

SNSF Conference on Best Practices in Research Funding





Research on Research at the SNSF



Goals

- Expand research policy expertise
- Enable evidence-based research funding and policy
- Optimise internal processes (e.g. evaluation procedures, OA funding, career promotion)
- Demonstrate the impact of research funding and research
- Contribute to research policy issues

Collaborative approach



Improving Reproducibility in Science

Some Lessons for Research Funding SNSF Conference on Best Practices in Research Funding 27. September 2021 Leonhard Held University of Zurich



My Background

- Professor of Biostatistics
- Director Center for Reproducible Science
- Steering Committee Swiss Reproducibility Network





Reproducibility and Replicability

Good Research Practice

The Swiss Reproducibility Network

Lessons for Research Funding



Reproducibility in Drug Development

Nature Reviews Drug Discovery (2011)

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

Florian Prinz, Thomas Schlange and Khusru Asadullah

"With reasonable efforts (sometimes the equivalent of 3–4 full-time employees over 6–12 months), we have frequently been unable to reconfirm published data."



The Reproducibility of Psychological Science Science (2015)

RESEARCH ARTICLE SUMMARY

PSYCHOLOGY

Estimating the reproducibility of psychological science

Open Science Collaboration*



"Collectively these results offer a clear conclusion: A large portion of replications produced weaker evidence for the original findings"



The Replicability of Social Science Experiments

Nature Human Behaviour (2018)

human behaviour

LETTERS https://doi.org/10.1038/s41562-018-0399-c

Evaluating the replicability of social science experiments in *Nature* and *Science* between 2010 and 2015

Colin F. Camerer^{1,1}, Anna Dreber^{2,16}, Felix Holzmeister ^{© 326}, Teck-Hua Ho^{4,86}, Jürgen Huber^{3,16}, Magnus Johannesson ^{© 226}, Michael Kirchler^{3,26,16}, Gideon Nave^{5,16}, Brian A. Nosek ^{© 38,164}, Thomas Pfeiffer ^{© 316}, Adam Altmejd ^{© 2}, Nick Buttrick²⁸, Taizan Chan¹⁰, Yiling Chen¹¹, Eskil Forsell¹², Anup Gampa²⁷, Emma Heikensten², Lily Hummer⁴, Taisuke Imai ^{© 17}, Siri Isaksson², Dylan Manfredi⁶, Julia Rose³, Eric-Jan Wagenmakers⁴⁴ and Hang Wu¹⁵

"The effect size of the replications is on average about 50% of the original effect size."



Reproducibility in Cancer Biology

eLife (2014)

PROJECT CANCER BIOLOGY

SCIENCE FORUM

An open investigation of the reproducibility of cancer biology research

Abstract is is widely believed that research that builds upon proviously published findings has reploated the original work. Monever, it is are for researchings to perform or publish direct reploated the original work. Monever, it is are for researchings to perform or publish direct reploated the provide the second build of the second build be and the second bu

POP & PARALALASS OF



Science (2018)

Plan to replicate 50 high-impact cancer papers shrinks to just 18

After 5 years, reproducibility project nears finish line

AL 1818 - IV 2020/11/08



A Replication Crisis in Methodological Research? *Significance* (2020)

A replication crisis in methodological research?

Statistics and have been for critique statistical asseeds of the replication crass's in other scientific during in the UK new statistical tools are often published; and provide without any thought to replicatility. This needs to change, ague **Anne-Laure Boulesteix**, **Sabine Hoffmann, Alsthes Charten** and **Heald Scienced**



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Reproducibility in Preclinical Research *Nature* (2014)

NIH plans to enhance reproducibility

Francis S. Collins and Lawrence A. Tabak discuss initiatives that the US National Institutes of Health is exploring to restore the self-correcting nature of preclinical research.

"Preclinical research [...] seems to be the area that is currently most susceptible to reproducibility issues.

The NIH is deeply concerned about this problem. "

Proposed NIH actions:

- Training modules
- Checklist for grant applications
- Greater transparency of the data
- PubMed Commons (discontinued in 2018)



Reproducibility in Clinical Trials

"Human clinical trials seem to be less at risk because they are already governed by various regulations that stipulate rigorous design and independent oversight."

- Randomisation
- Blinding
- Sample Size Calculations
- Preregistration
- Institutional Review Boards
- Standardized Reporting



Statistical Analysis Plans

JAMA | Special Communication

Guidelines for the Content of Statistical Analysis Plans in Clinical Trials

Card Gamble, PhD; Ashma Krishan, BSc; Delorah Stocken, PhD; Steff Lewis, PhD; Edmund Juszczak, MSc; Caroline Doré, BSc; Paula R. Williamson, PhD; Douglas G. Altman, DSc; Alan Montgomery, PhD; Pilar Lim, PhD; Jaese Barlin, Sch; Stephen Senn, PhD; Simon Day, PhD; Yolanda Barbachano, PhD; Eltabeth Loder, MD, MPH

Guidelines for Statistical Analysis Plans

David L. DeMets, PhD; Thomas D. Cook, PhD; Kevin A. Buhr, PhD

"Ultimately, a prespecified SAP is necessary to ensure interpretability and integrity of final results."



Rein in the Four Horsemen of Irreproducibility Dorothy Bishop (2019) in Nature





Questionable research practices (QRPs)



Preregistration PLOS guidelines



Preregistration is the practice of depositing a research question and study design with a registration service or journal before conducting a scientific investigation.



Registered Reports

Chris Chambers in Nature (2019)

What's next for Registered Reports?

Reviewing and accepting study plans before results are known can counter perverse incentives. **Chris Chambers** sets out three ways to improve the approach.



RAPID RISE

Since 2013, the number of journals offering Registered Reports (RRs) has risen to more than 200 titles.





High Replicability is Achievable

Protzko et al. 2020, psyarxiv.com



Fig 1. Effect sizes and 95%CI from 16 new discoveries (yellow marks) in the social-behavioral sciences with four replications each. Each lab is designated by a unique shape for observed effect size; blue marks correspond to self-replications, green marks to independent replications.



Computational Reproducibility

Roger Peng in Science (2011)

Data Replication & Reproducibility

PERSPECTIVE

Reproducible Research in Computational Science

Roger D. Peng





Open is Not Enough

PERSPECTIVE

Corrected: Publisher Correction

physics

Open is not enough

Xiaoli Chen¹², Sünje Dallmeier-Tiessen¹⁺, Robin Dasler¹¹¹, Sebastian Feger¹³, Pamfilos Fokianos¹, Jose Benito Gonzalez¹, Harri Hirvonsalo¹⁴³, Dinos Kousidis¹, Antemis Lavasa¹, Salvatore Mele¹, Diego Rodriguez Rodriguez¹, Tibor Šimko¹⁺, Tim Smith¹, Ana Trisovic¹³⁺, Anna Trzisnska¹, Ioannis Tsanaktsidis¹, Markus Zimmermann¹, Kyle Cranmer⁴, Lukas Heinrich⁴, Gordon Watts², Michael Hildreth⁴, Lara Lloret Iglesias², Kati Lassila-Penini⁴ and Sebastian Neubert¹⁰

The solutions adopted by the high-energy physics community to foster reproducible research are examples of best practices that could be embraced more widely. This first experience suggests that reproducibility requires going beyond openness.

Table 1 | Terminology related to reproducible research introduced by Carole Goble and Lorena A. Barba

Term	Purpose	Description
Rerun	Robust	Variations on experiment and set-up, conducted in the same lab
Repeat	Defend	Same experiment, same set-up, same lab
Replicate	Certily	Same experiment, same set-up, independent lab
Reproduce	Compare	Variations on experiment and set-up, independent labs
Reuse	Transfer	Different experiment

"Simple compliance with openness is not sufficient to foster reuse and reproducibility in particle physics."



Misunderstanding of Statistical Significance

Significance Magazine (2000)

Replication power and regression to the mean

If a scientific study reports a discovery with a *p*-value at or around 0.05, how credible is it? And what are the chances that a replication of this study will produce a similarly "significant" finding? Leonhard Held, Samuel Pawel and Simon Schwab's answers may surprise you





Two-sided p-value in original study

Replication is Standard in Drug Regulation

Guidance for Industry

Providing Clinical Evidence of Effectiveness for Human Drug and Biological Products



U.S. Department of Health and Human Services Food and Drug Administration Center for Drug Evaluation and Research (CDER) Center for Biologics Evaluation and Research (CBER) May 1998 (Clinical 6



FDA's "two-trials rule" requires

"at least two adequate and well-controlled studies, each convincing on its own, to establish effectiveness."

No Publication Without Confirmation *Nature* (2017)



No publication without confirmation

Jeffrey S, Mogil and Malcolm R. Macleod propose a new kind of paper that combines the flexibility of basic research with the rigour of clinical trials.



Bundesministerium für Bildung und Forschung

DECIDE

DECIDE - Decision-Enabling Continuation of Innovative Discoveries and exploratory Violence - is the accompanying project within the BMBF funded consortium Richtlinie zur Förderung von Kontimatorischen präklinischen Studien-Oudfäll in der Gesandheitsfanschung, Guidelings für Pranntion of Continuatory. Precinical Studies - Quality in Health



Berlin Institute of Health



We Need Both Exploratory and Confirmatory



PLOS BIOLOGY

Perspective

OPEN CACCESS Freely available online

Distinguishing between Exploratory and Confirmatory Preclinical Research Will Improve Translation

Jonathan Kimmelman¹*, Jeffrey S. Mogil², Ulrich Dirnagl^{3,4,5}



Reproducibility and Replicability

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The Swiss Reproducibility Network



- Computational Reproducibility
- Preregistration and Registered Reports
- Research Assessment and Incentives
- Replication Studies
- Research Methodology
- Training

International Networks





Reproducibility and Replicability

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Open Research Practices



A consortium of 18 universities - members of the UK Reproducibility Network - has received significant funding to drive uptake of open research practices across the sector, furthering the UK's position at the forefront or frigorous and reproducible research.

The Bristol-led project is worth £8.5M over five years and includes £4.5M from the Research England Development (RED) Fund.



Train the Pls

Ulrich Dirnagl in Nature (2018)

ULRICH DIRNAGL Train the PIs

Professor of neuroscience, Charité University Medicine, Berlin.

> "Let's start with mandatory courses in basic statistics and open science."



Health tips for research groups

Nature asked scientists to recommend one thing that institutional and laboratory leaders could do to make science more productive, rigorous and happy.



Replication and Confirmation





REPLICATION STUDIES IMPROVING REPRODUCIBILITY IN THE EMPIRICAL SCIENCES



- NWO Programme Replication Studies
- DFG Priority Programme META-REP



Registered Report Grant Model

DRUG DISCOVERY INITIATIVE REGISTERED REPORTS (DDIRR)

About

The Children's Tumor Foundation (CTF) and the scientific journal PLOS ONE in 2017 launched a new funding program in the area of neurofibromatosis (NF) research based on the Registered Reports model. The new initiative, called the Drug Discovery initiative Registered Report (DDIRR) Awards, is a funder-publisher partnership that integrates the Registered Reports model in the grant application process. This model will allow for more rigorous, reproducible and transparent science, guaranteeing its awardees with an in-principle acceptance (IPA) to publication in the journal PLOS ONE, regardless of study outcome. We have successfully awarded 3 investigators in the 2017-2018 and together with PLOS ONE decided to continue to offer this grant in future cycles.

The list of awarded DDIRR is available on the **Open Science Framework website**. This award evolves from the Foundation's classic Drug Discovery Initiative Award program that has assigned over 75 awards since 2006.



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Summary

- Reproducibility issues are haunting various scientific disciplines.
- An interdisciplinary perspective helps to identify common problems and provide targeted solutions.
- More research funding should be devoted to
 - Methodology
 - Replication Studies
 - Meta-Science



Backup: Definitions

- Reproducibility is obtaining consistent results using the same input data; computational steps, methods, and code; and conditions of analysis.
- Replicability is obtaining consistent results across studies aimed at answering the same scientific question, each of which has obtained its own data.
- Generalizability refers to the extent that results of a study apply in other contexts or populations that differ from the original one.

National Science Foundation (2018)





Towards better practices in research evaluation

Thomas Werder Schläpfer


The SNSF

- Private foundation, sponsored by the State, based on scientific self-governance
- One core task : fund scientific research
- Interested in numbers? → have a look at <u>data.snf.ch</u> !



Key figures

6,000 Ongoing SNSF projects

20,000 Researchers in projects

> 1,000 Panel members

> > 100 Panels

Data 2020



Evaluation process – reduced to the max

- Money \rightarrow SNSF \rightarrow researchers
- We organize competitions based on scientific quality criteria

• Core process:

gather basis for decision, evaluate against criteria, funding decision

• What guides us towards better practices?



Project funding

- For established researchers
- Free choice of research themes
- All scientific disciplines
- Competitive selection process based on peer review and a scientific panel



Evaluation Process: Reviewers – Referees – Panels



A Unified Evaluation Procedure at the SNSF



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Gemma Derrick

Diana Hicks

James Wilsdon Professor of Research Policy, Director RoRI University of Sheffield

Senior Lecturer, Education Research,

ublic Policy

A «Unified Evaluation Procedure» at the SNSF



Separate evaluation from funding decision

• Why? Keep tasks separated. Prevent "substitution".

Actual question	Simpler question
How likely is it that this candidate could be tenured in our department?	How impressive was the talk?
How relevant/original/feasible/ is this proposal? Why?	Would I like to fund this project?

Not new, best practice in other places

Kahneman, D., & Frederick, S. (2002). Representativeness revisited: Attribute substitution in intuitive judgment. In T. Gilovich, D. Griffin, & D. Kahneman (Eds.), *Heuristics and biases: The psychology of intuitive judgment* (pp. 49–81). Cambridge University Press <u>https://doi.org/10.1017/CB09780511808098.004</u>

Factsheets → structured discussion



Applicant Name	31	0030-196XXX (#12)	Project Title																A	/A					
APPLICANTS 2		REVIEWS	applicants				2	relevance,					suitability of				overall assessment								
Name Applicant 1 Applicant 2	Affiliation Affiliation 1 Affiliation 2	B sessed reviews not useful eful not assessed	outstanding	excellent	ery good	poor	iverage	DOOL	outstanding	excellent	rery good	pool	iverage	Door	outstanding	excellent	ery good	poot	iverage	DOOL NO	outstanding	excellent	'ery good	DOO	iverage **
		Reviewer 1 Reviewer 2	0	U	>	00	ro I	-	0	U	>	00	0	-	0	U	>	00	e	-	0	0	>	00 0	10 1
		Reviewer 3 Reviewer 4	1.0		1.1																				
PARTNERS REFEREES		REFEREES 4	REES 4 Applicants						4	-	-	-	_			Project					Overall				
Name Project Partner 1	Affiliation Affiliation 1	Referee Co-referee	X												X						A				
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		Postdoc				_							-		1										
		turther employee	-					-		1.0)			1.0	5.4	1									
		salaries	_		-	-		-	_	22	2	-	2	35			_	_	_	_	_	_			_
		O T research costs				-	_		-	52.	2	-		0			_								
								-		121	6	-	1	216	5		-								
FLAGS & RELATIONS													-												
	171888	Duration (months)					_	1	_	36				36											
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continuation of resubmission of	1/1/0/	Spending level (kCHF)								40	5		4	105											
continuation of resubmission of use-inspired project	1/1///	Spending level (kCHF) Spending level per applic	ant	(kCł	HF)					403	5 2		2	105 202											



Individual voting

Individual votes enable the splitting of evaluation and funding decision



A Unified Evaluation Procedure at the SNSF



Motivation for a numeric rating scale

- Works at all stages (external review, recommendation, panel)
 → Coherence and transparency, facilitates monitoring
- Allows direct statistical analysis to establish ranking
 → No hidden mapping of categories to numbers
- 3. Works for all panel configurations

→ Allows for treatment of proposals in sub-panels

9-point numeric rating scale

Please provide a rating on the following scale regarding your assessment of [evaluation criteria]. 5 should be considered as the entry point; from that point, you should develop arguments to grade the [evaluation criteria] higher or lower.

9	Strong in all relevant aspects. No or negligible weaknesses.
8	
7	Strong in most relevant aspects. Few clearly identified weaknesses.
6	
5	Strong in several relevant aspects. Some clearly identified weaknesses.
4	
3	Some strengths in relevant aspects. Several clearly identified weaknesses.
2	
1	Few or no strengths in relevant aspects. Many serious weaknesses.

A Unified Evaluation Procedure at the SNSF



Randomness

- expert reviews, expert judgment, expert panel
 - → randomness? yes
- Elements to consider
 - "Luck of the draw" (referees, reviewers, sequence, ...)
 - Social dynamics



• All lost? no

Heyard, R., Hottenrott, H. The value of research funding for knowledge creation and dissemination: A study of SNSF Research Grants. *Humanit Soc Sci Commun* **8**, 217 (2021). <u>https://doi.org/10.1057/s41599-021-00891-x</u>

https://careertrackercohorts.ch/

Randomness in evaluation?



PANEL		Pa	nel 2
		fund	reject
Donal 1	fund	а	b
Panel I	reject	С	d

Agreement=(a+d)/(a+b+c+d)

Study	Setting	Туре	Agreement
Cole, 1981	National Science Foundation	Grant proposals	
Hodgson, 1997	Canadian funding agencies	Grant proposals	
Fogelholm, 2012	Finnish Academy	Grant proposals	
Cortes, 2014	Machine learning conference	Abstracts	

Research creates knowledge.

Randomness in evaluation?



PANEL		Pa	nel 2
		fund	reject
Danal 1	fund	20	15
Panel I	reject	15	50

Agreement = 70 /100 (!)

Study	Setting	Туре	Agreement
Cole, 1981	National Science Foundation	Grant proposals	70-76%
Hodgson, 1997	Canadian funding agencies	Grant proposals	73%
Fogelholm, 2012	Finnish Academy	Grant proposals	69%
Cortes, 2014	Machine learning conference	Abstracts	74%

Research creates knowledge.

Elements of the Postdoc.Mobility pilots 2019

- Fellowship for a stay abroad for postdocs, many applications
- Need for a fair, transparent, efficient, state-of-the art procedure
- Draw lots to break ties → prevent arbitrariness and bias
- **Triage**; discuss only proposals in «middle group» → increase efficiency
- Learn how a remote evaluation agrees with panel meetings

Bieri M, Roser K, Heyard R, et al. Face-to-face panel meetings versus remote evaluation of fellowship applications: simulation study at the Swiss National Science Foundation. BMJ Open 2021;11:e047386. doi:10.1136/ bmjopen-2020-047386

Random selection: Learnings from pilot

- Random selection was applied on a small set of applications (~4%)
- Mixed reception by panel members, acceptance growing
- Few reactions by applicants

nature > career news > article

CAREER NEWS 06 May 2021

Swiss funder draws lots to make grant decisions

Agency hopes to eliminate bias when choosing between applications of similar quality.

Dalmeet Singh Chawla

🖊 (f) (🗖



Upcoming in December



RoRI RANDOMISATION project

Are lottery-style funding mechanisms a good idea?

Key questions



How to generate a ranking from individual votes?

How to identify a random selection group?



A Unified Evaluation Procedure at the SNSF



Bayesian Ranking

- There are many ways of ranking
- E.g. averages, intuitive, but not optimal

- The Bayesian Ranking (BR) is a statistical model that *increases fairness*
- **Answer 1** BR compares each proposal with all the others to produce a relative ranking
- **Answer 2** It provides a sound method to define random selection groups

Example (illustrative)



Similar result with average score and Bayesian Ranking method

Example (illustrative) – with conflicts of intererst

	X	X	X	X	X		
Proposal	Referee 1	Referee 2	Referee 3	Referee 4	Referee 5	Average	Rank
1						9.0	1
2						8.8	2
3				7		8.4	3
4						8.2	4
5						8.2	4
6				7		8.0	6
7	COI	7	7	7	7	7.0	8
8	9	7	7	7	7	7.4	7
9	COI	7	7	7	7	7.0	8
10						6.6	10
11						6.4	11
12						5.8	12
13						5.8	12
14						5.0	14
15						5.0	14

Example (illustrative) – with conflicts of intererst





8 9

Proposal

2

3

5

6

How to identify a random selection group?

	X	X	Â	Ŷ	X	X	X	X	X		1
	Λ		Λ	Λ	Λ	Λ I		Λ	Λ	mean	rank
A	В	В	AB	В	В	AB	В	COI	AB	2.50	25
A	В	В	В	В	AB	AB	AB	В	В	2.56	26
а	bstain	absent	AB	В	В	В	AB	AB	В	2.57	27
а	bstain	В	В	AB	В	AB	В	В	AB	2.63	28
а	bstain	В	AB	AB	AB	В	В	В	В	2.63	28
Α	В	AB	В	COI	В	В	В	В	AB	2.63	28
A	В	В	В	AB	В	В	AB	В	abstain	2.63	28
В		В	AB	AB	В	AB	В	В	В	2.67	32
В		В	В	В	AB	AB	В	В	AB	2.67	32
В		В	В	AB	В	COI	COI	AB	absent	2.67	32
В		abstain	В	В	В	COI	COI	AB	В	2.83	35
С	01	В	AB	В	В	В	В	В	absent	2.86	36

Note: different combinations of missing votes (abstentions, absences, COIs)

How to identify a random selection group?

X	×	×	X	×	×	×	×	X		mle
AR		AR			AR			AR	mean ra	25
	D	B								
abstain	absent	AB	B	B	B	AB	AB	B	2.57	27
abstain	В	В	AB	В	AB	В	В	AB	2.63	28
abstain	D	AB							2.63	

Note: different combinations of missing votes (abstentions, absences, COIs)

\rightarrow by using computed credible intervals



A comment & further information

• BR is a help, a practical tool, a sound tool, a pretty exciting tool ...

Rethinking the Funding Line at the Swiss National Science Foundation: Bayesian Ranking and Lottery

Rachel Heyard, Manuela Ott, Georgia Salanti, Matthias Egger

Funding agencies rely on peer review and expert panels to select the research deserving funding. Peer review has limitations, including bias against risky proposals or interdisciplinary research. The inter-rater reliability between reviewers and panels is low, particularly for proposals near the funding line. Funding

Submitted to Statistics and Public Policy, currently revised. https://arxiv.org/abs/2102.09958

Train, exchange, learn ...



→ <u>https://scienceval.ch/</u>



... monitor, and review!

- Data as basis for research
- Basis for policy decisions
- Gender monitoring as an example

Open access Original research BMJ Open Gender and other potential biases in peer review: cross-sectional analysis of 38 250 external peer review reports

Anna Severin,^{1,2} Joao Martins,³ Rachel Heyard,⁴ François Delavy,² Anne Jorstad,⁴ Matthias Egger ^{1,5}

Research funding in focus: even more transparent thanks to data stories

04.05.2021

The SNSF meticulously examines its funding activities. From now on, we will publish these analyses on our data portal. To kick things off, we'll take a look at Open Access, ERC grants and women scientists during the pandemic.

On the <u>data.snf.ch</u> site, the SNSF shows what figures alone cannot: insights into research

There is much to be done



New frontiers for research on research evaluation, J. Wilsdon, RoRI & Univ. of Sheffield

Summary

- Join forces to advance evidence-based decision making
- Best practice in research evaluation is continuously evolving
- We introduce a few practical elements that align with current research («split», individual voting, numeric scale, random selection, statistical tools)

Thank you!


The Structure of Research Evaluation

Michael Hill, Online, 27.09.2021



Who Is the Fastest Athlete Ever?



Forschung schafft Wissen.





Michael Faraday



Marie Sklodowska-Curie



Galileo Galilei



Charles Darwin



Leonhard Euler



Ibn al-Haytham



Louis Pasteur



Albert Einstein



Gregor Mendel



Isaac Newton



Gottfried von Leibniz



James Clerk Maxwell





Albert Einstein



Gregor Mendel

"We had sent you our manuscript for publication and had not authorised you to show it to specialists before it is printed. I see no reason to address the - in any case erroneous – comments of your anonymous expert. On the basis of this incident I prefer to publish the paper elsewhere."



lewton



Gottfried von Leibniz



James Clerk Maxwell





Michael Faraday



Marie Sklodowska-Curie



Galileo Galilei



Charles Darwin



Leonhard Euler



Ibn al-Haytham



Louis Pasteur



Albert Einstein



Gregor Mendel



Isaac Newton



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Leonhard Euler



Ibn al-Haytham



Louis Pasteur



Albert Einstein



Gregor Mendel



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James Clerk Maxwell



Michael Faraday



Marie Sklodowska-Curie



Galileo Galilei



Charles Darwin



Leonhard Euler



Ibn al-Haytham



Louis Pasteur



Albert Einstein



Gregor Mendel



Isaac Newton



Gottfried von Leibniz



James Clerk Maxwell

NOBEL IMBALANCE

Of the 599 Nobel medals awarded in scientific disciplines, just 18 have gone to women.





Michael Faraday



Marie Sklodowska-Curie



Galileo Galilei



Charles Darwin



Leonhard Euler



Ibn al-Haytham





Michael Faraday



Marie Sklodowska-Curie



Galileo Galilei



Charles Darwin



Leonhard Euler



Ibn al-Haytham



Louis Pasteur



Albert Einstein



Gregor Mendel



Isaac Newton



Gottfried von Leibniz



James Clerk Maxwell



Who Do We Want to Support?



Forschung schafft Wissen.

Trial by Jury

- ~12 Jury members as "peers of the accused"
- Jury only judges guilt or a verdict of not guilty, the penalty is set by the judge
- Anonymous voting (e.g. ancient Greece)
- Unanimous vote (or sometimes high level of agreement)
- Certain information is withheld from a jury (e.g. previous convictions).
- Seeking information from external sources, undermines the integrity of a jury trial. The breaking of the rules can lead to a prison sentence for a juror.
- Verdict based upon rational deliberation, step-wise establishment of argument, logical deduction, structured argumentation



Three Guiding Principles

- documents.
- final verdict.

1. Research evaluation is an active decision-making process. It is not the description of some objective ground truth by onlookers. The evaluation proceedings need to be structured to handle the complexity of the evaluation task appropriately.

2. Evaluation and the documents under scrutiny should comprise of clearly delineated individual parts such that the verdict can be synthesised from the sum of many individual smaller steps. Assessment should not consist of unstructured, open-ended discussions that try to simultaneously consider all aspects of monolithic evaluation

3. Each step of the evaluation procedure must be transparent and well-defined, easy to understand with a clearly formulated aim and comprehensible outcome, which in turn should form the basis of the next step of the evaluation and/or feed directly into the



Overview of SciCV

- H-Group
- Narrative(s) and "lists"
- Omitted the full publication list
- Included Academic Age
- Limited to two metrics: H-index and RCR
- Interactive online platform
- Developed with Research Council Members
- Piloted in Biology and Medicine in April 2020
- 346 applications (495 applicants), of which 129 applications received funding





Forschung scha





SWISS NATIONAL SCIENCE FOUND	DATION				
Guidelines		Name and Position			
Your SciCV Name and Po Academic Ag	ge	How to fill in this section + Orcid ID () 0000-0002-4998-5635			
 H-Index Education / 0 Employment 	Qualifications	First Name * O	Last Name * 🔞 Test		
 Funding Project-relate Contributions 	ed Narrative s to Science	Current Position *			
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SNF SciCV ORCID				Privacy Co	onta

Privacy Contact

Forschung schafft Wissen.



FNSNF Sci

Fonds national suisse Schweizerischer Nationalfonds Fondo nazionale svizzero Swiss National Science Foundation

Professor of Neurobiolog ORCiD: 0000-0002-4998-5635, Academ

Education & Qualifications

MSc Student, Linear Algebra, Harvard Medical School, MA, US 11.2006 — 12.2008; 1 year, 1 month

PhD Student, Systems Biology, Behaviour and Neurscience, Eidgenössische Technische Ho Switzerland

11.2000 – 12.2005; 5 years, 11 months

MSc Student, Linear Algebra, Harvard Medical School, MA, US 11.2006 - 12.2008; 2 years, 1 month

PostDoc, Geography, École Polytechnique Fédérale de Lausanne, Lausanne, Switzerland 12.2012 — 12.2014; 2 years

Full Professor, Computational Sciences, California Institute of Technology Division of Physics Astronomy, Pasadena, USA 06.2015 — 02.2020; 4 years, 8 months (still ongoing)

Employment

MSc Student, Linear Algebra, Harvard Medical School, MA, US 11.2006 — 12.2008; 1 year, 1 month

PhD Student, Systems Biology, Behaviour and Neurscience, Eidgenössische Technische Ho Switzerland

11.2000 – 12.2005; 5 years, 11 months

MSc Student, Linear Algebra, Harvard Medical School, MA, US 11.2006 – 12.2008; 2 years, 1 month

PostDoc, Geography, École Polytechnique Fédérale de Lausanne, Lausanne, Switzerland 12.2012 — 12.2014; 2 years

Funding

Funding (1) | To SciCV or not to SciCV, Schweizerischer Nationalfonds zur Förderung Forschung, Bern, Switzerland. Grant Identifier 986298 Principal Investigator; 11.2000 – 12.2005; 5 years, 11 months Total funded amount: CHF 10'000'000 Funding allocated to my group: CHF 5'000'000

Funding (2) | To SciCV or not to SciCV, Schweizerischer Nationalfonds zur Förderung Forschung, Bern, Switzerland. Grant Identifier 986298

* The fields "Citation of your first peer reviewed publication (or equivalent)" and "Activities and context included in the SciCV PDF, as they are used for administrative purposes only and do not form part of the

Vornamen	
Nachnamen	
gy, University of Zürich ic Age: 22*, H-index: 4	Principal Investigator; 11.2000 — 12.2005; 5 years, 11 months Total funded amount: CHF 10'000'000 Funding allocated to my group: CHF 5'000'000
	Funding (3) To SciCV or not to SciCV, Schweizerischer Nationalfonds zur Förderung der Wissenschaftlichen Forschung, Bern, Switzerland. Grant Identifier 986298 Principal Investigator; 11.2000 – 12.2005; 5 years, 11 months Total funded amount: CHF 10'000'000 Funding allocated to my group: CHF 5'000'000
ochschule , Zürich,	Funding (4) To SciCV or not to SciCV, Schweizerischer Nationalfonds zur Förderung der Wissenschaftlichen Forschung, Bern, Switzerland. Grant Identifier 986298 Principal Investigator; 11.2000 – 12.2005; 5 years, 11 months Total funded amount: CHF 10'000'000 Funding allocated to my group: CHF 5'000'000
	Funding (5) To SciCV or not to SciCV, Schweizerischer Nationalfonds zur Förderung der Wissenschaftlichen Forschung, Bern, Switzerland. Grant Identifier 986298 Principal Investigator; 11.2000 – 12.2005; 5 years, 11 months Total funded amount: CHF 10'000'000 Funding allocated to my group: CHF 5'000'000
s Mathematics and	Project-Related Narrative
ochschule , Zürich,	Lorem ipsum dolor sit amet, consectetur adipiscing elit. Sed aliquam justo orci, ac scelerisque nulla ullamcorper non. Suspendisse nunc sem, laoreet sed urna eu, mollis lacinia mi [1]. Lorem ipsum dolor sit amet, consectetur adipiscing elit. Sed a enim tellus. Duis vitae ex vitae lorem scelerisque varius. Etiam rhoncus in leo nec tincidunt [2]. Donec faucibus sapien luctus orci fringilla, ac faucibus tortor dictum. Nunc feugiat dapibus nibh a tempor. Interdum et malesuada fames ac ante ipsum primis in faucibus. Quisque mi dolor, malesuada eu leo mattis, scelerisque dapibus diam. Nunc feugiat fermentum libero, a condimentum neque faucibus at. Suspendisse quis iaculis dui. Proin eleifend risus at orci ultricies pharetra. Nulla eget consectetur libero, a vestibulum sapien. Vivamus condimentum fringilla diam ut imperdiet. Nunc ex felis, feugiat et placerat non, blandit at nunc. Vestibulum a ullamcorper quam, in pulvinar lacus [3, 4]. Cras et luctus neque. Donec luctus quam erat, vitae lacinia nisl portitor vitae. Cras commodo semper purus nec elementum. Praesent id ornare mi, eget convallis ipsum. In et commodo felis. In hac habitasse platea dictumst. Nunc accumsan egestas convallis. Donec pretium metus et lectus pretium posuere. Fusce nec eros feugiat, hendrerit risus nec, lobortis ante [1 - 3]. Mauris ornare tellus ac nulla aliquam imperdiet. Donec malesuada portitor scelerisque. Cras posuere libero in ipsum rhoncus molestie. Cras auctor varius diam et mollis. Ut sed vulputate erat, in varius lectus. In euismod, ipsum eu porta cursus, leo libero fringilla purus, non malesuada erat tortor quis tortor. Donec ipsum est, rhoncus non lacus quis, mollis ultrices lectus. Nunc efficitur mauris gravida, egestas quam quis, sodales massa. Donec faucibus, nisl id vestibulum fringilla, lorem magna viverra urna, in mattis felis lacus at diam [5].
g der Wissenschaftlichen	[1] Journal Article. Kiefer, E., Hoover, D., Shi, Q., Dusingize, J., Sinayobye, J., & Anastos, K. (2018). Longitudinal evaluation of markers of inflammation in HIV-positive and HIV- negative Rwandan women. HIV Medicine,19(10), 734–744. https://doi.org/10.1038/ncomms12722. RCR: 1.2. <u>Dimensions Link</u> , <u>Open Access Link</u> .
	[2] Journal Article. Kiefer, E., Hoover, D., Shi, Q., Dusingize, J., Sinayobye, J., & Anastos, K. (2018). Longitudinal evaluation of markers of inflammation in HIV-positive and HIV- negative Rwandan women. HIV Medicine,19(10), 734–744. https://doi.org/10.1038/ncomms12722. RCR: 1.2. <u>Dimensions Link</u> , <u>Open Access Link</u> .
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<i>et beyond academia</i> " are not evaluation.	

Analysis

- Survey among applicants (response rate 24.8%)
- Semi-structured interviews with 10 applicants
- Text mining of the narrative elements of all 495 submitted SciCVs
- Survey among external reviewers, panel members, research council members (response rate 12.4%)
- Semi-structured interviews with 10 reviewers (4 external, 2 regular panel members, 4 research council members)
- Data on the practical use of the SciCV in the 10 review panel meetings, collected through participant observation







Applicants

Usefulness of SciCV elements





Applicants with less than 3 previous applications were more positive about narratives (3.80 vs 3.44 and 3.79 vs 3.34) and academic age (3.57 vs 3.17) than more experienced applicants.



Evaluators & Reviewers

Usefulness of SciCV elements





SciCV was perceived as very to extremely useful by 70% of reviewers

Junior evaluators were more positive than senior evaluators

External reviewers were more positive than members of the Research Council about *narratives* and the omission of a *publication lists*

Gender Effects in Narratives

February 9th, 2021 CWTS B.V. Centre for Science and

Occurrence of Terms in Narratives

_	Total occurrence	Occurrence female	% occurrence among	Total occurrence female
Terms	female applicants	applicants in %	female applicants	applicants
expert	232	70	30.172	51.47
lead	161	48	29.814	35.29
success	115	38	33.043	27.94
the first	95	28	29.474	20.59
publication	88	25	28.409	18.38
grant	86	23	26.744	16.91
novel	83	22	26.506	16.18
leading	70	21	30	15.44
unique	62	18	29.032	13.24
ERC	59	17	28.814	12.5
head	55	20	36.364	14.71
article	45	7	15.556	5.147
paper	39	6	15.385	4.412
discovery	33	11	33.333	8.088
innovative	27	7	25.926	5.147
fellowship	26	8	30.769	5.882
award	26	7	26.923	5.147
specialist	25	3	12	2.206
recognized	25	9	36	6.618
cited	23	4	17.391	2.941
pioneer	22	6	27.273	4.412
director	21	5	23.81	3.676
excellent	18	4	22.222	2.941
peer- reviewed	18	4	22.222	2.941
Nature (journal)	12	2	16.667	1.471
breakthrough	7	5	71.429	3.676
Science (journal)	7	2	28.571	1.471
independent research	6	3	50	2.206
citation	4	1	25	<1%



We found no significant difference in how men and women present themselves in narratives



Panel Meetings (participant observations)

- Novel elements of the SciCV broadened the information base
- Narrative elements were effectively used to supplement
 publication-centric decision-making
- Many evaluators routinely consulted information beyond the SciCV (e.g. full publication lists and biological age)
- Repeated attempts to enforce adherence to the processual regulations laid out by SNSF by administrators and individual panel members



Overview of SciCV

- Blended CV (narratives and "lists")
- Omitted full publication list
- Included Academic Age
- Limited to two metrics: H-index and RCR
- Interactive online platform
- Developed with Research Council Members





Forschung scha



SciCV 2.0

Possible Future Directions (TBD):

- Reduction of Metrics
- Even stronger ORCID integration
- Less focus on publications
- Less focus on standing in community
- Better integration of narrative Elements



Forschung scha



Marcel Benoist Prize

Overview

- Awarded annually by the Marcel Benoist Foundation since 1920
- For "[...] the most useful discovery or study in the sciences that is of particular relevance to human life"
- Chaired by Federal Councillor Guy Parmelin
- The SNSF was mandated as an independent organisation to design and conduct the evaluation
- Unique opportunity to design new evaluation procedures (2018)





Overview

- Highly structured and transparent procedure
- Anonymous, electronic voting (now fully online)
- Non-academic evaluators
- Anonymised nominations
- Network evaluation
- Pre-evaluation
- Ranking instead of rating
- Data supported Discussions





Anonymisation

Promi





Anonymisation

Promi





Network Evaluation









Forschung schafft Wissen.

Thresholding (non-anonymous)

Median

18

Data-supported Evaluation

Overview

- Highly structured and transparent procedure
- Anonymous, electronic voting (now fully online)
- Non-academic evaluators
- Anonymised nominations
- Network evaluation
- Pre-evaluation
- Ranking instead of rating
- Data supported Discussions

Laureates

2021



2020



Thomas Berger (Uni Bern)

Rudolf Aebersold (UZH, ETHZ)





2018



Nicola Spaldin (ETHZ)

Lars-Erik Cederman (ETHZ)



The Structure of Research Evaluation

- Evaluation is more like active decision-making and less like the revelation of a ground truth
- Formalised processes like a trial by jury can provide valuable insights and inspiration
- SciCV successfully piloted a blended CV with the support of change management and independent analysis
- The Marcel Benoist Prize Evaluation combines many innovations including: structured process, non-academic evaluators, anonymisation, pre-evaluation, network evaluation, ranking, data-supported discussions

Thank you!

The work presented here involved many people at the SNSF administrative offices and in the National Research Council. In the SciCV and the Marcel Benoist Prize projects these include most notably:



Michaela Strinzel Strategy



Martin von Arx Biology and Medicine



The Structure of Research Evaluation

Michael Hill, Online, 27.09.2021



The use of metascience in the context of funding

Dr. Cassidy R. Sugimoto Professor + Tom and Marie Patton School Chair School of Public Policy @csugimoto



A brief overview





Where am I coming from?

Scientometrics

- Background in information science
- Use of large-scale quantitative data to understand science
- Triangulation with survey data

National Science Foundation

- Science of Science Innovation and Policy Program (retitled Science of Science: Discovery, Communication, and Impact)
- Part of the Social, Behavioral, and Economic Sciences
- 2018-2020 (Trump admin.)

School of Public Policy

- 30 full-time tenure/tenure-track faculty
- ST&I, Philosophy of science, Energy & Environment, Cybersecurity
- Joined as head of school in 2021



How should metascience approaches be employed?



PORTFOLIO MANAGEMENT



Science mapping (Boyack, SciTech Strategies)



Physics
Computer
Chemistry
Engineering
Earth
Biology
Disease
Medicine
Brain
Health
Social
Humanities

Science mapping can distill large amounts of information into easily accessible visualizations for assessment and decision-making

Scientometrics can be a tool to evaluate the effects of concentration

TABLE 1 Grant application success rates

Agency	Success rate	Year	Average annual grant	Source
NSERC	70.2	2007	\$30,000	(NSERC, 2007a)
CIHR	16.3	2005	\$109,700	(CIHR, 2007)
SHHRC	33.1	2008	\$28,245	(Taylor and Yasmeen, 2008)
US NIH (R01)	16.3	2006	\$359,030	(NIH, 2006a,b)
US NSF	20	2005	\$140,000	(Tornow, 2006, 2007)
UK MRC	25	2006		(Tornow, 2007)

Note. NSERC = Natural Sciences & Engineering Research Council, Canada; CIHR = Canadian Institutes of Health Research; SSHRC = Social Sciences and Humanities Research Council, Canada; US NIH (R01) = United States National Institutes of Health Research Project Grant Program; US NSF = United States National Science Foundation; UK MRC = United Kingdom Medical Research Council.

Georgia

Decline in acceptance rates



Georgia Tech

Extending the age of funded researchers





Decreasing returns to scale in funding (n. articles)



Georgia Tech

https://arxiv.org/ftp/arxiv/papers/1602/1602.07396.pdf

Decreasing returns to scale in funding (impact)



Georgia Tech

https://arxiv.org/ftp/arxiv/papers/1602/1602.07396.pdf

Using government surveys + bibliom etrics

- Survey of Earned Doctorates (SED):annual census of all individuals receiving a doctorate from an accredited US institution
- Survey of Doctoral Recipients (SDR): cross-sectional data collected biennially since 1973 surveying all those under 76 in the DRF (from the SED)
- Web of Science: 1990-2012 for matches to SDR (1995-2013)
 - 12,997 respondents with 114,411 publications
 - Last name/first initial; Random Forest models; inclusion of survey data; emails as exact matches



Disparities in doctoral graduates



Career trajectories based on publications



Estimated odds ratio of publishing



Receipt of research assistantships



Metascience can help funding institutions with portfolio management by:

...mapping the current landscape of funding by variables of interest (e.g., topic, institution, status);

... providing evidence of consequences of funding;

...making decisions about concentration or dispersion.



PROCESS EVALUATION



eLife as a case of consultative peer review (2012-2017)



Georgia

Outcomes by gender



Gender of Author



Outcomes by author order



Do the "peers" in "peer review" matter?







Outcomes by review team composition



Georgia Tech

Country homophily





Probability of homophily

Corr. Author Country	# Submissions	Proportion Homogeneity
United States	3,605	0.91
United Kingdom	803	0.3
Germany	641	0.25
Canada	176	0.11
South Korea	45	0.11
South Africa	11	0.09
France	310	0.08
Japan	184	0.08
Australia	101	0.07
China	233	0.06
Switzerland	163	0.06
India	59	0.05
Sweden	70	0.04
Israel	127	0.04
Spain	91	0.03
Denmark	32	0.03
Italy	79	0.03
Belgium	41	0.02
Austria	58	0.02
Netherlands	100	0.01



Factors leading to acceptance



Metascience can help funding institutions with process evaluation by:

... identifying barriers to achieving values.



POLICY EVALUATION



Funder mandates



Funders included in the analysis









BILL & MELINDA GATES foundation SSHRC CRSH Social Sciences and Humanities Research Council of Canada Consell de recherches en sciences humaines du Canada



EPSRC

wellcome

Engineering and Physical Sciences Research Council



erc European Research Council





Calculating compliance

ab of Science InCites Journal Citation Reports Essential Science Indicators EndNote unpaywall 2 Web of Science Search Search Results IU-Link 3 Free Full Text from Publisher 🔛 Look Up Full Text NCBI The Academic Advantage: Gender Disparities in Patenting Associated Data By: Sugimoto, CR (Sugimoto, Cassidy R.)^[1]; Ni, CQ (Ni, Chaoqun)^[2]; West, JD (West, Jevin I View ResearcheriD and ORCID PROCEEDINGS OF THE ROYAL SOCIETY A Document object identifier (DOI) PLOS ONE Volume: 10 Issue: 5 Information-theoretic approach to quantum error con Article Number: e0128000 DOI: 10.1371/journal.pone.0128000 Published: MAY 27 2015 Document Type: Article **View Journal Impact** + Add Unpaywall to Chrome Keywords KeyWords Plus: SCIENCE; WOMEN; ENTREPRENEURSHIP; GAP Author Information Reprint Address: Lariviere, V (reprint author) + Univ Montreal, Ecole Bibliothecon & Sci Informat, Pavillon Lionel Groulx, Succ Ctr Ville, M Addresses: + [1] Indiana Univ, Sch Informat & Comp. Bloomington, IN USA + [2] Simmons Coll, Sch Lib & Informat Sci, Boston, MA 02115 USA + (3) Univ Washington, Informat Sch, Seattle, WA 98195 USA + [4] Univ Montreal, Ecole Bibliothecon & Sci Informat, Montreal, PO, Canada + [5] Univ Quebec, CIRST, OST, Montreal, PQ H3C 3P8, Canada E-mail Addresses: vincent.lariviere@umontreal.ca Funding % COMPLIANCE Grant Number **Funding Agency** Canada Research Chairs program Fonds de Recherche du Quebec Societe et Culture (FRQSC) Social Sciences and Humanities Research Coucil of Canada NSF-SciSIP Program View funding text

Georgia Tech
Funders over time



Scientometrics allows you to compare your compliance with others

Georgia Tech

North America



Value check: why are you mandating openness? Who is served? How does this vary by green/gold?

> Georgia Tech

UK and Europe



Power of mandates and infrastructure

Funder	Biomedical Research	Clinical Medicine	Health	Mathematics	Earth and Space	Psychology	Physics	Biology	Professional Fields	Social Sciences	Chemistry	Engineering and	All Disciplines
Wellcome trust	92%	84%	87%	96%	71%	80%	73%	88%	93%	74%	73%	79%	87%
NIH	93%	86%	79%	87%	73%	75%	84%	76%	74%	59%	81%	71%	87%
MRC	88%	75%	79%	87%	62%	62%	47%	83%	77%	73%	59%	50%	79%
Gates	89%	81%	83%	95%	50%	47%	51%	57%	28%	44%	52%	46%	79%
BBSRC	83%	71%	77%	90%	57%	44%	58%	68%	92%	52%	49%	52%	74%
ESRC	92%	76%	72%	70%	66%	60%	69%	60%	59%	63%	60%	56%	69%
ERC	80%	64%	59%	75%	82%	50%	75%	66%	46%	46%	36%	46%	67%
CIHR	71%	51%	52%	73%	43%	22%	36%	57%	47%	26%	25%	22%	56%
EPSRC	76%	64%	70%	78%	59%	54%	60%	68%	58%	62%	39%	49%	55%
NSF	76%	70%	52%	69%	54%	34%	48%	46%	35%	26%	24%	23%	47%
NSERC	57%	38%	42%	55%	31%	18%	40%	28%	14%	8%	10%	12%	30%
SSHRC	78%	35%	25%	40%	33%	17%	27%	36%	14%	16%	0%	17%	23%
All funded papers	85%	79%	73%	67%	57%	56%	56%	51%	42%	39%	35%	29%	66%

Gr Georgia Tech

Metascience can help funding institutions with policy evaluation by:

...providing the institution with largescale analyses of the effectiveness of their mandates.



OUTCOME EVALUATION



Diversity as a value

Individual

Rawls' principles of justice:

- Equality: "each person is to have an equal right to the most extensive total system of equal basic liberties"
- Fairness: "greatest benefit of the least advantage"
- Access: "fair equality of opportunity"

Collective

- Utilitarian
 - "greatest happiness of the greatest number"



Percentage of papers with funding acknowledgement



This is the level of all funders, but could be done as a comparative analysis between funders.



(WoS)

Normalized by specialty



Georgia Tech

Country	Biology	Biomedical Research	Chemistry	Clinical Medicine	Earth and Space	Engineering	Health	Mathematics	Physics	Professional Fields	Psychology	Social Sciences	All Domains
Egypt	51%	37%	30%	-5%	29%	37%	17%	33%	55%	-31%	-65%	29%	27%
Russian Federation	0%	5%	13%	43%	1%	10%	36%	1%	6%	35%	17%	4%	23%
Pakistan	6%	6%	17%	10%	10%	5%	-8%	0%	18%	43%	9%	-1%	16%
Ireland	-5%	-2%	-5%	-5%	-1%	0%	7%	-13%	9%	-18%	-7%	-20%	16%
United States	6%	2%	26%	-6%	0%	-5%	18%	-2%	-2%	20%	0%	-9%	15%
Czechia	1%	9%	6%	29%	1%	3%	61%	-2%	7%	12%	35%	-4%	15%
New Zealand	-3%	1%	-7%	1%	-3%	-8%	10%	24%	5%	-13%	2%	-6%	15%
Canada	3%	2%	3%	-3%	-2%	-6%	5%	-6%	0%	7%	-2%	-3%	14%
United Kingdom	4%	2%	2%	-10%	1%	-4%	-1%	-7%	-5%	-12%	3%	-16%	13%
Israel	5%	-1%	1%	-16%	3%	-2%	1%	5%	-5%	9%	6%	-16%	12%
Australia	0%	0%	-1%	-12%	1%	-9%	4%	-1%	-2%	-4%	11%	-17%	12%
Austria	-2%	-4%	0%	-5%	1%	2%	28%	-4%	-8%	1%	11%	-6%	10%
India	-1%	4%	8%	-3%	2%	5%	11%	3%	2%	14%	32%	28%	10%
Republic of Korea	8%	4%	1%	-2%	4%	1%	10%	1%	2%	19%	9%	6%	8%
South Africa	-2%	1%	-4%	-10%	-4%	-4%	-8%	2%	-8%	-5%	27%	-2%	7%
Singapore	1%	0%	-2%	-10%	-5%	-2%	4%	12%	1%	16%	21%	-4%	5%
Mexico	-4%	2%	1%	-8%	-2%	-4%	17%	1%	-2%	18%	30%	-12%	5%
Romania	-4%	2%	-2%	1%	4%	4%	37%	-5%	12%	16%	-11%	5%	5%
Spain	-3%	1%	1%	-11%	-1%	-1%	9%	-1%	1%	8%	12%	-1%	4%
Cormany	_7%	20/2	በ%	12%	0%	-6%	-6%	_10/	<u>_</u> ۲%	20/	.7%	_0%	1%
Switzerland	9%	-1%	4%	-11%	-1%	-11%	4%	1%	-7%	1%	-5%	-10%	4%
Greece	-1%	-4%	18%	-23%	4%	2%	-1%	-19%	12%	47%	13%	-16%	4%
Taiwan	4%	0%	1%	-2%	0%	2%	-8%	-3%	5%	-1%	6%	-15%	3%
Denmark	0%	-2%	0%	-6%	-4%	-8%	-4%	-3%	-4%	-11%	-8%	-15%	2%
China	0%	1%	1%	2%	1%	0%	11%	-1%	1%	8%	11%	2%	2%

Comparisons to other countries



Gender as an object of study



Georgia Tech

Gendered nature of specialties



Georgia

0% 10% 20% 30% 40% 50% 60% 70% 80% 90% 100%

Gender homophily between authors and topics





Intersectional homophily in topics





Case example from ERC project



Are we funding the "best" candidates? Does our funding have an "impact"?



of papers of ERC funded + unfunded researchers





Consider implications: --interdisciplinarity (control for differences in publication) --status (junior or senior)

> https://www.rand.org/pub s/external_publications/E P67210.html



Average relative citations of ERC (un)funded researchers





Check your values: --conservatism (reinforce Matthew effect; risk averse) --innovation (seek new entrants, higher risk)

> https://www.rand.org/pub s/external_publications/E P67210.html



of patents of funded and unfunded researchers



Gr Georgia Tech

of papers of ERC researchers before/after competition



Funding the already established: is growth a good indicator? How much growth?

> https://www.rand.org/pub s/external_publications/E P67210.html



Average relative citations of ERC researchers before/after competition





https://www.rand.org/pub s/external_publications/E P67210.html



Improvement of grantees on mean # of patents



Value check: is innovation incentivized?

Georgia

1.67

1.76

2.0

Metascience can help funding institutions with outcome evaluation by:

...measuring outcomes according to values;

...providing largescale comparisons of impact of funding.



Concluding thoughts

Science funding is a critical actor in the scientific system. Funders must acknowledge their roles and understand the context. **Metascience is a useful tool for contextualization**. Science funding should be done scientifically. **Funders collect data that they rarely employ for evidenced-based decision making**. They should either develop skills internally or consult to utilize these data effectively to improve funding.

Funding should reinforce values and serve society. Whether public or privately funded, organizations should examine their values and whether their investments are maximized for the greatest good. **Metascience creates analytic instruments to match values to evidence**. Metasciences are inclusive of all fields that study science, including from historical and sociological perspectives. The **best studies are those that triangulate evidence from a variety of approaches and include key stakeholders in processes of cocreation**.



Thank you! Questions?

...and thanks to Dr.Vincent Larivière

