Introduction to R

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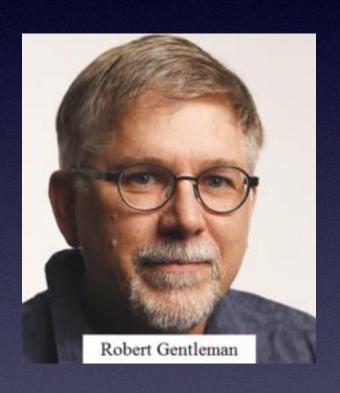
Borrowed from: Ramiro Logares (ICM-CSIC, Barcelona)

History

- Originated from S
 - Statistical programming language developed by John Chambers at Bell Labs in the 70s
 - Developed at the same times as Unix
 - Closed source
- First version of R: developed by Robert Gentleman and Ross Ihaka in the mid-1990s
 - Aimed for better statistics software in their Mac teaching labs
 - Open Source alternative
- R 1.0.0 released in 2000
 - Current version 4.1.1
- Developers: international R-core developing team



John Chambers

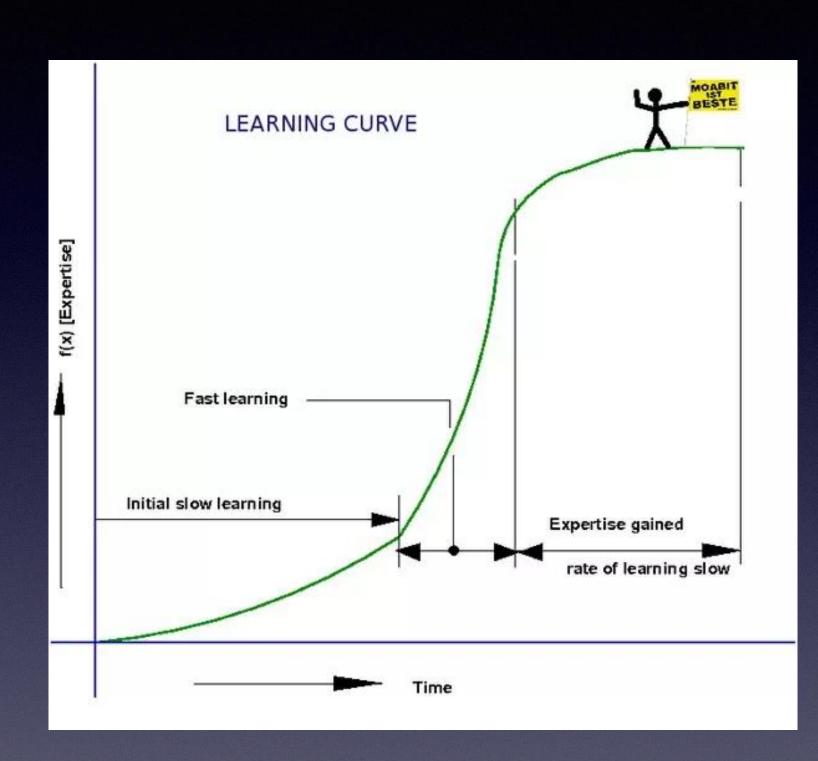




Ross Ihaka

Why learn R?

- Language and environment for statistical computing and graphics
- Open Source (free)
- Cross-platform compatibility
- Community supported
- Great flexibility to do what you want
- Many packages available: ecology, metabarcoding, networks
- Amazing publication quality graphs



okay, I want R

- https://cran.uib.no: Linux, Mac, Windows...
- We will use an Integrated Development Environment (IDE): <u>R-Studio</u>
 - https://www.rstudio.com/
 - Set of tools designed to help and be more productive with R
 - Includes a console and syntax-highlighting editor that supports code execution
 - Allows having several open sessions
 - Includes a Unix terminal

Installing R

R version 4.1.1 (2021-08-10) -- "Kick Things"



[Home]

Download

CRAN

R Project

About R

Logo

Contributors

What's New?

Reporting Bugs

Conferences

Search

Get Involved: Mailing Lists

Developer Pages

R Blog

R Foundation

Foundation

The R Project for Statistical Computing

Getting Started

R is a free software environment for statistical computing and graphics. It compiles and runs on a wide variety of UNIX platforms, Windows and MacOS. To download R, please choose your preferred CRAN mirror.

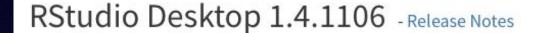
If you have questions about R like how to download and install the software, or what the license terms are, please read our answers to frequently asked questions before you send an email.

News

- R version 4.1.2 (Bird Hippie) prerelease versions will appear starting Friday 2021-10-22. Final release is scheduled for Monday 2021-11-01.
- R version 4.1.1 (Kick Things) has been released on 2021-08-10.
- R version 4.0.5 (Shake and Throw) was released on 2021-03-31.
- Thanks to the organisers of useR! 2020 for a successful online conference. Recorded tutorials and talks from the conference are available on the R Consortium YouTube channel.
- You can support the R Foundation with a renewable subscription as a supporting member

Installing R-Studio

https://www.rstudio.com



- 1. Install R. RStudio requires R 3.0.1+.
- 2. Download RStudio Desktop. Recommended for your system:



Requires macOS 10.13+ (64-bit)

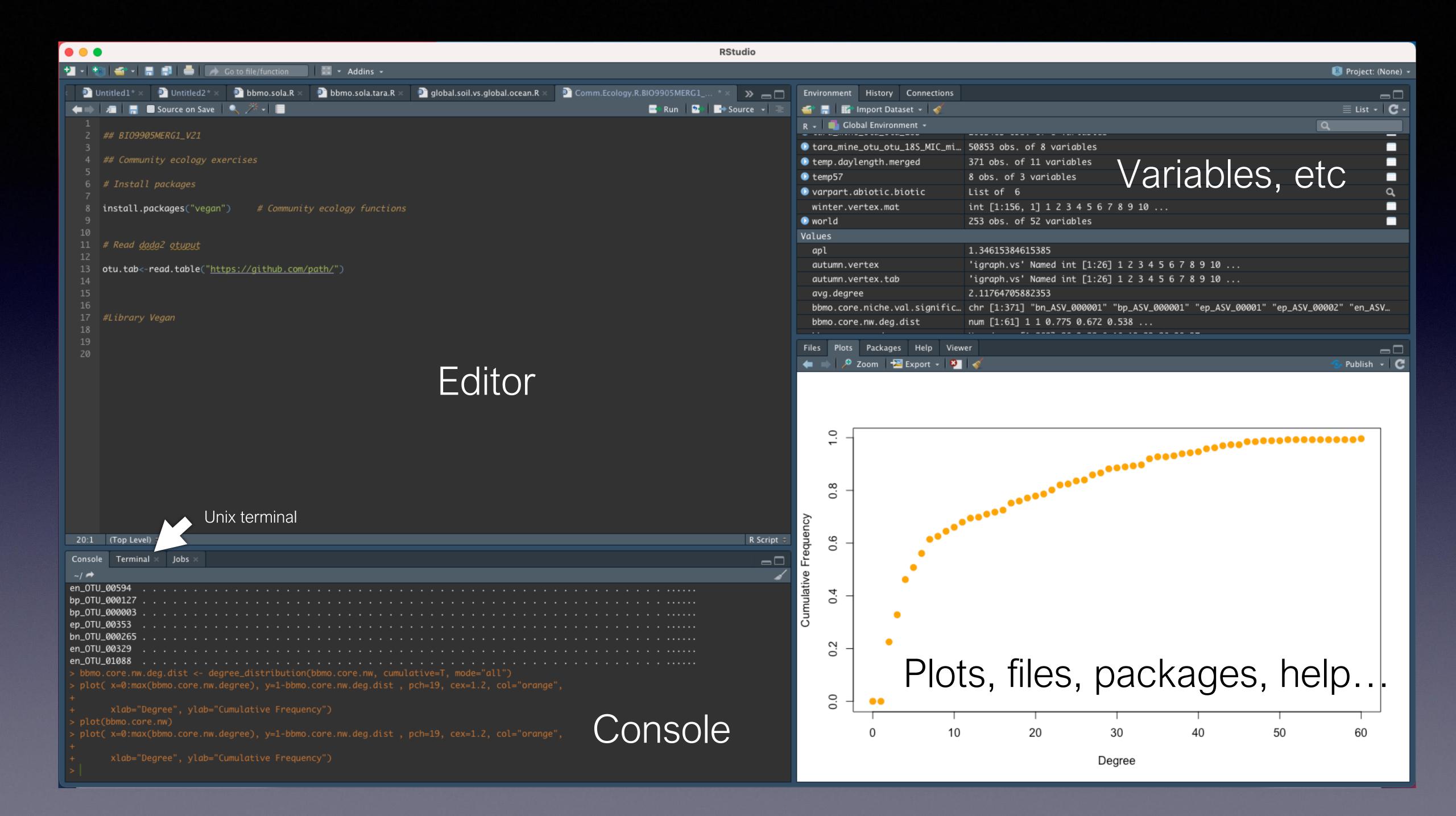
All Installers

Linux users may need to import RStudio's public code-signing key prior to installation, depending on the operating system's security policy.

RStudio requires a 64-bit operating system. If you are on a 32 bit system, you can use an older version of RStudio.

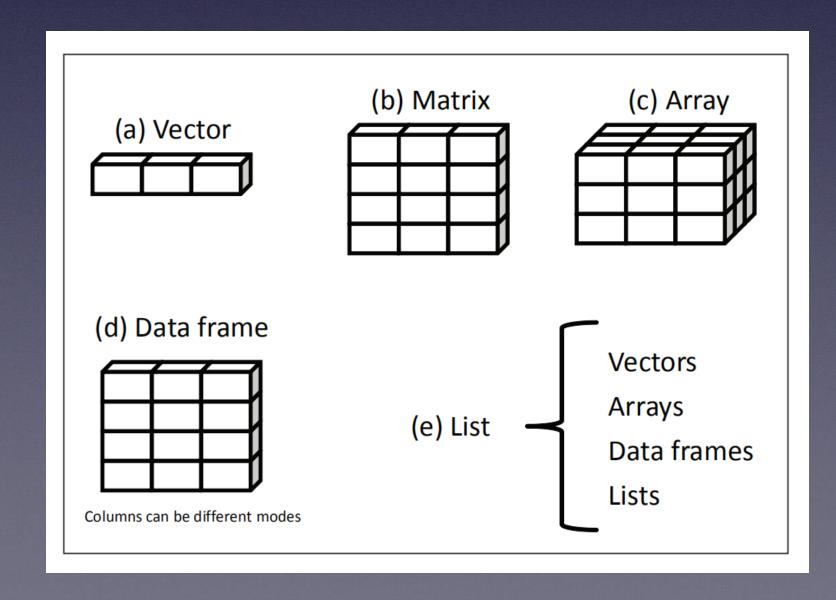
os	Download	Size	SHA-256
Windows 10	♣ RStudio-1.4.1106.exe	155.97 MB	d2ff8453
macOS 10.13+	♣ RStudio-1.4.1106.dmg	153.35 MB	c64d2cda
Ubuntu 16	★ rstudio-1.4.1106-amd64.deb	118.45 MB	1fc82387
Ubuntu 18/Debian 10	★ rstudio-1.4.1106-amd64.deb	121.07 MB	3b5d3835
Fedora 19/Red Hat 7		138.18 MB	a9e6ddc4
Fedora 28/Red Hat 8	★ rstudio-1.4.1106-x86_64.rpm	138.16 MB	35e57c1c





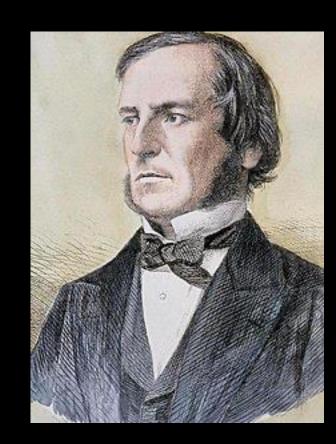
Objects and data-types

- Fundamental structures in R
- · Objects: Vectors, Matrices, Arrays, Factors, Data frames, Lists,
- · Data types: numeric, integer, character, logical



```
1 ## BIO9905MERG1 V21
3 # Intro to R
 5 # <- use this symbol for lines that R should not interpret or as comments to yourself (highly recommended)
 6
7 # Help
    Use "?" before a function. E.g. ?sum
    Execute from Editor: select the chunk of code to execute with the mouse and press then "control+enter"
    See the output in the console (+plot area)
12
13 #Basic operations
14
15 6+6 # sums two numbers
16 # Result [1] 12
17
18 mysum<-6+6 # sum two integers and assign it to a variable sum
19 mysum = 6+6 # same as above
20 # check variable content by executing "mysum"
21 head(mysum) # useful to see the beginning of a variable if it is too long
22
23 #Check variables defined
24 ls() # this info is also shown in the "Environment" panel of RStudio
25
26 #Remove a variable
27 rm (mysum)
28 rm(list=ls()) # remove all variables
```

```
1 #Objects or data structures : Vectors, Lists, Matrices, Arrays, Factors, Data frames
 2 #Let's have a look to basic datatypes on which R objects are built
 4 #Numeric: numbers with decimals
 5 mynumber<-66.6
 6 print (mynumber)
 7 # [1] 66.6
 8 class(mynumber) # use it to know what is the data type
 9 # [1] "numeric"
10
11 #Integer: numbers with no decimals
12 mynumber.int<-as.integer(mynumber)
13 # [1] 66
14 class (mynumber.int)
15 # [1] "integer"
16
17 #Character: can be a letter or a combination of letters enclosed by quotes
18 mychar<-"bioinfo course"
19 print (mychar)
20 # [1] "bioinfo course"
21 class (mychar)
22 #[1] "character"
23
24 #Logical: a variable that can be TRUE or FALSE (boolean)
25 im.true<-TRUE
26 print(im.true)
27 #[1] TRUE
28 class(im.true)
29 # [1] "logical"
```



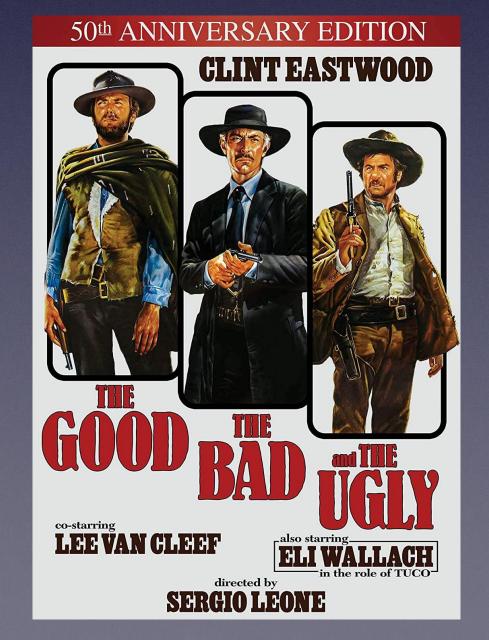
George Boole

Vectors

```
1 #Vectors
 2 # Objects that are used to store values or other information of the same data type
 3 # They are created with the function "c()" that will generate a 1D array
 4 species <-c(123, 434, 655, 877, 986) # we create a numeric vector
 5 class(species)
 6 #[1] "numeric"
 7 length(species) # number of elements in the vector
 8 #[1] 5
 9 species[5] # accessing the fifth element in the vector
10 #[1] 986
11 species[1:3]
12 #[1] 123 434 655
13 sum(species) # sum the values in the vector
14 #[1] 3075
15
16 species.names<-c("dog","lion","human","pig","cow") # we create a character vector
17 class(species.names)
18 # [1] "character"
19
20 seq.num < -c(1:100) # we create a sequence of numbers
21
                                                    12 13 14
                                           42 43 44 45 46
                                                                           50 51 52 53 54 55
                                                                                                  56
                                                                                                         58 59
                                        41
                                                               47
                                                                   48
                                                                       49
                                                                                                     57
                                                                                                                  60
         65 66 67 68 69 70 71 72 73 74 75 76 77 78 79 80 81 82 83 84 85 86 87 88 89 90 91 92 93 94 95 96
25 #[97] 97 98 99 100
26
27 seq.num.by2 < -seq(1,100, 2) # same sequence as above but taken by 2
28
29 # [1] 1 3 5 7 9 11 13 15 17 19 21 23 25 27 29 31 33 35 37 39 41 43 45 47 49 51 53 55 57 59 61 63 65 67 69 71 73 75 77 79 81 83 85
30 # [44] 87 89 91 93 95 97 99
31
32 seq.num.by2[5:10] # we access the 5th to the 10th element
33 # [1] 9 11 13 15 17 19
```

Factors

```
1 #Factor: used to refer to a qualitative relationship.
2 # to generate a factor, we'll use a vector defined with the function c()
3 myfactor<-factor(c("good", "bad", "ugly", "good", "good", "bad", "ugly"))
4 print(myfactor)
5 #[1] good bad ugly good good bad ugly
6 #Levels: bad good ugly <- NB: levels of the factor
7 class(myfactor)
8 #[1] "factor"
9 levels(myfactor) # this can be used to check the levels of a factor
10 # [1] "bad" "good" "ugly"
11 nlevels(myfactor)
12 # [1] 3
13 class(levels(myfactor))
14 # [1] "character"</pre>
```



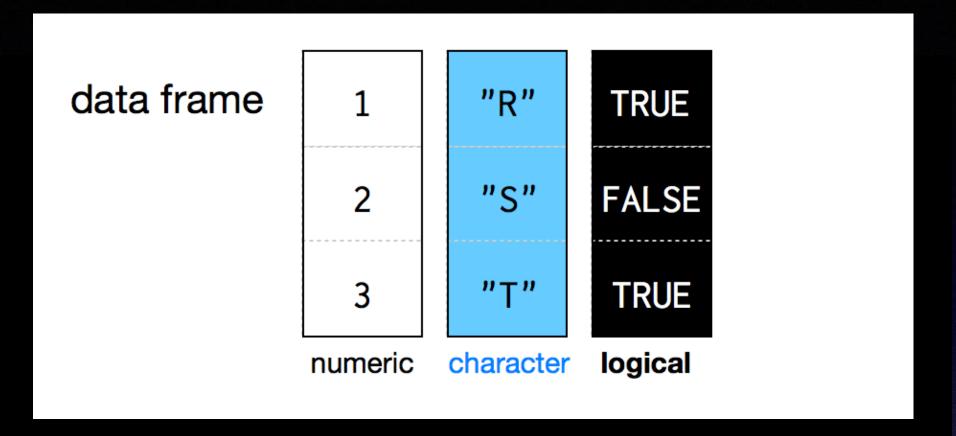
List

```
1 #List
 2 #It can contain elements of various data types (e.g.vectors, functions, matrices, another list)
 3 # Example of vectors with three different data types in one list
 4 list1<-c(1:5) # integer vector
 5 #[1] 1 2 3 4 5
 6 list2<-factor(1:5) # factor vector
 7 # [1] 1 2 3 4 5
 8 # Levels: 1 2 3 4 5
 9 list3<-letters[1:5]
10 # [1] "a" "b" "c" "d" "e"
11 grouped.lists<-list(list1, list2, list3)
12 #[[1]]
13 #[1] 1 2 3 4 5
14
15 #[[2]]
16 #[1] 1 2 3 4 5
17 #Levels: 1 2 3 4 5
18
19 #[[3]]
20 #[1] "a" "b" "c" "d" "e"
21
22 #Accessing elements of a list
23 grouped.lists[[1]] # accessing the first vector
24 # [1] 1 2 3 4 5
25 grouped.lists[[3]][5] # accessing the 5th element from the third vector
26 # [1] "e"
27
28 #Ungroup the list
29 ungrouped.list<-unlist(grouped.lists)
30 # [1] "1" "2" "3" "4" "5" "1" "2" "3" "4" "5" "a" "b" "c" "d" "e"
31 class (ungrouped.list)
32 # [1] "character" # NB: the list becomes a character datatype
33 length (ungrouped.list)
34 # [1] 15
```

Matrix

```
2 #Like a vector, a matrix stores information of the same data type, but different from a vector, it has 2 dimensions.
 4 #syntax: mymatrix <- matrix(vector, nrow=r, ncol=c, byrow=FALSE, dimnames=list(char vector rownames, char vector colnames))
 6 # byrow=F indicates that the matrix should be filled by columns
 8 mymatrix \leftarrow matrix(seq(1:100), nrow=10, ncol=10, byrow=FALSE, dimnames=list(c(1:10), letters[1:10]))
 9 print(mymatrix)
        abcdefghi
          11 21 31 41 51 61 71 81
             26 36 46 56 66 76 86 96
        9 19 29 39 49 59 69 79 89 99
20 # 10 10 20 30 40 50 60 70 80 90 100
21
22 mymatrix.rand <- matrix(sample (seq(1:100),100), nrow=10, ncol=10, byrow=FALSE, dimnames=list(c(1:10), letters[1:10]))
23 # We generate a matrix with random numbers
            80 27 21 3 50 44 70 60 64
           66 24 68 48 79 34 57 52 49
           95 19 97 23 16 33 25 71 54
           81 1 96 91 11 40 56 14 76
    10 8 55 4 18 69 43 39 35 99 30
38 mymatrix[3:6,1:3] # We select what sections of the matrix we want to look at
39 # Rows 3 to 6 and Columns 1 to 3
45 # 6 6 16 26
```

```
1 #Dataframes
 2 # More general than a matrix and can contain different data types
 3 # Variables or features are in columns, while observations are in rows
 4 # =>NB: this is one of the most common objects in metabarcoding analyses<=
 5 # Generated with the data.frame() function
 7 my.data.frame<-data.frame(</pre>
   Name=c("Game of Thrones", "MrRobot", "WestWorld"),
    Budget=c(344, 59, 122),
    Seasons=c(8,4,3),
    Audience=c(300,14,80),
    Actors=c(221,56, 90)
13)
14 print(my.data.frame)
15 #
                 Name Budget Seasons Audience Actors
16 #1 Game of Thrones
                         344
                                           300
                                                  221
17 #2
                                                   56
              MrRobot
                                           14
18 #3
            WestWorld
                         122
                                            80
                                                   90
19
20 row.names(my.data.frame) <-my.data.frame[,1] # Assign to the row names the names in the first column
21 my.data.frame<-my.data.frame[,-1] # Remove the fisrt column
```



22 print(my.data.frame) # By clicking this object in the "Environment" panel on the right, you'll see a window with the dataframe

24	#		Budget	Seasons	Audience	Actors
25	#	Game of Thrones	344	8	300	221
26	#	MrRobot	59	4	14	56
27	#	WestWorld	122	3	80	90

```
1 class(my.data.frame)
 2 # [1] "data.frame"
 3 ncol(my.data.frame) # Number of columns
 4 # [1] 4
 5 nrow(my.data.frame) # Number of rows
 6 # [1] 3
7 colnames (my.data.frame) # Column names
 8 # [1] "Budget" "Seasons" "Audience" "Actors"
 9 rownames (my.data.frame) # Name of rows
10 # "Game of Thrones" "MrRobot" "WestWorld"
11 colSums (my.data.frame) # Sum values in columns
12 # Budget Seasons Audience Actors
13 # 525
                15
                        394
                                 367
14 rowSums(my.data.frame) # We sum the values, even if they make no sense in the example
15 # Game of Thrones
                           MrRobot
                                         WestWorld
16 #
                873
                                133
                                               295
```



```
1 rbind(my.data.frame, my.data.frame) # appends dataframes one below the other (column names identical)
                      Budget Seasons Audience Actors
 2 #
 3 # Game of Thrones
                         344
                                           300
                                                  221
                          59
                                                   56
 4 # MrRobot
                                           14
 5 # WestWorld
                         122
                                           80
                                                   90
    Game of Thrones1
                         344
                                           300
                                                  221
                                                  56
 7 # MrRobot1
                          59
                                           14
 8 # WestWorld1
                                           80
                                                   90
                         122
                                                                                                          Id X1 X2 X3 X4 Y
10 cbind(my.data.frame, my.data.frame) # appends dataframes one next to the other (row names identical)
11 #
                      Budget Seasons Audience Actors Budget Seasons Audience Actors
                        344
12 # Game of Thrones
                                         300
                                                221
                                                        344
                                                                                221
                                                                         300
13 # MrRobot
                                          14
                                                 56
                                                         59
                                                                          14
                                                                                 56
                        122
                                          80
                                                        122
14 # WestWorld
                                                 90
                                                                                 90
                                                                          80
15
16 head(my.data.frame, 2) # Useful to have a look to the beginning of the dataframe (specially useful in big tables)
17 # Here asking to print only 2 rows
18 #
                     Budget Seasons Audience Actors
19 # Game of Thrones
                        344
                                                 221
                                          300
20 # MrRobot
                         59
                                          14
                                                 56
21
22 my.data.frame[1:2,2:4] # Useful to look at specific sections of the dataframe
23 #
                     Seasons Audience Actors
24 # Game of Thrones
                                  300
                                         221
25 # MrRobot
                                                                                                         MR 7539T
```

```
1 #Let's generate a dataframe with different data types
 3 my.data.frame.2<-data.frame(
     Name=c("Game of Thrones", "MrRobot", "WestWorld", "Chernobyl"),
     Rating=c("Excellent", "Very Good", "Excellent", "Very Good"),
     Audience.Restriction=c(TRUE, FALSE, TRUE, FALSE)
 7)
 8 print(my.data.frame.2)
                  Name
                         Rating Audience.Restriction
10 # 1 Game of Thrones Excellent
                                                  TRUE
              MrRobot Very Good
11 # 2
                                                 FALSE
12 # 3
            WestWorld Excellent
                                                 TRUE
            Chernobyl Very Good
                                                 FALSE
14 #Rename row names
15 row.names(my.data.frame.2) <-my.data.frame.2[,1]
16 my.data.frame.2 < -my.data.frame.2[,-1] # Remove redundant column 1
17
18 #
                       Rating Audience. Restriction
19 # Game of Thrones Excellent
                                               TRUE
20 # MrRobot
                    Very Good
                                              FALSE
21 # WestWorld
                    Excellent
                                              TRUE
22 # Chernobyl
                    Very Good
                                              FALSE
23
24 str(my.data.frame.2) # Let's look at the data types within this dataframe
25
26 # 'data.frame': 4 obs. of 2 variables:
    $ Rating
                           : chr "Excellent" "Very Good" "Excellent" "Very Good"
28 # $ Audience.Restriction: logi TRUE FALSE TRUE FALSE
29
30 # Variables in this case are characters and logical (TRUE/FALSE)
31
```

```
1 #Merge two dataframes based in a pattern
2 # We will use the series names to merge these dataframes as this is what they have in common
4 data.frame.large<-merge(my.data.frame, my.data.frame.2, by="row.names") # "by" indicates the column used for merging
            Row.names Budget Seasons Audience Actors
                                                        Rating Audience.Restriction
6 #
      Game of Thrones
                          344
                                           300
                                                  221 Excellent
                                                                                TRUE
                          59
                                                  56 Very Good
              MrRobot
                                           14
                                                                               FALSE
                                                   90 Excellent
            WestWorld
                          122
9 # 3
                                            80
                                                                                TRUE
10
```

NB: "Chernobyl" was not used, as it was only present in one data frame, but this could be modified

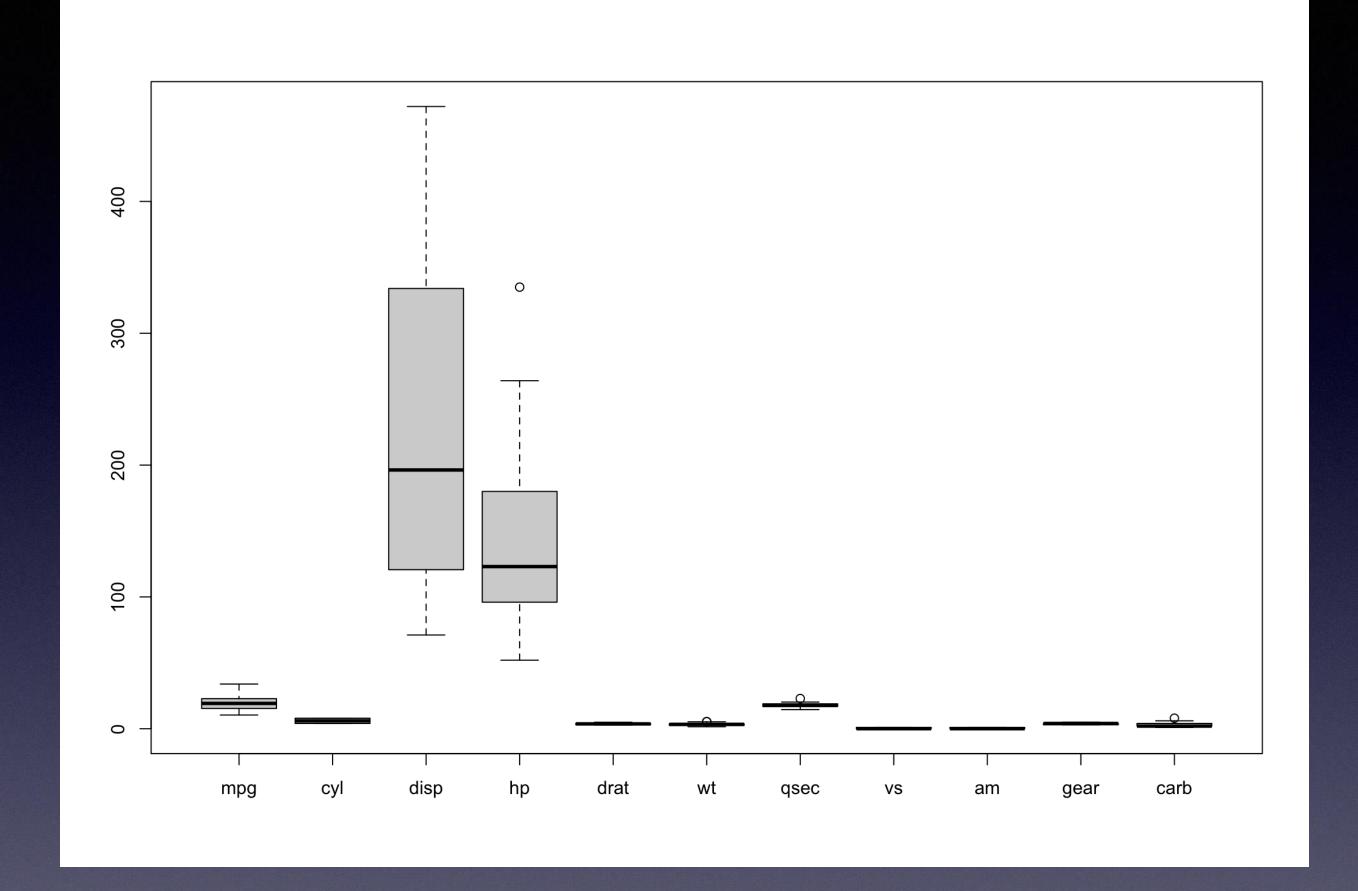


Working with tables or data frames

```
1 #Useful commands to work with tables or dataframes
                     # get working directory
 2 getwd()
 3 # [1] "/Users/admin"
 4 setwd("path/to/my/directory") # set working directory
 6 my.table<-read.table(file="table.tsv", sep="\t", header=T) # read table; several other options available
 7 dim (my.table) # Table dimensions
 8 nrow(my.table) # Number of rows
 9 ncol(my.table) # Number of columns
10 colnames (my.table) # Name of columns
11 rownames (my.table) # Name of rows
12 colSums(my.table) # Sum of numeric values in columns
13 rowSums(my.table) # Sum of numeric values in rows
14 head(my.table) # See table header
15 t(my.table)
                     # Transpose table
16
17 #Table subsetting
18 # Format: my.table[row, column]
                                            # Get value from row 1, column 2
19 my.table[1,2]
                                            # Get values from row 1 across all columns
20 my.table[1,]
21 my.table$column.name<-NULL
                                            # Remove column
22 my.table[-5, -2]
                                            # Remove row 5 and column 2
23 my.table[-(5:10),]
                                            # Remove rows 5 to 10, keep all columns
my.table[,-(which(colSums(my.table)==0))] # Remove columns that sum 0
```

Simple plots

```
1 #Plotting
 2 data("mtcars") # We load a dataset that comes with R
 3 #The data was extracted from the 1974 Motor Trend US magazine, and comprises fuel consumption and 10 aspects
 4 # of automobile design and performance for 32 automobiles (1973 & 74 models).
 6 #Data structure
                        mpg cyl disp hp drat wt qsec vs am gear carb
                       21.0 6 160.0 110 3.90 2.620 16.46 0 1
8 # Mazda RX4
9 # Mazda RX4 Wag
                       21.0 6 160.0 110 3.90 2.875 17.02 0 1
10 # Datsun 710
                             4 108.0 93 3.85 2.320 18.61 1 1
11 # Hornet 4 Drive
                       21.4 6 258.0 110 3.08 3.215 19.44 1 0
14 \# [, 1] mpgMiles/(US) gallon
15 # [, 2] cyl Number of cylinders
16 # [, 3] disp Displacement (cu.in.)
17 # [, 4] hp Gross horsepower
           drat Rear axle ratio
19 # [, 6] wt Weight (1000 lbs)
           qsec 1/4 mile time
           vs Engine (0 = V-shaped, 1 = straight)
           am Transmission (0 = automatic, 1 = manual)
23 # [,10] gear Number of forward gears
24 # [,11] carb Number of carburetors
```



1 boxplot(mtcars) # make a boxplot of variables across car models

```
lower quartile

Q1

median

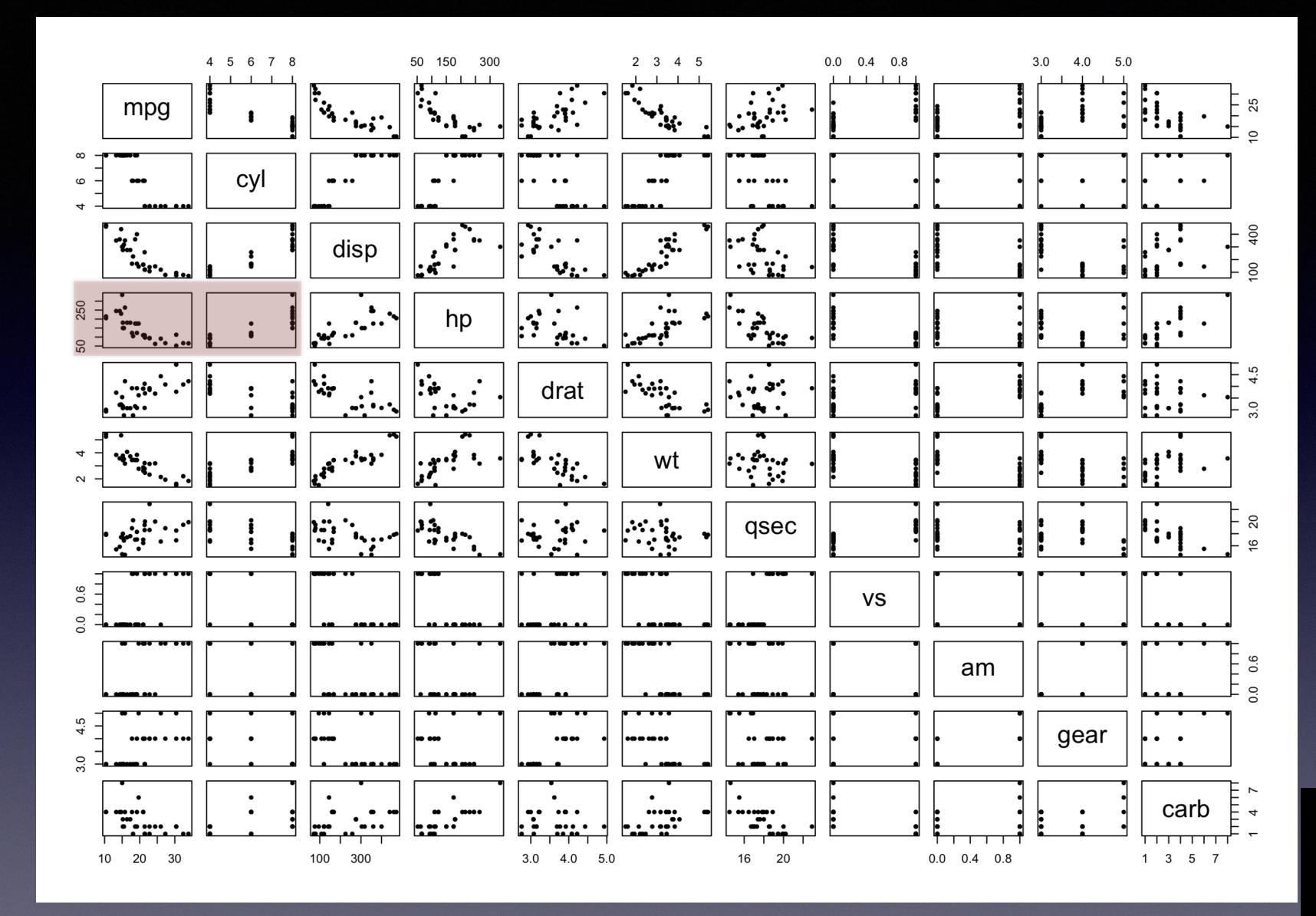
Q3

whisker

box

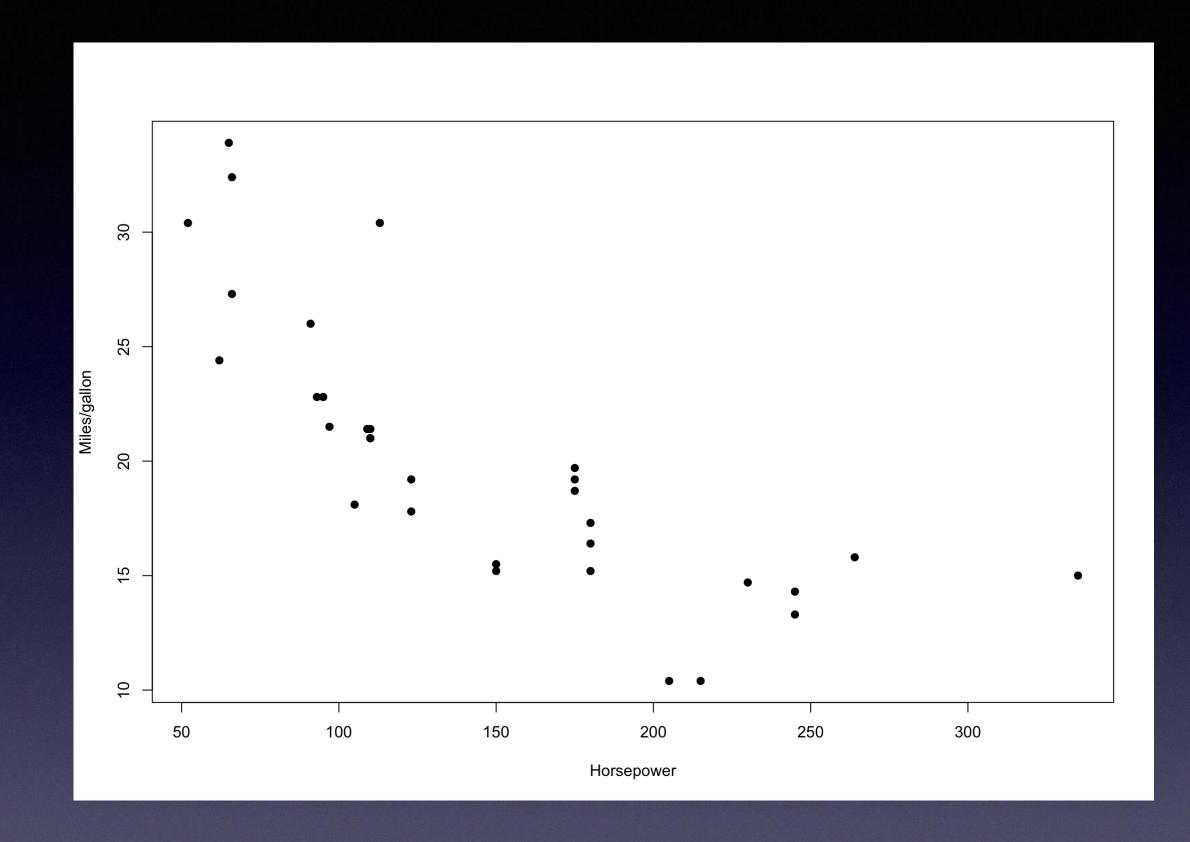
Interquartile range (IQR)
```

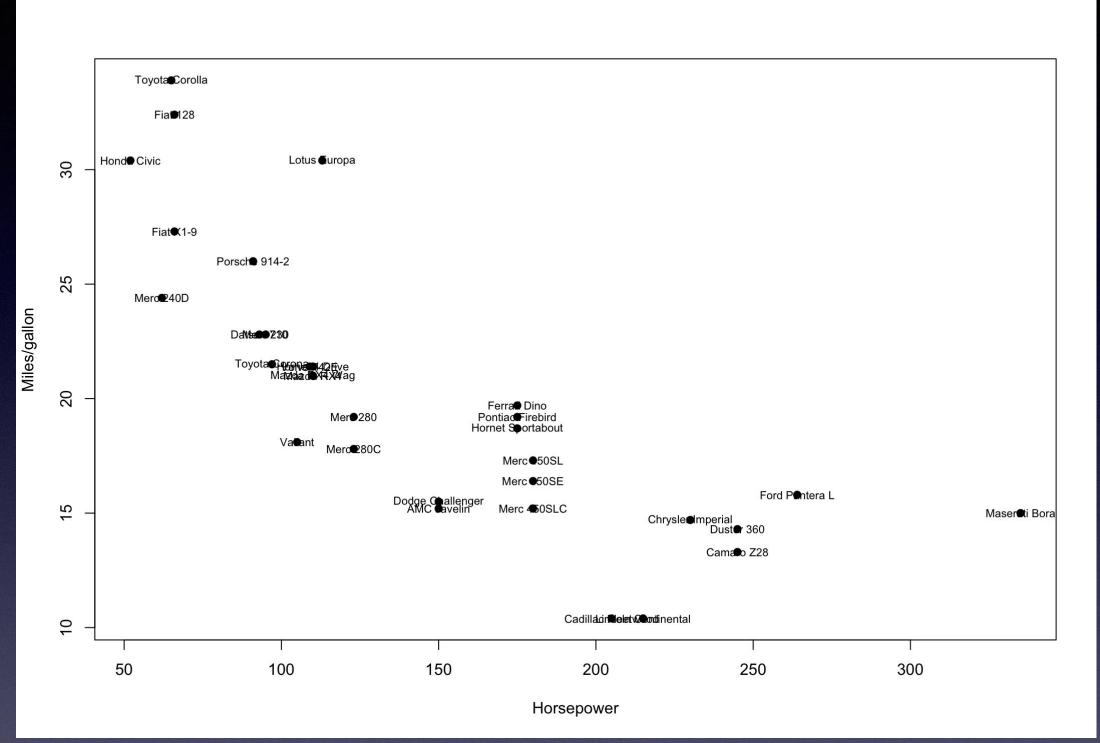
```
14 # [, 1] mpgMiles/(US) gallon
15 # [, 2] cylNumber of cylinders
16 # [, 3] disp Displacement (cu.in.)
17 # [, 4] hp Gross horsepower
18 # [, 5] drat Rear axle ratio
19 # [, 6] wt Weight (1000 lbs)
20 # [, 7] qsec 1/4 mile time
21 # [, 8] vs Engine (0 = V-shaped, 1 = straight)
22 # [, 9] am Transmission (0 = automatic, 1 = manual)
23 # [,10] gear Number of forward gears
24 # [,11] carb Number of carburetors
```



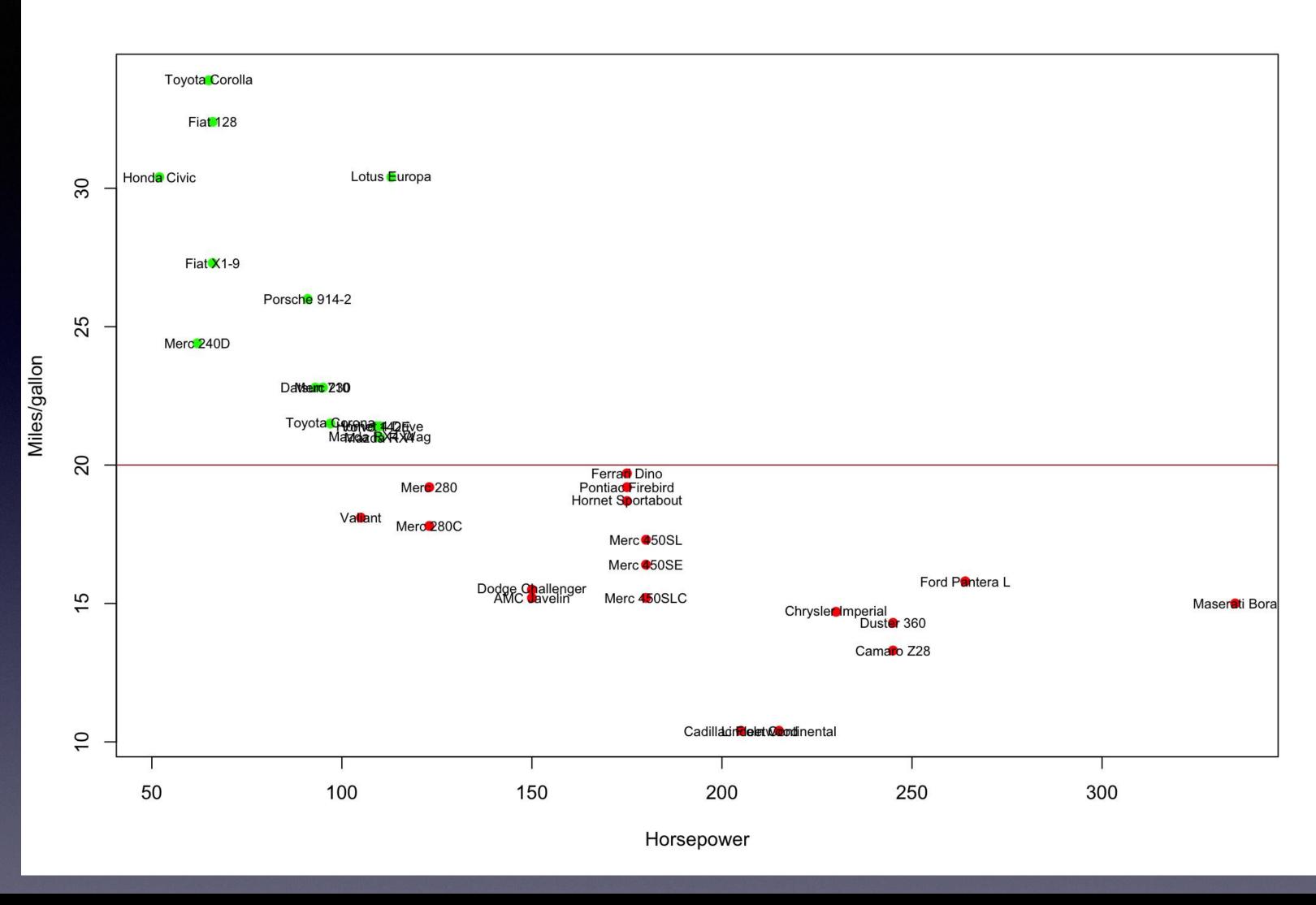
1 plot(mtcars, pch=19, cex=0.6) # make x-y plots for all variables

```
14 # [, 1] mpgMiles/(US) gallon
15 # [, 2] cylNumber of cylinders
16 # [, 3] disp Displacement (cu.in.)
17 # [, 4] hp Gross horsepower
18 # [, 5] drat Rear axle ratio
19 # [, 6] wt Weight (1000 lbs)
20 # [, 7] qsec 1/4 mile time
21 # [, 8] vs Engine (0 = V-shaped, 1 = straight)
22 # [, 9] am Transmission (0 = automatic, 1 = manual)
23 # [,10] gear Number of forward gears
24 # [,11] carb Number of carburetors
```

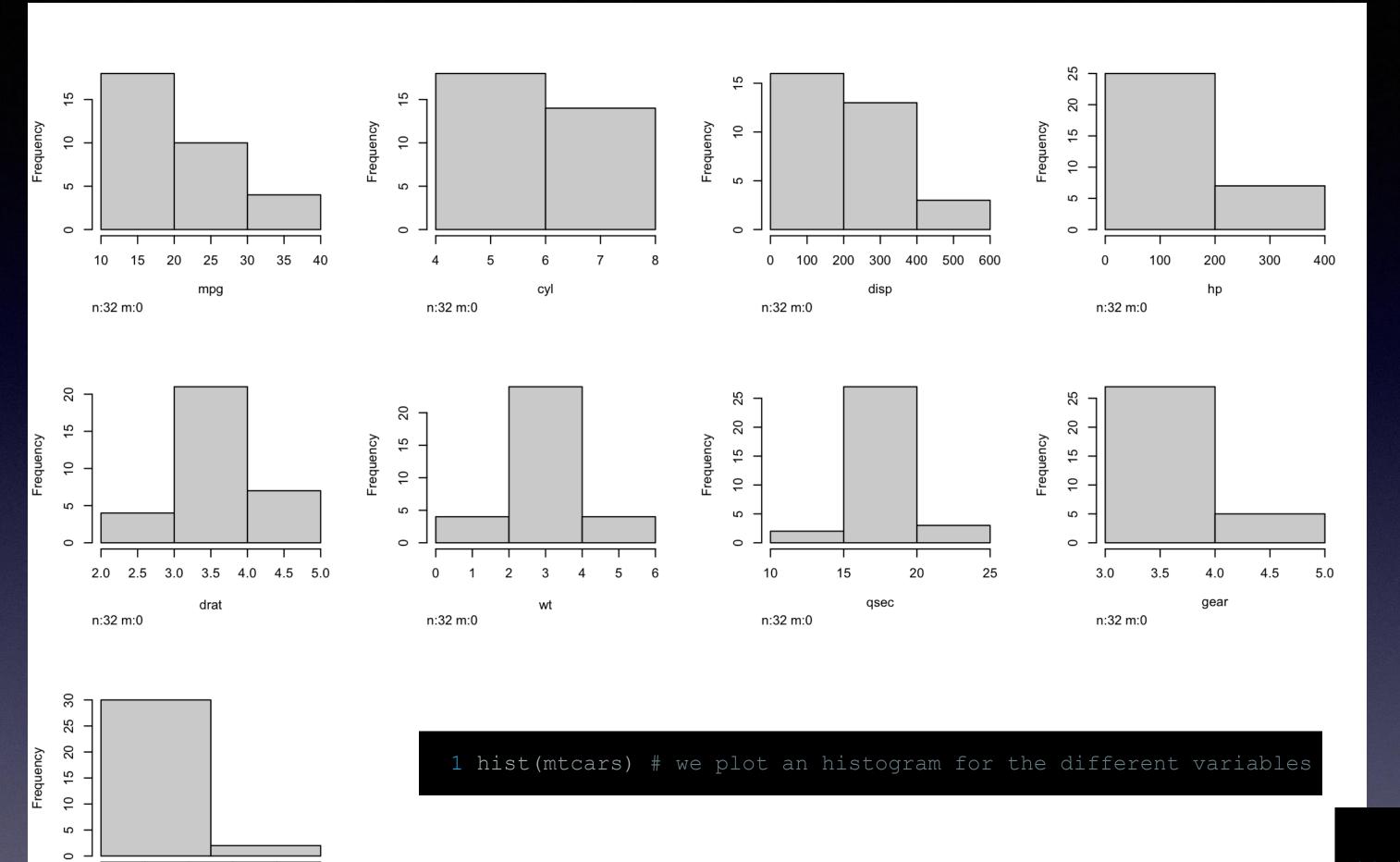




1 plot(mtcars\$hp, mtcars\$mpg, xlab="Horsepower", ylab="Miles/gallon", pch=19) # we plot horsepower vs. miles per gallon 2 text(mtcars\$hp, mtcars\$mpg, row.names(mtcars), cex=0.7) # we add the car model



```
1 plot(mtcars$hp, mtcars$mpg, xlab="Horsepower", ylab="Miles/gallon", pch=19, col=ifelse(mtcars$mpg<20,"red", "green")) # We color dots according to
2    a condition (20<x<20 mpg)
3 text(mtcars$hp, mtcars$mpg, row.names(mtcars), cex=0.7) # we add the car model
4 abline(h=20, col="brown") # we add an horizontal line at "20"</pre>
```

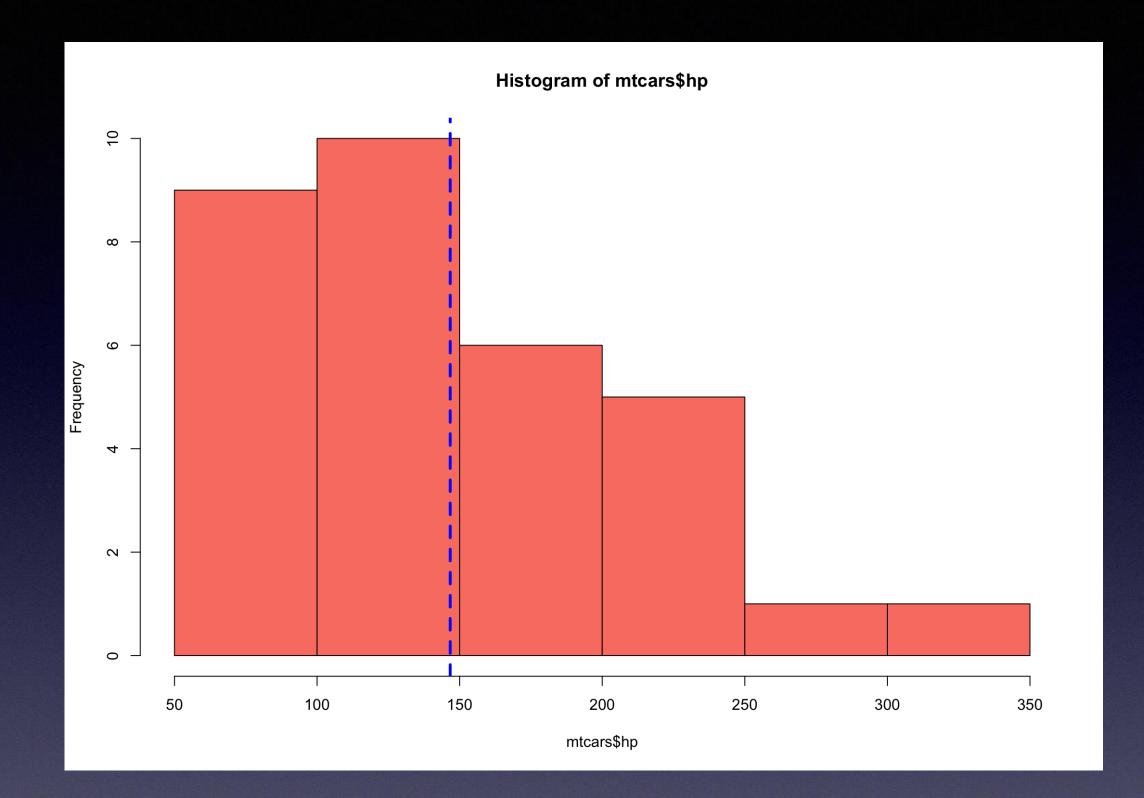


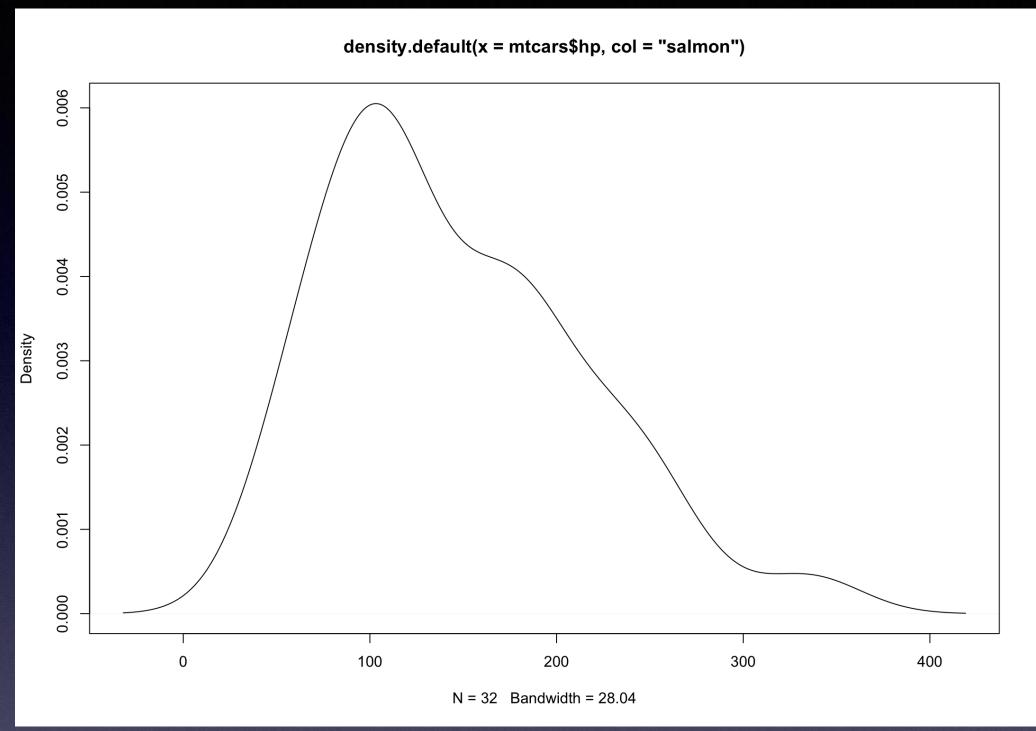
8

carb

n:32 m:0

```
14 # [, 1] mpgMiles/(US) gallon
15 # [, 2] cylNumber of cylinders
16 # [, 3] disp Displacement (cu.in.)
17 # [, 4] hp Gross horsepower
18 # [, 5] drat Rear axle ratio
19 # [, 6] wt Weight (1000 lbs)
20 # [, 7] qsec 1/4 mile time
21 # [, 8] vs Engine (0 = V-shaped, 1 = straight)
22 # [, 9] am Transmission (0 = automatic, 1 = manual)
23 # [,10] gear Number of forward gears
24 # [,11] carb Number of carburetors
```

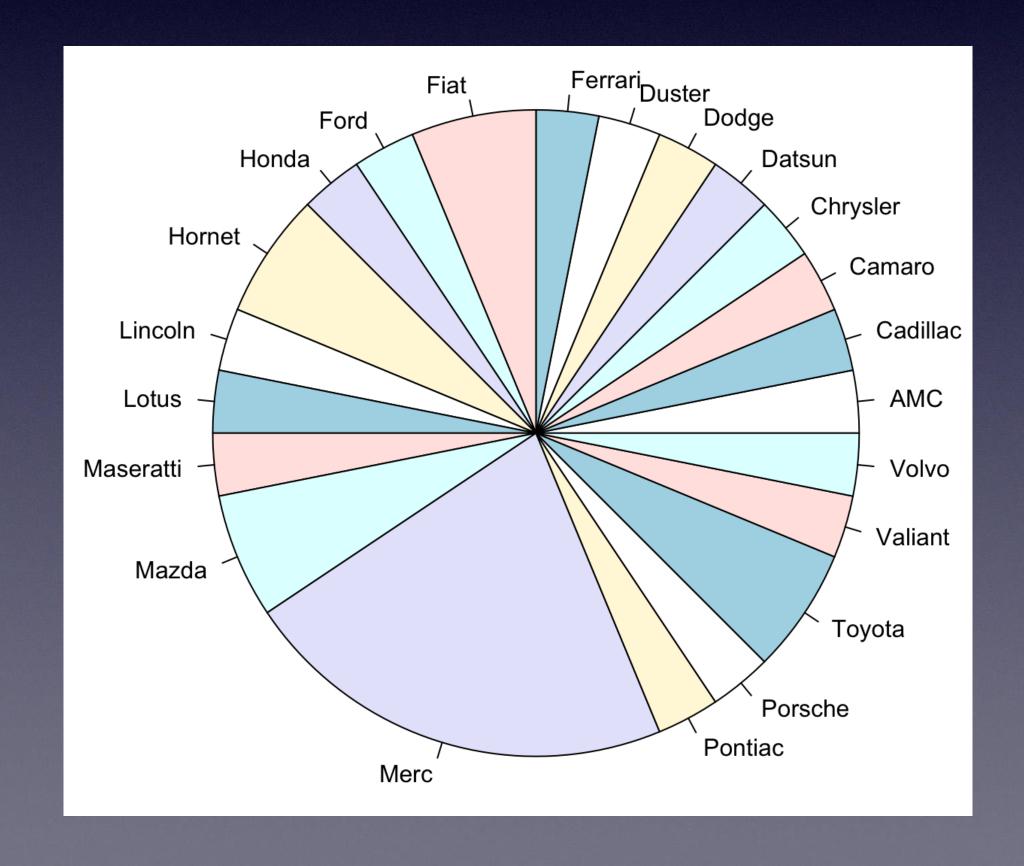




¹ hist(mtcars\$hp, col="salmon")
2 abline(v=mean(mtcars\$hp), col="blue", lwd=3, lty=2)

³ plot(density(mtcars\$hp))

```
1 brands<-c("Mazda", "Mazda", "Datsun", "Hornet", "Hornet", "Valiant", "Duster", "Merc", "Merc", "Merc", "Merc", "Merc", "Merc", "Cadillac",
            "Lincoln", "Chrysler", "Fiat",
            "Honda", "Toyota", "Toyota", "Dodge", "AMC", "Camaro", "Pontiac", "Fiat", "Porsche", "Lotus", "Ford", "Ferrari", "Maseratti", "Volvo")
4 mtcars$brand<-brands # we add an extra column with brands
5 mtcars[1:5,] # let's double check
                      mpg cyl disp hp drat wt qsec vs am gear carb brand
8 # Mazda RX4
                            6 160 110 3.90 2.620 16.46 0 1
                                                                    4 Mazda
9 # Mazda RX4 Wag
                     21.0 6 160 110 3.90 2.875 17.02 0 1
                                                                    4 Mazda
10 # Datsun 710
                                                                    1 Datsun
                     22.8 4 108 93 3.85 2.320 18.61 1 1
11 # Hornet 4 Drive 21.4 6 258 110 3.08 3.215 19.44 1 0
                                                                    1 Hornet
12 # Hornet Sportabout 18.7 8 360 175 3.15 3.440 17.02 0 0
                                                                    2 Hornet
14 pie(table(mtcars$brand)) # we make a piechart of the brands
```



Installing and loading packages

```
1 #Installing packages
  3 # R has a large repository of packages for different applications
  5 install.packages("spaa")  # Installs the ecological package spaa
6 install.packages("vegan")  # Installs the community ecology package Vegan with hundreds of functions
  7 library("vegan") # load Vegan
 8 #Loading required package: permute
 9 # Loading required package: lattice
10 \# This is vegan 2.5-7
11
12
13 # Other relevant packages
15 install.packages("readr")
                                     # To read and write files
16 install.packages("readxl")
                                    # To read excel files
17 install.packages("dplyr")
                                     # To manipulate dataframes
18 install.packages("tibble")
                                    # To work with data frames
                                     # To work with data frames
19 install.packages("tidyr")
20 install.packages("stringr")
21 install.packages("ggplot2")
                                    # To manipulate strings
                                    # To do plots
22 install.packages("kableExtra") # necessary for nice table formatting with knitr
23 install.packages("tidyverse")
24
25 if (!requireNamespace("BiocManager", quietly = TRUE))
26 install.packages("BiocManager")
27 #BiocManager::install(version = "3.10")
28 BiocManager::install(c("dada2", "phyloseq", "Biostrings"))
29
30 install.packages("devtools")
31 devtools::install github("pr2database/pr2database") # Installs directly from github resources that are not in R repos
32 devtools::install github("GuillemSalazar/EcolUtils") # Installs other tools for ecological analyses
34 #Load libraries
35 #### Load libraries ####
36
37 library("dada2")
38 library("phyloseq")
39 library ("Biostrings")
40 library("ggplot2")
41 library("dplyr")
42 library("tidyr")
43 library("tibble")
44 library("readxl")
45 library("readr")
46 library("stringr")
47 library("kableExtra")
48 library("tidyverse")
49 #library("pr2database")
```



-Reproduce all steps shown in this presentation

-The code is available in:

https://github.com/krabberod/BIO9905MERG1_V21/blob/main/intro.to.r/Intro.to.R.BIO9905MERG1_V21.R

THEEND