



Biomedical Replication Studies

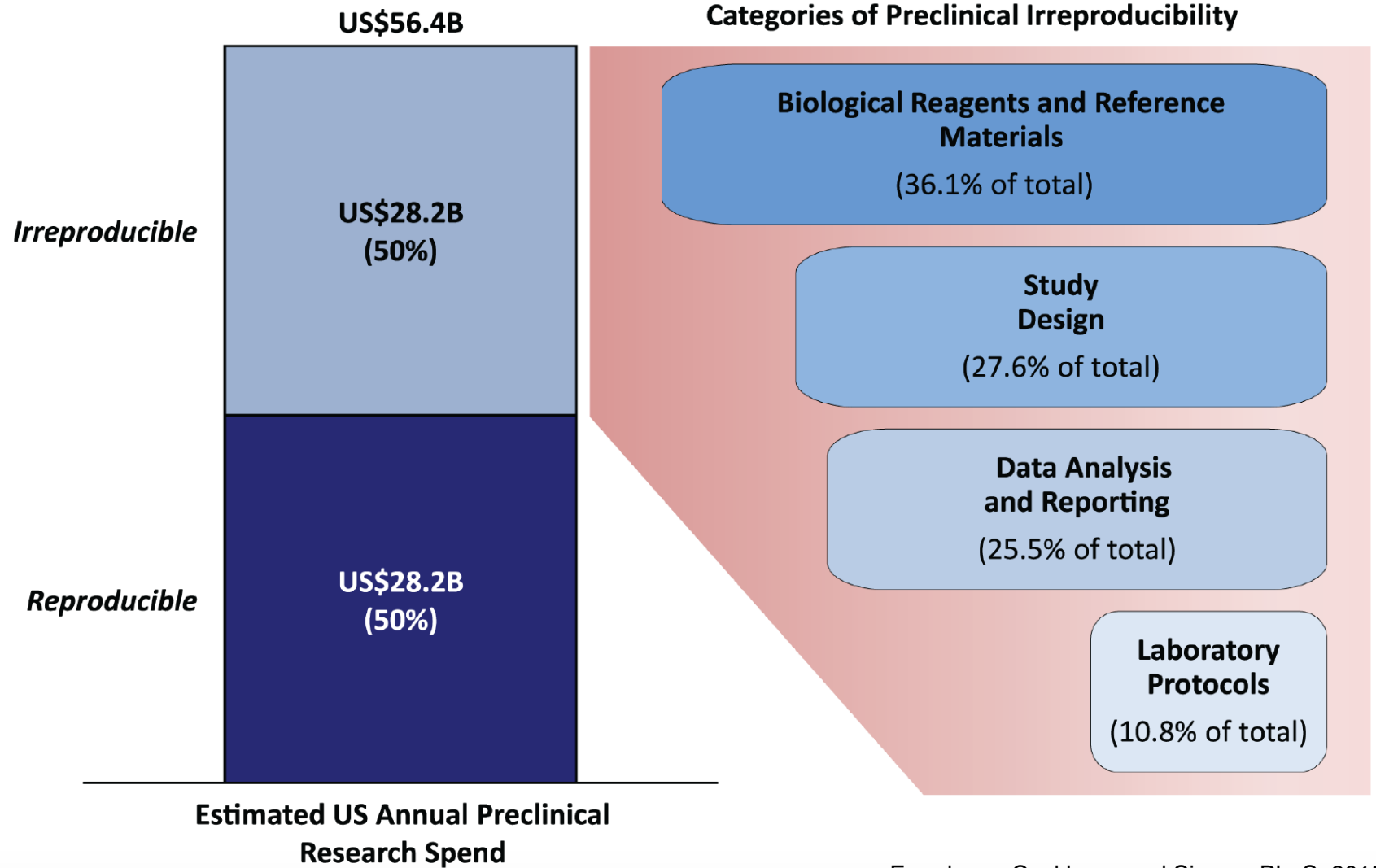
Elizabeth Iorns, PhD and Nicole Perfito, PhD

May 2017 – 5th World Conference on Research Integrity

Annual Preclinical Spend

\$28B

Spent on irreproducible
studies



Freedman, Cockburn, and Simcoe PLoS 2015

Reproducibility rates in biomedical studies ranged between 0 to 21%



0%

- Re-tested 70+ drugs from 221 independent studies¹
- Minocycline: effective in four separate ALS mouse studies worsened symptoms in a clinical trial of more than 400 patients²



11%

- Attempted to replicate 53 “landmark” oncology studies
- 6 of 53 fully reproduced



16%

- Sponsored replication of 12 spinal cord injury studies
- 2 of 12 fully reproduced



21%

- Conducted in-house target validation studies
- 14 of 67 fully reproduced

1. Scott et al. *Amyotroph Lateral Scler.* 9, 4-15 (2008), 2. Gordon et al. *Lancet Neurol.* 6, 1045–1053 (2007), 3. Stuart et al. *Experimental Neurology* 233, 597–605 (2012), 4. Prinz et al. *Nat Rev Drug Discov.* 10, 712 (2011), 5. Begley and Ellis. *Nature.* 483, 531-3 (2012).

Defining Reproducibility

PERSPECTIVE | SCIENTIFIC INTEGRITY

What does research reproducibility mean?

Steven N. Goodman^{*}, Daniele Fanelli and John P. A. Ioannidis

+ See all authors and affiliations

Science Translational Medicine 01 Jun 2016:
Vol. 8, Issue 341, pp. 341ps12
DOI: 10.1126/scitranslmed.aaf5027

Results reproducibility

Results reproducibility (previously described as replicability) refers to obtaining the same results from the conduct of an independent study whose procedures are as closely matched to the original experiment as possible.

.... Reproducibility is a minimum necessary condition for a finding to be believable and informative.”

Unreliable research

Trouble at the lab

Scientists like to think of science as self-correcting. To an alarming degree, it is not

Oct 17th 2013, 15:02 | From the print edition

A Survey on Data Reproducibility in Cancer Research Provides Insights into Our Limited Ability to Translate Findings from the Laboratory to the Clinic

Aaron Mobley, Suzanne K. Linder, Russell Braeuer, Lee M. Ellis , Leonard Zwelling 


Published: May 15, 2013 • <https://doi.org/10.1371/journal.pone.0063221>

124 Save	52 Citation
16,115 View	146 Share

Methods and Findings

To examine a microcosm of the academic experience with data reproducibility, we surveyed the faculty and trainees at MD Anderson Cancer Center using an anonymous computerized questionnaire; we sought to ascertain the frequency and potential causes of non-reproducible data. We found that ~50% of respondents had experienced at least one episode of the inability to reproduce published data; many who pursued this issue with the original authors were never able to identify the reason for the lack of reproducibility; some were even met with a less than “collegial” interaction.

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Less than 30% of respondents who could not reproduce published findings published their failure

Why don't scientists publish their failures and enable self-correction?

- Replication experiments are not the norm
- Creates issues with retaliation from community of peers
- Can be difficult to interpret results, particularly from studies that were not originally designed as formal replications

Science Exchange: Replication Projects



Reproducibility Project: Cancer Biology



Independent Antibody Validation Initiative



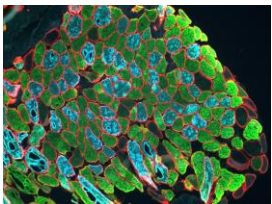
PCF Movember Foundation Reproducibility Initiative



3ie Gates Foundation Reanalysis Studies



Reproducibility Initiative



Private pharmaceutical validations



A blue-tinted photograph of several glass beakers or test tubes arranged in a row, slightly out of focus, creating a sense of depth. The image is used as a background for the title text.

REPRODUCIBILITY PROJECT Cancer Biology

The CD47-signal regulated protein alpha (SIRPa) interaction is a therapeutic target for human solid tumors



ORIGINAL ARTICLE

April 24, 2012

SB Willingham, JP Volkmer, AJ Gentles, D Sahoo, P Dalerba, SS Mitra, J Wang, H Contreras-Trujillo, R Martin, JD Cohen et al.

Proceedings of the National Academy of Sciences of USA 2012;109:6662-6667

[10.1073/pnas.1121623109](https://doi.org/10.1073/pnas.1121623109)



REGISTERED REPORT

January 26, 2015

Denise Chroscinski, Nimet Maherali, Erin Griner, Reproducibility Project: Cancer Biology

eLife 2015;4:e04586

[10.7554/eLife.04586](https://doi.org/10.7554/eLife.04586)



REPLICATION STUDY

January 19, 2017

Stephen K Horrigan, Reproducibility Project: Cancer Biology

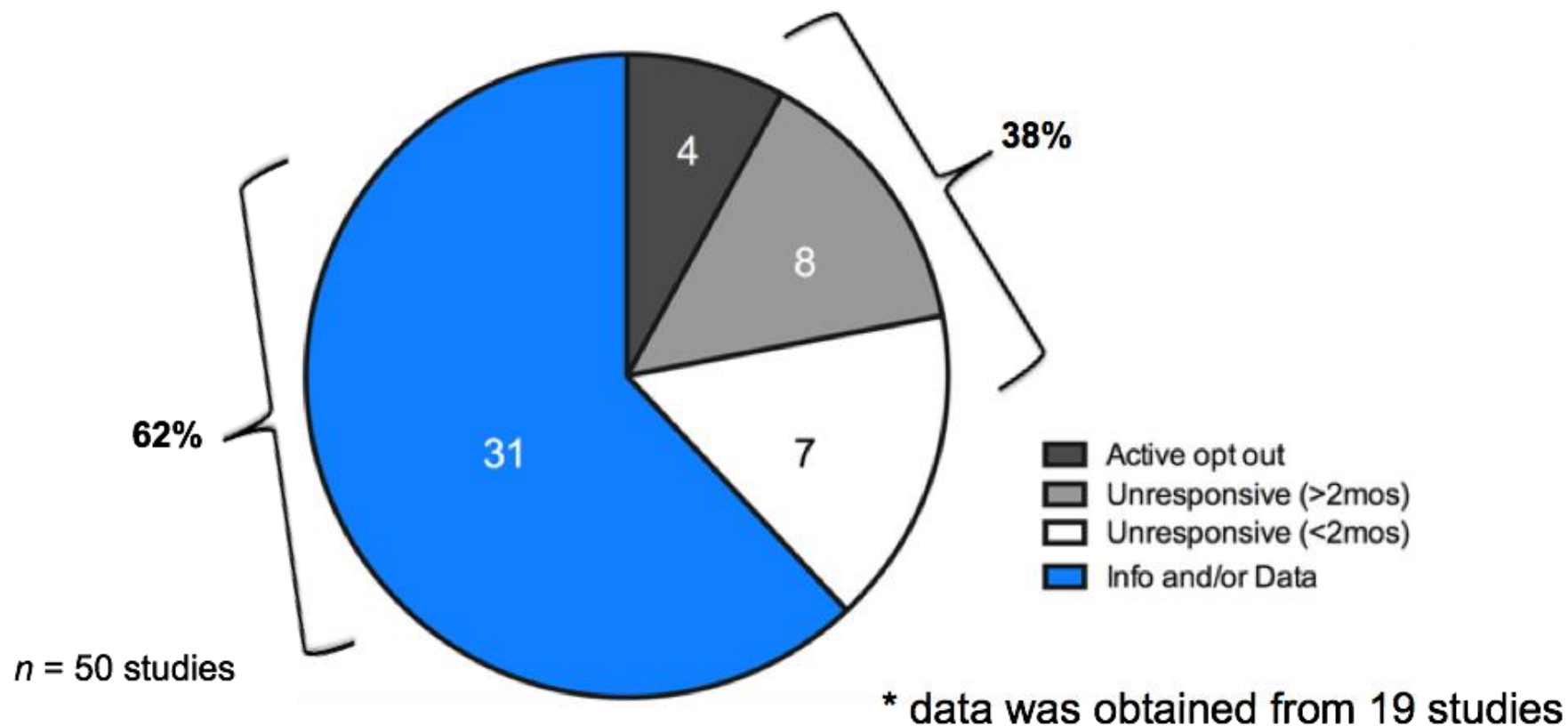
eLife 2017;6:e18173

[10.7554/eLife.18173](https://doi.org/10.7554/eLife.18173)

1. Where possible, we obtained input from the original authors (and unique non-commercial reagents as well as data)

Replication study best practices

Author responsiveness:



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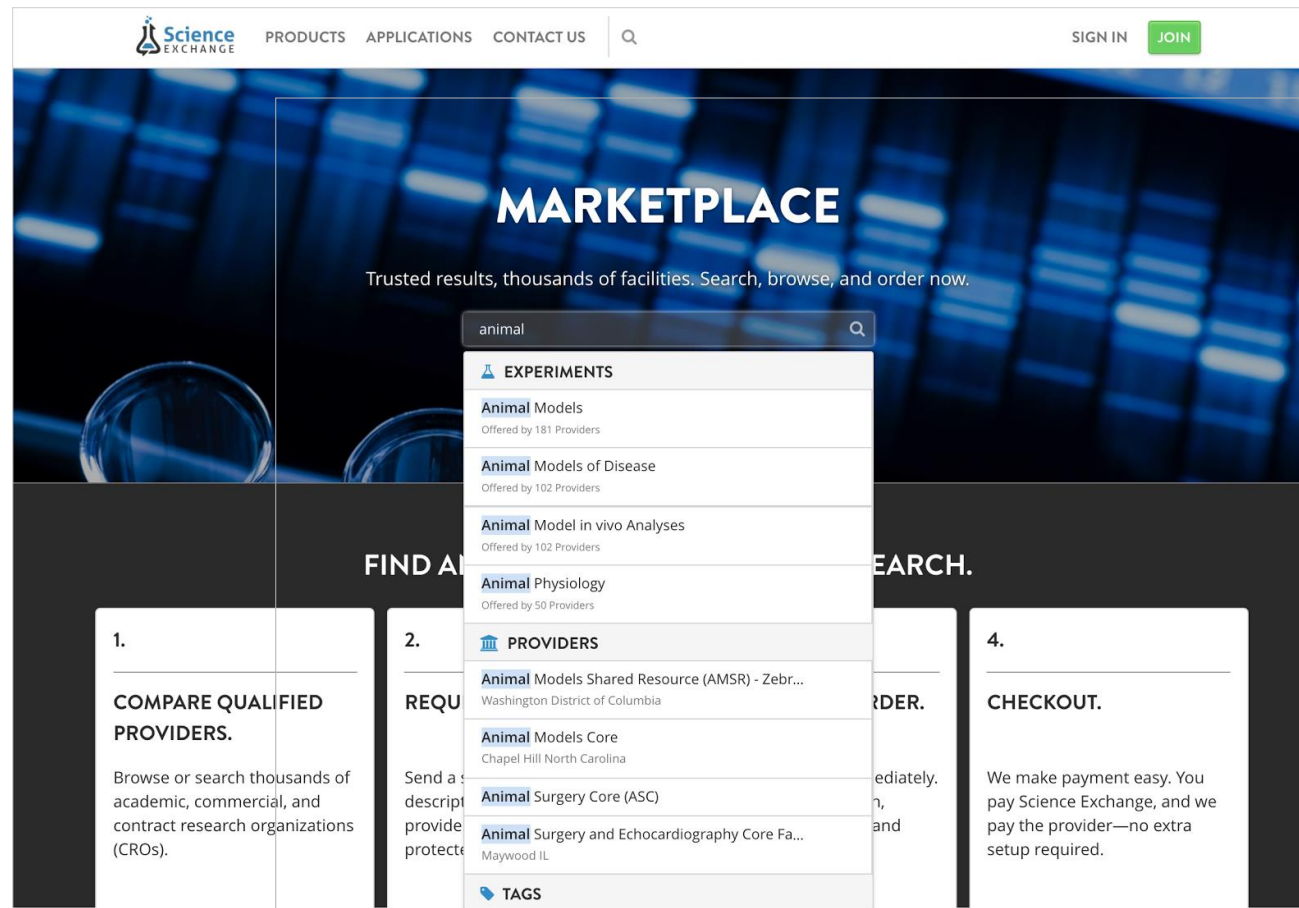
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2. Pre-establish (and pre-register) protocols and analysis plans
3. Use power calculations to ensure replication sample size is sufficient to detect the reported effect with sufficient power



4. Use expert, independent labs with extensive expertise in the techniques being replicated



The CD47-signal regulated protein alpha (SIRPa) interaction is a therapeutic target for human solid tumors



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5. Make all protocols, results, and data open and accessible to everyone
6. Results are published regardless of findings

RP:CB Project Status

50 most impactful papers from 2010-2012 in cancer biology

31 Registered Reports submitted to eLife

- 29 accepted and published
- 2 rejected

8 replication studies completed

- 5 replication studies published
- 3 replication studies in review

21 replication studies ongoing

19 potential studies on hold



Meta-Analysis for all Replication Studies

- What were the main road-blocks to conducting replication studies
- How much do they cost on average?
- What factors were associated with studies that were more likely to replicate?

Promoting a culture of replication

1. Reduce reliance on contacting original authors

Update journal formats to capture more information and data



Uniquely identify commercial reagents



Repositories for materials



Promoting a culture of replication

2. Divide research studies into different categories and identify studies in each category

Exploratory Novel Studies

- Multi-year Investigator initiated grants

Confirmatory Studies

- Technical Experts
- May require different types of labs and scientists (e.g. Core Facilities)
- Rigorous QC Procedures

Promoting a culture of replication

3. Provide funding for Replication



The screenshot shows the top of a Nature news article. The header includes the 'nature' logo and navigation links. The article title is 'Dutch agency launches first grants programme dedicated to replication'. The sub-headline reads 'Three-year pilot devotes €3 million to verifying other studies.' The author is 'Monya Baker' and the date is '20 July 2016'. A 'Rights & Permissions' button is visible. The main text begins with 'The Netherlands has launched what researchers say is the world's first national fund dedicated to replication studies: a pot of €3 million (US\$3.3 million) over the next 3 years for Dutch scientists to test whether they can reproduce important research results in social and medical sciences.'

nature International weekly journal of science

Home | News & Comment | Research | Careers & Jobs | Current Issue | Archive | Audio & Video | For Authors

News & Comment > News > 2016 > September > Article

NATURE | NEWS

Dutch agency launches first grants programme dedicated to replication

Three-year pilot devotes €3 million to verifying other studies.

Monya Baker

20 July 2016 | Updated: 20 July 2016

[Rights & Permissions](#)

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Thank you.

- . RPCB Core Team
- . Science Exchange labs
- . Center for Open Science
- . eLife
- . Laura & John Arnold Foundation
- . Reagent donors
- . Prostate Cancer Foundation
- . 3IE /Gates Foundation

Contact

Nicole Perfito

nicole@scienceexchange.com

Published Studies	Were effects in the same direction?	Were effects statistically significant?
Aird et al. 2017. Replication study: BET bromodomain inhibition as a therapeutic strategy to target c-Myc	Yes	No
Horrigan et al. Replication study: The CD47-signal regulatory protein alpha (SIRPa) interaction is a therapeutic target for human solid tumors	No	No
Horrigan et al. Replication study: Melanoma genome sequencing reveals frequent PREX2 mutations	No	No
Kandela, et al. Replication study: Discovery and preclinical validation of drug indications using compendia of public gene expression data	Yes	Yes
Mantis et al. Replication study: Coadministration of a tumor penetrating peptide enhances the efficacy of cancer drugs	2 of 3	No