# CODECHECK: An Open Science initiative for the independent execution of computations underlying research articles during peer review to improve reproducibility

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HTML Slides: http://bit.ly/codecheck22 (CC-BY 4.0 license)

## Declarations and acknowledgements

#### **Declarations**

Affiliate editor of *bioRxiv*; editorial board of *Gigabyte*.

These slides accompany our paper: https://f1000research.com/articles/10-253/

#### **Acknowledgements**

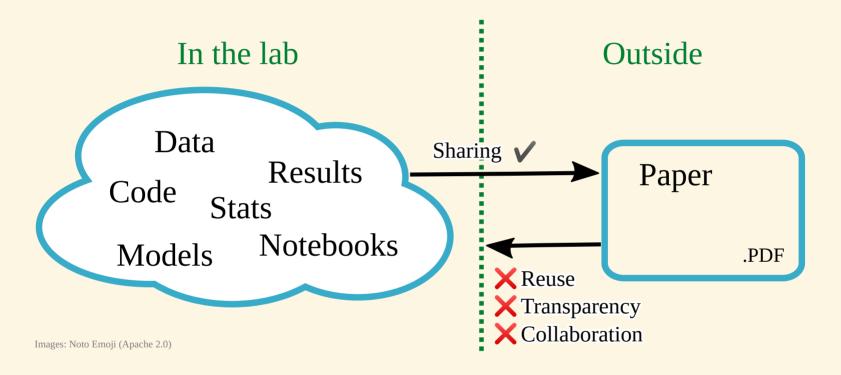
Mozilla mini science grant, UK Software Sustainability Institute.

Editors @ Gigascience, eLife, Scientific Data.

#### **CODECHECK** in one slide

- 1. We take your paper, code and datasets.
- 2. We run your code on your data.
- 3. If our results match your results, go to step 5.
- 4. Else we talk to you to find out where code broke. If you fix your code or data, we return to step 2 and try again.
- 5. We write a report summarising that we could reproduce your finding.
- 6. We work with you to freely share your paper, code, data and our reproduction.

#### **Premise**



We should be sharing material on the left, not the right.

"Paper as advert for Scholarship" (Buckheit & Donoho, 1995)

## Approaches to code sharing

Barnes (2010)

Published online 13 October 20 10 | Nature 467, 753 (2010) | doi:10.1038/467753a Column: World View

# 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.

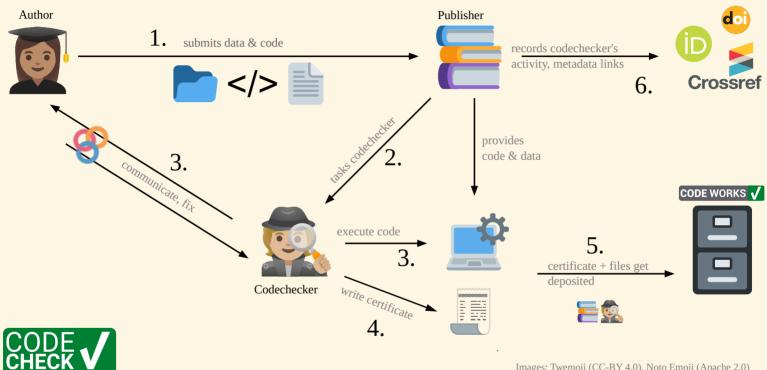
Nick Barnes

- Informal 'code buddy' system
- Community-led research compedia.
- Code Ocean (Nature trial)
- Certify reproducibility with confidential data (CASCAD) (Pérignon et al 2019)

## The CODECHECK philosophy

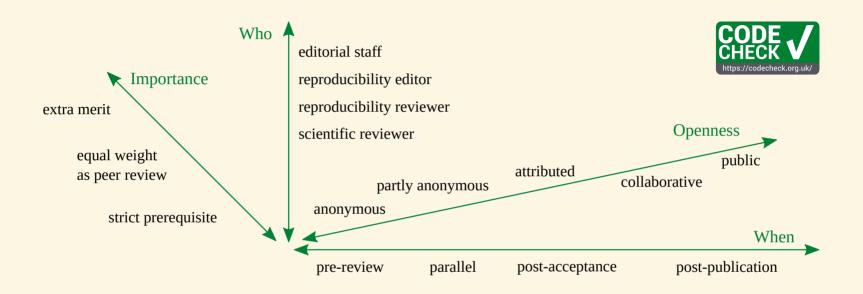
- Systems like Code Ocean set the bar high by "making code reproducible *forever* for *everyone*".
- CODECHECK simply asks "was the code reproducible once for someone else?"
- We check the code runs and generates the expected number of output files.
- The contents of those output files are not checked, but are available for others to see.
- The validity of the code is *not* checked.

## **CODECHECK** process



Images: Twemoji (CC-BY 4.0), Noto Emoji (Apache 2.0) Logos: doi.org, orcid.org, crossref.org

#### Variations in a codecheck



## Core principles

- 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.

#### Who does the work?

- 1. **AUTHOR** provides code/data and instructions on how to run.
- 2. **CODECHECKER** runs code and writes certificate.
- 3. **PUBLISHER** oversees process, helps depositing artifacts, and persistently publishes certificate.

#### Who benefits?

- 1. **AUTHOR** gets early check that "code works"; gets snapshot of code archived and increased trust in stability of results.
- 2. **CODECHECKER** gets insight in latest research and methods, credit from community, and citable object.
- 3. **PUBLISHER** Gets citable certificate with code/data bundle to share and increases reputation of published articles.
- 4. **PEER REVIEWERS** can see certificate rather than check code themselves.
- 5. **READER** Can check certificate and build upon work immediately.

## Our register of certificates

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

CODECHECK Register					
Certificate	Repository	Туре	Issue	Report	Check date
2020-001	Piccolo-2020	journal (GigaScience)	NA	http://doi.org/10.5281/zenodo.3674056	2019-02-14
2020-002	Reproduction-Hancock	community	2	http://doi.org/10.5281/zenodo.3750741	2020-04-13
2020-003	Hopfield-1982	community	1	https://doi.org/10.5281/zenodo.3741797	2020-04-06
2020-004	Barto-Sutton-Anderson-1983	community	4	https://doi.org/10.5281/zenodo.3827371	2020-05-14
2020-005	Larisch-reproduction	community	5	https://doi.org/10.5281/zenodo.3959175	2020-07-23
2020-006	Detorakis-reproduction	community	6	https://doi.org/10.5281/zenodo.3948353	2020-07-16
2020-007	Hathway-Goodman-2018	community	7	NA	NA
2020-008	covid-uk	community (preprint)	8	http://doi.org/10.5281/zenodo.3746024	2020-04-09
2020-009	2020-cov-tracing	community (preprint)	9	http://doi.org/10.5281/zenodo.3767060	2020-04-26
2020-010	covid-report9	community (preprint)	14	https://doi.org/10.5281/zenodo.3865491	2020-05-29
2020-011	covid19model-nature	community (in press)	18	https://doi.org/10.5281/zenodo.3893138	2020-06-13
2020-012	covid19model-report23	community (preprint)	19	https://doi.org/10.5281/zenodo.3893617	2020-06-14
2020-013	Spitschan2020_bioRxiv	community (preprint)	20	https://doi.org/10.5281/zenodo.3947959	2020-07-14
2020-014	Sadeh-and-Clopath	community	21	https://doi.org/10.5281/zenodo.3967326	2020-07-28
2020-015	Liou-and-Bateman	community	22	https://doi.org/10.5281/zenodo.3978402	2020-08-04
2020-016	OpeningPractice	community	15	https://doi.org/10.5281/zenodo.3981253	2020-06-02
CSV source   searchable CSV   JSON   Markdown					

Example certificate: https://zenodo.org/record/3865491/files/codecheck.pdf

## "It ain't pretty, but it works" (H. Bastian)





Independent review @StephenEglen confirmed that @MRC\_Outbreak team's #COVID19 simulation is reproducible: thumbs up from code-checking efforts @nature #COVID19 #covid19science



nature.com

Critiqued coronavirus simulation gets thumbs up from code-checking ef...

Nature - Influential model judged reproducible — although software engineers called its code 'horrible' and 'a buggy mess'.

7:47 PM · Jun 10, 2020 (i)

#### **Limitations**

- 1. CODECHECKER time is valuable, so needs credit.
- 2. Very easy to cheat the system, but who cares?
- 3. Author's code/data must be freely available.
- 4. Deliberately low threshold for gaining a certificate.
- 5. High-performance compute is a resource drain.
- 6. Cannot (yet) support all thinkable/existing workflows and languages.

#### Next steps

- 1. Embedding into journal workflows.
- 2. Training a community of codecheckers.
- 3. Funding for a codecheck editor.
- 4. Come and get involved

For more information please see: http://codecheck.org.uk and #CODECHECK