

Present challenges in sensitivity analysis

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





= more material on my web site



= more material on Wikipedia

What happened since Nice 2013?



Sensitivity analysis books available on Library Genesis^{1M}





+





Sensitivity analysis acknowledged as necessary Office for the Management and Budget, 2006

Environmental Protection Agency, 2009

European Commission, 2015

EPA, 2009, March. Guidance on the Development, Evaluation, and Application of Environmental Models. Technical Report EPA/100/K-09/003. Office of the Science Advisor, Council for Regulatory Environmental Modeling, http://nepis.epa.gov/Exe/ZyPDF.cgi?Dockey=P1003E4R.PDF, Last accessed December 2015.

EUROPEAN COMMISSION, Better regulation toolbox, appendix to the Better Regulation Guidelines, Strasbourg, 19.5.2015, SWD(2015) 111 final, COM(2015) 215 final, http://ec.europa.eu/smart-regulation/guidelines/docs/swd_br_guidelines_en.pdf.

OMB, Proposed risk assessment bulletin, Technical report, The Office of Management and Budget's – Office of Information and Regulatory Affairs (OIRA), January 2006, https://www.whitehouse.gov/sites/default/files/omb/assets/omb/inforeg/proposed_risk_assessment_bulletin_010906.pdf, pp. 16–17, accessed December 2015.

http://ec.europa.eu/smart-regulation/

European Commission				
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lome	Better Regulation Guidelines		Share	
REFIT Stakeholder consultations	These guidelines explain what Better Regulation is and how it should be applied in the day to day practices when preparing new initiatives and proposals or managing existing policies and legislation.		Search	5
Roadmaps / Inception Impact			Stay connected	
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mpact Assessment Evaluation	number of Better Regulation principles, objectives, tools and proc	in from		
Regulatory Scrutiny Board	stakeholder consultation, implementation and evaluation.	Latest documents		
audelines	The Batter Begulation, Guidelines are structured into chapters which cover each of the instruments of the law-making process. The corresponding <u>toolboy</u> gives more detailed and technical information. Befer Regulation Guidelines are based on the outcomes of public consultation exercises carried out in 2013 and 2014. • <u>Public consultation on the revision of the Commission's Impact Assessment</u> <u>Suidelines</u> • <u>Black-midder Consultation Guidelines</u>		 <u>19/05/2015 - Better Regulation</u> Package 	
Better Regulation "Cooldearnes Better Regulation "Toolbox" Key documents			Help us improve	
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	 Consultation on the draft Commission Evaluation Editor Guidelines 		What were you looking for?	
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Better Regulation "Toolbox"

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4. SENSITIVITY AND UNCERTAINTY ANALYSES Page 391

- Six steps for a global SA:
 - 1. Select <u>one</u> output of interest;
 - 2. Participatory step: discuss which input may matter;
 - 3. Participatory step (<u>extended peer review</u>): define distributions;
 - 4. Sample from the distributions;
 - 5. Run (=evaluate) the model for the sampled values;
 - 6. Obtain in this way bot the uncertainty of the prediction and the relative importance of variables.

Sensitivity auditing also acknowledged

Sensitivity auditing



Originates from uncertainty & sensitivity analysisAddresses model-based evidence used for policy

Saltelli, A., Guimarães Pereira, Â., Van der Sluijs, J.P. and Funtowicz, S., 2013, What do I make of your latinorum? Sensitivity auditing of mathematical modelling, Int. J. Foresight and Innovation Policy, 9, 2/3/4, 213–234.

Saltelli, A., Funtowicz, S., When all models are wrong: More stringent quality criteria are needed for models used at the science-policy interface, Issues in Science and Technology, Winter 2014, 79-85. http://issues.org/30-2/andrea/



EC guidelines: what do they about sensitivity auditing ?

European Earmitistion	Better Regulation	nnne ruund anna Leudiku (eu)		
European Commission > Detter Regulatio	no Guidelines Better Regulation Guidelines	Share E 🙆 🗋 😁		
REFIT Stakeholder consultations	These guidelines explain what Better Regulation is and how it should be applied in the day to day practices when preparing new initiatives and proposals or managing existing policies and ineriation.	Search		
Assessments Impact Assessment Evaluation Regulatory Scrutiny Board	They cover the whole policy cycle, from policy preparation and adoption to implementation and application, to evaluation and revision of EU law. For each of these phases there are a number of Better Regulation principles, objectives, tools and procedures to make sure that the EU has the best regulation possible. These relate to planning, impact assessment, stakeholder consultation, implementation and evaluation.	Latest documents 1905/2015 - Better Regulation Package		
Guidelines Better Regulation Guidelines	The <u>Better Regulation Guidefines</u> are structured into chapters which cover each of the instruments of the law-making process. The corresponding <u>toolbox</u> gives more detailed and technical information.			
Better Regulation "Toolbox" Key documents	Better Regulation Guidelines are based on the outcomes of public consultation exercises, carried out in 2013 and 2014. Public consultation on the revision of the Commission's Impact Assessment Guidelines Statisticities Statisticities Batterio Consultation on the revision of the Commission's Impact Assessment Guidelines Statisticities Consultation on the dual Commission Evaluation Policy Guidelines	Help us improve Find what you wanted? Yes The		
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http://ec.europa.eu/smartregulation/guidelines/docs/br_toolbox_en.pdf

... where there is a major disagreement among stakeholders about the nature of the problem, ... then sensitivity auditing is more suitable but sensitivity analysis is still advisable as one of the steps of sensitivity auditing.

Sensitivity auditing, $[\cdots]$ is a wider consideration of the effect of all types of uncertainty, including structural assumptions embedded in the model, and subjective decisions taken in the framing of the problem.

[…]

The ultimate aim is to communicate openly and honestly the extent to which particular models can be used to support policy decisions and what their limitations are.

"In general sensitivity auditing stresses the idea of honestly communicating the extent to which model results can be trusted, taking into account as much as possible all forms of potential uncertainty, and to anticipate criticism by third parties."

"In particular, one should avoid giving the impression of false confidence by "quantification at all costs". In some cases there is simply not enough data, or the process is too complex, to give a meaningful quantitative prediction."

Problematic sensitivity analyses

Can I lie with sensitivity analysis as I can lie with statistics?



Saltelli, A., Annoni P., 2010, How to avoid a perfunctory sensitivity analysis, Environmental Modeling and Software, 25, 1508-1517.



OAT is still the most used technique. Out of every 100 papers with SA only 4 are 'global' (non-OAT)



Contents lists available at ScienceDirect

Science of the Total Environment

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

Trends in sensitivity analysis practice in the last decade

Federico Ferretti ^{a,*}, Andrea Saltelli ^{b,d}, Stefano Tarantola ^c

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Ferretti, F., Saltelli A., Tarantola, S., 2016, Trends in Sensitivity Analysis practice in the last decade, Science of the Total Environment, http://dx.doi.org/10.1016/j.scitotenv.2016.02.133



OAT in 10 dimensions puts zero points in a portion of the input space equal to 99.75% of the input space



OAT in k dimensions







Fig. 4. GSA in the different scientific domains.

Problematic quantifications in statistics



Statisticians issue warning on *P* values

Statement aims to halt missteps in the quest for certainty.

"Misuse of the P value — a common test for judging the strength of scientific evidence — is contributing to the number of research findings that cannot be reproduced"

Baker, M., 2016, Statisticians issue warning on P values, Nature, 531, 151



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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

... and twenty 'dissenting' commentaries

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/

A loss of craft skills in statistics?

nature International weekly journal	ofscience			
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Archive Volume 520 Issue 7549 Comment	Article			
NATURE COMMENT			< 8	

Statistics: P values are just the tip of the iceberg

Jeffrey T. Leek & Roger D. Peng

28 April 2015

Ridding science of shoddy statistics will require scrutiny of every step, not merely the last one, say Jeffrey T. Leek and Roger D. Peng.

Leek J.T., and Peng, R.D., 2015, P values are just the tip of the iceberg, Nature, 520, p. 612.

Statistical and mathematical modelling are at the hearth of science for policy; yet alarm about malpractices.

New Scientists talks of "statistical sausage factory" FEATURE 13 April 2016

Why so much science research is flawed – and what to do about it

Dodgy results are fuelling flawed policy decisions and undermining medical advances. They could even make us lose faith in science. New Scientist investigates



LEADER 13 April 2016

Science isn't as solid as it should be – but science can fix it

An alarming amount of research is flawed Brett Ryder

Unconscious biases and data-torturing are weakening our knowledge base – but unlike politicians and bankers, scientists aren't covering up their failings





A new community for science

New Scientist

From Andrea Saltelli, Jerome R. Ravetz and Silvio Funtowicz

We would like to complement your analysis of a crisis in science relating to studies that can't be replicated (16 April, p 5 and p 38). One of us, Jerome Ravetz, predicted in 1971 in his book *Scientific* Knowledge and its Social Problems that the system of internal quality control of science would not easily withstand the evolution toward big science.

Quality in science depends on the existence of a community of scholars linked by norms and standards, and willing to stand by these. The historian Philip Mirowski in Science-Mart (2011), fills in the blanks of Ravetz's analysis with details of how science's internal quality control system stalled when "market" replaced "community" as a unifying principle, driven by firms funding research.

The crisis has deep significance, since the contract between science and power is a basis of modernity. Science offers legitimacy to power via its guarantee of "truth". If trust collapses within the research sector, how can public trust be maintained for the many policy-relevant functions of science?

Reform will depend on the emergence of a new "polity" of science including citizen scientists who take responsibility for rooting out corruption of all sorts, scientist-citizens working primarily in the policy arena and concerned journalists and teachers. Issues of ethics and quality, previously largely restricted to coffee-time grumbles, now attract public debates and activist campaigns.

Bergen, Norway; Barcelona, Spain; and Oxford, UK

June 26, 2016 https://www.newscientist.com/letter/mg23030791-600-7-a-new-community-for-science/

Is there a crisis?



Sources 1:



THE RIGHTFUL PLACE OF SCIENCE: 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 Sluijs



The Rightful Place of Science: Science on the Verge

Paperback – 20 Feb 2016 by Andrea Saltelli (Author), Alice Benessia (Author), & 7 more

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A crisis looms over the scientific enterprise. Not a day passes without news of retractions, failed replications, fraudulent peer reviews, or misinformed science-based policies.





Science in crisis: from the sugar scam to Brexit, our faith in experts is fading

September 27, 2016 4 43pm AEST

Academic rigour, journalistic flair

THE CONVERSATION



https://theconversation.com/science-in-crisis-from-the-sugar-scam-to-brexit-our-faith-in-experts-is-fading-65016



Unreliable research Trouble at the lab

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

Oct 19th 2013 From the print edition





The crisis has ethical, epistemological, methodological and even metaphysical dimensions;



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Identified points of friction:

- paradigm of evidence-based policy
- use of science to produce implausibly precise numbers and reassuring techno-scientific imaginaries



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 use of science to 'compel' decision by the sheer strength of 'facts'



- Generation of new data/ publications at an unprecedented rate
- Compelling evidence that the majority of these discoveries will not stand the test of time.



C. Glenn Begley



John P. A. Ioannides

Begley, C. G., and Ioannidis, J. P., 2015, Reproducibility in Science. Improving the Standard for Basic and Preclinical Research, Circulation Research, 116, 116-126, doi: 10.1161/CIRCRESAHA.114.303819
• Causes: failure to adhere to good scientific practice & the desperation to publish or perish.

In the book we have a different theory but ... read the book!

THE RIGHTFUL PLACE OF SCIENCE: SCIENCE ON THE

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





C. Glenn Begley



John P. A. Ioannides

Science/knowledge degenerates when it becomes a commodity for Ravetz (1971), Lyotard (1979) and Mirowski (2011).

Ravetz, J., 1971, Scientific Knowledge and its Social Problems, Oxford University Press, p. 22.

Lyotard, J.-F. 1979. La Condition postmoderne. Rapport sur le savoir, Paris : Minuit, Chapter 10.

Mirowski, P. 2011. Science-Mart: Privatizing American Science, Harvard University Press.





Jerome R. Ravetz



Jean-François Lyotard



Philip Mirowski

In economics see the 'Mathiness' discussion: blogs of Paul Romer, Judith Curry and Erik Reinert's 'scholasticism' paper.

See https://paulromer.net/mathiness/

https://judithcurry.com/2015/08/12/the-adversarial-method-versus-feynman-integrity-2/

http://www.andreasaltelli.eu/file/repository/Full_Circle_scholasticism_2.pdf



Paul Romer



Erik Reinert

Institutions charged with science advice choose to ignore the crisis

OECD publishing

Please cite this paper as:

OECD (2015), "Scientific Advice for Policy Making: The Role and Responsibility of Expert Bodies and Individual Scientists", *OECD Science, Technology and Industry Policy Papers*, No. 21, OECD Publishing, Paris. <u>http://dx.doi.org/10.1787/5js33l1jcpwb-en</u>

OECD Science, Technology and Industry Policy Papers No. 21



Scientific Advice for Policy Making

THE ROLE AND RESPONSIBILITY OF EXPERT BODIES AND INDIVIDUAL SCIENTISTS

OECD



The Future of

SCIENTIFIC ADVICE TO THE UNITED NATIONS

A Summary Report to the Secretary-General of the United Nations from the SCIENTIFIC ADVISORY BOARD September 2016 BREXT and the election of D. Trump have unleashed a debate on post-truth, end of expertise, and ultimately a new season of science wars



Andrea Saltelli and Silvio Funtowicz, Science wars in the age of Trump, November 16, 2016 https://theconversation.com/science-wars-in-the-age-of-donald-trump-67594

Quantification and trust

p. 8: "The appeal of numbers is especially compelling to bureaucratic officials who lack the mandate of a popular election, or divine right. Arbitrariness and bias are the most usual grounds upon which such officials are criticized. A decision made by the numbers (or by explicit rules of some other sort) has at least the appearance of being fair and impersonal."



Theodor M. Porter



Theodore M. Porter, Trust in Numbers, The Pursuit of Objectivity in Science and Public Life, Princeton 1995



p. 8: "Scientific objectivity thus provides an answer to a moral demand for impartiality and fairness. Quantification is a way of making decisions without seeming to decide. Objectivity lends authority to officials who have very little of their own." Trust, authority and styles of quantification: two different stories









Porter's story: Quantification needs judgment which in turn needs trust …without trust quantification becomes mechanical, a system, and 'systems can be played'.





Can sensitivity analysis and auditing play a role in all this?

Demystifying the mathematics of uncertainty

As a critical tool for extended peer communities, e.g. to deconstruct spoof evidence

Opening up of frames

An old book from STS scholars Silvio Funtowicz and Jerome R. Ravetz's

(STS=studies of science and technology)



THEORY AND DECISION LIBRARY

SERIES A: PHILOSOPHY AND METHODOLOGY OF THE SOCIAL SCIENCES

SILVIO O. FUNTOWICZ AND JEROME R. RAVETZ

UNCERTAINTY AND QUALITY IN SCIENCE FOR POLICY

Funtowicz, S. O. and Ravetz, J. R., 1990. Uncertainty and quality in science for policy. Dordrecht: Kluwer.





EPILOGUE

"...Numbers, however, are still esoteric knowledge, the property of a small set of initiates [...] Only when there is effective quality control of science for policy, through the management of uncertainties, will we be able to cope intelligently with the crises we face. <u>The demystification of the mathematics of</u>

<u>uncertainty</u> is therefore a central part of the programme for the democratization of scientific expertise."

Silvio O. Funtowicz & Jerome R. Ravetz, 1990. Uncertainty and quality in science for policy. Kluwer: Dordrecht. p. 209



SELVID OF FUNTOWICZ AND REPORT R. RAVETZ UNCERTAINTY AND QUALITY IN SCIENCE FOR POLICY



Quantitative storytelling and responsible quantification

What is quantitative story telling?

- A truism: always listen more than one story
- An exhortation from philosophers
- A development from sensitivity analysis and sensitivity auditing
- A concept implicit in post-normal science's concept of "extended peer communities"

"There is only a perspective seeing, only a perspective "knowing"; and the more affects we allow to speak about one thing, the more eyes, different eyes, we can use to observe one thing, the more complete will our "concept" of this thing, our "objectivity", be."



Friedrich Nietzsche, Genealogy of Morals, Third Essay.

Stories, frames / framings, narratives

Some examples

Frames

Most analyses offered as input to policy are framed as cost benefit analysis or risk analyses.

> 8 ON NOT HITTING THE TAR-BABY

Winner, L., 1986. The Whale and the Reactor: a Search for Limits in an Age of High Technology. The University of Chicago Press, 1989 edition.



Langdon Winner



A Search for Limits in an Age of High Technology

LANGDON WINNER

Frames

The expression 'tax relief' is apparently innocuous but it suggests that tax is a burden, as opposed to what pays for road, hospitals, education and other infrastructures of modern life (Lakoff, 2004).



George Lakoff



Lakoff, G., 2010, Why it Matters How We Frame the Environment, Environmental Communication: A Journal of Nature and Culture, 4:1, 70-81.

Lakoff, G., 2004-2014, Don't think of an elephant: know your values and frame the debate, Chelsea Green Publishing.

Frames

GMO treated as an issue of nutritional health safety by proponents and as an issue of power and control by opponents



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

Frames as hypocognition & Socially constructed ignorance

For Rayner (2012) "Sense-making is possible only through processes of exclusion. Storytelling is possible only because of the mass of detail that we leave out. Knowledge is possible only through the systematic 'social construction of ignorance' (Ravetz, 1986)"





Steve Rayner

Jerry Ravetz

Ravetz, J., R., 1987, Usable Knowledge, Usable Ignorance, Incomplete Science with Policy Implications, Knowledge: Creation, Diffusion, Utilization, 9(1), 87-116.

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

Rayner's (2012) strategies societies may use to deal with "uncomfortable knowledge".

- Denial: "There isn't a problem"
- Dismissal: "It's a minor problem"
- Diversion: "Yes I am working on it" (In fact I am working on something that is only apparently related to the problem)
- Displacement: "Yes and the model we have developed tells us that real progress is being achieved" (The focus in now the model not the problem).

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

"Uncomfortable knowledge" can be used as a gauge of an institution's health.

The larger the "uncomfortable knowledge" an institution needs to maintain, the closer it is to its ancient régime stage (Funtowicz and Ravetz, 1994).

Funtowicz, S.O. and Jerome R. Ravetz, 1994, Emergent complex systems, Futures, 26(6), 568-582.

Why frames 'stick'

"If is difficult to get a man to understand something when his salary depends upon his not understanding it."



Upton Sinclair

So what does quantitative story telling propose?

Instead of detailed quantification on a single [/few] frame[s] a rough quantitative appraise of a richer set of frames.



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CONTRIBUTORS

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Jerome R. Ravetz Andrea Saltelli Roger Strand



Andrea Saltelli and Mario Giampietro. The Fallacy of Evidence-Based Policy, in Benessia et al. 2016

Saltelli, A., Giampietro, M., Ravetz, J.R., 2016, Decalogue of the diligent quantifier. A Pledge.

Excerpts:

Don't quantify at gun point; My license to quantify is also a license not to quantify





Each measure need a stable external referent



How can sensitivity analysis play a role?

Mastering of the 'secrets'

First secret: The most important question is the question.

Corollary 1: Sensitivity analysis is not "run" on a model but on a model once applied to a question. Corollary 2: The best setting for a sensitivity analysis is one when one wants to prove that a question cannot be answered given the model [~null hypothesis in modelling]

It is better to be in a setting of falsification than in one of confirmation (Oreskes et al., 1994).

[Normally the opposite is the case]

Verification, Validation, and Confirmation of Numerical Models in the Earth Sciences, Naomi Oreskes, Kristin Shrader-Frechette, Kenneth Belitz, Science, New Series, Vol. 263, No. 5147 (Feb. 4, 1994), pp. 641-646.

Second secret: Sensitivity analysis should not be used to hide assumptions [it often is]



Third secret: If sensitivity analysis shows that a question cannot be answered by the model one should find another question/model which can be treated meaningfully.

[Often the love for the model prevails]

Badly kept secret:

There is always one more bug... (Lubarsky's Law of Cybernetic Entomology) And sensitivity analysis spots it!

Remember to justify why you are using one given methods among the available zillion on methods



= The application must drive the choice of the method

Don't ...

... run a sensitivity analysis where each factors has a 5% uncertainty





While sensitivity analysis enjoys universal recognition its use is scarce or deficient.

A general malaise? Loss of craft skills? A wider crisis of science's quality control apparatus?

Quantification and trust are linked. High responsibility of the quantifier.

Can sensitivity analysis and auditing help? To demystify spoof evidence, and fight hypocognition? A few SA-specific 'secrets' to help in this direction.


END

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