Juli Nagel | RG Psychology and Neurobiology of Sleep and Memory



#### Reproducible Research

Trifels Summer School, 27.09.2022





|          |           | Data         |               |
|----------|-----------|--------------|---------------|
|          |           | Same         | Different     |
| Analysis | Same      | Reproducible | Replicable    |
|          | Different | Robust       | Generalisable |

Definition: The Turing Way

#### Reproducibility vs. replicability

National Academies of Sciences Engineering (Chapter 3, p.4)

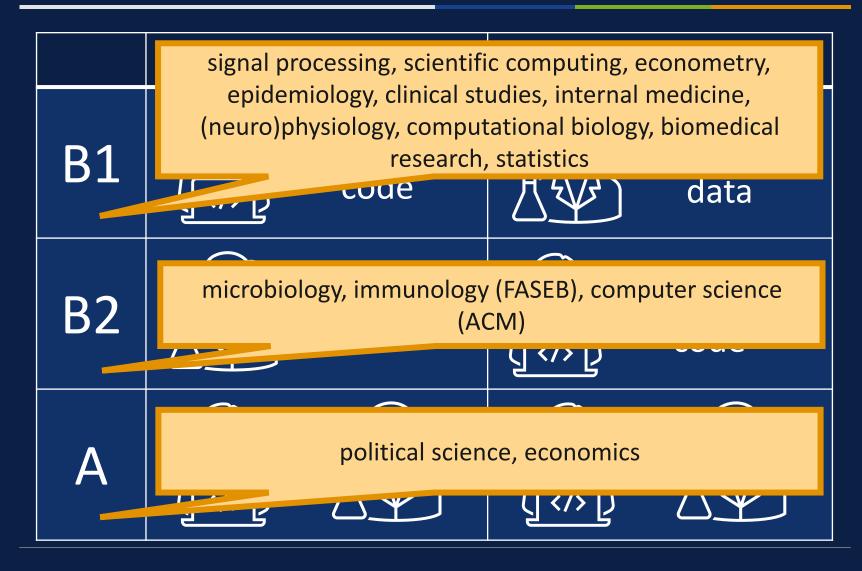


|    | reproducibility  | replicability    |
|----|------------------|------------------|
| B1 | same data + code | collect new data |
| B2 | collect new data | same data + code |
| A  |                  |                  |

#### Reproducibility vs. replicability

National Academies of Sciences Engineering (Chapter 3, p.4)





#### What is reproducibility?

#### National Academies of Sciences Engineering



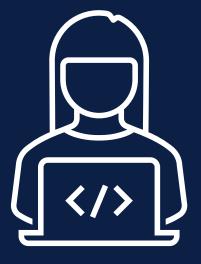
"Computational scientists generally use the term reproducibility to answer just the first question—that is, reproducible research is research that is capable of being checked because the data, code, and methods of analysis are available to other researchers. The term reproducibility can also be used in the context of the second question: research is reproducible if another researcher actually uses the available data and code and obtains the same results. The difference between the first and the second questions is one of action by another researcher; the first refers to the availability of the data, code, and methods of analysis, while the second refers to the act of recomputing the results using the available data, code, and methods of analysis."







Data and code are available



Someone actually uses them



# Same data, same analysis – why should it be hard to get the same results?!



#### Analysis of Open Data and Computational Reproducibility in Registered Reports in Psychology

#### **Abstract**

Ongoing technological developments have made it easier than ever before for scientists to share their data, materials, and analysis code. Sharing data and analysis code makes it easier for other researchers to reuse or check published research. However, these benefits will emerge only if researchers can reproduce the analyses reported in published articles and if data are annotated well enough so that it is clear what all variable and value labels mean. Because most researchers are not trained in computational reproducibility, it is important to evaluate current practices to identify those that can be improved. We examined data and code sharing for Registered Reports published in the psychological literature from 2014 to 2018 and attempted to independently computationally reproduce the main results in each article. Of the 62 articles that met our inclusion criteria, 41 had data available, and 37 had analysis scripts available. Both data and code for 36 of the articles were shared. We could run the scripts for 31 analyses, and we reproduced the main results for 21 articles. Although the percentage of articles for which both data and code were shared (36 out of 62, or 58%) and the percentage of articles for which main results could be computationally reproduced (21 out of 36, or 58%) were relatively high compared with the percentages found in other studies, there is clear room for improvement. We provide practical recommendations based on our observations and cite examples of good research practices in the studies whose main results we reproduced.

Obels et al., 2022

#### Reproducibility is hard



registered reports + code to the code to t

#### Abstract

Ongoing technological developments have made it easier than ever before for scienasts to share their data, materials, and analysis code. Sharing data and analysis code makes it easier for other researchers to reuse or check published research. However, these benefits will emerge only if researchers can reproduce the analyses reported in published articles and if data are annotated well enough so that it is clear what all variable and value labels mean. Because most researchers are not trained in computational reproduced article, it is important to evaluate current practices to identify those that can be improved. We examined data and code sharing for Registered reports published in the psychological literature from 20.4 to 2016 and attended to independently computationally reproduce the main results in each article. Of the 62 articles hat me our inclusion criteria, 41 had data available, and 37 had analysis scripts available. Both data and code for 3 to a the articles were shared. We could run the scripts for 31 analyses, and we reproduced the main results for 21 articles. Although the percentage of articles for which both data and code were shared (36 out of 62, or 58%) and the percentage of articles for which main results could be computationally reproduced (21 out of 36, or 58%) were relatively high compared with the percentages found in other studies, there is clear room for improvement. We provide practical recommendations based on our observations and cite examples of good research practices in the studies whose main results we reproduced.

#### Obels et al., 2022



Is Economics Research Replicable?
Sixty Published Papers from Thirteen Journals Say
"Usually Not"

Andrew C. Chang\* and Phillip Li<sup>†</sup>

September 4, 2015

Chang & Li (2015)



# But why?

#### Step 1: Access data and code

Chang & Li (2015)



39 data + code required
 -4
 -2 proprietary data
 After emailing the authors!

Chang & Li (2015)



For the papers for which we are able to obtain data and code replication files, we attempt to replicate the key results of the paper using only the instructions provided in the author readme files. If the readme files are insufficient or if the replication files are incomplete (or both) and the paper is subject to a replication policy, then we email the corresponding author (if no corresponding author, then the first author) for either clarification or to request the missing files. If we do not receive a response within a week, then we query the second author, and so on, until all authors on the paper had been contacted.<sup>11</sup>

Try to run code with instructions only first. If necessary, ask authors for help.

Chang & Li (2015)



| 39<br>data + code<br>required | 28<br>data + code<br>not required |                   |                             |
|-------------------------------|-----------------------------------|-------------------|-----------------------------|
| -4                            | -2                                | proprietary data  |                             |
| -6                            | -15                               | missing data/code | After emailing the authors! |
| -1                            | -1                                | missing software  |                             |

<u>Chang & Li (2015)</u>



One dimension where we are unable to follow the authors exactly is the software version they use. To execute the replications, we make use of the following software versionoperating system combinations: Dynare 4.3 and 4.4.2 (Windows), EViews 6 and 7 (Windows), EViews 8 (Linux), Gauss 9.0.2 (Linux), Fortran f90 (Linux), Matlab R2008a and R2012a and R2013a (Windows), Matlab R2010a and R2012a (Linux), OX 6.30 (Windows), Oxmetrics 6.30 (Windows), Stata 11.0 and 13.1 (Windows), Stata 13.0 (Windows and Linux), R 2.15.1 and 3.0.1 and 3.0.2 and 3.0.3 and 3.1.0 (Linux), and RATS 7.10 (Linux). When available in the readme, we attempt to run the software version-operating system combination specified by the authors. When the replication files fail to execute on a given software version-operating system combination, the author readme did not specify a particular software version-operating system combination, and it appeared that the data and code were complete, we email the authors to find out which combination they use.

#### Proprietary software



Configure your

IBM product

Subscription Term: 12 months auto-renewal

1 month

12 months

Plan options

Unit price: \$1,188.00 USD per authorized user

... prevents people who don't have access from running your code.

Enter the number of authorized users

Reset₽

+ \$1.188.00 USD

#### Proprietary software



| ← Back to product pricing | Subscription details |          |              |
|---------------------------|----------------------|----------|--------------|
|                           | Base                 | Standard | Professional |
| Statistics base           | ~                    | ~        | ~            |
| Data preparation          | ~                    | ✓        | ~            |
| Bootstrapping             | ~                    | ~        | ~            |
| Advanced statistics       |                      | ~        | ~            |
| Regression                |                      | ~        | ~            |
| Custom tables             |                      | ~        | ~            |
| Missing values            |                      |          | ~            |

#### Different versions = different results

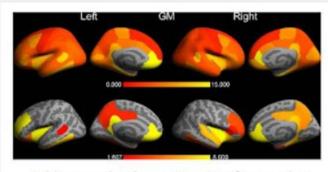


Thursday, 14 June 2012

#### Brains are Different on Macs

**Update** - A number of articles linking to this post are wrongly stating that FreeSurfer is medical software used to diagnose diseases or measure the size of brain tumors. It's not. It is purely for research purposes as the software license states, "The Software has been designed for research purposes only and has not been reviewed or approved by the Food and Drug Administration or by any other agency. CLINICAL APPLICATIONS ARE NEITHER RECOMMENDED NOR ADVISED."

Last month, neuroscientists were warned about potential biases in SPM8, a popular software tool for analysis of fMRI data.



This your brain on FreeSurfer version 4.3.1 vs version 5.0.0

http://neuroskeptic.blogspot.com/2012/06/brains-are-different-on-macs.html

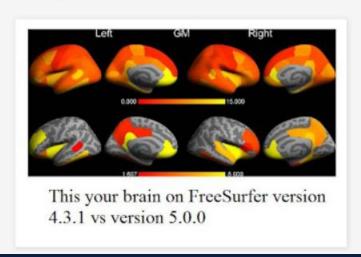
#### Different versions = different results



Thursday, 14 June 2012

#### Brains are Different on Macs

How much of a difference it made varied by brain location. The differences were 5-15% with version changes. For Mac vs PC and Mac OS updates it was less bad, 2-5% mostly, but in the worst regions - the parahippocampal and entorhinal cortex - it was still almost 15% different. Why those regions are so variable is unclear.



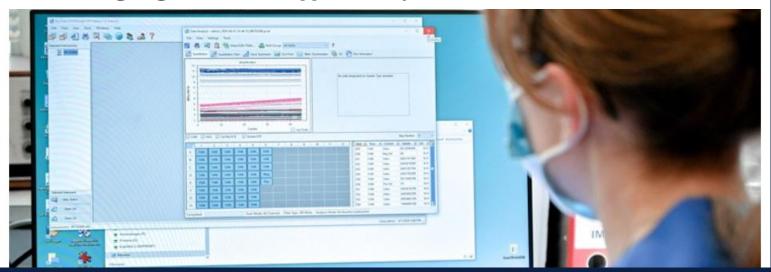
http://neuroskeptic.blogspot.com/2012/06/brains-are-different-on-macs.html



NEWS | 13 August 2021 | Correction 25 August 2021

# Autocorrect errors in Excel still creating genomics headache

Despite geneticists being warned about spreadsheet problems, 30% of published papers contain mangled gene names in supplementary data.



https://www.nature.com/articles/d41586-021-02211-4

#### Software can be tricky



#### A GROWING PROBLEM

A 2016 analysis found that 20% of papers featuring gene names had errors created by spreadsheet autocorrect functions, but a bigger survey now finds the proportion is up to 30%. Since 2014, the number of papers with errors has increased significantly.



Chang & Li (2015)



| 39<br>data + code<br>required | 28<br>data + code<br>not required |  |
|-------------------------------|-----------------------------------|--|
| -4                            | -2                                | proprietary data                               |
| -6                            | -15                               | missing data/code  After emailing the authors! |
| -1                            | -1                                | missing software                               |
| -5                            | -4                                | incorrect data/code                            |

#### Step 3: Same results?

Chang & Li (2015)



#### A (deliberately) lenient definition of "same".

We define a successful replication as when the authors or journal provide data and code files that allow us to qualitatively reproduce the key results of the paper. For example, if the paper estimates a fiscal multiplier for GDP of 2.0, then any multiplier greater than 1.0 would produce the same qualitative result (i.e., there is a positive multiplier effect and

Unfortunately, the authors don't distinguish between "different results" and "code execution failed".

#### Final count

#### Chang & Li (2015)



39 28 data + code data + code required not required -2 proprietary data -4 After emailing missing data/code -15 -6 the authors! missing software -1 -1 incorrect data/code -5 -4 23 (58.97%) 6 (21.43%)

reproduced

reproduced



#### "But it works on my machine."

Assumption: Most researchers publish code that works – for them.

(Or at least it did at some point).



# Solutions?



- Here are a few things that can improve reproducibility (by no means a complete list).
- They may be more or less relevant for you, depending on your field.
- Depending on your background, some tools might take a while to master.
- Some things cost quite some time, at least initially.
- You don't have to implement everything!



# Make data and code available



- Make sure you have permission to share the data.
- Beware: Even anonymous data might be used to identify people.
- Especially tricky: genetical data, imaging (e.g. brain) data, medical data, small (rare) samples
- That's a whole different topic we won't talk about here!

#### Where to put things?!



- Sometimes, journals allow/want you to upload data and code.
- Sometimes, you find data/code on personal/institute websites.
- Better: Data repositories
  - Offers a DOI?
  - Independent/safe?
  - If relevant storage in Germany/the EU?
- E.g.: OSF, ZPID (psychology)







Will help others to work with your data and code – including your future self.



#### How were the data collected?

 Which task, how were the data recorded, which sample, where, by whom, part of which paper ... ?

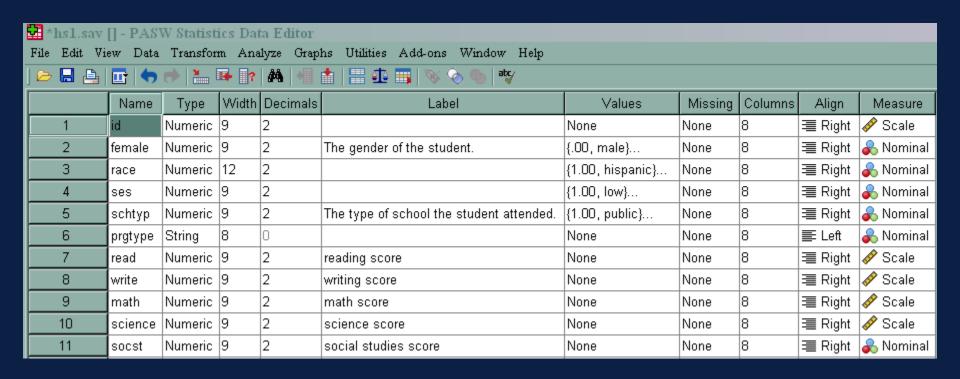
#### Codebook

- Which variables?
- What are valid values? (e.g. age in years; "How happy are you" on a scale from 1 ("not at all") to 10 ("very")
- How are missing values coded?

# DOCUMENTATION Data



#### Good: In a table - human and machine readable



https://stats.oarc.ucla.edu/spss/faq/how-can-spss-help-me-document-my-data/

### DOCUMENTATION Data



- Best use a "lightweight" file format (.csv or .txt)
- Here is a very thorough guide: <u>Horstmann et</u> al. (2020)

Table 2. Example on how to provide information about response options of Rating Scale Items

| Response list        | Coded response | Label                     | Translation       |
|----------------------|----------------|---------------------------|-------------------|
| response_list_bfi    | 1              | Stimme überhaupt nicht zu | Disagree strongly |
|                      | 2              | Stimme eher nicht zu      | Disagree a little |
|                      | 3              | Teils, teils              | Neutral           |
|                      | 4              | Stimme eher zu            | Agree a little    |
|                      | 5              | Stimme voll und ganz zu   | Agree strongly    |
| response_list_gender | 1              | Männlich                  | Male              |
|                      | 2              | Weiblich                  | Female            |
|                      | 3              | Divers                    | Non-binary        |
|                      | 4              | Keine Angabe              | Prefer not to say |

Note. response\_list = the name of the list, which can then be referenced in each item that makes use of this scale; coded response = the numerical value in the data frame that corresponds to the "label"; translation = an English translation of the label.



- Descriptive column names.
  - Bad: item1, column12, sumscore, test
  - Good: bdi1, bdi\_sumscore, age\_category
  - Don't use spaces or "weird" characters
- Clear, consistent labels, e.g.
  - E.g. 0 = no, 1 = yes for entire data set
- Maybe: Provide a raw and a "clean" version of your data set



# Making data meaningful: guidelines for good quality open data

Andrea S. Towse, David A. Ellis & John N. Towse

To cite this article: Andrea S. Towse, David A. Ellis & John N. Towse (2021) Making data meaningful: guidelines for good quality open data, The Journal of Social Psychology, 161:4, 395-402, DOI: 10.1080/00224545.2021.1938811

Towse et al. (2021)

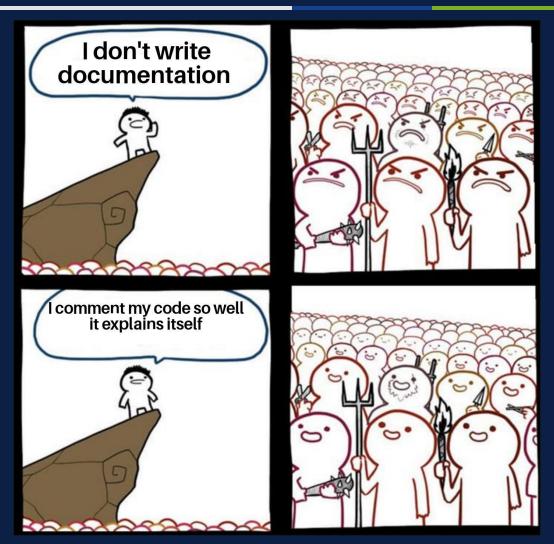
### DOCUMENTATION Code



- Report which versions you used (operating system, software and packages!)
- Provide a README file how the code should be handled, e.g. in which order the files need to be run.
- Write comments in your code to explain what's happening

#### "Good code is self-documenting"





**Reddit** 



# "GOOD CODE DOCUMENTS ITSELF" AND OTHER HILARIOUS JOKES YOU SHOULDN'T TELL YOURSELF

by: Sven Gregori

156 Comments

f 🔰 Y 🗳 🕯

March 5, 2019

<u>article link</u>

### DOCUMENTATION Code





Looking at some old code and was initially puzzled by a variable named 'feet'

I have now worked out that this was at one point called 'legend\_handles', which then became 'leg\_hands', which then became 'feet' Use descriptive variable names, e.g. min\_age, ttest\_rt\_gender, alpha\_level

sometimes I truly hate my past self

<u> Twitter</u>

- Write comments (balance between helpful explanations and "wall of text"
- Organise your code: Divide different parts into different scripts, draw repetitive elements into functions, use headings etc.

### DOCUMENTATION Code



KEEP IN MIND THAT I'M
SELF-TAUGHT, SO MY CODE
MAY BE A LITTLE MESSY.

LEMME SEEI'M SURE
IT'S FINE.

...WOW.
THIS IS LIKE BEING IN
A HOUSE BUILT BY A
CHILD USING NOTHING
BUT A HATCHET AND A
PICTURE OF A HOUSE.

IT'S LIKE A SALAD RECIPE WRITTEN BY A CORPORATE LAWYER USING A PHONE AUTOCORRECT THAT ONLY KNEW EXCEL FORMULAS.



IT'S LIKE SOMEONE TOOK A
TRANSCRIPT OF A COUPLE
ARGUING AT IKEA AND MADE
RANDOM EDITS UNTIL IT
COMPILED WITHOUT ERRORS.

OKAY, I'LL READ
A STYLE GUIDE.

Explain xkcd

Familiarise yourself with style guides



- SPSS syntax/Excel functions is fine!
- Reduce the amount of manual interaction with the data.
- But maybe you'll enjoy coding?



"But it works on my machine."

Be mindful of the things that are unique to your computer.

#### Absolute paths



data < read.csv("C:/Users/julit/Documents/r\_stuff/schedule\_drm\_batches/configs/drm\_config\_2022-11-12-14-37.csv")</pre>

Only exists on my computer!

Find the data in the folder "config" that lies in the same folder as my analysis script.

2 3 4

data <- read.csv("./configs/drm\_config\_2022-11-12-14-37.csv")</pre>

#### How to increase reproducibility



If possible, switch to free software.

#### How to increase reproducibility



Test you analysis on a colleague's computer.



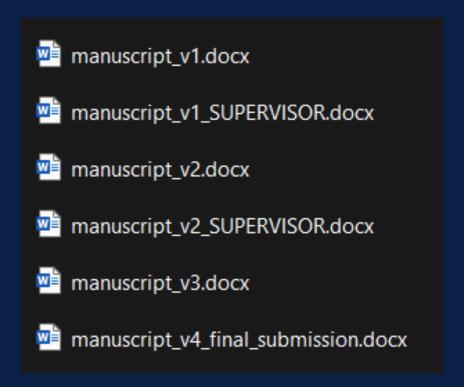
## More advanced stuff



## Version Control



- Keep track of what changed in your code.
- If necessary, go back to a previous version.







Get git here

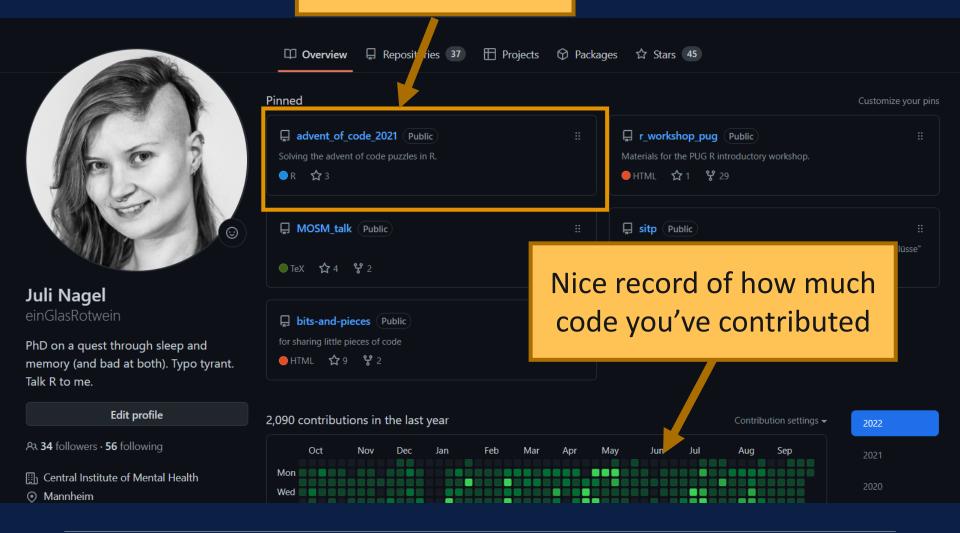


visit GitHub

#### Version Control GitHub

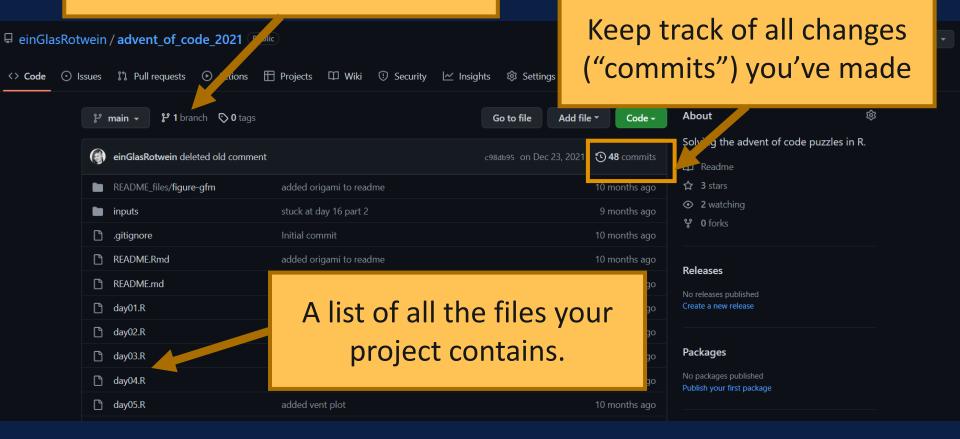
## Projects organised in repositories





## Different branches for "parallel versions" of your code





**Version Control** Zentralinstitut für **GitHub** Seelische Gesundheit ID of your commit – you can always go back or refer to a previous commit! ິ⊁ main ▼ Commits on Dec 23, 2021 deleted old comment c98db95 einGlasRotwein committed on Dec 23, 2021 forgot to push functions for day 16 dd88d50 einGlasRotwein committed on Dec 23, 2021 Description of what you've completed day 17 a6ee0ac <> einGlasRotwein committed on Dec 23, 2021 changed and when. Commits on Dec 22, 2021 stuck at day 16 part 2 ιÖ fc68df1 <> einGlasRotwein committed on Dec 22, 2021 solved part 1 day 17 ſĊ 6fdae54 einGlasRotwein committed on Dec 22, 2021

Commits on Dec 17, 2021

completed day 15

einGlasRotwein committed on Dec 17, 2021

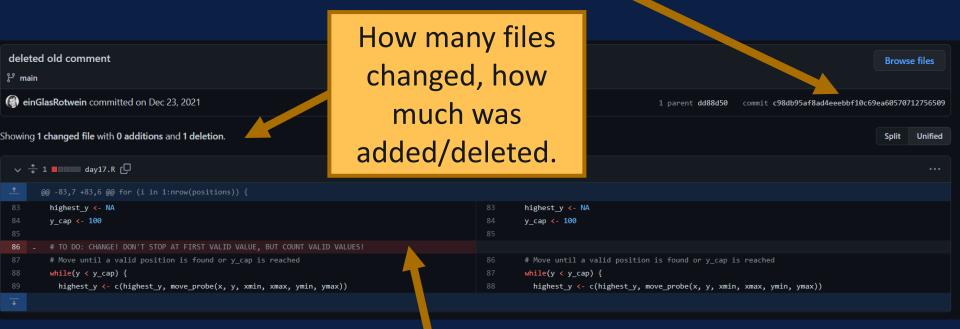
a0840d3

СD

#### Version Control GitHub



ID of your commit – you can always go back or refer to a previous commit!



Highlights which lines of code have been added/deleted. (Here: only one line deleted.)

## Version Control - Collaboration GitHub

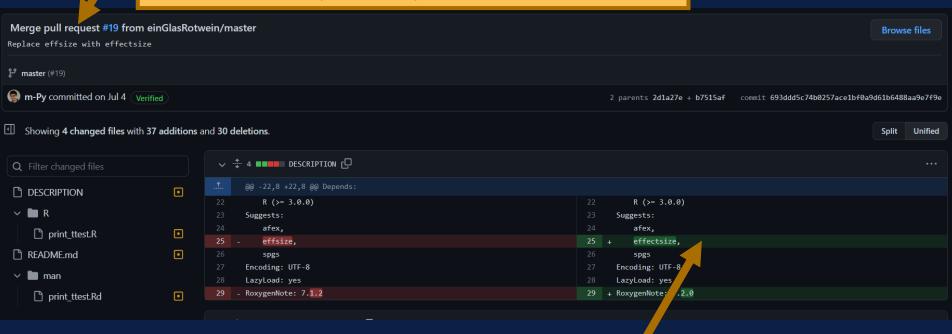




Versic GitHu

Work on the code in your own repository/branch and then ask for your changes to be implemented in the main repository/branch.

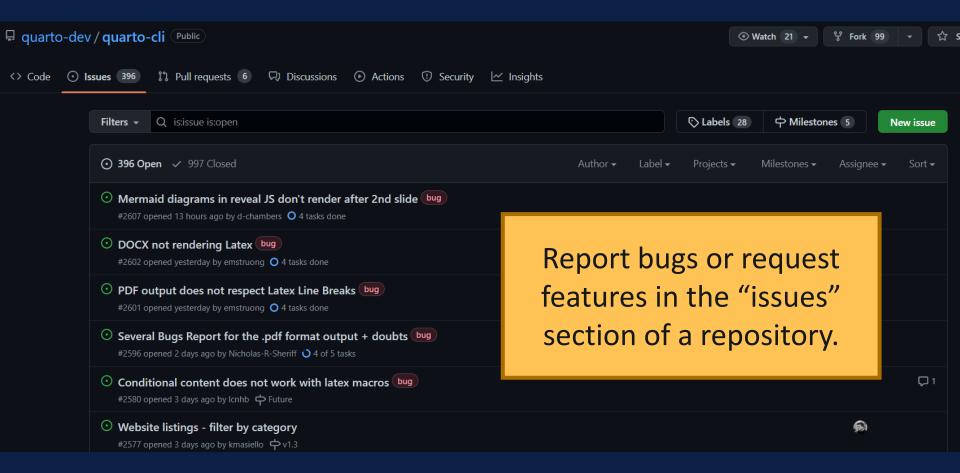




Highlights what has been changed/deleted in your version.

## Version Control - Collaboration GitHub







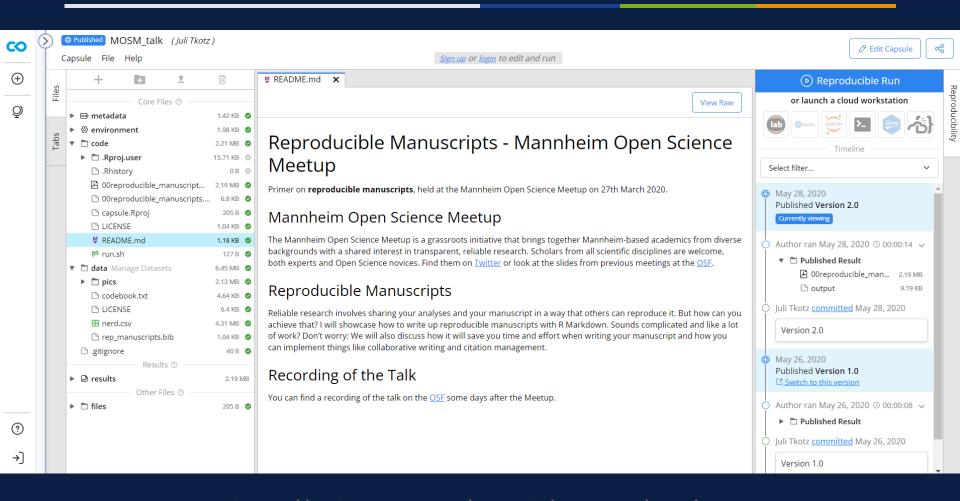
### Containers



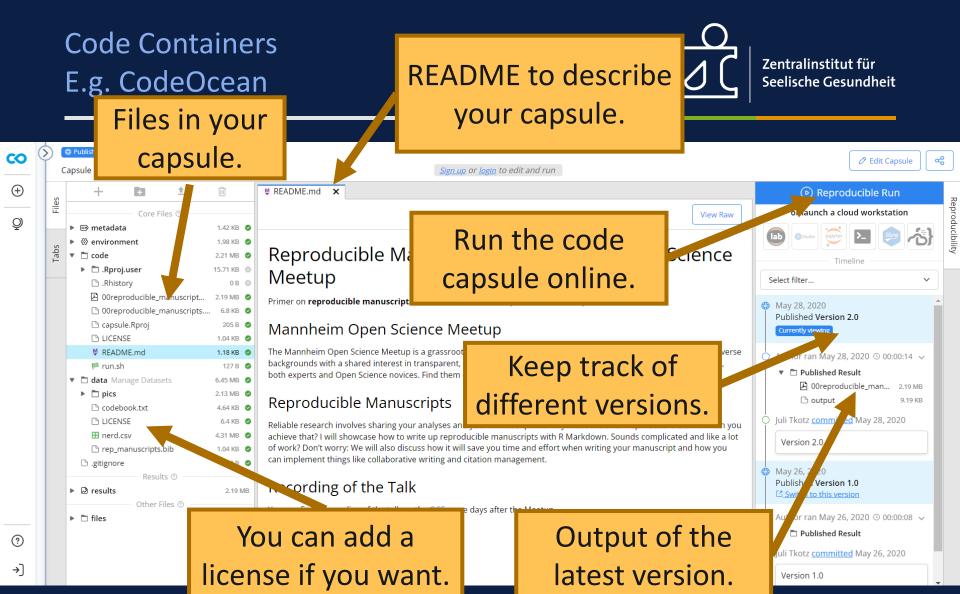
@agenlaku from unsplash

## Code Containers E.g. CodeOcean





https://codeocean.com/capsule/0399419/tree/v2



https://codeocean.com/capsule/0399419/tree/v2

## Code Containers E.g. CodeOcean



#### **Environment**

#### R (3.6.0 (deprecated))

R is a language and environment for statistical computing and graphics Ubuntu 18.04 R Software used

Packages for data

#### Additional Packages ③

Customize the selected environment with any other packages you need. You can also use these package managers to install other package managers, such as for different languages. Packages will be install run. Learn more.

analysis and **Package Managers Packages** apt-get ﷺ ∨ creating the slides lmodern 2.004.5-3 pandoc 1.19.2.4~dfsg-1build4 pandoc-citer rstudio-server 1.2.5033 wget 1.19.4-1ubuntu2.2 of my presentation Bioconductor < ⋄ ∨ + Add R (CRAN) 🛞 🗸 binb 0.0.5 dplyr 0.8.5 ggplot2 3.3.0 rmarkdown 2.1 effsize 0.8.0 knitr 1.28 tinytex 0.23 + Add R (GitHub) ㈜ ∨ m-Py/prmisc b010558ead60afb76216cd529ce877c6720e68bd + Add

## Code Containers e.g. CodeOcean



- Runs entirely online.
- A bit clunky to use.
- You need to pay for more computational time.
- Probably not suitable if you thoroughly want to look at the code.

## Code Containers under the hood: Docker



```
    README.md

                                                      🗙 🛮 🕾 Environment 🗶
                                                                             Dockerfile
                                                                                            ×
                                                # hash:sha256:428c89110fb4867647831adfd0524acd8893c7725afb0f18f2eb6e475622794f
              Core Files ①
                                               FROM registry.codeocean.com/codeocean/r-base:3.6.0-ubuntu18.04
▶ ■ metadata
                              1.42 KB
                                           3
                                           4
                                                ARG DEBIAN FRONTEND=noninteractive
▼ 

environment
                              1.98 KB
                                           5
    Dockerfile
                              1.44 KB
                                                RUN apt-get update \
    postInstall
                               549 B
                                                   && apt-get install -y --no-install-recommends software-properties-common \
  code
                              2.21 MB @
                                                    && apt-key adv --keyserver hkp://keyserver.ubuntu.com:80 --recv-keys \
  Rproj.user
                              15.71 KB 🔞
                                                        0xAD2323F17326AE31401037733E05EBFF05441C52 \
    .Rhistory
                                 0 B
                                                   && add-apt-repository -y 'deb http://deb.codeocean.com/rstudio-server-bionic/ ubuntu
                                          10
                                               main' \

    00reproducible_manuscript...

                              2.19 MB
                                                   && apt-get purge -y --autoremove software-properties-common \
                                          11
    00reproducible_manuscripts....
                                                   && apt-get update \
                                          12
    apsule.Rproj
                               205 B
                                                    && apt-get install -y --no-install-recommends \
                                          13
    □ LICENSE
                              1.04 KB
                                                        lmodern=2.004.5-3 \
                                          14

    README.md

                              1.18 KB
                                          15
                                                        pandoc=1.19.2.4~dfsg-1build4 \
    网 run.sh
                                127 B
                                                        pandoc-citeproc=0.10.5.1-1build4 \
                                          16
 data Manage Datasets
                                                        rstudio-server=1.2.5033 \
                              6.45 MB
                                          17
                                          18
                                                        wget=1.19.4-1ubuntu2.2 \
  ▶ ☐ pics
                              2.13 MB
                                                   && rm -rf /var/lib/apt/lists/*
                                          19

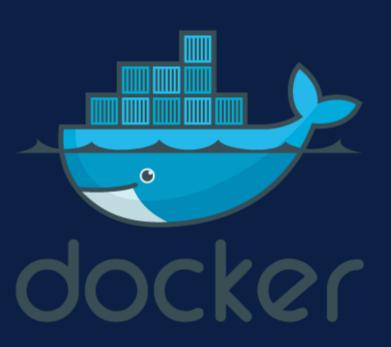
☐ codebook.txt

                               4.64 KB
                                          20
                                               RUN Rscript -e 'remotes::install version("binb", "0.0.5")' \
                                          21
     A Docker file
                                                    && Rscript -e 'remotes::install version("dplyr", "0.8.5")' \
                                          22
                                                   && Rscript -e 'remotes::install version("effsize", "0.8.0")' \
                                          23
                                                   && Rscript -e 'remotes::install version("ggplot2", "3.3.0")' \
   might look a bit
                                          24
                                                   && Rscript -e 'remotes::install version("knitr", "1.28")' \
                                          25
                                                   && Rscript -e 'remotes::install version("rmarkdown", "2.1")' \
                                          26
   intimidating at
                                                    && Rscript -e 'remotes::install version("tinytex", "0.23")'
                                          27
                                          28
              first.
                                               RUN Rscript -e 'remotes::install github( \
                                          29
                                                        "m-Py/prmisc", \
                                          30
                                          31
                                                        ref = "b010558ead60afb76216cd529ce877c6720e68bd")'
```

## Code Containers Docker



- Widely used for containerisation.
- Let's you run different
   operating systems with
   different software versions on
   your computer.
- Different pre-configured "images" are available.
- https://www.docker.com/
- Tutorial for beginners for R
- Learning curve might be steep!



#### More lightweight e.g. renv



- Local environment for R
- Stores the packages you used in your project (the versions you've used)

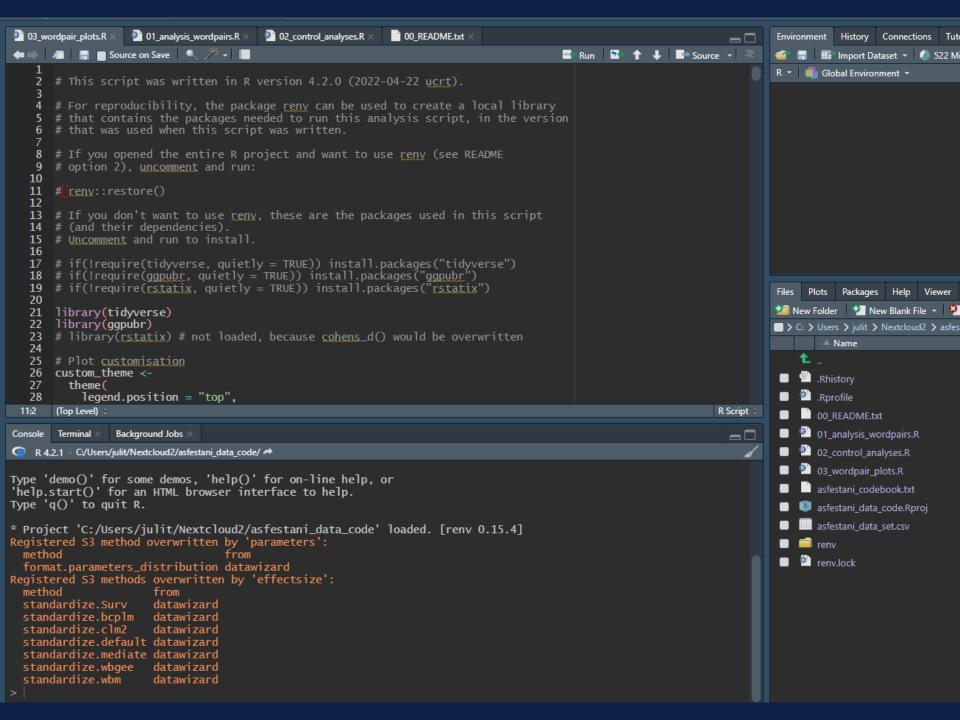
https://rstudio.github.io/renv/articles/renv.html

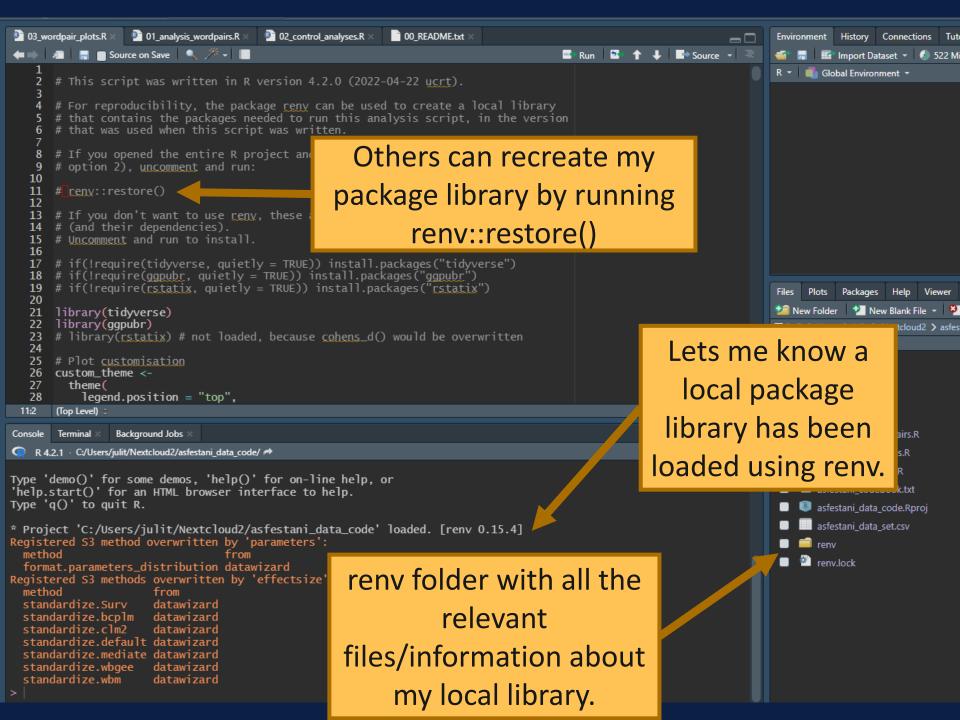
Reference Articles ▼ Changelog Get started renv 0.15.5 Introduction to renv **Kevin Ushey** 

2022-07-07

Source: vignettes/renv.Rmd









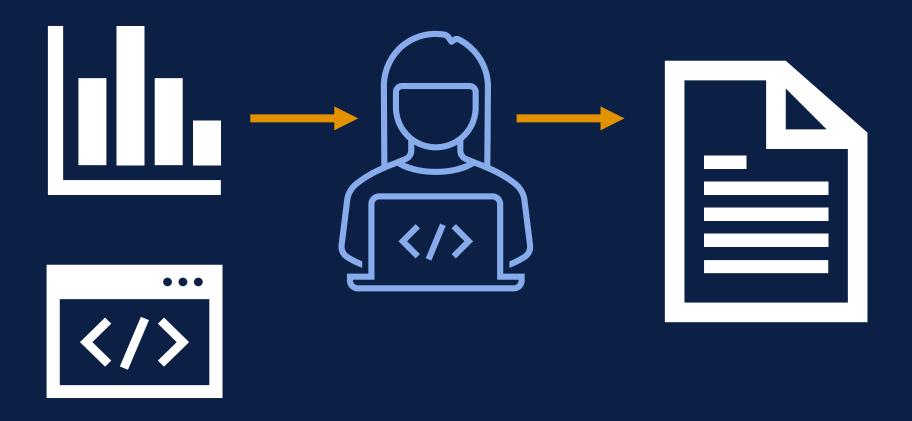
- Problem: Steep learning curve
- Most solutions put a least some burden on the recipient of your code



## Reproducible manuscripts

#### Traditional manuscripts





#### Reproducible manuscript





### Why reproducible manuscripts?

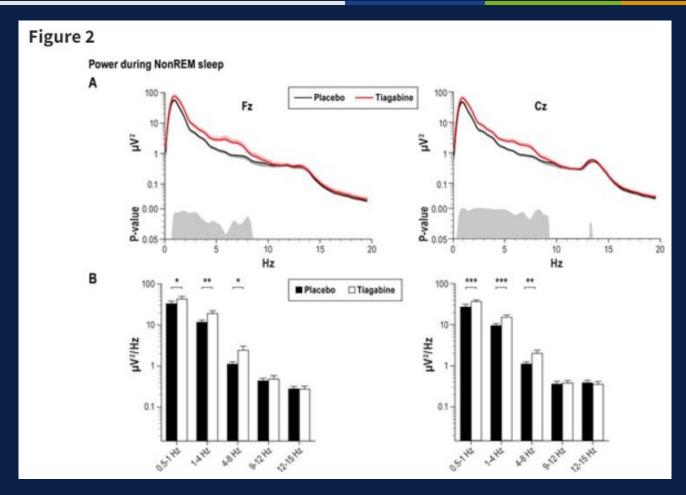


For the sequence finger tapping task, the overnight gain expressed by the difference of correctly tapped sequences at recall minus performance at learning was significantly reduced by tiagabine (tiagabine: 2.50 [0.5] Placebo: 5.03 [1.17],  $F_{1,11}$  = 5.58,  $P \le 0.05$ , Figure 1C). At learning, the number of correctly tapped sequences did not differ significantly between the treatment conditions (tiagabine: 18.19 [1.56], placebo: 16.83 [1.13],  $t_{11} = -1.54$ , P = 0.15). Also, tapping on the control sequence did not reveal any difference between the tiagabine and placebo conditions  $(t_{11} = 0.47)$ and P = 0.65). Error rates were variable, and there was a trend toward error rates reducing more across sleep in the placebo condition, i.e., participants made fewer errors in the placebo condition (mean reduction in error rate tiagabine: -1.01% [1.25], placebo: -4.47% [3.25],  $t_{11}$  = 1.91, P = 0.08).

Feld et al. (2013), *Sleep* 

### Why reproducible manuscripts?





Feld et al. (2013), Sleep

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Table 1 Sleep parameters and control measures

|                   | Minutes        |                |     |
|-------------------|----------------|----------------|-----|
| Measure           | Placebo        | Tiagabine      | *** |
| Wakefulness       | 20.41 (4.98)   | 14.90 (2.53)   | ns  |
| Stage 1           | 37.50 (4.86)   | 19.31 (5.41)   | **  |
| Stage 2           | 240.05 (11.44) | 236.68 (16.89) | ns  |
| SWS               | 63.68 (5.91)   | 98.95 (11.91)  | **  |
| REM               | 77.55 (4.44)   | 55.86 (9.62)   | *   |
| Movement time     | 4.18 (0.84)    | 3.27 (0.54)    | ns  |
| Total sleep time  | 443.45 (12.57) | 429.00 (26.50) | ns  |
| Sleep latency     | 24.91 (12.46)  | 24.09 (4.94)   | ns  |
| SWS latency       | 23.82 (4.27)   | 16.68 (2.34)   | †   |
| REM sleep latency | 115.50 (10.23) | 136.27 (35.33) | ns  |

Feld et al. (2013), Sleep



```
1* ---
2 title: "Quarto Example"
3 format: html
4 editor: visual
5*
6
7 |
8
```

### **Quarto Example**

#### This is a headline

Here is some example text. Let's write some more stuff. This is another example.

#### Here comes another headline

And here is some additional text.



```
16
17 * ## Stuff about flowers
18
19 The iris species "Setosa" has rather small petals (width *M =* `r
    round(mean(iris$Petal.Width[iris$Species == "setosa"]), 2)`, *SD =* `r
    round(sd(iris$Petal.Width[iris$Species == "setosa"]), 2)`), while those of the species
    "Versicolor" are larger (width *M =* `r round(mean(iris$Petal.Width[iris$Species ==
    "versicolor"]), 2)`, *SD =* `r round(sd(iris$Retal.Width[iris$Species == "versicolor"]), 2)`).
20
```

#### Stuff about flowers

The iris species "Setosa" has rather small petals (width M = 0.25, SD = 0.11), while those of the species "Versicolor" are larger (width M = 1.33, SD = 0.2).

```
7ontraline
```

t-test from the R
package prmisc

```
iris_ttest <-
    t.test(
    iris$Petal.Length[iris$Species == "setosa"],
    iris$Petal.Length[iris$Species == "versicolor"]
)

iris_cohens_d <-
    cohens_d(
    iris$Petal.Length[iris$Species == "setosa"],
    iris$Petal.Length[iris$Species == "versicolor"]
)</pre>
```

That's a pretty big difference `r print\_ttest(iris\_ttest, iris\_cohens\_d)`.

### Stuff about flowers

The iris species "Setosa" has rather small petals (width M = 0.25, SD = 0.11), while those of the species "Versicolor" are larger (width M = 1.33, SD = 0.2).

That's a pretty big difference t(62.14) = -39.49, p < .001, d = -7.90.



```
### A table about flowers

[r]
iris %>%
group_by(Species) %>%
summarise(
across(
Sepal.Length:Petal.Width,
~pasteO(force_decimals(mean(.), 2), " (", force_decimals(mean(.), 2), ")")
) %>%
kable() %>%
kable() %>%
kable_styling("striped")

Styling tables with

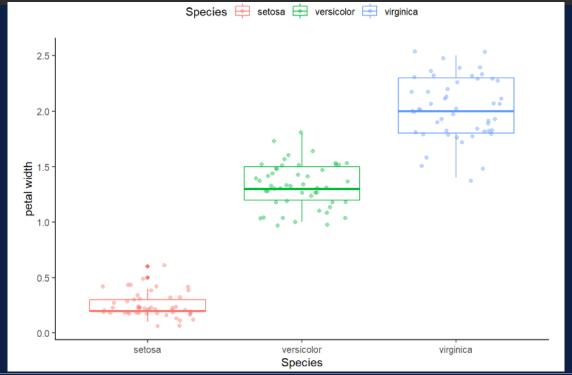
KableExtra
```

#### A table about flowers

| Species    | Sepal.Length | Sepal.Width | Petal.Length | Petal.Width |
|------------|--------------|-------------|--------------|-------------|
| setosa     | 5.01 (5.01)  | 3.43 (3.43) | 1.46 (1.46)  | 0.25 (0.25) |
| versicolor | 5.94 (5.94)  | 2.77 (2.77) | 4.26 (4.26)  | 1.33 (1.33) |
| virginica  | 6.59 (6.59)  | 2.97 (2.97) | 5.55 (5.55)  | 2.03 (2.03) |
|            |              |             |              |             |



```
iris %>%
  ggplot(aes(x = Species, y = Petal.Width, colour = Species)) +
  geom_boxplot() +
  geom_point(position = position_jitter(width = .3), alpha = .4) +
  theme_classic() +
  labs(y = "petal width") +
  theme(legend.position = "top")
```



### **Quarto Example**

### This is a headline

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### Here comes another headline

And here is some additional text.

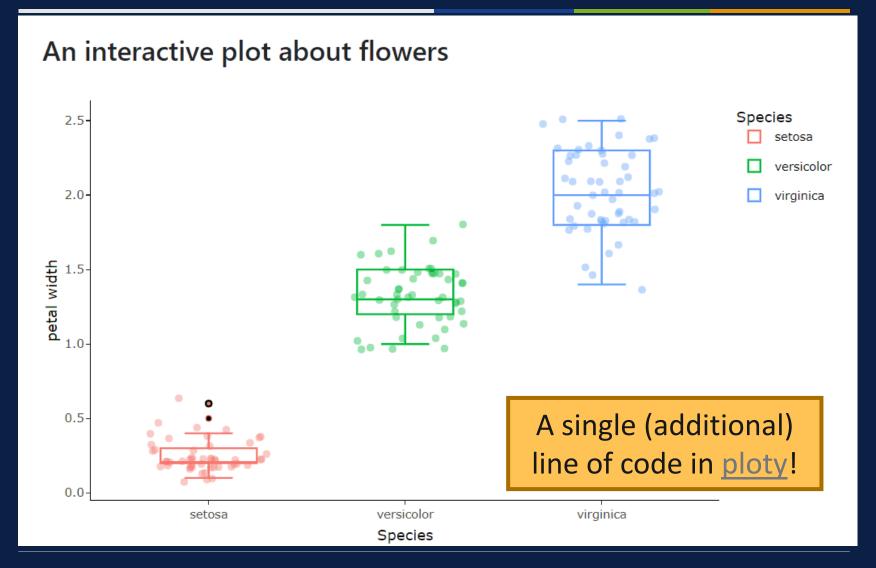
### Stuff about flowers

The iris species "Setosa" has rather small petals (width M = 0.25, SD = 0.11), while those of the species "Versicolor" are larger (width M = 1.33, SD = 0.2).

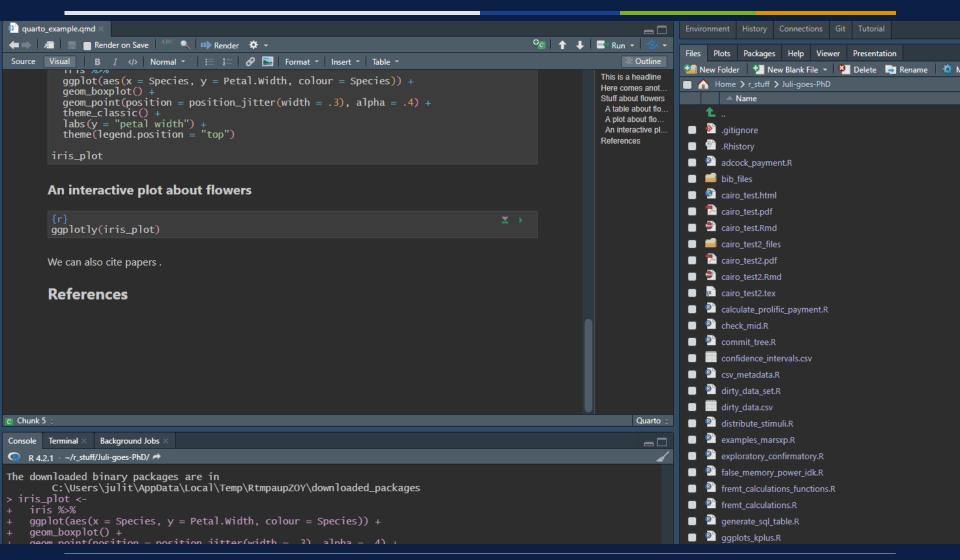
That's a pretty big difference t(62.14) = -39.49, p < .001, d = -7.90.

#### A table about flowers









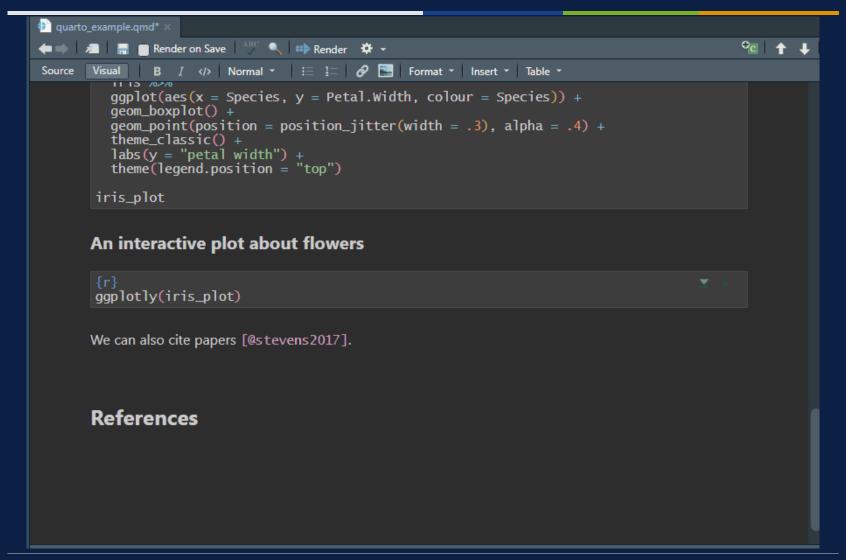


We can also cite papers (Stevens 2017).

#### References

Stevens, Jeffrey R. 2017. "Replicability and Reproducibility in Comparative Psychology." *Frontiers in Psychology* 8 (May). <a href="https://doi.org/10.3389/fpsyg.2017.00862">https://doi.org/10.3389/fpsyg.2017.00862</a>.





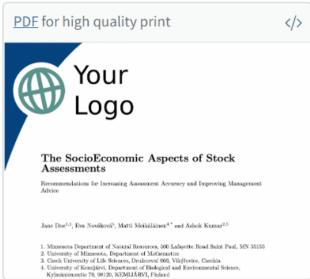
### Not just for R!



### **Articles & Reports**

Write a single markdown file and create output in a variety of formats.





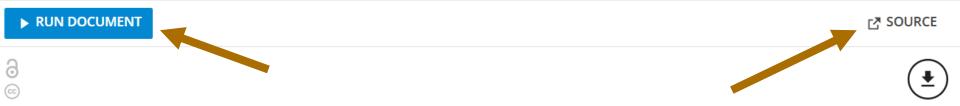


- Quarto supports multiple languages, e.g. Python, R, Julia, and Observable.
- Loads of different output formats with the same code (html, pdf, presentations etc.).

#### The future?



This is an executable code view. See the original article.



# Replication Study: Transcriptional amplification in tumor cells with elevated c-Myc









L Michelle Lewis, Meredith C Edwards, Zachary R Meyers, C Conover Talbot, Haiping Hao, David Blum, Reproducibility Project: Cancer Biology, Elizabeth Iorns, Rachel Tsui, Alexandria Denis, Nicole Perfito, Timothy M Errington

University of Georgia, Bioexpression and Fermentation Facility, Georgia, United States; Johns Hopkins University, Deep Sequencing and Microarray Core Facility, Maryland, United States; Science Exchange, Palo Alto, United States; Center for Open Science, Charlottesville, United States

Jan 9, 2018

#### The future?



Induction of c-Myc in P493-6 cells and impact on total RNA levels.

P493-6 cells were grown in the presence of tetracycline (Tet) for 72 hr and switched into Tet-free growth medium to induce c-Myc expression. Cells were cultured in two separate lots of serum. **(B)** Quantification of total RNA levels (ng of total RNA per 1,000 cells) for cells at 0, 1, and 24 hr after release from Tet. Means reported and error bars represent s.e.m. from  $\bigcirc$  3 independent biological repeats. For serum lot one, one-way ANOVA on total RNA levels of all groups;  $P(\bigcirc$  2 independent biological repeats. For serum lot one, one-way ANOVA on total RNA levels of all groups;  $P(\bigcirc$  2 independent biological repeats. For serum lot one, one-way ANOVA on total RNA levels of all groups;  $P(\bigcirc$  2 independent biological repeats. For serum lot one, one-way ANOVA on total RNA levels of all groups;  $P(\bigcirc$  6 independent biological repeats. For serum lot one, one-way ANOVA on total RNA levels of all groups;  $P(\bigcirc$  6 independent biological repeats. For serum lot one, one-way ANOVA on total RNA levels of all groups;  $P(\bigcirc$  6 independent biological repeats. For serum lot one, one-way ANOVA on total RNA levels of all groups;  $P(\bigcirc$  6 independent biological repeats. For serum lot one, one-way ANOVA on total RNA levels of all groups;  $P(\bigcirc$  6 independent biological repeats. For serum lot one, one-way ANOVA on total RNA levels of all groups;  $P(\bigcirc$  6 independent biological repeats. For serum lot one, one-way ANOVA on total RNA levels of all groups;  $P(\bigcirc$  6 independent biological repeats. For serum lot one, one-way ANOVA on total RNA levels of all groups;  $P(\bigcirc$  6 independent biological repeats. For serum lot one, one-way ANOVA on total RNA levels of all groups;  $P(\bigcirc$  6 independent biological repeats. For serum lot one, one-way ANOVA on total RNA levels of all groups;  $P(\bigcirc$  6 independent biological repeats. For serum lot one, one-way ANOVA on total RNA levels of all groups;  $P(\bigcirc$  6 independent biological repeats. For serum lot one, one-way ANOVA on total RNA levels of all groups;  $P(\bigcirc$  6 independent biological repeats. For serum lot o

#### Total RNA levels following c-Myc overexpression

We sought to independently replicate whether increased levels of c-Myc resulted in increased absolute levels of RNA. This experiment is similar to what was reported in Figure 3F of (Lin et al., 2012) and used the same extraction method for total RNA quantification.

### Template for papers



- How to use papaja: An Example Manuscript Including Basic Instructions
- Frederik Aust<sup>1</sup>
- <sup>1</sup> University of Cologne

E.g. "papaja: Prepare APA Journal Articles with R Markdown"



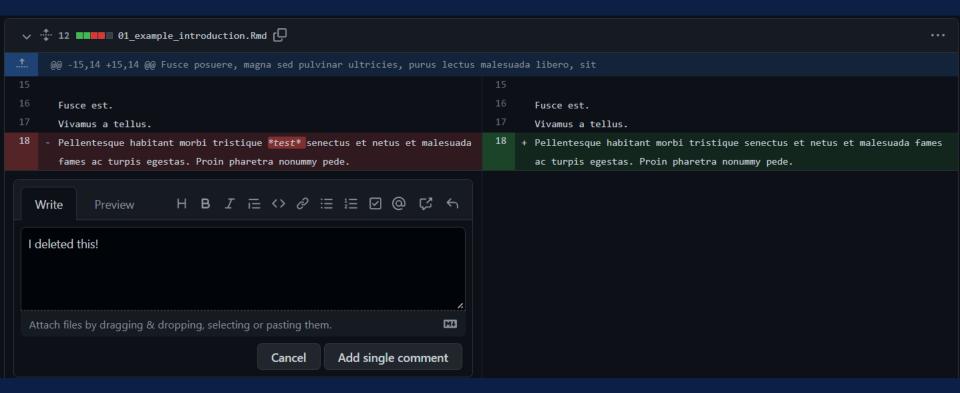
### HOWEVER ...



 Especially when rendering PDFs (likely using a Latex engine), you run into all sort of error messages that are sometimes very frustrating to debug.

### Collaborative writing





There is no real equivalent of the "track changes" in Word that many people use. We use GitHub as a substitute, but that requires that all people involved know how to use reproducible manuscripts and GitHub ...



## Downsides?



# Discussion: Do we need reproducibility?

(Or rather: Is it worth the effort?)

### Thank you. Stay reproducible.

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