# Responsible Research & Evaluation

Responsible Indicators?

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### Context

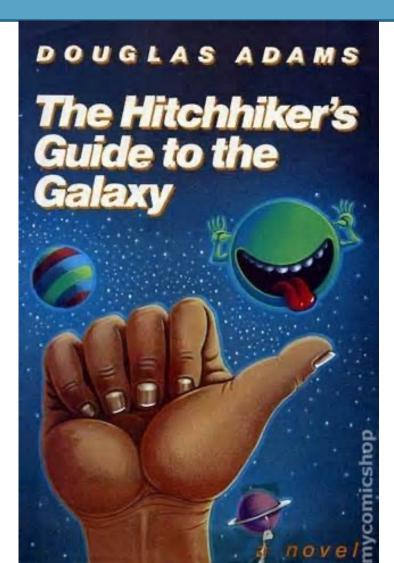


- Responsible Research and Innovation
  - Important concept in policy, not so clear in practice
  - Evaluation and RRI → How to evaluate research responsibly? Or only evaluate (irresponsibly) how responsible research is?
- Information is key
  - Information is not neutral
  - Numbers are objective (?)
  - Benchmarking: Data quality!
- My questions: What is Responsible Evaluation of Research?
   And: Are there Responsible Indicators?

### Numbers...: Metrics and Concepts



- Novel/Radio play by Douglas Adams Hitchhiker's Guide to the Galaxy (1979)
- Deep Thought:
   The ultimate question of life,
   the universe and everything
  - 7.5 million years to compute and check
  - The answer was.... 42
- answer is meaningless because the question was stupid:
  - did not specify the form of answer nor did they really know what they asked for



# Validity



- Numbers should reflect something
- "Quality", "Performance", "Societal Impact" are latent concepts
- Validity is the extent to which a measure (i.e., an indicator) actually measures what it purports to measure (i.e., a concept) (Borsboom et al., 2004, p. 1061)
- Scientometrics is data-driven: "measuring what can be measured" endangers validity, mostly reducing it to *correlation*.
- Thunder correlates highly with lightning (and there is even a causal relationship). However, lightning cannot measure thunder.

### Measurement Model

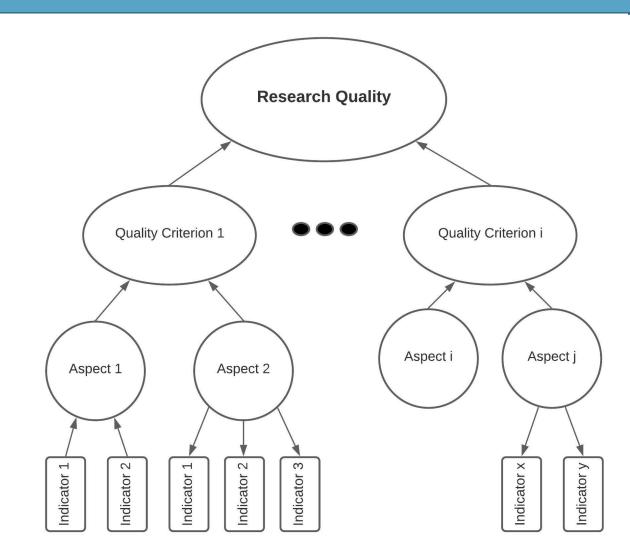


Latent Construct

Defintion: Main Dimensions

Explication to measurable or indentifiable units

Measurement



# Research Quality (Humanities)



- Valid measures for research quality?
   orange: three disc.; blue: two disc.; bold and italic. commonly used
  - 1. Scholarly exchange
  - 2. Innovation, originality
  - 3. Productivity
  - 4. Rigour
  - 5. Fostering cultural memory
  - 6. Recognition
  - 7. Reflection, criticism
  - 8. Continuity, continuation

- 9. Impact on research community
- 10. Relation to and impact on society
- 11. Variety of research
- 12. Connection to other research
- 13. Openness ideas and persons
- 14. Self-management, independence

- 15. Scholarship, erudition
- 16. Passion, enthusiasm
- 17. Vision of future research
- 18. Connection between research and teaching, scholarship of teaching
- 19. Relevance

### Measurement



• What do indicators measure that are often used in evaluation?

Table 1: Frequently used indicators and criteria they can potentially measure

Indicators	Criterion
Citations	Recognition; impact on research community; relevance
Prizes	Recognition; impact on research community; relevance
Third party funding	Recognition; impact on research community; relevance; relation to and impact on society
Collaborations	Scholarly exchange; recognition
Transfers to society and economy	Relation to and impact on society
Publications	Scholarly exchange; productivity
Board memberships	Scholarly exchange; recognition; impact on research community
Recruitment	Continuity, continuation

# Research Quality (Humanities)



- Measured by commonly used indicators (bold and italic)
  - 1. Scholarly exchange
  - 2. Innovation, originality
  - 3. Productivity
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  - 5. Fostering cultural memory
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# Research Quality (Humanities)



- English Literature, German Literature and Art History
- Consensual Indicators (orange: all three; blue: in two disciplines)
  - 1. Scholarly exchange
  - 2. Innovation, originality
  - 3. Productivity
  - 4. Rigour
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### So what?!



- Criteria are consistent across fields (SS & H) as well as evaluation situations (general evaluation or grants for young scholars)
- About 50% of relevant criteria not measurable with indicators
- Indicators measure the less important criteria
- → Validity issue! We do not measure what we want to measure but what we can

### Example Altmetrics



- Indicator is present almost everywhere
- We do not know what it measures nor is it stable (Gumpenberger, Glänzel, Gorraiz, 2016)
- It is seen as measure for societal impact → but it's driven by researchers (Ke, Ahn, Sugimoto, 2017)
- Based on Twitter data but also other social media → but Tweets correlate with >0.9
- Strongly dependent on single accounts (institutional; fun)



# Example Altmetrics: RealPeerBeview





# Example Altmetrics: RealPeerReview



Random selection of RPR-articles and control group

	@RPR				Control Group				
	Obs	Mean	Median	Min	Max	Mean	Median	Min	Max
AAS	67	50	23	3	440	9	2	0	226
Tweets	67	73	29	5	948	10	1	0	293
Percentile	67	90	94	49	99	42	40	0	99
PP Journal	67	86	92	40	100	37	30	0	99
PP Similar Age	67	87	90	62	99	42	48	0	99

### So what?!

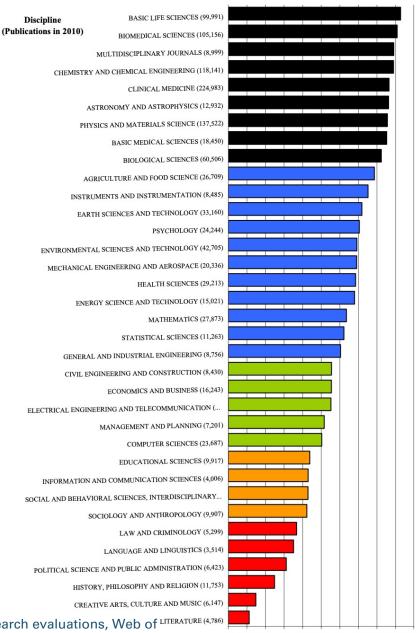


- We have objective numbers
- But not really meaningful results
- Still, it is visible everywhere → It has an impact
- If used in evaluation, the following incentives are made:
  - Have a Twitter account and tweet all your articles
  - Have an institutional account and retweet → already in 6th decile
  - Choose a funny, provoking title for your article
  - Study porn, feminist theory, funny sports or drugs and reference US presidents
- Are these the incentives to be promoted?

# Data Quality

- Let's assume, we have a correct indicator, measuring what we want
- Still, data quality issue → something that is missing from any discourse
- If many or even most citations from WoS go to non-WoS articles, what is then the meaning of a citation score based on WoS data?

Figure 2: Coverage of disciplinary output in WoS, 2010.



van Leeuwen, T. N. (2013). Bibliometric research evaluations, Web of <sup>17</sup> Science and the Social Sciences and Humanities: a problematic relationship? Bibliometrie - Praxis und Forschung, 2, 1–18.

# Data Quality



• If it is systematic bias, like language or local topics?

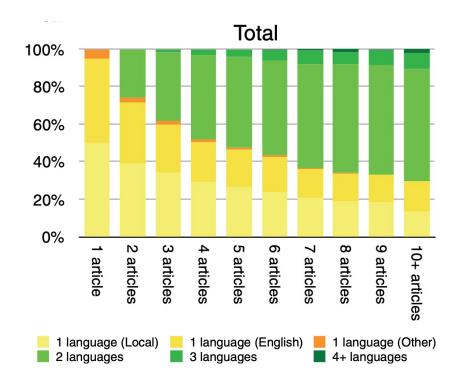


Table 2 Shares of document types in political science in different countries

Countries	Sources (Span)	WoS articles (%)	Journal articles (%)	Books as author (%)	Books as editor (%)	Book chapters/ articles in books (%)	Proceeding papers (%)
Germany	Publication lists of two institutes (2003–2007)	7	22	4.4	7.5	39	15
Norway	CRIStin (2005–2009) <sup>a</sup>	28	46	4 <sup>b</sup>		50°	-
Flanders, Belgium	VABB-SHW (2000–2009) <sup>d</sup>	17	79	1.7	2.6	16	0.3

Chi, P.-S. (2015). Changing publication and citation patterns in political science in Germany. Scientometrics, 105(3), 1833–1848. http://doi.org/10.1007/s11192-015-1609-3

Kulczycki, E., et al. (2020). Multilingual Publishing in the Social Sciences and Humanities: A Seven-Country European Study. Journal of the Association for Information Science and Technology, 26(1), 41. http://doi.org/10.1002/asi.24336

### Responsible Metrics?



- Metrics often do not cover concept encompassingly
- Missing out important information
  - Leads to an invalid measurement
  - Leads to side-effects
  - Leads to changes in behavior (de Rijke & Rushforth, 2015; de Rijke et al., 2016)
    - Not "perverse" or "unintended" effects but wrong incentives
    - Not wrong behavior but wrong policy intentions
    - Pay 1\$ per dead rat. People will start to breed rats.

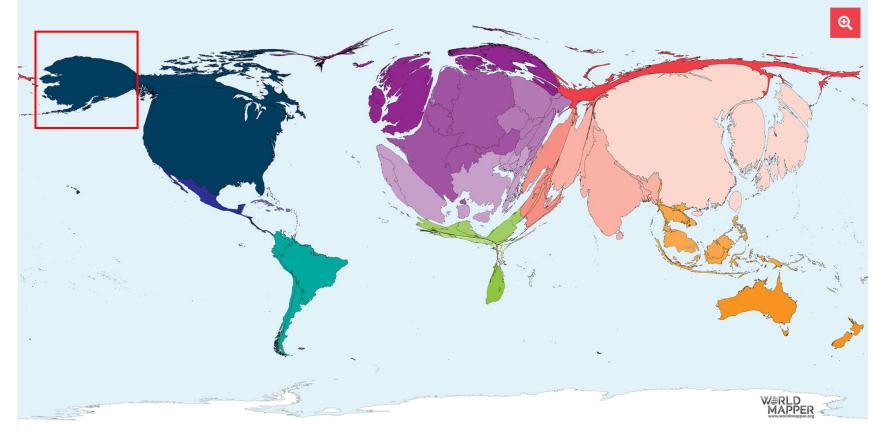
### Responsible Metrics?



Policy information tools:

• Worldmapper: Science papers published

Indicators are often
 Misinformation or even
 Disinformation

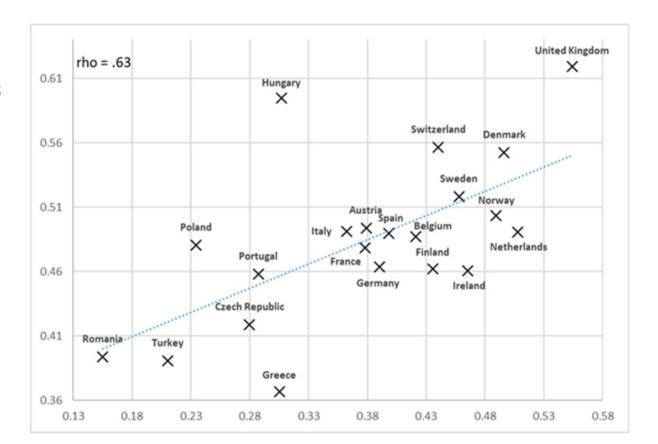


### Responsible Metrics?



- Typical example
  - Open Access as publication to wider audience
  - Twitter as societal impact
- But
  - We know that knowledge transfer is difficult (see effect of OA on Covid-Discussions: Doubts about scientific knowledge!)
  - We know that Tweets are mainly driven by scientists
  - Open Access promoters are likely to be Tweeters
- What then is the information in the Graph?
  - Is is responsible to show data without any validation of the measurement and data?
- Responsible is about use of indicators

Figure 4. Percentage of open access (vertical axis) and tweeted (horizontal axis) publications by country (top) and topic (bottom)



### Conclusion: The answer is 42



- Deep Thought created a new solution including beings that will resolve the question of all questions:
  - Planet Earth, directed by white lab mice
    - Calculating time: 10 million years.
    - Earth destroyed before the result was ready by Psychiatrists who feared loss of their careers
- Metrics are never responsible
  - Users are responsible, those who present the metrics
- Sketch of Responsible Use of Metrics (be it evaluation or Covid)
  - Assure that indicators validly measure the concept
  - Assure the data quality ("representation", error, reliability)
  - Interpret within the boundaries of measurement and data quality

#### Research Evaluation



- Research Evaluation Must Correspond to Research Practices
- Involve all Stakeholders of Research Evaluation
- Acknowledge Diversity of Evaluation Practice
- Include a Broad Range of Evaluation Criteria
- Combine Different Evaluation Methods
- Carefully Evaluate Interdisciplinary Research
- →ENRESSH Policy Brief on Better Adapted Procedures for Research Evaluation https://doi.org/10.6084/m9.figshare.12049314.v1