



Enhancing Trust, Integrity and  
Efficiency in Research through  
next-level Reproducibility



# Enhancing Trust, Integrity and Efficiency in Research through next-level Reproducibility – the TIER2 project

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Max Planck Digital Library Open Science Day 2024 – 30<sup>th</sup> January 2024



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# TIER2 in a nutshell

## TIER2: enhancing Trust, Integrity And Efficiency In Research through next-level Reproducibility

- Investigate reproducibility in social, life, computer sciences, plus funder and publisher contexts
- Co-creative approach to creating and evaluating new reproducibility tools and practices
- 2 million Euros from EC Horizon Europe and UKRI
- January 2023 to December 2025



<http://tier2-project.eu/>

# TIER2

Organisation	Principal investigator
Know-Center GmbH, Austria	Tony Ross-Hellauer (m)
Athena Research Center, Greece	Thanasis Vergoulis (m)
Stichting Vumc, Netherlands	Joeri Tjldink (m)
Aarhus University, Denmark	Jesper Schneider (m)
Pensoft Publishing, Bulgaria	Lyubomir Penev (m)
GESIS, Germany	Hajira Jabeen (f)
OpenAIRE, EU	Natalia Manola (f)
Charite, Germany	Alexandra Bannach-Brown (f)
University of Oxford, UK	Susanna-Assunta Sansone (f)
Biomedical Sciences Research Center Alexander Fleming, Greece	Martin Reczko (m)



# Why should we care? – Quest for Truth



Image: Neil Webb, "Nothing in the Rulebook"

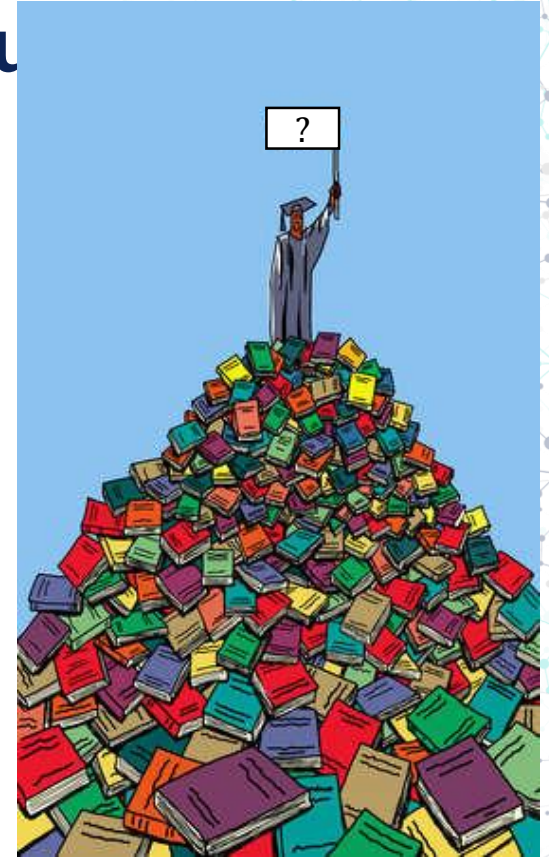
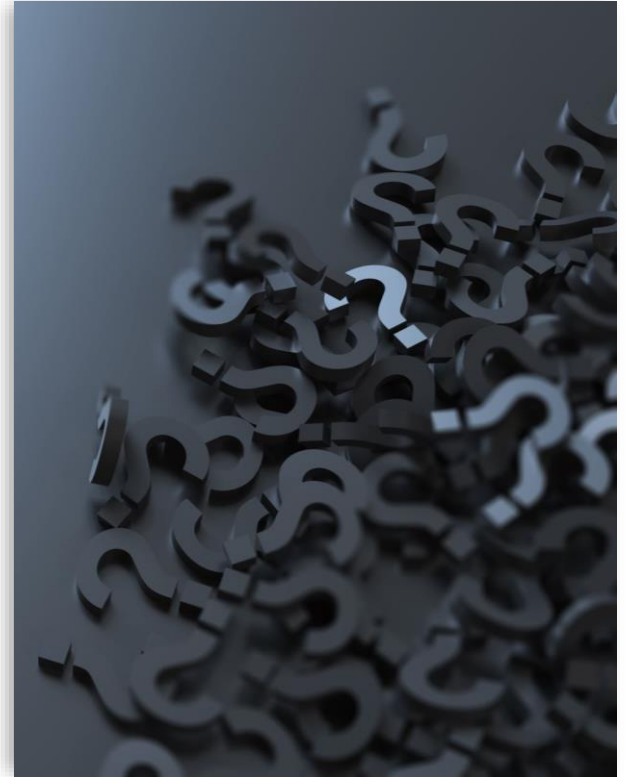


Image: [Anthony Bari](#) 520758

# What is reproducibility?

- Definitions vary (a lot)
  - Using the same words for different things (reproducibility / replication)
  - Taxonomies for the different aspects of research that can be made reproducible/replicable
- Key distinction between:
  - *Methods reproducibility*: - “reproducible in principle”, sufficient documentation and sharing of methods, protocols, data, code, etc. to enable the work to be reproduced.
  - *Results reproducibility*: - successful reproduction/replication when a study is repeated, i.e., the results are sufficiently similar across both studies
- At its highest level, just obtaining consistent results when repeating experiments and analyses



# Reliability of findings are in question



## Why Most Published Research Findings Are False

John P. A. Ioannidis



Believe it or not: how much can we rely on published data on potential drug targets?

Florian Prinz, Thomas Schlange & Khusru Asadullah

BMJ

BMJ 2014;348:g3725 doi: 10.1136/bmj.g3725 (Published 13 June 2014)

### Evidence based medicine: a movement in crisis?

Trisha Greenhalgh and colleagues argue that, although evidence based medicine has had many benefits, it has also had some negative unintended consequences. They offer a preliminary agenda for the movement's renaissance, refocusing on providing useable evidence that can be combined with context and professional expertise so that individual patients get optimal treatment



The same algorithm can learn to walk in wildly different ways.

COMPUTER SCIENCE

### Artificial intelligence faces reproducibility crisis

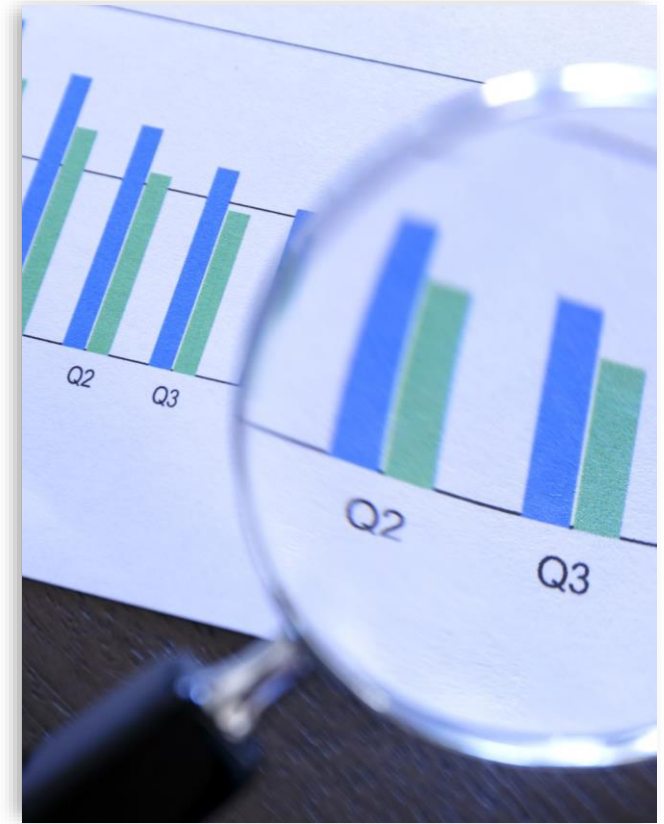
Unpublished code and sensitivity to training conditions make many claims hard to verify

### Power failure: why small sample size undermines the reliability of neuroscience

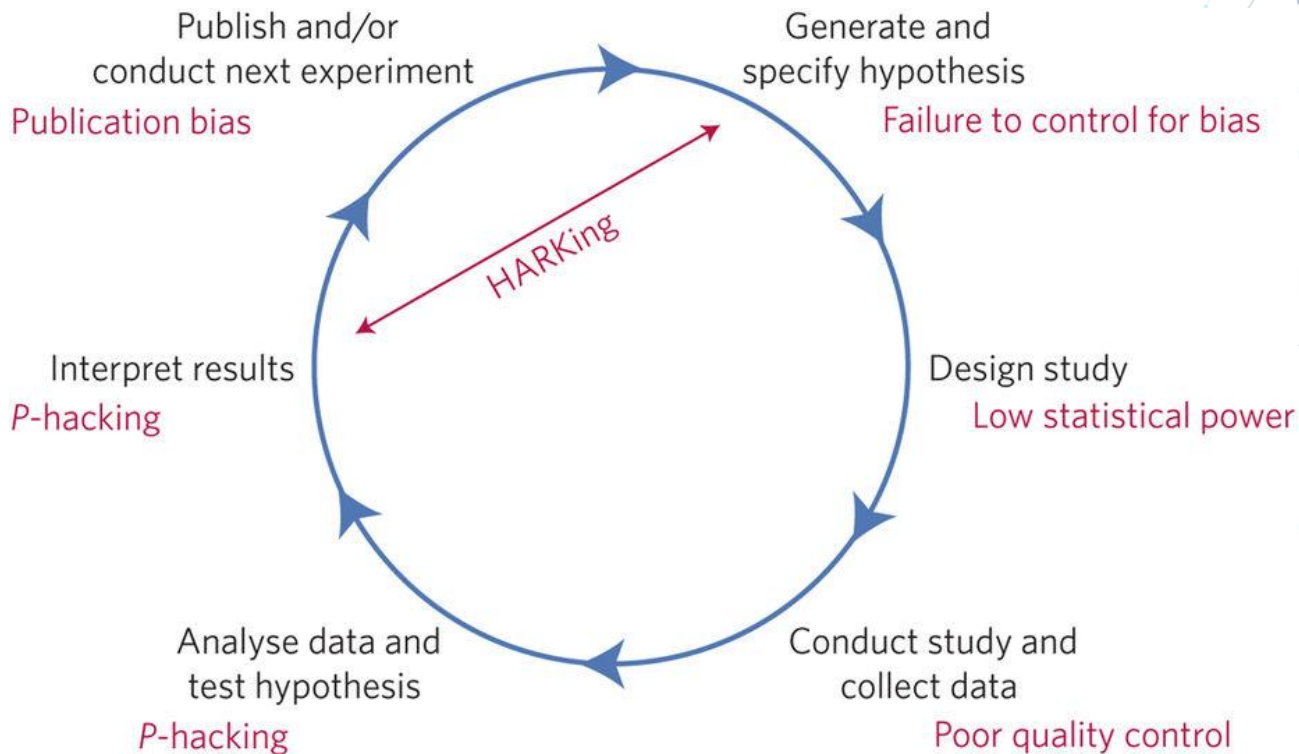
Katherine S. Button<sup>1,2</sup>, John P. A. Ioannidis<sup>3</sup>, Claire Mokrysz<sup>1</sup>, Brian A. Nosek<sup>4</sup>, Jonathan Flint<sup>5</sup>, Emma S. J. Robinson<sup>6</sup> and Marcus R. Munafò<sup>1</sup>

# Causes

- Lack of transparency
- Poor reporting of methods
- Lack of sharing of data/code
- Lack of reproduction/replication studies
- Publication bias towards reporting of positive results
- Questionable research practices



# Threats to reproducible science





# Funders are taking note

2020 European Commission Scoping Report\* recommended dedicated **funding lines**, testing and scaling of **interventions**, **capacity-building**, alignment of **policies**

↳ 2022 EC Horizon Europe call for Research and Innovation Projects on the theme “**Increasing the reproducibility of scientific results**”

↳ **3 projects** funded for total **~6m Euros** from EC and UKRI



iRISE



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

# Strategic priorities: The TIER2 approach

The screenshot shows the header of a RIO grant proposal. It includes the RIO logo (Research Ideas and Outcomes 8: e98457, doi: 10.3897/rio.8.e98457), an Open Access icon, and a Creative Commons icon. Below the header is a blue bar with the text "Grant Proposal". The main title is "TIER2: enhancing Trust, Integrity and Efficiency in Research through next-level Reproducibility". The authors listed are Tony Ross-Hellauer\*, Thomas Klebel‡, Alexandra Bannach-Brown§, Serge P.J.M. Horbach¶, Hajira Jabeen¶, Natalia Manola¶, Teodor Metodiev¶, Haris Papageorgiou\*, Martin Reczko\*, Susanna-Assunta Sansone\*, Jesper Schneider†, Joeri Tjeldink†, and Thanasis Vergoulis\*. A list of affiliations follows, including Know-Center GmbH, Charité - Universitätsmedizin Berlin, Aarhus University, GESIS-Leibniz-Institut, OpenAIRE AMKE, Penseff Publishers, Athena - Athena Research & Innovation Center, Biomedical Sciences Research Center Alexander Fleming, Oxford e-Research Centre, and Stichting VUmc. At the bottom, it shows the corresponding author Tony Ross-Hellauer (tross@know-center.at) and a "Reviewable v1" status. The submission and publication dates are 07 Dec 2022 and 08 Dec 2022, respectively.

Research Ideas and Outcomes 8: e98457  
doi: 10.3897/rio.8.e98457

OPEN ACCESS

Grant Proposal

## TIER2: enhancing Trust, Integrity and Efficiency in Research through next-level Reproducibility

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Reviewable v1

Ross-Hellauer T et al. (2022) TIER2: enhancing Trust, Integrity and Efficiency in Research through next-level Reproducibility. Research Ideas and Outcomes 8: e98457. <https://doi.org/10.3897/rio.8.e98457>

# 5 key principles

1. Reproducibility is an opportunity, not a crisis;
2. Epistemic diversity (variation across modes of knowledge production and socio-technical contexts) must be centred;
3. Evidence must be systematised for informed policy across contexts;
4. Action must be targeted holistically to boost capacity at all levels.
5. Emphasize inclusion to minimize unintended consequences and maximize equitable transition

# The solution: How will TIER2 increase reproducibility?

## TIER2 Partners



Create conceptual frameworks for assessing the state of reproducibility across scientific domains and contexts













Co-create reproducibility-related tools and interventions for different disciplinary contexts.



Build capacity to tackle reproducibility issues by linking and empowering individuals and networks.



Co-create a policy roadmap on relevant priorities for improvement of future reproducibility and science integrity.

-  Know-Center GmbH – Project Coordinator
-  Athena Research Center
-  Biomedical Research Center Fleming
-  Stichting VUmc Amsterdam
-  Aarhus University
-  Pensoft Publishers
-  Gesis Leibniz Institute for Social Sciences
-  OpenAIRE
-  Charité - Universitätsmedizin Berlin
-  University of Oxford

# TIER2 methodological steps

NETWORK & EMPOWER

Co-creation - Strategic Alignment  
Training - Skills - Reproducibility Hub

6

1

## CONCEPTUALISE

Conceptual framework for epistemic diversity across cases

Scope the evidence  
Inventory tools and practices



2

## DESIGN

Future studies to prioritise design elements

Co-creation of pilots

Develop assessment framework



3

## IMPLEMENT

Develop & pilot tools for

- Researchers
- Publishers
- Funders

to enable & monitor reproducibility



4

## ASSESS

Implement pilot assessment framework

Synthesise findings to evaluate gains & savings



5

## RECOMMEND & REFLECT

Co-create future roadmap & policy recs

Reflect on TIER2 radical reproducibility practices

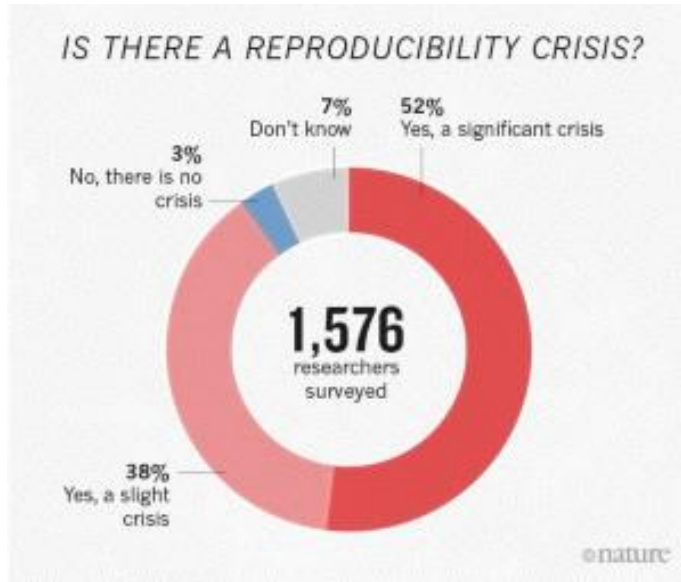


USE CASES

Social Sciences - Life Sciences - Computer Science/AI  
Publishers - Funders

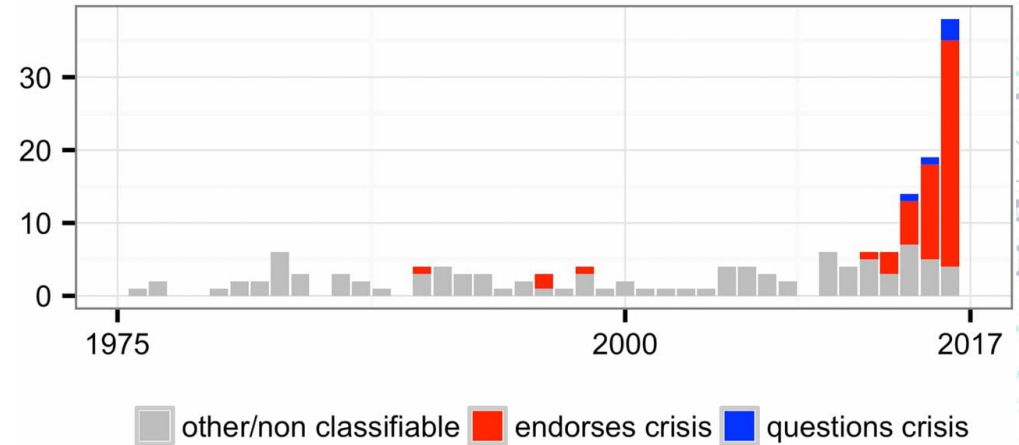
# 1. Frame reproducibility as a reformation, not a crisis

# Research in crisis?



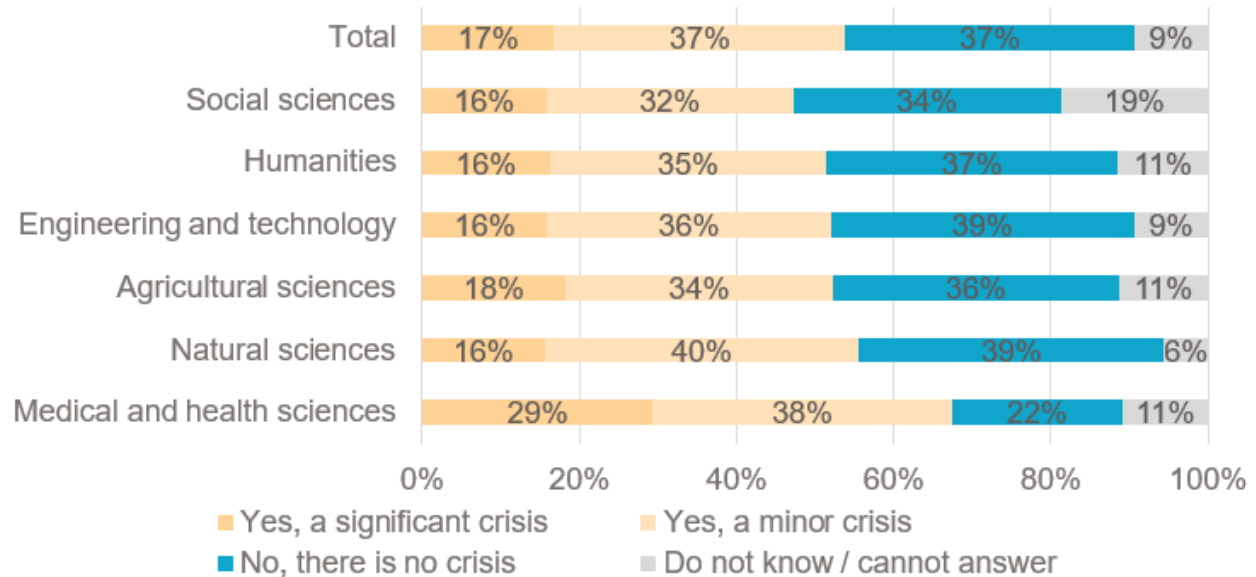
Baker, M. 1,500 scientists lift the lid on reproducibility. *Nature* 533, 452–454 (2016). <https://doi.org/10.1038/533452a>

Frequency of Crisis Narrative in Web of Science Records



Fanelli D. Is science really facing a reproducibility crisis, and do we need it to? *Proc Natl Acad Sci USA*. 2018;115(11):2628–2631. <https://doi.org/10.1073/pnas.1711111115> pmid:29531051

# 2022 – Less so?



European Commission, Directorate-General for Research and Innovation. 2022. Assessing the reproducibility of research results in EU Framework Programmes for Research final report. <https://data.europa.eu/doi/10.2777/186782>



# An opportunity not a crisis?

*“Rather than viewing the current debate around the reproducibility and replicability of research findings as a “crisis”, it is more constructive in our view to frame it as an opportunity to reflect on which aspects of relevant working practices continue to be effective, which can be improved, and which new ways of working can beneficially be introduced to the research ecosystem.”*

Munafò, M.R., Chambers, C., Collins, A. et al. The reproducibility debate is an opportunity, not a crisis. BMC Res Notes 15, 43 (2022). <https://doi.org/10.1186/s13104-022-05942-3>

## 2. Centre epistemic diversity.

# Forms of reproducibility across research contexts

- Discussion on reproducibility led by specific disciplines like medicine & psychology
- Yet, per Leonelli: “Reproducibility for data-intensive research comes in a variety of forms geared to specific features of the research environment”, e.g.,:
  - Assumed degree of control over research conditions
  - Dependence on statistics as inferential tool
  - Precision of the research goals
  - Dependence on researchers’ judgement”
- And what of non-data intensive research? (Open question)

# Leonelli - Sources of epistemic diversity relevant to Open Science\*

## MATERIAL

- ▶ Target objects
- ▶ Materials

## CONCEPTUAL

## METHODOLOGICAL

- ▶ Standards
- ▶ Methods

## INFRASTRUCTURAL (capacity res. environment)

- ▶ Funding
- ▶ Infrastructures
- ▶ ICT and other technologies
- ▶ Mobility and transports

## SOCIO-CULTURAL

- ▶ System of research assessment (locally and nationally)
- ▶ Legal and ethical accountability
- ▶ Geo-political location
- ▶ Language
- ▶ Values and goals
- ▶ Characteristics of researchers (gender, class, ethnicity, age, physical ability..)

## INSTITUTIONAL

- ▶ Career stage and power dynamics
- ▶ Institutional and administrative support
- ▶ Field of study and related norms / venues for publishing and exchange
- ▶ Intellectual property regimes

# In TIER2 ...

- Investigation of relevance and feasibility of reproducibility across modes of knowledge production
  - Theoretical investigation led by Jesper Schneider, Aarhus University
  - *Ulpts, S., & Schneider, J. W. (2023). Knowledge Production Modes: The Relevance and Feasibility of 'Reproducibility'. <https://doi.org/10.31222/osf.io/ujnd9>*
  - “Future studies” investigations with researchers, publishers and funders to investigate views of what is necessary to increase reproducibility
- Pilots of new tools in various contexts (social, life, computer sciences + funders and publishers)

# 3. Systematize evidence for informed policy across contexts

# Q. How do reproducibility interventions affect outcomes across contexts?

- Currently, much of the debate and evidence comes from a relatively narrow slice of the research spectrum
- Need to acknowledge that across contexts (e.g., disciplinary, geographic, demographic), communities face different problems and are at different levels of readiness
- Even within research areas, not all interventions equally effective
  - E.g., Vazire ([2018](#)) suggests that although increased reproducibility may raise productivity in general, productivity may be reduced in some subfields
- What generalities can we find in common issues across disciplines, and what specificities?

Vazire, S. 2018. "Implications of the Credibility Revolution for Productivity, Creativity, & Progress." *Perspectives on Psychological Science* 13 (4): 411–17.  
<https://doi.org/10.1177/1745691617751884>.

# Scoping the evidence in TIER2

- Scoping review and evidence mapping of interventions aimed at improving reproducible and replicable science
- All disciplines and contexts (incl. publishing, funding)
- Study underway (collaboration with OSIRIS project)
- Currently reviewing >25,000 records
- Protocol online: <https://osf.io/rhe9k>





# TIER2 pilots on new tools and interventions

\*(under development!)



## Researchers

- **Reproducibility hub** (resources for awareness, training, checklists hosted via Embassy of Good Science)
- **Reproducible workflow tools**
  - “Schema” extension for Life Science
  - Methods Hub for computational social science
  - Tools for transparency in qualitative research



## Funders

- **Reproducibility promotion plans** for funder policy development
- **Reproducibility monitoring dashboard** – indicators of levels of Open Science and reproducibility practices
- **Reproducibility management planning tool** (extension of Data Management Plan concept)



## Publishers

- **Data Availability Statements** (intervention to improve clarity/efficacy of Data Availability Statements)
- Training/education on **workflows for editorial checks on data**

# 4. Work together to boost capacity at all levels

# Elements of research culture change (from Nosek, 2019)

- Treat reproducibility as a “full stack” problem
- Joined-up approaches for coordinated change at all levels
- Building on the great strides already made
  - Reproducibility Networks
  - **Open** infras, e.g., OSF, EOSC
  - Research assessment reform (COARA)

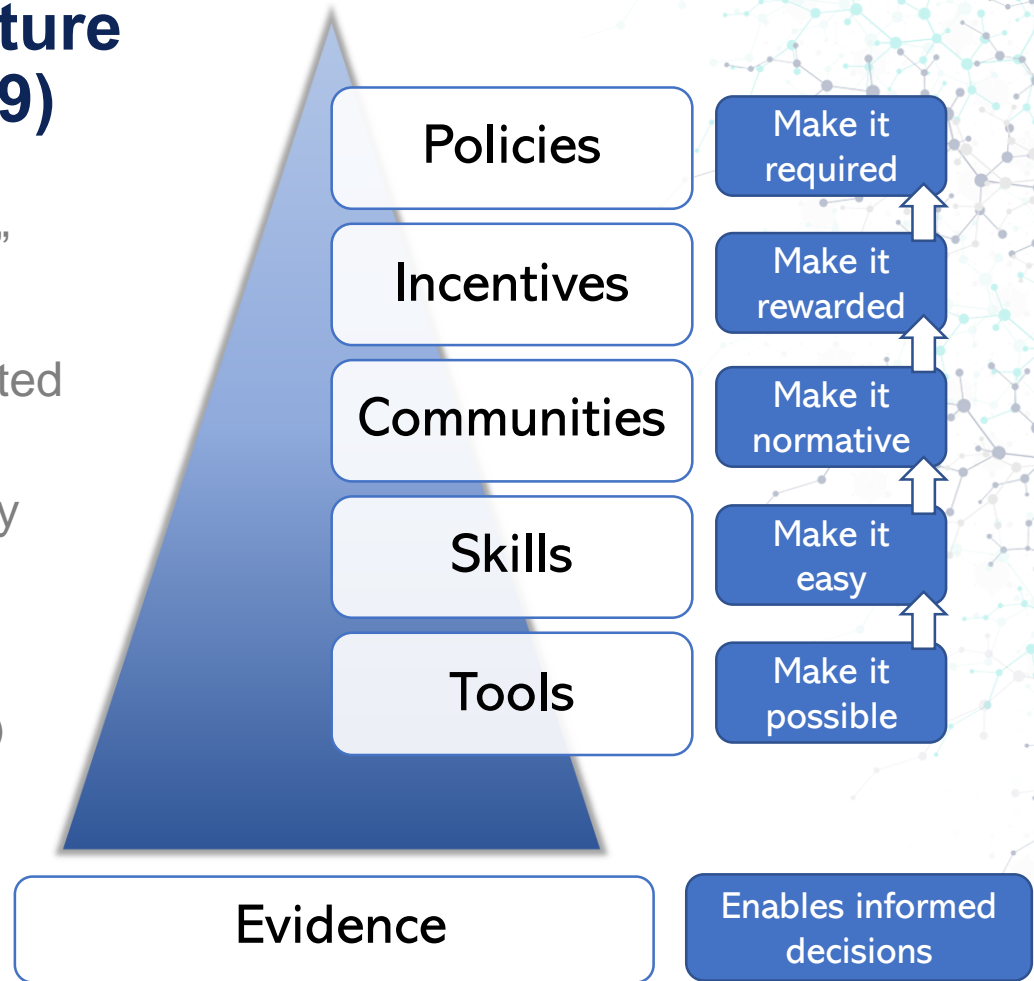


Figure adapted from CC BY figure in: Nosek, B. 2019. “Strategy for Culture Change.” 2019. <https://www.cos.io/blog/strategy-for-culture-change>.

# TIER2 is well linked to, and empowers, other networks

## Including:

- **Reproducibility Networks**
  - via several National RNs, incl UKRN, German Reproducibility Network
- **Research Data Alliance (RDA)**
  - via the FAIRsharing WG, OpenAIRE
- **EOSC and other European Research Infrastructures**
  - via OpenAIRE and FAIRsharing
- **Center for Open Science (COS)**
  - we share members between COS Board of Directors and TIER2 Advisory Board
- **Publisher and Funder networks**
- **Fellow EC reproducibility projects iRISE & OSIRIS**



# Collaboration with sister projects

- Evidence scoping (interventions, outcomes)
- Assessment/monitoring indicators
- Events, community-building
- Self-reflection on own practices
- Investigation of new interventions



FAIRlady @SusannaASansone · May 9

#Metascience2023 @tonyR\_H on @TIER2Project & sisters projects OSIRIS, iRISE. #TIER2 enhances trust, integrity, efficiency in research through next-level #reproducibility Excited to be part of TIER2 via @FAIRsharing\_org resource & #FAIRdata expertise [▶ tier2-proje](#)

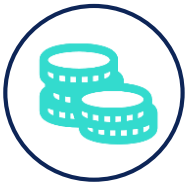


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# The TIER2 Award for establishing a Reproducibility Network



- The aim is to foster the creation of three new Reproducibility Networks (RNs) in “Widening participation” countries.

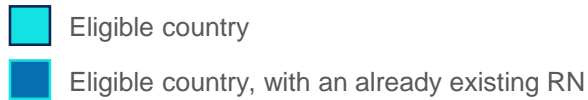


- Three selected consortia will receive an award of €5000 each to organize an initial establishment meeting

# The TIER2 Award - “Widening participation” countries

## “Widening participation” countries

- EU member states
- Associated countries



## Meet the Awardees

# TIER2 Reproducibility Network Award Winners



### Ukraine Consortium



Institute for Open Science & Innovation (INOSI)



OPTIMA Project Consortium



Lviv Polytechnic National University



### Georgia Consortium



Tbilisi State Medical University



Tbilisi State University



Caucasus International University

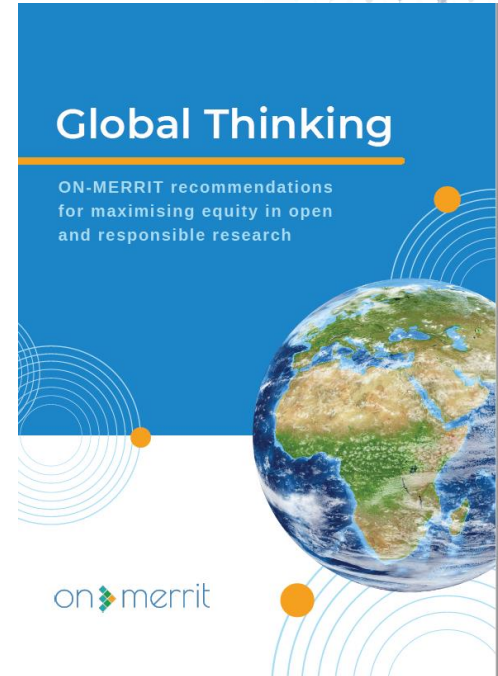
Read more at: [tier2-project.eu/news](https://tier2-project.eu/news)



**5. Emphasize inclusion to minimize unintended consequences and maximize equitable transition**

# Avoiding unintended consequences

- Not all impacts will be positive, and trade-offs and unintended consequences are to be expected
- Need special attention on ways that variance in epistemic diversity alters what is desirable in terms of reproducibility
- Respect differences in levels of advancement in dealing with these issues across these contexts
- Ensure that policies reflect this diversity, and harness openness of infrastructures, tools, services, and training to move as a global community



## In TIER2 ...

- Developing open, collaborative solutions
- Collaborative Working Group across sister projects on DEI
- Working with newly established RNs in widening participation countries to address and minimise unintended consequences

# Priorities for Reproducibility Reform



## 1. Frame reproducibility as a reformation

Ditch the 'crisis' narrative and reframe debate to emphasize the opportunities possible through a broad holistic movement towards reproducibility reformation



## 2. Centre epistemic diversity

Better understand the meanings, implications and conditions of/for reproducibility across disciplinary, methodological, geographic and stakeholder contexts



## 3. Systematize the evidence

Foster (systematic) experimentation across, between and within contexts to generate comparative findings, inform/cross-pollinate interventions, identify trade-offs



## 4. Collaborate to boost capacity

Network existing initiatives across dimensions of research to build capacities and harness network effects, especially by empowering the Reproducibility Networks



## 5. Minimize unintended consequences

Be alert to possible negative impacts and trade-offs, and work to maximize equitable transition, especially through global dialogue and open infrastructures/services



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# Acknowledgements

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Slides from Tony Ross Hellauer & TIER2 Project

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# Thank you!

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TIER2 Project



<https://tier2-project.eu/>