Reproducibility in the SKA Challenges and reproducible paper



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Current You

Future You







The importance of reproducibility

> To give the full history of your science



You will deliver robust, reliable, trustful science. Open Science benefits the research community and society **but...**

Be realistic

Think about your purpose and skills

Files Data Scripts Config Github Software Depend encies https://thinkbeyondthelogo.wordpress.com/2015/06/19/moving-parts/

Full end-to-end automatic reproducibility is hard

Define your scope

Think about your purpose and skill

Incremental progress is better than frustration

Who is going to reproduce your research?

Potentially, all the future generations of scientist that will ever exist

- Do it for yourself (and your future self)
- For your collaborators
- For the paper referees
- For the community in your field
- For everyone

A reproducible paper

Location and instructions to access raw data

Explicit definition of software used (provenance)

Analysis (code)

Ramos-Padilla+2021: The viewing angle in AGN SED models, a data-driven analysis

Documentation

https://github.com/aframosp/AGNView

Where to start?

Get routines

Document what you do (README files)
Use plain text (e.g. Markdown)
Use online repositories (Github, gitlab)
Get used to version control (git), at least the basics
Be explicit with the software you use
Notebooks can help with collaboration and sharing

Software repositories (e.g. Github)

































Software repositories

Github Gitlab Bitbucket

. . .

They aim to provide an efficient **collaborative platform** with powerful **git management** under the hood and enabling personal or **social coding**



Basic ingredients

This project is to lanage topics	share files with n	ny collaborator	YOUR DESCRI	PTIO	N				E	Edi
🕞 1 commit	¥ 1	pranch	🗇 0 packages	0 (releases	🎎 1 contrib	utor	হাঁুহ G	PL-3.0	
Branch: master -	New pull request				Create new file	Upload files	Find file	Clone of	o <mark>r down</mark> loa	ıd •
😨 jmoldon Initial (comm <mark>i</mark> t					La	atest commit	d3d166a (3 minutes a	ago
.gitignore			Initial comn	nit				3	minutes a	ago
		YOUR FILES	Initial comn	nit				3	minutes a	ago
README.md			Initial comn	nit				3	minutes a	ago
E README.md										
test		YOUR R	EADME							

Automatic rendering of files

Jupyter notebooks csv markdown

<pre>\$* master - droplets / gaia_exploratory / jupyter_exploratory.ipynb</pre>	Go to file ····
imoldon Add new row limit for gaia with Gaia.ROW_LIMIT	Latest commit 09a4ac7 on Apr 9, 2021 🕚 History
At 1 contributor	
2.49 MB	Download ปี

Exploratory analysis of unkown star cluster

We are going to explore the star population of the region of interest by analysing *Gaia* data. *Gaia* Data Release 2 provides high-precision astrometry and three-band photometry for about 1.3 billion sources over the full sky. Theprecision, accuracy, and homogeneity of both astrometry and photometry are unprecedented. To obtain the data we will use the astroquery TAP+ protocol. More information can be found here: https://astroquery.readthedocs.io/en/latest/

[1]: %matplotlib inline

import numpy as np import matplotlib.pyplot as plt import matplotlib

matplotlib.rcParams['figure.figsize'] = (18.0, 10.0)
from astroquery.gaia import Gaia
Gaia.ROW_LIMIT = -1

import astropy.units as u
from astropy.coordinates import SkyCoord

Markdown Ianguage

Useful and efficient syntax For .md files, issues, pull requests, etc.

```
droplets / sessions / droplets-02-conda /
                                             droplets-02-conda.md
                                                                                                                  Cancel changes
                                                                         in master
                                                                                               $ 1
 <> Edit file
                     Preview
                                                                                                                   Soft wrap
                                                                                     Spaces
                                                                                                              $
                                                                                                                                $
      Open Science Droplets 02
1
2
    # Keep your software organized with Conda
3
    Our collaborator shared a [Jupyter notebook](https://github.com/spsrc/droplets/blob/master/gaia exploratory
4
    /jupyter_exploratory.ipynb) with us
    and we want to re-run it and change a few things.
5
6
    ## Install Jupyter using conda
    Let's work on a temporary folder so at the end of the session we will simply remove the folder to clean everything up:
8
9
     mktemp --directory
10
     cd </path/to/temp/folder>
11
     . . .
12
13
    Now let's download the git repository containing the notebook:
14
15
     git clone https://github.com/spsrc/droplets.git
17
18
    First, do we have Jupyter installed?
19
20
21
     which jupyter
     . . .
22
23
    We don't. Instead of using the operating system's package manager (e.g. `apt-get`) or performing a manual installation, let's
24
    use `conda`!
25
     curl --output Miniconda.sh https://repo.anaconda.com/miniconda/Miniconda3-latest-Linux-x86 64.sh
26
     bash Miniconda.sh -b -p conda-install
27
28
     source conda-install/etc/profile.d/conda.sh
     conda install mamba --channel conda-forge --yes
29
30
31
```

Markdown Ianguage

Useful and efficient syntax For .md files, issues, pull requests, etc.

Open Science Droplets 02

Keep your software organized with Conda

Our collaborator shared a Jupyter notebook with us and we want to re-run it and change a few things.

Install Jupyter using conda

Let's work on a temporary folder so at the end of the session we will simply remove the folder to clean everything up:

mktemp --directory
cd </path/to/temp/folder>

Now let's download the git repository containing the notebook:

git clone https://github.com/spsrc/droplets.git

First, do we have Jupyter installed?

which jupyter

We don't. Instead of using the operating system's package manager (e.g. apt-get) or performing a manual installation, let's use conda !

README



First thing a visitor sees



Describe what is this, for who and why

Describe the structure or add links to relevant files

Include instructions

Project information

Commit history

Commits on Jan 30, 2022				
Merge pull request #22349 from QuLogic/luatex-kpsewhich	Verified	ιÖ	6eba0af	0
🗑 timhoffm committed 15 hours ago 🗸				
Merge pull request #22025 from anntzer/wxf	Verified	۲D	5722182	0
greglucas committed yesterday ✓		U		
Commits on Jan 29, 2022				
Deprecate various custom FigureFrameWx attributes/methods.		ŋ	b463a3b	0
🚓 anntzer committed yesterday 🗸		U		
Merge pull request #21391 from anntzer/jpegbkg	Verified	٢D	30db833	6
greglucas committed yesterday		5		<u> </u>
Merge pull request #22026 from anntzer/wxc	Verified	rD	f44c225	(()
👔 greglucas committed yesterday 🗸		6		
Merge pull request #22351 from anntzer/tw	Verified	-	d771226	0
imhoffm committed yesterday X		G		
Fix "trailing" whitespace in C docstrings.		۲D	a9d12de	0
		-		0.00

Issues

⊙ 1,462 Open ✓ 6,821 Closed	Author -	Label -	Projects -	Milestones -	Assignee -	Sort +
[Doc]: Deprecation note in get_cmap is non-actionable Documentation #22362 opened 9 hours ago by mwaskom						Q 1
③ [Bug]: text.usetex Vs. DateFormatter topic: date handling topic: text/usetex #22350 opened 2 days ago by leocirto				រិរូ 1		Ç 3
 [ENH]: Having more customization options for the FancyArrow class (specific topic: arrow) #22344 opened 2 days ago by mapfiable 	cally different tail	S) New featu	ire			₽ 4
O [MNT]: Delay (or make pending) the deprecation of set_constrained_layout/se #22343 opened 3 days ago by anntzer	et_tight_layout 🚺	laintenance		រិង្ខ 1		P 8
 [Bug]: GridSpec or related change between 3.4.3 and 3.5.1 #22341 opened 3 days ago by KelSolaar 						Ç 2
[Bug]: rcParams['legend.loc'] can't use float-tuple like kwarg legend(loc) (c #22338 opened 3 days ago by cphlewis	opic: rcparams					
③ [Bug]: Unable to twinx an axis with sharex=True #22335 opened 3 days ago by madphysicist						Q 4
⑦ [Bug]: Data under cursor crashes on QuadMesh status: confirmed bug #22334 opened 3 days ago by Stassels ♀ v3.5.2					æ	Ç 3
③ [Bug]: First and or last minor ticks sometimes not plotted status: confirmed bug #22331 opened 4 days ago by bproxauf						Q 1

Pull/merge requests

13,745 Closed	Author -	Label -	Projects -	Milestones -	Reviews -	Assignee -	Sort -
Revert datetime usetex ticklabels to use default tex font. × topic: date #22361 opened 12 hours ago by anntzer • Review required F, 6 tasks	handling (topi	ic: text/usetex	topic: ticks axis la	abels	⊙ 1		
Let TeX handle multiline strings itself. × (status: waiting for other PR) (topic: 1) #22360 opened 12 hours ago by anntzer * Review required F) 6 tasks	text/usetex						
\$\\$ Slightly refactor TeX source generation. × Maintenance topic: text/usetex #22359 opened 12 hours ago by anntzer * Approved \$\Frac{1}{2}\$ 6 tasks							
It Cleanup tripcolor() Maintenance #22356 opened yesterday by timhoffm • Review required V3.6.0					⊙ 1		₽ 2
#22355 opened yesterday by kmivan • Review required 4 of 6 tasks							
th correctly treat pan/zoom events of overlapping axes × #22347 opened 2 days ago by raphaelquast • Review required ③ 2 of 6 tasks ♀ v3.6.0							7 13
NMT: make layout deprecations pending ✓ Maintenance #22345 opened 2 days ago by jklymak • Approved					⊙ 1		₽ 5

Workflow management systems

snakemake





https://slides.com/johanneskoester/ismb-snakemake-tutorial-2019



https://slides.com/johanneskoester/ismb-snakemake-tutorial-2019



https://slides.com/johanneskoester/ismb-snakemake-tutorial-2019


Workflow management systems

Why workflows?

- Allow you to create, manage, and execute workflows for data analysis
- From raw data to figures/paper automatically
- Atomic steps, more intuitive logic of analysis
- Re-run half-way through
- Re-run same analysis many times. Manage parallelization
- Create workflows that are transparent, shareable, and reusable
- Tools for dependency management (tasks and software packages)

Existing workflow systems

Existing Workflow systems

Stian Soiland-Reyes edited this page 2 days ago · 343 revisions

Permalink: https://s.apache.org/existing-workflow-systems

Cite as (update dates):

Peter Amstutz, Maxim Mikheev, Michael R. Crusoe, Nebojša Tijanić, Samuel Lampa, et al. (2022): **Existing Workflow systems.** *Common Workflow Language wiki*, GitHub. https://s.apache.org/existing-workflow-systems updated 2023-05-03, accessed 2023-05-03.

Computational Data Analysis Workflow Systems

An incomplete list

Please add new entries at the bottom.

In addition to this list, actively developed free/open-source systems should be registered at https://workflows.community/systems

See also: https://github.com/pditommaso/awesome-pipeline

- 1. Arvados CWL-based distributed computing platform for data analysis on massive data sets. https://arvados.org/ https://github.com/arvados/arvados
- 2. Apache Taverna http://www.taverna.org.uk/ https://taverna.incubator.apache.org/
- 3. Galaxy http://galaxyproject.org/
- 4. SHIWA https://www.shiwa-workflow.eu/
- 5. Apache Oozie https://oozie.apache.org/
- 6. DNANexus https://wiki.dnanexus.com/API-Specification-v1.0.0/IO-and-Run-Specifications https://wiki.dnanexus.com/API-Specification-v1.0.0/Workflows-and-Analyses
- 7. BioDT http://www.biodatomics.com/-archived at https://web.archive.org/web/20180609011656/http: //www.biodatomics.com/
- 8. Agave http://agaveapi.co/live-docs/
- 9. DiscoveryEnvironment http://www.iplantcollaborative.org/ci/discovery-environment

https://github.com/common-workflow-language/common-workflow-language/wiki/Existing-Workflow-systems

Why snakemake?

Why?

- Snakemake is **based on Python** and uses a domain-specific language to define workflows
- Easy to learn (subjective)
- Scalability: runs on laptop or multi-core servers (e.g. slurm)
- Easy to **manage software** (specific conda or singularity per task)
- Snakemake provides tools for visualizing the job flow
- Handles boilerplate: common tasks such as parallelization, suspend/resume, logging

snakemake

To manage packages, dependencies and execution

(~make in python)





Mölder et al. F1000Research 2021, 10:33

Some DAG examples

(think input \rightarrow output)











```
$ cat european-countries.txt
rule count countries:
                                                          Netherlands
   input:
                                                          Greece
      "european-countries.txt"
                                                          Spain
   output:
                                                          Portugal
      "number-of-countries.txt"
                                                          Italy
   shell:
                                                          Poland
      "wc --lines european-countries.txt >
                                                          Austria
   number-of-countries.txt"
```

```
rule count_countries:
input:
    "european-countries.txt"
    output:
    "number-of-countries.txt"
    shell:
    "wc --lines {input} > {output}"
    $ cat european-countries.txt
    Netherlands
    Greece
    Spain
    Portugal
    Italy
    Poland
    Austria
```

```
$ cat european-countries.txt
rule count countries:
                                                          Netherlands
   input:
                                                          Greece
      "european-countries.txt",
                                                          Spain
      "other-countries.txt"
                                                          Portugal
   output:
                                                          Italy
      "number-of-countries.txt"
                                                          Poland
   shell:
                                                          Austria
      "wc --lines {input} > {output}"
```

```
rule count countries:
   input:
      "european-countries.txt",
      "other-countries.txt"
   output:
      "number-of-countries.txt"
   shell:
      "wc --lines {input} > {output}"
rule pre processing:
   input:
      "number-of-countries.txt"
   output:
      "my plot.png"
   shell:
      "python myscript.py {input}"
```



```
rule count_countries:
    input:
        "european-countries.txt",
        "other-countries.txt"
    output:
        "number-of-countries.txt"
    conda:
        "envs/count_countries.yaml"
    shell:
        "wc --lines {input} > {output}"
```

```
rule count_countries:
    input:
        "european-countries.txt",
        "other-countries.txt"
        output:
        "number-of-countries.txt"
        container:
            "docker://repo/image"
        shell:
        "wc --lines {input} > {output}"
```



```
rule count countries:
   input:
      "european-countries.txt",
      "other-countries.txt"
   output:
      "Number-of-countries.txt"
   container:
      "docker://repo/image"
   log:
      "logs/count countries.log"
   benchmark:
      "benchmarks/count countries.txt"
   report:
      "report("fig1.png", caption="fig1.rst")"
   params:
      option="--lines"
   resources:
      mem mb=100
      nvidia gpu=1
   threads: 8
   priority: 50
   shell:
      "wc {params.option} {input} > {output}"
```

Show your work!

Workflow management tool for open source scientific articles

show your work!

- Based on snakemake. Final output is ms.pdf
- Github action to generate the pdf
- Can use Zenodo as archive for heavy files
- Integration with overleaf
- Prepares files for **arXiv** submission
- Links figures in pdf to actual script
- https://show-your.work/en/latest

```
\begin{figure}
   \begin{centering}
      \includegraphics{figures/mandelbrot.pdf}
      \caption{This is a pretty visualization of the Mandelbrot set.}
      \label{fig:mandelbrot}
      \script{mandelbrot.py}
   \end{centering}
   \end{figure}
```

Demo time

Example of a simple reproducible paper using snakemake

https://snakemake.readthedocs.io/en/stable/

A quick example

SKA Data Challenge 2



The SKA Data challenges

Preparatory activities for the science community. Familiarize with SKA data products and optimize analysis

SDC1 (2018)

Continuum images at 3 bands simulating 1000 h of data. Source finding + characterization + identification

SDC2 (2021)

Multifrequency source finding and characterization of HI emitting galaxies. 1 TB data cube



An SKA Data Challenge example



File traceability

Helps anyone to understand the logic and flow of the analysis.

Benefits modularization





File structure

Using a template is very helpful to organize ideas and start the project

Workflow file structure



Results file structure



Documentation

Version-controlled documentation deployed with readthedocs Search docs The SKA Data Challenge 2 Methodology Workflow Description

HI-FRIENDS SDC2

Workflow installation

Workflow execution

SDC2 HI-FRIENDS results SDC2 Reproducibility award

Developers

Acknowledgments

Welcome to HI-FRIENDS SDC2's documentation!

لا master -

- The SKA Data Challenge 2
 - The HI-FRIENDS solution to the SDC2

Welcome to HI-ERIENDS SDC2's documentation!

- Workflow general description
- The HI-FRIENDS team
- Methodology
 - Data exploration
 - Feedback from the workflow and logs
 - Configuration
 - Unit tests
 - Software managed and containerization
 - Check conformance to coding standards
- Workflow Description
 - Workflow definition diagrams
 - Workflow file structure
 - Output products
 - $\circ~$ Snakemake execution and diagrams
- Workflow installation
 - Dependencies
 - Installation

jmoldon fix typo in link to binder in the documentation
 source
 Makefile
 make.bat
 requirements.txt
 sphinx.yml

hi-friends / docs /

Developers docs

Populated directly from the scripts using Sphinx

filter_catalog module

This script filters the output catalog based on some conditions

filter_catalog.arcsec2kpc(redshift, theta)

Converts angular size to linear size given a redshift

Parameters:	 redshift (float) – redshift
	• theta (array of floats) – angular size in arcsec
Returns:	distance_kpc - linear size in kpc

Return type: array of floats

filter_catalog.compute_d_m(cat)

Computes the Mass of HI and linear diameter of the galaxies in a catalog

Parameters:	cat (<i>pandas.DataFrame</i>) – catalog of galaxies
Returns:	cat – original catalog adding the columns log(M_HI) and log(D_HI_kpc)
Return type:	pandas.DataFrame

O Edit on GitHub

Use standard Open Science related files





	이 같은 사람 사람은 가장 이 것 같아요. 아님 것 이야지 않는 것 같은 것 같은 것 같은 것 같아요			
	Dependencies	▲ workflowHub ♀ Browse - Search here Search ♦		
Interoperable	 Installation Deploy in containers Docker 	HI-FRIENDS HI data cube source finding and characterization Version 1 Overview Files I Related items		
	🗉 Singularity	Workflow Type: Snakemake Stable		
	🗉 Podman			
	Use tarball of the workflow	ZEROCO Search Q Upload Communities		
	Use myBinder	Celebrating our 10th anniversary! Send us your birthday greeting here. 🔉		
		August 6, 2021 Software Open Access		
		HI-FRIENDS participation in the SKA Data Challenge 2		
Software Heritage Browse the	e archive	O Moldon, Javier; O Darriba, Laura; Verdes-Montenegro, Lourdes; Kleiner, Dane; Sanchez, Susana; Kamphuis, Peter; Parra, Manuei; Józsa, Gyula; Garrido, Julian; Cannon, John; Jones, Michaei; Akhlaghi, Mohammad; Sorgho, Amidou; Sabater, José; Pandey-Pommier, Mamta; Alberdi, Antonio; Márquez, Isabel; Gomez, Jose Francisco; Herranz, Diego		
Features	https://github.com/HI-FRIENDS-SDC2/hi-friends 2	This repository contains the workflow used to find and characterize the HI sources in the data cube of the SKA Data Challenge 2. This is developed by the HI-FRIENDS team. The execution of the workflow was conducted in the SP-SRC cluster at the IAA-CSIC. Documentation can be found in HI-FRIENDS SDC2 Documentation. The workflow is maintained in the hi-friends Github repository. It is also published in WorkflowHub.		
Q Search	13 April 2023, 05:01:25 UTC	The repository includes the following files:		
👱 Downloads	Code Paranches (2) Releases (0) Visit	ts -HI-FRIENDS-SDC2/hi-friends-1.0.0.zip. A copy of the Github repository https://github.com/HI-FRIENDS-SDC2/hi-friends		
Save code now	★ Branch: HEAD ▼ 1c56c72 /	Config files and all software packages of each defined conde environment. The only dependency to use it is snakemake. Works on Linux, and has been testes on Ubuntu 20.04.		
🗶 Add forge now	Tip revision: d77378f3cdda2a36346f8e8boabd2603a2ab	 hi-friends-wf.sif. Singularity image of the whole workflow. To execute it, follow instruction in https://hi-friends- sdc2.readthedocs.io/en/latest/installation.html#id1 		
2 Help	-O- Update README.md	- hi-friends-wf.tgz. Docker container of the whole workflow.		
U Holp		 hi-friends_solution.tgz. HI-FRIENDS solution, including code, catalogs, cubelets, etc. 		

⊟ Workflow installation

Reproducibility checklists

Criteria:

https://drive.google.com/file/ d/1B2mZ SYwktvXY-Rbdf0 OgllPuyHBs2UW/view

SDC2 reproducibility award

List of criteria: link

- Well-documented
- Easy to install
- Easy to use
- Open license
- Accessible code
- Code standards
- Testing

	Reproducibility of the solution Can the software pipeline be re-run easily to produce the same results? Is it: • Well-documented <i>Besearch software documentation best practice</i> • Easy to install <u>Top tips for ackaging software</u> • Easy to use <u>Top tips for documentation</u>				
ocumented	High-level description of what/who the software is for is available				
	High-level description of what the software does is available				
	High-level description of how the software works is available				
	Documentation consists of clear, step-by-step instructions				
	Documentation gives examples of what the user can see at each step e.g. screenshots or command-line excerpt				
	Documentation uses monospace fonts for command-line inputs and outputs, source code fragments, function names, class names etc				
	Documentation is held under version control alongside the code				
o install	Full instructions provided for building and installing any software				
	All dependencies are listed, along with web addresses, suitable versions, licences and whether they are mandatory or optional				
	All dependencies are available				
	Tests are provided to verify that the installation has succeeded				
	A containerised package is available, containing the code together with all of the related configuration files, libraries, and dependencies required. Using .e.g. Docker/Singularity				
o use	A getting started guide is provided outlining a basic example of using the software e.g. a README file	ted guide is provided outlining a basic example of using the ME file biological accessibility for biological accessibili			
	Instructions are provided for many basic use cases		Idable source code		
	Reference guides are provided for all command-line, GUI and configuration ontions				

Well-c

Easy to

Easy t

		e.g. GNU General Public License (GPL), BSD 3-Clause
		Licence is stated in source code repository
		Each source code file has a licence header
	Accessible code	Access to source code repository is available online
		Repository is hosted externally in a sustainable third-party repository e.g. SourceForge, LaunchPad, GitHub: Introduction to GitHub
		Documentation is provided for developers
	Code standards	Source code is laid out and indented well
		Source code is commented
		There is no commented out code
		Source code is structured into modules or packages
Software		Source code uses sensible class, package and variable names
Suctoinchility	Testing	Source code structure relates clearly to the architecture or design
Suscalinability		Source code has unit tests
Institute		Software recommends tools to check conformance to coding standards
		e.g. A miler such as ryeme joi ryenon

Conclusions

What to do next?



First things first



Follow a reproducibility checklist

Reproducibility of the solution

Can the software pipeline be re-run easily to produce the same results? Is it:

- Well-documented Research software documentation best practice
- Easy to install Top tips for packaging software
- Easy to use Top tips for documentation

High-level description of what/who the software is for is available	
High-level description of what the software does is available	
High-level description of how the software works is available	
Documentation consists of clear, step-by-step instructions	
Documentation gives examples of what the user can see at each step e.g. screenshots or command-line excerpt	
Documentation uses monospace fonts for command-line inputs and outputs, source code fragments, function names, class names etc	
Documentation is held under version control alongside the code	
Full instructions provided for building and installing any software	
All dependencies are listed, along with web addresses, suitable versions, licences and whether they are mandatory or optional	
All dependencies are available	
Tests are provided to verify that the installation has succeeded	
A containerised package is available, containing the code together with all of the related configuration files, libraries, and dependencies required. Using .e.g. Docker/Singularity	
A getting started guide is provided outlining a basic example of using the software e.g. a README file	
Instructions are provided for many basic use cases	
Reference guides are provided for all command-line, GUI and configuration options	
	High-level description of what/who the software is for is available High-level description of how the software works is available High-level description of how the software works is available Documentation consists of clear, step-by-step instructions Documentation gives examples of what the user can see at each step e.g. creenshots or command-line excerpt Documentation uses monospace fonts for command-line inputs and outputs, source code fragments, function names, class names etc Documentation is held under version control alongside the code Full instructions provided for building and installing any software All dependencies are listed, along with web addresses, suitable versions, licences and whether they are mandatory or optional All dependencies are available Tests are provided to verify that the installation has succeeded A containerised package is available, containing the code together with all of the related configuration files, libraries, and dependencies required. <i>sing .e.g. Docker/Singularity</i> A getting started guide is provided outlining a basic example of using the software <i>e.g. on README file</i> Instructions are provided for many basic use cases Reference guides are provided for all command-line, GUI and configuration options

the second se	
	Reusability of the pipeline Can the code be reused easily by other people to develop new projects? Does it: • Have an open licence <u>Choosing an open source licence</u> • Have easily accessible source code <u>Choosing a repository for your project</u> • Adhere to coding standards <u>Writing readable source code</u> • Utilise tests <u>Testing your software</u>
Open licence	Software has an open source licence e.g. GNU General Public License (GPL), BSD 3-Clause
	Licence is stated in source code repository
	Each source code file has a licence header
Accessible code	Access to source code repository is available online
	Repository is hosted externally in a sustainable third-party repository e.g. SourceForge, LaunchPad, GitHub: Introduction to GitHub
	Documentation is provided for developers
Code standards	Source code is laid out and indented well
	Source code is commented
	There is no commented out code
	Source code is structured into modules or packages
	Source code uses sensible class, package and variable names
	Source code structure relates clearly to the architecture or design
Testing	Source code has unit tests
	Software recommends tools to check conformance to coding standards e.g. A 'linter' such as PyLint for Python

Get inspired: Workflows

Snakemake workflow catalog

Sn Sn	akemake w	orkflow catalo	g		A comprehe	nsive catalog of standards
	Standardiz	zed usage <mark>155</mark>	All workflows 2214			
		Workflow	¢	Description	Topics	QC
	Usage	snakemake-wo deseq2	rkflows/rna-seq-star-	RNA-seq workflow using STAR and DESeq2	snakemake, sciworkflows, reproducibility, gene-expression-analysis, deseq2	license MIT last commit last saturday linting passed formatting passed
	Usage	snakemake-wo gatk-variant-ca	rkflows/dna-seq- Iling	This Snakemake pipeline implements the GATK best- practices workflow	reproducibility, snakemake, sciworkflows, genomic-variant-calling, gatk	license MET last commit may 2021 linting passed formatting failed
	Usage	franciscozorrill	a/metaGEM	:gem: An easy-to-use workflow for generating context specific genome-scale metabolic models and predicting metabolic interactions within microbial communities directly from metagenomic data	metagenomics, computational-biology, metabolic-models, gut- microbiome, snakemake, community-simulations, metagenome- assembled-genomes, microbial-communities, mags, metabolism, bioinformatics, fba, flux-balance-analysis, genome-scale-metabolic-model, genome-scale-model, metabolic-modeling	license MIT last commit march linting failed formatting failed
	Usage	snakemake-wo varlociraptor	rkflows/dna-seq-	A Snakemake workflow for calling small and structural variants under any kind of scenario (tumor/normal, tumor/normal/relapse, germline, pedigree, populations) via the unified statistical model of Varlociraptor.	varlociraptor, sciworkflows, snakemake, reproducibility, genomic-variant- calling	license MIT last commit today linting passed formatting passed

https://snakemake.github.io/snakemake-workflow-catalog/?rules=true

Get inspired: papers with repositories

 + virtually all recent papers from Mohammad
 Akhlaghi and close collaborators Jones+2019: Evolution of compact groups from intermediate to final stages. A case study of the H I content of HCG 16

https://github.com/robertdstein/at2019dsg/tree/master



Stein+2020: A tidal disruption event coincident with a high-energy neutrino

https://github.com/robertdstein/at2019dsg/tree/master

Ramos-Padilla+2021: The viewing angle in AGN SED models, a data-driven analysis

https://github.com/aframosp/AGNView

Reprohacks

Events to review the reproducibility of papers

Community

ReproHack Hub: https://www.reprohack.org/

Papers to review: <u>https://www.reprohack.org/paper/</u>



ReproHack Hub

Building Communities Of Practice In Reproducibility

Find an event near you!
Resources

- Snakemake documentation
 <u>https://snakemake.readthedocs.io/en/stable/index.html</u>
- Open Science Droplets (IAA) https://droplets-spsrc.readthedocs.io/
- Reproducibility course @ CSIC <u>https://github.com/spsrc/reproducibility-course</u>
- SKA Data Challenge reproducibility criteria: <u>https://drive.google.com/file/d/1B2mZ_SYwktvXY-Rbdf0OgIIPuyHBs2UW/view</u>
- The Turing Way https://the-turing-way.netlify.app/index.html
- A Survey on Adoption Guidelines for the FAIR4RS Principles: Dataset <u>https://zenodo.org/record/6375540</u>
- NBIS Reproducible research course
 <u>https://nbis-reproducible-research.readthedocs.io/en/course_1811/snakemake/</u>
- Becoming a better scientist with open and reproducible research <u>https://lgatto.github.io/open-and-rr-2/</u>
- Creating an executable paper is a journey through Open Science <u>https://www.nature.com/articles/s42005-020-00403-4</u>
- Chapter 14 Managing Workflows with Snakemake
 <u>https://eriqande.github.io/eca-bioinf-handbook/snakemake-chap.html</u>
- Five recommendations Endorse for fair software <u>https://fair-software.eu/</u>
- Analysis preservation using Snakemake <u>https://mstamenk.github.io/2017/08/snakemake-tutorial-for-data-analysts.html</u>