

Introduction

Analytically reproducible documents

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1 Research = a dynamic process

- Research insights are typically disseminated through reports (e.g., scientific presentations, publications, etc), including a textual narrative detailing the research context, methods, and key findings, often supplemented with figures and tables to summarize results, and a final discussion, with findings serving as evidence to support conclusions and recommendations ;
- Research is an **iterative** and **dynamic** process, meaning there are no **final** or **definitive** results or reports ;
- In addition, we continuously build upon the work of others to generate new insights and discoveries.

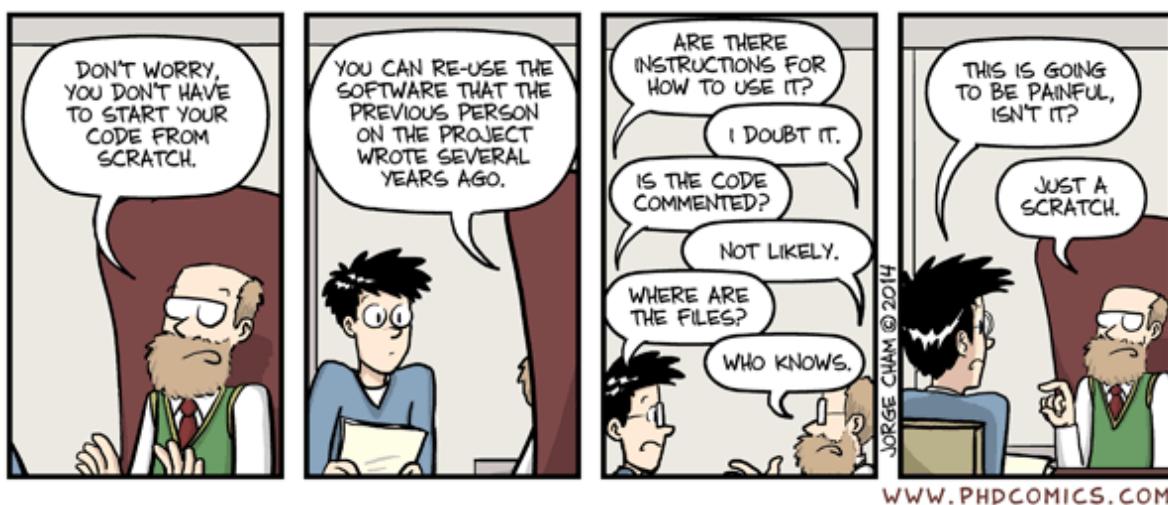


Figure 1: Image reproduced from Jorge Cham at [PhDComics](http://www.phdcomics.com).

2 Reproducibility in research

Achieving reproducibility requires clear access to the underlying **data**, the **code** used for analysis, and the **results** produced. It also depends on documenting the **tools**, such as software and libraries, alongside the **computational environment**, including hardware configurations and operating systems (1).

3 Analytically reproducible documents

Analytically reproducible documents typically contain 3 main types of content, integrating code and natural language in a way that is called “*literate programming*” (2).

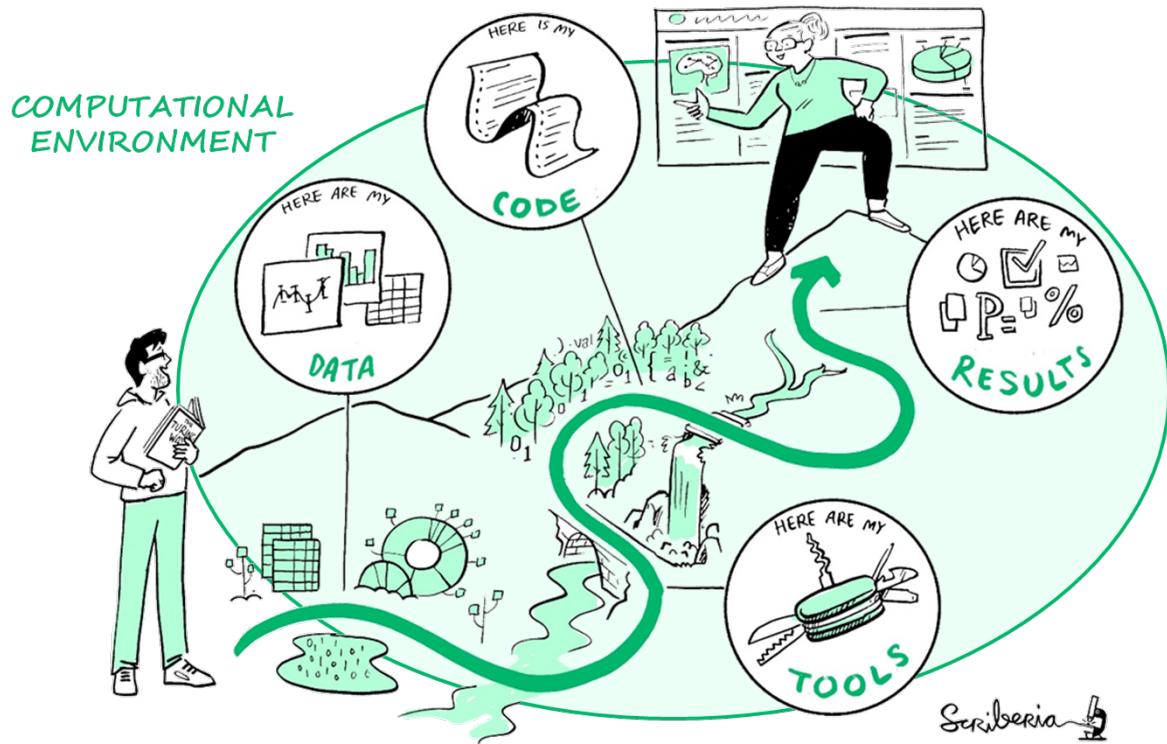


Figure 2: Illustration highlighting the key components of reproducibility in research, including data, code, results, tools, and the computational environment. This illustration is adapted from the one created by Scriberia with The Turing Way community, and used under a CC-BY 4.0 licence. DOI: [10.5281/zenodo.3332807](https://doi.org/10.5281/zenodo.3332807).

3.1 Formatted text

These are languages that can be written using any **plain text editor**. They use *markup* elements to define how text should be displayed or printed.

3.1.1 HTML

HTML is used to structure content on the web.

```
<b>This text will be displayed in bold</b>
```

3.1.2 LaTeX

LaTeX is used for academic and technical documents.

```
\textbf{This text will be displayed in bold}
```

3.1.3 Markdown

Markdown is a lightweight markup language.

```
**This text will be displayed in bold**
```

3.2 Code commands

Different programming languages allow us to execute code to generate results or perform tasks.

3.2.1 R

```
```{r}
library(ggplot2)
data.frame(country=c("Nigeria", "Kenya", "India"), prevalence=c(14.5, 9.2, 3.5)) |>
 ggplot(aes(x=country, y=prevalence)) +
 geom_bar(stat="identity", fill="steelblue")
```
```

3.2.2 Python

```
```{r}
library(reticulate)
Sys.setenv(RETICULATE_PYTHON = "C:/ProgramData/anaconda3/python.exe")
```

```{python}
import matplotlib.pyplot as plt
plt.bar(['Nigeria', 'Kenya', 'India'], [14.5, 9.2, 3.5], color='steelblue')
plt.show()
````
```

3.2.3 Observable JS

```
```{ojs}
BarChart({x: ["Nigeria", "Kenya", "India"], y: [14.5, 9.2, 3.5], yLabel: "Prevalence (%)"}
````
```

3.3 Code outputs

The output from executing code often results in visualizations or printed results. Below are the corresponding outputs for each language:

Call: `glm(formula = confirmed ~ age, family = binomial, data = df)`

Coefficients:

| (Intercept) | age |
|-------------|----------|
| 1.312275 | 0.001292 |

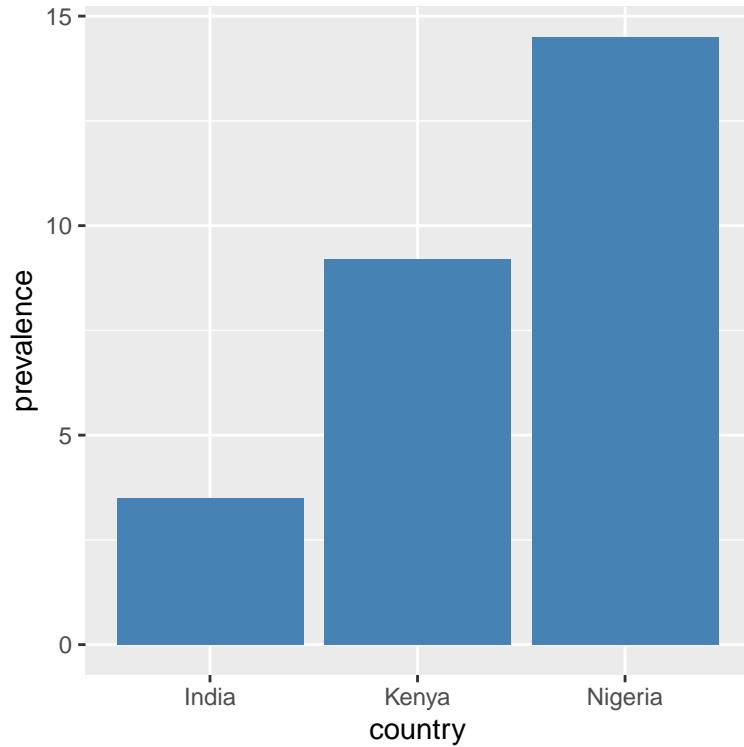
Degrees of Freedom: 65668 Total (i.e. Null); 65667 Residual

Null Deviance: 66000

Residual Deviance: 66000 AIC: 66000

| | c1 | c2 |
|--------|-----|----|
| setosa | 5.1 | |
| setosa | 4.9 | |
| setosa | 4.7 | |

| | c1 | c2 |
|--------|-----|----|
| setosa | 4.6 | |
| setosa | 5.0 | |



Documents can be rendered in different type of outputs e.g., MS Word, PDF, HTML, Power-Point, etc.

Pandoc is a powerful open-source tool that enables seamless **conversion** between various document formats, making it an essential resource for working with markup languages like Markdown, HTML, and LaTeX. By using Pandoc, you can easily transform a document written in one markup language into a wide range of output formats, including MS Word, PDF, HTML, PowerPoint, and more, without needing to manually adjust formatting or structure.

This versatility makes Pandoc particularly valuable in workflows that involve literate programming. Pandoc also supports templates and extensions, allowing users to customize the output to meet specific stylistic or formatting requirements, simplifying the process of producing polished, professional documents.

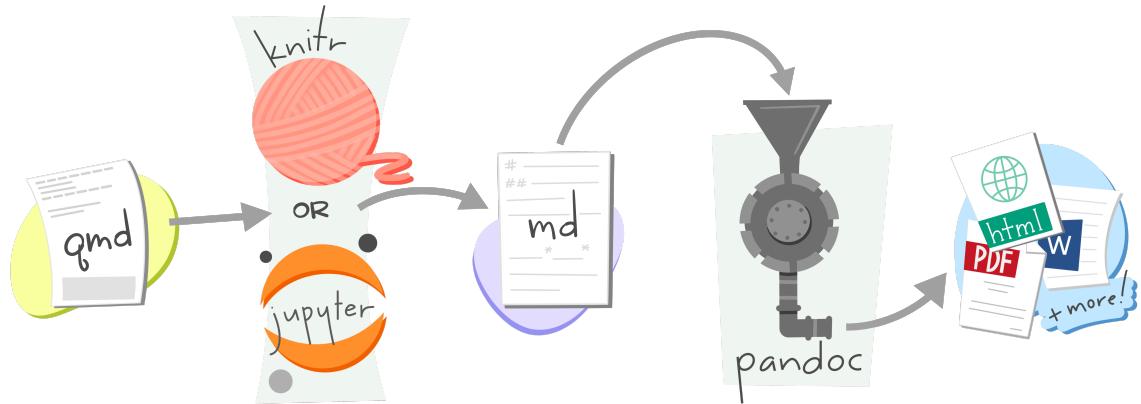


Figure 3: Process of transforming a Quarto document from its source format to the final rendered output. Artwork by Allison Horst.

| Language | Commands / File types |
|----------|---|
| Stata |  <p>dyndoc command
 putpdf command
 putdocx command
 putwrap command
 stmd command
 markstat command</p> <p>Limited capacity compared to Quarto</p> |
| R |  <p>R Markdown (R + Markdown)
 R Sweave (R + LaTeX)
 R HTML (R + HTML)
 Quarto (*.qmd)</p> |
| Python |  <p>Jupyter Notebook
 Quarto (*.qmd)</p> |

Figure 4: Existing tools for writing analytically reproducible documents

4 Existing tools for writing analytically reproducible documents

5 Quarto

- Quarto is the successor to R Markdown, but is not tied to the R language.
- Quarto files have a .qmd extension.

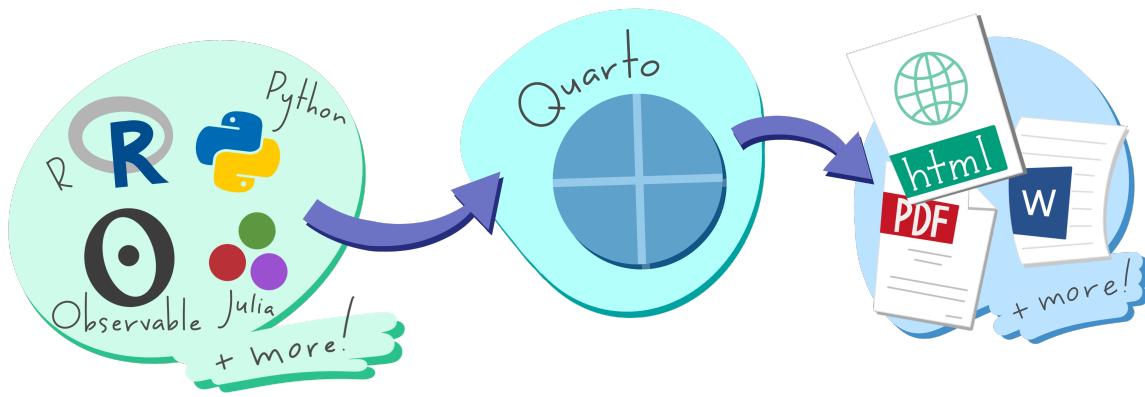


Figure 5: Artwork by Allison Horst.

5.1 Source document

The screenshot shows a code editor with R Markdown syntax. A code chunk is highlighted with a green background. The rendered text above the code chunk is "Markdown text". The output below the code chunk is "Output".

```
10+ ### Task 2
11
12 Display data. To run the code in *notebook* mode, click the green
   arrow on the right side of the code chunk.
13
14 ``{r}
15 df <- iris
16 df |>
17 head(5) |>
18 knitr::kable()
19 ``
```

Markdown text

R command within code chunks

Output

| Sepal.Length | Sepal.Width | Petal.Length | Petal.Width | Species |
|--------------|-------------|--------------|-------------|---------|
| 5.1 | 3.5 | 1.4 | 0.2 | setosa |
| 4.9 | 3.0 | 1.4 | 0.2 | setosa |
| 4.7 | 3.2 | 1.3 | 0.2 | setosa |
| 4.6 | 3.1 | 1.5 | 0.2 | setosa |
| 5.0 | 3.6 | 1.4 | 0.2 | setosa |

5.2 Rendered output

The screenshot shows the rendered output of the R Markdown code. It includes a section titled "Task 2" with instructions, the rendered R command, and the resulting table.

Task 2

Display data. To run the code in `notebook` mode, click the green arrow on the right side of the code chunk.

```
df <- iris
df |>
  head(5) |>
  knitr::kable()
```

Rendered

R command within code chunks

Output

| Sepal.Length | Sepal.Width | Petal.Length | Petal.Width | Species |
|--------------|-------------|--------------|-------------|---------|
| 5.1 | 3.5 | 1.4 | 0.2 | setosa |
| 4.9 | 3.0 | 1.4 | 0.2 | setosa |
| 4.7 | 3.2 | 1.3 | 0.2 | setosa |
| 4.6 | 3.1 | 1.5 | 0.2 | setosa |
| 5.0 | 3.6 | 1.4 | 0.2 | setosa |

5.3 Quarto rendered outputs

- Quarto documents can be rendered into many report formats including HTML, Word document and many more
- [List of supported formats](#)

The screenshot shows the Quarto Gallery page. At the top, there's a navigation bar with links for Overview, Get Started, Guide, Extensions, Reference, Gallery, Blog, and Help. The main content area has a heading 'Gallery' and a sub-section titled 'Quarto can produce a wide variety of output formats. Here are some examples:' followed by a bulleted list: Articles & Reports, Presentations, Dashboards, Websites, Books, and Interactive Docs. To the right of this text is a data visualization titled 'MPG and Horsepower' showing a scatter plot of miles per gallon (mpg) versus horsepower (hp). The plot includes a loess smoothing line. Below the plot is a snippet of R code:

```
library(ggplot2)
ggplot(mpg, aes(hp, mpg, color = am)) +
  geom_point() + geom_smooth(formula = y ~ x, method = "loess")
```

At the bottom right of the visualization, there's a 'Create data-driven presentations' button with a dashed arrow icon.

5.4 Engines

An engine refers to the software or system that executes the embedded code within a document. The engine takes the code chunks written in a specific programming language (e.g., R, Python, or Julia), runs them, and returns the output, which is then incorporated into the rendered document.

Both knitr and Jupyter serve as engines to execute code embedded within a document, but they work in different programming environments.

5.4.1 knitr

This R package will read the code chunks, execute it, and ‘knit’ it back into the document. This is how tables and graphs are included alongside the text.



5.4.2 Jupyter

Jupyter is a popular engine for running Python code interactively. It supports multiple programming languages, but Python is the most common.



6 To go further on reproducibility

- MOOC Reproducible research I - Methodological principles for transparent science (in French)
 - MOOC Reproducible research II - Practices and tools for managing computations and data
1. The Turing Way Community. [The Turing Way: A handbook for reproducible, ethical and collaborative research \(1.0.2\)](https://book.the-turing-way.org/index.html). <https://book.the-turing-way.org/index.html>; 2022.
 2. Knuth DE. Literate Programming. The Computer Journal [Internet]. 1984 Jan;27(2):97–111. Available from: <https://doi.org/10.1093/comjnl/27.2.97>
 3. Batra, Neale and Mousset, Mathilde and Spina, Alex and Florence, Isaac and Coyer, Liza and others. [The Epidemiologist R Handbook](https://epirhandbook.com). <https://epirhandbook.com>; 2021.
 4. The Graph Courses Team. Websites and dashboards with Quarto. <https://thegraphcourses.org/courses/websites-and-dashboards-with-r/>; 2023.