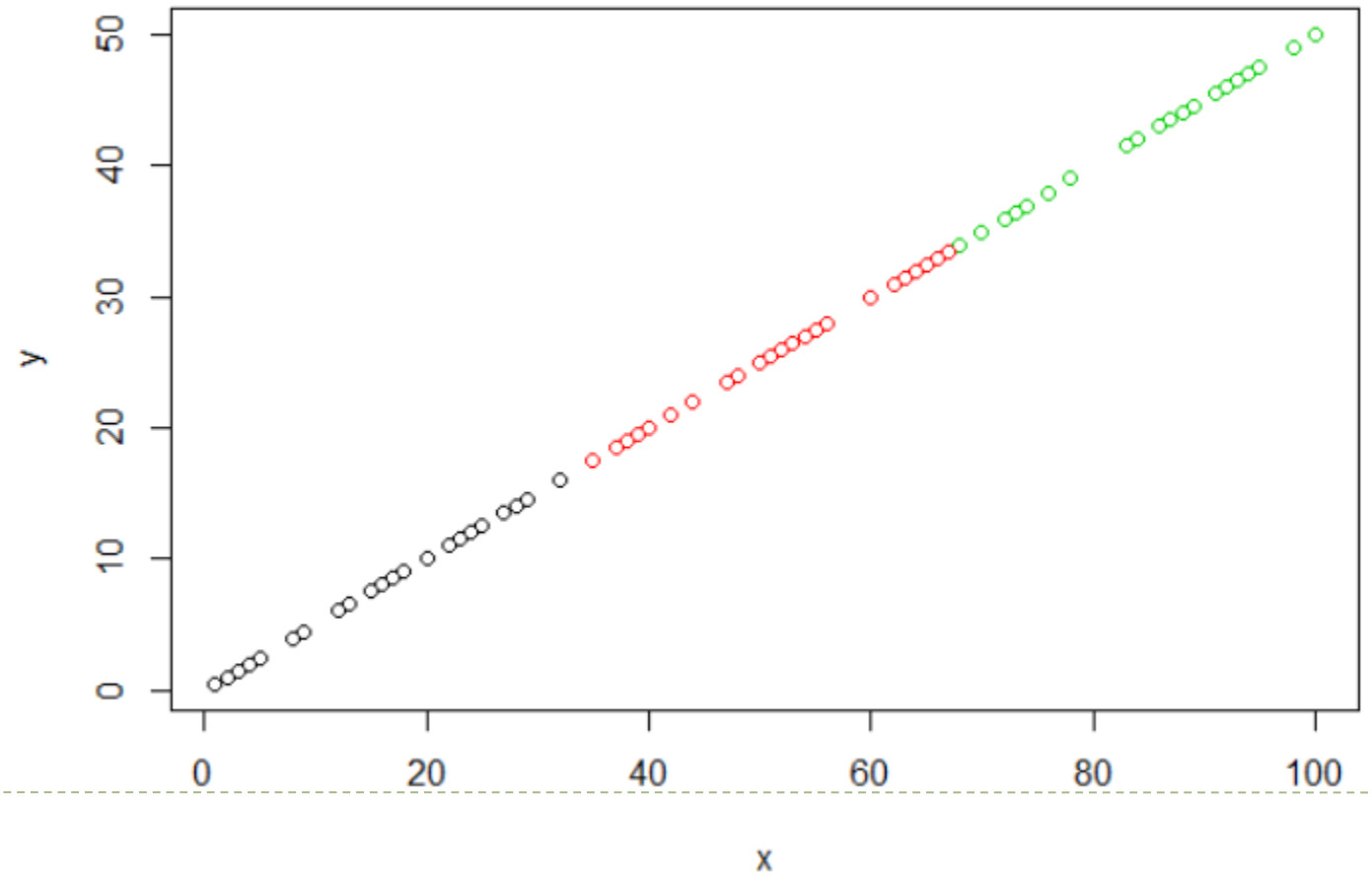
Scatter Plot

```
> set.seed(2017)
> x <- sample(1:100, 100, replace = TRUE)
> y <- x / 2
> plot(x, y)
>
```



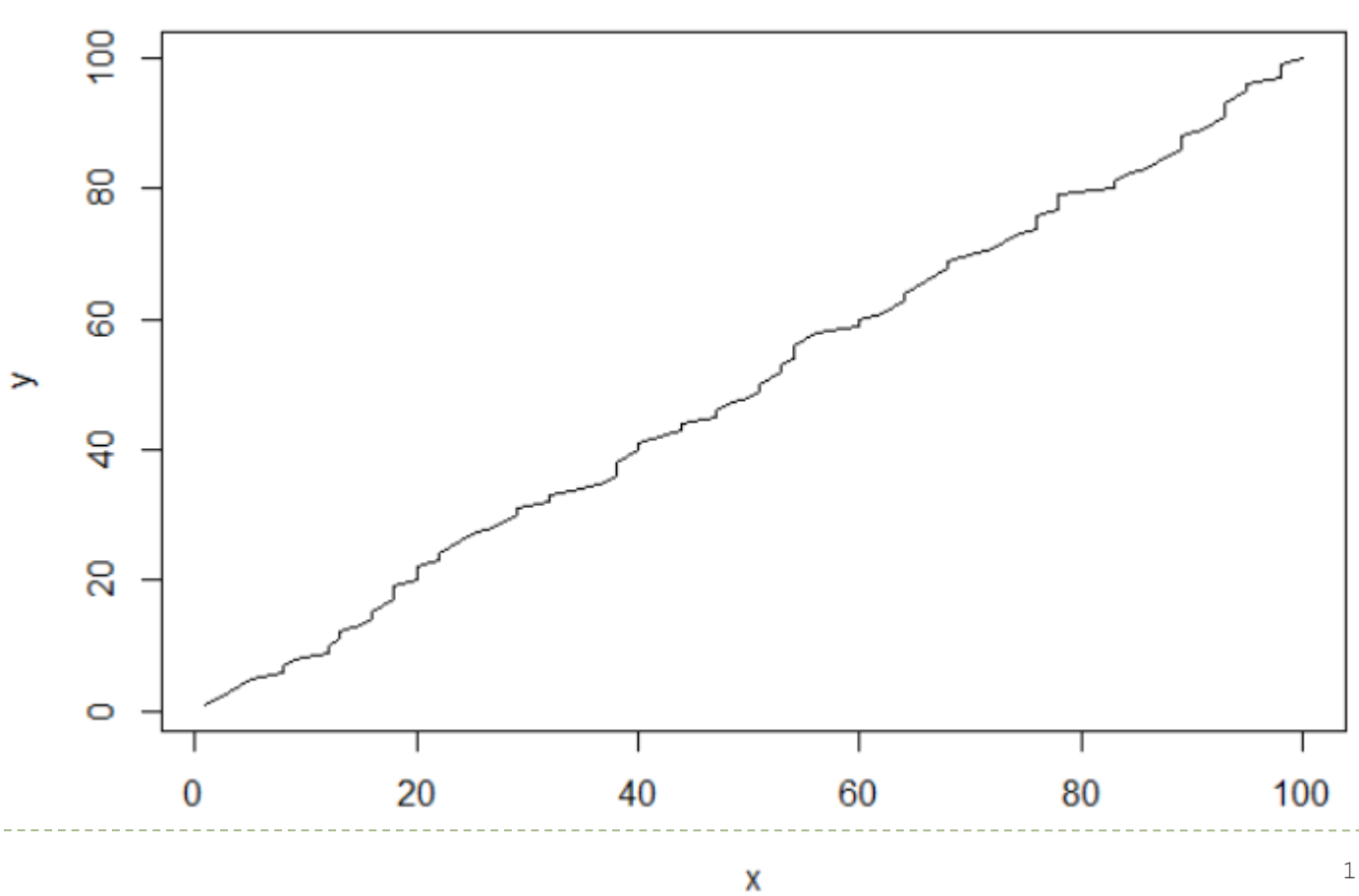
Scatter Plot

```
> set.seed(2017)
> x <- sample(1:100, 100, replace = TRUE)
> y <- x / 2
> c <- cut(x, breaks = 3)
> plot(x, y, col = c)
>
```



Line Grapth

```
> set.seed(2017)
> x <- sample(1:100, 100, replace = TRUE)
> plot(sort(x), type = "l")
>
```



Demos

```
> demo(graphics)


 demo(graphics)
 ---- ~~~~~~~~

Type  <Return>  to start :

> #  Copyright (C) 1997-2009 The R Core Team
>
> require(datasets)

> require(grDevices); require(graphics)

> ## Here is some code which illustrates some of the differences between
> ## R and S graphics capabilities.  Note that colors are generally specified
> ## by a character string name (taken from the X11 rgb.txt file) and that line
> ## textures are given similarly.  The parameter "bg" sets the background
> ## parameter for the plot and there is also an "fg" parameter which sets
> ## the foreground color.
>
>
> x <- stats::rnorm(50)

> opar <- par(bg = "white")

> plot(x, ann = FALSE, type = "n")
Hit <Return> to see next plot:
```

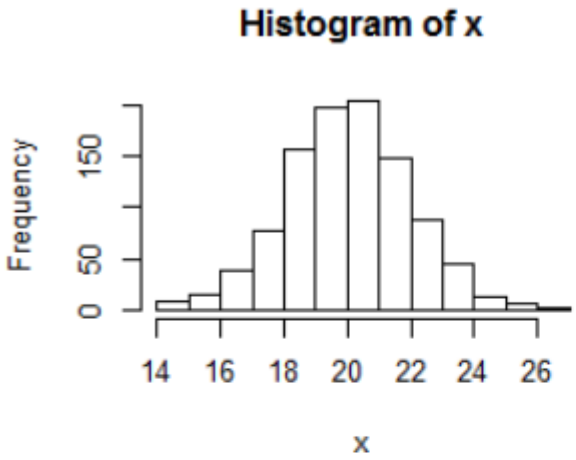
```
> demo(image)


 demo(image)
 ---- ~~~~~

Type  <Return>  to start :

> #  Copyright (C) 1997-2009 The R Core Team
>
> require(datasets)

> require(grDevices); require(graphics)

> x <- 10*(1:nrow(volcano)); x.at <- seq(100, 800, by=100)

> y <- 10*(1:ncol(volcano)); y.at <- seq(100, 600, by=100)

>      # Using Terrain Colors
>
> image(x, y, volcano, col=terrain.colors(100),axes=FALSE)
Hit <Return> to see next plot:
```

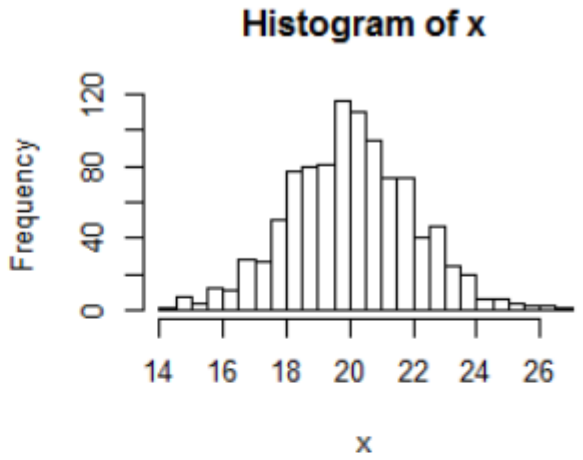
Exercise 26

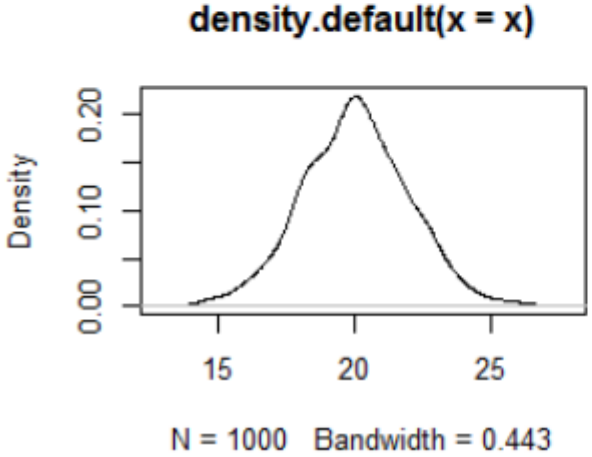
- Set the random seed to 2017
- Create a vector of numbers according to the normal distribution (mean = 20 and sd = 2)
- With this data create 8 different graphs
  - 2 different types of histograms
  - 1 density graph
  - 1 box graph
  - 1 pie chart
  - 1 bar graph
  - 1 scatter plot
  - 1 line graph

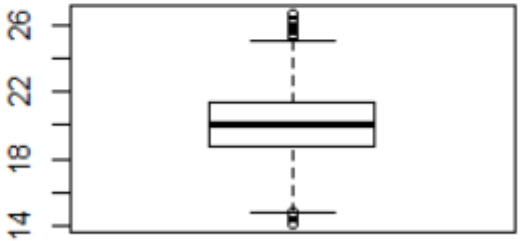
Exercise 26 (Solution)

```
> set.seed(2017)
> x <- rnorm(1000, mean = 20 , sd = 2)
> par(mfrow=c(2,2))
> hist(x)
> hist(x, breaks = 20)
> plot(density(x))
> boxplot(x)
>
```



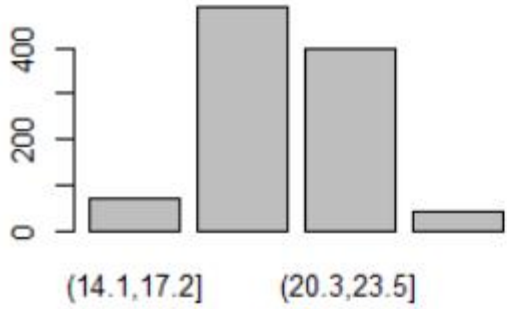


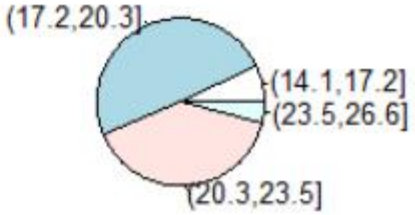


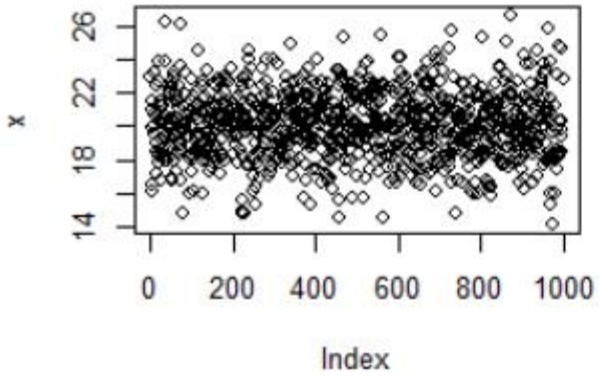


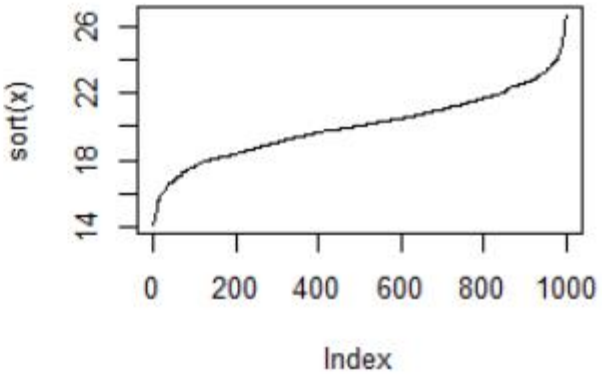
Exercise 26 (Solution)

```
> set.seed(2017)
> x <- rnorm(1000, mean = 20 , sd = 2)
> par(mfrow=c(2,2))
> barplot(table(cut(x, breaks = 4)))
> pie(table(cut(x, breaks = 4)))
> plot(x)
> plot(sort(x), type = "l")
>
```









THANKS FOR YOUR ATTENTION

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