

# Research transparency & data management

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# The context of Research Data Management



Transparency and reproducibility

From current practice to better practice

References





# Transparency and reproducibility

## The 'reproducibility crisis'



For nearly a decade the reproducibility crisis has featured in the scientific literature [Jasny et al., 2011, Baker, 2016, Munafò et al., 2017]. Low reproducibility rates have emerged from large-scale studies:

- Results from only 39% of psychology studies could be reproduced [Open Science Collaboration, 2015].
- Even lower reproducibility rate in biomedical research [Begley and Ellis, 2012, Prinz et al., 2011].

# Perceptions of the reproducibility crisis



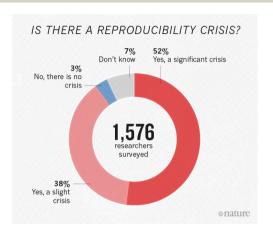


Figure 1: Is there a reproducibility crisis? [Baker, 2016]

## **Motivation: Preserving data**



## MISSING DATA

As research articles age, the odds of their raw data being extant drop dramatically.

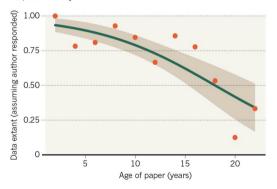


Figure 2: [Vines et al., 2014]

# The response: improved rigour and transparency



## Key guidelines to good practice:

- Findable, Accessible, Interoperable, and Reusable (FAIR) data [Wilkinson et al., 2016, GO-FAIR, 2017].
- Transparency and Openness Promotion (TOP) guidelines [Nosek et al., 2015, COS, 2019].
- Data transparency toolkit [Perkel, 2018].

## The response: from guidelines to mandates



## Mandates for transparency or reproducibility:

- Nature: Transparency Upgrade [Nature, 2017].
- Nature: FAIR data in Earth science [Nature, 2019].
- Copernicus: FAIR data in atmospheric sciences [van Edig, 2018].
- Not just the natural sciences: AJPS requires data and code [Jacoby et al., 2017, AJPS, 2015].
- TOP Guidelines signatories include publishers representing 1000+ journals, as well as professional organisations and major private foundations [COS, 2019].

## **Level 2 TOP Guidelines for authors (excerpt)**



- 2. Authors using original data must:
  - a. make the data available at a trusted digital repository [...]
  - b. include all variables, treatment conditions, and observations described in the manuscript.
  - c. provide a full account of the procedures used to collect, preprocess, clean, or generate the data.
  - d. provide program code, scripts, codebooks, and other documentation sufficient to precisely reproduce all published results.
  - e. provide research materials and description of procedures necessary to conduct an independent replication of the research.

[OSF, 2014]

## **TOP Guidelines: publisher adoption**



COMPARISON OF FOUR PUBLISHER DATA POLICIES TO THE TOP GUIDELINES				
	NOT TOP COMPLIANT Encourages sharing	TOP LEVEL 1 Disclose	TOP LEVEL 2 Require	TOP LEVEL 3 Verify
ELSEVIER				
SPRINGER NATURE				
TAYLOR & FRANCIS	Basic	Share upon reasonable request**	Publicly available Open data Open and fully FAIR	
WILEY				Mandates data sharing and peer reviews data***
MORE JOURNALS IMPLENTING POLICIES	Any journal that merely encourages data sharing	- Psychonomics Society Journals - Nature - Psychological Science - PNAS	- Science - PLOS - Royal Society Journals - Cognition	- AJPS - Biostatistics - JEPS - JPR - Meta-Psychology - QJPS

Figure 3: The Landscape of Open Data Policies [Mellor, 2018]

## **TOP Guidelines: funder endorsement**



## Private funders have endorsed via the Open Funders Research Group:

- Alfred P. Sloan Foundation
- American Heart Association
- · Bill and Melinda Gates Foundation
- · Howard Hughes medical Institute
- John Templeton Foundation
- Laura and John Arnold Foundation
- Open Society Foundations
- Robert Wood Johnson Foundation
- Wellcome Trust
- and six more [OFRG, 2019]

## Other Funder data policies



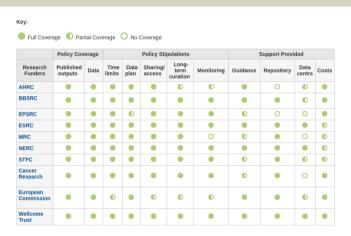


Figure 4: Overview of funders' data policies [DCC, 2019]

# **Data sharing in the NHMRC Statement**



The NHMRC 'strongly encourages' data sharing in the National Statement on Ethical Conduct in Human Research and their Open Access Policy. [NHMRC, 2018a, NHMRC, 2018b]

National Statement 3.1.50

In the absence of justifiable ethical reasons (such as respect for cultural ownership or unmanageable risks to the privacy of research participants) and to promote access to the benefits of research, researchers should collect and store data or information generated by research projects in such a way that they can be used in future research projects. Where a researcher believes there are valid reasons for not making data or information accessible, this must be justified.

# **NHMRC Open Access Policy 2018 changes**



Key changes to the Open Access Policy (15 January 2018)

Research data and metadata (2.2)

NHMRC now strongly encourages researchers to take reasonable steps to share research data and associated metadata arising from NHMRC supported research.

FAIR principles (2.7)

Reference to the Australian F.A.I.R. principles (Findable, Accessible, Interoperable, Reusable) when publishing research literature and sharing data has been made.

# **NHMRC Open Access Policy data sharing**



## Medatdata (4.1)

The metadata for the peer-reviewed publication must be made openly accessible via an institutional repository as soon as possible but no later than 3 months from the date of publication.

## Data (4.2)

NHMRC acknowledges the importance of making research data publicly accessible and therefore strongly encourages researchers to consider the reuse value of their data and to take reasonable steps to share research data and associated metadata arising from NHMRC supported research.

## Legal compliance



- NSW General Retention and Disposal Authority GDA 23; data associated with 'significant' research or researchers must be kept forever (23.6.1) [NSW, 2015]
- NSW Privacy and Personal Information Protection Act 1998 No 133, esp. Part 2, Division 1, Section 19, which flags indicators of high sensitivity and establishes data sovereignty.[NSW, 1998] Compare the (Australian) Privacy Act 1988, esp. Part II, Division 1, Section 6 'Sensitive Information' and Schedule 1, and 'Australian Privacy Principles', Section 8, which covers some university-controlled entities. [AG, 2017, OAIC, 2019a]
- NSW Notifiable Data Breach guidance [IPC NSW, 2018]; see also the Australian Notifiable Data Breaches scheme [OAIC, 2019b]
- EU General Data Protection Regulation [GDPR, 2019]

# Beyond compliance: large-scale research

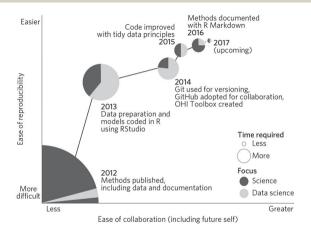


The same approaches that facilitate transparency and reproducibility support the kind of scalable and synthetic research that can address archaeological 'grand challenges'. [Kintigh et al., 2014]

- Paper data capture and manual digitisation and cleaning don't scale.
- Email and desktop software don't scale.

## Scalable approaches to data and analysis





**Figure 5**: Better science in less time, illustrated by the Ocean Health Index project. [Stewart Lowndes et al., 2017]





From current practice to better practice

## What does this mean? Are we ready?



Emerging good practice - and publisher and funder policies - mean:

- Comprehensive, FAIR datasets will be deposited in domain-specific repositories. Data, and especially metadata, quality will be higher.
- Data will be captured digitally as early in research as possible, and provenance / version history maintained.
- Research approach, processes, and procedures will be documented.
- Data processing and analysis will use code (not Excel or ARCGIS!)
- Code will be documented and published for reuse.
- Further steps taken for analytical reproducibility (use of OSS, version control, automation, containerisation, etc.).

## Challenges and paths forward



How do we get from where we are now to where we want to be?

- Understand the evolving expectations of transparent research.
- Look past desktop software (Excel, ARCGIS, Filemaker, Access, etc.).
- Rally around emerging research- and domain-specific solutions (even if imperfect).
- Overcome 'not invented here'; you don't need a bespoke solution.
- Budget for 'ground-up' transparency (data and code). Up-front costs will be high but offer longer-term payoffs (in costs, time, and quality).
- Implement (and budget for) fundamental good practice in data and code management before other technologies.
- Improve research design (prioritise approach over methods)
   [Muthukrishna and Henrich, 2019, Hole, 1973]





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## Thank you!



Source code for this presentation is available at: https://github.com/saross/Research-Transparency

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