

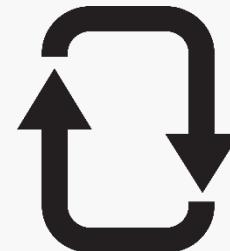
# [article+code+data]: A virtuous triptych towards reproducible research



Research



Publish



Reproduce

Franck MICHEL



# Agenda

- Overview of Open Science
- Reproducible research
  - The reproducibility crisis
  - Vocabulary
  - Incentives and rewards
- Make code and data findable, accessible, referenceable & citable
  - Importance of Persistent Identifiers (PID)
  - Citation guidelines
  - Public repositories + focus on Software Heritage
- Giving credit: citing article, code & data alike

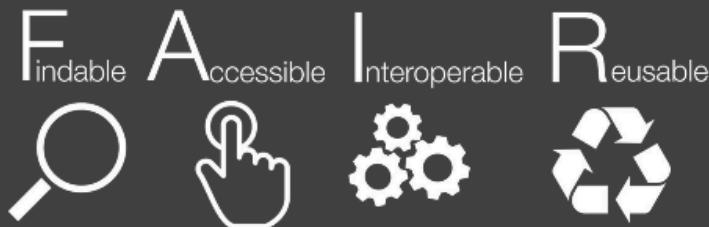
# Science



# Open Science

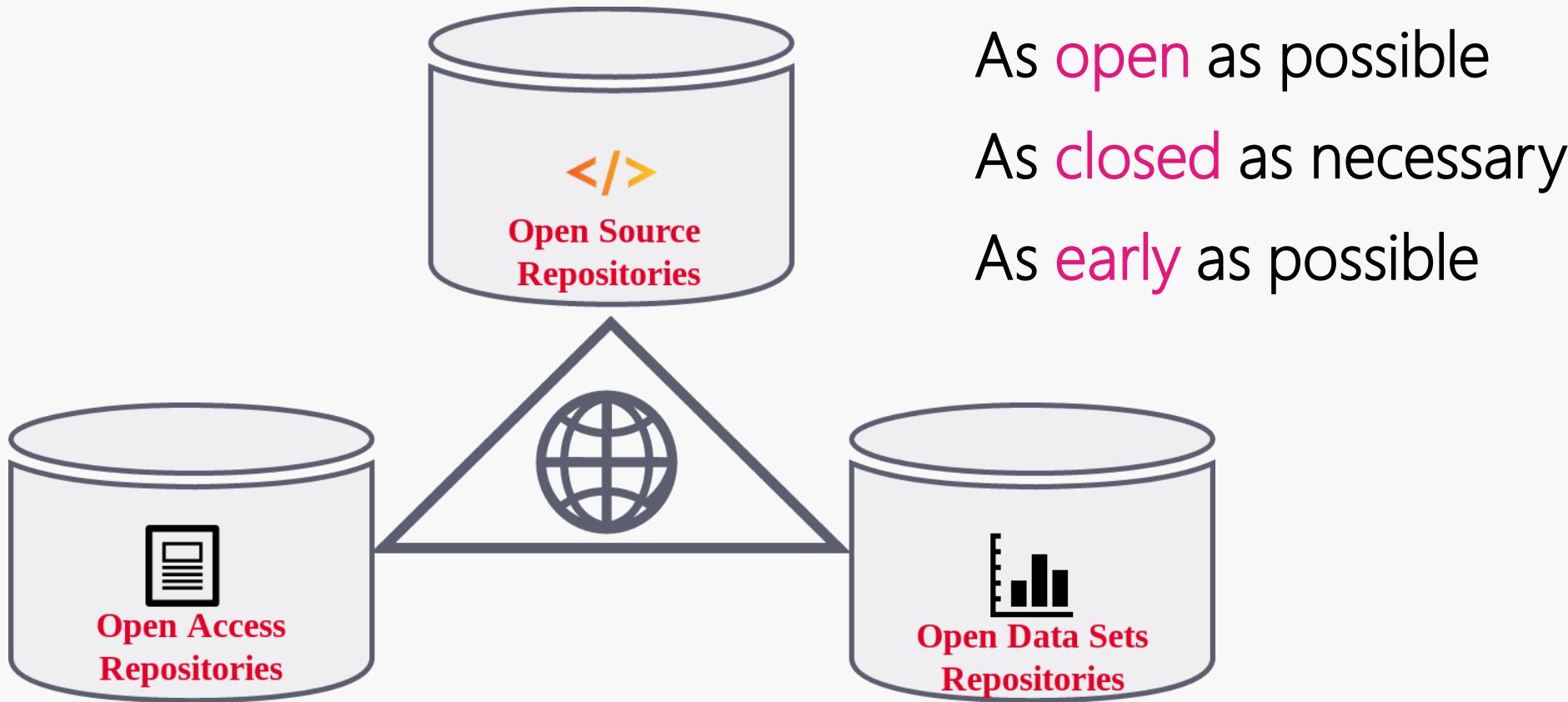
*"is the unhindered spreading of the results, methods and products of scientific research.*

*It is based on the (...) **open access to publications** and, as much as possible, to **data, source code and research methods**."*\*  
\*



\*: translated from <https://www.ouvririrlascience.fr/deuxieme-plan-national-pour-la-science-ouverte/>

# The Three Pillars of Open Science



Source: Software Heritage, 2019. <https://www.softwareheritage.org/save-and-reference-research-software/>

# What benefits are expected from Open Science?

- Foster **reproducible research**:
  - A cornerstone of the scientific method: transparency and sharing of methods/code/data allow other researchers to reproduce experiments, verify results
  - Non reproducible research is not science!
- Make **scientific knowledge accessible** to **everyone**, regardless of location, institution or financial resources
- Increase **scientific integrity**
- Foster more effective **collaboration** of researchers across disciplines, institutions...
- Increase **creativity** through collective intelligence
- **Accelerate** scientific discovery and innovation: easier to build upon others' work, reuse vs. redo
- Increase **public trust** in science by making scientific research more accessible and understandable to non-experts.

*How to verify or measure these claims?*

S. Friesike, B. Fecher, & G.G. Wagner. Open science: One term, five schools of thought. In *Opening science* (pp. 17-47). Springer International Publishing (2014). DOI: 10.1007/978-3-319-00026-8\_2

# Open Science: a widely shared concern



UNESCO. UNESCO Recommendation on Open Science (2021). <https://www.unesco.org/en/legal-affairs/recommendation-open-science>

European Commission, Directorate-General for Research and Innovation. Horizon Europe, open science : early knowledge and data sharing, and open collaboration. Publications Office of the European Union (2021). <https://data.europa.eu/doi/10.2777/18252>

Ministère de l'ES, la Recherche et l'Innovation. Deuxième Plan national pour la science ouverte (2021). <https://www.ouvrirlascience.fr/deuxieme-plan-national-pour-la-science-ouverte/>

National Academies of Sciences, Engineering, and Medicine, Policy and Global Affairs, Board on Research Data and Information, Committee on Toward an Open Science Enterprise. Open Science by Design: Realizing a Vision for 21st Century Research (2018).

# Open Science @ UniCA



Recherche & Innovation / Science ouverte

## SCIENCE OUVERTE

**SCIENCE OUVERTE**

Science Ouverte à Université Côte d'Azur

Identifiants chercheurs

Publications

Données de la recherche

Accompagnement à la Science Ouverte

Contacts

La science ouverte est la diffusion sans entrave des résultats, des méthodes et des produits de la recherche scientifique. Cette démarche globale s'oppose à la privatisation du savoir scientifique et aux limitations induites à sa diffusion pour restaurer son rôle sociétal, démocratique et rétablir les conditions de son fonctionnement comme science efficace et de qualité.

Université Côte d'Azur soutient fermement cette dynamique en proposant un panel de services destinés à favoriser l'ouverture des publications et des données produites par ses chercheurs.

POUR VOUS AIDER

La [cellule Appui à la Recherche](#) est à votre disposition pour vous accompagner sur toutes questions relatives à vos publications ou à vos données.

### PLATEFORMES ET OUTILS D'UNIVERSITÉ CÔTE D'AZUR AU SERVICE DES CHERCHEURS

HAL UNIVERSITÉ CÔTE D'AZUR

PLATEFORME DE REVUES ÉPI-REVEL

ENTREPÔT DE DONNÉES UNIVERSITÉ CÔTE D'AZUR

Ulysseus

ENTREPÔT DE L'UNIVERSITÉ EUROPÉENNE ULYSSEUS

hum@zur BIBLIOTHÈQUE NUMÉRIQUE HUMAZUR

<https://univ-cotedazur.fr/recherche-innovation/science-ouverte>

Trainings & masterclasses for PhD/master students and researchers

(<https://univ-cotedazur.fr/recherche-innovation/science-ouverte/acc陪agnement-a-la-science-ouverte/formations-a-la-science-ouverte>)

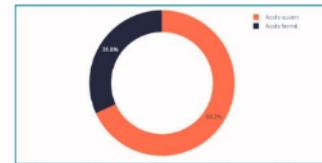
Multiple resources & guides

- Publishing articles/manuscripts in open access
- Licenses
- Where to store data, how to write a DMP
- DOIs, researcher ids...
- Open Science Barometer

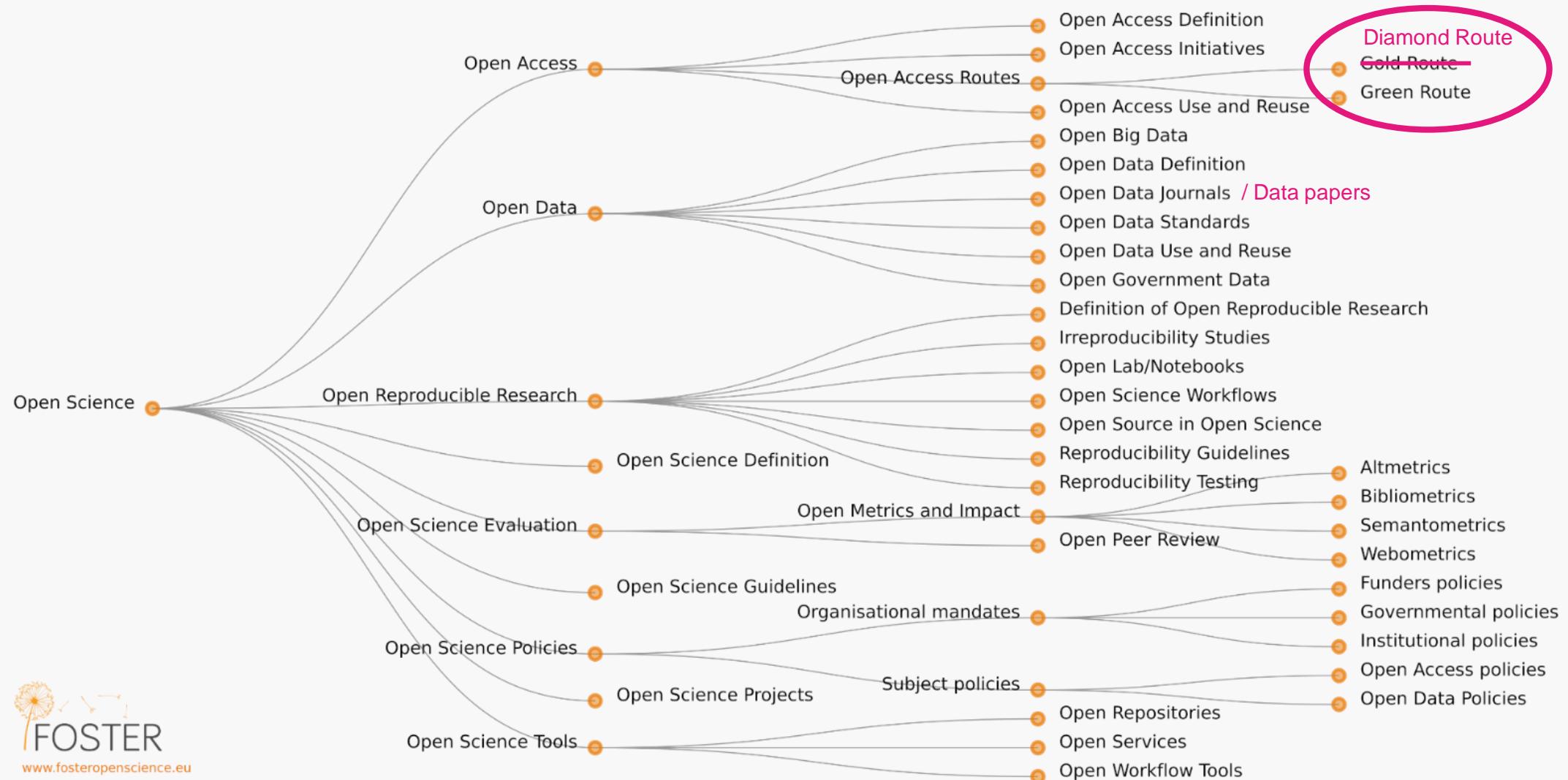
(<https://apps-scd.univ-cotedazur.fr/barometre-science-ouverte/dashboard-publications>)

**68,2% Taux d'ouverture des publications à Université Côte d'Azur**

Le [baromètre de la science ouverte](#) mesure la progression de l'ouverture des publications scientifiques produites par Université Côte d'Azur.

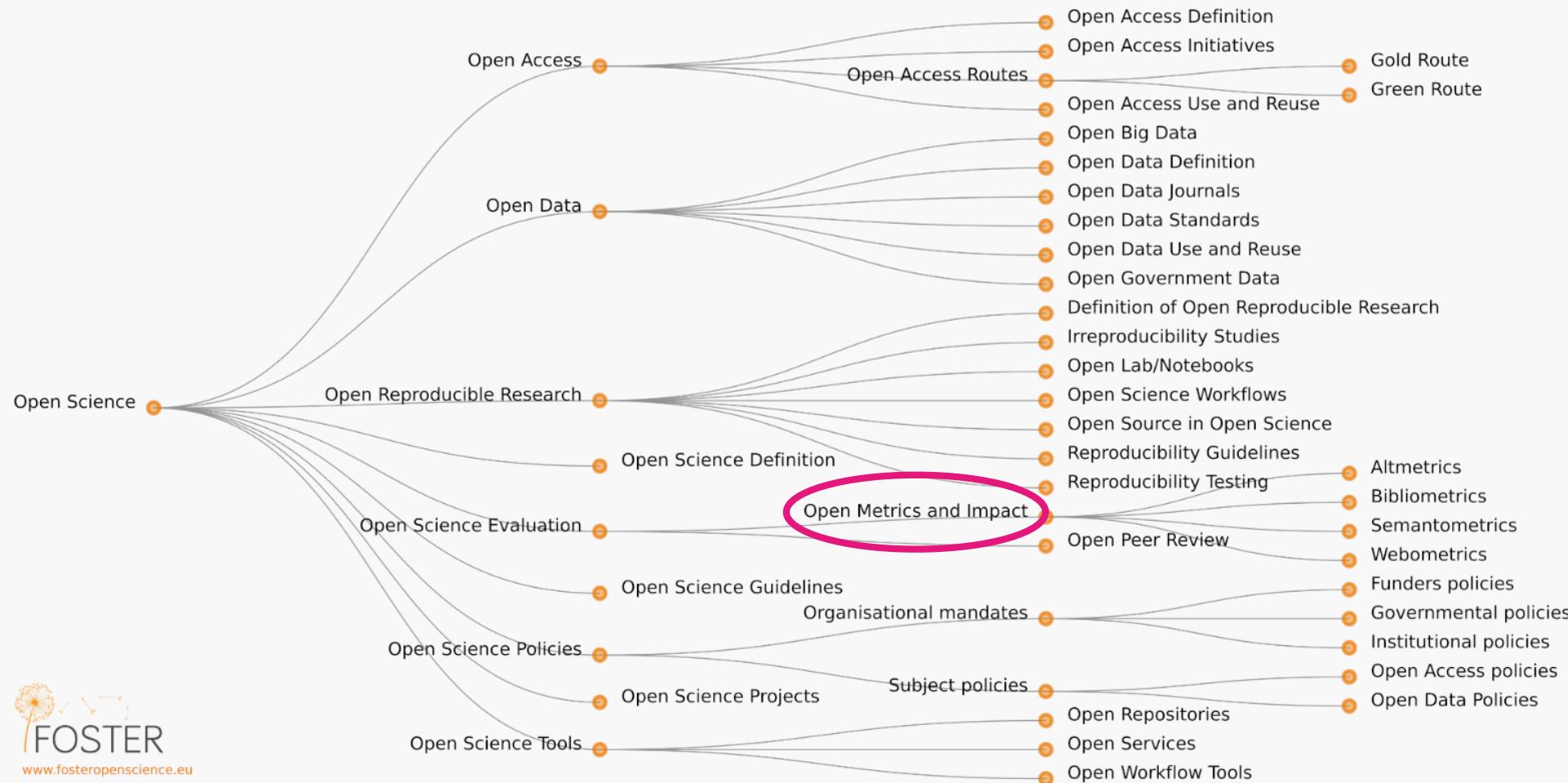


# How can I do my part? Check the OS taxonomy!



Source: <https://www.fosteropenscience.eu/taxonomy/term/134>

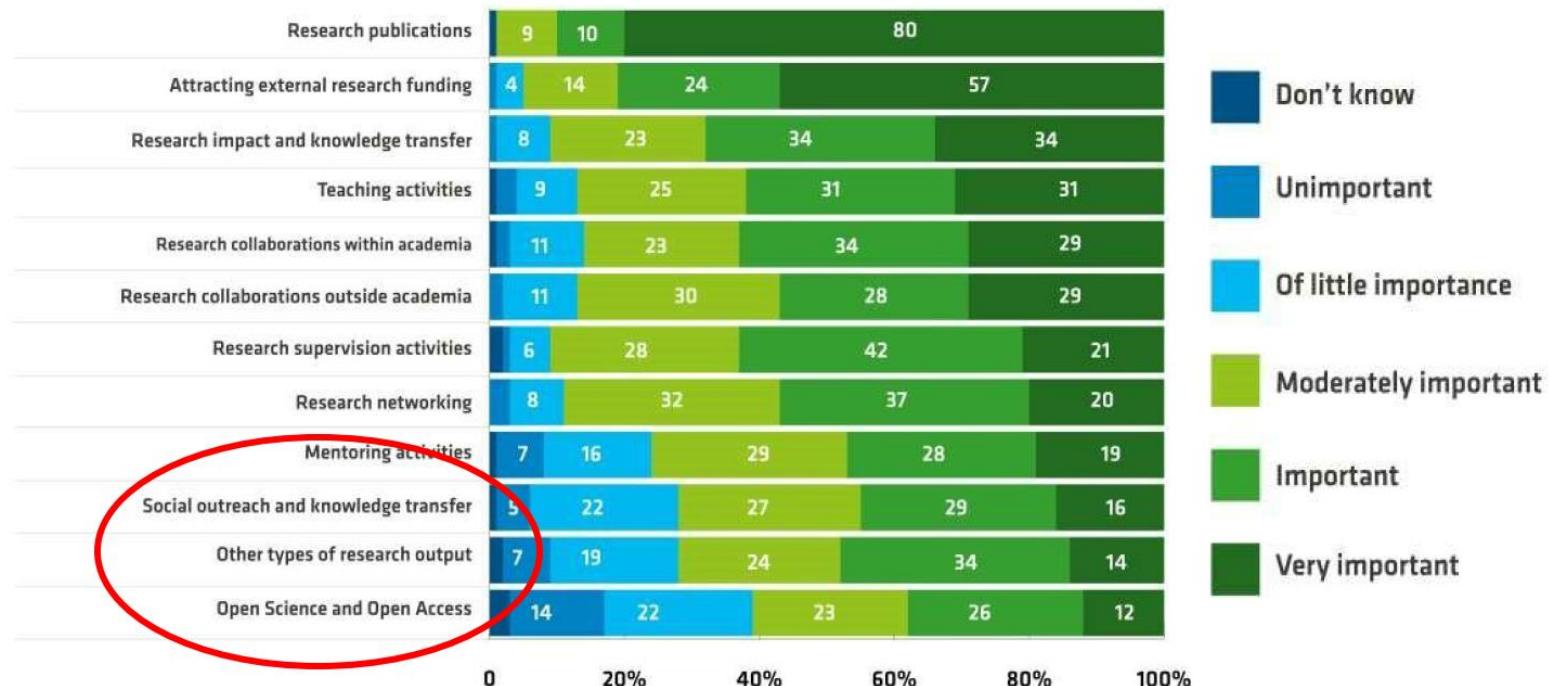
# How can I do my part? Check the OS taxonomy!



Declaration on Research Assessment (DORA) <https://fdora.org/read/>  
Coalition for Advancing Research Assessment (CoARA) <https://coara.eu/>

# Current rewards system

Which types of academic work matter most for research careers?

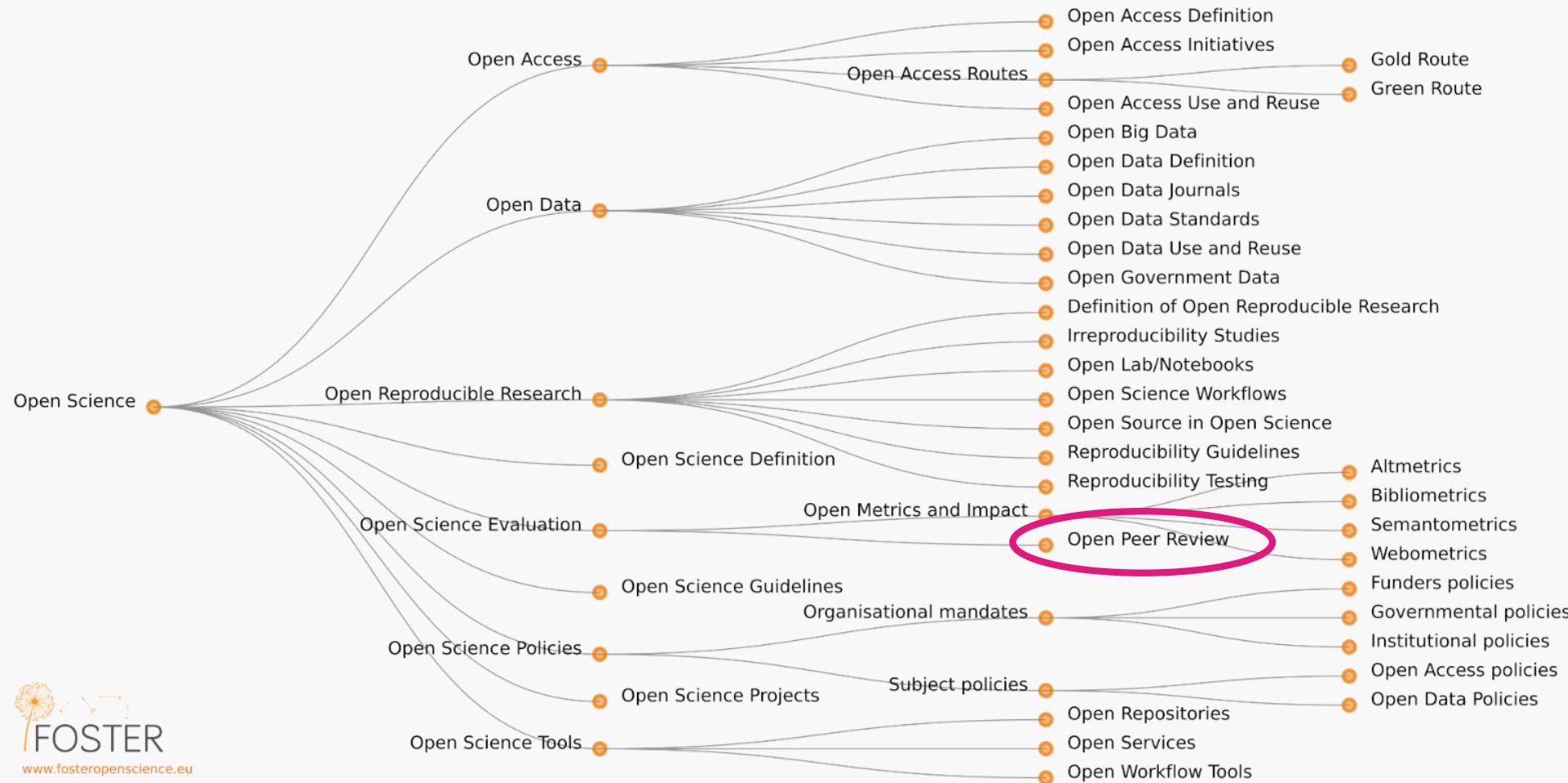


Source: EUA, 2019 Open Science survey of Universities



Slide by Kostas Glinos. Challenges for the 21<sup>st</sup> century science.  
Open Science Seminar, University Côte d'Azur, 2023-05-05.  
<https://drive.google.com/drive/folders/1ARjE-G8vWeSPmygLcMZiiVWmXKh1SDAk>

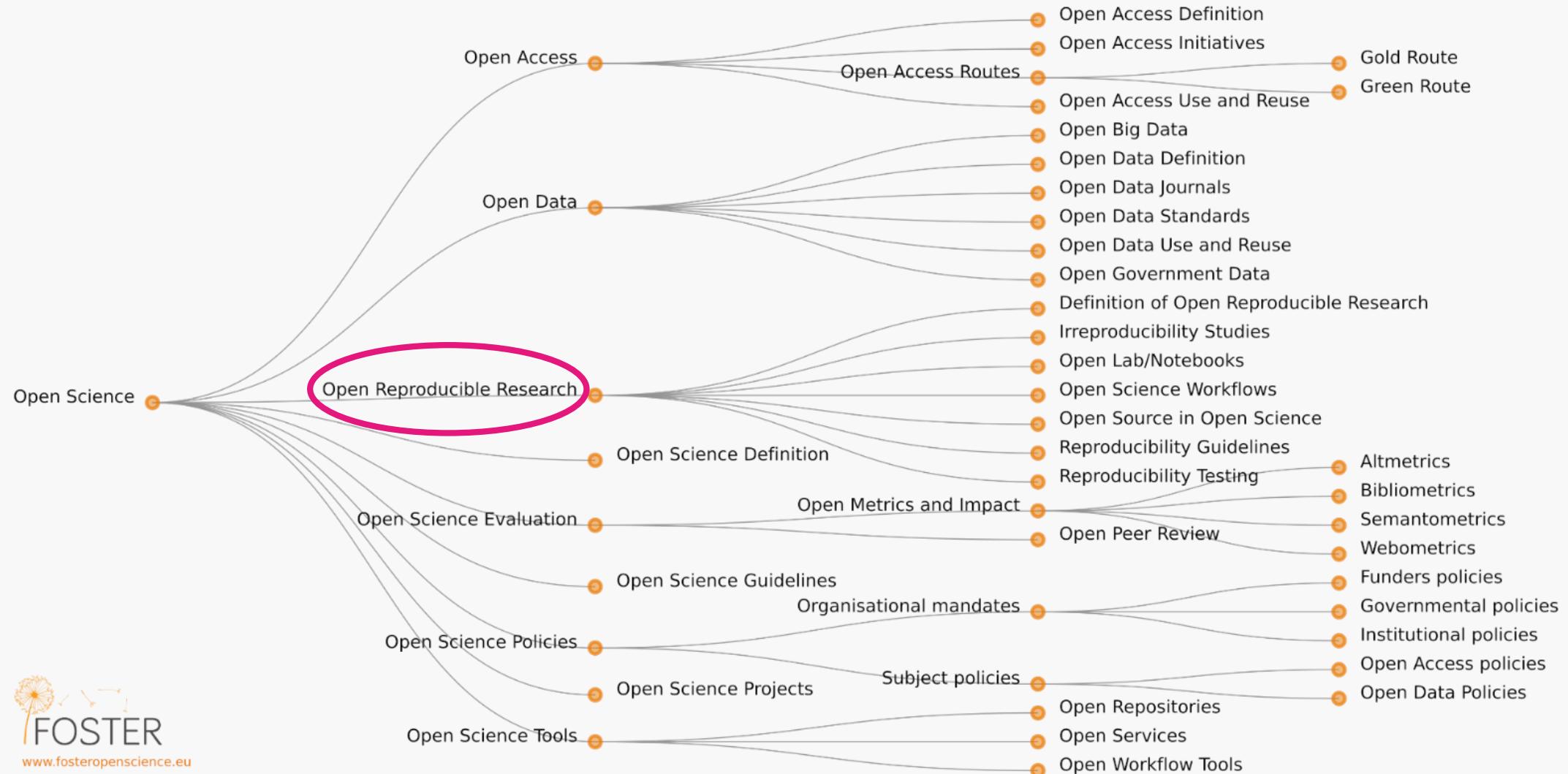
# How can I do my part? Check the OS taxonomy!



*"20% of the researchers performed 69% to 94% of the reviews. Among researchers actually contributing to peer review, 70% dedicated 1% or less of their research work-time to peer review while 5% dedicated 13% or more of it".*

M. Kovanis, R. Porcher, P. Ravaud, L. Trinquart. The Global Burden of Journal Peer Review in the Biomedical Literature: Strong Imbalance in the Collective Enterprise. PLOSOne, 2016. <https://doi.org/10.1371/journal.pone.0166387>

# How can I do my part? Check the OS taxonomy!



Source: <https://www.fosteropenscience.eu/taxonomy/term/134>

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- Giving credit: citing article, code & data alike

# The “crisis” of reproducibility



Repeat  
Replicate  
Reproduce  
Reuse



Same words used differently in different contexts.

L. A. Barba. Terminologies for Reproducible Research. ArXiv preprint. 2018, <https://doi.org/10.48550/arXiv.1802.03311>.

# Repeat

Same experiment

Same setup

Same lab

S. Cohen-Boulakia, K. Belhajjame, O. Collin, J. Chopard, C. Froidevaux, A. Gaignard, K. Hinsen, P. Larmande, Y. Le Bras, F. Lemoine, F. Mareuil, H. Ménager, C. Pradal, C. Blanchet. **Scientific workflows for computational reproducibility in the life sciences: Status, challenges and opportunities.** Future Generation Computer Systems, Volume 75, 2017, <https://doi.org/10.1016/j.future.2017.01.012> .

# Repeat > Replicate

Same experiment	Same experiment
Same setup	Same setup
Same lab	<del>Same lab</del>

S. Cohen-Boulakia, K. Belhajjame, O. Collin, J. Chopard, C. Froidevaux, A. Gaignard, K. Hinsen, P. Larmande, Y. Le Bras, F. Lemoine, F. Mareuil, H. Ménager, C. Pradal, C. Blanchet. **Scientific workflows for computational reproducibility in the life sciences: Status, challenges and opportunities.** Future Generation Computer Systems, Volume 75, 2017, <https://doi.org/10.1016/j.future.2017.01.012>.

# Repeat > Replicate > Reproduce

Same experiment	Same experiment	Same experiment
Same setup	Same setup	<del>Same setup</del>
Same lab	<del>Same lab</del>	<del>Same lab</del>

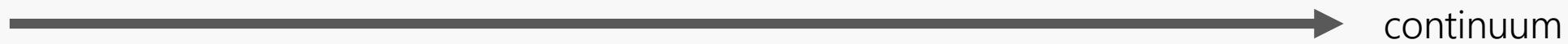
S. Cohen-Boulakia, K. Belhajjame, O. Collin, J. Chopard, C. Froidevaux, A. Gaignard, K. Hinsen, P. Larmande, Y. Le Bras, F. Lemoine, F. Mareuil, H. Ménager, C. Pradal, C. Blanchet. **Scientific workflows for computational reproducibility in the life sciences: Status, challenges and opportunities.** Future Generation Computer Systems, Volume 75, 2017, <https://doi.org/10.1016/j.future.2017.01.012>.

# Repeat > Replicate > Reproduce > Reuse

Same experiment	Same experiment	Same experiment	New ideas, new experiment, new data
Same setup	Same setup	<del>Same setup</del>	
Same lab	<del>Same lab</del>	<del>Same lab</del>	

S. Cohen-Boulakia, K. Belhajjame, O. Collin, J. Chopard, C. Froidevaux, A. Gaignard, K. Hinsen, P. Larmande, Y. Le Bras, F. Lemoine, F. Mareuil, H. Ménager, C. Pradal, C. Blanchet. **Scientific workflows for computational reproducibility in the life sciences: Status, challenges and opportunities.** Future Generation Computer Systems, Volume 75, 2017, <https://doi.org/10.1016/j.future.2017.01.012>.

# Repeat > Replicate > Reproduce > Reuse



Same experiment	Same experiment	Same experiment	New ideas, new experiment, new data
Same setup	Same setup	<del>Same setup</del>	
Same lab	<del>Same lab</del>	<del>Same lab</del>	

S. Cohen-Boulakia, K. Belhajjame, O. Collin, J. Chopard, C. Froidevaux, A. Gaignard, K. Hinsen, P. Larmande, Y. Le Bras, F. Lemoine, F. Mareuil, H. Ménager, C. Pradal, C. Blanchet. **Scientific workflows for computational reproducibility in the life sciences: Status, challenges and opportunities.** Future Generation Computer Systems, Volume 75, 2017, <https://doi.org/10.1016/j.future.2017.01.012>.



# Repeat > Replicate > Reproduce > Reuse

Same experiment

Same experiment

Same experiment

New ideas,

Same setup

Same setup

~~Same setup~~

new experiment,

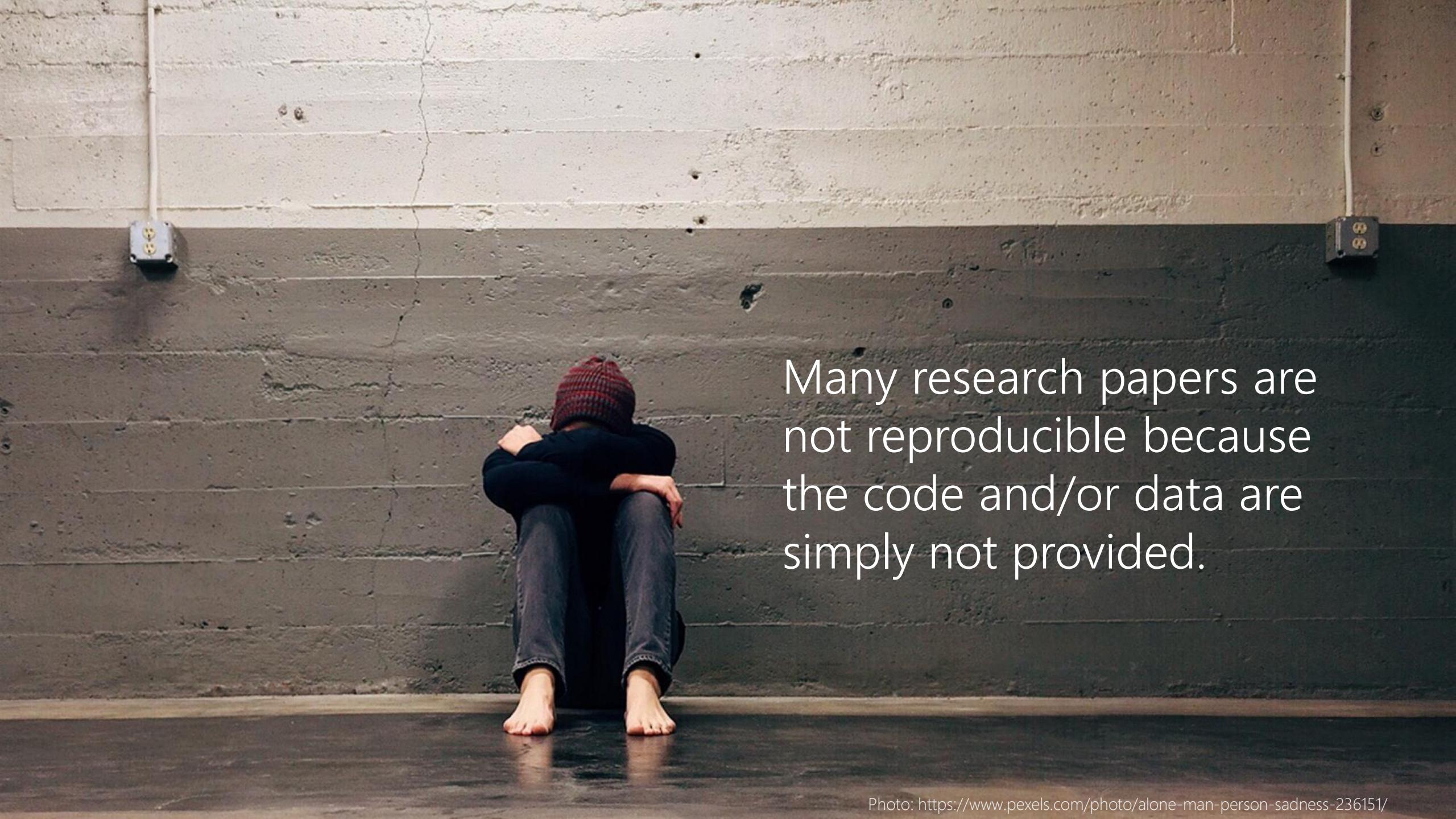
Same lab

~~Same lab~~

~~Same lab~~

new data

S. Cohen-Boulakia, K. Belhajjame, O. Collin, J. Chopard, C. Froidevaux, A. Gaignard, K. Hinsen, P. Larmande, Y. Le Bras, F. Lemoine, F. Mareuil, H. Ménager, C. Pradal, C. Blanchet. **Scientific workflows for computational reproducibility in the life sciences: Status, challenges and opportunities.** Future Generation Computer Systems, Volume 75, 2017, <https://doi.org/10.1016/j.future.2017.01.012>.

A photograph of a person sitting alone against a concrete wall, symbolizing sadness or lack of reproducibility.

Many research papers are  
not reproducible because  
the code and/or data are  
simply not provided.

# What is the problem?

- Some important choices may only be in the code (e.g. architecture, hyperparams, protocols, ...)
- The method works with the authors' data but not with yours. Beyond applicability scope? Flaw?
- Hardly possible to verify results, and therefore build upon the original work



Munafò, M., Nosek, B., Bishop, D. et al. A manifesto for reproducible science. *Nat Hum Behav* 1, 0021 (2017). <https://doi.org/10.1038/s41562-016-0021>

EC, Directorate-General for Research and Innovation, Baker, L., Cristea, I., Errington, T., et al., Reproducibility of scientific results in the EU: scoping report, Lusoli, W. (editor), Publications Office, 2020, <https://data.europa.eu/doi/10.2777/341654>

# What is the problem?

nature

Explore content ▾ About the journal ▾ Publish with us ▾ Subscribe

nature > matters arising > article

Matters Arising | Published: 14 October 2020

## Transparency and reproducibility in artificial intelligence

Benjamin Haibe-Kains , George Alexandru Adam, Ahmed Hosny, Farnoosh Khodakarami, Massive Analysis Quality Control (MAQC) Society Board of Directors, Levi Waldron, Bo Wang, Chris McIntosh, Anna Goldenberg, Anshul Kundaje, Casey S. Greene, Tamara Broderick, Michael M. Hoffman, Jeffrey T. Leek, Keegan Korthauer, Wolfgang Huber, Alvis Brazma, Joelle Pineau, Robert Tibshirani, Trevor Hastie, John P. A. Ioannidis, John Quackenbush & Hugo J. W. L. Aerts

Nature 586, E14–E16 (2020) | [Cite this article](#)

18k Accesses | 121 Citations | 548 Altmetric | [Metrics](#)

 [Matters Arising](#) to this article was published on 14 October 2020

 The [Original Article](#) was published on 01 January 2020

ARISING FROM S. M. McKinney et al. *Nature* <https://doi.org/10.1038/s41586-019-1799-6> (2020)

<https://www.nature.com/articles/s41586-020-2766-y> (2020)

"The lack of access to code and data in prominent scientific publications may lead to **unwarranted and even potentially harmful clinical trials**. (...)

Making one's methods reproducible may **surface biases or shortcomings** to authors before publication.

Preventing external validation of a model will likely **reduce its impact**, as it also prevents other researchers from using and building upon it in future studies."

# What is the problem?

BANQUE DE FRANCE  
EUROSYSTÈME

## Publications

### Working Paper Series no. 853: The Reproducibility of Economics Research: A Case Study

By Herbert Sylvérie, Kingi Hautahi, Stanchi Flavio, Vilhuber Lars

Given the importance of reproducibility for the scientific ethos, more and more journals have pushed for transparency of research through data availability policies. If the introduction and implementation of such data policies improve the availability of researchers' code and data, what is the impact on reproducibility? We describe and present the results of a large reproduction exercise in which we assess the reproducibility of research articles published in the American Economic Journal: Applied Economics, which has implemented a data availability policy since 2005. Our replication success rate is relatively moderate, with 37.78% of replication attempts successful. 68 of 162 eligible replication attempts successfully replicated the article's analysis (41.98%) conditional on non-confidential data. A further 69 (42.59%) were at least partially successful. A total of 98 out of 303 (32.34%) relied on confidential or proprietary data, and were thus not reproducible by this project. We also conduct several bibliometric analyses of reproducible vs. non-reproducible articles and show that replicable papers do not provide citation bonuses for authors.

<https://publications.banque-france.fr/en/reproducibility-economics-research-case-study> (2021)

BMC Part of Springer Nature

## Molecular Brain

Home About Articles Submission Guidelines

Editorial | Open Access | Published: 21 February 2020

### No raw data, no science: another possible source of the reproducibility crisis

Tsuyoshi Miyakawa [✉](#)

*Molecular Brain* 13, Article number: 24 (2020) | [Cite this article](#)  
56k Accesses | 88 Citations | 2191 Altmetric | [Metrics](#)

#### Abstract

A reproducibility crisis is a situation where many scientific studies cannot be reproduced. Inappropriate practices of science, such as HARKing, p-hacking, and selective reporting of positive results, have been suggested as causes of irreproducibility. In this editorial, I propose that a lack of raw data or data fabrication is another possible cause of irreproducibility.

As an Editor-in-Chief of *Molecular Brain*, I have handled 180 manuscripts since early 2017 and have made 41 editorial decisions categorized as "Revise before review," requesting that the authors provide raw data. Surprisingly, among those 41 manuscripts, 21 were withdrawn without providing raw data, indicating that requiring raw data drove away more than half of the manuscripts. I rejected 19 out of the remaining 20 manuscripts because of insufficient raw data. Thus, more than 97% of the 41 manuscripts did not present the raw data supporting their results when requested by an editor, suggesting a possibility that the raw data did not exist from the beginning, at least in some portions of these cases.

Considering that any scientific study should be based on raw data, and that data storage space should no longer be a challenge, journals, in principle, should try to have their authors publicize raw data in a public database or journal site upon the publication of the paper to increase reproducibility of the published results and to increase public trust in science.

<https://molecularbrain.biomedcentral.com/articles/10.1186/s13041-020-0552-2> (2020)

# What is the problem?

BANQUE DE FRANCE  
EUROSYSTÈME

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<https://publications.banque-france.fr/en/reproducibility-economics-research-case-study> (2021)

BMC Part of Springer Nature

Molecular Brain

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Editorial | Open Access | Published: 21 February 2020

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### Abstract

A reproducibility crisis is a situation where many scientific studies Inappropriate practices of science, such as HARKing, p-hacking, a positive results, have been suggested as causes of irreproducibility that a lack of raw data or data fabrication is another possible cause

As an Editor-in-Chief of *Molecular Brain*, I have handled 180 manuscripts and have made 41 editorial decisions categorized as "Revise before resubmission". In 2019, I required raw data from the authors provide raw data. Surprisingly, among those 41 manuscripts, 20 manuscripts did not present raw data, indicating that requiring raw data does not always work. Thus, more than 97% of the 41 manuscripts did not present raw data when requested by an editor, suggesting a possibility that raw data is not always available from the beginning, at least in some portions of these cases.

Considering that any scientific study should be based on raw data, and that data storage space should no longer be a challenge, journals, in principle, should try to have their authors publicize raw data in a public database or journal site upon the publication of the paper to increase reproducibility of the published results and to increase public trust in science.

The Economist

Science & technology | Scientific malpractice

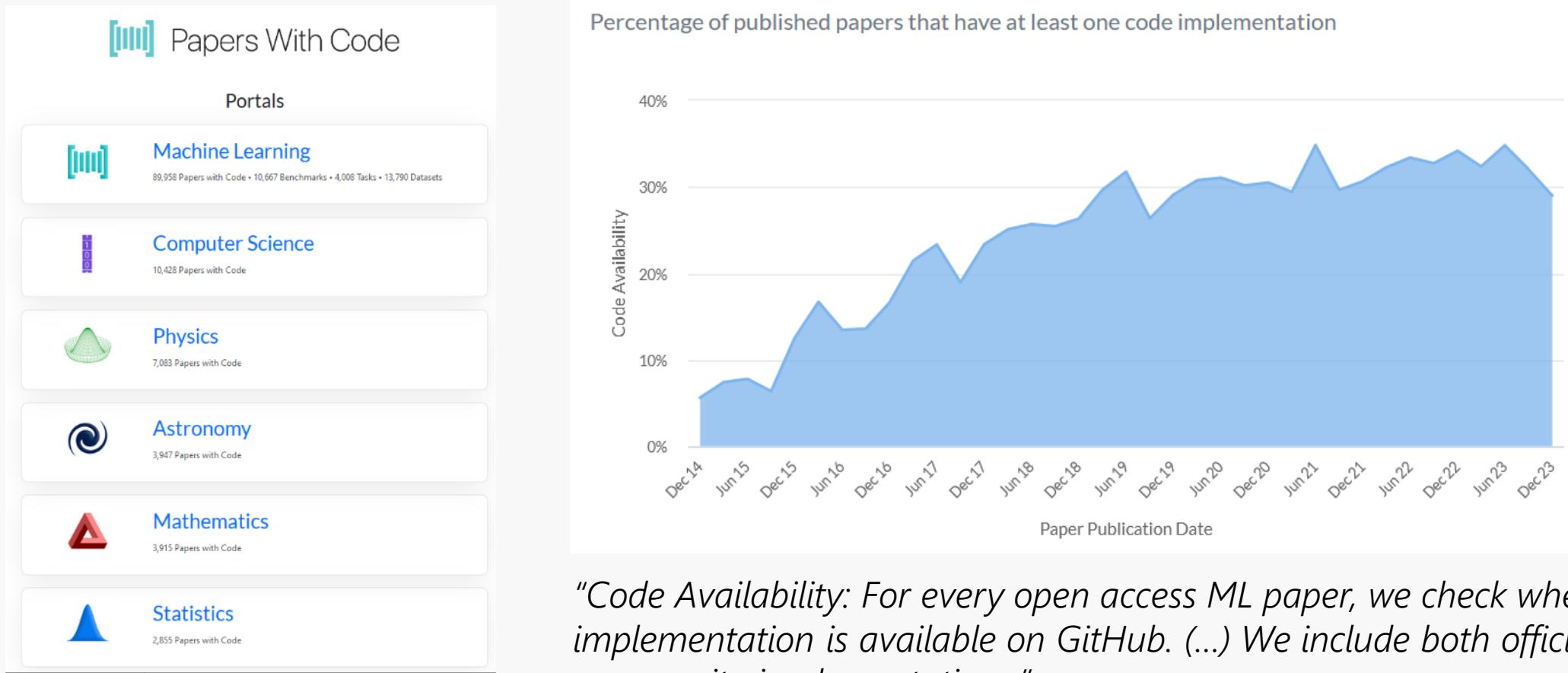
## There is a worrying amount of fraud in medical research

And a worrying unwillingness to do anything about it

Alberto Manguel

<https://molecularbrain.biomedcentral.com/articles/10.1186/s13041-020-0552-2> (2020)

# What is the problem?



# Why publish my [article+code+data] and link them?

- My research is funded by **public grants**, code/data have to be public too
- It **convinces** reviewers that the results in my paper can be trusted
- People can **use** my algorithm and **compare** it with others without having to re-implement it
- Tends to increase the number of **citations** of my paper\*
- It improves **quality**: forces me to organize, document, clean my code & data

\*Colavizza C., Hrynaszkiewicz I., Staden I., Whitaker K., McGillivray B. The citation advantage of linking publications to research data. *PLOS ONE*, 2020, <https://doi.org/10.1371/journal.pone.0230416>

"In 2018, 94% of 21,793 PLOS articles and 88% of 31,956 BMC had data availability statements. In 2017 and 2018, 21% of PLOS and 12% of BMC publications provided **data availability statements containing a link to data** in a repository. (...) association between articles that include statements that link to data in a repository and **up to 25.36% higher citation**"

# Reproducibility incentives?

Availability of code+data not yet a requirement from journals and conferences, but visible uptake.



Photo: <https://www.pexels.com/photo/side-view-of-giving-treats-to-a-dog-8473725/>

# Uptake of reproducibility requirement?

- Reproducibility checklist for reviewers  
IJCAI, AAAI, NAACL, MICCAI
- Conference Reproducibility Track  
ISWC, ECIR, SIGIR, ACM Multimedia
- Reproducibility of Results in the ACM Digital Library  
Prototypes of *active digital curation platforms*, close to “executable paper”  
<https://www.acm.org/publications/reproducibility>
- Replicability Stamp for papers published in some journals  
<https://www.acm.org/publications/policies/artifact-review-and-badging-current>  
<http://www.replicabilitystamp.org/>  
(graphics community effort)



available, functional, reusable, reproduced, replicated

# Data availability incentives?

Some journals implement a **data availability policy** ranging from encouragement to requirement:

- Springer data policies: 4 policies to apply to different journals  
<https://www.springernature.com/gp/authors/research-data-policy/research-data-policy-types>
  - Springer Scientific Data - *Data sharing, evidence of data sharing and peer review of data required*
  - Springer Humanities and Social Science Communications: *Data sharing encouraged and statements of data availability required*
- Cell Discovery, Nature
  - *Data sharing encouraged and statements of data availability required*
- International Economic Review <https://economics.sas.upenn.edu/ier/submissions/data-availability-policy>
- IOP Publishing data availability policy <https://publishingsupport.iopscience.iop.org/iop-publishing-data-availability-policy/>
- Set of Data Availability policies: <https://www.lib.uiowa.edu/data/cite-data-and-code/#availability>

# How do I get rewarded?

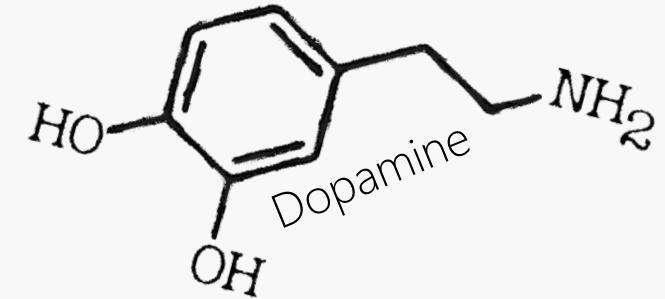
Data: **Data Paper** (data journal)

Code: **Software Paper** (research software journal)

Data or code: **Resource Track Paper** (conference)

Advantage: it's a regular citable paper

Fits in existing citation fw, accounted for in common citation indicators



Examples of Data Journals:

- Biomedical Data Journal
- Biodiversity Data Journal
- Elvevier Data in Brief
- Nature Scientific Data

Examples of Software Journals:

- Journal of Open Source Software
- Open Research Software
- ScienceDirect SoftwareX
- BMC Neuroscience

But we want to cite data/code,  
not (*only*) data/software papers!

# Agenda

- Overview of Open Science
- Reproducible research
  - The reproducibility crisis
  - Vocabulary
  - Incentives and rewards
- Make code and data findable, accessible, referenceable & citable
  - Importance of Persistent Identifiers (PID)
  - Citation guidelines
  - Public repositories + focus on Software Heritage
- Giving credit: citing article, code & data alike

Reproducibility requires to  
make code and data **FARC\***



\*Findable, Accessible, Referenceable, Citable

# FARC: Findable Accessible Referenceable Citable

- **Findable:** publish rich metadata
  - Title, Authors/publishers
  - Dates (first publication, release),
  - Version
  - License
  - Provenance
  - Persistent identifier (PID)
  - ...
- **Accessible:** published on sustainable public repository
- **Citable:** give credit, attribution
- **Referenceable:** exact version of code/data for reproducibility

# *PID “is all you need!”*

- Name a resource unambiguously
- Associate metadata to a resource
- Cite a resource
- Reference a version of a resource

# Add (*human-readable*) citation guidelines for your code and data

README.\* of a repository, or citation field in the metadata etc.

https://github.com/frmichel/taxref-ld/ 

## Cite this work

When mentioning TAXREF-LD in a publication or when redistributing it, please cite this way:

TAXREF-LD: Knowledge Graph of the French taxonomic registry. Franck Michel, Catherine FARON, Sandrine TERCERIE, Olivier GARGOMINY. 2017-2022. DOI: [10.5281/zenodo.6940891](https://doi.org/10.5281/zenodo.6940891)

## Reference(s)

[1] Michel F., Gargominy O., Tercerie S. & Faron-Zucker C. (2017). A Model to Represent Nomenclatural and Taxonomic Information as Linked Data. Application to the French Taxonomic Register, TAXREF. In *Proceedings of the 2nd International Workshop on Semantics for Biodiversity (S4BioDiv) co-located with ISWC 2017*. CEUR vol. 1933. Vienna, Austria.

Drawback: human-readable only

# Add (*machine-readable*) citation guidelines for your code and data

## Citation File Format (CFF)

CITATION.cff: plain text file with human- and machine-readable citation information for software and datasets to let others know how to correctly cite them.

<https://citation-file-format.github.io/>

The diagram illustrates the generation of citation metadata from a GitHub repository. On the left, a screenshot of a GitHub repository page shows the CITATION.cff file content. This file defines a software citation with a version of 1.2.0, titled 'SPARQL Micro-Services', and includes author information for Franck Michel. An arrow points from this file to a larger screenshot on the right, which displays the generated citation details. The right screenshot shows a 'Cite this repository' section for an APA and BibTeX citation. It includes a link to the Readme and the Apache-2.0 license, and a prominent 'Cite this repository' button, which is highlighted with a red dashed circle. Below this, a preview of the citation in APA style is shown: 'Michel, F. (2022). SPARQL Micro-Services (Vers'. A 'View citation file' button is also present.

Generation form: <https://citation-file-format.github.io/cff-initializer-javascript/#/start>

Supported by Github, Zenodo, Zotero's browser plugin.

# Make **DATA** findable, accessible, referenceable

Where do I publish my data?

French p/f:

<https://www.data.gouv.fr/>

<https://recherche.data.gouv.fr/> (PNSO2)

*"To be used when there is no well-adopted domain or community specific repository."*

Spaces and collections per institution, laboratory...

[https://entrepot.recherche.data.gouv.fr/dataverse/\[univ-cotedazur|inria|cnrs|I3S\]](https://entrepot.recherche.data.gouv.fr/dataverse/[univ-cotedazur|inria|cnrs|I3S])

Research or general-purpose repositories, e.g.:

**Zenodo** (doi): by OpenAire (European infrastructure that supports Open Sc.)

**Figshare** (doi): hosted by Digital Science, a subsidiary of Springer Nature

**Internet Archive** (ark)

# Make DATA findable, accessible, referenceable

Where do I publish my data? (cont.)

Institutional or community data repositories

Find a repo on **OpenDOAR**: Directory of Open Access Repositories

Faceted search by country, domain, type of research object...

(<https://v2.sherpa.ac.uk/opendoar/>)

Fenner, M., Crosas, M., Grethe, J.S. et al. A data citation roadmap for scholarly data repositories. *Sci Data* 6, 28 (2019).  
<https://doi.org/10.1038/s41597-019-0031-8>

Force11 Data Citation. **Data Citations: A Primer**. (2016). Retrieved December 22, 2016. From <http://force11.github.io/data-citation-primer/>

Task Group on Data Citation Standards and Practices, C.-I., 2013. **Out of Cite, Out of Mind: The Current State of Practice, Policy, and Technology for the Citation of Data**. *Data Science Journal*, 12, pp.CIDCR1–CIDCR7. <http://doi.org/10.2481/dsj.OSOM13-043>

# Make CODE findable, accessible, referenceable, citable

Where do I publish my code?

Public/institutional CVS: Github, Gitlab, Bitbucket, Redmine.

No guarantee of sustainability/long term preservation.

e.g. Google Code 2006-2016 R.I.P.

Research or general-purpose repositories: Zenodo, Figshare, Internet Archive

**Software Heritage**

**HAL**

Smith AM, Katz DS, Niemeyer KE. FORCE11 Software Citation Working Group. 2016. Software citation principles. *PeerJ Computer Science* 2:e86. DOI: 10.7717/peerj-cs.86

P. Alliez, R. Di Cosmo, B. Guedj, A. Girault, M.S. Hacid, et al.. **Attributing and Referencing (Research) Software: Best Practices and Outlook from Inria**. 2019.  
[⟨hal-02135891v1⟩](https://hal.archives-ouvertes.fr/hal-02135891v1)

# Automatic deposit of code from Github

- Github to Zenodo

Automated on release action (snapshot), gets a DOI

<https://docs.github.com/en/repositories/archiving-a-github-repository/referencing-and-citing-content>



- Github to Figshare



Need to add a GitHub workflow action in the repository

Updates on every change, new version on release action, gets a DOI

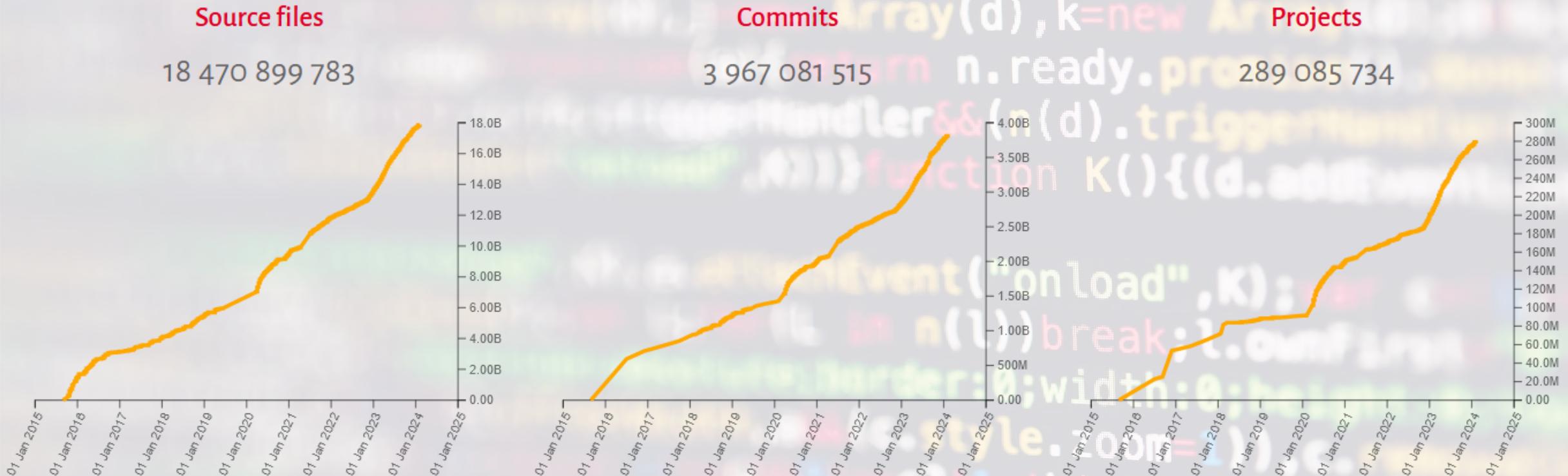
20GB limit.

<https://help.figshare.com/article/how-to-connect-figshare-with-your-github-account>

# Software [is our] Heritage

*"collect, preserve, share  
all software publicly available  
with full dev. history, in source code form"*

# Software Heritage



(2024-03-28)  
<https://archive.softwareheritage.org/>

# Software Heritage persistent Identifiers: SWHIDs

- Intrinsic identifiers: no need for external register
- Do not depend on external resolvers that can be compromised/discontinued
- Resolvable: prepend with <https://archive.softwareheritage.org/>
- Reference a precise point in the sw dev history, independently of releases
- Flexible granularity of referenced content, from project down to code lines

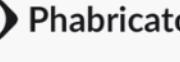
R. D. Cosmo, M. Gruenpeter and S. Zacchirolì. **Referencing Source Code Artifacts: A Separate Concern in Software Citation.** *Computing in Science & Engineering*, vol. 22, no. 2, pp. 33-43, 2020, doi: 10.1109/MCSE.2019.2963148.

Research Data Alliance/FORCE11 Software Source Code Identification WG, Allen, A., Bandrowski, A., Chan, P., di Cosmo, R., Fenner, M., Garcia, L., Gruenpeter, M., Jones, C. M., Katz, D. S., Kunze, J., Schubotz, M., & Todorov, I. T. **Software Source Code Identification Use cases and identifier schemes for persistent software source code identification (1.1).** 2020. DOI: 10.15497/RDA00053

# Software Heritage automatic harvesting

## Regular crawling

These software origins get continuously discovered and archived using the [listers](#) implemented by Software Heritage.

 Bitbucket 2,539,796 origins	 56,983 origins	 git 30,314 origins
 26,984 origins	 debian 136,867 origins	 54,628 origins
 GitHub 205,985,200 origins	 gitiles 10,234 origins	 GitLab 4,246,148 origins
 Guix 50,159 origins	 Gogs 197 origins	 GO 1,095,300 origins
 launchpad 512,317 origins	 Maven 312,428 origins	 heptapod 1,234 origins
 NPM 3,598,076 origins	 Maven 5,098 origins	 NixOS 48,591 origins
 fedora PAGURE 67,596 origins	 Phabricator 201 origins	 Packagist The PHP Package Repository 306,058 origins
 Python Package Index 524,132 origins	 SOURCEFORGE 381,374 origins	 pub.dev 51,029 origins
		 stagit 318 origins

# Software Heritage on-demand harvesting

Github: <https://github.com/marketplace/actions/save-to-software-heritage>

A Gitlab/Github/Bitbucket endpoint using the API:

<https://archive.softwareheritage.org/api/1/origin/save/doc/>

## On demand archival

These origins are directly pushed into the archive by trusted partners using the [deposit](#) service of Software Heritage.



12 origins



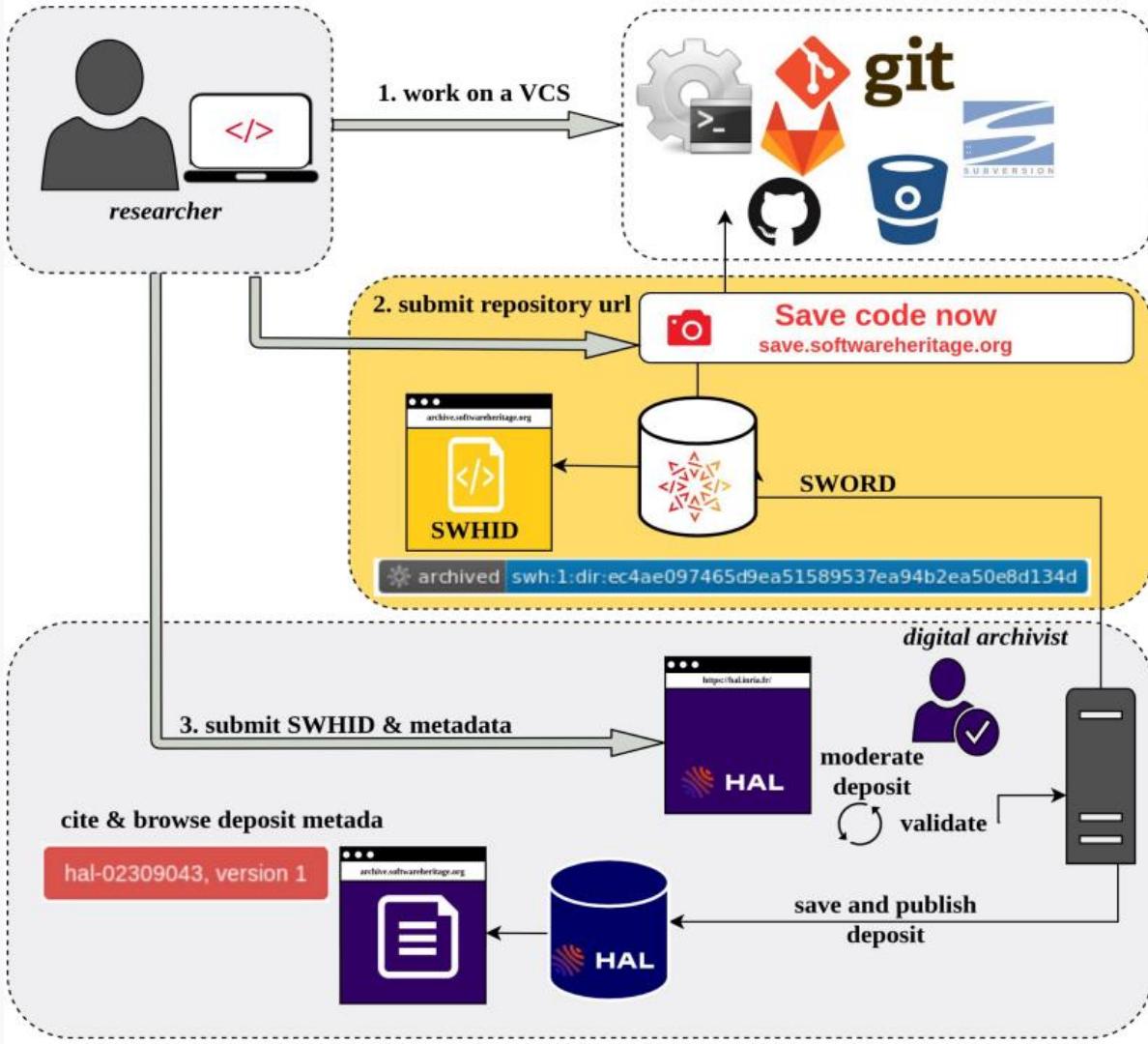
687 origins



193 origins

HAL <https://www.softwareheritage.org/2018/09/28/depositing-scientific-software-into-software-heritage/>

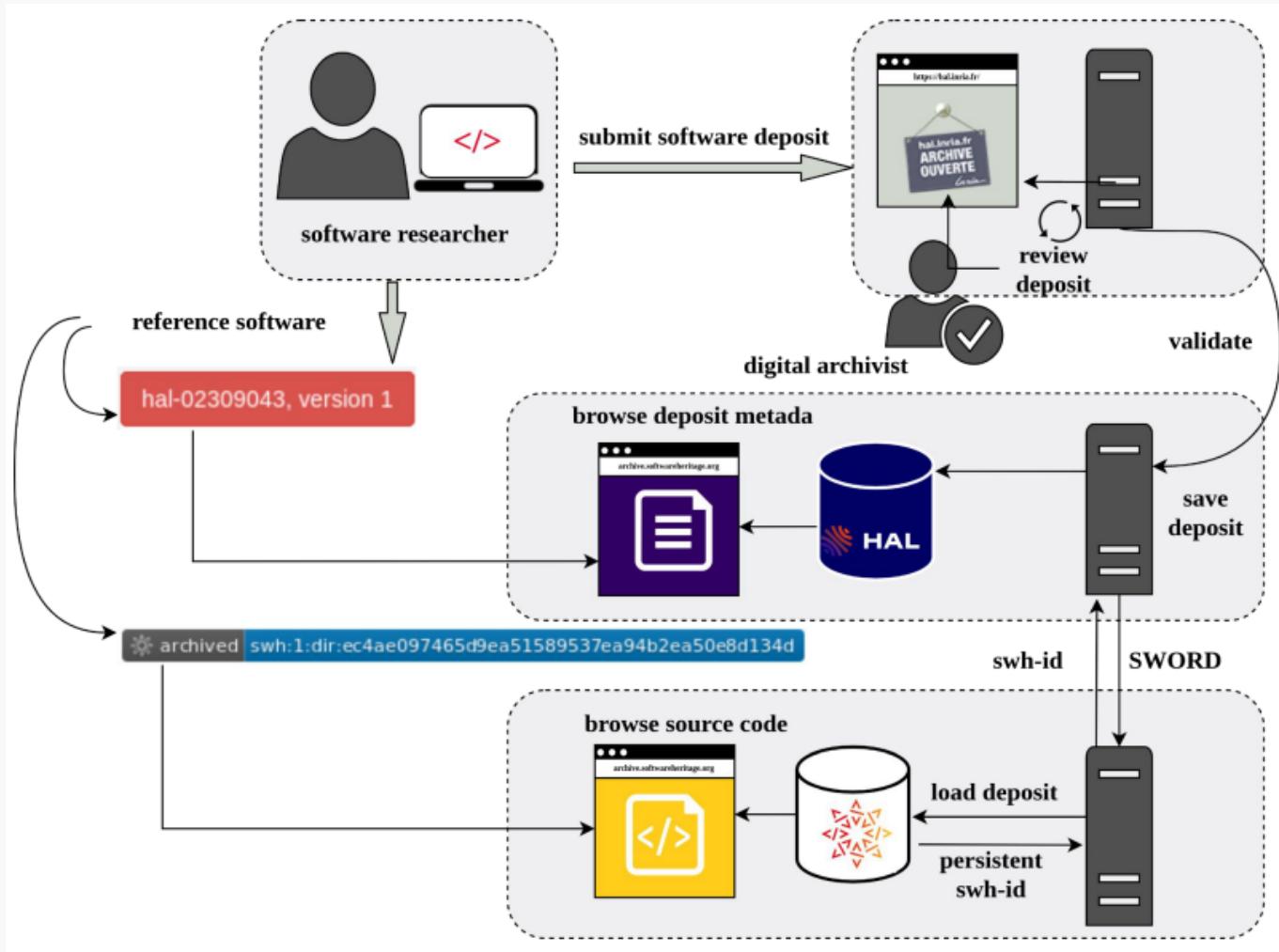
# CVS -> Software Heritage -> HAL



Source:

Morane Gruenpeter, Jozefina Sadowska, Estelle Nivault, Alain Monteil. Create software deposit in HAL: User guide and best practices. [Technical Report] Inria; CCSD; Software Heritage. 2022. [hal-01872189v2](https://hal-01872189v2)

# HAL -> Software Heritage



Source:

Morane Gruenpeter, Jozefina Sadowska, Estelle Nivault, Alain Monteil. Create software deposit in HAL: User guide and best practices. [Technical Report] Inria; CCSD; Software Heritage. 2022. [⟨hal-01872189v2⟩](https://hal.archives-ouvertes.fr/hal-01872189v2)

# Archive and reference with Software Heritage

## 1. Prepare the repository

README

AUTHORS

LICENSE

codemeta.json

# Archive and reference with Software Heritage

## 1. Prepare the repository

README, README.md, README.txt

-> see HAL documentation (<https://hal.inria.fr/hal-01872189v2>)

# Archive and reference with Software Heritage

## 1. Prepare the repository

README

AUTHORS (.md, .rst), CONTRIBUTORS, CREDITS, CITATION, **CITATION.cff**

Recommended to use Inria's taxonomy of contributors (design, architecture, coding, testing...) but other options e.g. [Contributor Role Ontology](#).

Pierre Alliez, Roberto Di Cosmo, Benjamin Guedj, Alain Girault, Mohand-Said Hacid, et al.. **Attributing and Referencing (Research) Software: best Practices and Outlook from Inria.** 2019. <hal-02135891v1>

No recommended file format but common practices:

John Smith

John Smith <john.smith@domain.org>

John Smith <john.smith@domain.org> (<https://homepage.me/johnsmith>)

John Smith - author and maintainer

<john.smith@domain.org>

<https://homepage.me/johnsmith>

# Archive and reference with Software Heritage

## 1. Prepare the repository

README

AUTHORS

LICENSE

Most cases: use the SPDX license list (<https://spdx.org/licenses/>)

SPDX: open standard for communicating license and copyright information used in free/open sw, data, hw or documentation => Find a license, copy its content to your LICENSE file

Mix of licenses, or material with different licenses: use the REUSE guidelines (<https://reuse.software/>). More cumbersome.

# Archive and reference with Software Heritage

## 1. Prepare the repository

README

AUTHORS

LICENSE

codemeta.json

CodeMeta initiative (<https://codemeta.github.io/>): std for sharing metadata about sw across repositories.  
Addresses citation (authors), reproducibility (dependencies/env), discovery (keywords/description)

Jones, M. B., Boettiger, C., Mayes, A. C., Arfon Smith, Slaughter, P., Niemeyer, K., Gil, Y., Fenner, M., Nowak, K., Hahnel, M., Coy, L., Allen, A., Crosas, M., Sands, A., Hong, N. C., Cruse, P., Katz, D., & Goble, C. (2017). **CodeMeta: an exchange schema for software metadata**. KNB Data Repository. DOI: 10.5063/schema/codemeta-2.0

Supported by Github, DataCite, Figshare, Zenodo, NSF.

Format: JSON-LD, mostly relies on schema.org + few extensions.

Issue: does not address contributors roles, only author and contributor.

CodeMeta generator (<https://codemeta.github.io/codemeta-generator/>) + various tools

Example: <https://github.com/frmichel/sparql-micro-service/blob/master/codemeta.json>

# Archive and reference with Software Heritage

## 1. Prepare the repository

README: for humans

AUTHORS for humans, DATA CITATION.cff for machines

LICENSE: for humans (& machines)

codemeta.json: for machines

# Archive and reference with Software Heritage

## 1. Prepare the repository

## 2. Save the code

<https://archive.softwareheritage.org/save/>

The screenshot shows the 'Save code now' page of the Software Heritage archive. At the top, there is a search bar with the placeholder 'Enter a SWHID to resolve or keyword(s) to search for in origin URLs' and a red search icon. Below the search bar, the title 'Save code now' is displayed in red. A descriptive text explains that users can contribute to the archive by submitting an origin save request, and provides instructions to fill in the required info in the form below. The form consists of two input fields: 'Origin type' (set to 'git') and 'Origin url'. Below the form are two buttons: 'Help' and 'Browse save requests'. A note below the form states that a 'Save code now' request takes the following parameters: 'Origin type' (Git, Mercurial, Subversion, Bazaar) and 'Origin url' (the URL of the remote repository). It also provides instructions for using the command line to check if the URL is valid before submission.

You can contribute to extend the content of the Software Heritage archive by submitting an origin save request. To do so, fill the required info in the form below:

Origin type      Origin url

git

A "Save code now" request takes the following parameters:

- **Origin type:** the type of version control system the software origin is using. Currently, the supported types are:
  - git, for origins using Git
  - hg, for origins using Mercurial
  - svn, for origins using Subversion
  - bzr, for origins using Bazaar
- **Origin url:** the url of the remote repository for the software origin.  
In order to avoid saving errors from Software Heritage, you should provide the clone/checkout url as given by the provider hosting the software origin.  
It can easily be found in the web interface used to browse the software origin.  
For instance, if you want to save a git origin into the archive, you should check that the command \$ git clone <origin\_url>  
does not return an error before submitting a request.

# Archive and reference with Software Heritage

## 3. Cite and reference

[https://archive.softwareheritage.org/browse/origin/directory/?origin\\_url=<original\\_uri>](https://archive.softwareheritage.org/browse/origin/directory/?origin_url=<original_uri>)

Link to a version of the software project

The screenshot shows a GitHub repository page for the project 'frmichel/sparql-micro-service'. The URL in the address bar is <https://github.com/frmichel/sparql-micro-service>. The page displays a commit from February 2023. At the top right, there is a red circle around the 'Permalinks' button. Another green circle highlights the 'Branch: refs/tags/0.5.3' dropdown menu, which is currently set to '69c8a41 /'. Below the header, there is a tip revision message: 'Tip revision: 4181739045676264e77e4d7c8285978ff46f5df1 authored by Franck Michel on 11 February 2022, 13:26:32 UTC' and a link to 'Update Docker build + image versions'. The main content area shows a file tree with directories: demo, deployment, doc, services, and src.

# Archive and reference with Software Heritage

## 3. Cite and reference

[https://archive.softwareheritage.org/browse/origin/directory/?origin\\_url=<original\\_uri>](https://archive.softwareheritage.org/browse/origin/directory/?origin_url=<original_uri>)

Link to a version of the software project

The screenshot shows a GitHub repository page for 'frmichel/sparql-micro-service'. A green oval highlights the 'Branch: refs/tags/0.5.3' dropdown menu. A red box highlights the 'Permalinks' button in the top right corner of the Software Heritage sidebar. A red callout box points to the 'Permalinks' button with the text: 'To reference or cite the objects present in the Software Heritage archive, permalinks based on SoftWare Heritage persistent IDentifiers (SWHIDs) must be used instead of copying and pasting the url from the address bar of the browser (as there is no guarantee the current URI scheme will remain the same over time).'. Another red callout box points to the 'Add contextual information' checkbox at the bottom of the sidebar with the text: 'Select below a type of object currently browsed in order to display its associated SWHID and permalink.' Below the sidebar, a red box highlights the 'repository' status in the SWHID card, which also includes 'archived' status and the identifier 'swh:1:rev:4181739045676264e77e4d7c8285978ff46f5df1'. At the bottom right of the sidebar, two buttons are shown: 'Copy identifier' and 'Copy permalink'.

# Archive and reference with Software Heritage

## 3. Cite and reference

Link to a version of a source file, down to the line of code

The screenshot shows a code editor on the left displaying PHP code for a `SparqlClient` class. The code includes constructor logic, HTTP client configuration (with a timeout of 600 seconds), and assignment of an `httpClient` instance. A specific line of code (line 27) is highlighted in green. To the right of the code editor is a detailed view of the file's history, showing it was archived from GitHub. The view includes tabs for content, directory, revision, and snapshot, and provides a URL for the specific revision (swh:1:cnt:7184351e05c1022a3a1a6d8288a06fca1ec38123). Below the URL, there are checkboxes for adding contextual information and options to copy the identifier or permalink.

```
17     public function __construct($queryUri, $updateUri = null)
18     {
19         parent::__construct($queryUri, $updateUri);
20
21         // HTTP client configuration with a large timemout value:
22         // default is 10s but we want to be sure
23         $httpConfig = array(
24             'maxredirects' => 5,
25             'useragent' => 'Eas',
26             'timeout' => 600
27         );
28         $this->httpClient = Http
29         $this->httpClient->setC
30
31         $this->queryUri = $quer
32     }
```

content    directory    revision    snapshot

archived repository archived swh:1:cnt:7184351e05c1022a3a1a6d8288a06fca1ec38123    Iframe embedding

swh:1:cnt:7184351e05c1022a3a1a6d8288a06fca1ec38123;  
origin=https://github.com/frmichel/sparql-micro-service;  
visit=swh:1:snp:8fa59701754afa4b37c198ab4680fa17ef52c5cf;  
anchor=swh:1:rev:4181739045676264e77e4d7c8285978ff46f5df1;  
path=/src/common/SparqlClient.php;  
lines=23-27

Add contextual information     Copy identifier     Copy permalink

# Agenda

- Overview of Open Science
- Reproducible research
  - The reproducibility crisis
  - Vocabulary
  - Incentives and rewards
- Make code and data findable, accessible, referenceable & citable
  - Importance of Persistent Identifiers (PID)
  - Citation guidelines
  - Public repositories + focus on Software Heritage
- **Giving credit: citing article, code & data alike**

# Giving credit: citing article, code & data alike



# Cite others' works

Have a look at



*"A global community of organizations and researchers identifying and citing research outputs and resources."*

Multiple services:

DOI registration, metadata management, discovery,  
citation tracking, **citation formatter**, bibliometrics...

Non-profit association (German right)

Federation of organizations allowing a single point of entry: institutions, universities, libraries, archives... (<https://datacite.org/members/>)

Not just data: code, articles and any research output.

Harvest existing repositories e.g. Zenodo, Crossref

# Cite data in LaTex

@dataset entry type in BibLaTeX (not in BibTex)



The screenshot shows the Zenodo dataset page for the "Covid-on-the-Web dataset". The page has a blue header with the Zenodo logo, a search bar, and navigation links for Upload and Communities. Below the header, the date November 5, 2020, is displayed. A "Dataset" button is highlighted in grey, while "Open Access" is in green. The title "Covid-on-the-Web dataset" is in large blue text, followed by the author "Wimmics Research Team". A "BibTeX Export" section contains the BibTeX code: @dataset{wimmics\_research\_team\_2020\_4247134, author = {Wimmics Research Team}, title = {Covid-on-the-Web dataset}, month = nov, year = 2020, publisher = {Zenodo}, version = {1.2}, doi = {10.5281/zenodo.4247134}, url = {https://doi.org/10.5281/zenodo.4247134} }. To the right, a reference [6] is shown: [6] Wimmics Research Team. *Covid-on-the-Web dataset*. Version 1.2. Zenodo, Nov. 2020. DOI: 10.5281/zenodo.4247134. URL: <https://doi.org/10.5281/zenodo.4247134>.

*My experience: worked with LNCS, not with many other templates e.g. with ACM SIG-ALTERNATE.*

# Cite code in LaTex

**software-biblatex**: package that makes full use of SWHIDs, HAL ids, DOIs.  
(<https://www.ctan.org/tex-archive/macros/latex/contrib/biblatex-contrib/biblatex-software>)

Extensions: @software, @softwarerevision, @softwaremodule, @codefragment

.tex file:

```
\usepackage[datamodel=software]{biblatex}
\usepackage{software-biblatex}
\ExecuteBibliographyOptions{halid=true, swhid=true, swlabels=true, vcs=false, license=true}
\addbibresource{biblio.bib}
```

*My experience: worked with LNCS, not with many other templates e.g. with ACM SIG-ALTERNATE.*

# Cite code in LaTex

```
@software{sparql-micro-services,
  title = {SPARQL Micro-Services},
  author = {Michel, Franck},
  date = {2018},
  institution = {University Côte d'Azur, CNRS, Inria},
  license = {Apache 2.0},
  repository= {https://github.com/frmichel/sparql-micro-service/},
  swhid = {swh:1:dir:7ffd9f813b0f7c75fc696caa40cdd17215b1e280}
}

@software{sparql-micro-services-doi,
  title = {SPARQL Micro-Services},
  author = {Michel, Franck},
  date = {2018},
  institution = {University Côte d'Azur, CNRS, Inria},
  license = {Apache 2.0},
  doi = {10.5281/zenodo.5898725},
  repository= {https://github.com/frmichel/sparql-micro-service/}
}

@softwareversion{sparql-micro-services-0.5.3,
  crossref = {sparql-micro-services}
  version = {0.5.3},
  date = {2022},
  swhid = {swh:1:rev:4181739045676264e77e4d7c8285978ff46f5df1;
    origin=https://github.com/frmichel/sparql-micro-service;
    visit=swh:1:snp:e42c3a4105c6866748c14f06801de51d5058915f}
}
```

- [1] [SW] Franck Michel, *SPARQL Micro-Services* 2018. University Côte d'Azur, CNRS, Inria. LIC: Apache 2.0. SWHID: {[swh:1:dir:7ffd9f813b0f7c75fc696caa40cdd17215b1e280](#)}.
- [2] [SW] Franck Michel, *SPARQL Micro-Services* 2018. University Côte d'Azur, CNRS, Inria. LIC: Apache 2.0. DOI: [10.5281/zenodo.5898725](https://doi.org/10.5281/zenodo.5898725),
- [3] [SW Rel.] Franck Michel, *SPARQL Micro-Services* version 0.5.3, 2022. University Côte d'Azur, CNRS, Inria. LIC: Apache 2.0. SWHID: {[swh:1:rev:4181739045676264e77e4d7c8285978ff46f5df1;origin=https://github.com/frmichel/sparql-micro-service;visit=swh:1:snp:e42c3a4105c6866748c14f06801de51d5058915f](#)}.

# What if only BibTex can be used?

Cite data paper/software paper/resource track paper, if any

Use BibTex entry type @misc and field 'note' to add  
version, license, SWHID, HAL id, DOI...

<https://www.bibtex.com/e/entry-types/#misc>

```
@misc{SPARQL-micro-services,
  Author      = {Franck Michel},
  Title       = {SPARQL Micro-Services},
  howpublished = "\url{https://github.com/frmichel/sparql-micro-service/tree/0.5.7}",
  note        = {[Software] v0.5.7, SWHID: \texttt{swh:1:rev:bc9a913d88c8844bbd1b2ccbe8e1fe6ed22846c4}},
  year        = {2024}
}
```

[13] F. MICHEL, « SPARQL Micro-Services », <https://github.com/frmichel/sparql-micro-service/tree/0.5.7>,  
2024, [Software] V0.5.7, SWHID : `swh:1:rev:bc9a913d88c8844bbd1b2ccbe8e1fe6ed22846c4`.

But not standard so likely not machine-processable ☹



# Good research is reproducible research

"Open Science is science done right"    Still a long way to go...

Open Access, Open Data, Open Source

Cultural shift to openness and collaboration

Make code & data "FARC"

Data on [recherche.data.gouv.fr](#) or Zenodo or...

Code on [SWH and HAL](#), or Zenodo [and HAL](#)

Prepare repositories, rich metadata

PID is (*almost*) all you need

Name a resource, Cite it, Reference a specific version, Associate metadata to it

Editors must support code/data citation

- Update the Latex templates!
- Lengthy PIDs require unlimited pages for references

Track article/code/data relationships

- Metadata (on most portals) often not ready. HAL doing it but progress still needed

Give credit & reward:

- Change the metrics to reward impactful code/data
- Reward reviewing work...
- Change the mentalities...

More: DORA, CoARA

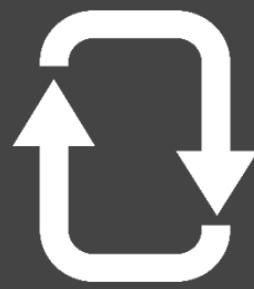
# Thank you!



Research



Publish



Reproduce

**Links:**

<https://www.ouvrirlascience.fr/passeport-pour-la-science-ouverte-guide-pratique-a-lusage-des-doctorants/>

<https://www.ouvrirlascience.fr/science-ouverte-codes-et-logiciels/>

<https://www.ouvrirlascience.fr/partager-les-donnees-liees-aux-publications-scientifiques-guide-pour-les-chercheurs/>