# Executing workflows during peer review for transparency, reproducibility, and reusability

Thuringian RDM-Days 2021

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Slides: https://doi.org/10.5281/zenodo.5006379



https://giphy.com/gifs/usnationalarchives-nasa-scientist-scientists-1F1JGyGZhiSAA8Vuhn



THE CONVERSATION

https://theconversation.com/how-computers-broke-scienceand-what-we-can-do-to-fix-it-49938



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https://giphy.com/gifs/with-computers-fascination-PxSFAnuubLkSA



https://giphy.com/gifs/david-hasselhoff-M3o3fL9nnxG4o



Your online tool to help explore the data

Actually giving me the data and code, environment, documentation

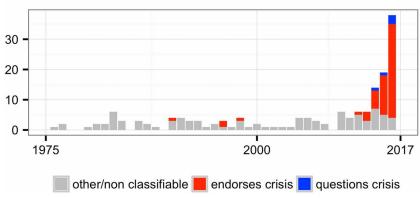
# **Crisis? Crisis of what?**

#### COLLOQUIUM OPINION

# Opinion: Is science really facing a reproducibility crisis, and do we need it to?

Daniele Fanelli

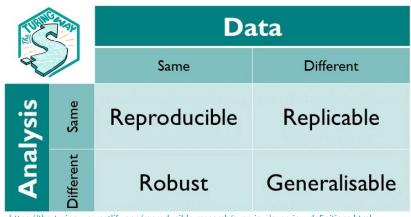
PNAS March 13, 2018 115 (11) 2628-2631; first published March 12, 2018; https://doi.org/10.1073/pnas.1708272114



### Frequency of Crisis Narrative in Web of Science Records

https://doi.org/10.1073/pnas.1708272114

Credibility crisis? Replicability crisis? Reproducibility crisis? Robustness crisis? Generalisability crisis?



https://the-turing-way.netlify.app/reproducible-research/overview/overview-definitions.html

# **Reproducible Research**

# **Peer Review**



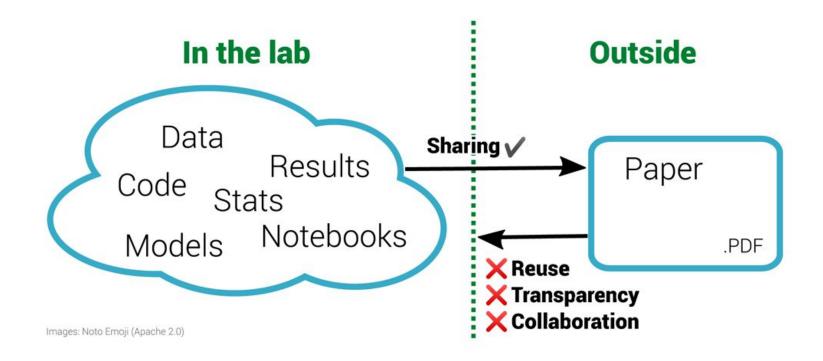


#### Reproducible research and peer review are cornerstones of science. But are they getting along?

https://giphy.com/gifs/suspicious-YNEpBZC0Ly08M https://giphy.com/gifs/lol-futurama-humor-cFgb5p5e1My3K

# CODECHECK

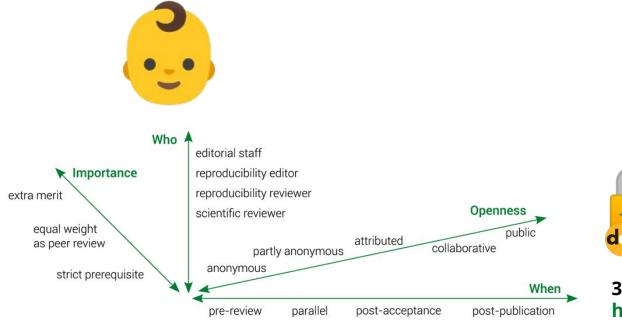
https://codecheck.org.uk/



#### The inverse problem in reproducible research. Figure 1 of <u>https://doi.org/10.12688/f1000research.51738.1</u>

The left half of the diagram shows a diverse range of materials used within a laboratory. These materials are often then condensed for sharing with the outside world via the research paper, a static PDF document. Working backwards from the PDF to the underlying materials is impossible. This prohibits reuse and is not only non-transparent for a specific paper but is also ineffective for science as a whole. By sharing the materials on the left, others outside the lab can enhance this work.

### One re-execution of computational workflow by codechecker during peer review



The CODECHECK variations. Figure 1 of <u>https://doi.org/10.12688/f1000research.51738.1</u>

CODE CHECK https://codecheck.org.uk/

Independent execution of computations underlying research articles.

- 1. Codecheckers record but don't investigate or fix.
- 2. Communication between humans is key.
- 3. Credit is given to codecheckers.
- 4. Workflows must be auditable.
- 5. Open by default and transitional by disposition.



30 Certificates https://codecheck.org.uk/register /

### F1000Research

METHOD ARTICLE

CODECHECK: an Open Science initiative for the independent execution of computations underlying research articles during peer review to improve reproducibility [version 1; peer review: 1 approved, 1 approved with reservations]

🔀 Daniel Nüst 🔟 1, 🔀 Stephen J. Eglen 🔟 2

Nüst D and Eglen SJ. **CODECHECK: an Open Science initiative for the independent execution of computations underlying research articles during peer review to improve reproducibility** [version 1; peer review: awaiting peer review]. F1000Research 2021, 10:253 (<u>https://doi.org/10.12688/f1000research.51738.1</u>)

### Next steps

# https://codecheck.org.uk/get-involved/

### CODECHECK paper V

Build journal partnerships through community checks 😓

Grow codechecker community 🔥

Collaborate on education (ReproHack, PhD schools) 💽



CODECHECK editor for 💎 OA journals



Independent execution of computations underlying research articles.

#### As a codechecker

You are a scientist and want to help codechecking submissions?

Awesome! Please open an issue on the codecheckers repository to be adde

#### As an author

You want to share the code underlying your research paper? Congratulation

There are different ways for you to get involved, for example (a) submit a mai CODECHECK as part of your cover letter, or (c) submit your workflow to the submit to a journal with an open review.

#### As a reviewer or editor

If you are contributing to science as a reviewer of academic manuscripts or a if the author provides suitable information. The CODECHECK team would be on how you to best achieve that, i.e., if you conduct a community CODECHE

#### As a journal, publisher, or conference

You are an editor or reviewer at a journal or conference and are interested to

Great! There is no formal process or certification. You can simply announce p principles, e.g. in a blog post. A link to the CODECHECK principles in your su reviewers. Please consider adding a CODE WORKS V badge to the publication to should link directly to the CODECHECK report.

The badge graphic and all documentation on this website are available under

The CODECHECK team would be glad to help you set up a process, if you have on our website after we have gotten to know your implementation of a CODE

#### As a developer or science communicator

CODECHECK is a community effort, and your help is welcome across all tasl to conduct more effective reviews or to streamline the CODECHECK review p vision and educate others on code executability checks - then please get in tu

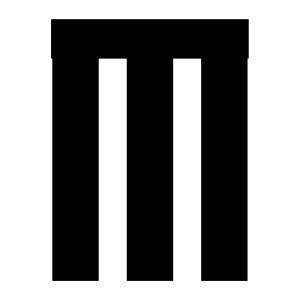


# Traditional and modern scientists

Deep knowledge: expertise and

skills within a single field

Broad knowledge: across disciplines collaborate with other experts, apply outside of own field







science

data

programming,

Computer & method skills statistics, reproducibility,





https://en.wikipedia.org/wiki/T-shaped\_skills

https://doi.org/10.1007/s10816-015-9272-9

https://jakevdp.github.io/blog/2014/08/22/hacking-academia/

https://www.sciencemag.org/careers/2013/05/when-all-science-becomes-data-science

https://escience.washington.edu/community-level-data-science-and-its-spheres-of-influence-beyond-novelty-squared/

Who are you?



developer



https://en.wikipedia.org/wiki/T-shaped\_skills

scientist

https://doi.org/10.1007/s10816-015-9272-9

https://jakevdp.github.io/blog/2014/08/22/hacking-academia/ https://www.sciencemag.org/careers/2013/05/when-all-science-becomes-data-science https://escience.washington.edu/community-level-data-science-and-its-spheres-of-influence-beyond-novelty-squared/

https://www.software.ac.uk/resources/publications/better-software-better-research

# Where is the NFSI?

### Nationale Forschungssoftwareinfrastruktur!

### F1000Research

#### **OPINION ARTICLE**

(REVISED) An environment for sustainable research software in Germany and beyond: current state, open challenges, and call for action [version 2; peer review: 2 approved]

Hartwig Anzt<sup>1,2\*</sup>, Felix Bach (b)<sup>1\*</sup>, Stephan Druskat (b)<sup>3-5\*</sup>, Frank Löffler<sup>3,6\*</sup>, Azel Loewe (b)<sup>1\*</sup>, Bernhard Y. Renard<sup>7\*</sup>, Gunnar Seemann (b)<sup>8\*</sup>, Alexander Struck (b)<sup>5\*</sup>, Elke Achhammer<sup>9</sup>, Piush Aggarwal (b)<sup>10</sup>, Franziska Appel<sup>11</sup>, Michael Bader<sup>9</sup>, Lutz Brusch (b)<sup>12</sup>, Christian Busse (b)<sup>13</sup>, Gerasimos Chourdakis (b)<sup>9</sup>, Piotr Wojciech Dabrowski (b)<sup>14</sup>, Peter Ebert<sup>15</sup>, Bernd Flemisch<sup>16</sup>, Sven Friedl (b)<sup>17</sup>, Bernadette Fritzsch<sup>18</sup>, Maximilian D. Funk<sup>19</sup>, Volker Gast<sup>3</sup>, Florian Goth<sup>20</sup>, Jean-Noël Grad (b)<sup>16</sup>, Jan Hegewald (b)<sup>18</sup>, Sibylle Hermann<sup>16</sup>, Florian Hohmann<sup>21</sup>, Stephan Janosch<sup>22</sup>, Dominik Kutra (b)<sup>23</sup>, Jan Linxweiler (b)<sup>24</sup>, Thilo Muth (b)<sup>25</sup>, Wolfgang Peters-Kottig (b)<sup>26</sup>, Fabian Rack<sup>27</sup>, Fabian H.C. Raters (b)<sup>28</sup>, Stephan Rave (b)<sup>29</sup>, Guido Reina (b)<sup>16</sup>, Malte Reißig (b)<sup>30</sup>, Timo Ropinski<sup>31,32</sup>, Joerg Schaarschmidt<sup>1</sup>, Heidi Seibold (b)<sup>33</sup>, Jan P. Thiele (b)<sup>34</sup>, Benjamin Uekermann (b)<sup>35</sup>, Stefan Unger<sup>36</sup>, Rudolf Weeber<sup>16</sup>

### Software = Research output!

### F1000Research

#### METHOD ARTICLE

(REVISED Recognizing the value of software: a software citation guide [version 2; peer review: 2 approved] Previously titled: "The importance of software citation"

Daniel S. Katz (b)<sup>1</sup>, Neil P. Chue Hong (b)<sup>2</sup>, Tim Clark<sup>3</sup>, August Muench (b)<sup>4</sup>, Shelley Stall (b)<sup>5</sup>, Daina Bouquin<sup>6</sup>, Matthew Cannon (b)<sup>7</sup>, Scott Edmunds<sup>8</sup>, Telli Faez<sup>9</sup>, Patricia Feeney<sup>10</sup>, Martin Fenner<sup>11</sup>, Michael Friedman (b)<sup>12</sup>, Gerry Grenier (b)<sup>13</sup>, Melissa Harrison (b)<sup>14</sup>, Joerg Heber<sup>15</sup>, Adam Leary (b)<sup>16</sup>, Catriona MacCallum (b)<sup>17</sup>, Hollydawn Murray<sup>18</sup>, Erika Pastrana<sup>19</sup>, Katherine Perry (b)<sup>20</sup>, Douglas Schuster<sup>21</sup>, Martina Stockhause (b)<sup>22</sup>, Jake Yeston<sup>23</sup>

\* Equal contributors

Anzt H, Bach F, Druskat S *et al.* An environment for sustainable research software in Germany and beyond: current state, open challenges, and call for action [version 2; peer review: 2 approved]. *F1000Research* 2021, 9:295 (<u>https://doi.org/10.12688/f1000research.23224.2</u>)

Katz DS, Chue Hong NP, Clark T *et al.* Recognizing the value of software: a software citation guide [version 2; peer review: 2 approved]. *F1000Research* 2021, 9:1257 (https://doi.org/10.12688/f1000research.26932.2)



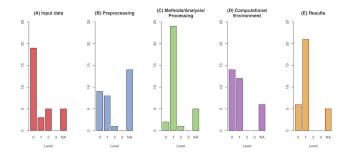
# **Reproducible AGILE**



# https://reproducible-agile.github.io/

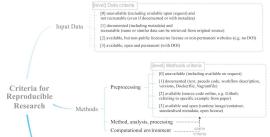
2017, '18 & '19: Workshops on reproducibility
2019: Reproducible publications at AGILE conferences (initiative)
2020: First AGILE reproducibility review
2021: Second AGILE reproducibility review

# **Assessment of GIScience papers**



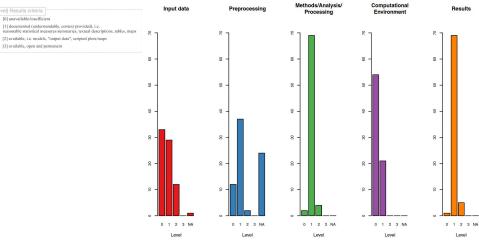
Legal restrictions	Lack of time	Lack of tools	Lack of knowledge	Lack of incentiv
Main reason	Strongly hindered	Not at all	Not at all	Strongly hindered
Main reason	Not at all	Not at all	Not at all	Moderately hinde
	Slightly hindered	Strongly hindered	Moderately hindered	Strongly hindered
	Not at all	Slightly hindered	Not at all	Not at all
Strongly hindered	Strongly hindered	Strongly hindered	Moderately hindered	Strongly hindered
Moderately hindered	Main reason	Not at all	Not at all	Not at all
Slightly hindered	Moderately hindered	Slightly hindered	Slightly hindered	Moderately hinde
Slightly hindered	Not at all	Main reason	Strongly hindered	Not at all
Not at all	Moderately hindered	Not at all	Moderately hindered	Not at all
Not at all	Strongly hindered	Strongly hindered	Strongly hindered	Slightly hindered
Not at all	Moderately hindered	Not at all	Not at all	Not at all
Not at all	Slightly hindered	Main reason	Not at all	Strongly hindere
Not at all	Main reason	Not at all	Not at all	Not at all
Not at all	Main reason	Not at all	Not at all	Not at all
Not at all	Moderately hindered	Moderately hindered	Not at all	Strongly hindere
Not at all	Not at all	Not at all	Not at all	Not at all
Not at all	Slightly hindered	Not at all	Slightly hindered	Not at all

Nüst, D., Granell, C., Hofer, B., Konkol, M., Ostermann, F. O., Sileryte, R., & Cerutti, V. (2018). *Reproducible research and GIScience: an evaluation using AGILE conference papers.* PeerJ, 6, e5072. https://doi.org/10.7717/peerj.5072



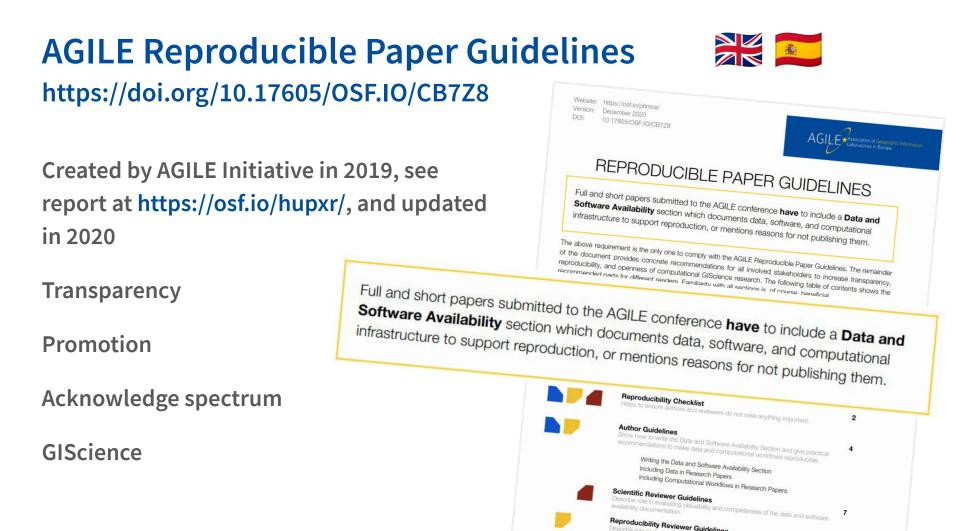
[0] unavailable/insufficient

Results



Ostermann, F., Nüst, D., Granell, C., Hofer, B., & Konkol, M. (2020). Reproducible Research and GIScience: an evaluation using GIScience conference papers. EarthArXiv.

https://doi.org/10.31223/x5zk5v | pub. pending at GIScience conf.



# The guidelines

https://doi.org/10.17605/OSF.IO/CB7Z8

### **Reproducibility checklist**

Author guidelines Writing DASA section **Data in Research Papers Computational workflows in Research Papers** 

**Reviewer guidelines** 

**Reproducibility reviewer guidelines** 

### Background

Website: https://osf.io/phmce/ December 2020 10.17605/OSE.IO/CB778



#### **REPRODUCIBLE PAPER GUIDELINES**

Full and short papers submitted to the AGILE conference have to include a Data and Software Availability section which documents data, software, and computational infrastructure to support reproduction, or mentions reasons for not publishing them.

The above requirement is the only one to comply with the AGILE Reproducible Paper Guidelines. The remainder of the document provides concrete recommendations for all involved stakeholders to increase transparency. reproducibility, and openness of computational GIScience research. The following table of contents shows the recommended parts for different readers. Familiarity with all sections is, of course, beneficial.





**Reproducibility Checklist** 



#### Author Guidelines

Writing the Data and Software Availability Section Including Data in Research Papers Including Computational Workflows in Research Papers



Scientific Reviewer Guidelines



**Reproducibility Reviewer Guidelines** 8

2

4

7

10

#### Further resources

These guidelines can not cover all details of the reproducibility review at AGILE conferences. For more information for authors, translations, and practical examples see the guidelines wiki. For more information about the review process and deadlines, see the process description. For any questions, please visit the AGILE Discourse server's forum for the Reproducible Paper Guidelines

# **Checklist and writing the DASA section**



For all datasets included/produced in the paper, check if data:

- Is provided in a non-proprietary format
- Is documented for third parties to reuse
- Is accessible in a public repository and has an open data licence
- For all software tools/libraries/packages and computational workflows included/produced, check if:
  - Reproduction steps are explained in a README (plain text file), flowchart, or script
  - Computational environments (including hardware) are documented or provided
  - Versions of relevant software components (libraries, packages) are provided
  - All parameters and expected execution times for the computational workflow are provided
  - Software developed by the authors is available in a public repository and has an open licence
  - There is a clear connection between tables, figures, maps, and statistical values and the data and code that they are based on, e.g., using file names or documentation in the README
- In the Data and Software Availability section, check if you include:
  - Data and software statements (see examples below)
  - The reasons, if any, for not being able to share (parts of) data or code
- For all data and software check that:
  - All datasets and code (used or mentioned) are assigned DOIs
- Datasets and code are cited throughout the paper

#### After acceptance in the camera-ready paper check that:

- If data has been shared privately or anonymously for peer review, they are updated with all metadata and accessible via a DOI and referenced from the paper
- If a reproducibility review report will be published for your paper, a DOI URL in the Data and Software Availability section is included using the following template: A reproducibility report for this paper is available confirming that [considerable parts of the computational workflow / all results / Figures 1 and 4] could be independently reproduced, see https://doi.org/inki\_to\_report.

#### WRITING THE DATA AND SOFTWARE AVAILABILITY SECTION

The DASA section provides references to where data, software and documentation is available (e.g., paper section or README file) and under what conditions (e.g., copyright, licenses or access procedures for protected data). It should be concise and contain persistent links to repositories using Digital Object Identifiers' (DOI). You may remove links for anonymity during peer review ("xox"), or share anonymized links<sup>8</sup> if your repository supports them. Data, software and (third-party) tools should be cited following recommended citation or standard citation guidelines. Possible statements for the DASA section are provided below. You may include one of these statements or draft your own.

#### Statements for non-computational or conceptual work

No data or code was collected, developed, or used in this work.

The full list of reviewed literature is available at [link to attachment or citable deposit of bibliography].

The full concept maps are available at [link] and the ideas were first sketched in a blog post at [link].

#### Research data/code supporting this publication ...

... is available in [name of the repository(-ies)] and is accessible via the following DOI [DOI link(s)]

... was accessed on [date of dataset access/download] with the following [query parameters, if applicable] under the license [dataset license].

... was downloaded manually using the services at [name of organisation] (using a departmental subscription for costs) and [name of organisation]. The compiled dataset cannot be redistributed due to licensing restrictions.

...is not available due to [indicate reasons, e.g., licenses, sensitive data on human subjects, privacy statements; if there are processes to obtain the data, describe them].

#### The computational workflow supporting this publication ...

... is executed via [choose, e.g., a single command/file, a workflow management software, a set of numbered scripts] published under license [the license] at [DOI of repository].

... is published in a [language] module/package at [link of software project]. The used version is archived at [DOI of repository].

... is provided as a [container/VM] published at [DOI of repository] with instructions included in the file README.md in the repository.

### https://doi.org/10.17605/OSF.IO/CB7Z8

# The guidelines for data



INCLU	DING DATA IN RESEARCH PAPER	RS		
	Minimum requirements	Recommended practices		
What?	<ul> <li>All input data and configuration</li> <li>Data description/documentation, including provenance, field or column types, etc.</li> <li>If data is retrieved from an external source, documentation on collection queries and download steps</li> </ul>	<ul> <li>Standardised, discipline-specific metadata<sup>8</sup> and ontologies to describe your data</li> <li>Data download scripts</li> </ul>		
Where?	<ul> <li>Publish data in a public repository providing a DOI</li> <li>Cite data (including date and version) in the paper</li> </ul>	<ul> <li>Discipline- or data type-specific repository<sup>9</sup></li> <li>Include recommended citation in dataset description (unless already provided by repository)</li> <li>Create a registration for OSF projects<sup>10</sup> and use the DOI to cite it</li> </ul>		
How?	<ul><li>Use open data formats; export from proprietary format for publication</li><li>Specify the license</li></ul>	Use plain text-based file formats		

### https://doi.org/10.17605/OSF.IO/CB7Z8

# The guidelines for computational workflows



#### INCLUDING COMPUTATIONAL WORKFLOWS IN RESEARCH PAPERS

	Minimum requirements	Recommended practices		
What? Computational environment	<ul> <li>Describe the used environment and computational infrastructure, e.g., hardware specs, operating system</li> <li>List software versions</li> <li>Cite used software<sup>14</sup></li> </ul>	<ul> <li>Provide the actual environment, e.g., a Dockerfile + container<sup>15</sup> or a Virtual Machine (e.g., using OSGeo-Live)</li> <li>Provide a pinned freeze of your dependencies (structured configuration files with dependency information)</li> <li>Add a colophon or "reproducibility receipt"<sup>16</sup> to your notebooks</li> <li>Installation and execution instructions for different operating systems</li> </ul>		
Computation steps	<ul> <li>Document the detailed steps in a text file and/or flowchart (every action/click)</li> <li>Document expected execution times given computing power unless negligible</li> <li>Ask a colleague to try out the instructions</li> </ul>	<ul> <li>Scripts/models and a README file that explains their use</li> <li>All figures are fully scripted and a peer has read your README's instructions (incl. interactive visualisations and interactive adjustments</li> <li>Multi-panel plots are composited with scripts<sup>17</sup></li> <li>Software package with structured metadata<sup>18</sup>, tests/Cl<sup>19</sup>, and a pipeline framework<sup>20</sup> or workflow language<sup>21</sup></li> <li>Live documents for analyses, e.g., Binder<sup>22</sup></li> <li>Live demo of APIs/online applications (e.g., anonymous cloud resources, such as Google Cloud Run or AWS)</li> <li>Subset or a synthetic dataset for quick evaluation</li> </ul>		
Where?	• Repository providing a persistent identifier, e.g., a DOI or SWHID <sup>23</sup>	<ul> <li>Versioned code repository, such as GitHub or GitLab, and ongoing open development</li> </ul>		
How?	Use generally available tools     (avoid proprietary tools that are	<ul><li>Use and create Open Source tools</li><li>Cite core modules/tools/language used</li></ul>		
Tools used	not available to reviewers and other researchers)			
Development practices	<ul> <li>Use clear licenses<sup>24</sup> that fit your environment</li> <li>Follow one of "Good enough practices in scientific computing"<sup>25</sup></li> </ul>	<ul> <li>Follow all "Good enough practices" Use development guidelines for your environment / language of choice (e.g., for R<sup>26</sup>)</li> </ul>		

https://doi.org/10.17605/OSF.IO/CB7Z8

Scientific reviewer guidelines... concerning the reproducibility review only!



#### SCIENTIFIC REVIEWER GUIDELINES

This section clarifies the expectations and role of the scientific reviewer with respect to the reproducible paper guidelines. For information for the Reproducibility Reviewer, please see the following section.

Reproducibility is considered good scientific practice that provides input for the quality assessment of a paper. Therefore, reviewers of AGILE papers should be aware of the **author guidelines on reproducibility** and be familiar with the **reproducibility checklist**, as well as the expected content of the **mandatory data and software availability section.** Using this information, reviewers should evaluate the plausibility and completeness of the data and software availability documentation, and whenever possible and readily available **include feedback on reproducibility aspects** in their comments. Scientific reviewers are free to but **are not expected to attempt reproductions of computations**.

Data and software availability documentation provide an additional set of information for assessing the quality of research presented in a manuscript. Reviewers are asked to know about the AGILE reproducible paper guidelines and to consider the level of reproducibility reached in a manuscript. To do so, they shall assume the position of someone who would like to reproduce the submitted work to assess whether the provided material is likely to allow reproduction of the submitted work. Based on this impression, reviewers may challenge authors regarding the level of reproducibility reached, if any statements are made regarding reproducibility in a manuscript.

Scientific reviewers are not required to actually reproduce a manuscript, but, if the data and code are provided in an anonymous format, and if a reviewer attempts to reproduce all or parts of the submitted work, then they are asked to document the process and outcomes (see Reproducibility Reviewer Guidelines below). Please reach out to the reproducibility chair if you are keen on conducting a reproducibility review for a paper you are reviewing.

The peer review of AGILE papers is a fully anonymous peer review, i.e. authors and reviewers do not know each other's identity. Reviewers should be supportive to authors and consider potential limitations in access to resources due to anonymisation. Since the provision of information to help reproduction of a paper can accidentally lead to disclosure of an author's identity, the reviewers should not use any such additional information to the disadvantage of the authors. The reviewers' comments provided to the authors are expected to be neutral<sup>28</sup> and contribute to improved reproducibility of the reported findings.

# The guidelines for reproducibility reviewers

Ideal vs. realistic

### Role & skills

Examples for "Do's and Don'ts":

- Do shift burden to author
- Do encourage and set examples
- Private data/code sharing last resort
- Document your work in report (impact)
- Be kind (career stage, knowledge, privileges)
- No rummaging

#### REPRODUCIBILITY REVIEWER GUIDELINES

Reproducibility reviewers conduct a complimentary review of the computational workflow that is published with a full paper that is provisionally accepted after the solenititic review process. They read the paper insofar as needed to **reproduce the computation**, **using the abstract and the Data and Software Availability section** (DASA) as starting points, locally, these sections of the paper together with a README lie are sufficient for the reproduction. When reproducibility reviewers should be aware of the different reproducibility levels (see Author Guidelines above) to recommend **improvements** to the authors, but they are not responsible for making a workflow transparent or executable. Reproducibility reviewers write a **reproducibility report** is published if the reproduction attempt and their communication with the authors. The report is published if ther reproduction attempt and their communication.

#### Reproducibility review coordination

The reproducibility chair will be your contact person regarding supporting infrastructure and getting access to the private discussion forum for reproducibility reviewers on the AGILE Discourse server<sup>ay</sup>. This forum is used to assign, under the leadership of the reproducibility chai

respective topical and technical skills, and share mat report.

#### Goals and scope

While the AGILE reproducible paper guidelines are reproducibility success rate for accepted papers, understanding, and ultimately community adoption the tasks as reproducibility reviewer harder and progress review is an extra ment for an accepted paper, bu acceptance. The reproducibility reviewer should be aw might "take the extra few steps" needed. This non-exc one reproducibility reviewer is assigned per paper. Y scientific reviewer on the same paper, but ther oreles of th of the reproducibility review is roughly in line with t community is worth exploring for further examples and reproduction, e.g., the recreation of some but not all of t though what is "good enough" may change over time. or the reproducibility commune chair in case of doubt.

#### Reproducibility reviewer skills

A reproducibility review is a learning experience for bc AGILE community to increase openness and transpare amount of time you should spend on a reproduction at as the research you are tasked to reproduce. However few minutes of being stuck and not spending more i depends also on you interest, time budget, and skils u get basic familiarity with package managers and virtue DESCRIPTION lifes and renv for R, pm for JavaSC reproducibility reviewer discussion forum early and often

50	Don't
Oucle pre-repro-review checks and ask authors to fix before continuing; even if not all of these are technically regulard, authors who are willing to work reproducibly can show their engagement right from the start: 1. Do the links to data sets and materials resolve? 2. Is there a README with clear step-by-step instructions? 3. Is there a clear mention of to be expected execution times?	Dig across badly or un-documented collections of files and functions to identify which pair of the code/data oreates which figure/habie/output; find or build the "start button" yourself.
Encourage authors by pointing out promising intermediate results or concrete benefits of reproducibility.	Run workflows requiring considerable computational resources (unless interesting for you) but ask for data subsets for demonstration purposes.
Accept sample datasets to run a workflow and compare the outcome with the expected sample results; check the sources of the full datasets, if available.	Accept private sharing of data or code, unless strictly required for protection of sensitive data. All changes by the author should update to the public reproduction material.
Clearly document the extent of the reproduction in your reproduction report and suggest potential improvements, if you provide intermediate feedback, to include a history of your interactions in the report so that the ideas you contributed are preserved when the submission's material is improved.	Attempt to instal adfivere without any instructions, instal binary adfivere of uninoum origin, or try to fix installation problems you encounter on your machine; try to instal without (a) asking for help from a fellow reproducbility reviewer who is familiar with the adfivere, or (b) asking the author to help, providing a minimal reproducbile exempted or your problem.
Get in touch with fellow reproducibility reviewers if specific expertise (tool, programming language,) is needed.	Point out or even fix problems that are not specific to the submission, e.g., general problems in a software tool.
Set an example when communicating about computational problems, e.g., by clearly defining your system (OS version, language version, etc.)	Oreate accounts on any service or platform to access code, data, or other resources.
Ask specific questions or point out concrete problems that may lead authors to improve their material, including referencing these guidelines or concrete tools/intertoods that you already (i) know about, especially 1 you suspect that the author might now be familiar with them (e.g., version pinning/dependency management), version pinning/dependency management.	Fix anything (unless you really enjoy doing so), e.g., complex problems, ouddated libraries, broken paths, or incomplete computing environment specifications, especially if the author can fix them even quicker.
Make sure that you are aware of any templates or specific resources provided for reproducibility reviewers from the reproducibility committee chair before starting your review.	
Consider the author's background, career stage, and position to be aware of la lack of privileges or institutional gover to decide how much support you provide and how you communicate; your producbility review can be a contribution to improve equity and inclusion in academia.	Be a <u>hro</u> .

Don't



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### **Review process**

Proceedings: https://www.agile-giscience-series.net/review\_process.html

Process documentation: https://osf.io/7rjpe/

Reproducibility review *after* accept/reject decisions

**Reproducibility review & communication** 

**Community conference & volunteers** 

Badges on proceedings website, article website with link, and first article page (V Copernicus!)



## **Reproducibility review results 2021**

### 9 reproducibility reports published (2020: 6)

- no starting point in the paper
- documentation insufficient for third party

8 not reproducible:

- conceptual papers
- data not shared (choice, licence)
- code not shared (choice) or proprietary software (repro reviewer matching failed)

Image Matching Point Clouds using Height and **Class** Information Friese Reproduction report and material. Reproducibility review of: Investigating drivers' geospatial abilities in unfamiliar environments Friese Reproduction report and material. **#** Reproducibility review of: Extraction of linear o/h64sd structures from digital terrain models using deep learning Nüst & Graser Reproducibility review of: A Comparative Study of Typing and Speech For Map Metadata Creation Ostermann & Nüst Reproducibility review of: A Socially Aware ---Huff Model for Destination Choice in Naturebased Tourism Krukar ... Reproducibility review of: Automated s://ost. Extraction of Labels from Large-Scale Historical Maps Nüst Reproducibility review of: Flood Impact Assessment on Road Network and Healthcare Access - at the example of Jakarta, Indonesia Graser Reproducibility review of: H-TFIDF: What ... makes areas specific over time in the massive flow of tweets related to the covid pandemic? Nüst ---Reproducibility review of: An Approach to Assess the Effect of Currentness of Spatial Data on Routing Quality

Nüst & Kmoch

Reproducibility review of: Building Change Detection of Airborne Laser Scanning and Dense

### Reproducibility Reports

Published on OSF with a DOI Title page, cites the paper

Paper links to report via URL (no citation)

Automatically added to ORCID profile

#### Eventually indexed in GS

		Connecting	Research and Researche		RSHIP
	1	Daniel Nü	st	Biography	
Reproduci	bility review of: Investigating drivers' g	geospa	tial	producible ge producibility.	earch software oscientific rese
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				Data on Re Open Science 2021   other	bility review buting Quali e Framework 5/osf.lo/bdu28
This report is part of the reproducibility review at the AGILE conference. For more information see https://reproducible-agile.github.io/. This document is published on OSF at https://osf.io/dx92a. To cite the report use				Source: DataCite Reproducibility review	
Friese, Philipp	A. (2021, May). Reproducibility review of: Investigating driv miliar environments. https://doi.org/10.17605/OSF.IO/DX92		oatial	2021   other	e Framework 5/osf.lo/anv9r
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	Kokla, M., and Tomai, E.: Investigating drivers' geospatial ability s, AGILE GIScience Ser., 2, 3, https://doi.org/10.5194/agile				4 Ergel
	2.4 Data and Software Availability				

OPCID

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Alert erstellen

#### Summary

The updated submiss tionnaires. The provi

Questionnaires and sketches were collected anonymously. All statistical analyses, which results are detailed in the following section, have been performed in R (R Core Team, 2021) using the tidyverse package (Wickham et al., 2019). Driving directions given to participants, an Exemplary Questionnaire in English, the collected survey data in tabular form, the R code of the statistical analysis workflow, and all necessary metadata supporting this publication, are available on figshare and are accessible via the following DOI: https://doi.org/10.6084/m9.figshare.14460102.v4. The workflow underlying this paper was successfully reproduced by an independent reviewer during the AGILE reproducibility review and a reproducibility published report at was https://doi.org/10.17605/OSF.IO/DX92A.

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		Open Science Fra 2021   other DOI: 10.17605/osi		<ul> <li>Reproducibility review of: Automated Extraction of Label.</li> <li>Reproducibility review of: Extraction of linear structures f (2021-06-08)</li> </ul>			
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Beliebige Spra Seiten auf De			For more information see h at https://osf.io/suwpj/ To cite t	3 Mustifere, Y La Nir - research.utwente.nl ttps://reproducible-aglie.github.lof This document is published on OSF his report use Ostermann, FO, and Nüst, D. (2020, July). omparing supervised learning algorithms for Spatial Nominal ⊗			
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10.17605/OSF.IO/XS5YR Reviewed paper Owuor, Innocensia, Hochmair, Hartwig and Cveloren Sreten: Tracking Hurricane Dorian in GDELT and Twitter. AGILE GiScience Ser., 1, 19 ... \$ 99 88

. Reproducibility review of: Tracking Hurricane Dorian in GDELT and Twitter. https://doi.org/



*How to put your community on a path towards more reproducibility in 5 <del>casy</del> hard steps* 

- 1. Build a team of enthusiasts (workshop, social events)
- 2. Assess the current state and raise awareness (workshop, paper)
- 3. Institutional support ( <u>A AGILE Council</u> <u>A</u> + committee chairs)
- 4. Positive encouragement (no reproduction != bad science)
- 5. Keep at it!



### **Next steps**

Do it again in 2022 🎉

Grow reproducibility reviewer team Opportunity ECRs (mentoring/workshops/...)

Continue discourse (meaning of rprdcblty)

Re-assess new papers > impact?

Towards opening scholarship

Scope, requirements, acceptance condition? Open review if tenured? Format-free first submission CRediT

Phase out when standard practice...



cluster differ label proceed popul student framework context true tourism tempor increas global destindetail improv creat multi scenario natur select support function averag health attract approach imag pattern distribut understand usablcombin temperatur signific descript classif rout approact search manag annot includ process extractlearn input exist countri distanceize networkad move addit concept analysi geograph speech object web a httpsm and total Interact<sup>geo</sup> step sens respons cover semant relat softwar Scienctext citi Studi buildmetada sourc paramet correct proposflood chang road class settion rate journal cel due estim rm systemapplic structur similar score languag featur evalu question result typequalitiand implement geoga geospatiprovidactiv research doi.org experi linkclassifi entiti content specifcomput method answer levelvisual complex project task section space effect assess appli park limit challeng knowledg measur particip term train defin environ public futur scale identificator design impact environ public futur scale identififactor databas generat contributosm govern relev

> Word-stem cloud of all AGILE 2021 submissions (full/short/poster & accepted/rejected)

# What did we learn?



https://giphy.com/gifs/foxhomeent-l44QgV6RFRGgjDsDC/media

### Reproducible AGILE and CODECHECK: Highlights of Lessons learned

**Spectrum** or layers of reproducibility very apparent



Effect of guidelines at AGILE: **improved reproducibility**, community discourse

Reproducibility reports/CODECHECK certificates full of **recommendations** for improvement, often well received by authors, many included in revised submission

Good practices spread slowly, establishing a **process** is tedious, needs time until familiarity

**Challenges** for reproducibility reviewer: Inconsistencies and disconnects (figures), lack of documentation, unknown runtimes vs. no subsets of data, lack of reprod. guidance

Reproductions are **rewarding** and educational, matching expertises tricky

**Communication is without alternative** 

Safety net ( •• ), not security

# What can you do today?





### FDM-TAGE 2021 REPRODUCIBLE RESEARCH IS THE BEST DATA DOCUMENTATION

THÜRINGER

<title>

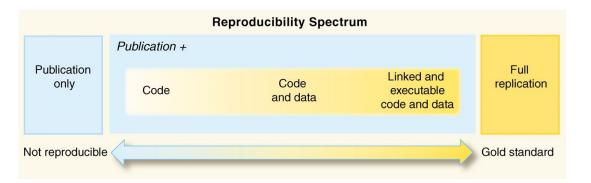
A love note to the future!

#### </title>

<meta name="description" content="event"> <meta name="dates" content="21.06.21-25.06.21"> <meta name="author" content="Thueringer Kompetenznetzwerk Forschungsdatenmanagement">



## **Reproducible Research & Open Science**



https://doi.org/10.1126/science.1213847

Wellcome Trust 🥝 @wellcometrust



A

"Science should be 'show me', not 'trust me'; it should be 'help me if you can', not 'catch me if you can'."

Rather than reproducibility, should we be looking at preproducibility? @Nature wellc.me/2IMNuig ♡ 151 15:55 - 28. Mai 2018

> "Science should be 'show me', not 'trust me'."

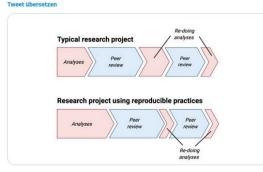
Before reproducibility must come preproducibility Instead of arguing about whether results hold up, let's push to prov... nature.com

#### 35 https://www.nature.com/articles/d41586-018-05256-0



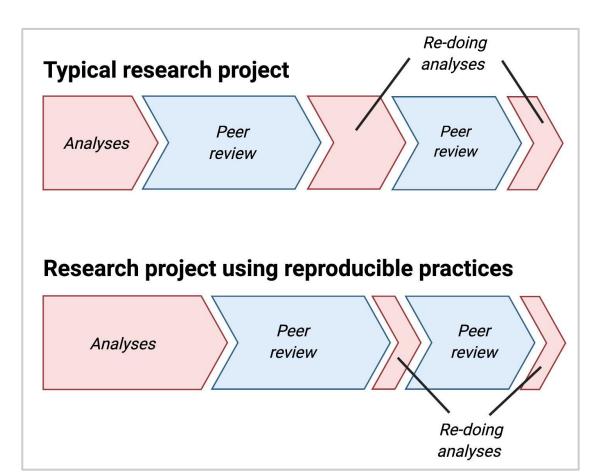
In my experience, you don't lose time doing reproducible science-you just \*relocate\* how you're spending it

000



4:13 nachm. · 26. Nov. 2020 · TweetDeck

107 Retweets 20 Zitierte Tweets 536 "Gefällt mir"-Angaben



Quintana, D. S. (2020, November 28). Five things about open and reproducible science that every early career researcher should know. https://doi.org/10.17605/OSF.IO/DZTVQ

# Work more reproducibly... by finding the champions in your domain!

### Full list of resources for many disciplines at http://bit.ly/rcr-in

### Creating reproducible workflows

Computing environment: hardware + software, containers/virtualisation (Binder), freezing/pinning Script-based workflows: no point-and-click GIS, notebooks (Jupyter, R Markdown) > Research compendium > https://research-compendium.science/

### Challenges (for geography, geosciences, GIScience)

Education, publishing practices, SDIs, GIS, proprietary software, lack of rewards/pressure, sensitive data, time, ...

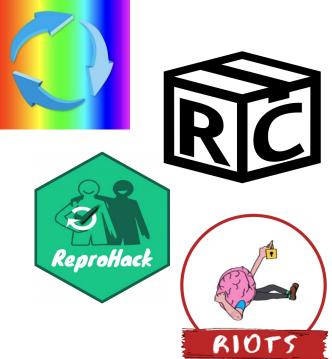
### > all solvable

# What can scientists do?

Take one step at a time.

Create and publish **Research Compendia** (Your code is good enough!): https://research-compendium.science/

Become a **codechecker** or **reprohacker**. Join a **Reproducibility 4 Everyone** workshop.



Strive to be an open science champion **especially** if you're junior in your field. [**RIOT talk by Gavin Buckinham**; **preprint by Sam Westwood**]

Be the change, find communities, do not rely on those in power - they don't know!

# What can communities and institutions do?

Introduce reproducibility reviews - CODECHECK (or not) - at your journals, labs, collaborations!

Workshops on RCR, ReproHacks

Provide support (**R2S2**, PhD edu.)

Rewards and incentives

Community discourse

Awareness > Change



https://giphy.com/gifs/chicagodancecrash-KCqjrcPfL55q3MkgHZ

# Vision

ERC: Executable Research Compendium

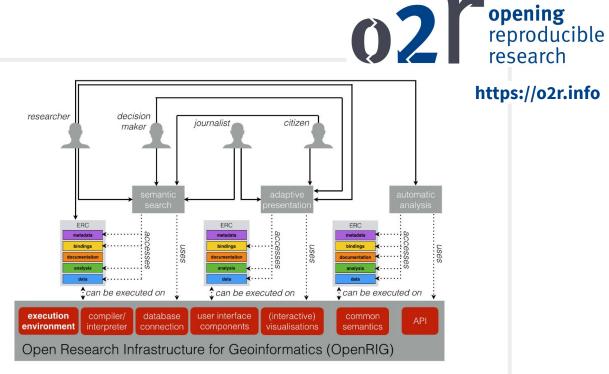
metadata

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analysis

data



**Figure 1** Executable Research Compet ERCs can be integrated into the researc stands for an unvalidated ERC, ERC-V for for a published one. Processes are sequen

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ERC-U

**Figure 2** Open Research Infrastructure for Geoinformatics (OpenRIG): key components (red), essential functionalities enabled by it (grey boxes) and different stakeholders wanting to access them.

<u>Reproducible Research in Geoinformatics: Concepts, Challenges and Benefits (Vision Paper)</u> *Kray C, Pebesma E, Konkol M, Nüst D.* doi:<u>10.4230/LIPIcs.COSIT.2019.8</u> GenR blog: <u>https://genr.eu/wp/a-vision-for-reproducible-research-in-geoinformatics-geography-and-geosciences/</u>

# Thanks!



"Science should be 'show me', not 'trust me'."

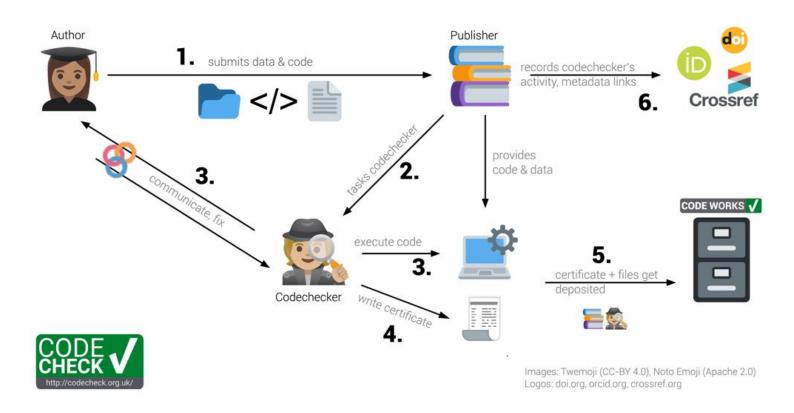


### **Daniel Nüst**

Institute for Geoinformatics, University of Münster d.n@wwu.de | @nordholmen iD 0000-0002-0024-5046

Slides: https://doi.org/10.5281/zenodo.5006379

# **Bonus slides for discussion**



### The CODECHECK example process implementation. Figure 2 of <u>https://doi.org/10.12688/f1000research.51738.1</u>

The left half of the diagram shows a diverse range of materials used within a laboratory. These materials are often then condensed for sharing with the outside world via the research paper, a static PDF document. Working backwards from the PDF to the underlying materials is impossible. This prohibits reuse and is not only non-transparent for a specific paper but is also ineffective for science as a whole. By sharing the materials on the left, others outside the lab can enhance this work.

### https://codecheck.org.uk/process/

# CODE V

https://codecheck.org.uk/

Independent execution of computations underlying research articles.

### https://codecheck.org.uk/register/

#### **CODECHECK** Register

Certificate	Repository	Туре	Issue	Report	Check date
2020-001	O codecheckers/Piccolo-2020	journal (GigaScience)	NA	http://doi.org/10.5281 /zenodo.3674056	2019-02-14
2020-002	O codecheckers/Reproduction-Hancock	community	2	http://doi.org/10.5281 /zenodo.3750741	2020-04-13
2020-003	O codecheckers/Hopfield-1982	community	1	https://doi.org/10.5281 /zenodo.3741797	2020-04-06
2020-004	O codecheckers/Barto-Sutton- Anderson-1983	community	4	https://doi.org/10.5281 /zenodo.3827371	2020-05-14
2020-005	O codecheckers/Larisch-reproduction	community	5	https://doi.org/10.5281 /zenodo.3959175	2020-07-23
2020-006	O codecheckers/Detorakis-reproduction	community	6	https://doi.org/10.5281 /zenodo.3948353	2020-07-16
2020-008	O codecheckers/covid-uk	community (preprint)	8	http://doi.org/10.5281 /zenodo.3746024	2020-04-09
2020-009	O codecheckers/2020-cov-tracing	community (preprint)	9	http://doi.org/10.5281 /zenodo.3767060	2020-04-26
2020-010	O codecheckers/covid-report9	community (preprint)	14	https://doi.org/10.5281 /zenodo.3865491	2020-05-29
2020-011	O codecheckers/covid19model-nature	community (in press)	18	https://doi.org/10.5281 /zenodo.3893138	2020-06-13

				7201000.3693136	
2020-012	O codecheckers/covid19model-report23	community (preprint)	19	https://doi.org/10.5281 /zenodo.3893617	2020-06-14
2020-013	O codecheckers/Spitschan2020_bioRxiv	community (preprint)	20	https://doi.org/10.5281 /zenodo.3947959	2020-07-14
2020-014	O codecheckers/Sadeh-and-Clopath	community	21	https://doi.org/10.5281 /zenodo.3967326	2020-07-28
2020-015	O codecheckers/Liou-and-Bateman	community	22	https://doi.org/10.5281 /zenodo.3978402	2020-08-04
2020-016	O codecheckers/OpeningPractice	journal (J Geogr Syst)	15	https://doi.org/10.5281 /zenodo.3981253	2020-06-02
2020-017	Ocodecheckers/JGSY-D-19-00087	journal (J Geogr Syst)	24	https://doi.org/10.5281 /zenodo.4003848	2020-08-27
2020-018	O reproducible-agile/AGILECA	conference (AGILEGIS)	25	https://doi.org/10.17605/OSF.IO /ZTC7M	2020-07-13
2020-019	♦ 5SVMT	conference (AGILEGIS)	25	https://doi.org/10.17605/OSF.IO /5SVMT	2020-07-13
0000-000	2021-008 © grideq conference (AGILEGIS) 38	https://doi.org/10.17605/ost.log/dog 2021-06-10	95	https://doi.org/10.17605/09E10	2020-07-12
	2021-009 O rdnyu conference (AGILEGIS) 38	https://doi.org/10.17605/ost.io/rdnyu 2021-06-10			
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# The many problems of science

**Publish or perish Broken metrics (citations, JIF)** Structural change not considering senior academics **Publication bias** Long-term funding for tools & infrastructure HARKing p-Hacking Scholarly communication 1.0 Lack of reusability Lack of transparency Lack of reproducibility **Reinventing the wheel Retraction practices** Not invented here syndrome Fraud **Imposter syndrome** No "negative" citation



https://giphy.com/gifs/bbcamerica-cute-animals-lifestory-Ze3RpHue7qkwvcYOOf

**Open Science (OER, OA, OS, OPR) Registered reports/preregistration Altmetrics** Preprints Leiden Manifesto DORA **Vienna Principles Citing data and software Software papers** Data and software as products of research **RSEng & RSEs (software sustainability)** CRediT **Research Compendia Ten Hot Topics Around Scholarly** Publishing Code review (PyOpenSci, ROpenSci, JOSS)

....



Messy Laboratory Stock Photos & Mess... alamycom



The World's Best Photos of lab and mes... hivemin.er.com



Untidy Kitchenware Pile Dirty Dishes Sink Sto...



How to Handle Untidy, Messy Employees | Inc.com inc.com



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essy Desk Is a Sign of Genius, According to Scienc...



Messy Laboratory Stock Photos & Messy L... alamy.com





ssy offices - ... Messy Laboratory Stock Pho... alamy.com



The Messy Desks Behind These Creati... designnews.com





a alamy stock photo

alamy.com

Messy Laboratory Stock Photos & Mes...



Untidiness Cartoons and C...



Are You Messy? Here's Why It Might Mean ....



Top 10 Office Decluttering Tricks lifehacker.com



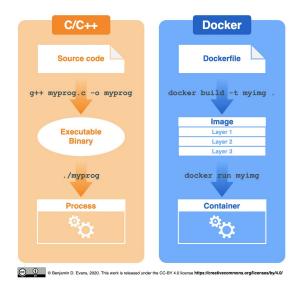




# Ten simple rules for writing Dockerfiles for reproducible data science

Daniel Nüst 👼, Vanessa Sochat, Ben Marwick, Stephen J. Eglen, Tim Head, Tony Hirst, Benjamin D. Evans

Published: November 10, 2020 • https://doi.org/10.1371/journal.pcbi.1008316



	ple Rules for Writing Docke Reproducible Data Science	
1	Use available tools	11
2	Build upon existing images	
3	Format for clarity	
4	Document within the Dockerfile	Ż
5	Specify software versions	×
6	Use version control	ዮ
7	Mount datasets at run time	- <b>C</b> -
8	Make the image one-click runnable	举
9	Order the instructions	t 🖹
10	Regularly use and rebuild containers	10 47
© Benjamin D. 8	Evans, 2020. This work is released under the CC-BY 4.0 license https://creativecommons	.org/licenses/by/4.0/

Comment Open Access Published: 08 December 2015

### Five selfish reasons to work reproducibly

Florian Markowetz 🖂

 Genome Biology
 16, Article number: 274 (2015)
 Cite this article

 15k
 Accesses
 28
 Citations
 443
 Altmetric
 Metrics

https://doi.org/10.1186/s13059-015-0850-7

- reproducibility helps to avoid disaster
- 2. reproducibility makes it easier to write papers
- 3. reproducibility helps reviewers see it your way
- 4. reproducibility enables continuity of your work
- 5. reproducibility helps to build your reputation

# General observations and lessons learned

- **Further improvement over last years submissions better prepared workflows!** Biggest hurdles remain: insufficient documentation, no "quick" variant or lack of expected data size/runtime, links Figures < > Scripts
- **Community understanding better, but needs time**: Had to remind authors to add DASA section how can we be clearer in the communication? Camera-ready papers by authors possible, but exhausting.
- Additional **reproducibility questions for scientific reviewers worked better**, but triggering only by regular reviewers doesn't work well fortunately not too many submission to check for repro chair
- Repro reviews were less strict than original ideal but on par with last year
   promote positive examples and don't expect perfection
- Non-blindness served its purpose, but unblinding also delayed procedures
- Schedule still very much a challenge, partly because infrastructure (EasyChair) does not enable reviewer roles and communication > working around that with scripts and scraping
- Improvements to process were good: clarity in communication for authors that DASA section is mandatory, not attempting short papers, do not offer authors to object to report publications (no problems!)
- Reproduction not attempted != bad science, reproducibility is not binary but a <u>spectrum</u>
   > continue education on reproducibility, increase requirements while practices spread in community

# J. Leek's tidypvals

field Ŵ Animal, veterinary and agricultural science Nutrition And Dietetics Dentistry Pharmacology And Pharmaceutical Sciences Complementary And Alternative Medicine Biochemistry And Cell Biology Plant Biology Informatics, mathematics and physics Chemistry and geology Physiology Economics Zoology Geography, business and economics Education Immunology Psychology and sociology Biomedical Engineering Public Health And Health Services Microbiology Computer sciences Biological Sciences Neurosciences Genetics Ecology, evolution and earth sciences Medical And Health Sciences 0.00 0.25 0.50 1.00 0.75 pvalue

https://**simplystatistics.org**/2017/07/26/announcing-the-tidypvals-package/

The tidypvals package is an effort to find previous collections of published p-values, synthesize them, and tidy them into one analyzable data set. The currently available p-value data sets in this package are:

# **Code Review**





Boettiger, C., Chamberlain, S., Hart, E., & Ram, K. (2015). Building Software, Building Community: Lessons from the rOpenSci Project. Journal of Open Research Software, 3(1), e8. <u>doi:10.5334/jors.bu</u>





# **Code Review Community** Working Group

### **Reproducible computational research in journals & conferences**

ACM Transactions on Mathematical Software



### **Reproducibility** Initiative





# Biostatistics



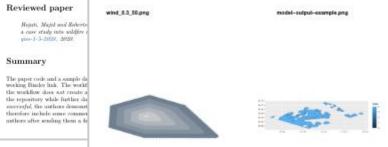




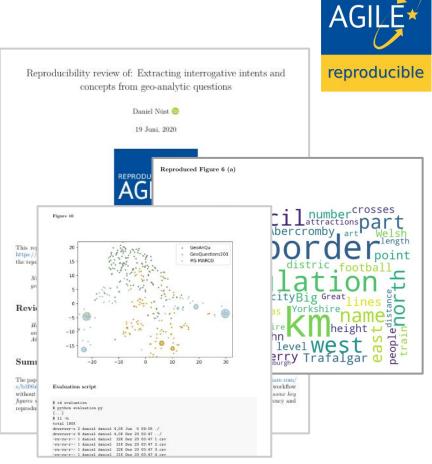
Reproducibility review of: Integrating cellular automata and discrete global grid systems: a case study into wildfire modelling



the report use



### https://doi.org/10.17605/OSF.IO/ZTC7M



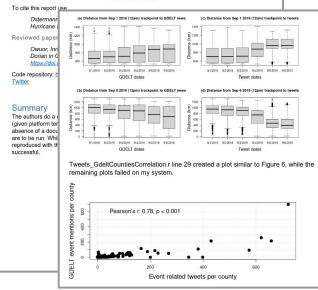
### https://doi.org/10.17605/OSF.IO/7XRQG

#### Reproducibility review: "Tracking Hurricane Dorian in GDELT and Twitter"

This report is part of the reproducibility review at the AGILE conference

For more information see https://reproducible-agile.github.io/

#### This document is published on OSF at https://osf.io/xs5vr/



### https://doi.org/10.17605/OSF.IO/XS5YR

#### Reproducibility review: "Comparing supervised learning algorithms for Spatial Nominal Entity recognition"

	reproducibility	

For more information see https://reproducible-agile.githu

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Ostermann, F. O., and Nüst, D. (2020, July), Rei supervised learning algorithms for Spatial Nomin https://doi.org/10.17605/OSF.IO/SUWPJ

Reviewed paper

Amine Medad, Mauro Gaio, Ludovic Moncla, Sé Comparing supervised learning algorithms for St. AGILE GiScience Ser., 1, 15, https://doi.org/10.5

Source code: https://github.com/MedadAmine/Spatial-

#### Summarv

from sklearn.decomposition import PCA from sklearn.metrics import precision score, recall score, fl score, accuracy score /Users/lmoncla/.pyenv/versions/3.7.3/lib/python3.7/site-packages/treetaggerwrapper.py:740: FutureW The authors have done a commendable job at providing arning: Possible nested set at position 8 re.IGNORECASE | re.VERBOSE) documentation to run the analysis. The reproduction wa //workimoncla/.pyen/versions/3.7.3/lib/python3.7/site-packages/treetaggerwrapper.py:2844: Future Marning: Possible nested set at position 152 computational environment required some initially undo re VERROSE | re TGNORECASE) libraries used, which have now been documented. It sho /Users/lmoncla/.pyenv/versions/3.7.3/lib/python3.7/site-packages/treetaggerwrapper.py:2007: Future Marring: Possible nested set at position 409 requires substantial downloads, disk space, and proces urlMatch re re.completu/UMatch expression, re.VERBOSE | re.IGNORECASE) /Users/looncla/.pyenv/versions/37.37/Lb/python37/site-packages/treetaggerwrapper.py:2879: Future Marring: Possible nested set at position 192 reproduction was mostly successful. EmailMatch re = re.compile(EmailMatch expression, re.VERBOSE | re.IGNORECASE) [2]: def sentences to norans(sentences, noran size, fr nouns file) Reproducibility reviewer notes ngrams = [] The materials on GitHub have an MIT license. context size = int(ngram\_size / 2)
tagger = treetaggerwrapper.TreeTagger(TAGLANG='fr', TAGINENC='utf-8', TAGOUTENC='utf-8') with open(fr\_nouns\_file, "r") as file: fr nouns = file.readlines() Original hiking texts: not available, although there is a list Lexicon: FastText freely available online for s in sentences: s = s.replace(';', '')

Corpus: entire corpus not available, although there is a Samples for analysis available (named corpus), but not

#### Processing

- uses open source libraries

#### - Scripts and hyper-parameters are available

sentence tagged = treetaggerwrapper.make tags(tagger.tag text(s)) sentence = list(np.array(sentence tagged)[:, 0]) # getting only the token (not lemmas except IndexError

> for i, token in enumerate(sentence) if token -- "leee

s = s.replace(\*\*\*, chr(39))
s = s.replace(\*\*\*, chr(39))

s = s.replace("d\'", " deeee ")
s = s.replace("l\'", " leeee ")

**Evaluation of Spatial Nominal Entity Recognition models** This notebook presents the evaluation of the models trained for Spatial Nominal Entity Recognition and proposed in

Conference on Geographic Information Science. 2020

methodological and algorithmic choices by relying on small corpora.

as French

import random import pandas as pd

import numpy as np import treetaggerwrapper from keras.models import load model

from gensim.models import fasttext from joblib import load

Amine Medad, Mauro Gaio Ludovic Moncla, Sébastien Mustière, and Yannick Le Nir. Comparing

supervised learning algorithms for Spatial Nominal Entity recognition. The 23rd AGILE International

This paper presents a methodology comparing five supervised machine learning algorithms for the automatic identification of SNoE from raw texts. The approach uses a pre-trained WEs model as input according to the TL principle. The WEs used as input data for

these algorithms, come from the FastText model pre-trained on a huge corpus of generic texts in French. The FastText model was

chosen because it produced better results, compared to other equivalent WEs models, on so-called morphological rich languages such

The experimental results demonstrate: 1) the feasibility of our approach for the SNoE recognition task. 2) the importance of the context

on this kind of task. Thanks to the use of the principle of transfer learning we have been able to show that it is possible to test

- if token -- 'deeee
- sentence[i] = "dy phrase noram = []
- index left = sentence.index('f' index right = sentence.index(']

### https://doi.org/10.17605/OSF.IO/SUWPJ



reproducible Reproducibility review of: Window Operators for Processing Reproducibility review of: What to do in the Meantime: A Service Coverage Analysis for Parked Autonomous Vehicles Daniel Nüst 💿. Carlos Granell 💿 2020-07-13 This created the file images/analysis-01.07.18-02.07.18.png shown below, which seems seems to loosely match (to be expected due to sampling) a panel of Fig. 2. Confusing is that the created plots is labeled as "vehicles seamlessly reaching one vertex", whereas the Fig. 2 is described in the text as "vehicles reaching all available vertices". um, average and maximum number of vehicles seamlessly reaching one vertex, per 10 minut This report is part of the reproducib https://reproducible-agile.github.io/ cite the report use Nüst, Daniel, and Analysis for Parked Reviewed paper 80 Steffen Illium, Phi meantime: A Servi Ser., 1, 7. https:// \* Sec. -Sec. 60 Summarv The paper data and code With some directions fro 40 trial and error process, w the paper could be recre 1 16 \* \* --No. -- Mar W. 196

### https://doi.org/10.17605/OSF.IO/5SVMT

55

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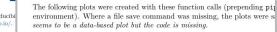
> Nüst. D., & Ostermann, F. O. for Processing Spatio-Temporal 17605/OSF.IO/7TWR2

#### Reviewed paper

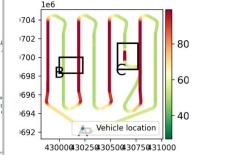
Tobias Werner and Thomas Brink Streams on Unmanned Vehicles. giss-1-21-2020, 2020.

#### Summary

The reproduction was successful. Base (extending the original anonymous sur mented functions and insert the test of provided functions.



Plot density track (Fig. 2), pipenv run python plot density\_track.



### https://doi.org/10.17605/OSF.IO/7TWR2

Spatio-Temporal Data Streams on Unmanned Vehicles

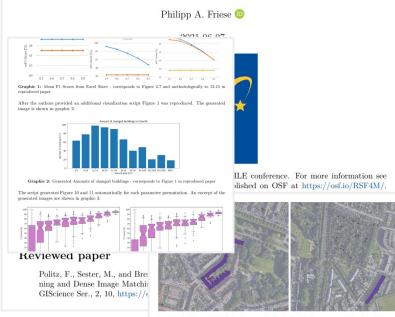
Daniel Nüst 💿, Frank O. Ostermann 💿

2020-07-13

REPRODUCIBLE

Plots

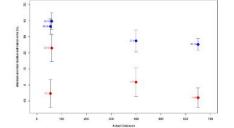
Reproducibility review of: Building Change Detection of Airborne Laser Scanning and Dense Image Matching Point Clouds using Height and Class Information



Graphic 4: Generated Prediction Images, visualised using QGIS, parameters 'jsd prob ct 0.7' - corresponds to Figure 8, 9, and 16 in reproduced paper

#### Reproducibility review of: Investigating drivers' geospatial abilities in unfamiliar environments

Unitaminiar environments Initial execution of the analysis script raised errors while generating Fig. 4. This was however resolved after contacting the authors and Fig. 4 was reproduced. The generated image is shown in Figure 1.



This report is part of the reproduhttps://reproducible-agile.github.ic cite the report use

> Friese, Philipp A. (2021, May abilities in unfamiliar environ

#### Reviewed paper

Karkasina, D., Kokla, M., and iar environments, AGILE GI 2021. Figure 1: Average absolute (blue) and real relative (red) estimation error - corresponds to Figure 1 in reproduced paper

Table 1 and 2 were not generated automatically but instead the corresponding values where printed to the console. After extracting these values and exporting them to .csv files, both tables were reproduced. Refer to Table 1 and 2 in this report, which contain the raw values generated by the script.

Table 1: Spearman correlations Group 1 - corresponds to Table 1 in reproduced paper

type	S statistic	rho	p-valu
SBSOD - Map Errors	463.24	-0.6197337	0.0316
SBSOD – Landmarks omitted	364.51	-0.2745132	0.3879
SBSOD – Road Segments mistakes	471.27	-0.6477894	0.0227
Landmarks omitted- Road Segments mistakes	160.86	0.4375473	0.1549
SBSOD – Direction estimates	233.45	0.1837559	0.5675
SBSOD – Distance estimates	342.00	-0.5545455	0.0766
Map Errors – Direction estimates	278.88	0.0249112	0.9387
Map Errors – Distance estimates	102.19	0.5354817	0.0895
Distance estimates – Direction estimates	205.81	0.0645223	0.8505

Table 2: Spearman correlations Group 2 - corresponds to Table 2 in reproduced paper

type	S statistic	rho	p-value
SBSOD - Map Errors	578.43	-0.5890887	0.03414
SBSOD – Landmarks omitted	520.67	-0.4304142	0.14210

### https://doi.org/10.17605/OSF.IO/DX92A

### https://doi.org/10.17605/OSF.IO/RSF4M

Reproducibility review of: A Comparative Study of Typing and Speech For Map Metadata Creation

#### F.O. Ostermann (D) and Daniel Nüst (D)

npm start

Reproducibility reviewer notes

### This review focuses on the reproduction of the analysis results. No in-depth examination code was conducted, but it was confirmed that the provided code and be run and see application used in the study. Using # with npm version 6.14.8 and node version 14.13.0 npm install we could run the application on http://localhost:8080, as shown in the screenshot belo 00085418292 | and mod PR Sinc

This report is part of the reproducibili https://reproducible-agile.github.io/, T cite the report use

> Ostermann, F. O., & Nüst, D. (202 of Typing and Speech For Map Ma

Figure 1: Screenshot of application executed locally

#### **Reviewed** paper

A clear license is missing in the repository. The most important information (soft overview, exact questionnaire, maps used in the experiment) is also provided as supple

Lai, P.-C. and Degbelo, A.: A Comparative Study of Typing and Speech For Map Metadata Creation, AGILE GIScience Ser., 2, 7, https://doi.org/10.5194/agile-giss-2-7-2021, 2021.

#### Summarv

The paper presents the results of a user experiment to improve GI-metadata using speech. A complete reproduction is practically impossible to achieve. This reproducibility report therefore investigated two components: First, whether sufficient information is provided to replicate the experiment elsewhere with

Reproducibility review of: A Socially Aware Huff Model for Destination Choice in Nature-based Tourism

Jakub Krukar 匝

0001 00 07

This report is part of the reproduci

https://reproducible-agile.github.io/.

Krukar, J. (2021, May 7). Reproducil

in Nature-based Tourism. https://dc

Shi, M., Janowicz, K., Cai, L., Mai, G

in Nature-based Tourism, AGILE G

The code, sample API query, and do

working Binder link. All files containi

Reviewed paper

the report use

2021.

Summary

Construction. ipynb and can be verified by comparing the values from the output of chunk [12] to Table 8 in the paper. I expected that the values in the Number of photos column would stav the same (because the number of photos does not change), but the values in outgoing/incoming trips columns would change.

The location of the threshold variable is marked with an in-code comment in the file Trip Construction.ipvnb:

if length.days > 4: #time threshold: average length of stay in both NPs

#### Table 8 Summary of attractions in Acadia National Park

Attraction	Number of photos	Outgoing trips	Incoming trips
Schoodic Institute	1119	53	64
Bass Harbor	2298	260	288
Southwest Harbor	723	109	111
Northeast Harbor	605	67	76
Bar Harbor	6259	433	357
Wild Gardens of Acadia	550	60	66
Cadillac Mountain	3285	349	345
Penobscot Peak	776	16	15
Bubble Rock	703	83	89
Jordan Pond	1250	227	250
Boulder Beach	536	85	102
Thunder Hole	977	167	185
Sand Beach	1253	216	177

Figure 1: Original Table 8 from the paper

	a	b	c	d	e	1		h		1	k		m	total_out	total_in	cross_boundary	photos
Places																	
Schoodic Institute	0	13	7	1	12	1	8	0	0	4	3	2	6	57	66	123	1119
Bass Harbor	12	0	34	9	64	13	53	4	6	25	12	15	21	268	295	563	2298
Southwest Harbor	3	44	0	6	30	3	15	4	1	4	1	2	2	115	117	232	723
Northeast Harbor	6	16	8	0	13	1	7	0	2	10	1	2	3	68	78	146	605
Bar Harbor	20	60	25	21	0	17	118	3	12	50	15	40	56	437	367	804	6259
Wild Gardens of Acadia	1	3	1	2	10	0	6	1	1	6	4	11	15	61	67	128	550
Cadillac Mountain	8	57	12	13	102	16	0	0	14	51	12	24	45	364	350	704	3285
Penobscot Peak	2	3	3	2	2	0	0	0	0	2	0	1	1	16	15	31	776

### https://doi.org/10.17605/osf.io/7fqtm

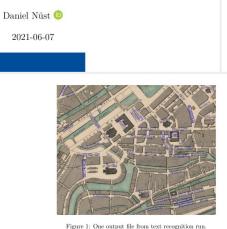
### https://doi.org/10.17605/OSF.IO/4CPM3



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reproducible

Reproducibility review of: Automated Extraction of Labels from Large-Scale Historical Maps



This report is part of the reproduhttps://reproducible-agile.github.ic cite the report use

> Nüst, D. (2021, May 6). Ret Large-Scale Historical Maps.

#### **Reviewed** paper

Schlegel, I.: Automated Ext GIScience Ser., 2, 12, https://

#### Summary

The provided workflow could be pa calculations could be executed and

I could run all cells in String\_Similarity\_by\_Levenshtein\_Distance.ipynb, and found the documentation to be extensive and a little bit raw, though very transparent, including tests by the author while developing the workflow etc. At first I got an error reading the OCR\_results.xlsx file: XLRDError: Excel xlsx file; not supported, so I changed the data loading to use openpyxl # via https://stackoverflau.com/pusitions/8525g535/strd-biffh-mindernor-excel-miss-file-not-supported our results = pd\_read excel("data/UR results.xis", sheet mane\*'Lindley', bander\*1, enrine\*'comparai')

Figure 6 seems to be created using QGIS, but no project file or georeferenced version of the base map was included in the repository.

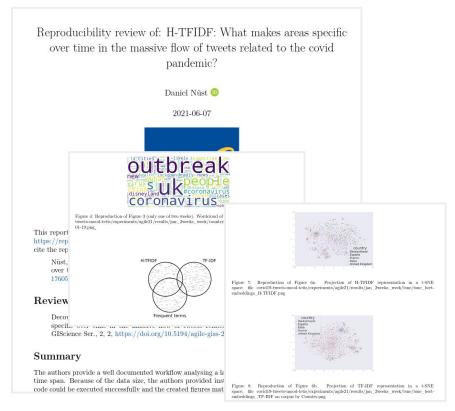
I did not run the final notebook of step "06 Approximate georeferencing", because of the advertised run time, but noticed that the chancels calv is included in a 71D excluse and thus the first fear calls already providing all input and output data for each step, however, some manual steps were included which .. .. .....

reproducible Reproducibility review of: Flood Impact Assessment on Road Network and Healthcare Access – at the example of Jakarta, Indonesia Anita Graser 🔟 2021-06-07 CDF results saved. Histogram results saved normal scenario 60000 4000 This report is part https://reproducible The paper states that "Due to the flood event, 30 (15%) hospitals and 349 (25%) clinics were affected cite the report use and were considered as no longer functional for our analysis. This led to a reduction of 12,000 (16.6%) and 34,500 (25.8%) beds in hospitals and clinics respectively". The sum of 379 affected heath service Graser, A. (20 locations could be confirmed, as shown in the following screenshot: Network and I The resulting CDF plots 17605/OSF.IO Name and You and Series States Ander Anter Anter Anter Man Market Personal H Therefore, it is not strai 🗋 🖮 🛯 성학 : 신북 최종 및 위원의 이유 등 🖬 등 🖥 변경 😂 📵 번 변종 🏹 등 - 🏵 - 10 - 150 - 160 - 170 - 160 - 1 Reviewed paper 9. P & C # 9 . C .. . . A . T . . . . . Klipper, I. G., Zipf, A., and Lautenbach, S.: Floor Access at the example of Jakarta, Indonesia, AGI giss-2-4-2021, 2021. Summary The provided workflow was partially reproduc multiple sources (a Github.com repo, a GitLab r

### https://doi.org/10.17605/osf.io/anv9r

### https://doi.org/10.17605/OSF.IO/G4DCQ

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Reproducibility review of: An Approach to Assess the Effect of Currentness of Spatial Data on Routing Quality

Alexander Kmoch 📵 Daniel Nüst 🕕



This report is part of the reproducibility review at th https://reproducible-agile.github.io/. This document is cite the report use

Nüst, D., & Kmoch, A. (2021, May 19). Reproduc Effect of Currentness of Spatial Data on Routing

#### Reviewed paper

Schmidl, M., Navratil, G., and Giannopoulos, I.: rentness of Spatial Data on Routing Quality, AG 10.5194/agile-giss-2-13-2021, 2021.

#### Summary

The reproduction was successful. All provided scripts cousing the provided data. Some manual steps could not Figure 1: Reproduction of Figure 1: 'Distribution of the 1000 origin and destination points used in the experiment'

#### Table 1

A version of Table 1, naturally with different values, could be recreated from any of the generated GeoJSON files:

Table 1: Reproduction of Table 1

year	duration	distance	geometry
2014	1173.1	11093.7	LINESTRING (16.29116 48.166
2015	1195.8	11180.5	LINESTRING (16.29116 48.166
2016	1176.9	11508.9	LINESTRING (16.29116 48.166.
2017	1175.7	11511.4	LINESTRING (16.29116 48.166.
2018	1174.9	11511.6	LINESTRING (16.29116 48.166.
2019	1181.8	11510.5	LINESTRING (16.29116 48.166.
2020	1183.0	11513.0	LINESTRING (16.29116 48.166

Check route completeness

### https://doi.org/10.17605/rdnyu

### https://doi.org/10.17605/bdu28

#### 59

reproducible



Reproducibility review of: Extraction of linear structures from digital terrain models using deep learning

Daniel Nüst 🔟 and Anita Graser 🔟

2021-06-07



This report is part of the reproducibility review at the AGILE conference. For more inf https://reproducible-agile.github.io/. This document is published on OSF at https://osf.ic cite the report use

Nüst, D., & Graser, A. (2021, April 30). Reproducibility review of: Extraction o structures from digital terrain models using deep learning. https://doi.org/10.17605 2sc7g

#### **Reviewed** paper

Satari, R., Kazimi, B., and Sester, M.: Extraction of linear structures from digital models using deep learning, AGILE GIScience Ser., 2, 11, https://doi.org/10.5194/ag 2-11-2021, 2021.

#### Summary

The provided workflow was **partially reproduced**. Based on the provided test file and in was able to recreate the computing environment and run the segmentation models. Relevan the paper could be recreated. The training and validation part of the workflow is irreprodu

### https://doi.org/10.17605/osf.io/2sc7g

### This finished within a minute! These values match the column SegNet of Table 1, within a level of precision to be expected from such a classification.

hrnet <- read.csv("agile-submission-2021/HRNetBinarySegmentation/files/evaluation\_file.csv")
segnet <- read.csv("agile-submission-2021/SegnetBinarySegmentation//files/evaluation\_file.csv")</pre>

suppressPackageStartupMessages(library("tidyverse"))
dplyr::full\_join(hrnet, segnet) %>%
knitr::kable()

acc	f1_m	loss	model_type	precision_m	recall_m	specific_name
0.9069678	0.7762662	0.2579104	hrnet	0.8187426	0.7393778	simple_binary
0.8787796	0.6977567	0.3094499	segnetCustomized	0.7688990	0.6399856	simple binary

#### Run the next segmentation:

cd sulticlassSegmentation python3 evaluate.py --evaluation\_file=evaluation\_file.csv

This completes and recreates the data in Table 3 within reasonable numerical precision based on the file multiClassEvaluation.csv. It is unclear to me how Table 2 can be constructed from evaluation\_file.csv of this segmentation, but I assume it can be.

multi <- read.csv("agile-submission-2021/multiclassSegmentation/files/multiClassEvaluation.csv")</pre>

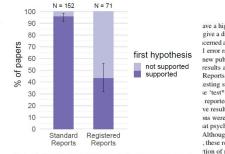
```
rows <- lapply(c0:05), function(class) {
    classValues <- multi %>%
    dplyr:seloct(dplyr:sends_with(as.character(class)))
    names(classValues) <- c("aparae_iou", "prediction", "recall", "fi.score", "support")
    c("Class label" = as.character(class), classValues)
})</pre>
```

dplyr::bind\_rows(rows) %>%
knitr::kable()

Class label	sparse_iou	prediction	recall	f1.score	support
0	0.8952831	0.9270560	0.9630006	0.9446866	12342971
1	0.2073642	0.4009994	0.3745212	0.3873083	247492
2	0.0324831	0.3139039	0.0373107	0.0666941	282037
3	0.7648531	0.8797419	0.8552982	0.8673479	1961849
4	0.4453632	0.6953347	0.5580455	0.6191711	830866
5	0.1593569	0.2697686	0.2787574	0.2741893	145345

#### An excess of positive results: Comparing the standard Psychology literature with Registered Reports

Anne M. Scheel<sup>1</sup>, Mitchell Schijen<sup>1</sup>, & Daniël Lakens<sup>1</sup>



ave a higher probability give a distorted view of icerned about the degree l error rates. Registered new publication format, results are known. We Reports in Psychology esting studies from the se 'test\* the hypothes\*' reported in each paper, ve results in Registered ons were excluded from at psychologists under-Although our study did , these results show that tion of negative results https://doi.org/10.31234/osf.io/p6e9c

Figure 2. Positive result rates for standard reports and Registered Reports. Error bars indicate 95% confidence intervals around the observed positive result rate.

ield Animal, veterinary and agricultural science Nutrition And Dietetics Dentistry Pharmacology And Pharmaceutical Sciences **Complementary And Alternative Medicine Biochemistry And Cell Biology** Plant Biology Informatics, mathematics and physics Chemistry and geology Physiology Economics Zooloav Geography, business and economics Education Immunology Psychology and sociology **Biomedical Engineering** Public Health And Health Services Microbiology Computer sciences **Biological Sciences** Neurosciences Genetics Ecology, evolution and earth sciences Medical And Health Sciences 61.00 0.00 0.25 0.50 0.75 https://simplystatistics.org/2017/07/26/announcing-the-tidypvals-package/ pvalue

# **Structural challenges**

**Metrics** for acknowledging/measuring impact in science **are broken** (impact factor, ..) and they lead to publication bias, HARKing, p-Hacking, intransparency and lack of reproducibility

Leiden Manifesto: http://www.leidenmanifesto.org DORA: https://sfdora.org Vienna Principles: https://viennaprinciples.org

Acknowledging data and software as valuable products of research (instead of shoehorning software into papers)



Data Without Software Are Just Numbers

Authors: James Harold Davenport , James Grant, Catherine Mary Jones http://doi.org/10.5334/dsj-2020-00

# nature International weekly journal of science

Published online 13 October 2010 | Nature 467, 753 (2010) | doi:10.1038/467753a

### Publish your computer code: it is good enough



Freely provided working code — whatever its quality improves programming and enables others to engage with your research, says Nick Barnes.

Nick Barnes

I am a professional software engineer and I want to share a trade secret with scientists: most professional computer software isn't very good. The code inside your laptop, television, phone or car is often badly documented, inconsistent and poorly tested.

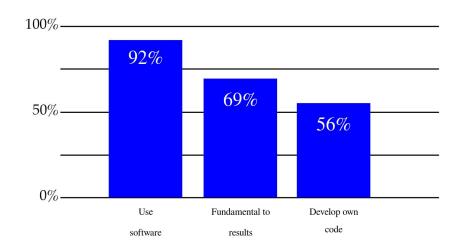
Why does this matter to science? Because to turn raw data into published research papers often requires a little programming, which means that most scientists write software. And you scientists generally think the code you write is poor. It doesn't contain good comments, have sensible variable names or proper indentation. It breaks if you introduce badly formatted data, and you need to edit the output by hand to get the columns to line up. It includes a routine written by a graduate student which you never completely understood, and so on. Sound familiar? Well, those things don't matter.

### https://doi.org/10.1038/467753a

# **Motivation**

Back to 2010 The Software Sustainability Institute (SSI, UK) run a study (1000 randomly chosen researchers) ...

"It's impossible to conduct research without software, say 7 out of 10 UK researchers"



https://www.software.ac.uk/blog/2014-12-04-its-impossible-conduct-research-without-software-say-7-out-10-uk-researchers

# **Motivation**

A study of Nature papers from Jan-March 2016 reveals that

"32 of the 40 papers examined mention software, and the 32 papers contain 211 mentions of distinct pieces of software, for an average of 6.5 mentions per paper."

[2] Nangia, Udit; Katz, Daniel S. (2017): Understanding Software in Research: Initial Results from Examining Nature and a Call for Collaboration. doi: **10.1109/eScience.2017.78** 

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RSEng = create research software RSEs = people behind research software RSEs ≠ IT !!!

**Researcher** uses scripts for data analysis and needs working stable software for her work. She learns what is necessary to achieve her research goals.



### **Software developer** was hired to implement software for a research project and contributes to large collaborative software projects to realise the next generation of digital infrastructure for science.





## "Software is 95% human and only 5% code" \*



**Reproducibility guru** dives deeply into manifold software and tools to make his research reproducible and develops his own software in a sustainable way.



Person for tough problems

knows how to solve all kinds of computer-related issues; he was not hired for that, but enjoys to help and spends time to get to the bottom of other people's challenges.

**Geek** writes software as part of her research project and would like to code more, but must keep an eye on her career in science and needs to write papers.

\* Eric Albers, CCC2019, https://media.ccc.de/v/thms-49-ber-die-nachhaltigkeit-von-software<sub>66</sub> Bilder © H. Seibold, S. Janosch, OSD2019