

Teilchenphysik 2 — W/Z/Higgs an Collidern

Sommersemester 2019

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Imagine you are walking along the road but you get tired and consider hitchhiking. There are on average four cars per hour going in your direction. The chance that a car would stop and give you a lift is 5%.

- a) What is the probability that at least one car appears during the next hour?
- b) Assume that four cars appear. What is the probability that you get a lift?

Exercise 1 — Solution



a) The appearance of cars can be assumed to be Poisson distributed with an average rate of $\lambda = 4$ cars per hour (counting experiment in intervals of hours). Then, the probability of at least one car is

$$P(x \ge 1; \lambda = 4) = 1 - P(x = 0; \lambda = 4) \approx 1 - 0.02 = 0.98$$

b) Here we are interested in the probability of $k \ge 1$ successes out of n = 4 trials if the success probability is p = 0.05 at each trial. This can be computed using Binomial statistics as

$$P(k \ge 1; n = 4, p = 0.05) = 1 - P(k = 0; n = 4, p = 0.05)$$
$$= 1 - {\binom{n}{k}} \cdot p^k \cdot (1 - p)^{n - k}$$
$$= 1 - 1 \cdot 1 \cdot 0.95^4 \approx 0.19$$

Important Probability Density Functions



- $\circ~$ Statistical processes underlying the data are generally assumed to follow a probability density function (pdf) ${\cal P}$
 - Binomial:

$$\mathcal{P}(k; p, N) = \frac{n!}{(n-k)!k!}p^k(1-p)^{N-k}$$

e.g. drawing *N* times with fixed success probability



Important Probability Density Functions



 $\circ~$ Statistical processes underlying the data are generally assumed to follow a probability density function (pdf) ${\cal P}$

• Poisson:

$$\mathcal{P}(\mathbf{x};\lambda) = \frac{\lambda^{\mathbf{x}}}{\mathbf{x}!} \mathbf{e}^{-\lambda}$$

e.g. counting experiments (like cross-section measurements)

• Gaussian:

$$\mathcal{P}(\mathbf{x}; \boldsymbol{\mu}, \sigma) = \frac{1}{\sqrt{2\pi\sigma}} \mathrm{e}^{-\frac{1}{2} \left(\frac{\mathbf{x}-\boldsymbol{\mu}}{\sigma}\right)^2}$$

e.g. parameter estimates (like mass measurements)



NB: both are in fact limits of the Binomial distribution for a large number of tries

















Probability density function f(x)

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Probability density function f(x)

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Probability density function f(x)

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Probability density function f(x)

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Exercise 2



You are searching for events from a new-physics process in 1 fb^{-1} pp collision events recorded by CMS during 2018. The signal process is expected to have a cross section of 2 fb and feature two jets of an extremely large invariant mass above 10 TeV.

You select the events with invariant dijet mass > 10 TeV. In each of the following cases, did you discover new physics?

- a) You observe 2 events.
- b) You observe 0 events.
- c) You observe 6 events, where you expect a background from Standard Model processes of 4 events on average.



You expect 2 signal events. Did you discover new physics?

- a) Yes (this is assuming you expect 0 background events!)
- b) No, but you also did not rule out the new physics: the probability to observe 0 events at an expectation of 2 is 0.14 (Poission distribution).
- No, this could be signal or an upward fluctuation of the background. The probability to observe 6 background events is 0.10 (Poission distribution).

Significance



- o In particle physics, usually counting experiments
- Allows often simple approximation of significance of an effect:
- 1. Total number b of expected background events in interesting region
- 2. Background-only hypothesis: expect data to be Poisson distributed with mean *b* and standard deviation \sqrt{b}
- 3. For large number of events: Poisson \rightarrow Gaussian

$$Z=rac{n_{
m obs}-b}{\sqrt{b}}
ightarrow rac{S}{\sqrt{B}}$$



p Value



- How well is the data described by my hypothesis (model)?
- For example, how likely that observed peak in data just upward fluctuation of the background, i. e. no Higgs boson present?
- Assume simple counting experiment
 - b: expected number of background events (=model)
 - n_{obs}: number of observed events



How well is the data described by my hypothesis (model)?

p Value

- For example, how likely that observed peak in data just upward fluctuation of the background, i. e. no Higgs boson present?
- Assume simple counting experiment
 - b: expected number of background events (=model)
 - nobs: number of observed events
- "p value": probability of upward fluctuation as large as or larger than observed in data

$$p \equiv \mathsf{P}(n \ge n_{\mathrm{obs}}|b) = \int_{n_{\mathrm{obs}}}^{\infty} \mathrm{d}n \, \mathcal{P}(n|b)$$





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p Value

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$$p \equiv \mathsf{P}(n \ge n_{\rm obs}|b) = \int_{n_{\rm obs}}^{\infty} \mathrm{d}n \,\mathcal{P}(n|b)$$

- p depends on model and on data
- If hypothesis is true, *p* is uniformly distributed between 0 and 1





p Value

0

- b: expected number of background events (=model)
- n_{obs} : number of observed events
- "p value": probability of upward fluctuation as large as or larger than observed in data

$$p \equiv \mathsf{P}(n \ge n_{\mathrm{obs}}|b) = \int_{n_{\mathrm{obs}}}^{\infty} \mathrm{d}n \, \mathcal{P}(n|b)$$



How well is the data described by my hypothesis (model)?



p value is not the probability of a hypothesis p quantifies level of (dis-)agreement between model and data: \rightarrow judgement call whether to keep model or reject it



Significance



- Often, *p* value converted into equivalent **significance** *Z*: upward fluctuation from 0 by Z of normal-distributed variable corresponding to same *p* value
 - $\circ~$ Corresponds to Z standard deviations σ of the Gaussian distribution

 $Z = \Phi^{-1}(1-p)$ Φ : cumulative (=quantile) function of normal distribution



- Convention to classify effects by significance
 - \circ 3 σ : *evidence* for signal (0.3% chance of background fluctuation)
 - \circ 5 σ : *discovery* of signal (0.00006% chance of background fluctuation)

2012: The Higgs-Boson Discovery?



NB: by now much more data available, increased significance



2012: The Higgs-Boson Discovery!



NB: by now much more data available, increased significance



Different channels combined: 5σ significance Still a \approx 0.00006% chance it is just a background fluctuation!

Exercise 3



You are searching for a new particle that is expected to decay into two photons. Thus, you select events with two photons and histogram their invariant mass using 40 equidistant bins.

- a) What is the probability that you observe an excess of 2σ or more above the background expectation in exactly 1 bin just because of an upward fluctuation of the background?
- b) What is the probability for at least one 2 σ excess due to a background fluctuation?
- c) What is the probability that you observe a 2 σ excess in two adjacent bins?
- d) Your colleague performs the same search at another experiment. What is the probability that she also measures a 2 σ excess in the same mass bins?

Exercise 3 — Solutions



a) The probability of a 2 σ fluctuation of the background is $p \approx 0.046$. Using Binomial statistics, the probability of exactly k = 1 excess by 2 σ in any of the N = 40 bins is

$${\sf P}(k=1; p=0.046, N=40)=N\cdot p^1\cdot (1-p)^{N-1}=0.29$$
 .

b) Similarly, the probability at least one 2 σ fluctuation is

 $P(k \ge 1; p = 0.046, N = 40) = 1 - P(k = 0) = 1 - 1 \cdot 1 \cdot (1 - p)^{N} = 0.85$.

c) The probability of an excess in two adjacent bins with all other bins within 2 σ can be computed as

$$P(p = 0.046, N = 40) = 39 \cdot p^2 \cdot (1 - p)^{N-2} = 0.014$$
.

The combinatorial factor is 39 because of the edges of the histogram.

d) The probability of exactly one 2-bin excess in the same mass bins in both experiments follows as

$$P(p = 0.046, N = 40) = \underbrace{39 \cdot p^2 \cdot (1 - p)^{N-2}}_{\text{anywhere in exp. 1}} \cdot \underbrace{p^2 \cdot (1 - p)^{N-2}}_{\text{same two bins in exp. 2}} = 4.9 \cdot 10^{-6} .$$

What Is Wrong With This Histogram?





What Is Wrong With This Histogram?





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Look Elsewhere Effect



- Example with invariant mass: we are searching for a deviation from the background-only model in any of the bins
 - $\circ~$ i.e. we are performing several independent measurements
- $\circ~$ Repeating measurement 3 times, expect one fluctuation by 1 $\sigma~$
- $\circ\,$ Repeating measurement 20 times, expect one fluctuation by $2\sigma\,$
- $\circ\,$ Repeating measurement 330 times, expect one fluctuation by $3\sigma\,$

ightarrow "look-elsewhere effect"

- $\circ~$ Here we considered bins, but can be channels etc. as well
- Deviation in one bin/channel: local significance
- Global significance takes into account number of bins/channels

Look Elsewhere Effect



- Applies also more generally to e.g. LHC physics programme as a whole
 - Huge number of searches for new phenomena (and generally measurements), which are effectively a test of the SM hypothesis
- Expect significant deviations to appear by chance
- In fact, too few deviations!
 - Deviations not reported?
 - Experimentalists being overly conservative when assigning systematic uncertainties? [Eur. Phys. J. Plus 127 (2012) 157]





di-photon event with $m_{\gamma\gamma}=$ 745 GeV





- With first LHC Run-II data at $\sqrt{s} = 13$ TeV: both ATLAS and CMS observe excess in $m_{\gamma\gamma}$ at ≈ 750 GeV (reported at CERN seminar on December 15, 2015)
 - $\circ~$ ATLAS: 3.6 σ local significance (1 : 10⁴), 2 σ global significance $_{\rm [ATLAS-CONF-2015-081]}$
 - \circ CMS: 2.6 σ local significance, 1.2 σ global significance $_{\rm [CMS-PAS-EXO-15-004]}$





- $\circ~$ Both experiments observed small excess around 750 GeV in LHC Run-I data at $\sqrt{s}=$ 8 TeV
 - If F(750) produced in gluon-gluon-fusion: $\sigma_F(8 \text{ TeV})/\sigma_F(13 \text{ TeV}) \approx \frac{1}{5}$
 - Amount of data: $L(8 \text{ TeV})/L(13 \text{ TeV}) \approx 8$
 - → naively expect higher significance in Run-I. But bkg. may grow less fast with \sqrt{s} or signal have mild downward (upward) fluctuation at 8 TeV (13 TeV) (or heavier resonance decaying to 750 GeV particle)





- $\circ~$ Both experiments observed small excess around 750 GeV in LHC Run-I data at $\sqrt{s}=$ 8 TeV
- Some tension between 8 and 13 TeV data but compatible
- ightarrow ATLAS+CMS Run I+II combined local significance of 4.4 σ



- $\circ~$ Scalar particle, coupling to vector-like quarks in gluon-gluon fusion production and decay to $\gamma\gamma$
- $\circ~$ Composite state bound by new strong interaction
- Kaluza-Klein graviton in Randall-Sundrum (extra dimension) models
- Additional Higgs boson of models with extended Higgs sectors (later)
 - ... a tiny, tiny fraction of the proposed models

(review from Aug 2016: arXiv:1605.09401 [hep-ph])

Huge Attention by Theory Community





http://jsfiddle.net/adavid/bk2tmc2m/show/





- $\circ~$ Adding further 12 fb⁻¹ of data: significance decreased (\approx 2.3 $\sigma)$
- $\circ~$ Further decreased after analysing even more data of 2016

We were so close... This is statistics at work