R Workshops for School of Psychology

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Introduction: What is R?

This e-book describes how to use R to import, clean, and process psychological data. All materials, data, and information in this e-book are used for educational purposes only. This document should only be shared within the University of Galway's School of Psychology, and is not intended for widespread dissemination. The e-book is very much in its draft stages and will be updated and fine-tuned in the future. Several materials are adapted from several online resources on teaching R. These materials are as follows: (ref: xie2015).

1.1 Who is this resource for?

These workshops are designed to help people who come from a Psychology or social science background learn the necessary programming skills to use R effectively in their research. These workshops are designed to help people who have no programming experience whatsoever to learn the necessary programming skills and ideas that you will need to conduct typically statistical techniques in Psychology (e.g., Power Analyses, Correlation, ANOVA, Regression, Mediation, Moderation).

These workshops are **not** for people interested in learning about statistical theory or the who, what, where's of any of the aforementioned statistical techniques. I want these workshops to focus entirely on how to do statistical analyses in R - I assume you know the rest or know how to access that information.

1.2 Should I learn R?

There are both extrinsically motivated and intrinsically motivated reasons to learn R. Let's focus on the extrinsically motivated reasons first:

Psychological research is increasingly moving towards open-science practices. One of the key principles of open-science is that all aspects of data handling including data wrangling, pre-processing, processing, and output generation are openly accessible. This is not only an abstract want or desire, several top-tier journals require that you submit R scripts along with any manuscripts. If you don't know how to use R (or at least no one in your lab does), then this will put you at an disadvantage.

R enables you to import, clean, analysis and publish manuscripts from R itself. You do not have to switch between SPSS, Excel, and Word or any other software. You can conduct your statistical analysis directly in R and have that "uploaded" directly to your manuscript. In the long run, this will save you so much time and energy.

It will make you more competitive in the field. A survey of LinkedIn career opportunities in the field of data science and entry, 80% require that you have skills in either R or Python when it comes to statistical programming. If one day you feel like you need an excursion from academia, R can potentially open doors for you in industry.

R is capable of more than statistical analysis. You can create websites, documents, and books in R. This workshop textbook was developed in R! While these initial workshops will not be discussing how to do this (although it is something that I would like to do in the future), I wanted to mention it as an example how powerful R can be.

1.3 What will I learn to do in R?

The following workshops will teach you on how to conduct statistical analysis in R.

R is a statistical programming language that enables you to wrangle, process, and analyse data. By the end of these workshops you should be able to import a data file into R, do some processing and cleaning, compute descriptive and inferential statistics, generate nice visualizations, and output your results.

The learning objectives of this course are:

- Learn how to import and create data sets in R.
- Learn and apply basic programming concepts such as data types, functions, and loops.
- Learn key techniques for data cleaning in R to enable statistical analysis
- Learn how to create APA-standard graphs in R
- Learn how to deal with errors or bugs with R code
- Learn how to export data.

1.4 What will I not learn to do in R?

This is not an exhaustive introduction to R. Similar to human languages, programming languages like R are vast and will take years to master. After this course, you will still be considered a "newbie" in R. But the material covered here will at least provide you a solid foundation in R, enabling you to go ahead and pick up further skills if required as you go on.

This course will teach you data cleaning and wrangling skills that you will enable you to wrangle and clean a lot of data collected on Gorilla or Qualtrics. But you will not be able to easily handle all data cleaning problems you are likely to find out in the "wild" world of messy data. Such datasets can be uniquely messy, and even experience R programmers will need to bash their head against the wall a few times to figure out a way to clean that dataset entirely in R. If you have a particularly messy dataset, you might still need to use other programs (e.g., Excel) to clean it up first before importing it to R.

Similarly, do not expect to be fluent in the concepts you learn here after these workshops. It will take practice to become fluent. You might need to refer to these materials or look up help repeatedly when using R on real-life datasets. That's normal.

This workshop is heavily focused on the tidyverse approach to R. The tidyverse is a particular philosophical approach on how to use R (more on that later). The other approach would be to use base R. This can incite violent debates in R communities on which approach is better. We will focus mainly on tidyverse and use some base R.

This workshop does not teach you on how to use R Markdown. R Markdown is a package in R that enables you to write reproducible and dynamic reports with R that can be converted into word documents, PDFS, websites, powerpoint presentations, books, and much more. That will be covered in the intermediate workshop program.

Getting Started with R and RStudio

This workshop introduces the programming language R and the RStudio application. Today, we will download both R and RStudio, set up our RStudio environment, and write and run our first piece of R Code. This will set us up for the rest of the workshops.

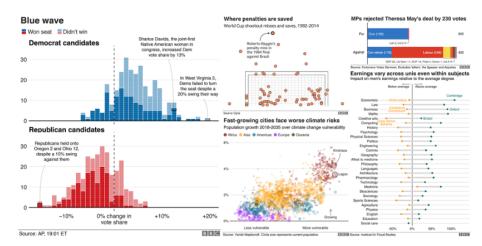
2.1 What actually is R?

R is a statistical programming language that enables us to directly ask our computer to carry out tasks. Typically, when we use our computers, we do not speak to it directly; instead we interact with "translators" (i.e., applications like SPSS), via button-click interfaces, to speak to our computer on our behalf. Such interfaces record and translate our instructions to our computers, who then carry out the instructions and return the results to the application, which then translates those results back to us.

Applications like SPSS are convenient. They usually have a user-friendly button-click based interface and take away the heavy lifting of communicating with our computer. This makes them significantly easier to learn in the short term compared to programming languages.

However, these apps also limit what we can do. For example, base SPSS is functional when it comes to creating visualizations, but it is difficult make major changes to your graph (e.g., making it interactive). If we want to create such visualizations, we will likely need to look elsewhere for it. Similarly, we might also be financially limited in our ability to use such apps, as proprietary software like SPSS is not cheap (it can cost between \$3830 - 25200 for a single licence depending on the version)!

In contrast, R is a free, open-source statistical programming language that enables us to conduct comprehensive statistical analysis and create highly elegant visualizations. By learning R we can cut out the middle man.



But why should we learn R and not a different programming language? In contrast to other programming languages (Python, JavaScript, C), R was developed by statisticians. Consequently, R contains an extensive vocabulary to enable us to carry out sophisticated and precise statistical analysis. I have used R and Python to conduct statistical analysis and anytime I wanted to use a less frequently used statistical test, there was significantly more support and information on how to conduct that analysis in R than in Python. For such reasons, R is typically used among statisticians, social scientists, data miners, and bioinformaticians - and will be used in this course¹.

2.2 Downloading R

Please follow the following instructions to download R on either Windows or Mac.

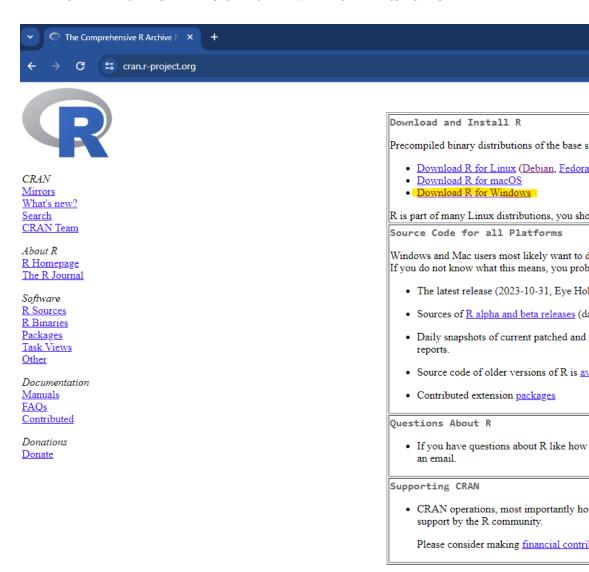
2.2.1 Downloading R on Windows

1. Go to the website: https://cran.r-project.org/

¹There are always tradeoffs in selecting a language. Many programming concepts are easier to grasp in Python than in R. Similarly, there is a lot of resources available for conducting machine-learning analysis in Python.

But if you are goal is conduct data cleaning, analysis, visualization, and reporting, then R is a excellent choice. The good thing is that once you achieve a certain level of competency in one programming language, you will find it significantly easier to pick up a following one.

2. Under the heading $Download\ and\ Install\ R,$ click $Download\ R\ for\ Windows$



R is 'GNU S', a freely available language and environment for statisti analysis, classification, clustering, etc. Please consult the R project ho

CRAN is a network of ftp and web servers around the world that store

CRAN submission will be offline from Dec 22, 2023 to Jan 8, 2024 (C

To "submit" a package to CRAN, check that your submission meets the





- 3. Click the hyperlink base or install R for the first Time
- 4. Click Download R-4.3.2 for Windows (depending on the date you accessed this, the version of R might have been been updated. That's okay, you can download newer versions). Let the file download.



- 5. Once the file has been downloaded, open it, and click "Yes" if you are asked to allow this app to make changes to your device. Then choose English as your setup language. The file name should be something like "R-4.3.2.-win". The numbers will differ depending on the specific version that was downloaded.
- 6. Agree to the terms and conditions and select a place to install R. It is perfectly fine to go with the default option.

2.2.2 Downloading R on Mac

The instructions are largely the same for Windows. Please see this guide for more information https://teacherscollege.screenstepslive.com/a/1135059-install-r-and-r-studio-for-mac

2.3 Install and Open R Studio

Once R is installed, we will install RStudio.

RStudio is a front-end program that makes it it much more user-friendly to use R without sacrificing our ability to code in R. R Studio will enable us to write and save R code, generate plots, manage our files, and do other useful things. RStudio relationship to R is similar to the relationship between a basic text editor and Microsoft Word. We could write a paper in a text editor, but it is much quicker and more efficient to use Word.

- 1. **NB:** Make sure that R is installed *before* trying to install R Studio.
- 2. Go to the RStudio website: https://posit.co/download/rstudio-desktop/

3. The website should automatically detect your operating system. Click the

1: Install R

RStudio requires R 3.3.0+. Choose a version of R that matches your computer's operating system.

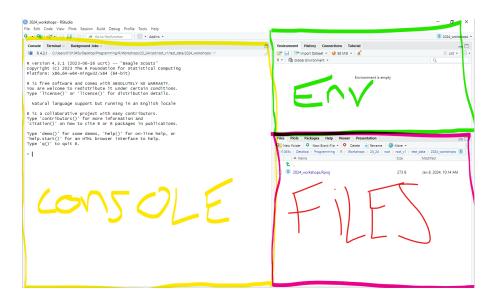
DOWNLOAD AND INSTALL R

Download RStudio Desktop button.

Once the file is downloaded, open it and allow it to make changes to your device. Then follow the instructions to download the program. I recommend going with all default options here.

After downloading both R and RStudio, open RStudio on your computer. You do not have to open R as RStudio will work with R (if everything is working correctly).

When you first open RStudio, you will see three panes or "windows" in R Studio: "Console" (left) "Environment" (top right), and "Files" (bottom right).



2.4 Creating an R Project

The first thing we will do in RStudio is create a *R Project*. R Projects are environments that will group together input files (e.g., data sets), analyses on those files (e.g., code), and any outputs (e.g., results or plots). Creating an R Project will set up a new directory (folder) on your computer. Any time you open that project, you are telling R to work within this particular directory.

Activity

Let's create an R Project that we will use during these workshops.

- Click "File" in the top left hand corner of RStudio-> then click new "New Project"
- 2. The "New Project Wizard" screen will pop up. Click "New Directory" -> "New Project"
- 3. In the "Create New Project" screen, there are four options.

Option 1: The "Directory name" options sets the name of the project and associated folder.

- You can set this to whatever you want. Just don't set it to "R", as this can create problems down the line.
- I recommend that you set the same directory name as me introR_2024

Option 2: The "Create project as sub-directory of" option selects a place to store this project on your computer.

- You can save this anywhere else you like (e.g., your Desktop). Just make sure to save somewhere you can find and somewhere that will not change location (e.g., if you save folders to your desktop, but then tend to move them elsewhere once it gets cluttered, then do not save it to your desktop).
- My recommendation would be to create a folder called "R_Programming" on your desktop. And then save your project in this folder.
- Regardless of where you save your project, copy the location and paste it somewhere you can check (e.g., into a text file)

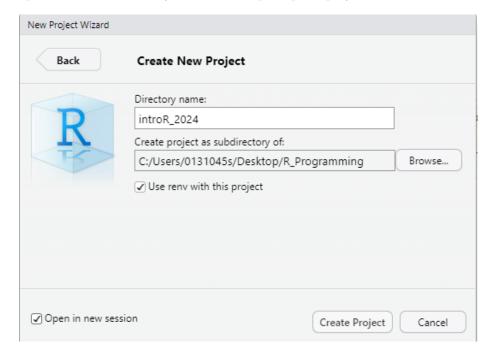
Option 3: The "Use renv with this project" option enables you to create a virtual environment for this project that will be separate to other R projects. Don't worry for now about what that means, it will be explained later on.

• Tick this option.

Option 4: The "Open in new session" just opens a new window on RStudio for this project.

• Tick this option.

You can see my example below. Once you're happy with your input for each option, click "Create Project" This will open up the project introR_2024.

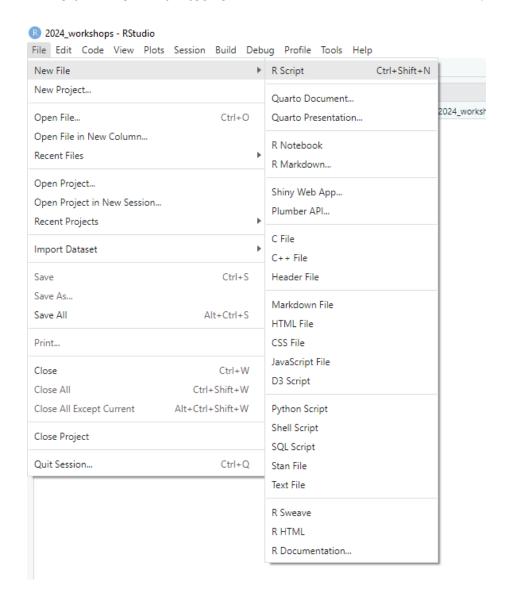


2.4.1 Navigating RStudio

In our new project, introR_2024, we are going to open the "Source" pane, which we will often use for writing code, and viewing datasets.

There are a variety of ways to open the Source pane.

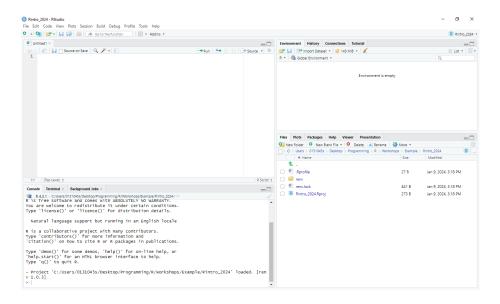
Button approach: Click the "File" tab in the top-left hand corner (not the File pane) -> Click "New File" -> "R Script"



Button Shortcut: directly underneath the *File* tab, there is an icon of a white sheet with a green and white addition symbol. You can click that too.

Keyboard Shortcut: You can press "Ctrl" + "Shift" and "N" on Windows. Or "Cmd" + "Shift" + "N" on Mac.

Now you should see your four panes: Source, Console, Environment, and Files.



2.4.1.1 The RStudio Workspace

Now that we have each pane opened, let's briefly describe what each pane is for.

- The *Source Pane* is where you will write R scripts. R scripts enable you to write, save, and run R code in a structured format. For example, you might have an R script titled "Descriptive" which contains the code you need to compute descriptive statistics on your data set. Similarly, you might have another R script titled "Regression" that contains the code for computing your regression analyses in R.
- The *Console Pane* is where you can write R code and where you can find several outputs from your R scripts. For example, if you create a script for running a t-test in R, then the results can be found in the Console Pane. You will also find any error or warning messages about any code that you run (e.g., if you make a mistake in your R code) highlighted in the console. In short, the console is where R is actually running.
- The *Environment Pane* is where you will find information on any data sets and variables that you import or create in R within a bespoke R project. The "History" tab will contain a history of any R code that you run during the project. This pane is really useful for getting a bird-eye's view of a project (which can be really useful if you are returning to a project after a long period of time or you are looking at someone's else code).
- The *Files Pane* is where you find your R project files (in the Files tab), the output of any plots that you create (Plots tab), the status of any down-

loaded packages (Packages tab), and information and helpful information about R functions and packages (Help).

Each pane will be used extensively during these workshops.

2.4.2 Checking our Working Directory

Everytime you open up a project or file in RStudio, it is good practice to check the working directory. The working directory is the environment on our computer that R is currently operating in.

You want the working directory to be in the same location as your R project. That way any files you import into RStudio or any files you export (datasets, results, graphs) can easily be found in your R project folder. A lot of problems can be avoided in R by making sure that you check the working directory.

To check the working directory, type the following into the console pane

getwd()

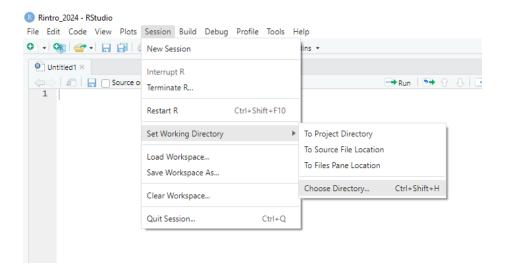
[1] "C:/Users/0131045s/Desktop/Programming/R/Workshops/Rintro_2024/rsot_v1"

What you get in return is the current working directory R is working in. Your working directory will not be the same as mine, that's perfectly normal. Just check to make sure that is in the same location you specified when you created your project (**Option 2**).

2.4.3 Setting up a new Working Directory

We are going to slightly change our working directory. In our R Project, we are going to create a folder for week1 of the workshop. Anything that we create in R will then be saved into this week1 folder.

 Click "Session" on your RStudio toolbar -> Set Working Directory -> Choose Directory



- By default you should be in your R Project (e.g., Rintro_2024).
- Within this R Project, create a new folder and call it "week1"
- Click "week1" and then click Open



You should see something like the following in your console

> setwd("C:/Users/0131045s/Desktop/Programming/R/Workshops/Example/Rintro_2024/week1")

Check whether this is actually the location you want to store your files for this course. If it is, we are good to go. If not, then let me know.

2.5 Writing our first R Code

Let's write our first line of R code. In the *console*, type in the each of the following instructions and press enter. Feel free to change the second line of code to add your own name.

```
print("Hello World")

## [1] "Hello World"

print("My name is Ryan and I am learning to code in R")
```

[1] "My name is Ryan and I am learning to code in R"

Congratulations, you've written your first piece of code!

Let's describe what is going on here. We used a function called print() to print the words "Hello World" and "My name is Ryan and I am learning to code in R" in the console. Functions are equivalent to verbs in English language - they describe doing things. In this case, R sees the function print - then it looks inside the bracket to see what we want to print, and then it goes ahead and prints it. Pretty straightforward.

Functions are a very important programming concept, and there is a lot more going on under the hood than I have described so far - so we will be returning to functions repeatedly and filling you in with more information. But in essence functions are verbs that enable us to tell our computer to carry out specific actions on objects.

2.6 Console vs Source Script

You might have noticed that I asked you to write code in the console rather than in the source pane. It's worth discussing here what the differences are between the console and the script when it comes to writing code.

The console is like the immediate chat with R. It's where you can type and execute single lines of code instantly. Imagine it as a friendly conversation where you ask R to do something, and it responds right away. The console The console is fantastic for experimenting and getting instant feedback. It's your interactive playground, perfect for spontaneous interactions with R.

The console is also really useful for performing quick calculations, testing functions or pieces of code, and for running code that should run once and only once.

However, the console is cumbersome to use if we want to write code that is several lines long and/or when we want to structure or save our code. This is where R scripts come in.

R scripts are text files where we can write R code in a structured manner. Scripts enable us to structure our code (e.g., with headings and instructions), write several pieces of code, and save and rerun code easily. If you think of your console as a draft, then your script is for the code that you want to keep.

From now on, whenever we write code, we are going to be using R scripts by default. For the times we will write code in the console, I will let you know beforehand.

2.7 Let's write some statistical code

Okay we have talked a lot about R and RStudio. To finish off this session, let's write code that will take a data set, calculate some descriptive statistics, run an inferential test, generate a graph, and save our results. Don't worry if you do not understand any of the following code. Just follow along and type it yourself in the R script we opened up earlier (if it's not open, click "File" -> New File -> RScript)

When you download R, you will have automatic access to several functions (e.g., print) and data sets. One of these data sets are called sleep, which we are going to use right now. To learn more about the sleep data set, type <code>?sleep</code> into the console. You will find more information on the data sets in the Files pane, under the Help tab.

First let's have a look at the sleep data set by writing and running the following code.

```
View(sleep) #this will open the dataset in your Source pane

#To run scripts in R, select the code and click the Run button with the green arrow in
```

The View() function takes a data set and opens up a new window in the source pane where we can view that data set.

Running it on sleep shows us there are 20 observations in the dataset (rows), with three difference variables (columns): extra (hours of extra sleep each participant had), group (which treatment they were taken), and ID (their participant ID).

Let's calculate some descriptive statistics. The summary() function takes in an object (e.g., like a data set) and summaries the data. Write the following in your R script and press run.

summary(sleep) #calculates descriptive statistics for each variable in our dataset

```
##
                                     ID
        extra
                       group
##
    Min.
            :-1.600
                       1:10
                              1
                                      :2
##
    1st Qu.:-0.025
                       2:10
                              2
                                      :2
                              3
    Median : 0.950
                                      :2
##
           : 1.540
                              4
                                      :2
    Mean
                              5
##
    3rd Qu.: 3.400
                                      :2
                              6
##
    Max.
           : 5.500
                                      :2
##
                               (Other):8
```

Running the summary() function on our data set shows us that mean change in hours of sleep were +1.5, and that there was 10 participants within both the control and experimental condition.

But it's not perfect. Firstly, we don't need summary descriptive on the participant ID. Secondly, it only tells us the mean across both groups, whereas we are more interested in the mean score per each group. Let's fix this by using the aggregate() function, which enables us to split our data into subset and then compute summary statistics per group. Remember to press run after you written your code.

```
aggregate(data = sleep, extra ~ group, FUN = mean)

## group extra
## 1     1  0.75
## 2     2  2.33

#The code inside the aggregate bracket tells our computer to:
# data = sleep -> Go to the sleep data set

#extra ~ group -> Take the variable "extra" and split it into subsets based on the variable "group"
# FUN = mean -> Apply the mean() function (FUN) on each subset
```

That's more like it. Now we can see that there does seem to a difference between treatment1 and treatment2. Participants slept an extra 2.33 hours on average when taking treatment 2, whereas they only slept .75 hours (e.g., 45 minutes) more on average when taking treatment 1. So treatment 2 does seem more effective.

Now that we have some descriptive statistics, let's run a paired-samples t-test to see if those differences are significant.

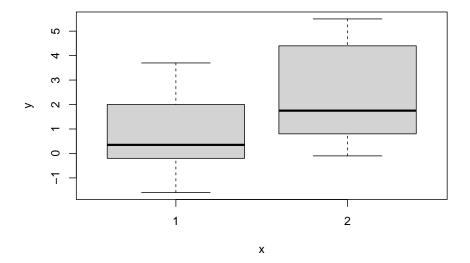
```
##
## Paired t-test
##
## data: sleep$extra[sleep$group == 1] and sleep$extra[sleep$group == 2]
## t = -4.0621, df = 9, p-value = 0.002833
## alternative hypothesis: true mean difference is not equal to 0
## 95 percent confidence interval:
## -2.4598858 -0.7001142
## sample estimates:
## mean difference
## -1.58
```

```
#the t.test function enables us to perform a t-test
```

Boom! We can see there is a statistically significant difference between the two groups. I know the code within the t-test might look a bit complicated, but we will break it down and explain it as we go on in further weeks.

Finally let's visualize our data with the plot() function.

```
plot(sleep$group, sleep$extra)
```

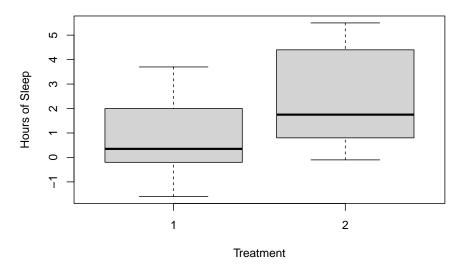


The plot() function is an example of a generic function, which means it's a function that will try to adapt to our code. In this case, the plot() function looks at the variables we wants to plot, and identifies that the box plot is the most appropriate way to plot it.

Now this plot is perfectly adequate for a first viewing, but let's make it a bit more instructive by adding labels to the x and y axis, and by adding a title to it.

plot(sleep\$group, sleep\$extra, xlab = "Treatment", ylab = "Hours of Sleep", main = "Effect of Treatment")

Effect of Treament on Sleep Duration



```
#xlab = creates a label for the x-axis

#ylab = creates a title for the y-axis

#main = creates a title for the plot
```

Now let's take this plot and save it to a PDF so that we could share our results with others. The standard way of doing this in R is a bit cumbersome. We have to tell R that we are about to create a plot that we want to make into a PDF. Then we have to generate the plot. Then we have to tell R we are done with creating the PDF. We'll learn a MUCH simpler way to do this in future weeks, but this will do for now.

```
pdf(file = "myplot.pdf") #Tells R that we will create a pdf file called "my_plot" in o
plot(sleep$group, sleep$extra, xlab = "Treatment", ylab = "Hours of Sleep", main = "Ef
dev.off() #this tells R that we are done with adding stuff to our PDF
```

```
## pdf
## 2
```

Go to the files pane, and open up the pdf "my_plot1.pdf". It should be in your working directory. Open it up the PDF and have a look at your graph².

There we have it! That completes our first session with R and RStudio. Today was more about getting to grips with the software R and RStudio, but we still got our first pieces of code written. Hopefully it's given you a tiny glimpse into what R can do.

Next week, we will go into more detail about programming concepts and how to import data.

²This is a fairly generic type of graph offered by base R. During the course we will looking at ways we can create "sexier" and more APA friendly type of graphs. But for one line of code, it's not bad!

Introduction to R Programming

Parts

You can add parts to organize one or more book chapters together. Parts can be inserted at the top of an .Rmd file, before the first-level chapter heading in that same file.

Add a numbered part: # (PART) Act one {-} (followed by # A chapter)

Add an unnumbered part: # (PART*) Act one {-} (followed by # A chapter)

Add an appendix as a special kind of un-numbered part: # (APPENDIX) Other stuff {-} (followed by # A chapter). Chapters in an appendix are prepended with letters instead of numbers.

Blocks

5.1 Equations

Here is an equation.

$$f(k) = \binom{n}{k} p^k \left(1 - p\right)^{n - k} \tag{5.1}$$

You may refer to using \@ref(eq:binom), like see Equation (5.1).

5.2 Theorems and proofs

Labeled theorems can be referenced in text using \@ref(thm:tri), for example, check out this smart theorem 5.1.

Theorem 5.1. For a right triangle, if c denotes the length of the hypotenuse and a and b denote the lengths of the **other** two sides, we have

$$a^2 + b^2 = c^2$$

 $Read\ more\ here\ https://bookdown.org/yihui/bookdown/markdown-extensions-by-bookdown.html.$

5.3 Callout blocks

The R Markdown Cookbook provides more help on how to use custom blocks to design your own callouts: https://bookdown.org/yihui/rmarkdown-cookbook/custom-blocks.html

Sharing your book

6.1 Publishing

HTML books can be published online, see: https://bookdown.org/yihui/bookdown/publishing.html

6.2 404 pages

By default, users will be directed to a 404 page if they try to access a webpage that cannot be found. If you'd like to customize your 404 page instead of using the default, you may add either a _404.Rmd or _404.md file to your project root and use code and/or Markdown syntax.

6.3 Metadata for sharing

Bookdown HTML books will provide HTML metadata for social sharing on platforms like Twitter, Facebook, and LinkedIn, using information you provide in the index.Rmd YAML. To setup, set the url for your book and the path to your cover-image file. Your book's title and description are also used.

This gitbook uses the same social sharing data across all chapters in your bookall links shared will look the same.

Specify your book's source repository on GitHub using the edit key under the configuration options in the _output.yml file, which allows users to suggest an edit by linking to a chapter's source file.

Read more about the features of this output format here:

https://pkgs.rstudio.com/bookdown/reference/gitbook.html

Or use:

?bookdown::gitbook

Footnotes and citations

7.1 Footnotes

Footnotes are put inside the square brackets after a caret ^[]. Like this one ¹.

7.2 Citations

Reference items in your bibliography file(s) using @key.

For example, we are using the **bookdown** package [Xie, 2023] (check out the last code chunk in index.Rmd to see how this citation key was added) in this sample book, which was built on top of R Markdown and **knitr** [Xie, 2015] (this citation was added manually in an external file book.bib). Note that the .bib files need to be listed in the index.Rmd with the YAML bibliography key.

The RStudio Visual Markdown Editor can also make it easier to insert citations: https://rstudio.github.io/visual-markdown-editing/#/citations

¹This is a footnote.

Bibliography

Yihui Xie. Dynamic Documents with R and knitr. Chapman and Hall/CRC, Boca Raton, Florida, 2nd edition, 2015. URL http://yihui.org/knitr/. ISBN 978-1498716963.

Yihui Xie. bookdown: Authoring Books and Technical Documents with R Markdown, 2023. URL https://github.com/rstudio/bookdown. R package version 0.37.