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"Probability is good sense reduced to a calculus"

(S. Laplace)

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- No collection of formulae.
- ▶ No collection of tests "with Russian names".
- ► Try to build up a consistent theory that can be used for a broad range of applications.
 - Avoid unneeded 'principles'... whose results will possibly be reobtained as approximations under well stated conditions.





"...today I'll learn to read,



"...today I'll learn to read, tomorrow to write,



"...today I'll learn to read, tomorrow to write, and the day after tomorrow I'll do arithmetic."



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"...today I'll learn to read, tomorrow to write, and the day after tomorrow I'll do arithmetic."

["Then, clever as I am,
I can earn a lot of money."]



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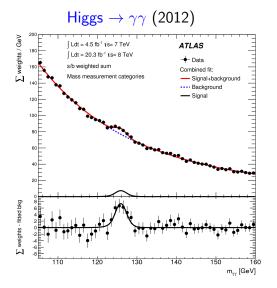
- ► No rush to get formulae
- → If you understand the basic reasoning you can derive many formulae by yourself'!





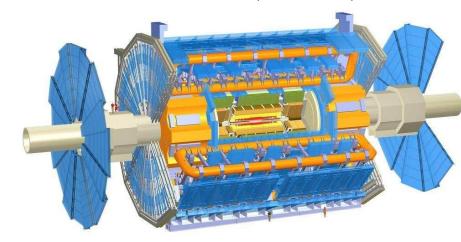




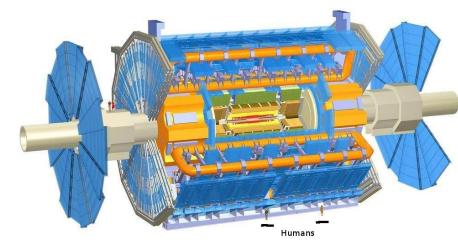


Two-photon invariant mass

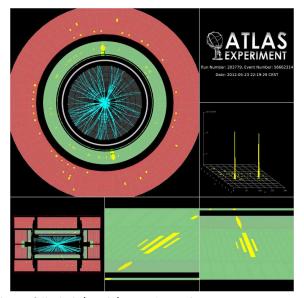
ATLAS Experiment at LHC (CERN, Geneva)



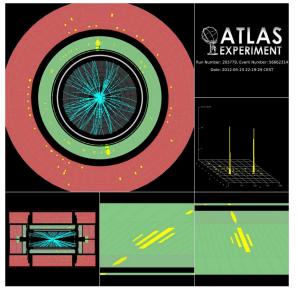
ATLAS Experiment at LHC [length: 46 m; Ø 25 m]



 $\approx 3000\,\text{km}$ cables

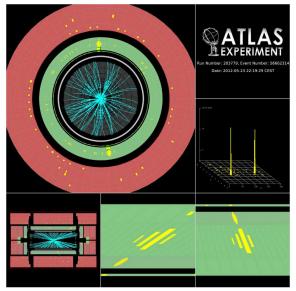


Two flashes of 'light' (2 γ 's) in a 'noisy' environment.



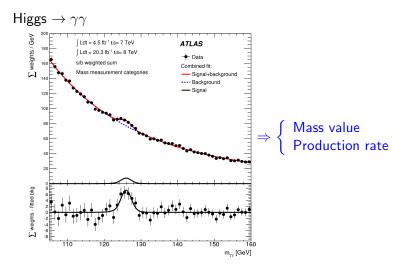
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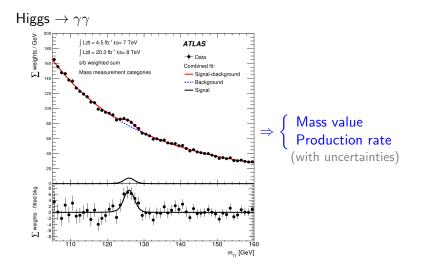
Higgs $\rightarrow \gamma \gamma$?

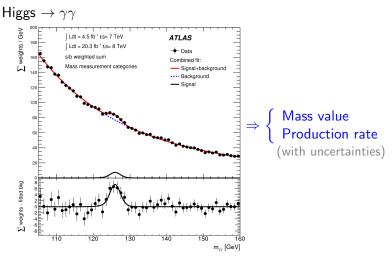


Two flashes of 'light' (2 γ 's) in a 'noisy' environment.

Higgs $\rightarrow \gamma \gamma$? Probably not...







Quite indirect measurements of something we do not "see"!

But, can we see our mass?



...or a voltage?



... or our blood pressure?



Certainly not!

Certainly not!

...although for some quantities we can have

a 'vivid impression' (in the David Hume's sense)

Measuring a mass on a scale



Equilibrium:

$$mg - k\Delta x = 0$$

 $\Delta x \rightarrow \theta \rightarrow \text{scale reading}$

(with 'g' gravitational acceleration; 'k' spring constant.)

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From the reading to the value of the mass:

scale reading
$$\xrightarrow{given \ g, \ k, \ "etc."} m$$

scale reading
$$given g, k, "etc." \dots$$
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scale reading
$$\xrightarrow{given \ g, \ k, \ "etc."} m$$

Dependence on 'g':
$$g \stackrel{?}{=} \frac{GM_{\odot}}{R_{\odot}^2}$$

- Position is usually <u>not</u> at "R_{\(\beta\)}" from the Earth center;
- Earth not spherical...
- ...not even ellipsoidal...
- ...and not even homogeneous.
- Moreover we have to consider centrifugal effects
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Certainly not to watch our weight But think about it!



scale reading $\xrightarrow{given \ g, \ k, \ "etc."}$ n

Dependence on k':

- temperature
- non linearity

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▶ left to your imagination...

scale reading
$$\xrightarrow{given \ g, \ k, \ "etc."...} m$$
Dependence on 'k':

- temperature
 - non linearity
 - **•** . . .

$\Delta x \rightarrow \theta \rightarrow \text{scale reading:}$

- ▶ left to your imagination...
- + randomic effects:
 - stopping position of damped oscillation;
 - variability of all quantities of influence (in the ISO-GUM sense);
 - reading of analog scale.

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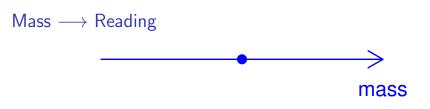
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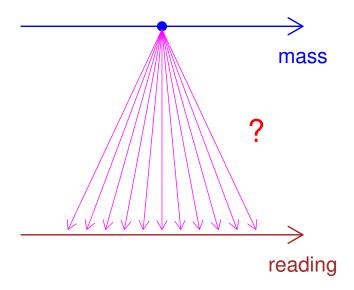
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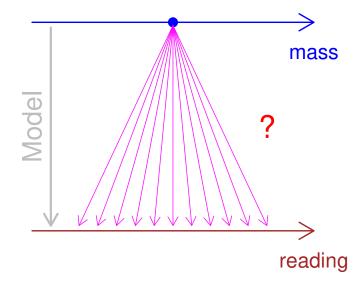




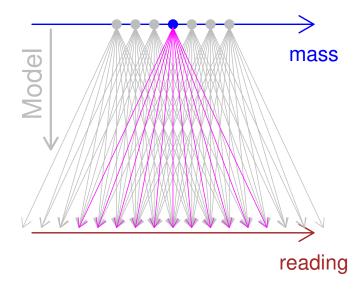
$\mathsf{Mass} \longrightarrow \mathsf{Reading}$



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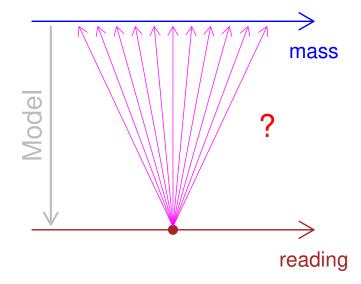






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$\mathsf{Reading} \longrightarrow \text{`true' mass}$



1 incomplete definition of the measurand

 \rightarrow g \rightarrow where? \rightarrow inertial effects subtracted?

1 incomplete definition of the measurand

```
→ g

→where?

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2 imperfect realization of the definition of the measurand

- 1 incomplete definition of the measurand
 - → g →where? →inertial effects subtracted?
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- 5 personal bias in reading analogue instruments;

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Note

- Sources not necessarily independent
- ▶ In particular, sources 1-9 may contribute to 10 (e.g. not-monitored electric fluctuations)

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- "In some areas of metrology the term "resolution" is used. This is understood to mean the small change in the value of the measurand which is necessary to produce a perceptible (often specified) small change in the response (in the case of measuring instruments with scale indication, for example, 1/5 of the scale interval)". (DIN 1319, part 2, 9)

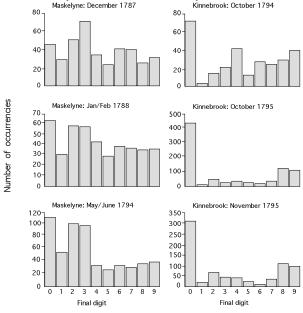
"In un formato per osservatore umano l'incertezza di lettura dipende dalle caratteristiche costruttive della scala e dell'indice, dalle modalità d'osservazione, dal rumore eventuale e dall'abilità dell'osservatore. Per esempio se si ammette che un osservatore di normale abilità, leggendo lo strumento nella posizione appropriata, possa stimare 1/5 di divisione, si indicherà come incertezza di lettura ±0.1 divisioni." (UNI 4546, 5.5)

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- ► Just try!
 No dogmatism!

An historical case (Nevil Maskelyne)



Half of the scale distance?

► It is not the reading error

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More on "Errori e incertezze di misura – rassegna critica e proposte per l'insegnamento"

⇒ http://www.roma1.infn.it/~dagos/teaching.html

An app to check you ability

⇒ ErroriLettura.apk on the course web site



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Error and uncertainty are not synonyms!

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These cases have not to be seen as "the exception that confirms the rule" [in physics exceptions falsify laws!], but as symptoms of something flawed in the reasoning, that could seriously effects also results that are not as self-evidently paradoxical as in these cases!

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The modern *fashion*: add them quadratically if they are considered to be independent, or build a covariance matrix of statistical and systematic contributions in the general case.

In my opinion, simply the reluctance to combine linearly 10, 20 or more contributions to a global uncertainty, as the (out of fashion) 'theory' of maximum bounds would require.

- \rightarrow Right in most cases!
- → Good sense of physicists ⇔ cultural background

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- 2 And many explain (also to students!) that "this means that, if I repeat the experiment a great number of times, then I will find that in roughly 68% of the cases the observed average will be in the interval $[\overline{x} \sigma/\sqrt{n}, \ \overline{x} + \sigma/\sqrt{n}]$."

A simple case

n independent measurements of the same quantity μ (with n large enough and no systematic effects, to avoid, for the moment, extra complications).

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Objections?

$$\begin{array}{l} 1 \ \ P(\overline{x}-\frac{\sigma}{\sqrt{n}}\leq\mu\leq\overline{x}+\frac{\sigma}{\sqrt{n}})=68\% \\ \text{OK to me, and perhaps no objections by many of you} \end{array}$$

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- ▶ If probability is the "limit of the frequency", this statement is meaningless, because the 'frequency based' probability theory only speak about

$$P(\mu - \frac{\sigma}{\sqrt{n}} \le \overline{X} \le \mu + \frac{\sigma}{\sqrt{n}}) = 68\%,$$

(that is a probabilistic statement about \overline{X} : probabilistic statements about μ are not allowed by the theory).

2 "if I repeat the experiment a great number of times, then I will find that in roughly 68% of the cases the observed average will be in the interval $\left[\overline{x} - \sigma/\sqrt{n}, \ \overline{x} + \sigma/\sqrt{n}\right]$."

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 - $\rightarrow P(\overline{x} \sigma/\sqrt{n} \leq \overline{x}_f \leq \overline{x} + \sigma/\sqrt{n}) = 52\%,$ where \overline{x}_f stands for future averages;

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 - 'in terms of performance' → 'very strange' that no quantities show in 'other side' of a 95% C.L. bound!
 - Not suited to express our confidence! Simply because it was not invented for that purpose!

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"that technological and commercial apparatus which is known as an acceptance procedure"

(Fisher, referring to Neyman's statistical confidence method)

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⇒ How much you are confident that the value of your quantity of interest is in a given interval. We do not play a lottery!

Arbitrary probability inversions

How do we turn, just 'intuitively'

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We can paraphrase as

"the dog and the hunter"

We know that a dog has a 50% probability of being 100 m from the hunter

⇒ if we observe the dog, what can we say about the hunter?

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Intuitive and reasonable answer:

"The hunter is, with 50% probability, within 100 m of the position of the dog."

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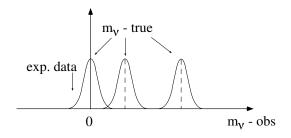
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Easy to understand that this conclusion is based on some tacit assumptions:

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- ▶ the dog has no preferred direction of arrival at the point where we observe him.
- \rightarrow not always valid!

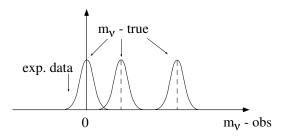
Measurement at the edge of a physical region

Electron-neutrino experiment, mass resolution $\sigma=2\,\mathrm{eV}$, independent of m_{ν} .



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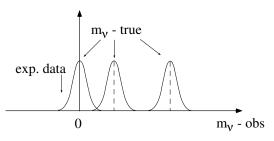
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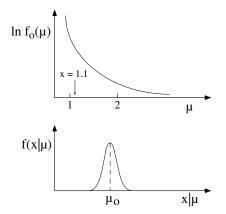
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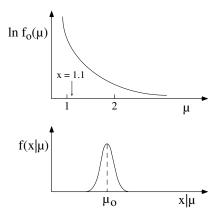
Observation: $-4 \, \text{eV}$. What can we tell about m_{ν} ? $m_{\nu} = -4 \pm 2 \, \text{eV}$? $P(-6 \le m_{\nu}/\text{eV} \le -2) = 68\%$? $P(m_{\nu} \le 0 \, \text{eV}) = 98\%$?

Imagine a cosmic ray particle or a bremsstrahlung $\gamma.$



Observed x = 1.1.

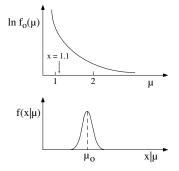
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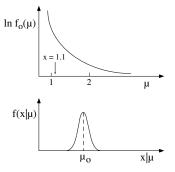
What can we say about the true value μ that **has caused** this observation?

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Also in this case the formal definition of the confidence interval does not work.

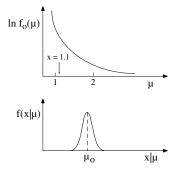
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In the jargon of the experimentalists, "there are more migrations from left to right than from right to left".

Asymmetric detector response

These two examples deviate from the dog-hunter picture only because of an asymmetric possible position of the 'hunter', i.e our expectation about μ is not uniform.

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Summing up:

the intuitive inversion of probability

$$P(\ldots \leq \overline{X} \leq \ldots) \Longrightarrow P(\ldots \leq \mu \leq \ldots),$$

besides being theoretically unjustifiable in the frequestist approach to probability, yields results which are numerically correct only in the case of symmetric problems.

Summary about standard methods

Situation is not satisfactory in the critical situations that often occur in HEP, both in

- hypotheses tests
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Moreover there are issues not easy to treat in that frame [and I smile at the heroic effort to get some result :-)]

- systematic errors
- background

Implicit assumptions

We have seen clearly what are the hidden assumptions in the 'naive probability inversion' (that corresponds more or less to the prescriptions to build confidence intervals).

We shall see that, similarly, there are hidden assumptions behind the naive probabilistic inversions.

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Curiously enough, these methods are advertised as objective because they do not need as input our scientific expectations of where the value of the quantity might lie, or of which physical hypothesis seems more reasonable!

But if we are convinced (by logic, or by the fact that neglecting that knowledge paradoxical results can be achieved) that prior expectation is relevant in inferences, we cannot accept methods which systematically neglect it and that, for that reason, solve problems different from those we are interested in!

The End