Introduction to R

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Outline

- What is R
- Setting up RStudio in your computer
- Examples
- Basics of R
- Some R Coding
- Importing a dataset in RStudio

What is R?

- R is a programming language environment for statistical computing
- Widely used among statisticians, data scientists and is currently ranked 9th in the TIOBE index
- R includes a wide variety of statistical and graphical techniques
- Many free resources to learn R
- It's free!



Setting up R

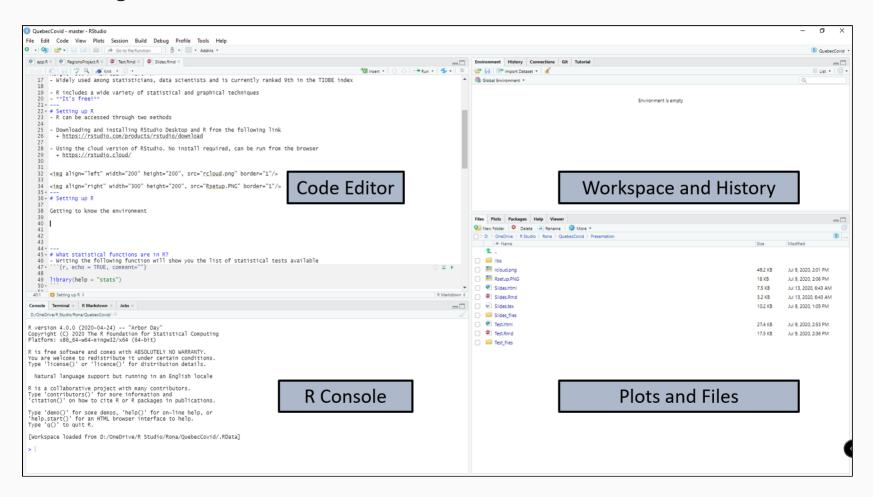
- R can be accessed through two methods
- Downloading and installing RStudio Desktop and R from the following link
 - https://rstudio.com/products/rstudio/download
- Using the cloud version of RStudio. No install required, can be run from the browser
 - https://rstudio.cloud/





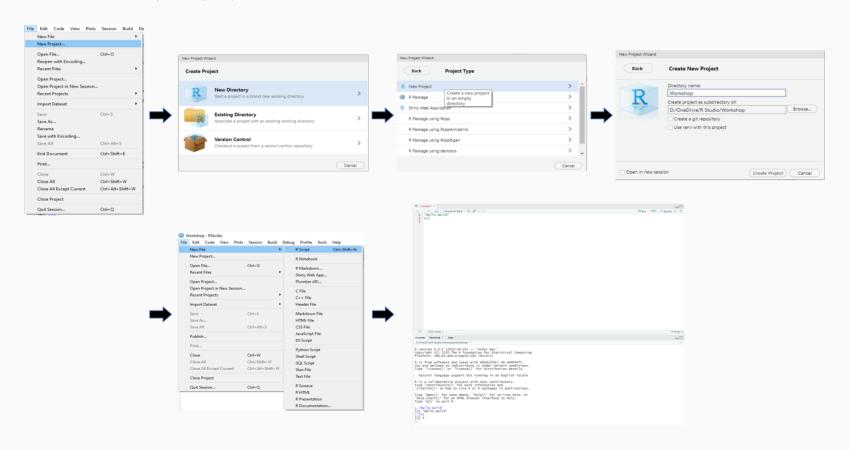
Working to RStudio

• Getting to know the environment



Working with RStudio

- Before starting any kind of work it is **very important** to have your environment set
- An environment is the space where all your variables, formulas, plots and everything related to your project will be saved

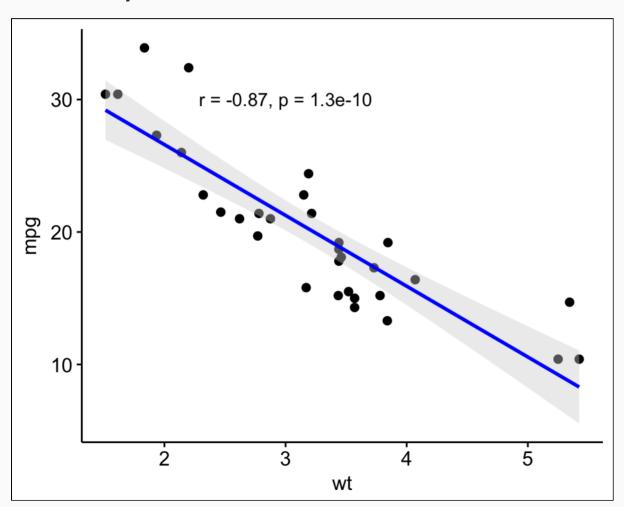


What statistical functions are in R?

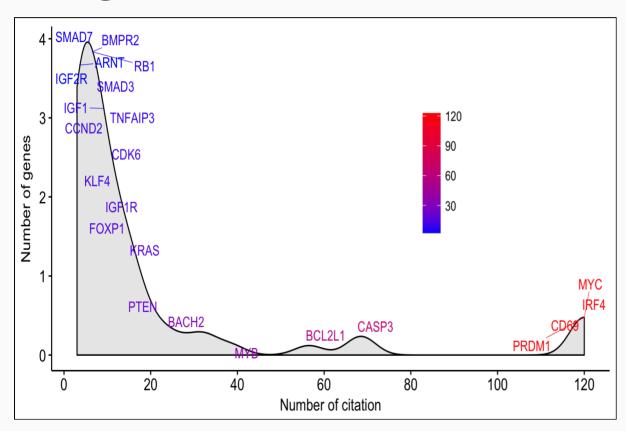
• Writing the following function will show you the list of statistical tests available

```
library(help = "stats")
```

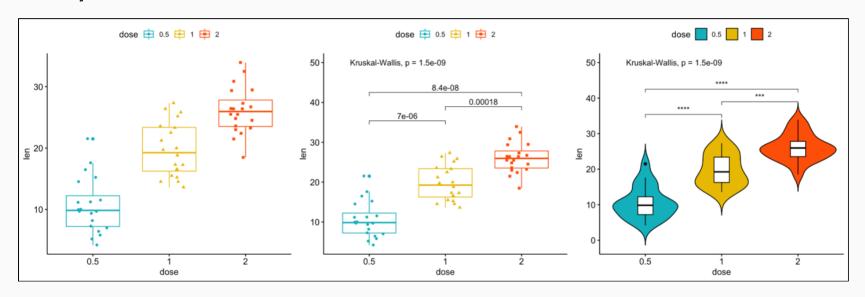
Scatterplot with statistical notation



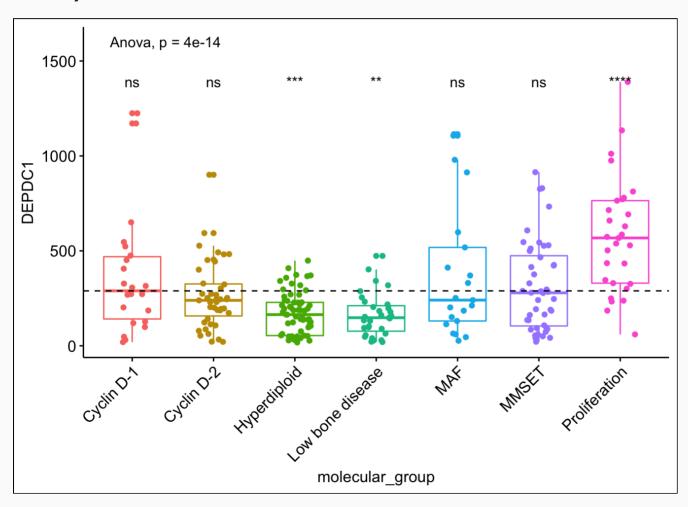
Histograms



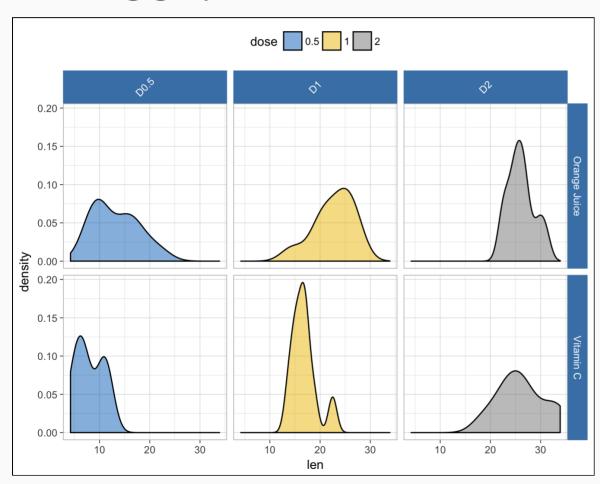
Boxplot



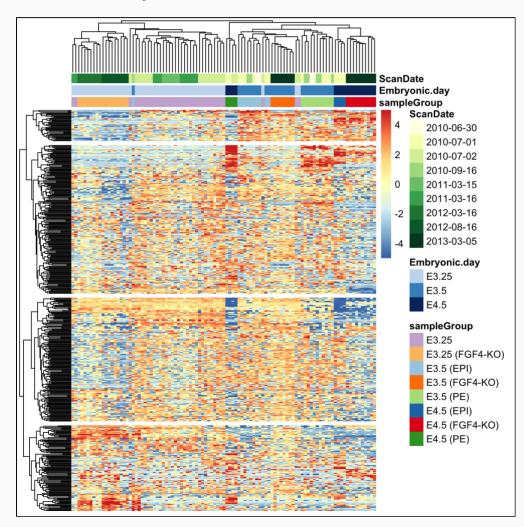
Boxplot



Faceting graphs



Heatmaps



Specialized tools for Bioinformatics

Bioconductor is a project that focuses in providing R tools for analysis of high-throughput biological assays. Some of the project's goals include:

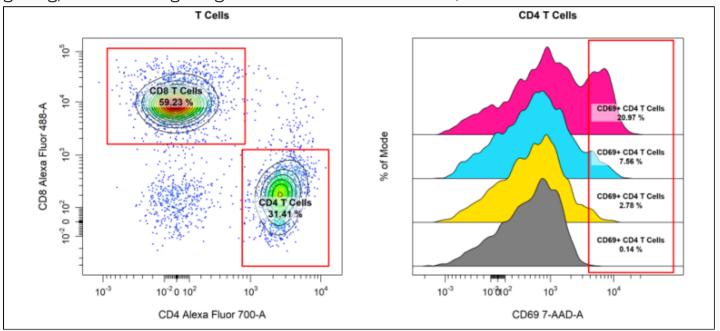
- Provide widespread access to a borad range of powerful statistical and graphical methods for analysis of genomic data
- Facilitate he inclusion of biological metadata in the analysis of genomic data from different sources
- Provide a common software platform that enables rapid development of interoperable software
- Train researchers on computational and statistical methods



Specialized tools for Bioinformatics

CytoExploreR

• Specifically designed to integrate all existing cytometry analysis techniques (e.g. manual gating, automated gating and dimension reduction)



Specialized tools for Bioinformatics

CytoExploreR

Basic R Operations

```
1+1 #Simple Arithmetic
[1] 2
2 + 3 * 4 #PEMDAS also applies
[1] 14
3 ^ 2 #Exponentiation
[1] 9
exp(1) #Basic mathematical functions are available
[1] 2.718282
```

Basic R Operations

```
sqrt(10)
[1] 3.162278

pi #constants are also defined within R

[1] 3.141593
2+pi*43 #Some random operation
[1] 137.0885
```

- Variables are names for values. Created variables can be found in the workspace pane.
- Numeric
 - Store floating point values
- Boolean (True or False)
 - TRUE or FALSE are reserved values, can not be used to name variables
- Strings
 - Essentially text, sequences of characters
- A variable can be determined with the ← operator

- Shortcut for the ← operator, Alt + -
- $x \leftarrow 1$ Assigns 1 to a variable called x
- y ← 3 Assigns 3 to a variable called y
- z ← 4 Assigns 4 to a variable called z
- x*y*x We can perform operations with variables, if allowed

[1] 12

• Variables under the same name can overwrite each other when called later

```
x \leftarrow 1

x \leftarrow 3

x = 1 \text{ #Is } x \text{ still } 1?
```

[1] FALSE

```
x = 3 \# Is \times now 3?
```

[1] TRUE

- Certain rules must be respected when naming variables
- letters_123. ← 4 Letters, numbers, dots, and underscores are allowed
 - letters.123_awesome
 - Can start with a dot but it should not be followed by a number .letters123
- Variables can't start with numbers 1illegalvariable
- The % character isn't allowed another%badvariable
- Starting with _ isn't valid _lastbadvariable
- Variables can hold Numeric, Boolean and String values the same way
 - o x ← 23
 - \circ y \leftarrow "I love this variable"

Vectors

• In R a vector is a collection of numbers, individual numbers are elements of the vector

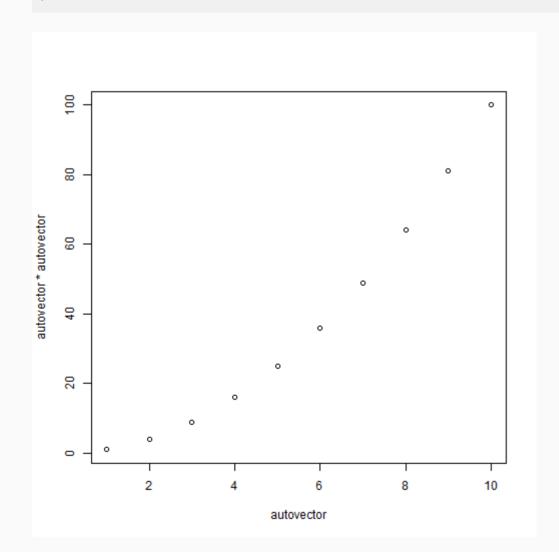
```
myvector \leftarrow c(10,20,30,40,50)
myvector + 1
[1] 11 21 31 41 51
myvector + myvector
[1] 20 40 60 80 100
length(myvector)
[1] 5
c(myvector, myvector)
[1] 10 20 30 40 50 10 20 30 40 50
```

Vectors

- We can create and index vectors with:
- Indexing means accessing specific elements in the vector

Vectors

plot(autovector, autovector**autovector)



Functions

- Functions are things that R do for us: calculate, manipulate data, read and write to files, produce plots.
- R contains many functions and we can also build our own (more advanced stuff)

```
myvector
[1] 10 20 30 40 50
      sum(myvector)
[1] 150
      rep(42,10) #Repeats the number 42, 10 times
       [1] 42 42 42 42 42 42 42 42 42 42
      rep(c(1,2,3),10) #Functions work from the inner brackets to the outer ones. In this ca
        [1] \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1 \ 2 \ 3 \ 1
```

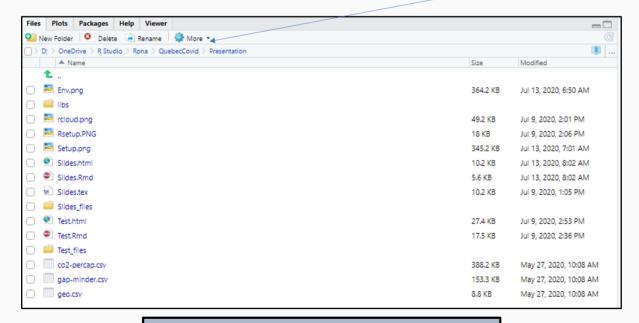
Data frames and the Tidyverse

- Data frames is the R name for tabular data. Essentially tables.
- Generally we want each row in a data frame to represent a unit of observation and each column to contain a different type of information
- As a beginner, it is advisable to prepare your tabular data in Excel prior to working in RStudio
- We will work with data using a package called Tidyverse which contains many popular tools used for data analysis in R
- To install Tidyverse in your computer write install.packages("tidyverse")
- To load Tidyverse write library(tidyverse)
- Whenever you close RStudio make sure to run the library(tidyverse) function the first time you log back in

Opening a csv file

- Save the file you wish to work with in the directory where you saved your project
- This will ensure you don't have you search everywhere in your computer and makes it easy for RStudio to access them

Address where I saved my project



All the files that I will be working with

Opening a csv file

```
geo ← readr::read csv("geo.csv")
geo
# A tibble: 196 x 7
                     region
                              oecd g77 lat long income2017
  name
  <chr>
                     <chr>
                              <lgl> <lgl> <dbl>
                                                <dbl> <chr>
                             FALSE TRUE
 1 Afghanistan
                     asia
                                          33
                                                66
                                                     low
 2 Albania
                             FALSE FALSE 41
                                                20
                                                     upper mid
                     europe
 3 Algeria
                     africa
                             FALSE TRUE
                                          28
                                             3
                                                     upper mid
 4 Andorra
                             FALSE FALSE 42.5 1.52 high
                     europe
                     africa FALSE TRUE -12.5
 5 Angola
                                                18.5 lower mid
 6 Antigua and Barbuda americas FALSE TRUE 17.0 -61.8
                                                     high
 7 Argentina
                     americas FALSE TRUE -34
                                               -64
                                                     upper mid
8 Armenia
                                                     lower mid
                     europe
                             FALSE FALSE 40.2 45
9 Australia
                     asia
                             TRUE FALSE -25
                                               135
                                                     high
10 Austria
                             TRUE FALSE 47.3 13.3
                                                     high
                     europe
  ... with 186 more rows
```

Exploring the data

• We can extract details from the dataset

```
nrow(geo) #Number of observations

[1] 196

ncol(geo) #Number of columns

[1] 7

colnames(geo) #Names of the columns

[1] "name" "region" "oecd" "g77" "lat"
[6] "long" "income2017"
```

Exploring the data

```
summary(geo) #Descriptive statistics (if available) for each column
```

```
name region oecd g77
Length:196 Length:196 Mode :logical Mode :logical
Class :character Class :character FALSE:165 FALSE:65
Mode :character Mode :character TRUE :31 TRUE :131
```

```
lat
                  long
                        income2017
Min. :-42.00
              Min. :-175.000
                              Length:196
                              Class :character
            1st Qu.: −5.625
1st Qu.: 4.00
Median: 17.42 Median: 21.875
                              Mode :character
Mean : 19.03
              Mean : 23.004
3rd Qu.: 39.82 3rd Qu.: 51.892
Max. : 65.00
              Max. : 179.145
```

Indexing data frames

• The syntax to subset (selecting parts of a table) data frames is [row,column]

```
geo[4, 2] #Here were are taking row 4, column 2.
# A tibble: 1 x 1
  region
  <chr>
1 europe
geo[4, "region"] #We can also use the name of the column instead. Be aware that this
# A tibble: 1 x 1
  region
  <chr>
1 europe
```

Indexing data frames

```
geo[4, ] #We can choose a row and all the columns that are associated with it by leav
# A tibble: 1 \times 7
        region oecd g77 lat long income2017
  name
 <chr> <chr> <lgl> <lgl> <dbl> <dbl> <chr>
1 Andorra europe FALSE FALSE 42.5 1.52 high
head(geo[, "region"]) #Similarly we can choose an entire column alone with all its ro
# A tibble: 6 x 1
 region
 <chr>>
1 asia
2 europe
3 africa
4 europe
5 africa
6 americas
```

Indexing data frames

```
geo[c(1, 50, 180), ] #We can index different rows in one line
# A tibble: 3 x 7
                          oecd g77 lat long income2017
 name
                   region
 <chr>
                   <chr> <lgl> <lgl> <dbl> <dbl> <chr>
1 Afghanistan
                   asia FALSE TRUE 33
                                             66
                                                1 ow
2 Dominican Republic americas FALSE TRUE 19 -70.7 upper mid
3 Turkmenistan
                   asia FALSE TRUE 39.8 59.7 upper mid
head(geo[2:8, ]) #Selecting a sequence of rows is called slicing
# A tibble: 6 \times 7
                    region
                            oecd g77 lat long income2017
 name
 <chr>
                    <chr>
                            <lgl> <lgl> <dbl> <dbl> <chr>
1 Albania
                            FALSE FALSE 41
                                              20
                                                    upper mid
                    europe
2 Algeria
                    africa
                            FALSE TRUE 28 3
                                                    upper mid
3 Andorra
                    europe FALSE FALSE 42.5 1.52 high
                            FALSE TRUE -12.5 18.5 lower mid
                    africa
4 Angola
5 Antigua and Barbuda americas FALSE TRUE 17.0 -61.8 high
6 Argentina
                    americas FALSE TRUE -34
                                             -64
                                                    upper mid
```

Logical indexing

- Instead of specifying rows and columns we can use logic to determine TRUE values that fit our request
- The tidyverse package provides the function filter() which allows this to happen in a much easier way than using pure R
- Some operators available include
 - ∘ x=y Equal to
 - x≠y Not equal to
 - x<y Less than
 - x>y Greater than
 - \circ x \leq y Less than or equal to
 - \circ x \geqslant y Greater than or equal to

Logical indexing

• We want countries that are positioned on latitudes that are negative, meaning southern

```
dplvr::filter(geo, lat < 0) #Select the dataframe first, then the condition, negative
# A tibble: 40 \times 7
                           oecd g77 lat long income2017
                   region
  name
  <chr>
                   <chr>
                           <lgl> <lgl> <dbl> <dbl> <chr>
                                      -12.5 18.5 lower mid
1 Angola
                  africa
                           FALSE TRUE
                  americas FALSE TRUE
2 Argentina
                                       -34 -64
                                                  upper mid
 3 Australia
                  asia
                           TRUE FALSE -25
                                            135
                                                  high
4 Bolivia
                                           -65 lower mid
                  americas FALSE TRUE
                                       -17
 5 Botswana
                  africa FALSE TRUE
                                       -22
                                           24 upper mid
 6 Brazil
                  americas FALSE TRUE
                                       -10
                                            -55 upper mid
                  africa
7 Burundi
                           FALSE TRUE -3.5 30
                                                low
8 Chile
                  americas TRUE TRUE -33.5 -70.6 high
9 Comoros
                  africa
                           FALSE TRUE
                                       -12.2 44.4 low
10 Congo, Dem. Rep. africa
                           FALSE TRUE -2.5 23.5 low
  ... with 30 more rows
```

Simple Graph Creation

- Tidyverse contains the package ggplot2 which can assist in creating custom made plots
- Three things to consider
 - A dataframe
 - How the columns of the dataframe can be translated into positions, colors, size, and shapes of graphical elements. The "aesthetics"
 - The actual graphical element to display (scatterplot, lineplot, barplots)

```
## # A tibble: 6 x 11
           year population gdp percap life exp region oecd g77
##
    name
                                                                  lat
                                                                        long
    <chr> <dbl>
                     <dbl>
                               <dbl>
                                        <dbl> <chr> <lgl> <lgl> <dbl>
                                                                       <dbl>
###
## 1 Afgh~
          1800
                 3280000
                                 603
                                         28.2 asia
                                                   FALSE TRUE
                                                                 33
                                                                       66
## 2 Alba~
          1800
                 410445
                                 667
                                         35.4 europe FALSE FALSE 41
                                                                       20
                                 715
                                         28.8 africa FALSE TRUE
                                                                        3
  3 Alge~ 1800
                 2503218
                                                                 28
  4 Ando~
          1800
                      2654
                                1197
                                         NA
                                              europe FALSE FALSE 42.5
                                                                      1.52
                                         27.0 africa FALSE TRUE
  5 Ango~
          1800
                   1567028
                                 618
                                                                -12.5
                                                                       18.5
## 6 Anti~ 1800
                     37000
                                 757
                                         33.5 ameri~ FALSE TRUE 17.0 -61.8
## # ... with 1 more variable: income2017 <chr>
```

Simple Graphs

```
ggplot2::ggplot(gap_geo, ggplot2::aes(x = year, y = life_exp)) + ggplot2::geom_point()
```

Simple Graphs

Let's trying adding more Aesthetics(R)

Simple Graphs

-Boxplots look cool in publications (not these ones though) -The year aesthetic separates the boxplots by year, otherwise it would be one single boxplot