

Reproducibility

- Question 1

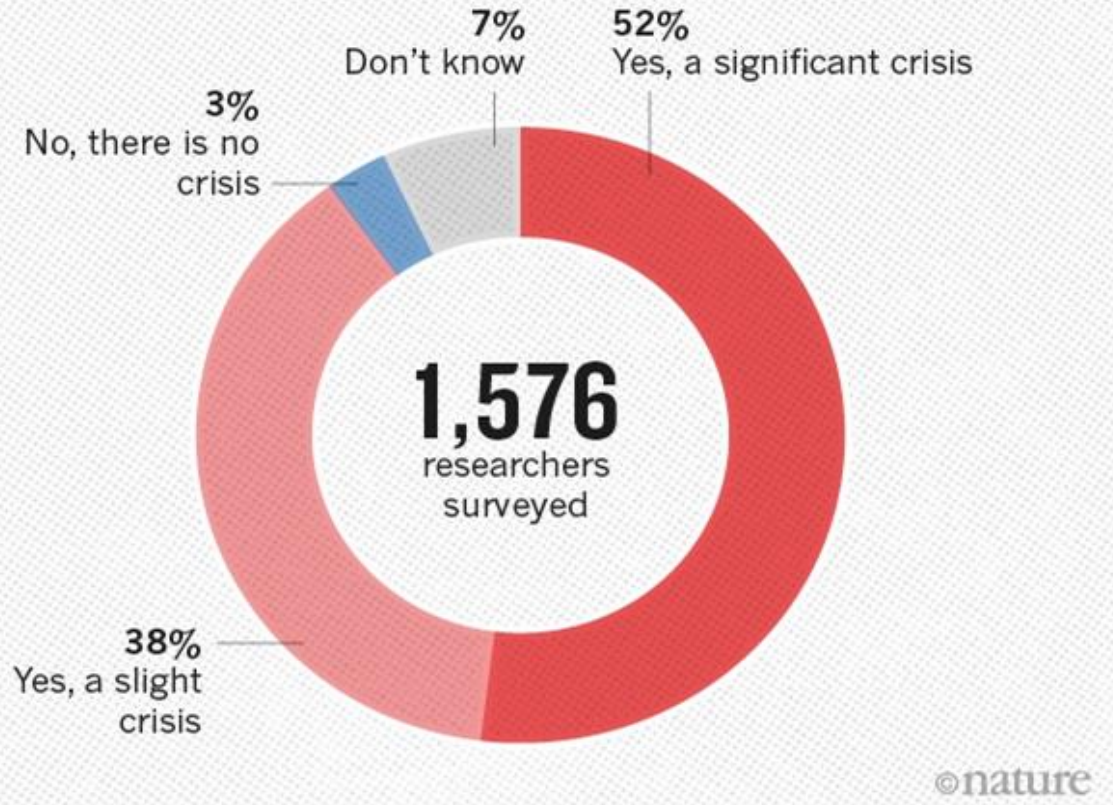
What is reproducibility?

- Replicability vs repeatability vs reproducibility
- “Reproducibility is more or less the ability to draw similar conclusions from replicates studies”
 - Diaba-Nuhoho, P., Amponsah-Offeh, M., *BMC Research Notes* (2021), <https://doi.org/10.1186/s13104-021-05875-3>
- Key component of the scientific method, “cornerstone of science”

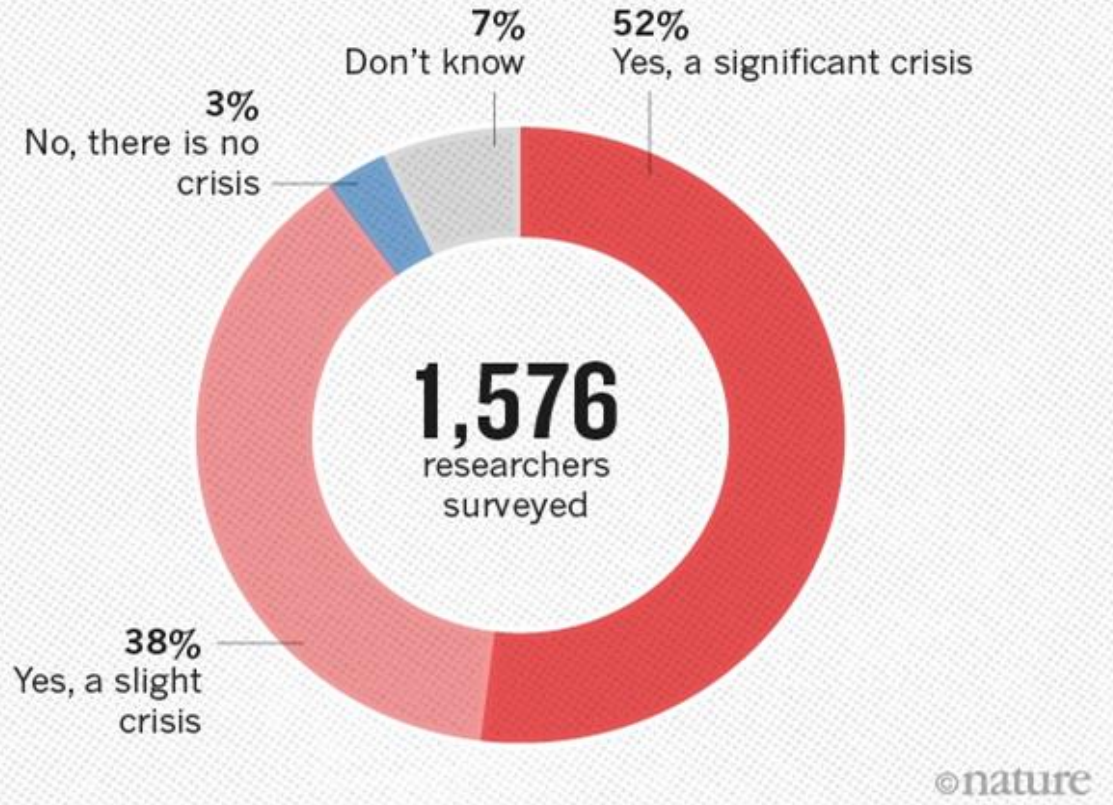
Reproducibility crisis

- Question 2

Is there a reproducibility crisis?



Is there a reproducibility crisis?



- Alfredo Sánchez-Tójar, Universität Bielefeld
- Publication bias in ecology and evolutionary biology:
 - <https://www.youtube.com/watch?v=wdhzLrPUJJY>
- 83 articles of 3 fields:
 - ~30% of partial replication
 - **0% of true replication**

Why is that?

Why is that?

- Absence of knowledge/infrastructure
- Questionable research practices and fraud
- Statistical issues
 - Low statistical power
 - Statistical heterogeneity
- Publication system in science
 - Publication bias (non-significant results/unoriginal replications not published)
 - "Publish or perish"
 - Standards of reporting, open-access

COMPLETED

50 experiments

INITIATED

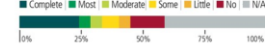
87 experiments

DESIGNED

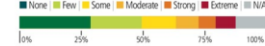
193 experiments

BARRIERS

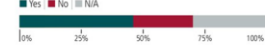
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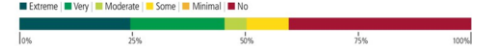
Modifications needed



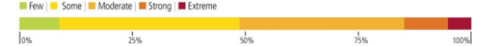
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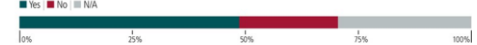
Authors helped



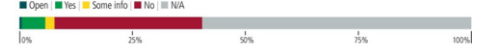
Protocol clarifications needed



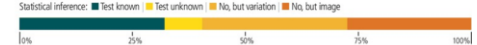
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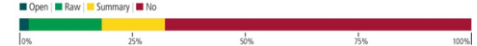
Code shared



Analysis reported



Data shared



Errington, T.M. *et al.*, *eLife* (2021),
<https://doi.org/10.7554/eLife.67995>

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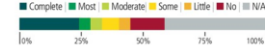
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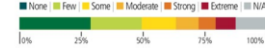
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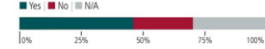
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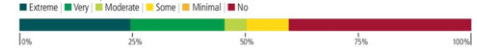
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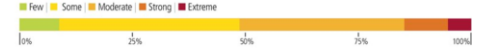
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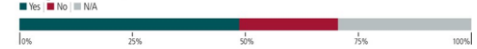
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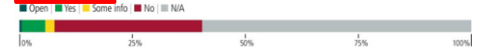
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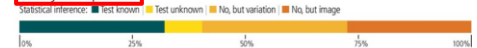
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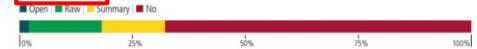
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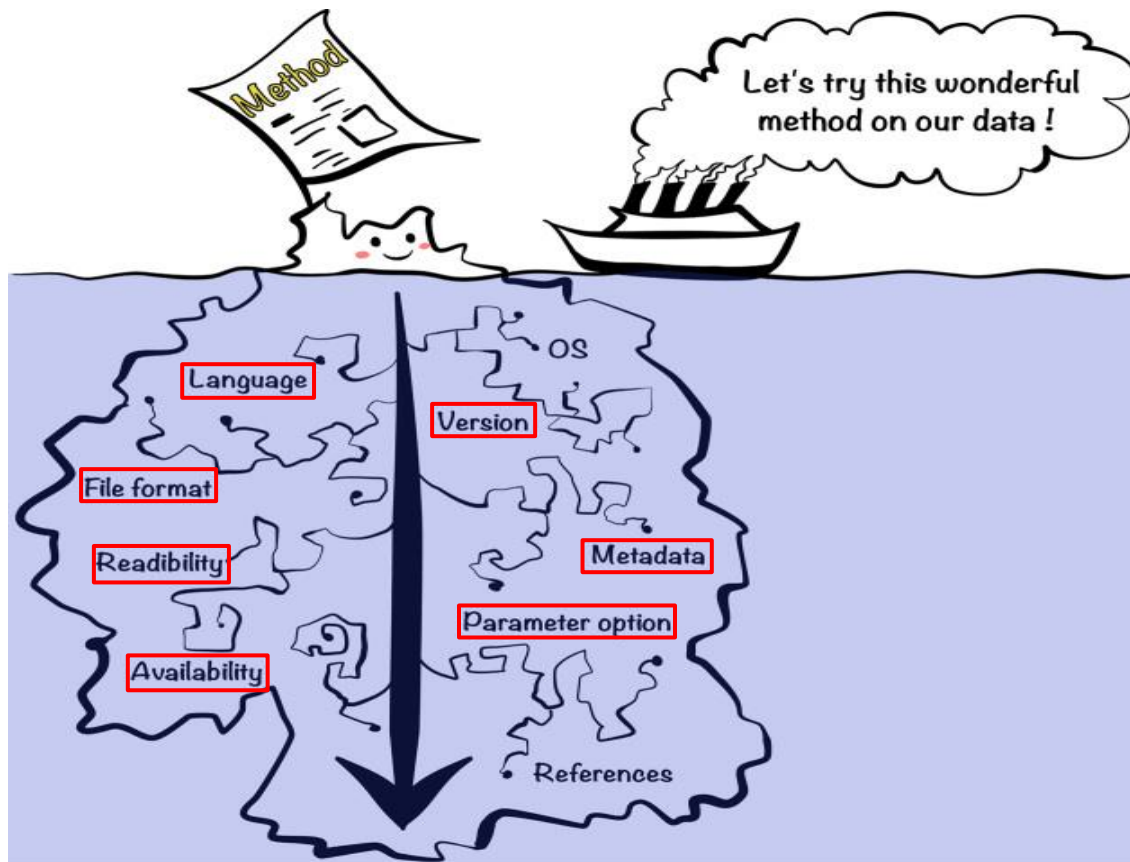


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Workflow Management Systems (WMS)

- Question 3

What do WMS bring?



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- Multiple systems exist. Most popular ones are:
 - [Nextflow](#): “top-down” approach, implemented in Groovy (~ Java)
 - [Snakemake](#): “bottom-up” approach resolving dependencies, implemented in Python
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Python, you said?

- Question 4

Overview of Snakemake's general features



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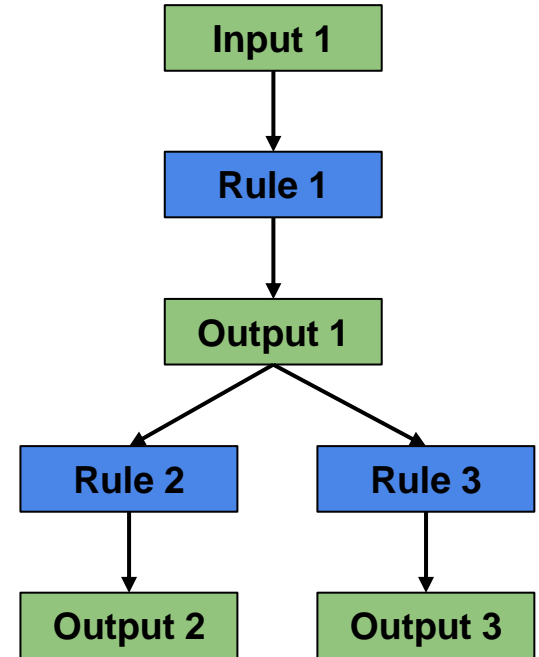
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- Can be easily executed on local machines, HPCs, and clouds
- Handles dependencies with **conda/mamba** (package manager) and **docker/singularity** (containers)
- With Snakemake, conda, and docker installed, you can:
 - Download a workflow (e.g. from a Github or Gitlab repository)
 - Run Snakemake in a controlled environments (software, versions, parameters, OS...)
 - Automatically and efficiently reproduce all the analyses and results

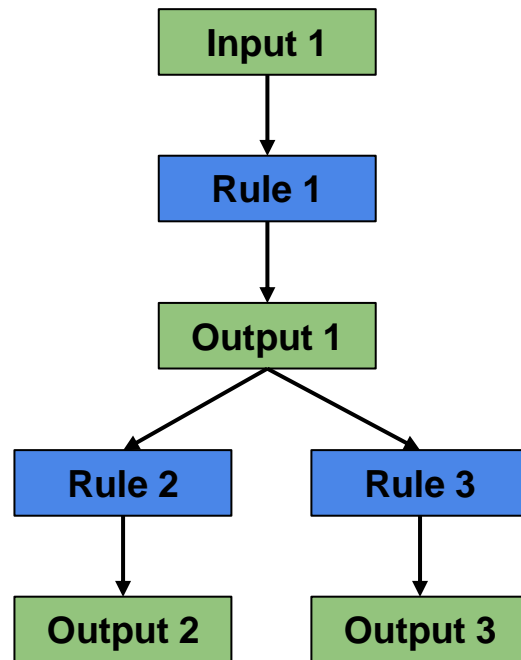
How does Snakemake work?

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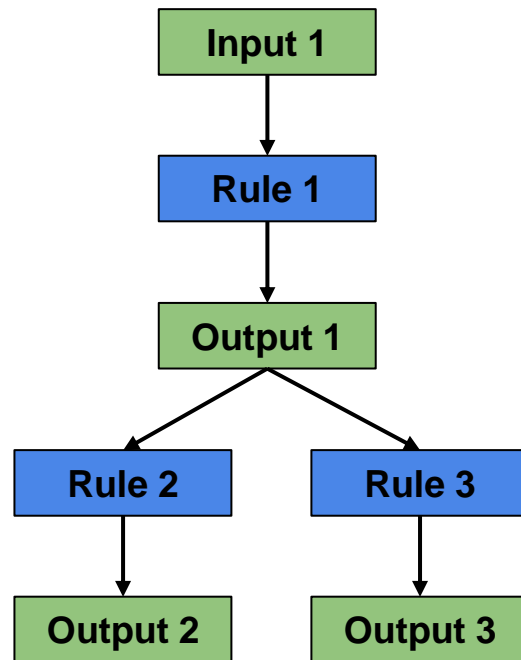
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- **Rule:**
 - Basic workflow unit
 - **Template (recipe)** to produce an **output** (1 or more files)
 - *Can* use an **input**
 - Generates **jobs** when executed
- **Job:**
 - Single **execution** of a **rule** (apply the recipe to specific data)
 - Successful if **all outputs are present and no error**



What does Snakemake really look like?

```
rule first_step:
    input:
        'results/first_step.txt'
    output:
        'results/second_step.txt'
    shell:
        'cp results/first_step.txt results/second_step.txt'
```


Exercises

- Throughout the day:
 - Develop a simple RNAseq analysis workflow, from reads (fastq files) to Differentially Expressed Genes (DEG)
- For now:
 - Understand the structure of a Snakemake workflow
 - Create your first rules and Snakefile
 - Chain rules together
 - Run your first workflow

