

# Statistical Methods in Particle Physics / WS 13

## Lecture I

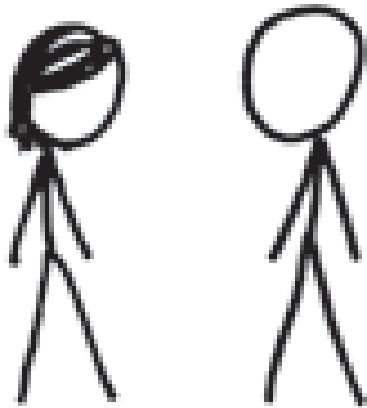
# Probability Theory

Niklaus Berger

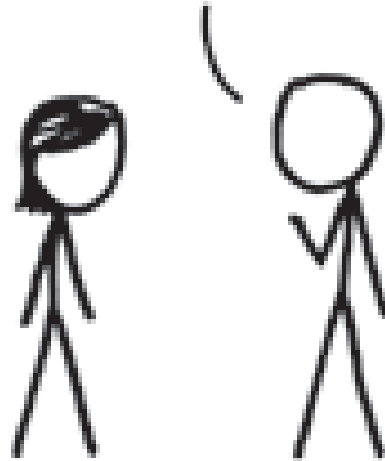
Physics Institute, University of Heidelberg



I USED TO THINK  
CORRELATION IMPLIED  
CAUSATION.

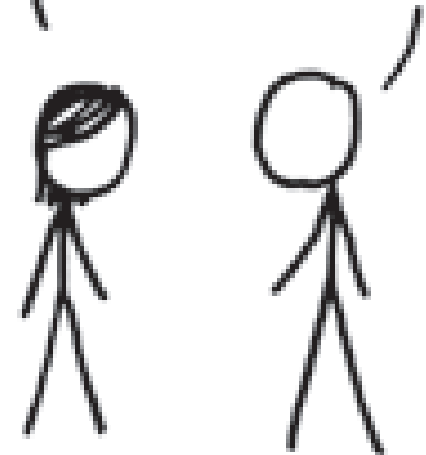


THEN I TOOK A  
STATISTICS CLASS.  
NOW I DON'T.



SOUNDS LIKE THE  
CLASS HELPED.

WELL, MAYBE.



# Aims of the course

- Understand Statistical Concepts  
Ability to read analysis papers

# Read an analysis paper...

Acceptances and efficiencies are obtained mostly from full simulations of the ATLAS detector [81] using GEANT4 [82]. These simulations include a realistic modelling of the pile-up conditions observed in the data.

For the 7 TeV data, this information is combined in a neural network, tuned to achieve a similar jet rejection as the cut-based selection described in Ref. [95], but with higher photon efficiency.

Exclusion limits are based on the  $CL_s$  prescription [123]; a value of  $\mu$  is regarded as excluded at 95% CL when  $CL_s$  is less than 5%. A SM Higgs boson with mass  $m_H$  is considered excluded at 95% confidence level (CL) when  $\mu = 1$  is excluded at that mass.

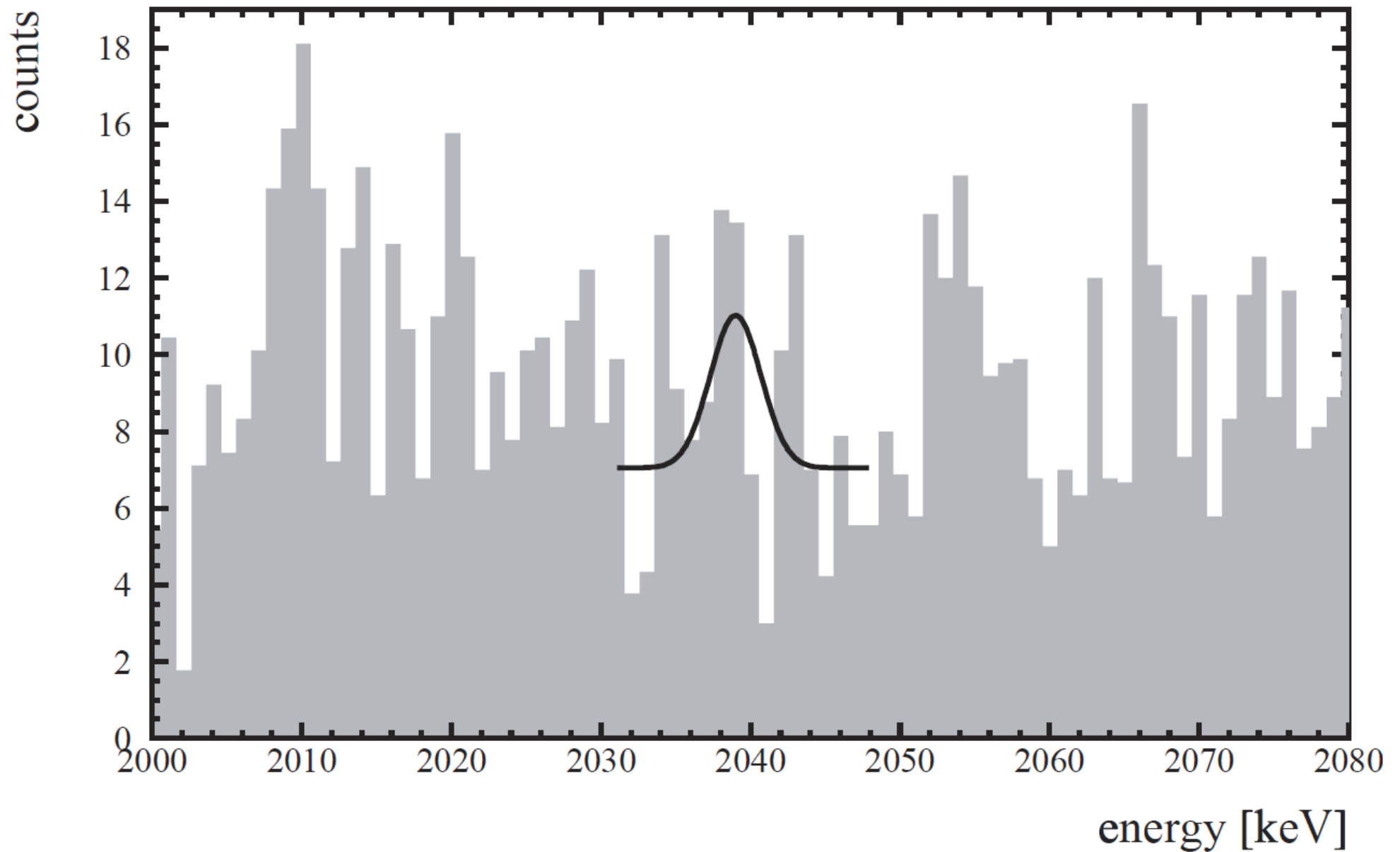
The uncertainty on the electron energy scale results in an uncertainty of  $\pm 0.7\%$  ( $\pm 0.5\%/\pm 0.2\%$ ) on the mass scale of the  $m_{4\ell}$  distribution for the  $4e$  ( $2e2\mu/2\mu2e$ ) channel.

The parameter of interest is the global signal strength factor  $\mu$ , which acts as a scale factor on the total number of events predicted by the Standard Model for the Higgs boson signal. This factor is defined such that  $\mu = 0$  corresponds to the background-only hypothesis and  $\mu = 1$  corresponds to the SM Higgs boson signal in addition to the background. Hypothesised values of  $\mu$  are tested with a statistic  $\lambda(\mu)$  based on the profile likelihood ratio [122]. This test statistic extracts the information on the signal strength from a full likelihood fit to the data. The likelihood function includes all the parameters that describe the systematic uncertainties and their correlations.

# Aims of the course

- Understand Statistical Concepts  
Ability to read analysis papers
- Develop Intuition  
Do I believe a statistical claim?

# Do you believe a statistical claim



# Aims of the course

- Understand Statistical Concepts  
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- Develop Intuition  
Do I believe a statistical claim?
- Know Methods  
Your statistical toolbox

# Your statistical toolbox



Photo: David I Poole



# Aims of the course

- Understand Statistical Concepts

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Do I believe a statistical claim?

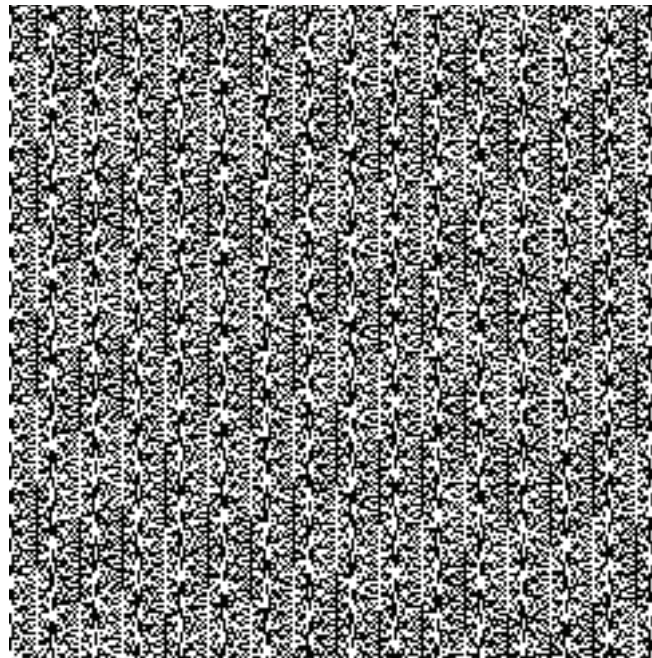
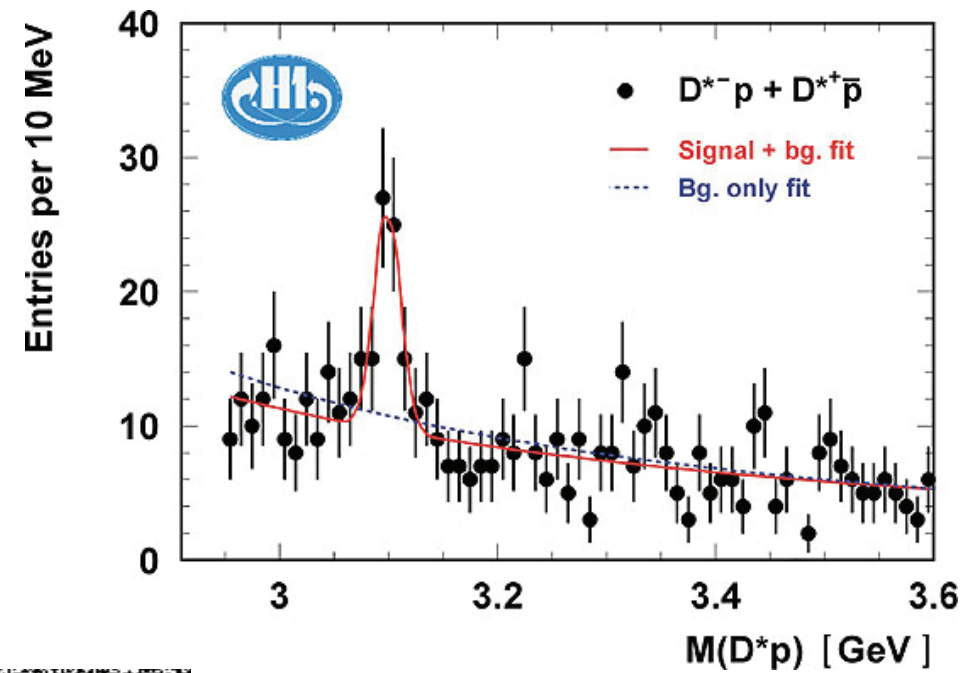
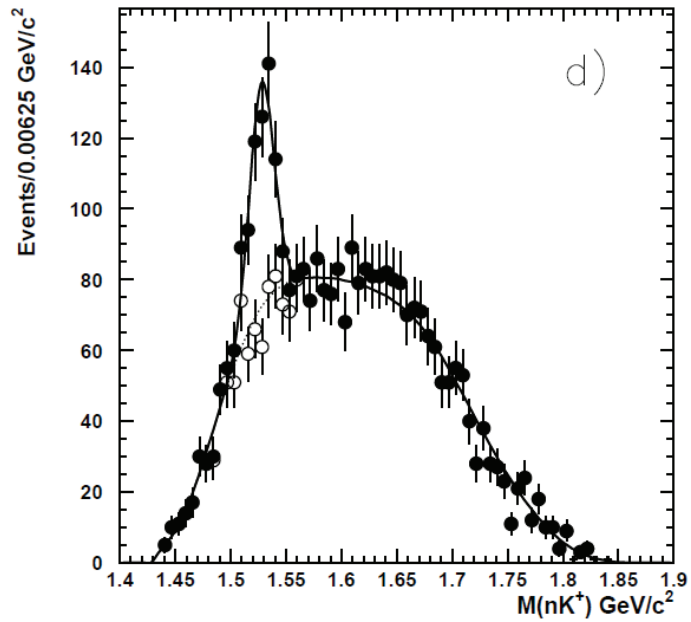
- Know Methods

Your statistical toolbox

- Know Pitfalls

Avoid mistakes already made by others

# Avoid Mistakes Made by Others



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Your statistical toolbox

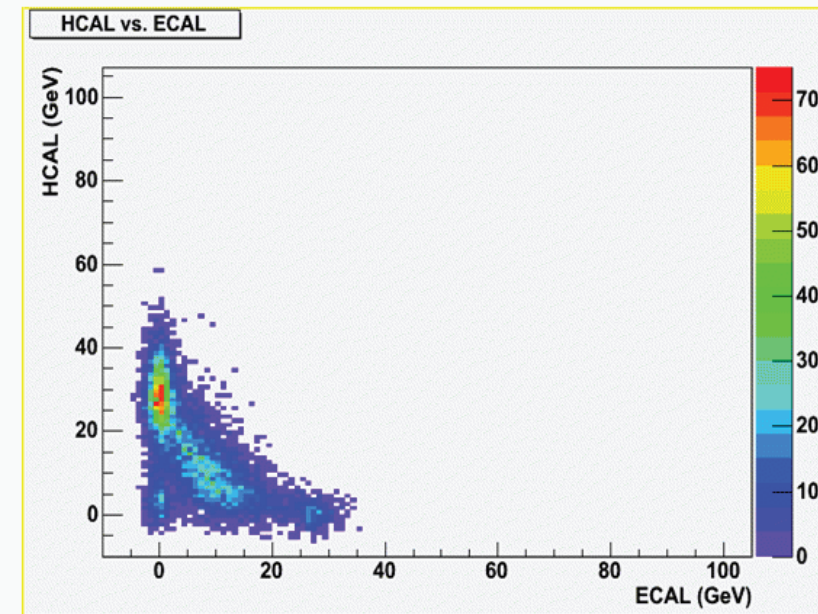
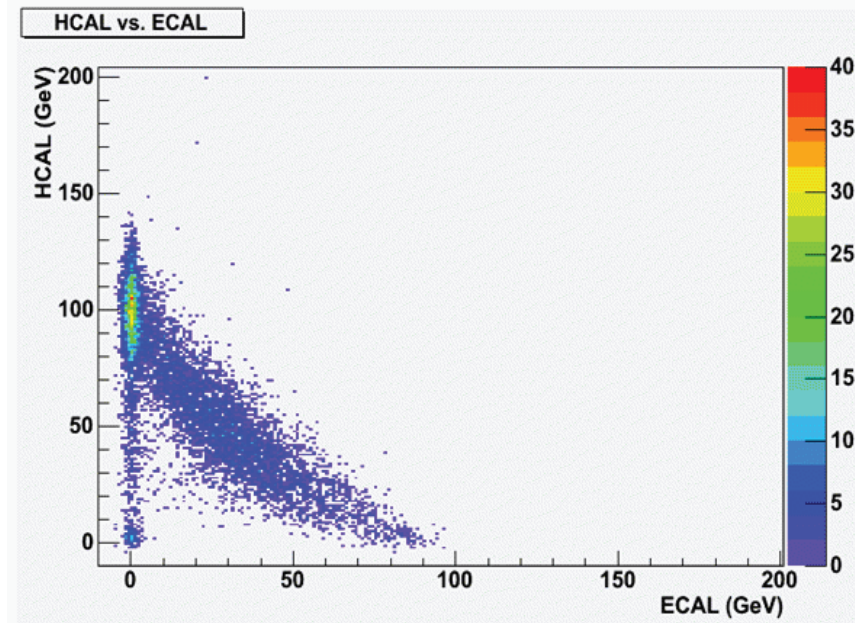
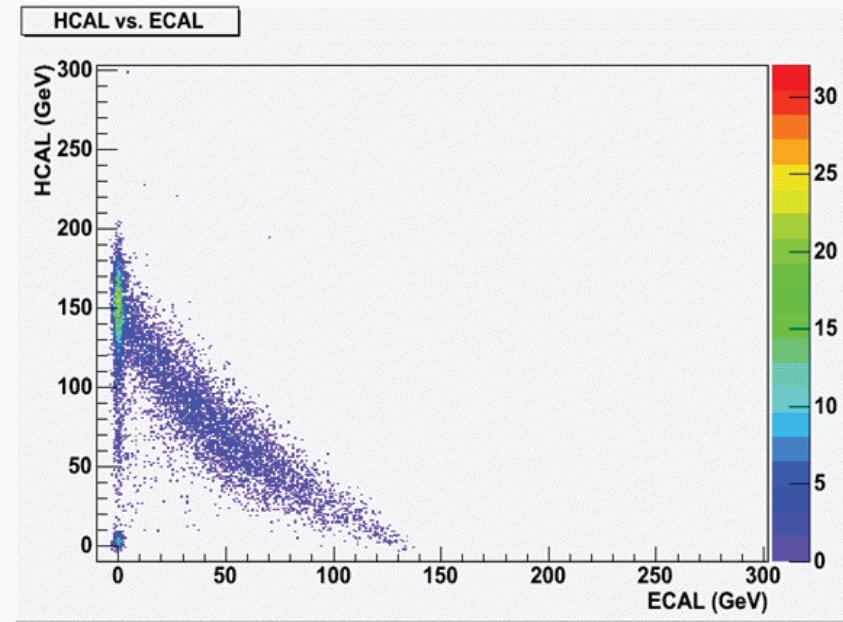
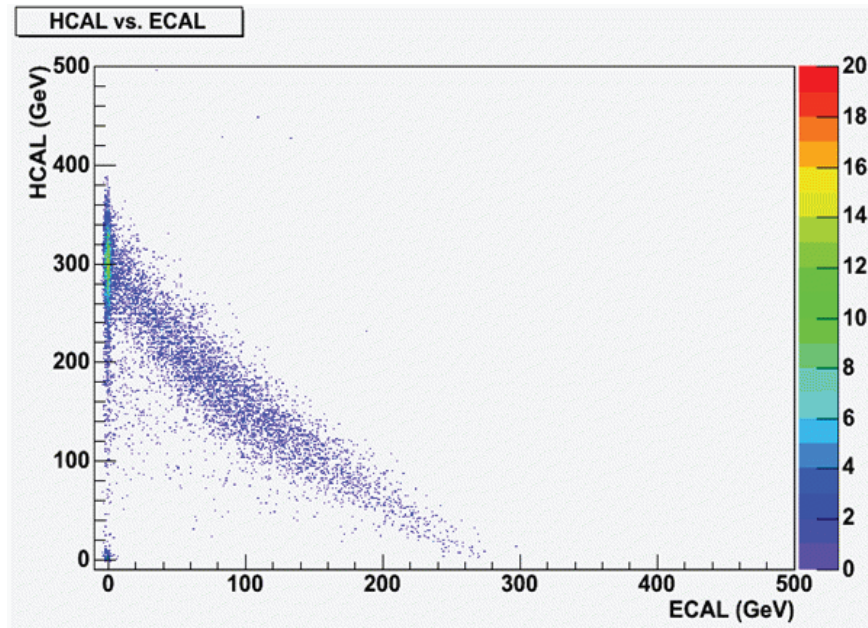
- Know Pitfalls

Avoid mistakes already made by others

- Use Tools

Learn to use root

# Learn to use root



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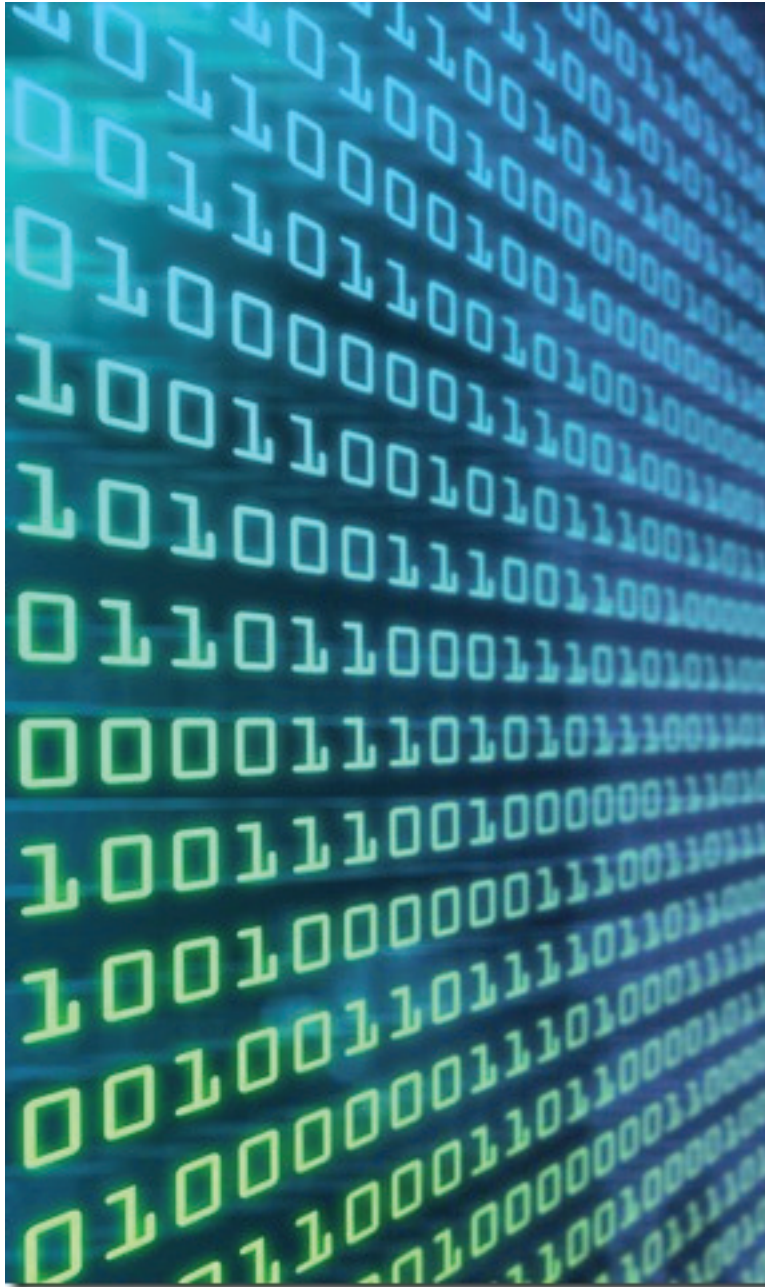
- Use Tools

Learn to use root

- Practice

Get ready for your own data analysis

# This is an applied course!



- We will use lots of examples from “real life” particle physics
- We will sometimes talk about implementation on a computer
- You should ask questions, discuss
- You will write lots of code

# Practicalities

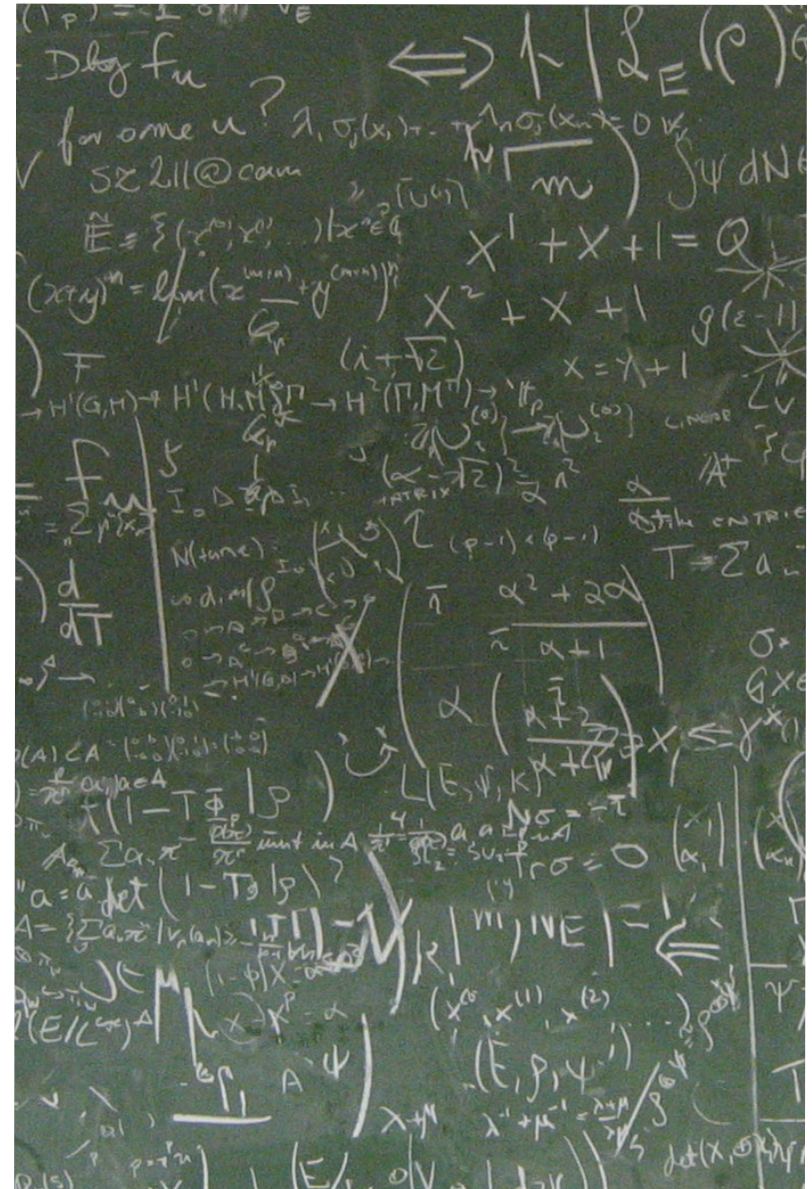
- No exam, no marks
- Tutorials are an integral part
- You get your credit points for coding
- Details from Oleg

# Material

- There is a course website:

<http://www.physi.uni-heidelberg.de/~nberger/teaching/ws13/statistics/statistics.php>

- You will get the slides
- When I use the blackboard, you should take notes...
- There are a few good books out there





# Literature

- Lyons:  
Statistics for Nuclear and Particle Physicists  
(Cambridge University Press)
- Cowan:  
Statistical Data Analysis  
(Oxford Science Publications)
- Barlow:  
Statistics: A Guide to the Use of Statistical Methods in the Physical Sciences  
(Manchester Physics Series)
- Blobel, Lohrmann:  
Statistische Methoden der Datenanalyse  
(Teubner, in German)  
Ebook: <http://www.desy.de/~blobel/eBuch.pdf>

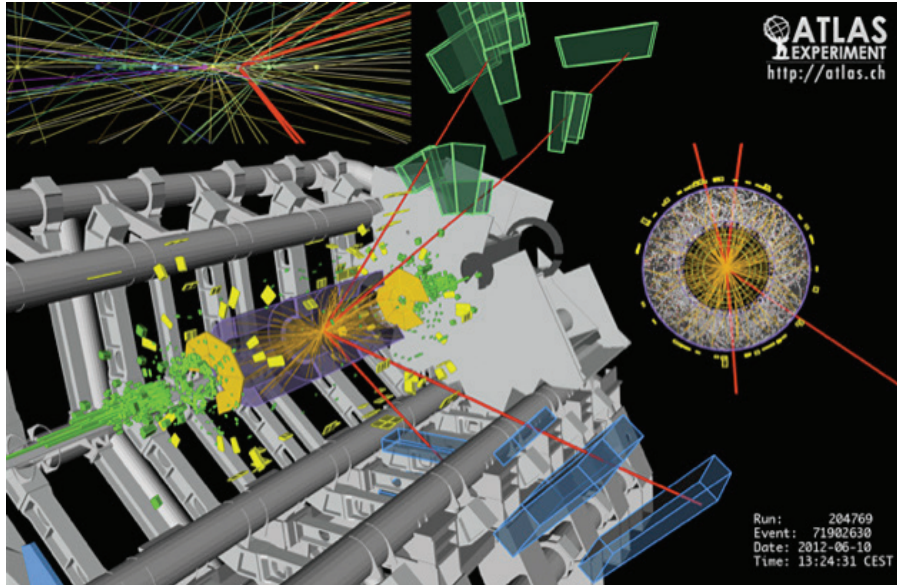
# Curriculum

- Probability theory
- Probability density functions and their properties
- Error propagation, correlations
- Monte Carlo techniques
- Estimators
- Fitting:
  - Least Squares
  - Maximum Likelihood
- Confidence intervals and limits
- Multivariate methods
- Unfolding

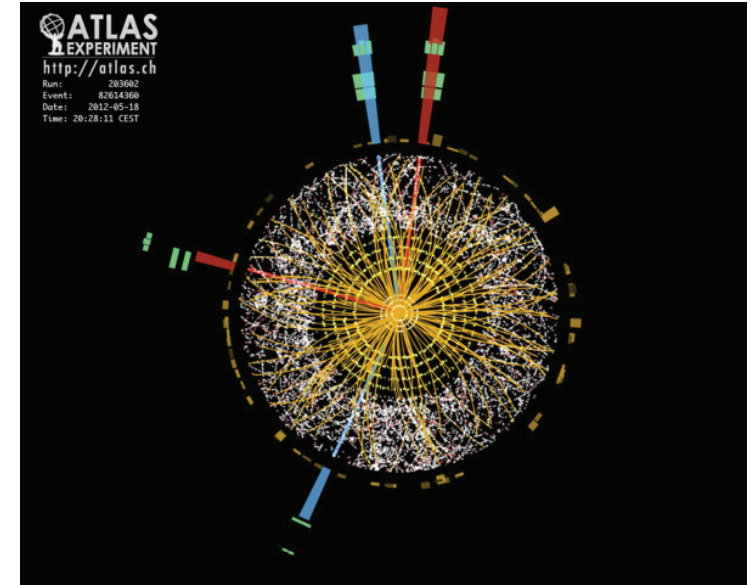
## Recurring topics:

- Bayesian vs. Frequentist interpretation
- Examples from our work
- Examples from your work
- Discussion of numerical implementations and programming techniques
- The role of the physicists judgement

# Statistics in Particle Physics

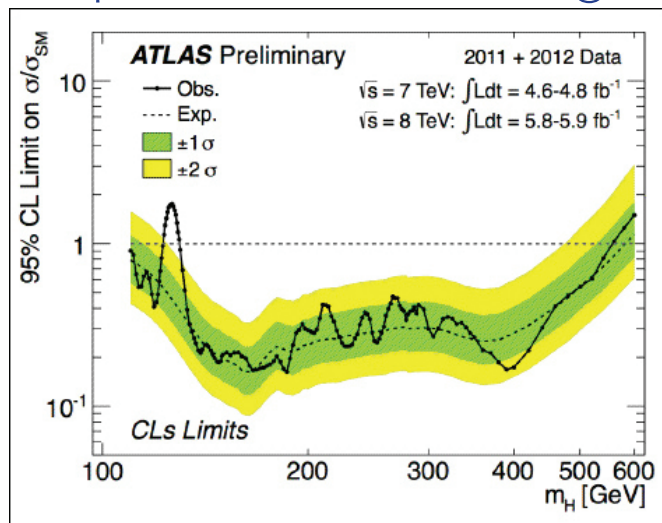


Detector modelling (Monte Carlo methods)

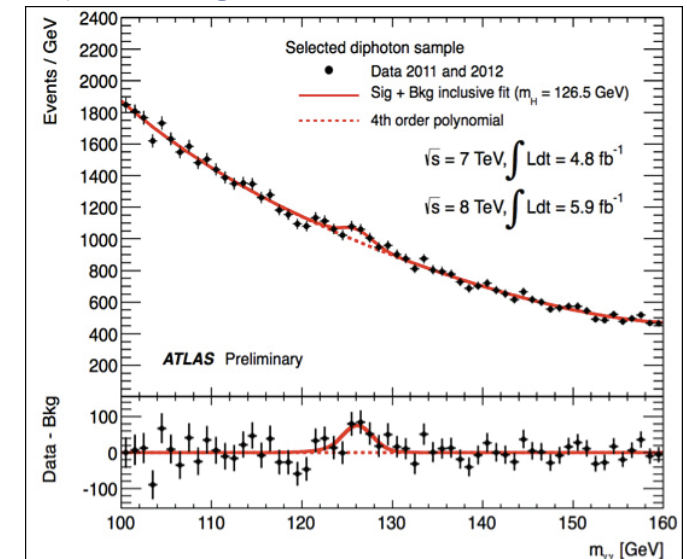


Event reconstruction (e.g. track fitting)

Interpretation of results (e.g. limits)



Data analysis (e.g. event classification)

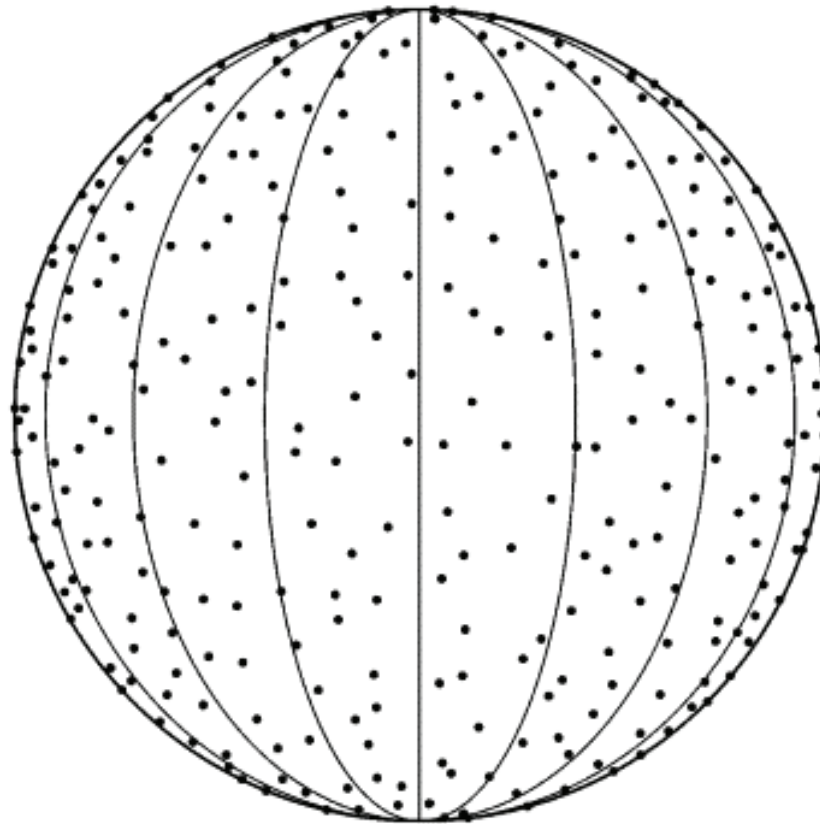


Part I:

# Probability Theory

# The Borel-Kolmogorov Paradox

- Distribute points equally over a sphere
- Points on the equator will also be equidistributed
- Points on any great circle, e.g. a meridian will be equidistributed



# The Borel-Kolmogorov Paradox

- Distribute points equally over a sphere (Earth)
- Points on the equator will also be equidistributed
- Points on any great circle, e.g. a meridian will be equidistributed
  
- A quarter of every meridian lies north of  $45^\circ$  N
- Integrate over all meridians: A quarter of all points lie north of  $45^\circ$  N, points are equidistributed, thus a quarter of the earth's surface lies north of  $45^\circ$  N

Contradiction?

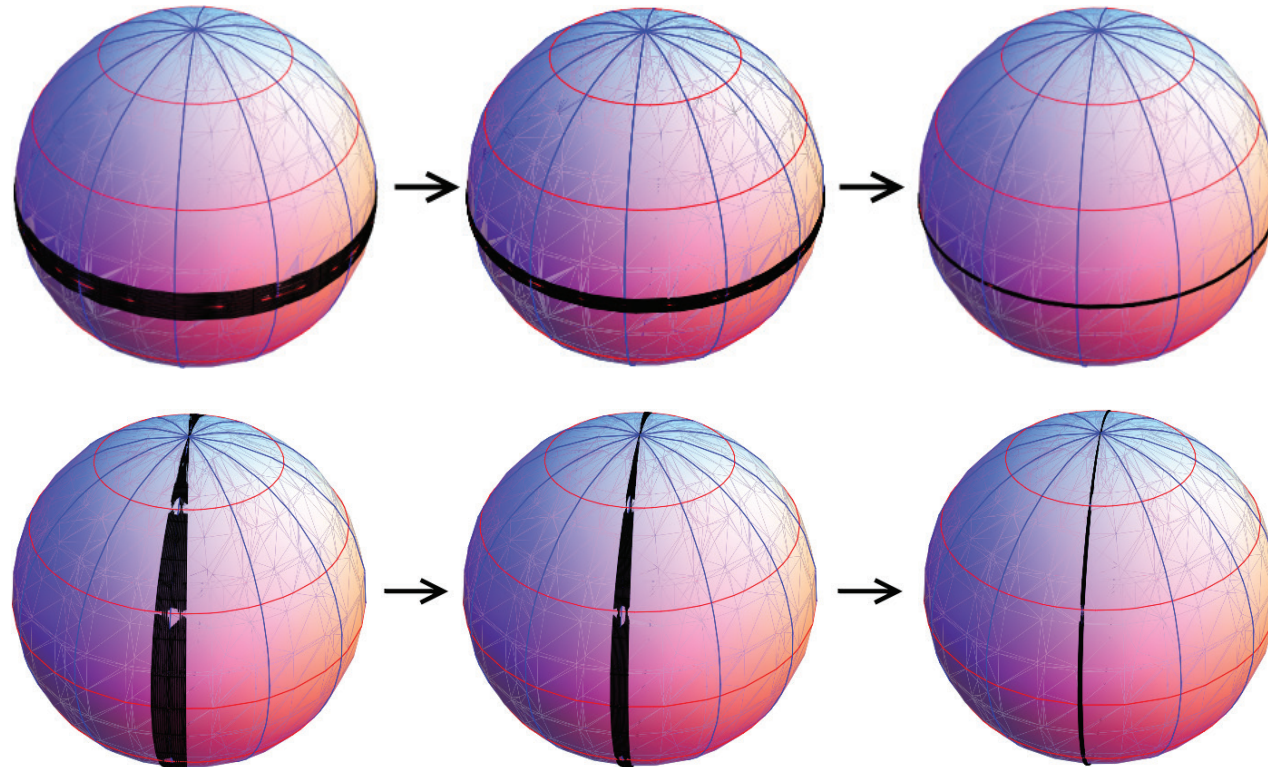
# The Borel-Kolmogorov Paradox

Where did this go wrong?

# The Borel-Kolmogorov Paradox

Where did this go wrong?

- It is not allowed to condition conditional probabilities on a set of probability zero
- Instead take finite surface and the proper limit



Images Greg Gandenberger