

# On the meaning of uncertainty of measurement

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TABLE XXXI. The CODATA recommended values of the fundamental constants of physics and chemistry based on the 2018 adjustment

Quantity	Symbol	Numerical value	Unit	Relative std. uncert. $u_r$
UNIVERSAL				
speed of light in vacuum	$c$	299 792 458	$\text{m s}^{-1}$	exact
vacuum magnetic permeability $4\pi\alpha h/e^2 c$	$\mu_0$	$1.256\,637\,062\,12(19) \times 10^{-6}$	$\text{N A}^{-2}$	$1.5 \times 10^{-10}$
$\mu_0/(4\pi \times 10^{-7})$		1.000 000 000 55(15)	$\text{N A}^{-2}$	$1.5 \times 10^{-10}$
vacuum electric permittivity $1/\mu_0 c^2$	$\epsilon_0$	$8.854\,187\,8128(13) \times 10^{-12}$	$\text{F m}^{-1}$	$1.5 \times 10^{-10}$
characteristic impedance of vacuum $\mu_0 c$	$Z_0$	376.730 313 668(57)	$\Omega$	$1.5 \times 10^{-10}$
Newtonian constant of gravitation	$G$	$6.674\,30(15) \times 10^{-11}$	$\text{m}^3 \text{kg}^{-1} \text{s}^{-2}$	$2.2 \times 10^{-5}$
	$G/hc$	$6.708\,83(15) \times 10^{-39}$	$(\text{GeV}/c^2)^{-2}$	$2.2 \times 10^{-5}$
Planck constant <sup>a</sup>	$h$	$6.626\,070\,15 \times 10^{-34}$	$\text{J Hz}^{-1}$	exact
⋮	⋮	⋮	⋮	⋮
fine-structure constant $e^2/4\pi\epsilon_0\hbar c$	$\alpha$	$7.297\,352\,5693(11) \times 10^{-3}$		$1.5 \times 10^{-10}$
inverse fine-structure constant	$\alpha^{-1}$	137.035 999 084(21)		$1.5 \times 10^{-10}$
Rydberg frequency $\alpha^2 m_e c^2/2h = E_h/2h$	$cR_\infty$	$3.289\,841\,960\,2508(64) \times 10^{15}$	Hz	$1.9 \times 10^{-12}$
energy equivalent	$hcR_\infty$	$2.179\,872\,361\,1035(42) \times 10^{-18}$	J	$1.9 \times 10^{-12}$
		13.605 693 122 994(26)	eV	$1.9 \times 10^{-12}$
Rydberg constant	$R_\infty$	$10\,973\,731.568\,160(21)$	$[\text{m}^{-1}]^b$	$1.9 \times 10^{-12}$
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What are we reading?  
What does it mean?

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“measurement uncertainty”

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A diagram illustrating the relationship between measurement uncertainty, accuracy, and error. A blue oval labeled "measurement uncertainty" is connected by a blue arrow to the uncertainty values in the equations above. Two red lines point from the words "accuracy" and "error" to the same blue oval.

**“measurement uncertainty”**

accuracy

error

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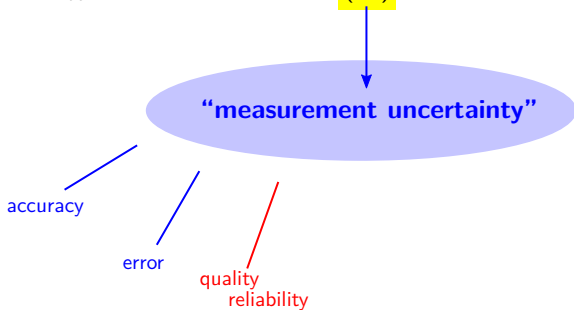
***International Vocabulary of Metrology (VIM), 1st edition, 1984***

Uncertainty of measurement : an estimate characterizing the range of values within which the true value of a measurand lies.

(p.16)

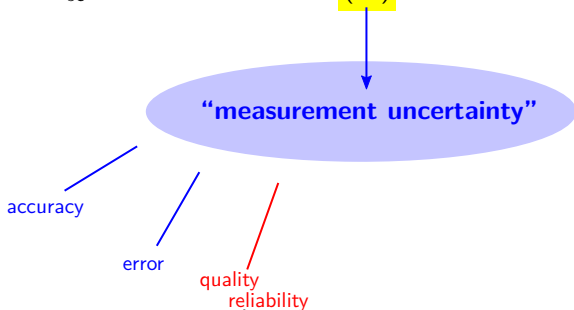
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## **Guide to the expression of uncertainty in measurement (GUM), 1993**

When reporting the result of a measurement of a physical quantity, it is obligatory that some quantitative indication of the quality of the result be given so that those who use it can assess its reliability. (p.vii)

## **Introductory supplement to the GUM (GUM supplement 4), 2009**

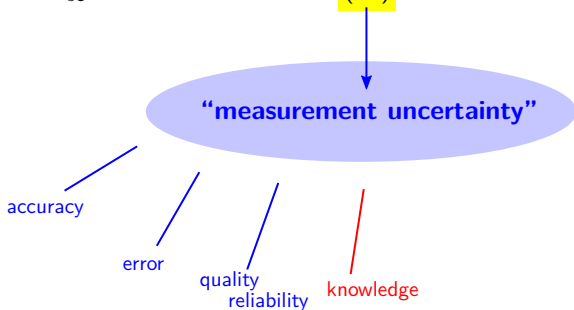
The dispersion of the indication values would relate to how well the measurement is made. (p.2)

## **S. Bell, A Beginner's Guide to Uncertainty of Measurement, NPL 1999**

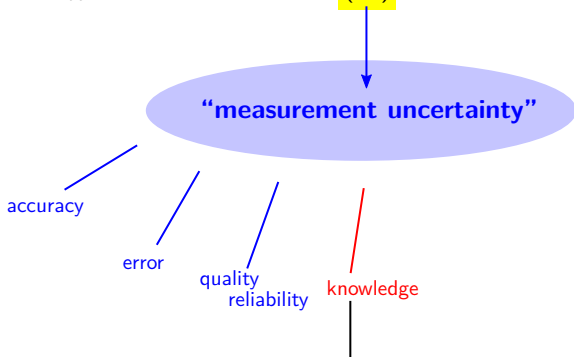
The uncertainty of a measurement tells us something about its quality. (p.1)

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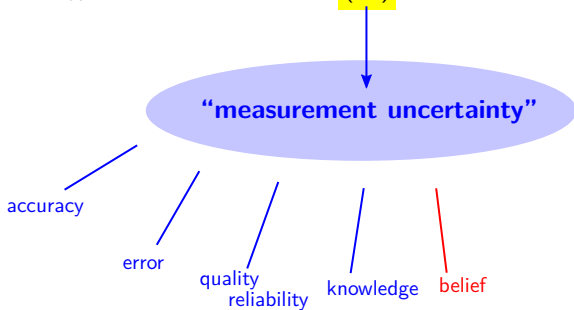
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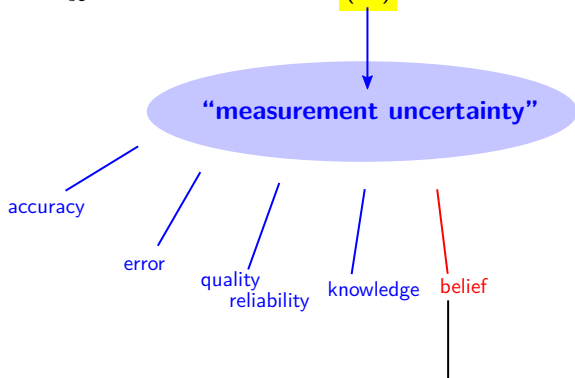
**W. Bich, *From Errors to Probability Density Functions*, 2012**

Uncertainty of measurement can be viewed as the logical reciprocal of state of knowledge. (p.2155)

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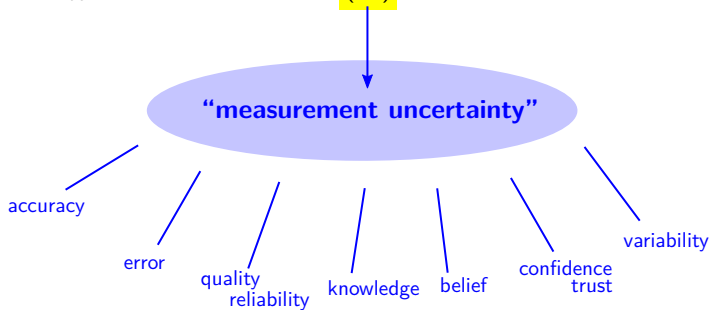


## Introductory supplement to the GUM (GUM supplement 4), 2009

Measurement uncertainty can (...) be described as a measure of how well one **believes one knows** the essentially unique true value of the measurand. (p.3)

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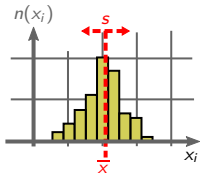
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## 1– Statistical models in metrology

## Statistical uncertainties

Experimental  
data: sample  
 $\{x_1, \dots, x_n\}$

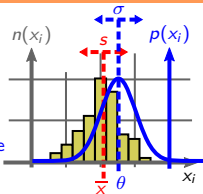




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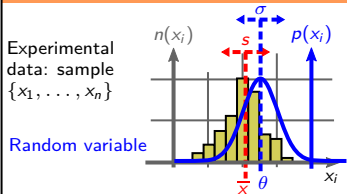
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Statistical inference  $(\bar{x}, s) \rightarrow (\theta, \sigma)$

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Probabilistic model: **frequencies**

- $p(x_i)$  is a probability that characterizes the physical setup
- Relative occurrence frequency of possible measurement outcome

## 1970s: what about systematic errors?

- If they induce an offset then it cannot be captured by frequentist probabilities  
(no frequency  $\Rightarrow$  no probability)
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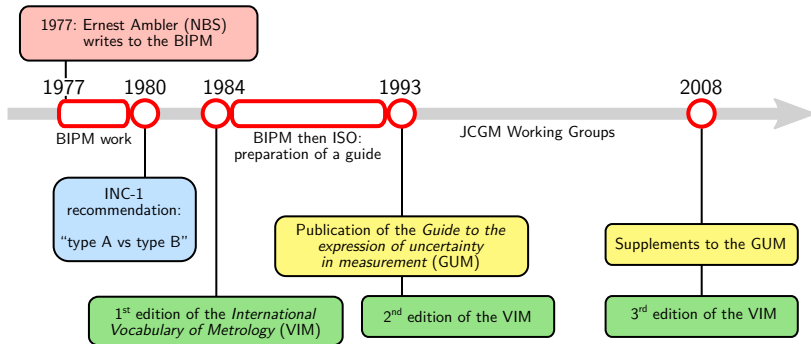
1977: Ernest Ambler (NBS)  
writes to the BIPM

# Systematic errors and a shift in the probabilistic approach 6

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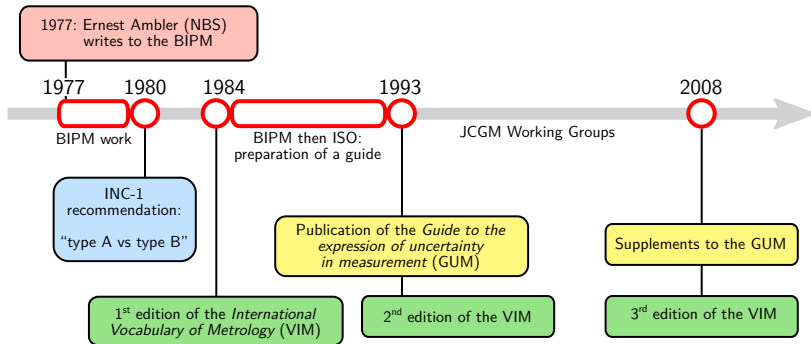


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**Cristallizes after the 70s around the interpretation of probabilities**

- type B methods imply **another interpretation of probabilities**
- underlies debate on frequentism vs Bayesianism in metrological statistics
- + some attempts to provide integrally Bayesian accounts of measurement uncertainty

**E.3.5** In the traditional terminology, the third term on the right-hand side of Equation (E.6) is called a “random” contribution to the estimated variance  $s^2(y)$  because it normally decreases as the number of observations  $n$  increases, while the first two terms are called “systematic” contributions because they do not depend on  $n$ .

Of more significance, in some traditional treatments of measurement uncertainty, Equation (E.6) is questioned because no distinction is made between uncertainties arising from systematic effects and those arising from random effects. In particular, combining variances obtained from a priori probability distributions with those obtained from frequency-based distributions is deprecated because the concept of probability is considered to be applicable **only to events that can be repeated** a large number of times under essentially the same conditions, with the probability  $p$  of an event ( $0 \leq p \leq 1$ ) **indicating the relative frequency with which the event will occur.**

In contrast to this frequency-based point of view of probability, an **equally valid viewpoint is that probability is a measure of the degree of belief that an event will occur** [13, 14]. For example, suppose one has a chance of winning a small sum of money  $D$  and one is a rational bettor. One's degree of belief in event  $A$  occurring is  $p = 0,5$  if one is indifferent to these two **betting choices**:

- 1) receiving  $D$  if event  $A$  occurs but nothing if it does not occur;
- 2) receiving  $D$  if event  $A$  does not occur but nothing if it does occur.

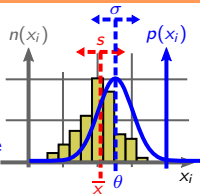
Recommendation INC-1 (1980) upon which this *Guide* rests implicitly adopts such a viewpoint of probability since it views expressions such as Equation (E.6) as the appropriate way to calculate the combined standard uncertainty of a result of a measurement



## Type A

Experimental data: sample  $\{x_1, \dots, x_n\}$

Random variable



Statistical inference  $(\bar{x}, s) \rightarrow (\theta, \sigma)$

**Standard uncertainty**  $u(X) = \sqrt{s^2/n}$

## Type B

$\neq$  frequentist model: no random process distribution **constructed** out of available info

Probabilistic model: **frequencies**

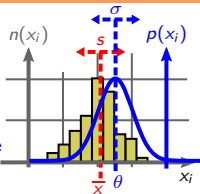
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 If information is:  $5.a < x < 6.a$   
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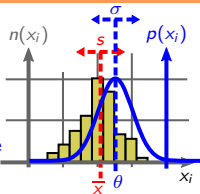
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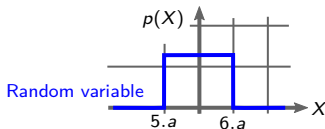
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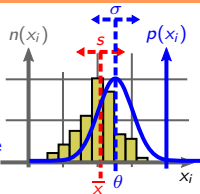


Std uncertainty  $\hat{=}$  std deviation  
 Here:  $u = a/\sqrt{12}$

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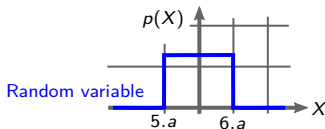
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The x-axis and y-axis are different!

- Probabilities are epistemic:  $p(X)$  is a **degree of belief/state of knowledge**
- About a constant parameter (the value of the measured quantity)

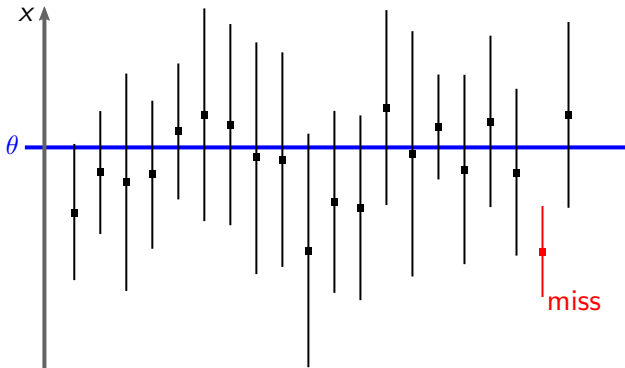
**Result expressed as interval  $[x - U(x); x + u(X)]$  with probability 95%**

→ *What is this probability?*

Frequentist confidence interval: refers to counterfactual situations

→ the interval *does or does not* contain the true value  $\theta$

→ There is no probability!



The confidence level  $p = 95\%$   
is the expected long-term success rate

Renewed success of Bayesian statistics: has triggered a reconsideration of the interpretation of measurement uncertainty

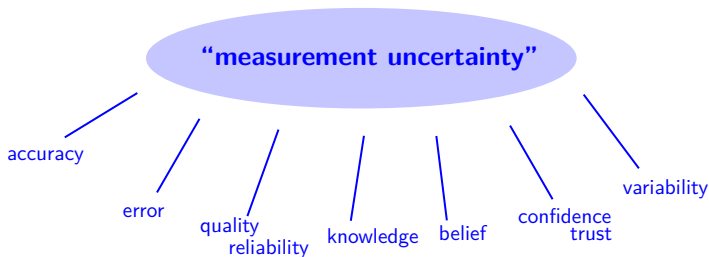
→ Emphasis put on the *subjectivity* of a measurement result

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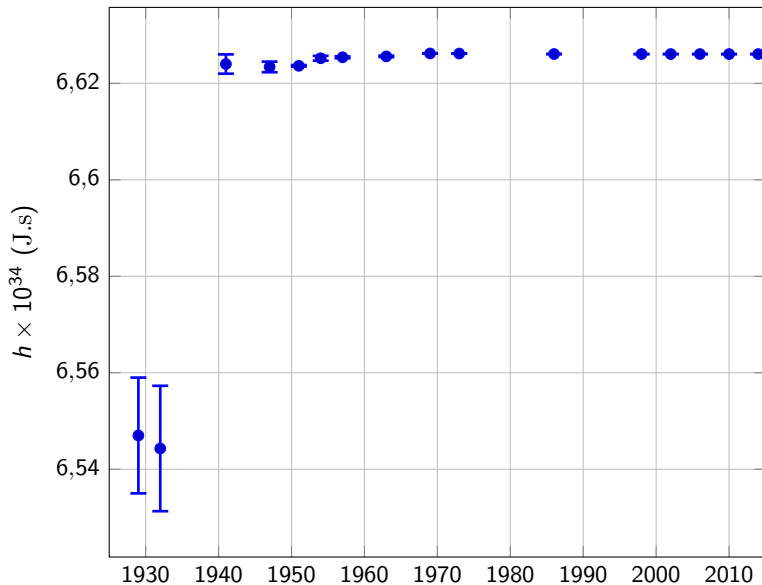
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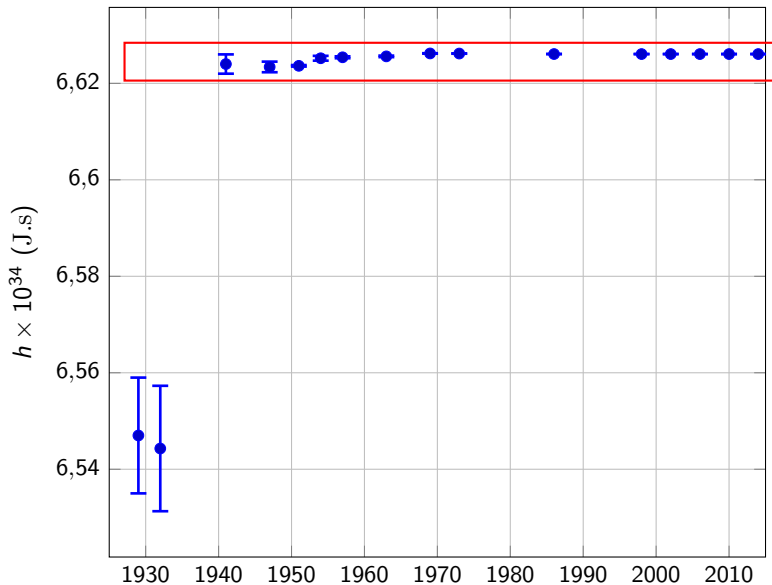
“Betting odds” (ex. Thomsen & Franken 1971)

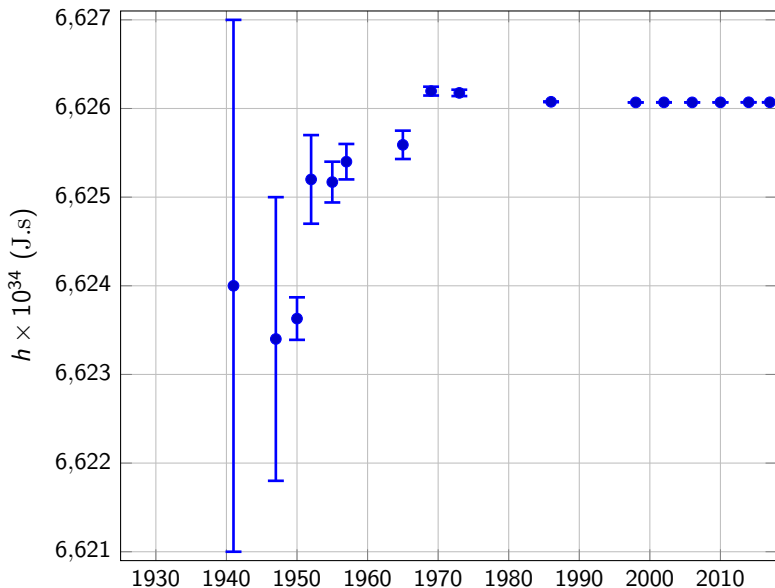
[...] the experimenter must recognize that he is quoting betting odds. Thus, if he states a result as  $(100 \pm 1)$  cm (probable error) he is asserting that there is a 50 percent probability that the true value lies between 99 cm and 101 cm. If he has formed his error estimate honestly, avoiding both overoptimism and undue conservatism, *he should be willing to take either side of the bet*. This is the essence of an honest error estimate.

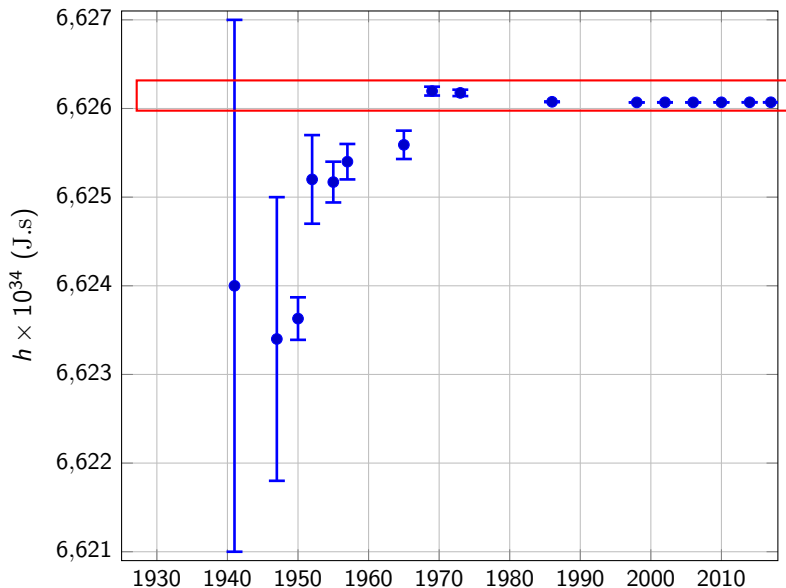
## 2– The adjustments of the fundamental physical constants

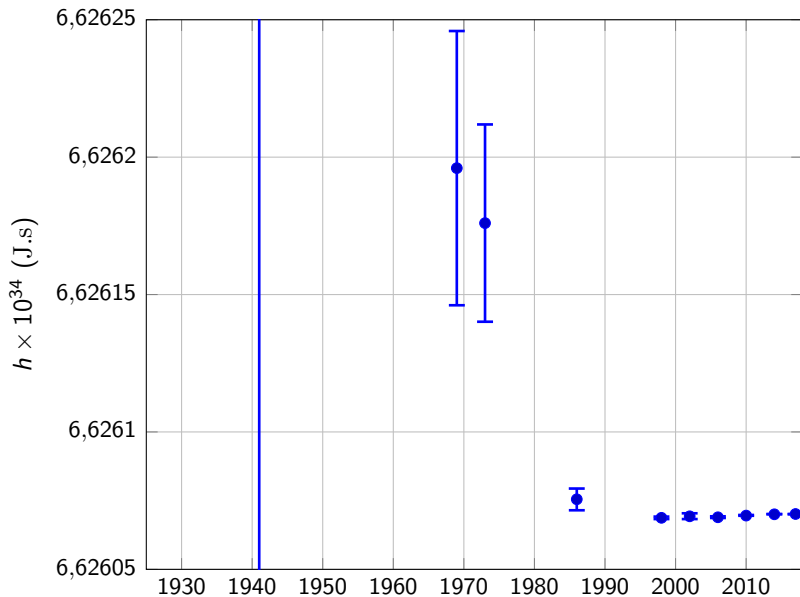


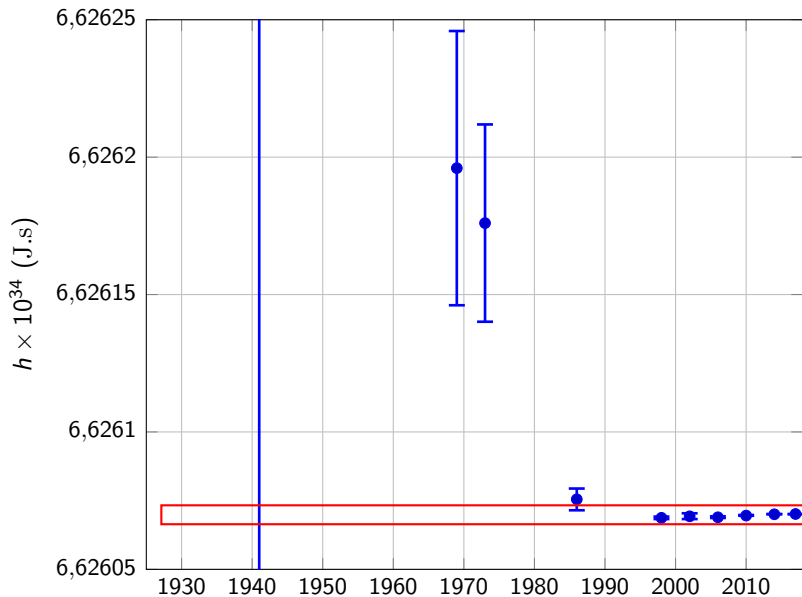


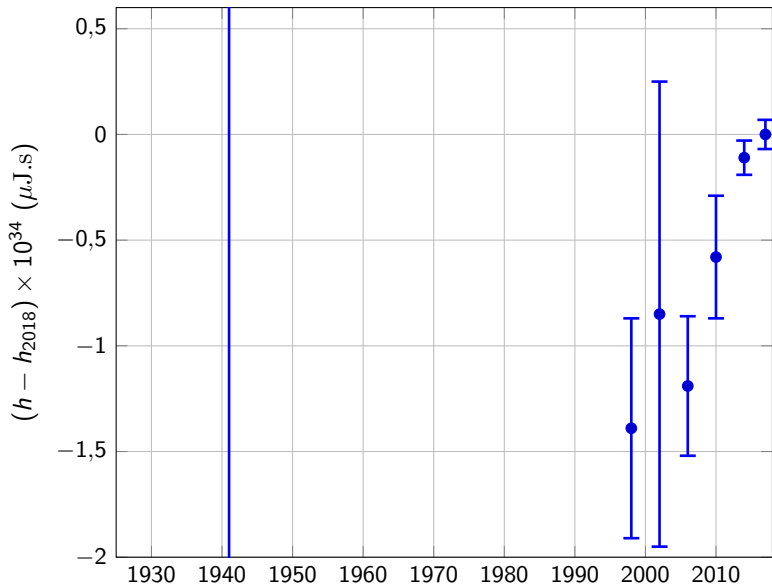












Repeated leaps across time

⇒ **why should we have any confidence in today's values?**



Repeated leaps across time

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Henrion & Fischhoff, *Assessing uncertainty in physical constants* (1986)

“examination of historical measurements and recommended values for the fundamental physical constants shows that the reported uncertainties have a consistent bias towards **underestimating** the actual errors. [...] the most common problem is **overconfidence**”

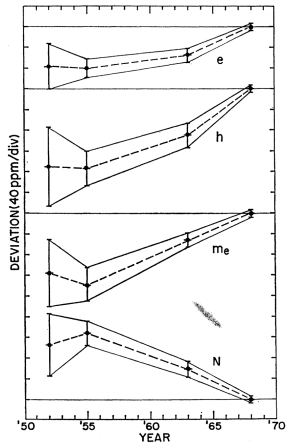
(*American Journal of Physics* **54** p.791)

→ **“surprise index”**: “the surprise index is the percent of 98% confidence intervals for which the true value is a ‘surprise.’”

**Precision Measurement and Fundamental Constants**  
**Proceedings of the International Conference**  
**held at the National Bureau of Standards**  
**Gaithersburg, Maryland, August 3-7, 1970**

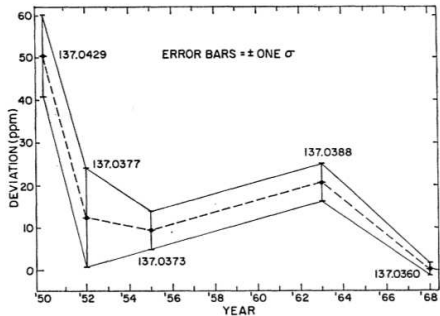
**PANEL DISCUSSION:**  
**SHOULD LEAST-SQUARES ADJUSTMENTS OF THE FUNDAMENTAL**  
**CONSTANTS BE ABOLISHED?**

## Taylor, Parker and Langenberg 1969



$e$ ,  $h$ ,  $m_e$  and  $N$

p.481



Fine-structure constant  $1/\alpha$

p.379

## Precision Measurement and Fundamental Constants

Proceedings of the International Conference  
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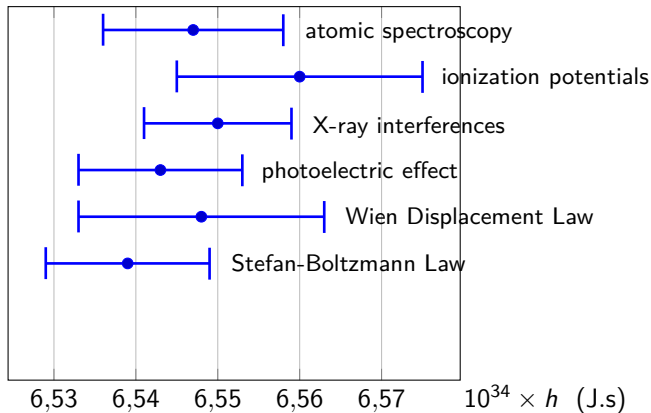
### PANEL DISCUSSION:

#### SHOULD LEAST-SQUARES ADJUSTMENTS OF THE FUNDAMENTAL CONSTANTS BE ABOLISHED?

- Are the adjusted values *safe*?
- *Should* they be safe/made safer?

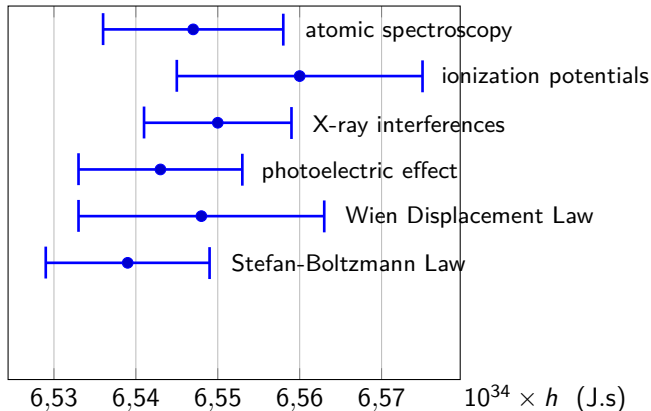
⇒ dilemma between *safety* and *precision*.

- **Safety**: uncertainties should not be underestimated / too optimistic
- **Précision**: results are not intended to be safe



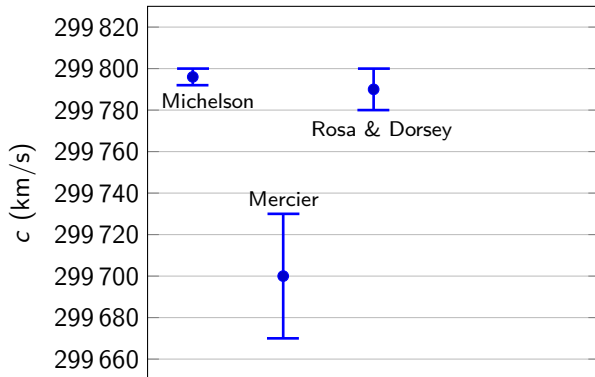
Raymond Thayer Birge (1887-1980)

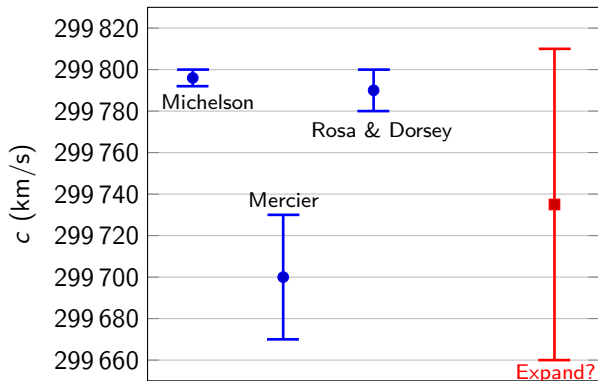
Probable values of the general physical constants  
 -- *Reviews of Modern Physics*, 1929, 1, 1-73



Values mutually consistent,

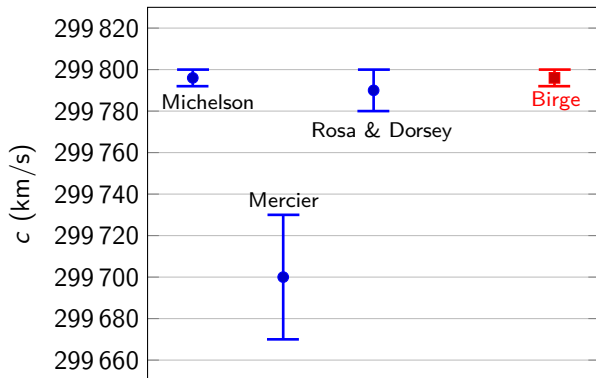
$$h_{\text{adj}} \propto \sum_{i=1}^6 \frac{h_i}{u_i^2}$$



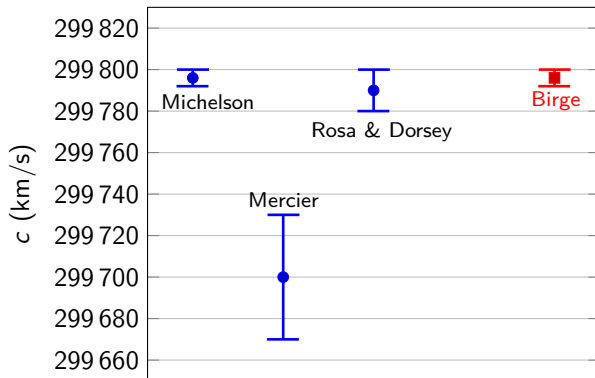


- Inconsistent values: expand the uncertainty?





- Inconsistent values: expand the uncertainty?
- Birge: chose to **select** Michelson's value → judgment



- Inconsistent values: expand the uncertainty?
- Birge: chose to **select** Michelson's value → judgment

The **filtering of the input data** has always been a topic of discussion throughout the history of the adjustments of the physical constants

## Peter Bender, 1970 conference, "Handling of Discrepant Data in Evaluations of the Fundamental Constants"

[Most users] would rather use values which are at least consistent with each other and which someone who has studied the problem carefully feels are as close as one can come to the **true ones** at the time of their adoption. [...] The major question is how to make the value and uncertainty that are chosen **as unbiased as possible**.

Up until now people doing evaluations have felt compelled to make crisp yes-or-no decisions on how to handle discrepancies, and no allowance has been made in the final uncertainties for the possibility that the **wrong choice** was made.

[A] fair estimate of the actual uncertainty in the result [is] the most important goal. To summarize, the basic desire is to find a way to **avoid having the quoted uncertainty in the results be systematically too small** because of throwing out data. (p.493-494)

## Taylor, 1970 conference, "Comments on Least-Squares Adjustments of the Constants"

True, it is worthwhile to have at any given epoch a consistent set of constants which can be used by all workers requiring them. But **this is the least important result** of a constants adjustment – the most valuable contribution of such studies to human knowledge is the **information gained during the course of the critical review** which necessarily accompanies the adjustment. (p.495)

The fact to keep in mind is that those scientists who really need to use the last decimal places **will not be content just to take numbers** out of a table but will go to the originating article. Those workers who are content to use the numbers as given without worrying about where they came from **could use almost any number**. (p.496)

Since the majority do not particularly care what numbers they use, adjustments should be geared to the small but more important minority who do and who need the **most useful and stimulating numbers** they can get their hands on. (p.497)

Our philosophy in the 1969 adjustment was to provide the best possible cutting tool for those workers who needed it most and who were prepared to use it in full knowledge that care was necessary to avoid cutting themselves. (p.497)

## Cohen & DuMond (1965)

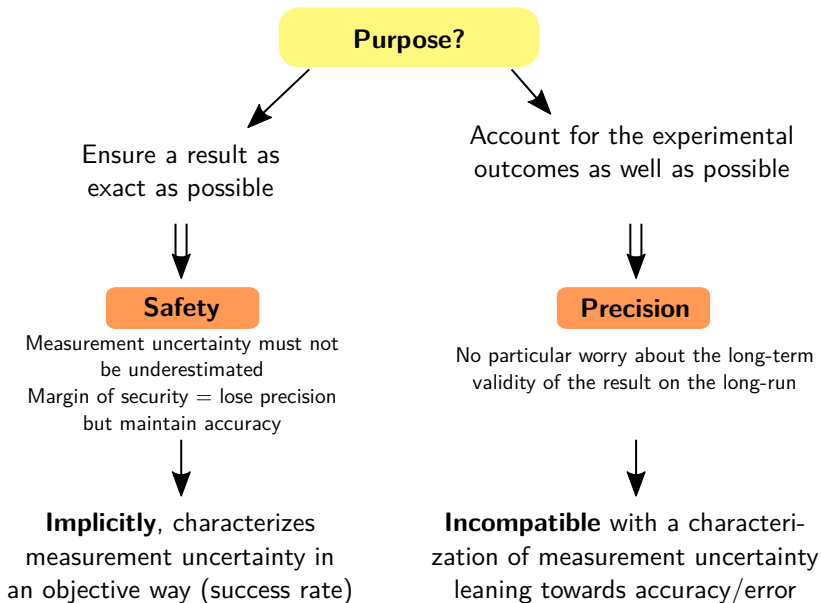
The idea that an overestimate of error “for safety” is somehow [...] laudable or virtuous [...] is somehow deplorably prevalent. We ask, for whom is such an overestimate “safe”? Certainly not for the general scientific community who wish to use the result. For them it is a **concealment of the true facts** regarding the results of the measurements.

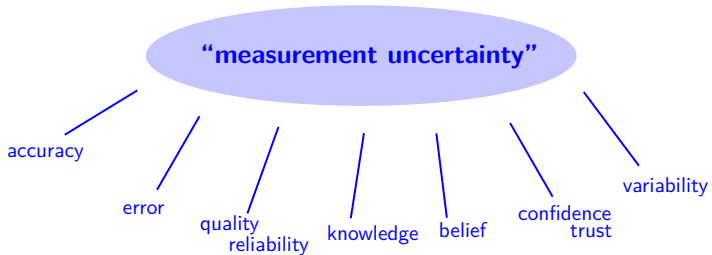
## Taylor (conférence 1970)

It is an admission of defeat [...] the only way out is to assume that all the data is bad. It therefore **throws away information** by making quantities more unknown than they actually are.

## Taylor, Parker & Langenberg (1969)

Measurements of the fundamental physical constants to ever greater levels of accuracy are important, not just because they “add another decimal point” and provide us with a more consistent set of constants to work with, but because they **may lead** to the discovery of a previously unknown inconsistency or the removal of a known inconsistency in our physical description of nature.





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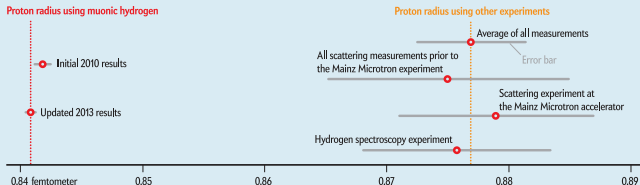
**Randolf Pohl** works on laser spectroscopy of hydrogen and hydrogenlike exotic atoms at the Max Planck Institute of Quantum Optics in Garching, Germany.



## RESULTS

# The Incompatible Measurements

The size of the proton should stay the same no matter how one measures it. Laboratories have deduced the proton radius from scattering experiments [see box on opposite page] and by measuring the energy levels of hydrogen atoms in spectroscopy experiments. These results were all consistent to within the experimental error. But in 2010 a measurement of the energy levels of so-called muonic hydrogen [see box on page 38] found a significantly lower proton radius. Attempts to explain the anomaly have so far failed.



SOURCE: MAX PLANCK INSTITUTE OF QUANTUM OPTICS



Thank you for your attention!