## Reproducible analysis workflows

A short introduction into reproducible analysis tools: Rmarkdown, Github and others



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## Why do we need reproducible data analysis?

"Reproducibility is the ability to obtain identical results from the same statistical analysis and the same data"

= long-term and cross-platform reproducibility of data analyses

- Peikert and Brandmeier (2021)

Reproducibility ≠ Replicability

(same analysis **new data**)

# Goals of reproducible workflows

- 1. Reported results are consistent with the actual results
- **2.** Computational reproducibility (= hardware and software change over time)
- **3.** Version control (= keep track of any changes at any time)

# Four essential tools for reproducible workflows

- **1.** Dynamic reports  $\rightarrow$  **R Markdown**
- **2.** Version control  $\rightarrow$  **Git & Github**  $\square$
- 3. Dependency management  $\rightarrow$  Make
- **4.** Containerization  $\rightarrow$  **Docker**  $\clubsuit$

## Highly versatile dynamic documents with R Markdown



https://rmarkdown.rstudio.com/authoring\_quick\_tour.html

## Happy knitting!

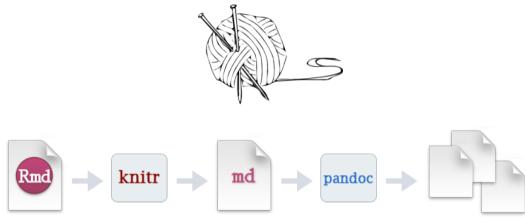


Figure 1: R Markdown under the hood

https://rmarkdown.rstudio.com/authoring\_quick\_tour.html

## Git & Github

#### **♦** Git

- "Distributed version control system"
- Track and document changes ("commits")
- ► Retrieve older versions of code
- ► Enables collaboration on any kind of programming projects (scalable!)

#### G Github

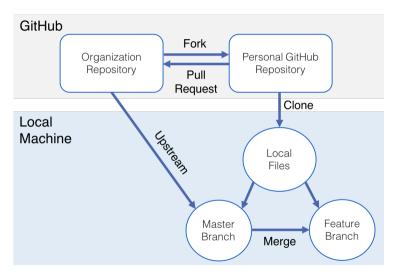
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#### Github

- Git repository hosting service
- Collaboration:
  - Many features for team/project management (scalable!)
  - ► Report bugs/issues, get help
  - Contribute to open-source projects
- ► Post-publication platform

## **Collaboration with Git & Github**

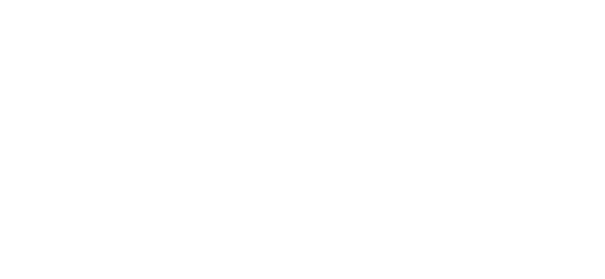


How to Update a Fork in Git

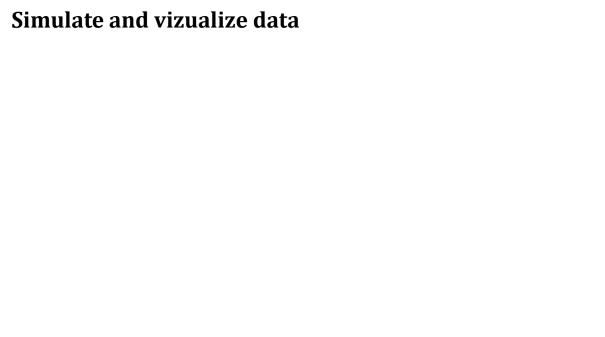


Docker is a tool that allows encapsulation, sharing, and re-creation of a computational environment on most operating systems (Windows, macOS, & Linux).

Reproducible data analysis in action

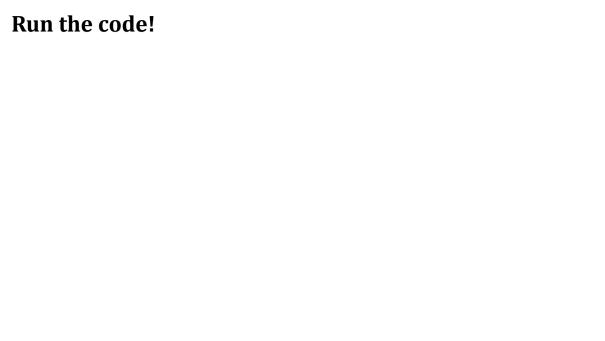


Hypothesis: R skills predict early PhD completion



## Get the data

 $link/QR\ code\ to\ google\ forms$ 



## Where to start

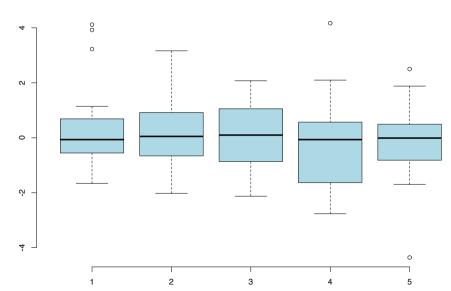
Links/ressources for these tools

## R Appendix: R Figure Example

The following code generates the plot on the next slide (taken from help(bxp) and modified slightly):

## R Appendix: R Figure Example

Example from help(bxp)



# R Appendix: R Table Example

A simple knitr::kable example:

**Table 1:** (Parts of) the mtcars dataset

|                   | mpg  | cyl | disp | hp  | drat | wt    | qsec  | vs |
|-------------------|------|-----|------|-----|------|-------|-------|----|
| Mazda RX4         | 21.0 | 6   | 160  | 110 | 3.90 | 2.620 | 16.46 | 0  |
| Mazda RX4 Wag     | 21.0 | 6   | 160  | 110 | 3.90 | 2.875 | 17.02 | 0  |
| Datsun 710        | 22.8 | 4   | 108  | 93  | 3.85 | 2.320 | 18.61 | 1  |
| Hornet 4 Drive    | 21.4 | 6   | 258  | 110 | 3.08 | 3.215 | 19.44 | 1  |
| Hornet Sportabout | 18.7 | 8   | 360  | 175 | 3.15 | 3.440 | 17.02 | 0  |

### References

Peikert, Aaron, and Andreas Brandmeier. 2021. "A Reproducible Data Analysis Workflow with R Markdown, Git, Make, and Docker Aaron." *Preprint*, 1–47.