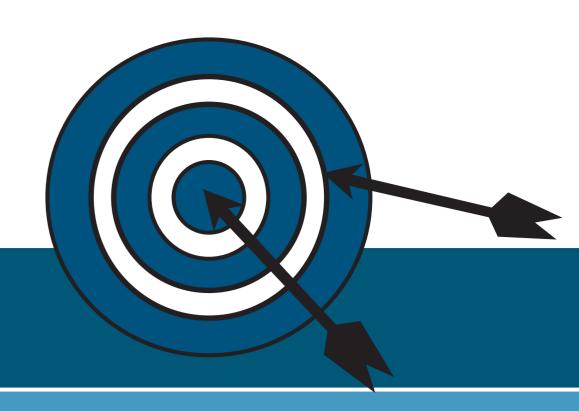
# Collaborative effort needed to address the 'Reproducibility Crisis'

Some large-scale efforts to reproduce scientific findings have been unsuccessful. Reproducibility depends on robust design, and also the availability and transparency of the data and methods.

'Reproducibility' – the ability of a researcher to duplicate the results of a prior study using the same materials and procedures as were used by the original investigator. (National Science Foundation)



# Selected high-profile publications revealing the crisis

2005

John loannidis publishes his landmark paper in Plos Medicine titled: 'Why most research findings are false'.1

2011-2015

'Reproducibility Project: Psychology', led by Brian Nosek, co-founder of the Center for Open Science, attempted to replicate 100 original psychology studies. Only 36% could be replicated.<sup>2</sup> 2012

Biotech company Amgen set out to confirm cancer research findings. 47/53 preclinical research papers could not be reproduced.3

2013 to present

'Reproducibility Project: Cancer Biology' aimed to replicate 50 preclinical studies published in Nature, Science and Cell. Early findings indicate these papers do not contain sufficient details about the method to allow them to be reproduced.4

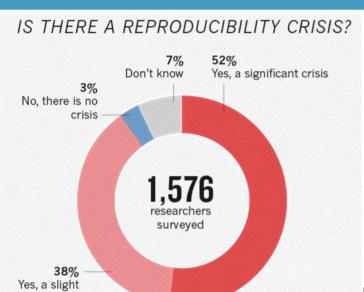
2014

Prominent *Nature* survey revealed the perception of a reproducibility crisis among researchers (see Figure 1).5

2017

Munafò, Nosek and co-authors propose the adoption of key measures for reproducible science in their manifesto.6

## Contributing factors underpinning the crisis



- Quality of reporting (i.e. insufficient detail to replicate the experiment)
- Data not made available
- Poor experimental design (e.g. no blinding or randomisation and low statistical power)
- Misinterpretation of data and cognitive bias
- Selective reporting
- Pressure to publish

Figure 1. Reprinted by permission from Macmillan Publishers Ltd: Nature (doi: 10. 1038/533452a), copyright (2016)

## Potential initiatives from stakeholders

#### Researchers

- Follow appropriate guidelines for experimental design<sup>7</sup>
- Make research processes transparent and accessible (e.g. ARRIVE guidelines for reporting animal studies)
- Adopt data management, sharing and storage procedures and guidelines
- Participate in open peer-review processes
- Provide mentorship to early career researchers
- As a peer reviewer, closely scrutinise the experimental section and statistical analysis

#### **Funders**

- Promote study pre-registration (where relevant)
- Provide incentives for open-science practices
- Allocate funding for replication studies
- Discourage awardees from publishing in predatory journals
- Use checklists to ensure robust experimental design
- Enforce greater transparency of open data and methods

## **Publishers**

- Improve the quality of reporting
  - Increase transparency and openness (TOP guidelines)
  - Consolidated Standards of Reporting Trials (CONSORT)
  - Preferred Reporting Items for Systematic Reviews and Meta-Analyses (PRISMA)
  - Use field-specific checklists upon submission
- Incorporate pre- and post-publication peer review
- Avoid actively promoting impact factor (DORA guidelines)
- Encourage the publication of replication studies and negative findings

#### Institutions

- Invest in methodological training particularly in research design and statistical analysis
- Acknowledge and provide incentives for open-science practices
- Support open-access initiatives
- Provide access to tools that facilitate reproducible research

#### Working together at Monash

- Facilitating research transparency by providing a repository for sharing and archiving data and research outputs e.g. monash.figshare
- Librarians and research managers partner to provide in-house education, advice and resources for researchers
- Provision of consulting services for statistical methods and approaches

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