Combining Tools for Reproducible Research with Snakemake





Reproducibility is rarer than you think

The results of only 26% out of 204 randomly selected papers in the journal Science could be reproduced.¹

Many journals are revising author guidelines to include data and code availability.

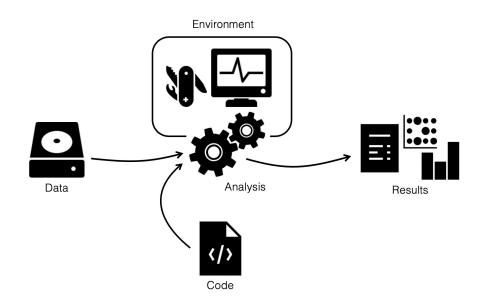
(...) an improvement over no policy, but currently insufficient for reproducibility.





¹ Stodden et. al (2018). "An empirical analysis of journal policy effectiveness for computational reproducibility". PNAS. 115 (11): 2584-2589

Combining Tools for Reproducible Research with Snakemake



- Track your Snakemake code with Git and share it in a remote repository on GitHub or BitBucket (not covered in this lecture)
- Combine Snakemake with Conda and/or containers to make the compute environment reproducible
- Integrate foreign workflow management systems such as Nextflow pipelines into your Snakemake workflow





• Is a package, dependency, and environment manager

packages: any type of program (e.g. bowtie2, snakemake etc.)
dependency: other software required by a package
environment: a distinct collection of packages

• Keeps track of the dependencies between packages in each environment





- 1. Running a Snakemake rule with a Conda environment
 - Make sure you have Conda installed (Miniconda or Anaconda)
 - Find your Conda package on http://anaconda.org
 - Create a Conda environment file (e.g. bwa.yaml)

```
channels:
- conda-forge
- bioconda
- defaults
dependencies:
- bwa=0.7.17
```

source: best practice example

- Store your yaml files in a directory for environments
- For reproducibility, it is important to keep include package versions in your environment file





- 1. Running a Snakemake rule with a Conda environment
 - Add the path to the Conda environment yaml file to your rule using conda

```
rule map_bwa_index:
output: expand("{{ref}}{ext}", ext=[".amb", ".ann", ".bwt", ".pac", ".sa"])
input: config["ref"]
log: "logs/bwa/index/{ref}.log"
conda: "../envs/bwa.yaml"
shell:
"bwa index {input}"
```

modified from: best practice example

• Start your workflow on the command line with --use-conda

\$ snakemake --use-conda

This doesn't work if you use run (instead of shell or script)





- 2. Using one Conda environment for the entire workflow
 - Write a Conda environment file that includes all tools used by the workflow (save it as e.g. environment.yaml)

```
name: best-practice-smk
channels:
- conda-forge

    bioconda

    default

dependencies:
- snakemake=6.8.0
 - python=3.8
 - pandas=1.3.3
 - jupyter=1.0
 - jupyter_contrib_nbextensions=0.5.1
 - jupyterlab_code_formatter=1.4
 - bwa=0.7.17
 - multiqc=1.11
 - r-ggplot2=3.3.5
 - samtools=1.13
```

source: best practice example





- 2. Using one Conda environment for the entire workflow
 - Create the environment

\$ conda env create -f environment.yml

• Activate your Conda environment

\$ conda activate best-practice-smk

Start your Snakemake workflow

(best-practice-smk) [...] \$ snakemake





What can I use containers for?

- Run applications securely isolated in a container, packaged with all dependencies and libraries
- As advanced environment manager
- To package your code with the environment it needs
- To package a whole workflow (e.g. to accompany a manuscript)
- And much more

Docker vs. Singularity

- Docker was developed for any operating system except high-performance computing (HPC) clusters
- Singularity is an open source container platform suitable for HPC clusters





Docker nomenclature

- A Docker file is a recipe used to build a Docker image
- A Docker image is a standalone executable package of software
- A Docker container is a standard unit of software run on the Docker Engine
- DockerHub is an online service for sharing Docker images
- Docker images can be converted into Singularity images





- 1. Running Snakemake rules with Singularity
 - Snakemake can run a rule isolated in a container, using Singularity
 - All Conda packages are available as Docker and Singularity images, e.g. on http://biocontainers.pro (bioconda channel)
 - Many other Docker images are available on DockerHub
 - Or build your own Docker or Singularity images





- 1. Running Snakemake rules with Singularity
 - Make sure your system has Singularity installed
 - Find the Docker or Singularity image in which you want to run the rule
 - Add the link to the container image (or the path to a Singularity *.sif file) to your rule using the container directive

```
rule NAME:
input:

"table.txt"
output:

"plots/myplot.pdf"
container:

"docker://joseespinosa/docker-r-ggplot2"
script:

"scripts/plot-stuff.R"
```

source: Snakemake documentation

• Start your workflow on the command line with --use-singularity

\$ snakemake --use-singularity





- 2. Packaging your Snakemake workflow in a Docker container
 - Make sure your system has Docker installed
 - Write a Docker file, e.g. see this example
 - Start with the official Ubuntu image
 - Install Miniconda and other required tools (e.g. Snakemake)
 - o Add the project files (e.g. Snakefile, config.yaml, environment.yaml)
 - Install the Conda environment containing all packages run by the workflow





- 2. Packaging your Snakemake workflow in a Docker container
 - Create a Docker image from your Docker file (e.g. called my_workflow)

\$ docker build -t my_workflow .

• Run your container, e.g.

\$ docker run my_workflow

• Share your Docker file on GitHub or BitBucket, or your Docker image on DockerHub





Combinations of Conda and Containers

Combine Conda-based package management with running jobs in containers

- A container can be specified globally (for the entire workflow) for a workflow with rule-specific Conda environments
- Snakemake then runs each job in this container with its corresponding Conda environment when run with --use-conda --use-singularity

More info: Snakemake documentation & best practice example





Combinations of Conda and Containers

Containerization of Conda-based workflows

• Snakemake can automatically generate a Docker file that contains all Conda environments used by the rules of the workflow using the flag --containerize

More info: Snakemake documentation





Integrating foreign workflow management systems

- From version 6.2 on, Snakemake can run workflows written in other workflow management systems such as Nextflow
- The workflow runs in Snakemake until a rule to run the foreign workflow is reached
- In this rule, Snakemake hands over to the other workflow manager
- Afterwards, Snakemake continues to run rules processing the output files of the foreign workflow

```
rule chipseq_pipeline:
    input:
    input="design.csv",
    fasta="data/genome.fasta",
    gtf="data/genome.gtf",
    output:
    "multiqc/broadPeaks/multiqc_report.html",
    params:
    pipeline="nf-core/chipseq",
    revision="1.2.1",
    profile=["conda"],
    handover: True
    wrapper:
    "0.74.0/utils/nextflow"
```

More info & source: Snakemake documentation





Summary

There are many ways to use other tools for reproducible research together with Snakemake:

- Use Git to version control, backup and share your code
- Run rules or your entire workflow in Conda environments
- Run your rules in isolated Singularity containers
- Package your entire workflow in a Docker container
- Run pipelines written in other workflow management systems in your Snakemake workflow





Questions?







