# Ron S. Kenett Statistics at a crossroad





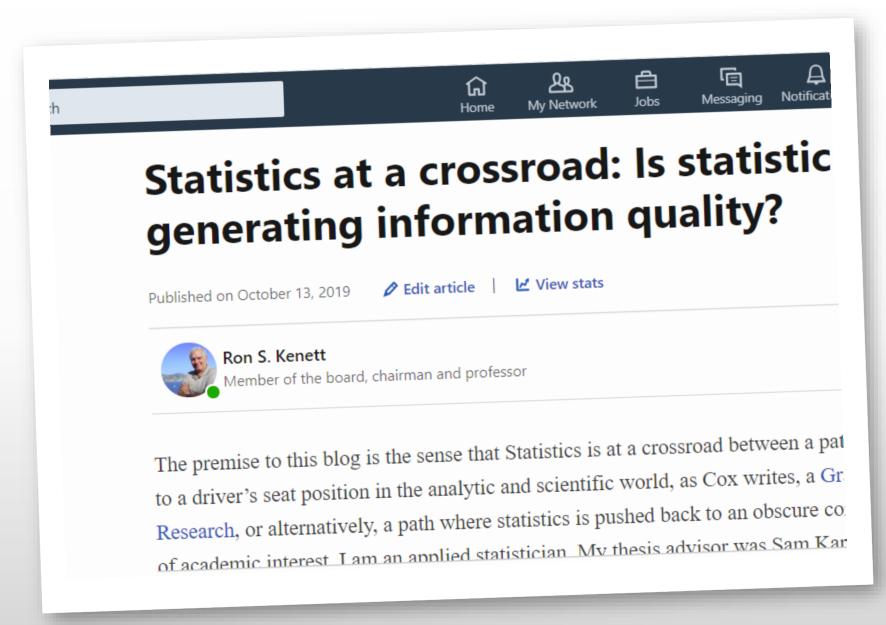


Samuel Neaman Institute for National Policy Research





https://www.linkedin.com/pulse/statistics-crossroad-generating-information-quality-ron-s-kenett/



A pragmatic view on the role of statistics and statisticians in modern data analytics

Ron S. Kenett (KPA Ltd., Raanana, Samuel Neaman Institute, Technion, Haifa and Institute for Drug Development, The Hebrew



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### ASICANDAPPLIED SOCIAL PSYCHOLOGY WIT WIT WIT MALESSING AND APPLIED SOCIAL PSYCHOLOGY WIT WIT WIT MALESSING AND APPLIED Basic and Applied Social Psychology

The *Basic and Applied Social Psychology* (BASP) 2014 Editorial emphasized that the null hypothesis significance testing procedure (NHSTP) is invalid, and thus authors would be not required to perform it (Trafimow, <u>2014</u>). However, to allow authors a grace period, the Editorial stopped short of actually banning the NHSTP. The purpose of the present Editorial is to announce that the grace period is over. From now on, BASP is banning the NHSTP.





New Guidelines for Null Hypothesis Significance Testing in Hypothetico-Deductive IS Research [Paper accepted at the Journal of the Association for Information Systems]

AUTHORS Willem Mertens, Jan Recker

https://osf.io/preprints/socarxiv/5qr7v/



### Journal

Enter keywords, authors, DOI, ORC

11012

The American Statistician > Volume 73, 2019 - Issue sup1: Statistical Inference in the 21st

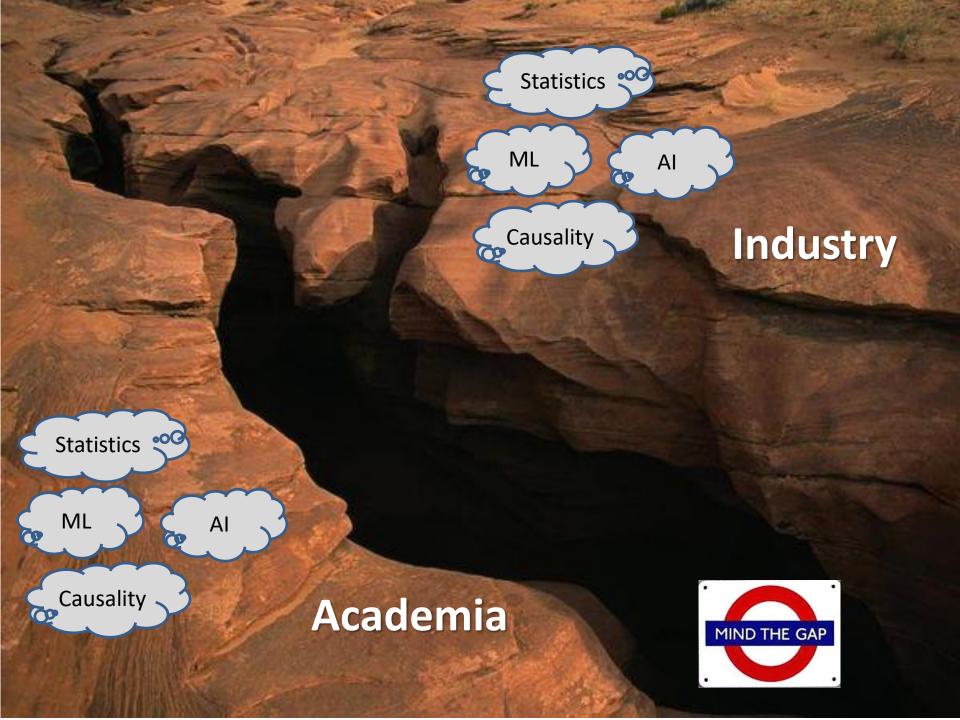
Century: A World Beyond p < 0.05

https://www.tandfonline.com/doi/full/10.1080/00031305.2019.1583913

Listen 139,900 Editorial Views Moving to a World Beyond "*p* < 0.05" 147 Ronald L. Wasserstein, Allen L. Schirm & Nicole A. Lazar Pages 1-19 | Published online: 20 Mar 2019 1,210 66 Download citation https://doi.org/10.1080/00031305.2019.1583913 Altmetric

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# **Reproducible** Research

### Reproducibility

Marcia McNutt is Editorin-Chief of *Science*. SCIENCE ADVANCES ON A FOUNDATION OF TRUSTED DISCOVERIES. REPRODUCING AN EXPERIMENT is one important approach that scientists use to gain confidence in their conclusions. Recently, the scientific community was shaken by reports that a troubling proportion of peer-reviewed preclinical studies are not reproducible. Because confidence in results is of paramount importance to the broad scientific community was are approached and a provide the broad scientific community.

### www.sciencemag.org SCIENCE VOL 343 17 JANUARY 2014

Published by AAAS

### Essay

### Why Most Published Research Findings Are False

John P. A. Ioannidis

#### Summary

There is increasing concern that most current published research findings are



PLoS Medicine | www.plosmedicine.org

factors that influence this problem and some corollaries thereof.

Modeling the Framework for False Positive Findings

0696

is characteristic of the field and can vary a lot depending on whether the field targets highly likely relationships or searches for only one or a few true relationships among thousands

Open access, freely available online

August 2005 | Volume 2 | Issue 8 | e124



### Clarifying the terminology that describes scientific reproducibility

To the Editor: There has recently been a growing interest in discussions of reproducible/repeatable scientific research1.2. The scientific press appears to be witnessing a confusion of terms: reproducibility, repeatability and replicability are referred to with different and sometimes conflicting mannings both between and within fields. We

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### Modern Industrial Statistics

with applications in R, MINITAB and IMP

ON S. KENETT SHELEMIYABU

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#### STATISTICS IN PRACTICE

l repeatabilroducibility' uipment. In set of items. are used to ler identical ast, the term o describe a h a different bpopulation. GR&R, such and compualgorithms. replicability, distinction instance, by werall result

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#### dies, reproby different WILEY term is used.

to describe changing experimental conditions beyond the researchers or lab. We see that the same terms are used with different meanings in different contexts. Our goal here is to provide conceptual clarification to this situation.

different lab technicians or test environments (scientific generalization), and therefore both test conditions and testers are varied. Poor reproducibility calls for considering the overall measurement process, including operating procedures and provided training.

As an example from biological studies, we consider the recent criticism of standardization in animal behavior experiments7. The authors show that, in contrast to standardization being beneficial, introducing systematic variation of experimental conditions (which they call "heterogenization") may attenuate spurious results and improve reproducibility8. Considering this from the standpoint of generalization clarifies the issue. Standardized animal behavior experiments are differently generalizable than experiments with induced systematic variation of experimental conditions. In particular, standardization intends statistical generalization, whereas heterogenization intends scientific generalization.

In summary, although terminology can remain domain specific, we propose that researchers should clearly state the intended generalization of their study. Such an approach will clarify the implications of a study within and across fields.

#### COMPETING FINANCIAL INTERESTS

The authors declare no competing financial interests.

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#### v 2006

rock fate

through analytics

### scientific reproducibility, *Nature Niethoas*, vol. 12(8), p 699.

## **Reproducibility versus Replicability**

Replicability is not Reproducibility: Nor is it Good Science

#### Chris Drummond

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Institute for Information Technology National Research Council Canada Ottawa, Ontario, Canada, K1A 0R6

Proc. of the Evaluation Methods for Machine Learning Workshop at the 26 th ICML, Montreal, Canada, 2009.

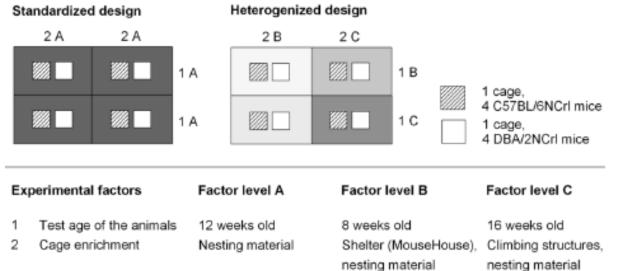
"Reproducibility requires changes; replicability avoids them. A critical point of reproducing an experimental result is that irrelevant things are intentionally not replicated. One might say, one should replicate the result not the experiment."

A highly standardized experiment supplies direct information only in respect of the narrow range of conditions achieved by standardization. Standardization, therefore, weakens rather than strengthens our ground for inferring a result, when, as is the case in practice, these conditions are somewhat varied. Ronald A. Fisher 1935

# **Reproducibility in Animal Behavior**

- Standardization is the attempt to increase reproducibility at the expense of external validity
- Standardization reduces external validity and thus also reproducibility
- Heterogenization increases external validity and thus also reproducibility

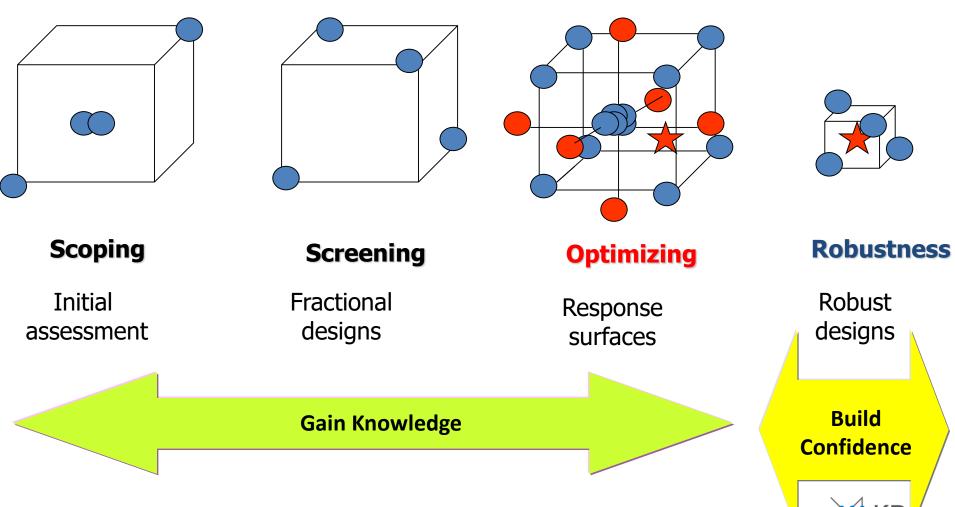
Würbel et al. 2000 Nature Genetics Richter et al. 2010 Nature Methods Richter et al. 2011 PLoS ONE





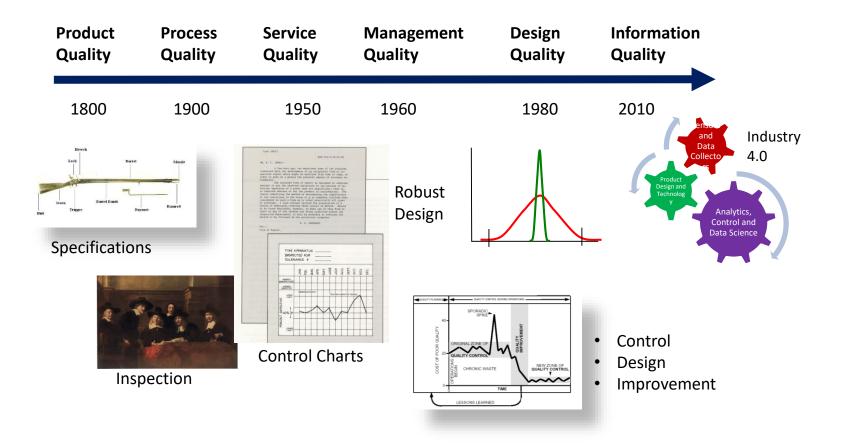
### **Design of Experiments Strategy**

Are Results Reproducible?



# An historical perspective

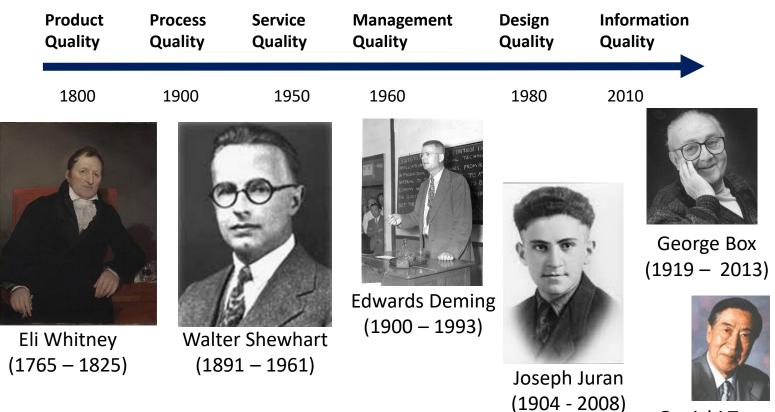
From product quality to information quality





# An historical perspective

From product quality to information quality

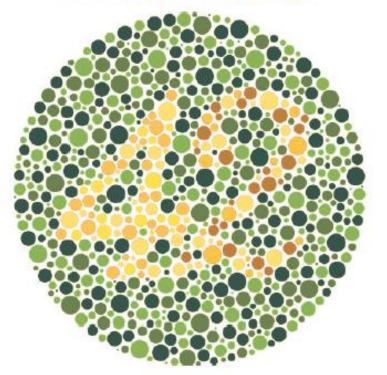


Genichi Taguchi (1924 – 2012)



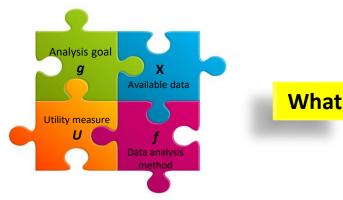
# **Information Quality**

The Potential of Data and Analytics to Generate Knowledge



Ron S. Kenett • Galit Shmueli

WILEY



InfoQ Dimensions

1.Data resolution

2.Data structure

How

3.Data integration

4. Temporal relevance

5. Chronology of data and goal

6.Generalizability

7. Operationalization

8.Communication



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	Shmueli: I <b>tion Quality: T</b>	he Potential of Data	a and Analytics to Generate Knowledge	$\mathbf{R}$	
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### Presentations on InfoQ

requires Adobe Acrobat Reader

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\* These links will open a new window

Fitle .	Location	Date
Do you want to make an impact with quantitative methods?	Toulon-Verona Conference, Israel	September
Make sure you generate high InfoQ		3, 2012
A Workshop on Modern Analysis of Customer Satisfaction	22nd Colombian Statistics Symposium, The National	July 17,
Surveys	University of Colombia Bucaramanga, Colombia	2012
Quantitative and Qualitative Aspects of Bayesian Networks:		
A General Approach for Integrating Expert Opinions and	Séminaire Parisien de Statistique, Institut Henri Poincare,	April 7,
Structured Data	Paris	2014
ENBIS Management Day Round Table Discussion	ENBIS 2011, Coimbra, Portugal	September
Endlo Management Day Nound Table Discussion	Endro 2011, Combra, Fontagai	7 2011



#### Adjusting to the GDPR: The Impact on Data Scientists and Behavioral Researchers

Travis Greene<sup>1</sup> Galit Shmueli<sup>24</sup> Soumya Ray<sup>2</sup> and Jan Felf<sup>2</sup>

#### Abstract

Rapid growth in the availability of behavioral big data (BBD) has outpaced the speed of updates to ethical research codes and regulation of data privacy and human subjects' data collection, storage, and use. The introduction of the European Union's (EU's) General Data Protection Regulation (GDPR) in May 2018 will have tar-reaching effects on data scientists and researchers who use BBD, not only in the EU, but around the world. Consequently, many companies are strugging to comply with the Regulation. At the same time, a cademics interested in research collaborations with companies are finding it more difficult to obtain data. In light of the importance of BBD in both industry and academia, data scientists and behavioral researchers would benefit from a deeper understanding of the GDPR's key concepts, definitions, and principles, especially as they apply to the data science workflow. We identify key GDPR concepts and principles and describe how they can impact the work of data scientists and researchers in this new data privacy regulation era.

Keywords: behavioral big data; data protection; GDPR; privacy and policy; information quality (InfoQ)

#### Introduction: The New Data Regulation Landscape

This new realm of big data has made large and rich microlevel data on individuals' behaviors, actions, and interactions accessible and usable by industry, governments, and academic researchers. Many industries, including retail, marketing, and advertising now take advantage of technologies such as GPS and facial recognition software,\* originally developed by military and security agencies, to collect and process data for purposes of surveilance, anomaly detection, and prediction.1-3 The resulting behavioral big data (BBD) include not only rich personal data but also social networks connecting individuals." At the same time, this sapid technological advance has far outpaced the speed of updates to ethical research codes and regulation of human subjects' data collection, storage, and use.5

The ever-widening gap has motivated data science researchers to call for the creation of general ethical

principles and guidelines to effectively balance the potential social and scientific benefits of HBD processing effects of the GDPR on data science practices and with its potential privacy costs.6 The European Union's (EU's) new General Data approaches.

Protection Regulation (GDPR), which took effect or The following sections are organized as follows. Sec-May 25, 2018, is poised to change the course of these developments. The GDPR is especially important becourse although there has been a long-standing Directive tion 2 discusses the key GDPR concepts as they relate on une use or personal data in the EU,' a Regulation-to the four components of InfoQ: goal, data, analysis, laws and has immediate application and enforcement and utility. Section 3 then examines the impact of in all EU Member States-has only been put in place now. The ostensible reason for updating the 1995 the GDPR on data scientists by analyzing a typical Directive was to keep the EU at the forefront of the modern information economy, while ensuring ar data science workflow using the InfoQ framework. 'equal phying field' among the EU countries. In addition, heterogeneity in national implementations of Finally, conclusions and future directions are given in

the Directive resulted in inefficiencies in the the Conclusion section.

"luray 0.01% describes how expli industries use fashi recognition, location tacking, biometric sensors, and other "weaplier" to analyze and pedict curationer behavior.

"Data protection e-galation, in the form of a Function with directive, has applied to the proceeding of personal data in RJ industry for over 30 years Dieche W/46EQ

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"Addess correspondence to: Golf Shmuel, institute of Service Science, National Toing Has University, No. 101, Section 2, Nation & Road, Holinchu, 2001), Talway, Final salt drawing is no undury

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given data analysis method and utility."<sup>12(p.17)</sup> The InfoQ framework can also be used to assess the value of potential, ongoing, and completed empirical studies. We therefore find it useful for analyzing the potential

The organizing framework behind our analysis and

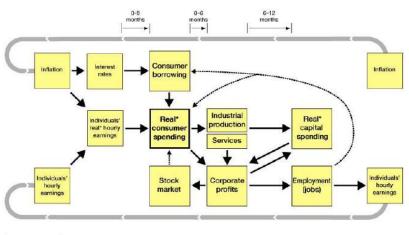
evaluation is the information quality (InfoQ) frame-

work, which aims at "assessing and improving the po-

tential of a dataset to achieve a particular goal using a

### **Predicting Changes in Quarterly Corporate Earnings Using Economic Indicators**

This study looks at corporate earnings in relation to an existing theory of business forecasting developed by Joseph H. Ellis (former research analyst at Goldman Sachs).



secondary effect

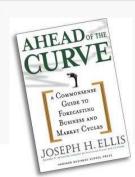
Help

This is a rating-based approach to guantifying InfoQ that scores each of the eight dimensions. This coarse grained approach rates each dimension on a 5 point scale, with 5 indicating "Very High" achievement in that dimension.

The ratings are then normalized into a desirability function for each dimension, which are then combined to produce an overall InfoQ score using the geometric mean of the individual desirabilities.

By dragging the slider handles, each dimension can be assigned a plausible range of ratings, or a specific rating.

InfoQ Lower Bound: 0.66.00 Upper Bound: 0,78.00



### InfoQ=66%

Data Resolu	
Acceptable	Acceptable
Data Structure	
High	Very High
Data Integration	
Very High	Very High
Temporal Relevance	
Acceptable	High
Chronology of Data	and Goal
Very High	Very High
Generalizability	
Low	Acceptable
Operationalization	
High	High
Communication	
Very High	Very High



# **Predicting ZILLOW.com's accuracy**

Zillow.com is a free real estate service that calculates an estimated home valuation ("Zestimate") as a starting point for anyone to see for most homes in the U.S. The study looks at the accuracy of Zestimates.

- Data collected, cleansed and merged from 4 sources –Zillow , Redfin, School Digger and Google Maps
- 17 counties (29 Zip codes) in Northern VA

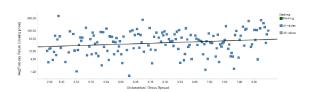
House sales data

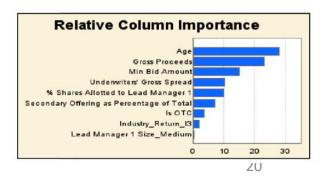
- Before Data Clean up: 3500+
- After Data Clean up: **1416**
- Y –*Is Zestimate correct* (Y/N) 37.6%/62.43%
- X –15 variables (5+ variables where discarded from initial set )



# **Predicting First Day Returns for Japanese IPOs**

An Initial Public Offering (IPO) is the first sale of stock by a company to the public. The study looks at the first-day returns on IPOs of Japanese companies.



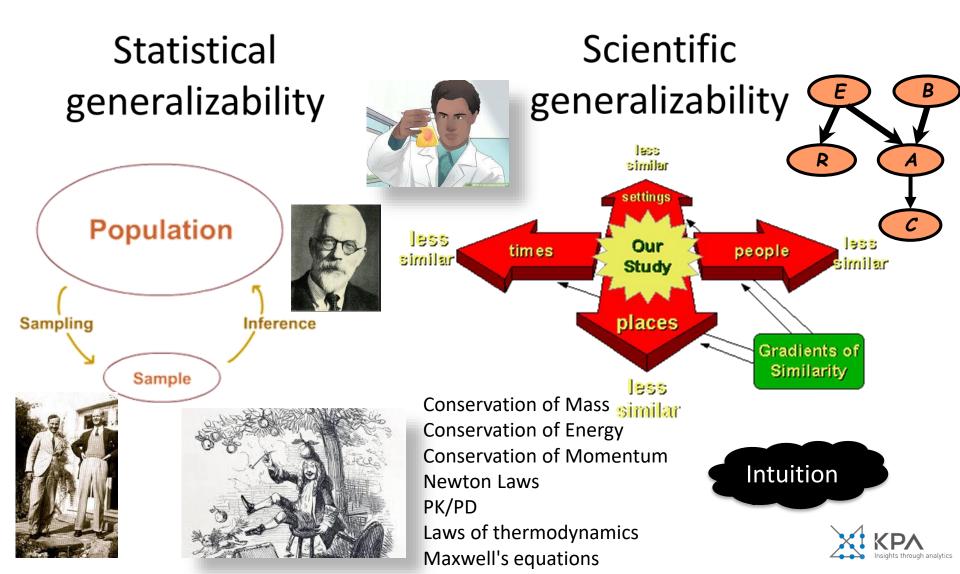


Goal: To predict the First Day returns on Japanese IPOs (based on first day closing price), using public information available prior to the offer The data: i) Japanese IPO data from 1997-2009\*, ii) 1561 IPOs, iii) Industry(categorical) : 35 industries - 3 were spelling errors, corrected Remove Air Trans (1), Fishery & Forestry (2) industries –Removed first 128 entries (1997-1999) as they had no data for 2 columns : Underwriter's fees & Allocation to BRLM –New Columns

InfoQ=66%

- Minimum bid size Secondary Offering %age –Creation of Dummy Variables
- BRLMs 3, on the basis of Gross proceeds of IPO
- Industry 4, binned by average return
- Market whether the IPO was OTC or not

# Generalizability



# Generalizability

DE GRUYTER

#### **Causal, Casual and Curious**

#### Judea Pearl\* Generalizing Experimental Findings

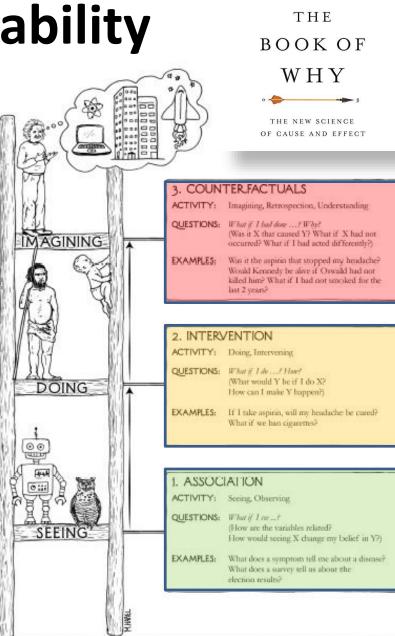
#### DOI 10.1515/jci-2015-0025

**Abstract:** This note examines one of the most crucial questions in causal inf randomized clinical trials?" The question has received a formal treatment resetting, and has led to a simple and general solution. I will describe the ramifications, and compare it to the way researchers have attempted to language of ignorability. We will see that ignorability-type assumptions nee assumptions in order to capture the full spectrum of conditions that permit judge their plausibility in specific applications.

Keywords: generalizability, transportability, selection bias, admissibility, ig

### 1 Transportability and selection bias

The long-standing problem of generalizing experimental findings from the ti a whole, also known as the problem of "sample selection-bias" [1, 2], has repast decade, as more researchers come to recognize this bias as a major mental findings in both the health sciences [3] and social policy makin randomized trial cannot be mandated, we cannot guarantee that the study as the population of interest. For example, the study population may consis financial and medical incentives offered by pharmaceutical firms or experition of outcomes in the study may differ substantially from the distribution interest.



JUDEA PEARL winner of the turing award AND DANA MACKENZIE

### THE NOBEL PRIZE IN PHYSIOLOGY OR MEDICINE 2019



### William G. Sir Peter J. Gregg L. Kaelin Jr. Ratcliffe

# Semenza

"for their discoveries of how cells sense and adapt to oxygen availability"

THE NOBEL ASSEMBLY AT KAROLINSKA INSTITUTET



### PHD2 inactivation in Type I cells drives HIF-2α-dependent multilineage hyperplasia and the formation of paraganglioma-like carotid bodies

James W. Fielding<sup>1,2,\*</sup>, Emma J. Hodson<sup>1,\*</sup>, Xiaotong Cheng<sup>1,2</sup>, David J. P. Ferguson<sup>3</sup>, Luise Eckardt<sup>1</sup>, Julie Adam<sup>1,2</sup>, Philomena Lip<sup>1</sup>, Matthew Maton-Howarth<sup>1</sup>, Indrika Ratnayaka<sup>2</sup>, Christopher W. Pugh<sup>1</sup>, Keith J. Buckler<sup>4</sup>, Peter J. Ratcliffe<sup>1,2,5</sup> and Tammie Bishop<sup>1</sup>

<sup>1</sup>Target Discovery Institute, University of Oxford, Oxford, UK <sup>2</sup>Ludwig Institute for Cancer Research, University of Oxford, Oxford, UK <sup>3</sup>John Radcliffe Hospital, University of Oxford, Oxford, UK <sup>4</sup>Department of Physiology, Anatomy and Genetics, University of Oxford, Oxford, UK <sup>5</sup>The Francis Crick Institute, London, UK

#### Edited by: Harold Schultz & Benedito Machado

#### Key points

- The carotid body is a peripheral arterial chemoreceptor that regulates ventilation in response to both acute and sustained hypoxia.
- Type I cells in this organ respond to low oxygen both acutely by depolarization and dense core vesicle secretion and, over the longer term, via cellular proliferation and enhanced ventilatory responses.
- Using lineage analysis, the present study shows that the Type I cell lineage itself proliferates and expands in response to sustained hypoxia.
- Inactivation of HIF-2α in Type I cells impairs the ventilatory, proliferative and cell intrinsic (dense core vesicle) responses to hypoxia.
- Inactivation of PHD2 in Type I cells induces multilineage hyperplasia and ultrastructural changes in dense core vesicles to form paraganglioma-like carotid bodies.
- These changes, similar to those observed in hypoxia, are dependent on HIF-2α.
- Taken together, these findings demonstrate a key role for the PHD2–HIF-2α couple in Type I cells with respect to the oxygen sensing functions of the carotid body.

Research claims

The statistical analysis section states: "Data are shown as the mean  $\pm$  SEM. Statistical analyses were performed using unpaired Student's t tests. For repeated measures, data were analysed by ANOVA followed by Tukey's multiple comparison test or t test with Holm–Sidak correction for multiple comparisons as appropriate and as described in Hodson et al. (2016). P < 0.05 was considered statistically significant."

Abstract The carotid body is a peripheral chemoreceptor that plays a central role in mammalian oxygen homeostasis. In response to sustained hypoxia, it manifests a rapid cellular proliferation



In communicating their findings, they list Key Points. The first three being:

- The carotid body is a peripheral arterial chemoreceptor that regulates ventilation in response to both acute and sustained hypoxia.
- Type I cells in this organ respond to low oxygen both acutely by depolarization and dense core vesicle secretion and, over the longer term, via cellular proliferation and enhanced ventilatory responses.
- Using lineage analysis, the present study shows that the Type I cell lineage itself proliferates and expands in response to sustained hypoxia.

These are statements supported by statistical analysis but formulated in plain language so that they can be communicated.

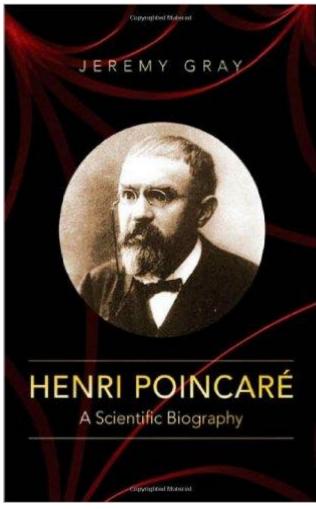
Two questions come to mind in reviewing this list:

**Question 1. What did they not find?** 

Question 2. What is the probability that they got it wrong? For example, that the Type I cell lineage itself *shrinks* in response to sustained hypoxia.

https://psyarxiv.com/jqw35





Princeton University Press, 2012

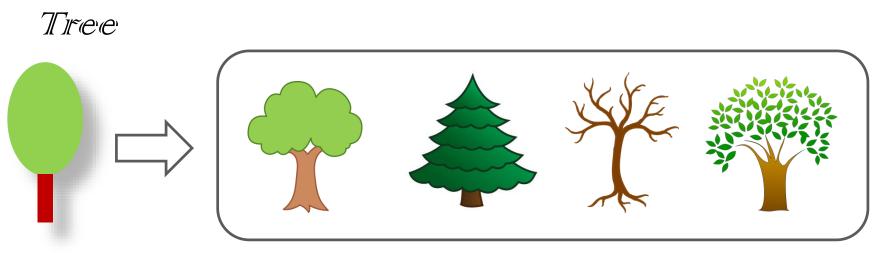
"What he emphasized above all was the act of human **understanding**. His preferred means of attaining the understanding of a problem was to find the right **generalization** of its core concepts, often in the form of an **analogy**."

> J. Gray, preface to Henri Poincarre, a scientific biography



"A **concept** is an abstraction or generalization from experience or the result of a transformation of existing concepts."

Wikipedia

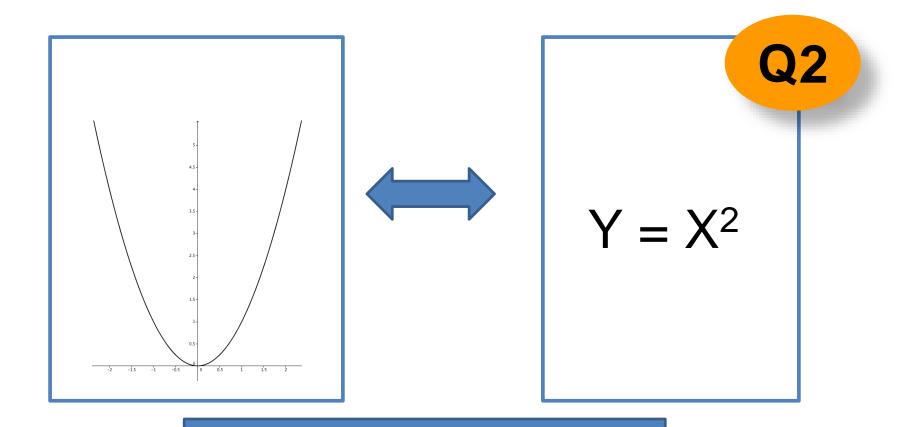


A concept can be represented in alternative forms

How do we communicate research outcomes?



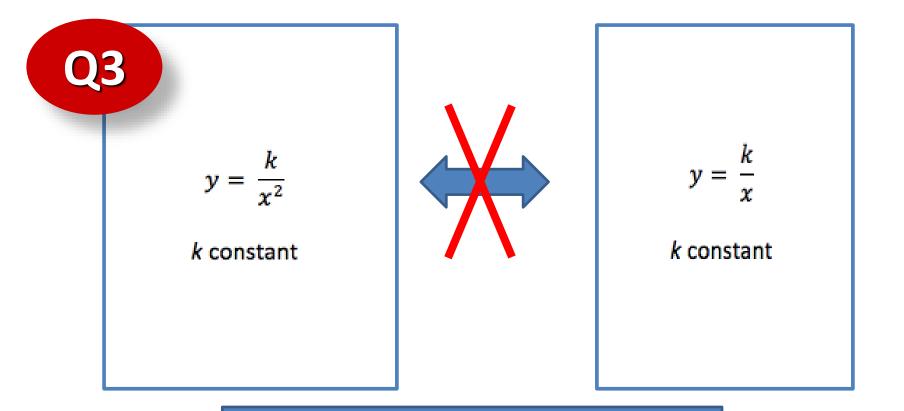
# Alternative representations with Meaning Equivalence



### Q2: Looks different but carries same meaning



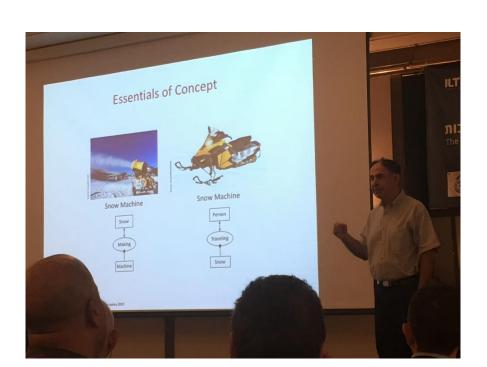
## Alternative representations with Surface Similarity

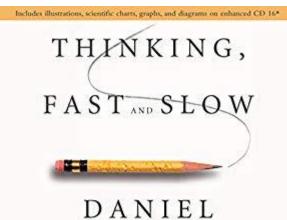


Q3: Looks similar but carries a different meaning









### DANIEL

KAHNEMAN

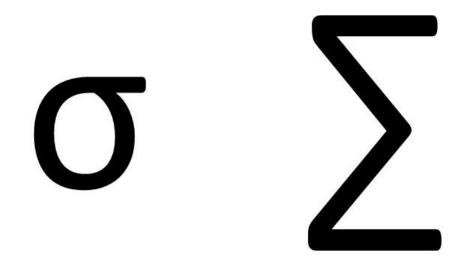
WINNER OF THE NOBEL PRIZE IN ECONOMICS

READ BY PATRICK EGAN • AN UNABRIDGED PRODUCTION



2+2

27+15



https://www.linkedin.com/pulse/little-sigma-big-sounds-same-has-totally-differentmeaning-kenett/

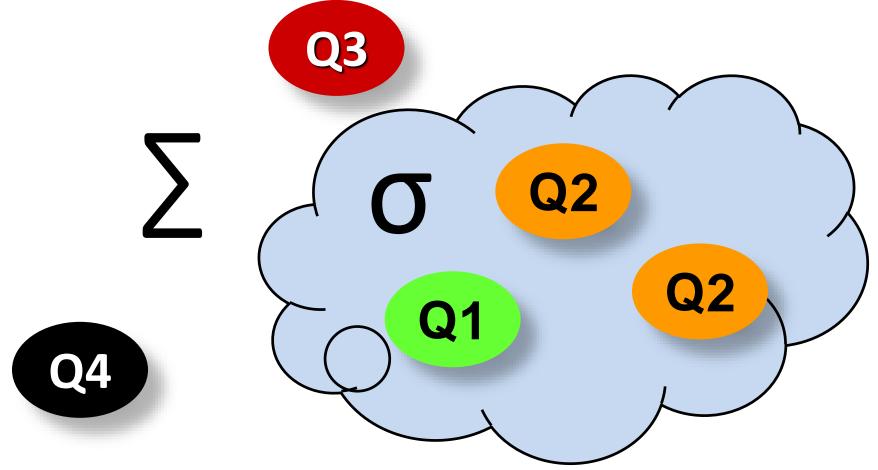
## Research findings Generalize with Alternative Representations

### **Surface similarity (SS)**

Q1	No	Yes		Q2	Mean
Yes	SS	No	SS		ing
Yes	ME	Yes	ME	No	equiv
					ivalence (ME)
Q3 Yes	SS	No	SS	Q4	e (M
No	ME	No	ME	Yes	E)

Shafrir, U. and Kenett, R.S. (2015), Concept Science Evidence-Based MERLO Learning Analytics, in Handbook of Applied Learning Theory and Design in Modern Education, IGI Global

# **Boundary of Meaning (BOM)**





# An example

### THE JOURNAL OF PEDIATRICS • www.jpeds.com



### A Structured Gradual Exposure Protocol to Baked and Heated Milk in the Treatment of Milk Allergy

Adi Efron, MD<sup>1</sup>, Yuri Zeldin, MD<sup>2,3</sup>, Leora Gotesdyner, MSc<sup>1</sup>, Tali Stauber, MD<sup>1,4,5</sup>, Ramit Maoz Segal, MD<sup>5</sup>, Inga Binson, MD<sup>3</sup>, Mira Dinkin, MD<sup>3</sup>, Larisa Dinkowitz, MD<sup>3</sup>, Danit Shahar, BSN<sup>4,5</sup>, Michal Deutch, BSN<sup>5</sup>, Mazal Yaron, BSN<sup>3</sup>, Ayelet Nevet, BSN<sup>3</sup>, Avner Reshef, MD<sup>5</sup>, Nancy Agmon-Levin, MD<sup>1,5</sup>, Ron S. Kenett, PhD<sup>6</sup>, and Mona I. Kidon, MD<sup>1,3,4,5</sup>

**Objective** To evaluate the efficacy and safety of a structured gradual exposure protocol (SGEP) with extensively heated and baked milk in promoting allergy resolution in children with cow milk allergy (CMA).

**Study design** In a case control study, children with CMA aged 1-4 years who were treated with SGEP including extensively heated and baked milk, were compared with children treated with strict avoidance. Data were collected from medical records and from validated telephone questionnaires. Data analysis was performed using a nonparametric Kaplan-Meier and proportional hazard Cox regression model, after evaluation of the adequacy of the case control matching.

**Results** There were 43 children with milk allergy—26 (62%) males with a mean age at intervention of 21 months (range, 12-47 months)—who were treated with SGEP and followed to a mean age of 40 months (range, 20-82 months). The median age at resolution of CMA was compared with a matched group of 67 children treated with strict avoidance at least until 4 years of age or followed until earlier resolution, with a mean age at follow-up of 71 months (range, 11-176 months). The median estimated age at CMA resolution in the SGEP group was 36 months (95% CI, 34.5-49.7) compared with 98 months (95% CI, 82.4-114.1) in controls (P < .001). At last follow-up, 86% of treated children were tolerant to unheated milk proteins vs 52% of controls (P = .003).

Conclusion A structured protocol with extensively heated and baked milk seems to promote faster resolution of CMA. (J Pediatr 2018;

"The quality of life of patients and families affected with a food allergy to staple foods (milk, egg, sesame, peanut) is impaired" is **equivalent in meaning** to: "Food allergy in children impacts negatively on day to day activities of the whole family "

"Food allergy in children impacts negatively on day to day activities of the whole family " has **surface similarity** to: "Educating patients on strict avoidance and carrying an epinephrine autoinjector, is completely effective in avoiding accidental exposures in preschool children".



Table III. Boundary of meaning st	M	
Target statement	Meaning equivalence findings included in BOM	Surface similarity findings not included in BOM
Finding 1: The quality of life of patients and families affected with a food allergy to staple foods (milk, egg, sesame, peanut) is impaired	Food allergy in children impacts negatively on the day-to-day activities of the whole family The incidence of accidental exposures to allergenic foods in preschool children is high The currently recommended management of food allergy in children is patient education, strict avoidance, and carrying an epinephrine autoinjector	Educating patients on strict avoidance and carrying an epinephrine autoinjector is completely effective in avoiding accidental exposures in preschool children
Finding 2: All children suspected of an allergic reaction to foods should be referred to a center that includes appropriate facilities, medical, and support staff experienced in the diagnosis and treatment of children with food allergies as early as possible	The diagnosis of food allergy in children should be performed soon after the suspected event There are no age limitations on the performance of diagnostic allergy tests, such as SPTs or observed food challenges, provided these are performed by well trained and experienced medical teams	Recommending strict avoidance of suspected allergenic foods is the best treatment for all young food allergic children Laboratory test such as slgE to food can accurately diagnose food allergy in children
Finding 3: The natural history of CM allergy in children is still favorable as in most—it seems to resolve with time	The median age at resolution of CMA (by which time 50% of children have resolved their allergies) is between 6 and 8 years Children with CMA and a positive family history of atopy, an initial anaphylactic reaction, recurrent wheezing or moderate/severe atopic dermatitis are less likely to resolve their CMA	Food allergy in children resolves in the first years of life Avoidance of allergenic foods is beneficial in preventing food allergy in children
Finding 4: A majority of children with IgE mediated CMA are capable of consuming certain amounts of EHBM proteins	Some children with CMA can develop immediate, life- threatening reactions to the ingestion of EHBM A minority of children with CMA are allergic also to heat denatured milk products. These are the most severely affected and least likely to resolve their allergies	Families of children with IgE-mediated CMA should be encouraged to try baked milk at home All forms of heated and baked milk are similarly safe
Finding 5: In preschool children with CMA capable of ingesting EHBM safely, SGEP seems to promote earlier resolution	The median age at CMA resolution of preschool children, capable of ingesting EHBM safely and treated with SGEP including EHBM, seems to be significantly lower than in children treated with avoidance Most preschool children capable of ingesting EHBM safely and treated with SGEP including EHBM will be able to tolerate milk in their regular diet before entering school	treated with SGEP including EHBM are developing
Finding 6: A protocol of SGEP including EHBM, seems safe in children <4 years of age	A protocol of SGEP, including EHBM, performed by medical teams trained and experienced in the treatment of food allergy in children is safe	All children with IgE-mediated CMA should be treated with an SGEP with EHBM





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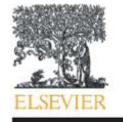
Published online in Wiley Online Library

(wileyonlinelibrary.com) DOI: 10.1002/pat.3531

### A multifactorial analysis of complex pharmaceutical platforms: an application of design of experiments to targetable polyacrylamide and ultrasound contrast agents

Meital Bloch<sup>a</sup>, Ron Kenett<sup>a</sup>\*, Lauren Jablonowski<sup>b</sup>, Margaret Wheatley<sup>b</sup>, Eylon Yavin<sup>a</sup> and Abraham Rubinstein<sup>a</sup>\*

To improve visualizati cently suggested a m near infrared dye deri to the recognition pep jugate (Flu-CPAA-Pep) tect it from pre-mature directed ultrasound in the MBs rupture into s vasculature and allow



Contents lists available at ScienceDirect

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The effect of linker type and recognition peptide conjugation chemistry on tissue affinity and cytotoxicity of charged polyacrylamide

Meital B.D. Bloch <sup>a</sup>, Eylon Yavin <sup>a</sup>, Aviram Nissan <sup>b</sup>, Ilana Ariel <sup>c</sup>, Ron Kenett <sup>a,d</sup>, Dovrat Brass <sup>e</sup>, Abraham Rubinstein <sup>a,\*</sup>



Another example

## The medical problem

#### **Colorectal cancer (CRC):**

- The 3<sup>rd</sup> most common cancer diagnosed in USA.
- The 2<sup>nd</sup> leading cause of cancer-related death.

**CRC treatment:** 

- Surgery

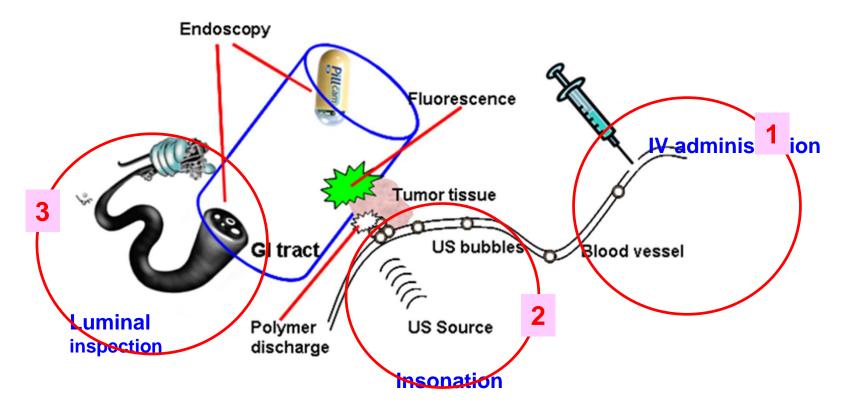
- Chemo/radio adjuvant therapy – depending on the CRC stage

- Overall incidence of CRC decline due to an advance in:
  - early diagnosis
  - improved medical treatments.
- This decline could even accelerate if <u>efficient screening system</u> is available.

Rex, D.K., *et al. Gastroenterology*, <u>112</u>: 24, 1997. Levin, B., *et al. Gastroenterology*, <u>134</u>: 1570, 2008. Mayer R.J. *et al. N. Engl. J Med*, <u>352</u>: 476, 2005. Vogelstein B. *et al. N. Engl. J Med*, <u>319</u>: 525, 1998. Edwards BK. *et al. Cancer*, <u>116</u>: 544, 2010.



## The concept



#### Hypotheses:

- 1. Targetability of Flu-CPAA towards dysplastic colon tissues is improved by adding a recognition peptide (Flu-CPAA-Pep).
- 2. Microbubbles protect Flu-CPAA and Flu-CPAA-Pep from premature affinity in the blood stream.

Bloch M, et al. Int. J. Pharm, <u>478</u>: 504, 2015.



### Power of the *in vitro* studies

#### Power Analysis

Significance Level 0.05 Anticipated RMSE 1

	Anticip	ated	
Term	Coeffi	cient	Power
Intercept		1	1
Mol% cat		1	1
Peptide		1	1
Presenting platform 1		1	0.988
Presenting platform 2		-1	0.917
Metastatic stage		1	0.993
Mol% cat*Peptide		1	1
Mol% cat*Presenting platform 1		-1	0.988
Mol% cat*Presenting platform 2		1	0.917
Mol% cat*Metastatic stage		-1	0.993
Peptide*Presenting platform 1		1	0.988
Peptide*Presenting platform 2		-1	0.917
Peptide*Metastatic stage		1	0.993
Presenting platform*Metastatic stage 1		-1	0.899
Presenting platform*Metastatic stage 2		1	0.84
Effect	Power		
Presenting platform	0.974		
	0.074		

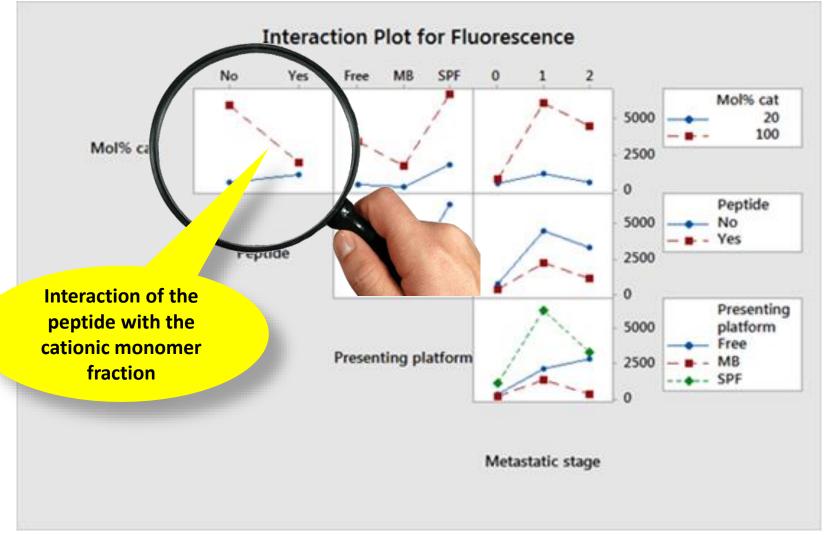
Effect	Power
Presenting platform	0.974
Mol% cat*Presenting platform	0.974
Peptide*Presenting platform	0.974
Presenting platform*Metastatic stage	0.883

### Power of the *in vivo* studies

Design Evaluation				
Power Analysis				
Significance Level 0.05 Anticipated RMSE 1				
Term	Anticipated Coefficient	Power		
	1	0.864		
Intercept				
Peptide		0.864		
Mode of administration	1	0.877		
SPF	1	0.864		
Peptide*Mode of administration	1	0.877		
Peptide*SPF	-1	0.864		
Mode of administration*SPF	1	0.877		



### Interaction plot for the *in vitro* studies





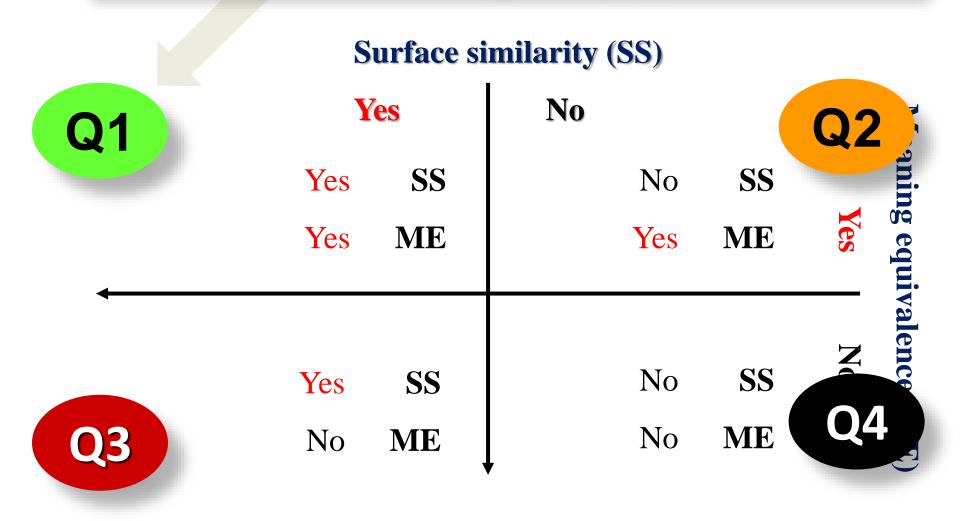
Bloch M., et al., Pol. Adv. Tech., 26: 898, 2015

## **Main Findings**

- 1. Increasing the charge density of Flu- CPAA-Pep leads to cross-reaction with the recognition peptide, VRPMPLQ.
- 2. Apart of Flu- CPAA-100, incorporation of the polymers into MBs did not significantly affect the MBs echogenic properties.
- 3. Flu-CPAA-Pep binds to dysplasia regions, after both IV and rectal administrations in the rat model.
- 4. Fragmenting MBs into SPF does not interfere with the affinity of Flu-CPAA and Flu-CPAA-Pep to malignant colon tissues after IV or rectal administrations in the rat.
- 5. SPF protected their Flu-CPAA-Pep cargo from non-specific interaction with serum proteins.



# Increasing the charge density leads to cross-reaction with the recognition peptide





	Boundary of meaning				
	Phrased Finding		Meaning Equivalence of the		
The boundary of meaning (BOM)	1	Q1 The addition of VRPMPLQ to the Flu-CPAA backbone increased the specific	MEF1-1: A vehicle affinity to its target can be increased by the addition of a recogniti moiety. MEF1-2: Specific binding of a	SSF1-1: The affinity of a multi- modal polymer to it biological target depends on the internal entanglements betwee recognition moieties.	
		binding of the polymer to their biological target.	vehicle may be affected by the relative specificity of its recognition compor	moiety depends on its charge, the higher the charge density the higher the affinity obtained.	
	Loading the Flu-CPAA into MBs, significantly reduced	MEF2-1: Loading a targeted polymer into a protective vehicle interferes with the affinity properties of the polymer.	SSF2-1: Recognition polymers express reduced affinity to their biological targets when loaded into a degradable vehicle.		
	2	the ability of the Flu-CPAA polymers to interact with their biological targets.	MEF2-2: Recognition of a biological target by a targetable polymer depends on the free acquaintance of the recognition moieties.	SSF2-2: Recognition polymer mode of loading into a protective vehicle affects the affinity to the biological target.	
		Fragmenting the MBs into SPF restored the recognition	MEF3-1: Rupturing the barrier functions of a protective vehicle regenerates the recognition properties of its polymeric cargo.	SSF3-1: Targeted nanoparticles enhance their recognition properties towards biological targets after fragmentation.	
	3	properties of the Flu-CPAA polymers and even increased them.	MEFP 2: Unveiling a shield from a support carrier restores the properties of the cargo polymer.	SSF3-2: Fragmentation of a protective vehicle increases the recognition capabilities of entrapped recognizing polymer.	



## Type S (sign) errors

"Contrary to the common impression, retrospective design calculation may be more relevant for statistically significant findings than for nonsignificant findings: The interpretation of a statistically significant result can change drastically depending on the plausible size of the underlying effect.

Like power analysis, the design calculations we recommend require external estimates of effect sizes or population differences."

Beyond Power Calculations: Assessing Type S (Sign) and Type M (Magnitude) Errors

#### Andrew Gelman<sup>1</sup> and John Carlin<sup>2,3</sup>

<sup>1</sup>Department of Statistics and Department of Political Science, Columbia University; <sup>2</sup>Clinical Epidemiology and Biostatistics Unit, Murdoch Children's Research Institute, Parkville, Victoria, Australia; and <sup>3</sup>Department of Paediatrics and School of Population and Global Health, University of Melbourne

Type S error:  $\theta_1 > \theta_2$ , but I claim that  $\theta_1 < \theta_2$  (or vice versa)



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#### From external information... D : the true effect size

From the data (or model if prospective design)... d : the observed effect s : SE of the observed effect p : the resulting p-value

#### Hypothetical replicated data

 $d^{rep}$ : the effect that would be observed in a hypothetical replication study with a design like the one used in the original study (so assumed also to have SE = s)

Use a value (or set of values) of the treatment effect considered plausible in advance of doing the study. Condition on a result being significant to calculate the **Bayesian** posterior probability of its being of the correct sign (S)

#### Design calculations:

- Power: the probability that the replication d<sup>rep</sup> is larger (in absolute value) than the critical value that is considered to define "statistical significance" in this analysis.
- Type S error rate: the probability that the replicated estimate has the incorrect sign, if it is statistically significantly different from zero.

Type S error:  $\theta 1 > \theta 2$ , but I claim that  $\theta 1 < \theta 2$  (or vice versa)



## Testing a BOM

A **Type I error** consists of rejecting the "null hypothesis" (roughly speaking, the assumption of no effect, the hypothesis you typically set out to disprove) in favour of the "alternative hypothesis" when in fact the null hypothesis is true.

A **Type II error** consists of accepting the null hypothesis (technically, failing to reject the null hypothesis) when in fact the null hypothesis

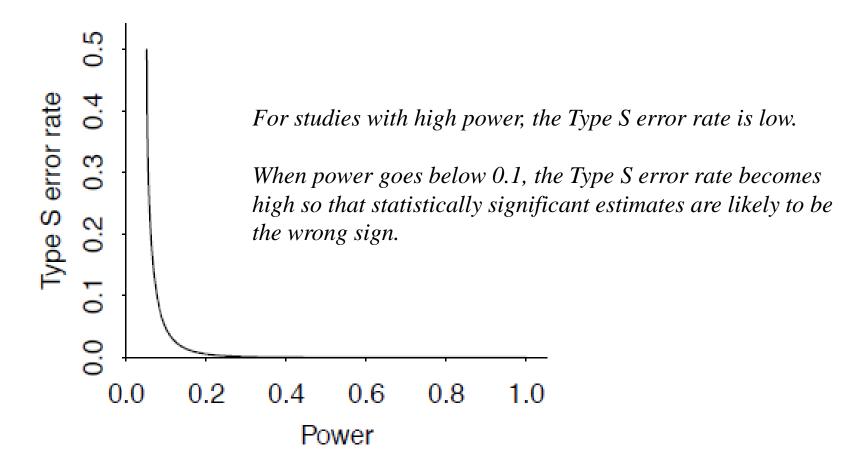
is false.

Identify effects

Interpret significant effects



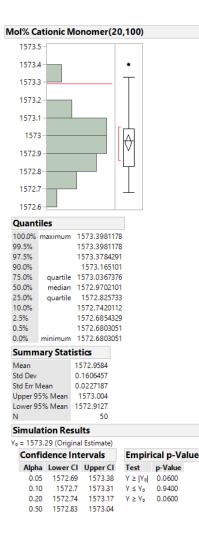
## Type S (sign) errors





## Type S (sign) errors

🙀 Model 🛛 —		$\times$			
⊿ Simulate Responses					
Effects		Y			
Intercept		1973			
Mol% Cationic Mon	omer	1573			
Peptide 1		975			
Presenting platform 1		-464			
Presenting platform 2		-1481			
Metastatic stage 1		-1487			
Metastatic stage 2		1241			
Reset Coefficients					
⊿ Distribution					
Normal Error	σ:	1			
O Binomial					
O Poisson					
Apply					
evaluations done	1	<b>•</b>			



Peptide	[No]				
957.3	_		<b>—</b>		
957.2					
957.1					
957			$\square$		
956.9					
956.8			$\bot$		
956.7					
Quant	iles				
100.0%	maximum	957.27028	523		
99.5%		957.27028			
97.5%		957.268174			
90.0%		957.238326			
75.0%					
		957.14014			
50.0%		957.038124			
25.0%		956.919612			
10.0%		956.847764			
2.5%		956.76479			
0.5%		956.752394			
	minimum		113		
Summ	ary Statis	tics			
Mean	9	957.02434			
Std Dev	(	0.1355272			
Std Err N	/lean (	0.0191664			
Upper 9	5% Mean 🤉	957.06286			
Lower 9	5% Mean	956.98583			
N		50			
	ation Resu				
$Y_0 = 957$	Y <sub>0</sub> = 957.51 (Original Estimate)				
es Cont	fidence In	tervals	Empi	rical p-Va	lues
Alph	a Lower C	Upper C	Test	p-Value	
0.0	956.765	957.268	Y ≥  Y₀	<.0001*	
0.1	0 956.812	957.258	Y ≤ Y₀	1.0000	
0.2	0 956.848	957.238	$Y \ge Y_0$	<.0001*	
0.5	0 956.92	957.14	Ļ		



#### https://www.linkedin.com/pulse/ten-questions-statistics-data-science-2020-beyond-ron-s-kenett/



Ten questions on statistics and data science for 2020 and beyond...

Published on December 29, 2019 🔗 Edit article 🕴 🛃 View sta

1. How should we practice • Statistics? 1) Embracing a life cycle perspective, from problem elicitation to generalization, operationalization and communication of findings. 2) Addressing information quality which is relevant at the design, monitoring and retrospective evaluation phases 2. What should we teach in Statistics/Data Science/Analytic courses? The conceptual understanding of Statistical methods and thinking is hard to teach. The appendix of Chapter 6 in Kenett and Shmueli (2016) is about teaching conceptual understanding in introductory Statistics courses



3. How should we teach in Statistics/Data Science/Analytic courses? Experimenting with flipped classroom strategies, where the class is used for discussion and the learning is individual and off-class, is a possible approach.

4. What are research areas for statistics and analytics to focus on? Areas that are of interest in the current interface of Statistics and Machine Learning/Artificial Intelligence/Computer Science include: 1) Data integration, also called data fusion, 2) Generalization and transportability assessments, 3) Causality analysis, 4) Combining observable data with experimental design such as done in Reinforcement Learning, 5) Compositional data analysis such as time use epidemiology and 6) Multivariate time series forecasting and multivariate process monitoring.

5. What are the tools and systems we need to deploy modern statistics and analytics? Analytic platforms such as Python, R, MINITAB, JMP are now an integral part of Applied Statistics and Data Science deliverables

6. Where and how should we publish in this area? Traditional journals such as JASA, Technometrics, JQT, QE, QREI and ASMBI are obvious candidates. There are now several new journals such as the Journal on Business Analytics. INFORMS is starting the INFORMS Journal on Data Science.

7. *How do we initiate synergistic collaborations* with other disciplines? The short answer is: by direct communication.



8. What is the role of professional organizations in this transformation, e.g. ISI, RSS, ASA, ENBIS, INFORMS and ISBIS? Professional organizations have a unique responsibility to foster discussion and provide an opportunity for contrarian views to be expressed. The attempts by some organizations to champion policy statements and recommendations such as what to do or what not to do seem problematic and are probably better avoided.

9. How should life long learning be implemented to update the skills of working statisticians? Adult education is posing a different challenge from the one faced in regular academia. In that context, simulation-based education and on-line training material are possible options. The goal is to show added value in an accessible format. Lifelong learners should be able to plan their educational effort and make it relevant to specific needs. In addition, their learning efforts should be made interesting and motivating.

#### 10. Should existing publications change their scope and review

**processes?** Publications should address the gap between academic research and application needs. With this perspective, realistic problems need to be presented as a justification for theoretical developments. This is different from using an example as demonstrator of theoretical results. In the review process, reviewers with domain specific experience should provide feedback on the submitted publication.







## Thank you for your attention

