FAIR_bioinfo : Open Science and FAIR principles in a bioinformatics project

How to make a bioinformatics project more reproducible

C. Hernandez¹ T. Denecker² J. Sellier² G. Le Corguillé² C. Toffano-Nioche¹

> ¹Institute for Integrative Biology of the Cell (I2BC) UMR 9198, Université Paris-Sud, CNRS, CEA 91190 - Gif-sur-Yvette, France

> > ²IFB Core Cluster taskforce

June 2021

A B b A B b

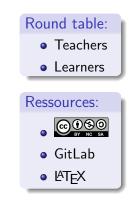
IFB 2021

1/263

General information

Practical information:

- Dates: June 28th 30th
- Location: Institut des Systèmes Complexes, 113 rue Nationale, 75013-Paris
- Courses: 9:00 to 17:30
- Meal: 12:30-14:00
- Pauses: 10:30-11:00 + 15:30-16:00
- 2 days of courses + 1 day of course building



< ∃ > < ∃

Training schedule

Day 1:

- Introduction to reproducibility
- History management (3 Practical Sessions, O^{git} , O^{GitHub})
- Control your development environment (1 PS, CONDA)
- Encapsulation (2 PS, rightarrow docker)

Day 2:

- Workflow (2 PS, $\stackrel{\text{M}}{\underset{\text{SNAKEMAKE}}{}}$)
- Traceability with notebooks (2 PS, [⊕], [€])
- IFB resources (2 PS, 🖏 🕥
- Sharing and disseminating (O GitHub, Zeroco)
- Conclusion

Day 3:

• Empowerment and improvement of resources



・ 何 ト ・ ヨ ト ・ ヨ ト

Table of contents

Introduction to reproducibility Reproducibility A solution

- 2 History management
- Control your development environment

- 4 Workflow
- 5 Tracability with Notebook
- 6 IFB resources
- Sharing and dissemination
- 8 Conclusion

▲ □ ▶ ▲ □ ▶ ▲ □ ▶

ifb

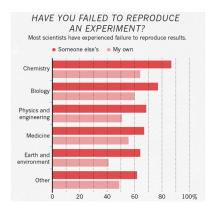
Reproducibility



< □ > < □ > < □ > < □ > < □ >

A reproducibility problem, Biology

70% of the analyses in Experimental Biology are not reproducible



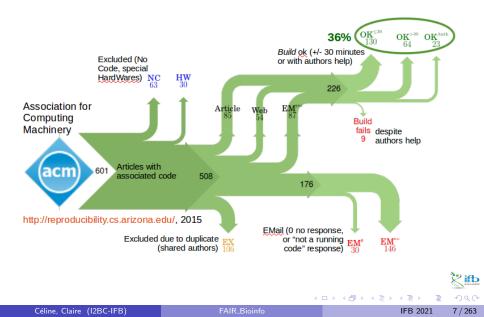
Monya Baker, 1,500 scientists lift the lid on reproducibility, Nature, 2016

() < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < () < ()

< □ > < 凸

ifb

A reproducibility problem, Computer Sciences



A reproducibility problem, Bioinformatics



Ten-Year Reproducibility Challenge, Konrad Hinsen Can your 2009 code still run? special issue of <u>ReScience</u> and result comments in *Nature* Who's never wanted to take over a protocol, a pipeline, or a tool without running into it?

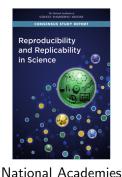
- unable to install tools: not compatible OS, not availability of dependencies
- tool update \Rightarrow codes unusable: python 2 vs. 3, change of function arguments (R)
- inability to reproduce the results of computational analysis: package versions, IDE: stable version of the language different according to the OS (Rstudio)

< □ > < □ > < □ > < □ > < □ > < □ >



Reproducibility in science

Reproducible research, Repeatability, Replicability, Reproducibility, Replication: overlapping semantics \Rightarrow a plethora of definitions!^a



ACM definition (2016):

Repeatability Same team, same exp. setup Replicability Different team, same exp. setup Reproducibility Different team, different exp. setup Whitaker's matrix of reproducibility (2017):^c

		Data	
		Same	Different
Analysis	Same	Reproducible	Replicable
	Different	Robust	Generalisable



Céline, Claire (I2BC-IFB)

of Sciences, Engineering, and Medicine (2019).^b

IFB 2021 9 / 263

FAIR_bionfo's finding

Depends on the object of study x what needs to be "memorized" to replay the experience:



Raw Data FAIR data principles & Data Management Plans M

 \rightarrow

Statistical or bioinformatic analysis Codes - parameters workflows



Validation Publication: thesis, article, report, etc

How to gain in reproductibility?

Focus on codes, parameters, and workflows used throughout the analysis process

Monya Baker, 1,500 scientists lift the lid on reproducibility, Nature, 2016

 \rightarrow



A solution



Céline, Claire (I2BC-IFB)

▲ ■ シ へ へ
IFB 2021 11/263

< □ > < □ > < □ > < □ > < □ >

Divert FAIR data principles towards processes

Findable



Third party tools used = ref. in their field

Easy to find analysis protocol (Github pages) Accessible



Available codes (Github, dockerhub)

Third party open source tools

Interoperable



Cooperation of tools (snakemake, docker) as well as locally than on servers (cloud or cluster) Reusable



Protocol replayable (snakemake) identically (Rshiny) in a virtual environment (docker)



IFB 2021 12 / 263

- B - - B

Promote learning



Our objective

FAIR raw data + FAIR scripts = FAIR processed data

Course

Take your first steps with several companion tools to gain in reproducibility

Example based

Just the beginning of an NGS analysis A full analysis is given as bonus (The NGS analysis is simply used as an example and not explained)



Céline, Claire (I2BC-IFB)

IFB 2021 13 / 263

Ressources

- <u>awesome</u> a curated list of reproducible research case studies, projects, tutorials, and media
- The Role of Metadata in Reproducible Computational Research
- Towards reproducible computational biology
- A very similar sweden <u>courses</u> with git, conda, snakemake, jupyter, r-markdown, docker, singularity

< ∃ > <