# Mashup or social discovery? Composite indicators in the fray

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Monitoring Convergence in the European Union Experts' workshop, Eurofound 13 - 14 June 2017





#### Where to find this talk: www.andreasaltelli.eu

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sensitivity analysis, sensitivity auditing, science for policy, impact assessment

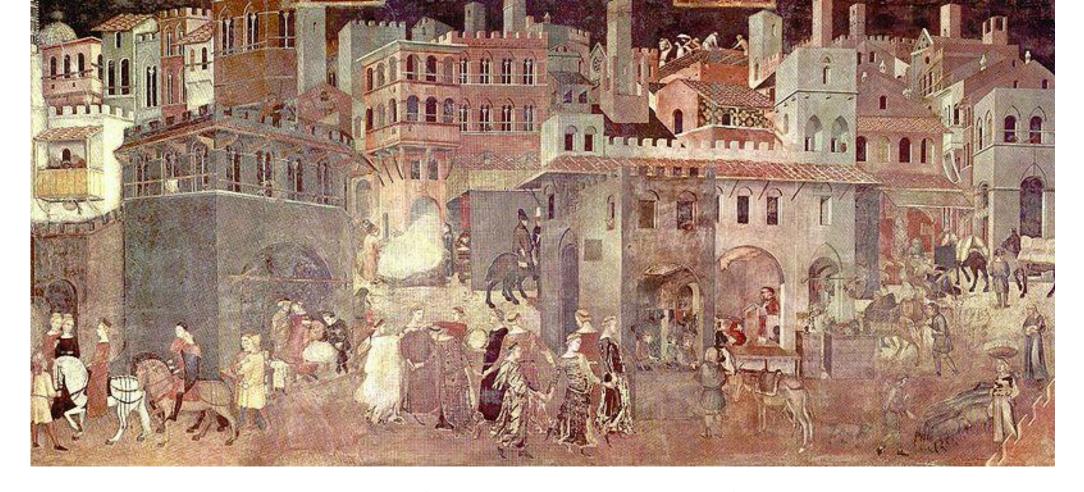


= available on andreasaltelli.eu

From images to numbers



Ambrogio Lorenzetti (c. 1290 – 1348), Allegory: Effects of good and bad government, Palazzo Pubblico di Siena, (detail: Safety)



Ambrogio Lorenzetti (c. 1290 – 1348), Allegory: Effects of good and bad government, Palazzo Pubblico di Siena, Effects of good government in the city



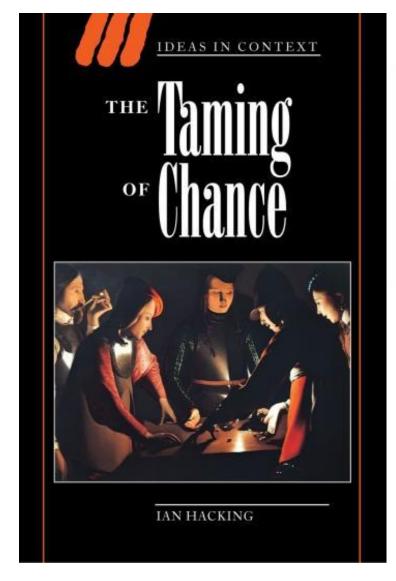
Ambrogio Lorenzetti (c. 1290 – 1348), Allegory: Effects of good and bad government, Palazzo Pubblico di Siena, Effects of the good government in the countryside



Ambrogio Lorenzetti (c. 1290 – 1348), Allegory: Effects of good and bad government, Palazzo Pubblico di Siena, Effects of the bad government in the countryside

"[...] Lorenzetti is modern because he invites the spectator of his frescoes, [...] to assess governments not so much on the political principles and values [...] than on the practical consequences of their decisions.

The paintings on the effects of good and bad governance show them were to look, what are the signs, or, in contemporary language, the indicators, to monitor in that respect." The emergence of statistics, the imperialism of probability, the first scoreboard ...

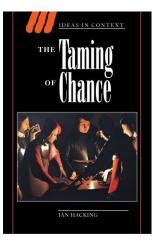




Ian Hacking

Ian Hacking, 1990, The taming of chance, Cambridge University Press. Leibnitz, 'philosophical godfather of Prussian official statistics' to the Prince Frederik of Prussia 1700





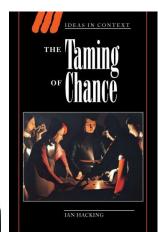
56 categories to 'measure the power of a state' (the first scoreboard; e.g. number of marriageable girls, able bodied capable to carry arms, diseases, child mortality)

Leibnitz's first proposal for a statistical office

Already in 1745 Jews are being treated as a separate category and counted in Prussian statistics

'Probability' won an epistemological war between the eighteen and the nineteen century.



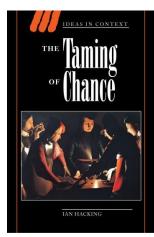


'Probability' became king in adjudicating the credibility of evidence.

We look at facts mostly through the lenses of statistics – before the enlightenment chance was equated with superstition.

The victory of probability is metaphysical (quantum mechanics), epistemological (statistics as a way of knowing things), logical (statistical inference methods) and ethical (no decision taken without statistical evidence), leading to the 'imperialism of probability'...





Statistics ←→ nation state ←→ Modernity

Is a theory for composite indicators possible?

"The role [of statistical indicators] has increased significantly over the last two decades. This reflects improvements in the level of education in the population, increases in the complexity of modern economies and the widespread use of information technology."



Jean-Paul Fitoussi, Amartya Sen, Joseph Stiglitz

CMEPSP (2009). Commission on the Measurement of Economic Performance and Social Progress, URL: http://ec.europa.eu/eurostat/documents/118025/118123/Fitoussi+ Commission+ report, last accessed June 2017.

CI as boundary objects, between analysis and advocacy

CI as instruments in a changing styles of governance of knowledge for policy; of democratization of expertise; of social discovery (John Dewey); the semiotic of CI's (Charles Sanders Peirce)



Paul-Marie Boulanger

Paul-Marie Boulanger, 2014, Elements for a comprehensive assessment of public indicators, Report EUR 26921 EN.

http://publications.jrc.ec.europa.eu/repository/bitstream/JRC92162/lbna26921enn.pdf

A triadic conception of the sign as structure connecting three elements: the sign properly said (S), an object (O) and an "interpretant"(I). But an example is needed …



Charles Sanders Peirce, the father of semiotics

"This monkey possess a sophisticated repertory of vocal signs for signaling the presence of a predator [distinguishing a] terrestrial stalking one such as a leopard, an aerial raptor such as an eagle or a ground predator such as a snake."

Paul-Marie Boulanger, 2014, Elements for a comprehensive assessment of public indicators, Report EUR 26921 EN. http://publications.jrc.ec.europa.eu/repository/bitstream/JRC 92162/lbna26921enn.pdf



African vervet monkey (Cercopithecus aethiops)



Object + Predator



Interpretant  $\leftarrow \rightarrow$  Behaviour



CI as instrumental to the creation of a new public, through a process of social discovery (J. Dewey)

Why are 'social discoveries' needed?

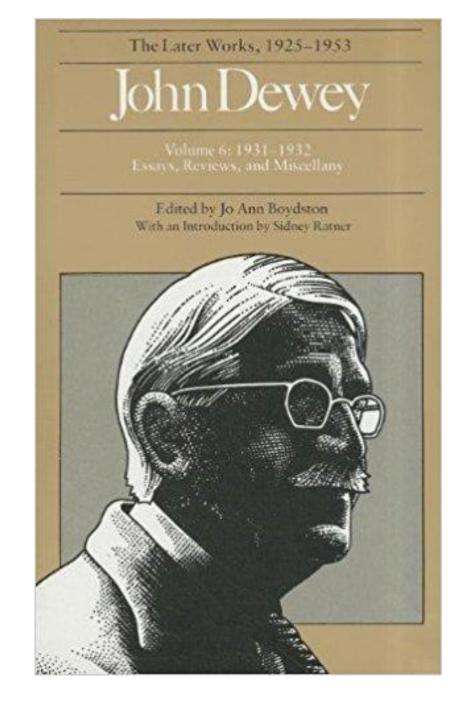
Because there are 'publics' affected by transaction taking place somewhere else. "[...] machine age has so enormously expanded, multiplied, intensified and complicated the scope of the indirect consequences [...] that the resultant public cannot identify and distinguish itself."

Dewey, J., 1938. The Public and its Problems, Read Book Ltd. Edition, 2013.

Social facts – unlike physical facts, are only meaningful in a context of desired ends

From J. Dewey 'Social Science and Social Control' in John Dewey: The Later Works, 1925–1953: 1931–1932, Vol. 6-ExLibrary,

CAETERIS ARE



Building a composite indicator can be seen as a process of social discovery for which a model of extended participation comes natural

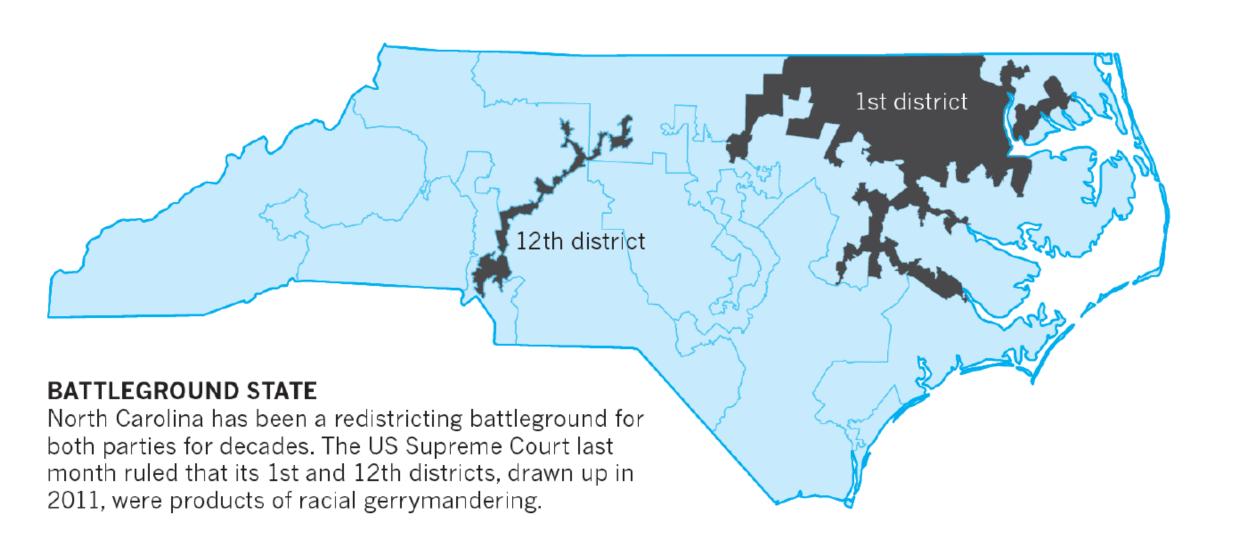
Frames and indicators are co-produced in the process which must be designed as to have a meaningful 'interpretant', or 'end-in-sight'



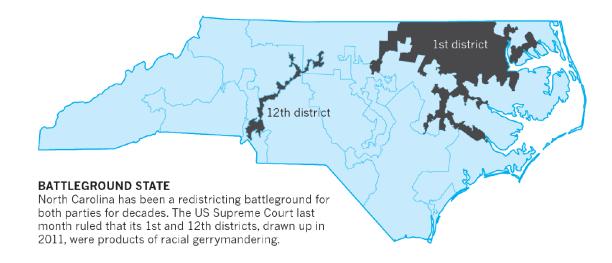
Paul-Marie Boulanger, 2014, Elements for a comprehensive assessment of public indicators, Report EUR 26921 EN. http://publications.jrc.ec.europa.eu/repository/bitstream/JRC92162/lbna26921enn.pdf

Ubiquity of composite indicators

## Making the case for gerrymandering?

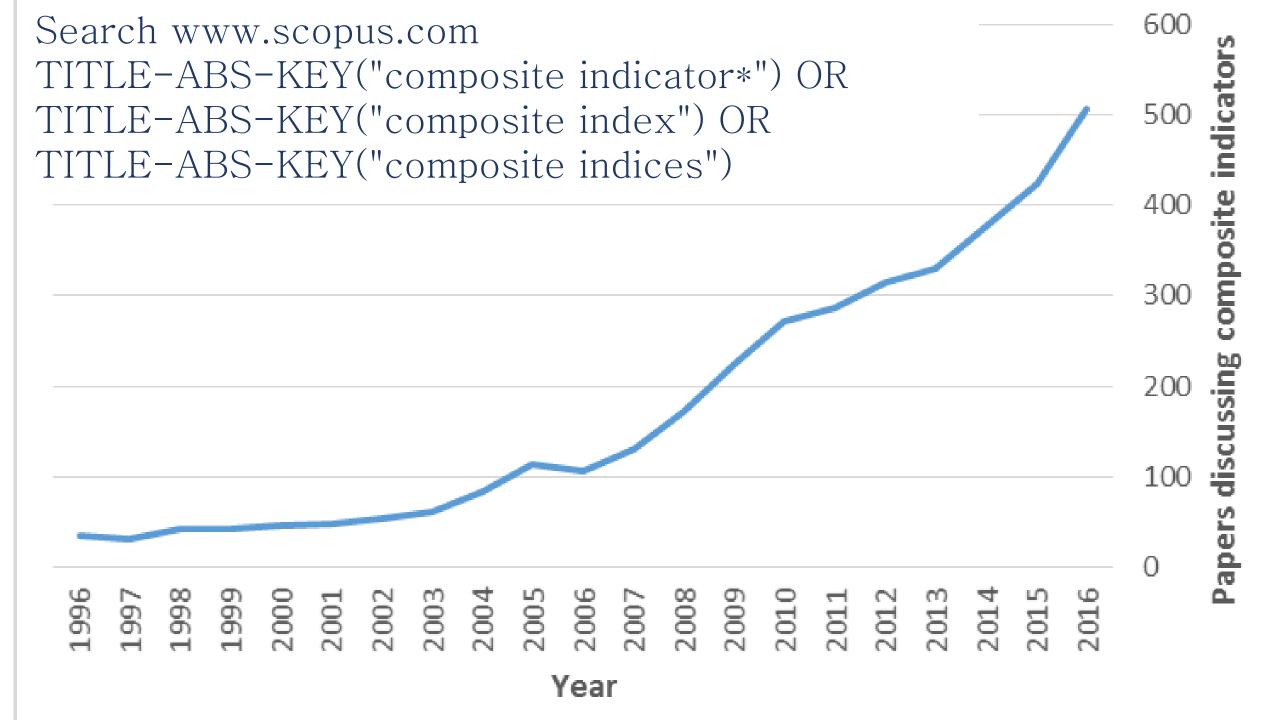


Nature June 2017 article on the mathematics of 'nailing' gerrymandering



"[US] ranked 55th of 158 nations — last among Western democracies — in a 2017 index of voting fairness (Electoral Integrity Project)"

Carrie Arnold, 2017, The mathematicians who want to save democracy, 200, NATURE, VOL 546, 8 JUNE 2017.



Critique of composite indicators

"a general criticism ··· frequently addressed at composite indicators, i.e. the arbitrary character of the procedures used to weight their various components ... an aggregation procedure always means putting relative values on the items that are introduced in the index ...



Jean-Paul Fitoussi, Amartya Sen, Joseph Stiglitz

CMEPSP (2009). Commission on the Measurement of Economic Performance and Social Progress, URL: http://ec.europa.eu/eurostat/documents/118025/118123/Fitoussi+ Commission+ report, last accessed June 2017.

"The problem is not that these weighting procedures are hidden, nontransparent or non-replicable – they are often very explicitly presented by the authors of the indices, and this is one of the strengths of this literature. The problem is rather that their normative implications are seldom made explicit or justified.



Jean-Paul Fitoussi, Amartya Sen, Joseph Stiglitz

CMEPSP (2009). Commission on the Measurement of Economic Performance and Social Progress, URL: http://ec.europa.eu/eurostat/documents/118025/118123/Fitoussi+ Commission+ report, last accessed June 2017.

There are types two indices: those built on economic theory / monetary aggregates / shadow prices and all others (=mashup indices)



Martin Ravallion

+ existing measures of e.g. development or poverty (Human Development Index, HDI, the Multidimensional Poverty Index, MPI) are bad at coping with tradeoffs

Martin Ravallion, 2010, Mashup indices of development, Policy Research Working Paper 5432, The World Bank Development Research Group,

http://documents.worldbank.org/curated/en/454791468329342000/pdf/WPS5432.pdf

To illustrate the distinction, consider two stylized examples of composite indices, both formed from the data on household assets and consumer durables found in

the Demographic and Health Surveys (DHS). For index A the variables and their weights are set by the analyst, who has some concept of —economic welfarell in mind, and thinks this is related to

certain variables in the DHS, which are aggregated based on the analyst's judgments. For

index B, the variables and weights are instead based on a regression model calibrated to

another survey data set for which a comprehensive measure of consumption (though still containing measurement errors) could be derived. The model is calibrated to common variables in the

expenditure survey and the DHS, and the regression model is used to predict wealth in the DHS.

A is a mashup index, B is not.



Martin Ravallion

# Economics theory is not all that it's cracked up to be

### Caution is needed with reliance on formal methods / models

From Carmen Reinhart and Kenneth Rogoff MS-Excel based theorem to the econometrics of Daron Acemoğlu to the use of DSGE ...

John Cassidy, 2013, The Reinhart and Rogoff Controversy: A Summing Up, April 26, 2013

http://www.newyorker.com/news/john-cassidy/the-reinhart-and-rogoff-controversy-a-summing-up

http://www.bbc.com/news/magazine-22223190

David Y. Albouy, American Economic Review, vol. 102, no. 6, October 2012 (pp. 3059-76) The Colonial Origins of Comparative Development: An Empirical Investigation: Comment,

https://www.aeaweb.org/articles?id=10.1257/aer.102.6.3059 Philip Mirowski, 2013, Never let a serious crisis go wasted, Verso Books.



# Science appears to be in an existential crisis which has ethical, epistemological, methodological and even metaphysical dimensions





# SCIENCE ON THE VERGE

#### CONTRIBUTORS

Alice Benessia Silvio Funtowicz Mario Giampietro Ângela Guimarães Pereira Jerome R. Ravetz Andrea Saltelli Roger Strand Jeroen P. van der Sluiis



Contents lists available at ScienceDirect

#### **Futures**

journal homepage: www.elsevier.com/locate/futures

#### What is science's crisis really about?

Andrea Saltelli<sup>a,b,\*</sup>, Silvio Funtowicz<sup>a</sup>





See an ongoing discussion here: https://theconversation.com/profiles/andrea-saltelli-299347/articles

<sup>&</sup>lt;sup>a</sup> Centre for the Study of the Sciences and the Humanities (SVT), University of Bergen, Norway

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# Since composite indicators are here to stay …

Tools for evidence appraisal such sensitivity analysis, sensitivity auditing, quantitative storytelling can be useful to gauge (and possibly deconstruct) measures

### Sensitivity analysis



Info

# Series A Statistics in Society

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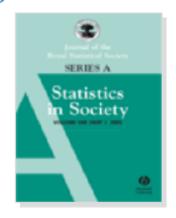
Uncertainty and sensitivity analysis techniques as tools for the quality assessment of composite indicators

M. Saisana, A. Saltelli, S. Tarantola

First published: 3 March 2005 Full publication history

DOI: 10.1111/j.1467-985X.2005.00350.x View/save citation

🌄 Citation tools 🔻



View issue TOC Volume 168, Issue 2 March 2005 Pages 307–323

# Using sensitivity analysis the volatility of country ranking can be exposed

Research Policy 40 (2011) 165-177



Contents lists available at ScienceDirect

### Research Policy

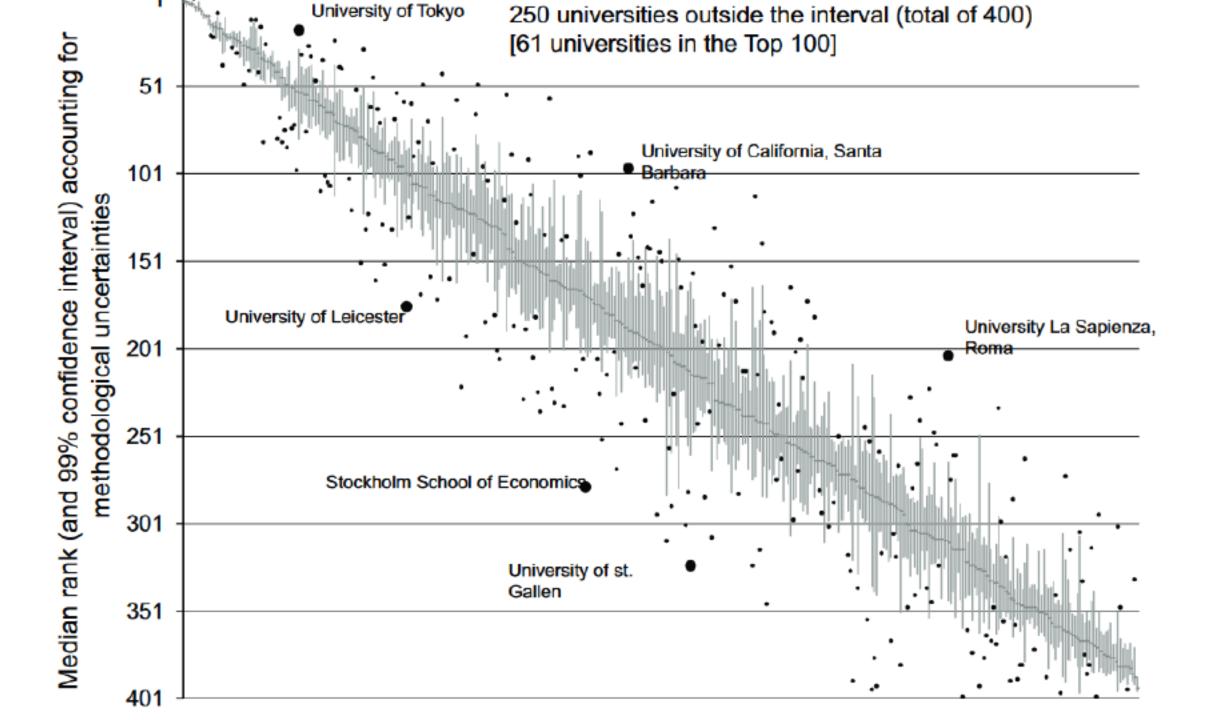
journal homepage: www.elsevier.com/locate/respol

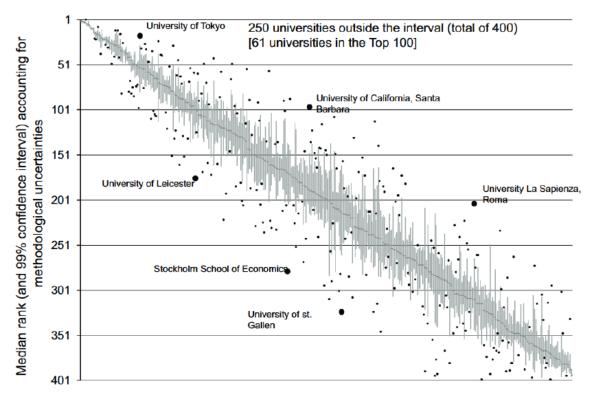


Rickety numbers: Volatility of university rankings and policy implications

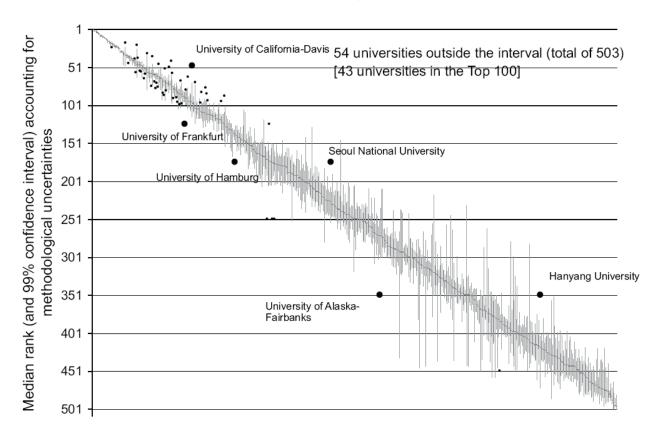
Michaela Saisana\*, Béatrice d'Hombres, Andrea Saltelli

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#### M. Saisana et al. / Research Policy 40 (2011) 165-177



# One can test whether assigned weights correspond to real importance

### Journal of the Royal Statistical Society



J. R. Statist. Soc. A (2013) **176**, Part 3, pp. 609–634

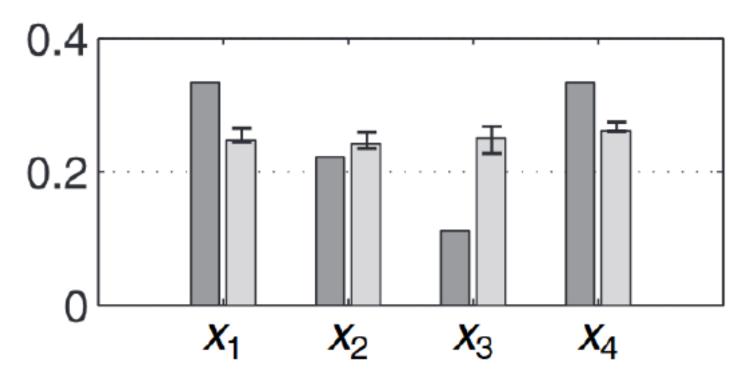
### Ratings and rankings: voodoo or science?

Paolo Paruolo

University of Insubria, Varese, Italy

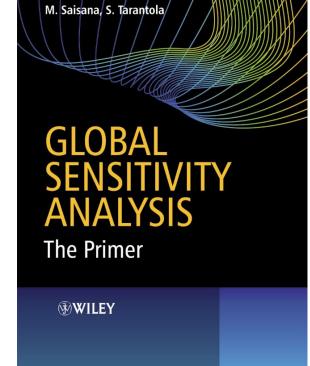
and Michaela Saisana and Andrea Saltelli

European Commission, Ispra, Italy



Assigned weights (dark grey) versus measured importance for the 2010 HDI (Paruolo et al., 2011)

A. Saltelli, M. Ratto, T. Andres, F. Campolongo, J. Cariboni, D. Gatelli,





### What do I make of your latinorum? Sensitivity auditing of mathematical modelling

#### Andrea Saltelli\* and Ângela Guimarães Pereira

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rutures xxx (2017) xxx=xxx



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#### Futures

journal homepage: www.elsevier.com/locate/futures



auditing & quantitative story-telling

How about

sensitivity

Original research article

What is wrong with evidence based policy, and how can it be improved?

Andrea Saltelli<sup>a,b,c,\*</sup>, Mario Giampietro<sup>a,c,d</sup>

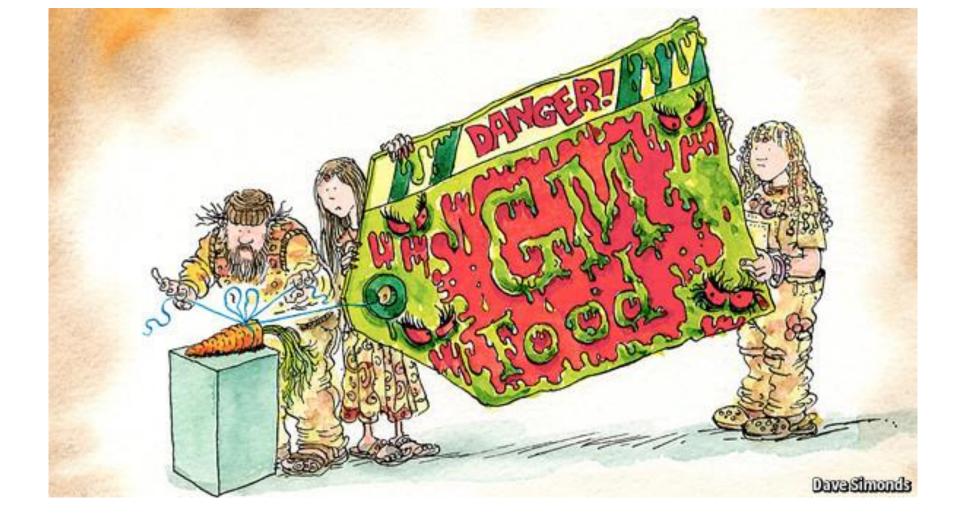
The issue of frames

Why quantification / framing may obfuscate an issue:

The example of GMO

Andrea Saltelli, Mario Giampietro, 2017, What is wrong with evidence based policy, and how can it be improved? Futures, DOI: http://dx.doi.org/doi:10.1016/j.futures.2016.11.012

Rayner, S., 2012, Uncomfortable knowledge: the social construction of ignorance in science and environmental policy discourses, Economy and Society, 41:1, 107-125.



GMO as a food scare

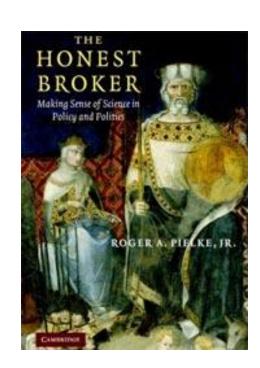
The Economist, Vermont v science, The little state that could kneecap the biotech industry, May 10th 2014

## Citizens' worries (Marris, 2001, excerpts)

- Who decided that they should be developed and how?
- Why are we not given an effective choice about whether or not to buy and consume these products?
- Do regulatory authorities have sufficient powers and resources to effectively counter-balance large companies who wish to develop these products?

Marris, C., Wynne, B., Simmons P., and Weldon, S. 2001. Final Report of the PABE research project funded by the Commission of European Communities, Contract number: FAIR CT98-3844 (DG12 - SSMI), December 2001.

The problem is not the non-neutrality of a measure but its purported neutrality (R. Pielke's Jr 'stealth advocacy')



So what does quantitative story telling propose?

Instead of detailed quantification on a single frame a rough quantitative appraise of a richer set of frames

E.g. not just one convergence story

#### Test the various stories for:

- feasibility (compatibility with processes outside human control);
- viability (compatibility with processes under human control, in relation to both the economic and technical dimensions); and
- desirability (compatibility with a multitude of normative considerations relevant to a plurality of actors).

### Conclusions: CI – instructions for use

Awareness of the imperfections and non-neutrality of measures

Investigate properties and assumptions

Use for social discovery, (deliberative) extended participation; quality as fitness for purpose

Don't commit to a single view



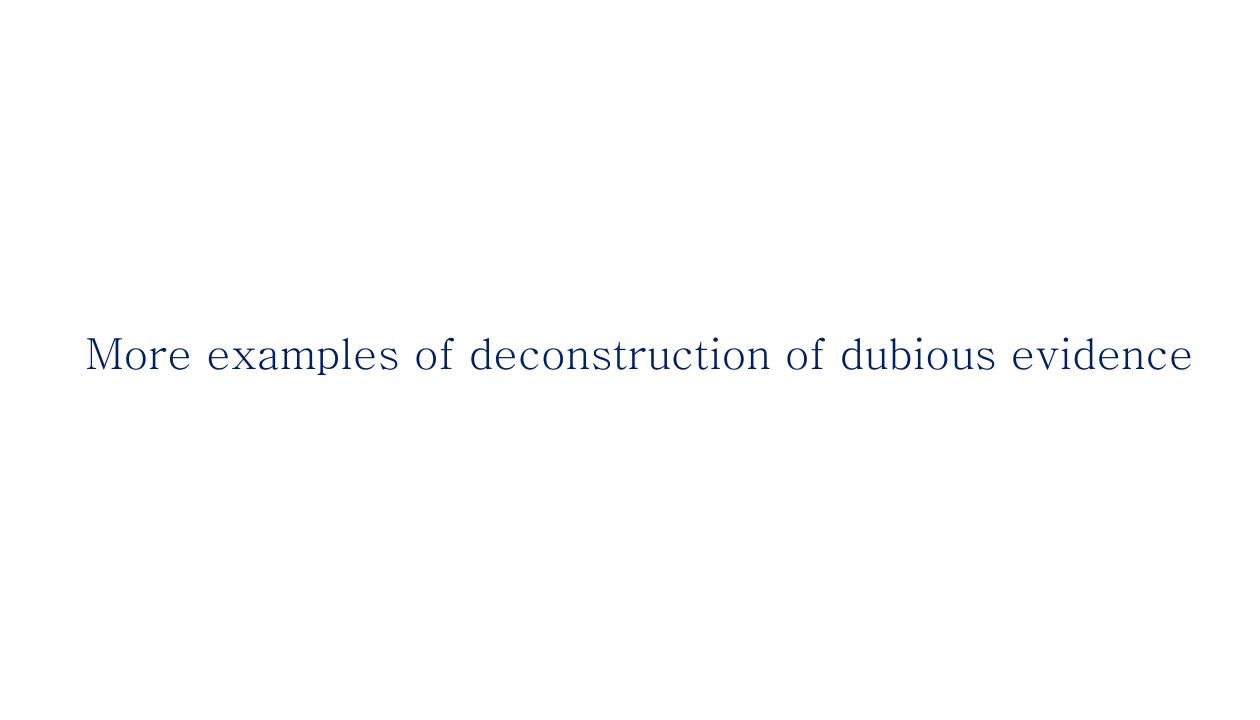
# END

Twitter: @andreasaltelli

### Outline

- Indicators from Lorenzetti to Leibnitz (Boulanger, Hacking)
- The fortune of composite indicators; How so? (CSMEP)
- CI as hybrid objects, here to stay: Gerrymandering and CI
- The critique of CI; CI hiding values (CSMEP)? CI as soft (mashup) versus strong monetary aggregates (Ravallion)
- Separating facts from values? Democratization of expertise.
- Evidence based policy and its nemesis (Saltelli and Giampietro, Ioannidis)
- The powerful methods of economics? Economics Blues (Rogoff and Reinhart, Acemoglu, Paul Romer, Mirowski on the virtues DSGE)
- Facts and norms cannot be separated; should they? Dewey on social discovery and the true nature of how social science works
- CI here to stay, let's do them properly

Extra material



### Too much is being read in the OECD-PISA data

IJCED 19,1

# Do PISA data justify PISA-based education policy?

20

Received 14 December 2016 Revised 17 February 2017 Accepted 24 February 2017

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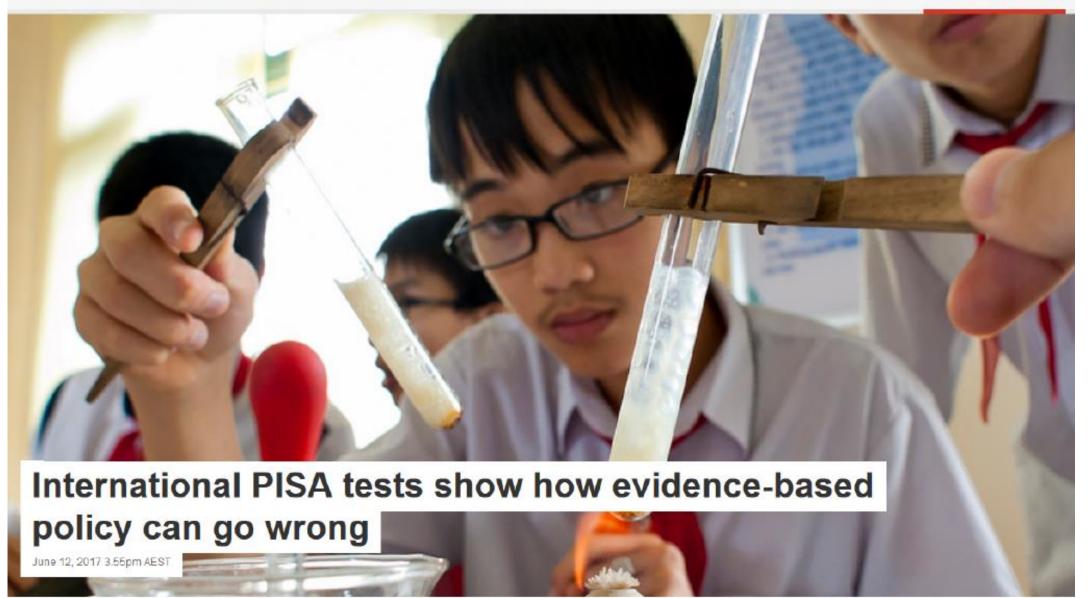


International Journal of Comparative Education and Development Vol. 19 No. 1, 2017 pp. 20-34 © Emerald Publishing Limited 2396-7404 DOI 10.1108/IJCED-12-2016-0023

### THE CONVERSATION

Academic rigour, journalistic flair

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### Taking issue with:

"If every EU Member State achieved an improvement of 25 points in its PISA score [...] the GDP of the whole EU would increase by between 4% and 6% by 2090; such an 6% increase would correspond to 35 trillion Euro" (Woessmann, 2014)

Advocating for a more collegial construction of the measure

Woessmann, L. (2014), "The economic case for education", EENEE Analytical Report 20, European Expert Network on Economics of Education (EENEE), Institute and University of Munich, Munich

See also 'OECD and Pisa tests are damaging', The Guardian, 6 May 2014 https://www.theguardian.com/education/2014/may/06/oecd-pisa-tests-damaging-education-academics

### The Ecological Footprint; top in advocacy, bottom in quality

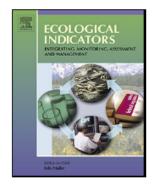
Ecological Indicators 46 (2014) 610-621



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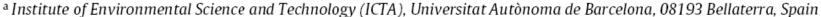
### **Ecological Indicators**

journal homepage: www.elsevier.com/locate/ecolind



### Footprints to nowhere

Mario Giampietro a,c, Andrea Saltelli b,\*



<sup>&</sup>lt;sup>b</sup> Institute for the Protection and Security of the Citizen (IPSC), The European Commission, Joint Research Centre, TP 361, 21027 Ispra, VA, Italy



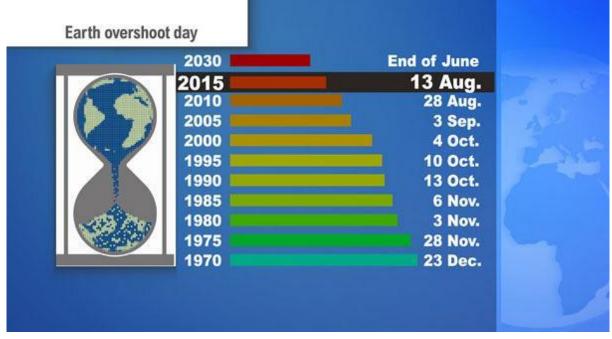
<sup>&</sup>lt;sup>c</sup> Catalan Institution for Research and Advanced Studies (ICREA), Passeig Lluís Companys, 23, 08010 Barcelona, Spain

The Ecological Footprint suggests compressing sustainability to a single metric (acres of equivalent land). Volatile assumptions are taken, spurious precision is generated, and a meaningless 'interpretant' is proposed



# Interpretant: Paradoxical policy implications – e.g. intensive non sustainable agricultural practices promoted





Alessandro Galli, Mario Giampietro, Steve Goldfinger, et al., 2016, Questioning the ecological footprint, Ecological Indicators, 69, 224-232.

Giampietro, M., and Saltelli, A., 2014, Footprints to nowhere, Ecological Indicators, 46, 610–621. Goldfinger, S., Wackernagel, M., Galli, A., Lazarus, E., Lin, D., 2014, Footprint facts and fallacies: A response to Giampietro and Saltelli (2014) "Footprints to Nowhere", 46, 622–632.

Giampietro, M., and Saltelli, A., 2014, Footworking in Circles, Ecological Indicators, 46 (2014) 260-263.

# Economics as master discipline to adjudicate evidence for policy?

The Mathiness discussion in Economics

"The style that I am calling mathiness lets academic politics masquerade as science"

The use of mathematics to veil a normative stance

https://paulromer.net/mathiness/ https://paulromer.net/feynman-integrity/

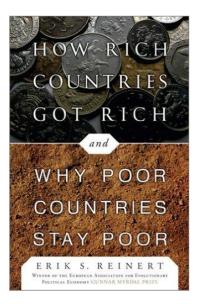


Paul Romer
Since July 18
2016 Chief
Economist of the
World Bank

For Erik Reinert economics has reverted to scholasticism forgetting an important continental tradition

··· with important implications for

developments





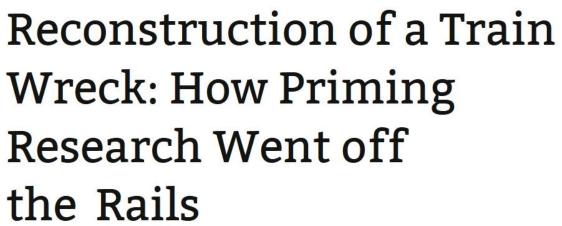
Erik Reinert

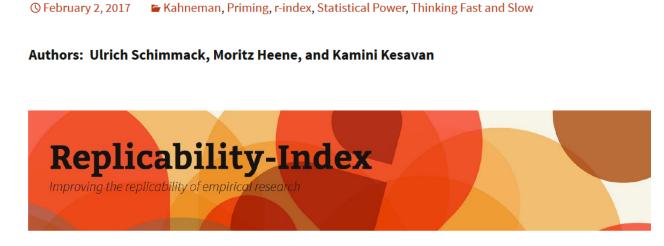


# A crisis of economics? A crisis of science!

# When entire branches of research become diseased the quality of any scientific artifact needs attention







https://replicationindex.wordpress.com/2017/02/02/reconstruction-of-a-train-wreck-how-priming-research-went-of-the-rails/comment-page-1/

# Not even statisticians can stop the crisis in the misuse of fundamental statistical tools



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#### AMERICAN STATISTICAL ASSOCIATION RELEASES STATEMENT ON STATISTICAL SIGNIFICANCE AND P-VALUES

Provides Principles to Improve the Conduct and Interpretation of Quantitative

Science

March 7, 2016

Wasserstein, R.L. and Lazar, N.A., 2016. 'The ASA's statement on p-values: context, process, and purpose', The American Statistician, DOI:10.1080/00031305.2016.1154108.

See also Christie Aschwanden at http://fivethirtyeight.com/features/not-even-scientists-can-easily-explain-p-values/



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#### **Futures**





**Journal of** 

Original research article

What is wrong with evidence based policy, and how can it be improved?

Andrea Saltelli<sup>a,b,c,\*</sup>, Mario Giampietro<sup>a,c,d</sup>





Clinical Epidemiology

Journal of Clinical Epidemiology 73 (2016) 82-86

### Evidence-based medicine has been hijacked: a report to David Sackett

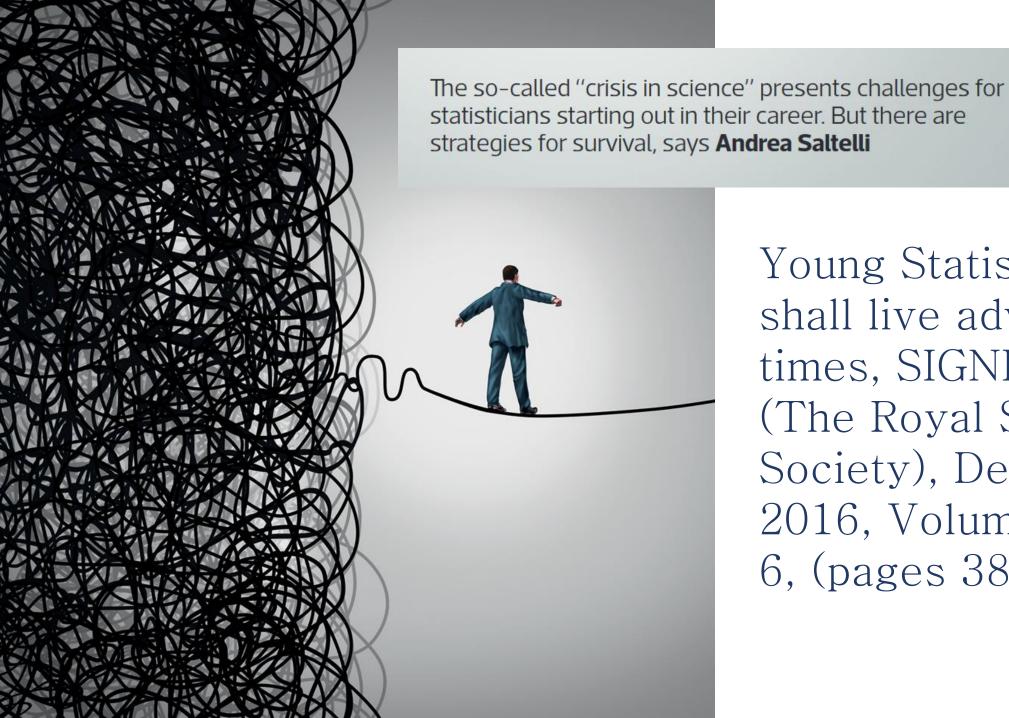
John P.A. Ioannidis<sup>a,b,c,d,\*</sup>

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 <sup>b</sup>Department of Health Research and Policy, Stanford University School of Medicine, Stanford, CA 94305, USA
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 Accepted 18 February 2016; Published online 2 March 2016

Power asymmetries in the framing of issues: those who have the deepest pockets marshal the best evidence; Instrumental use of quantification to obfuscate; (Saltelli and Giampietro, 2017)

Evidence based medicine hijacked to serve corporate agendas. Meta-analyses and guidelines serving vested interests. "Under market pressure, clinical medicine has been transformed to finance-based medicine" (Ioannidis, 2016)

# More reading on statistics, past and future



Young Statistician, You shall live adventurous times, SIGNIFICANCE (The Royal Statistical Society), December 2016, Volume 13, Issue 6, (pages 38–41)