# Introduction to R

Practice exercises - Answer key

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# Setup

Open the Intro R Rproject and start a new working script. Install any new packages, load packages, set a seed, and load data as we did in the workshop.

```
#RNAseq expression and metadata
load("data/RSTR_data_clean_subset.RData")
```

# **Exercises**

# Day 1: Base R

# Project setup

- 1. What are the benefits of storing data in RData versus tables (csv, tsv, etc)?
- Several tables can be stored in a single object and can be loaded together in R with a single load()
- Data are automatically compressed so they take up less hard-drive space
- Data formats are preserved in R such as factors, numbers you want to treat as characters, etc
- 2. Imagine a hypothetical project with the following data and results. How would you choose to setup your Rproject directory and sub-directories? This is something that may evolve over time, but it is helpful to start with a defined structure to make it easier for you and others to find things.
  - .RData file containing all cleaned data for the project
  - 2 .csv of raw RNAseq counts and sample metadata (what was cleaned to make the .RData)
  - 4 .csv with linear model results
  - 25 .png plots of gene expression, individual genes
  - 1 .png plot of gene expression, faceted with many genes
  - 2 .R scripts, 1 for linear modeling and 1 for making plots
  - 1 .Rmd report summarizing and interpreting the results

There are many options for this! I would do the following. Note that I personally like to use a lot of sub-directories.

```
project_name/
    data_clean/
        .RData
    data raw/
        2 data .csv
    figs/
        genes/
            25 individual gene plot .png
        1 facetd gene plot .png
    results/
        4 linear model .csv
    scripts/
        2 .R scripts
    .Rmd
Another option.
project_name/
    data/
        .RData
        2 data .csv
    results/
        models/
            4 linear model .csv
        figs/
            25 individual gene plot .png
            1 facetd gene plot .png
    2 .R scripts
    .Rmd
```

#### Data types

- 1. What is the difference between a character and factor?
- A character is any combination of alphanumeric (A-Z, 0-9) and other symbols (\_ . etc) that R treats like a single word. These are analogous to categorical variables in statistics. So for example, we have a variable with data on "MEDIA" vs "TB" in the workshop data set
- A factor is a character variable with some additional formatting. Factors have defined levels in a defined order. If you try to add data not of one of the defined levels, it is seen as an NA or missing.

For example, we could format our MEDIA/TB variable to a factor

```
factor(dat$targets$condition)
```

```
## Loading required package: limma
                                  MEDIA TB
   [1] MEDIA TB
                     MEDIA TB
                                              MEDIA TB
                                                           TB
                                                                  MEDIA MEDIA TB
## [13] MEDIA TB
                     MEDIA TB
                                  MEDIA TB
                                               MEDIA TB
## Levels: MEDIA TB
and force TB to be the first level even though it is the second alphabetically
factor(dat$targets$condition, levels=c("TB", "MEDIA"))
  [1] MEDIA TB
                     MEDIA TB
                                  MEDIA TB
                                              MEDIA TB
                                                           TB
                                                                  MEDIA MEDIA TB
## [13] MEDIA TB
                     MEDIA TB
                                  MEDIA TB
                                              MEDIA TB
```

#### ## Levels: TB MEDIA

And if we only allow TB as a level, we can see the how R replaces everything else with NA

factor(dat\$targets\$condition, levels=c("TB"))

```
## [1] <NA> TB <NA> TB
```

- 2. What data type does R classify the date 2021.06? What about 2021/06? If it is not classified as a "date", how could this impact downstream analyses? Try to predict the outcomes before checking in R.
- Both are treated as numeric. The first as a number with 2 decimal digits and the second as the result of 2021 divided by 6

```
2021.06

## [1] 2021.06

class(2021.06)

## [1] "numeric"

2021/06

## [1] 336.8333

class(2021/06)
```

- ## [1] "numeric"
  - This could dramatically impact results if these data were actually dates because 1) they are not being treated the same even though they are the same date, 2) scales will be wrong (as in 2021.06 is one month apart from 2021.07 but will be treated at 0.01 apart), 3) some functions that require a date won't run on a numeric, and other issues
  - 2. Challenge: Checkout the package lubridate for functions to effectively work with dates in R.
  - You can force date formatting like so and it is a lot more intuitive that base R's as.Date(). Here, you simply list which date components you have for year (y), month (m), and day (d) in the order they are in. That function does the rest!

```
library(lubridate)

ym("2021.06")

## [1] "2021-06-01"

ym("2021/06")

## [1] "2021-06-01"

#And if we had a day

ymd("2021.06.2")

## [1] "2021-06-02"

#A different order

mdy("06.2.2021")
```

- ## [1] "2021-06-02"
  - https://lubridate.tidyverse.org/ has more on the lubridate package

3. You have an S3 list object named myData and it contains 2 data frames named A and B. Within B there is a column named variable1. How do you access this variable?

# myData\$B\$variable1

#### Subsetting and filtering

Using dat:

1. What is the mean library size lib.size?

```
mean(dat$targets$lib.size)
```

#### ## [1] 9287558

2. Try running summary(dat\$targets). What kinds of data does it provide? Why are the results different for different variables?

# summary(dat\$targets)

```
##
       libID
                            lib.size
                                              norm.factors
                                                                 FULLIDNO
                                : 2776897
                                                    :0.7735
##
    Length:20
                                             Min.
                                                               Length:20
                        Min.
##
    Class : character
                        1st Qu.: 4625309
                                             1st Qu.:0.8871
                                                               Class : character
##
    Mode :character
                        Median :10186231
                                             Median :1.0224
                                                               Mode : character
##
                                : 9287558
                                                    :1.0082
                        Mean
                                             Mean
##
                        3rd Qu.:12526319
                                             3rd Qu.:1.0903
                                :17242699
                                                    :1.3324
##
                        Max.
                                             Max.
                         condition
##
        RSID
##
    Length:20
                        Length:20
    Class : character
                        Class : character
##
##
    Mode :character
                        Mode : character
##
##
##
```

- You will get min, max, mean, and quartiles for numeric data
- You get the class and length of character vectors
- R automatically detects the data type and provides as much info as it can. Since character variables are simply words, this class has the least summary info.
- 3. How many libraries have a library size lib.size greater than 5 million and a normalization factor norm.factors less than 1?

```
size.logical <- dat$targets$lib.size > 5E6
norm.logical <- dat$targets$norm.factors < 1
dat$targets[size.logical & norm.logical, ]</pre>
```

```
##
            libID lib.size norm.factors
                                          FULLIDNO
                                                        RSID condition
     RS102306 TB 10101705
                              0.9096415 84437-1-02 RS102306
## 4
                                                                    TB
     RS102244_TB
                  8695434
                              0.8544133 84457-1-02 RS102244
                                                                    TB
## 9 RS102521_TB
                   8859096
                                                                    TB
                              0.7735422 91360-1-04 RS102521
## 12 RS102340_TB 7368365
                              0.8892822 84317-1-03 RS102340
                                                                    TB
## 18 RS102469_TB 10536450
                              0.9812365 89448-1-04 RS102469
                                                                    TB
## 20 RS102484_TB 10270757
                              0.8390154 84427-1-02 RS102484
                                                                    TB
```

```
#Or combine it all together
dat$targets{lib.size > 5E6 & dat$targets$norm.factors < 1, ]</pre>
```

```
libID lib.size norm.factors
                                         FULLIDNO
## 4 RS102306_TB 10101705 0.9096415 84437-1-02 RS102306
## 8 RS102244 TB 8695434
                             0.8544133 84457-1-02 RS102244
                                                                  TB
## 9 RS102521_TB 8859096
                             0.7735422 91360-1-04 RS102521
                                                                  TB
## 12 RS102340_TB 7368365
                             0.8892822 84317-1-03 RS102340
                                                                  TB
## 18 RS102469 TB 10536450
                             0.9812365 89448-1-04 RS102469
                                                                  TB
## 20 RS102484 TB 10270757
                             0.8390154 84427-1-02 RS102484
#And bonus, you can make R count the rows for you
nrow(dat$targets[size.logical & norm.logical, ])
```

## [1] 6

4. Challenge: Using the function grep1, how many libraries are from a donor with an RSID that starts with "RS1025"?

```
dat$targets[grepl("^RS1025", dat$targets$RSID), ]
```

```
libID lib.size norm.factors
                                             FULLIDNO
                                                           RSID condition
## 2
         RS102531_TB 2776897
                                 0.9161955 92527-1-08 RS102531
                                                                       TR
## 3
     RS102531_MEDIA 4258343
                                 1.0732788 92527-1-08 RS102531
                                                                    MEDIA
         RS102521_TB 8859096
                                 0.7735422 91360-1-04 RS102521
                                                                       TB
## 11 RS102521_MEDIA 14509963
                                 1.0349902 91360-1-04 RS102521
                                                                    MEDIA
## 14
         RS102548_TB 12858053
                                 1.2734417 89902-1-07 RS102548
                                                                       TB
## 15 RS102548_MEDIA 17242699
                                 1.3323830 89902-1-07 RS102548
                                                                    MEDIA
```

• Note that ^ means the start of and \$ means the end of in a regular expression (regex) used in grepl

# R. session

```
sessionInfo()
## R version 4.1.1 (2021-08-10)
## Platform: x86_64-apple-darwin17.0 (64-bit)
## Running under: macOS Big Sur 10.16
## Matrix products: default
## BLAS:
         /Library/Frameworks/R.framework/Versions/4.1/Resources/lib/libRblas.0.dylib
## LAPACK: /Library/Frameworks/R.framework/Versions/4.1/Resources/lib/libRlapack.dylib
##
## locale:
## [1] en_US.UTF-8/en_US.UTF-8/en_US.UTF-8/C/en_US.UTF-8/en_US.UTF-8
## attached base packages:
## [1] stats
                graphics grDevices utils
                                               datasets methods
##
## other attached packages:
## [1] lubridate_1.8.0 limma_3.48.3
## loaded via a namespace (and not attached):
                                                        generics_0.1.0
## [1] compiler_4.1.1 magrittr_2.0.1 fastmap_1.1.0
## [5] tools 4.1.1
                       htmltools 0.5.2 yaml 2.2.1
                                                        stringi 1.7.5
## [9] rmarkdown 2.11 knitr 1.36
                                        stringr 1.4.0
                                                        xfun 0.27
## [13] digest_0.6.28
                       rlang_0.4.12
                                        evaluate 0.14
```