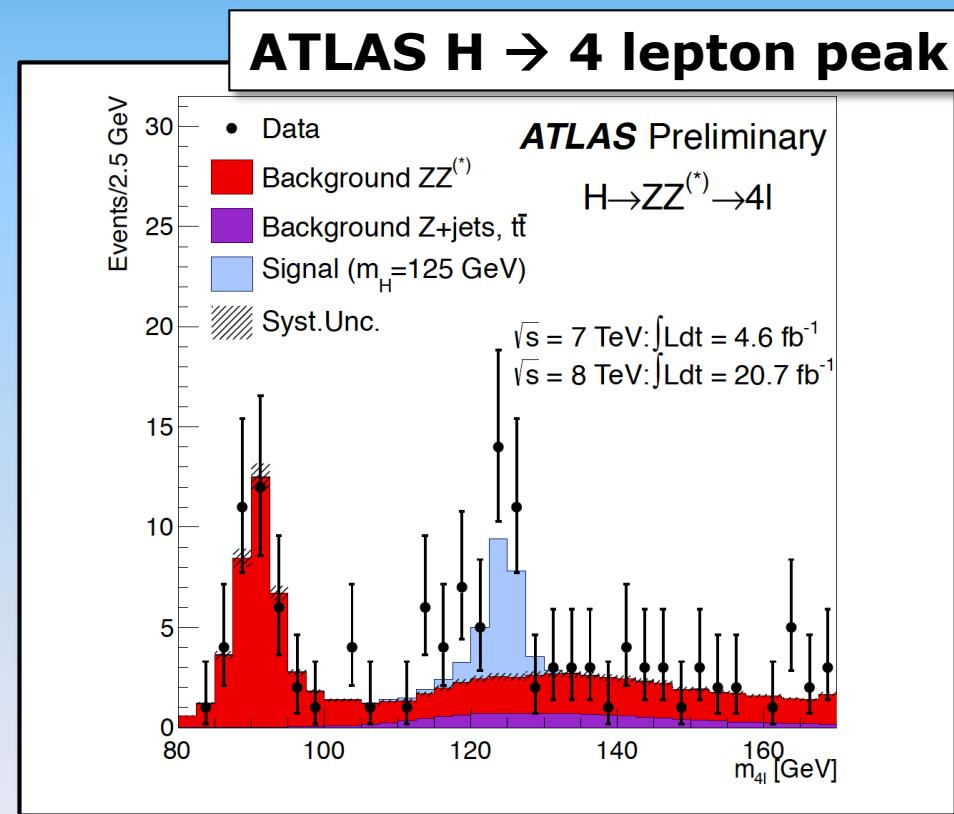


# Why does RooFit put asymmetric errors on data points ?

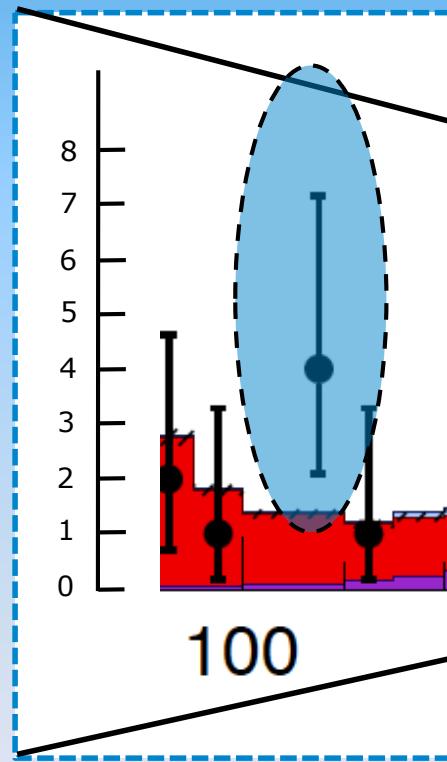
Ivo van Vulpen  
(UvA/Nikhef)

*10 slides on a 'too easy'  
topic that I hope confuse,  
but do not irritate you*

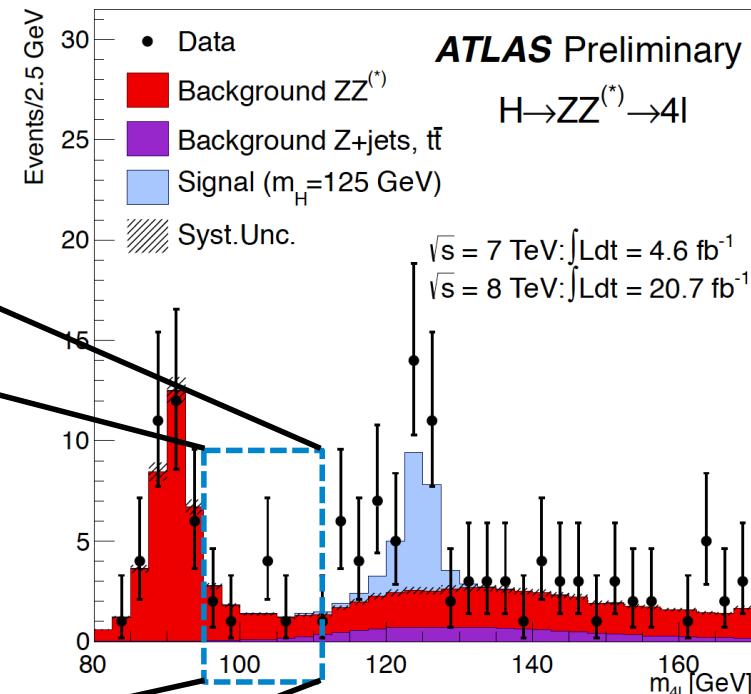


[http://www.nikhef.nl/~ivov/Statistics/PoissonError/BobCousins\\_Poisson.pdf](http://www.nikhef.nl/~ivov/Statistics/PoissonError/BobCousins_Poisson.pdf)

# Why put an error on a data-point anyway ?



## ATLAS H $\rightarrow$ 4 lepton peak



- Summarize measurement
- Make statement on underlying true value

I'll present 5 options.  
You tell me which one you prefer

# Known $\lambda$ (Poisson)

Binomial with  $n \rightarrow \infty$ ,  $p \rightarrow 0$  en  $np = \lambda$

$$P(n | \lambda) = \frac{\lambda^n e^{-\lambda}}{n!}$$

Probability to observe  $n$  events  
when  $\lambda$  are expected

*Poisson distribution*

$$P(0 | 4.0) = 0.01832$$

$$P(2 | 4.0) = 0.14653 !$$

$$P(3 | 4.0) = 0.19537$$

$$P(4 | 4.0) = 0.19537$$

$$P(6 | 4.0) = 0.10420 !$$

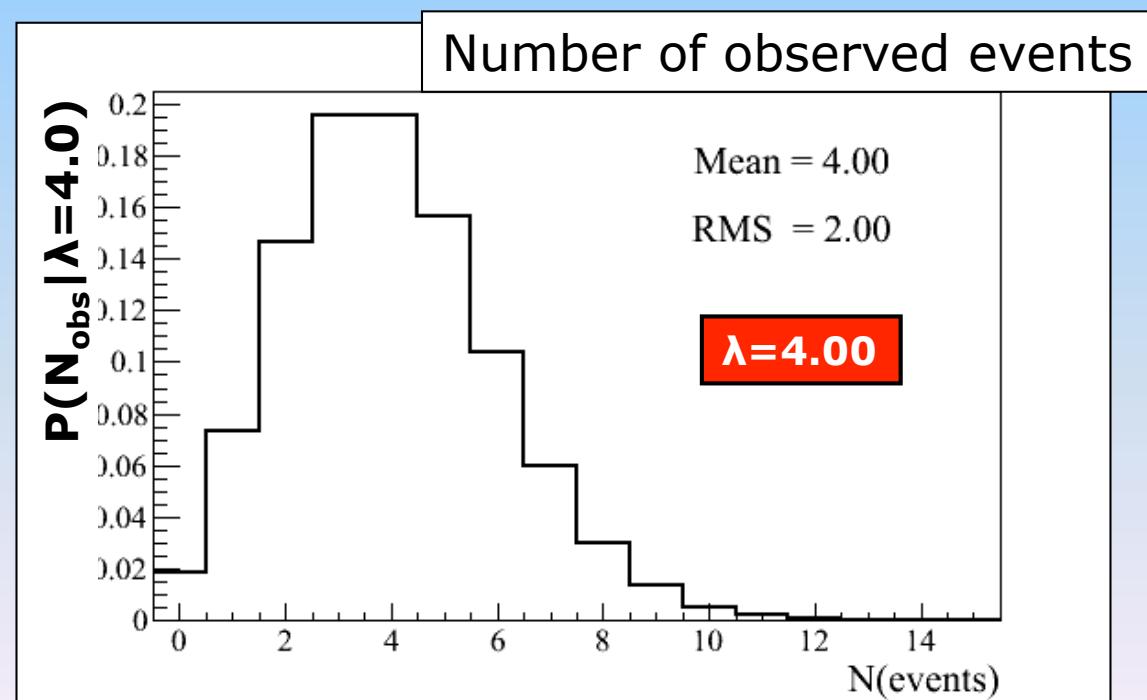


#observed

$\lambda$  hypothesis

varying

fixed



# Known $\lambda$ (Poisson)

Binomial with  $n \rightarrow \infty$ ,  $p \rightarrow 0$  en  $np = \lambda$

$$P(n | \lambda) = \frac{\lambda^n e^{-\lambda}}{n!}$$

*Poisson distribution*

$$P(0 | 4.9) = 0.00745$$

$$P(2 | 4.9) = 0.08940$$

$$P(3 | 4.9) = 0.14601$$

$$P(4 | 4.9) = 0.17887$$



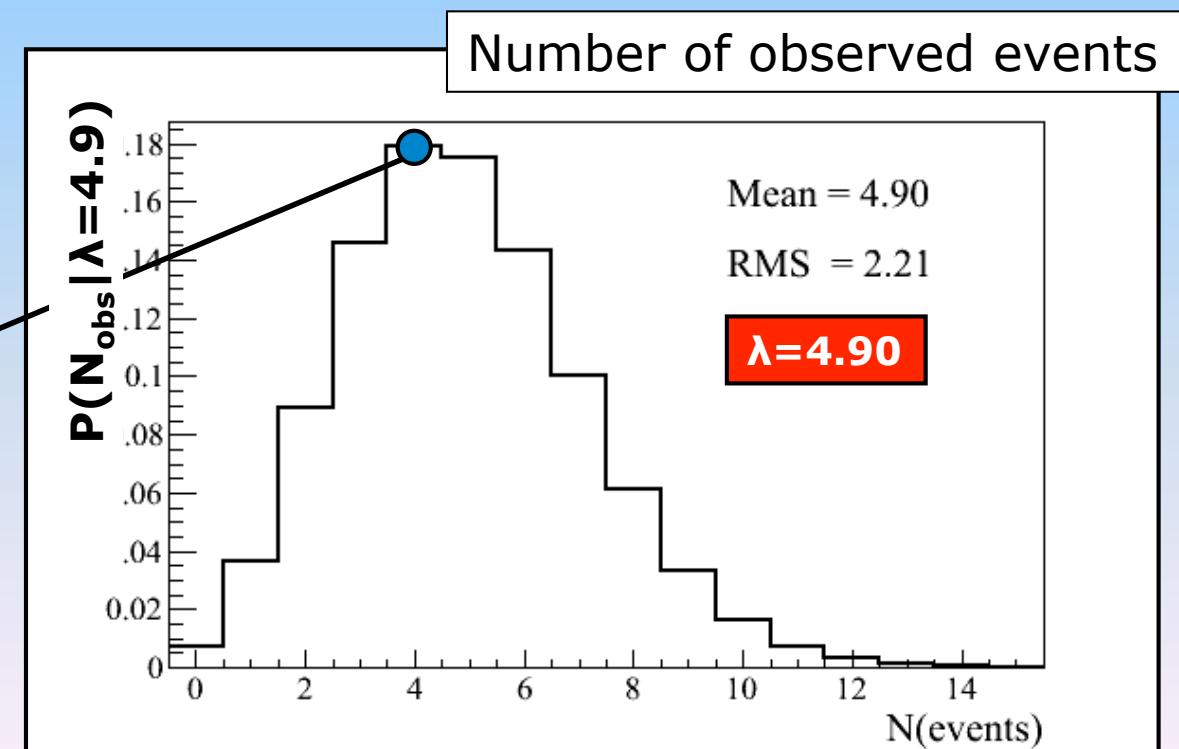
#observed

$\lambda$  hypothesis

varying

fixed

Probability to observe  $n$  events  
when  $\lambda$  are expected



the famous  $\sqrt{N}$

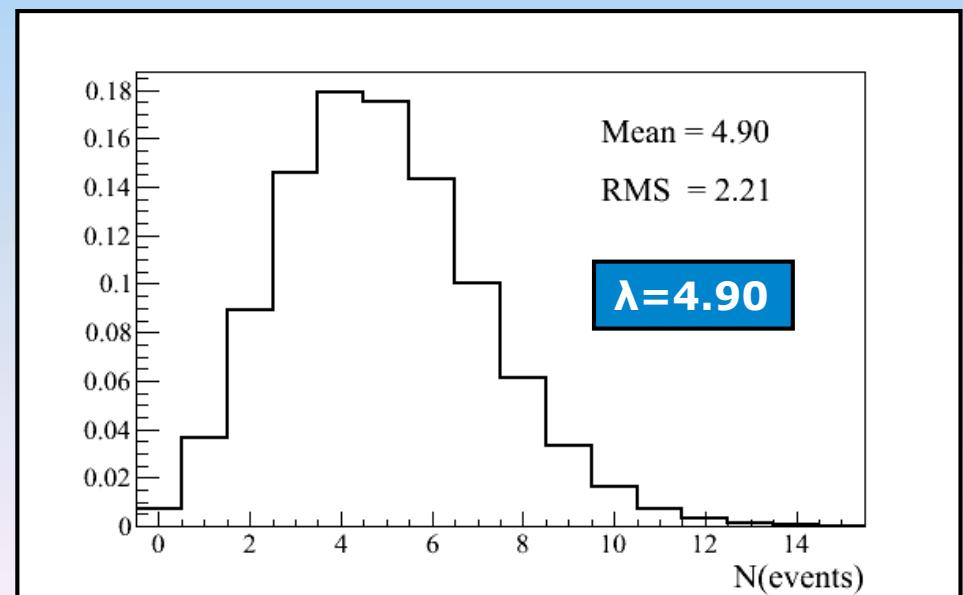
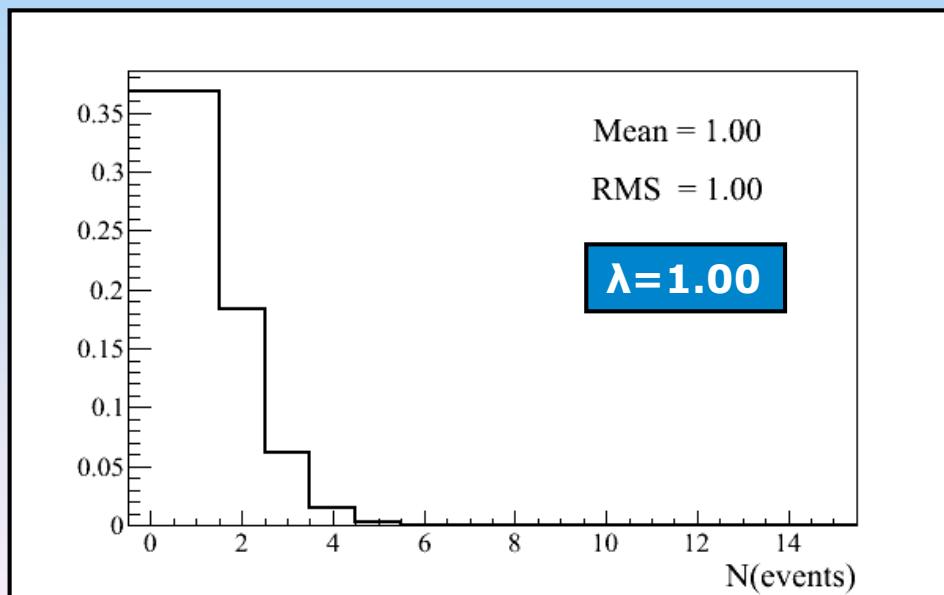
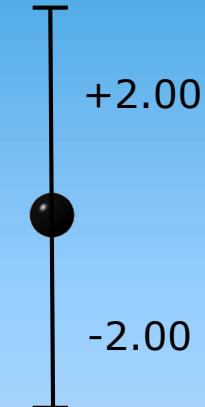
### properties

$$(1) \text{ Mean: } \langle n \rangle = \lambda$$

$$(2) \text{ Variance: } \langle (n - \langle n \rangle)^2 \rangle = \lambda$$

(3) Most likely: first integer  $\leq \lambda$

## Option 1: Poisson spread for fixed $\lambda$



# Treating it like a normal measurement

What you have:

$$P(N_{obs} | \lambda)$$

- 1) construct Likelihood  
 $\lambda$  as free parameter



- 2) Find value of  $\lambda$  that maximizes Likelihood



- 3) Determine error interval:  
 $\Delta(-2\text{Log}(lik)) = +1$

# Likelihood (ratio)

$$L(n | \lambda) = \frac{\lambda^n e^{-\lambda}}{n!}$$

*Likelihood*

$$P(4|0) = 0.00000$$

$$P(4|2) = 0.09022 !$$

$$P(4|4) = 0.19537$$

$$P(4|6) = 0.13385 !$$



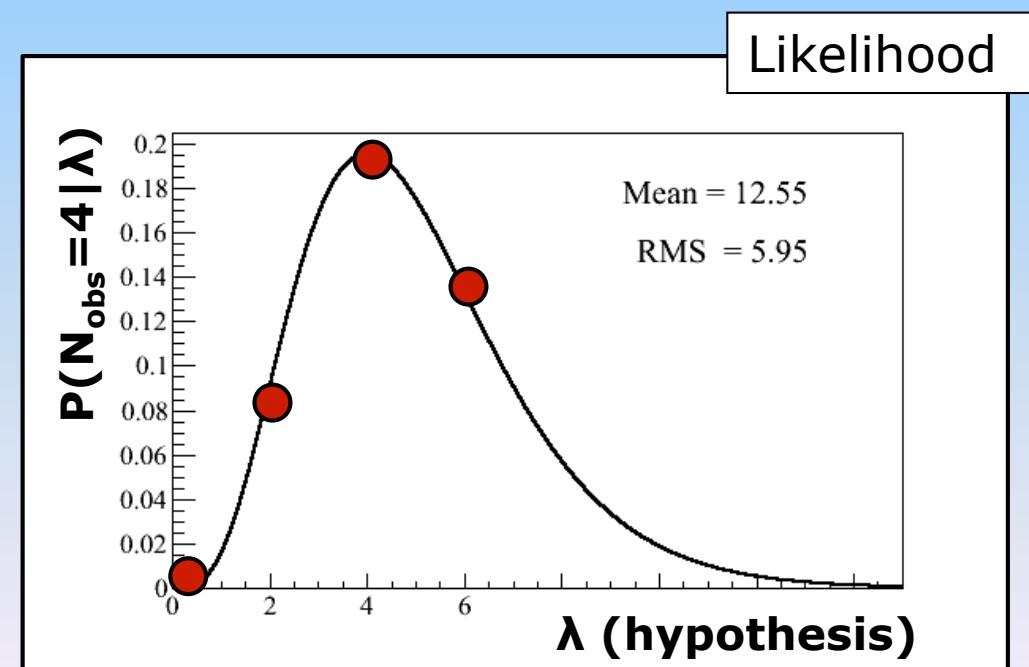
#observed

λ hypothesis

fixed

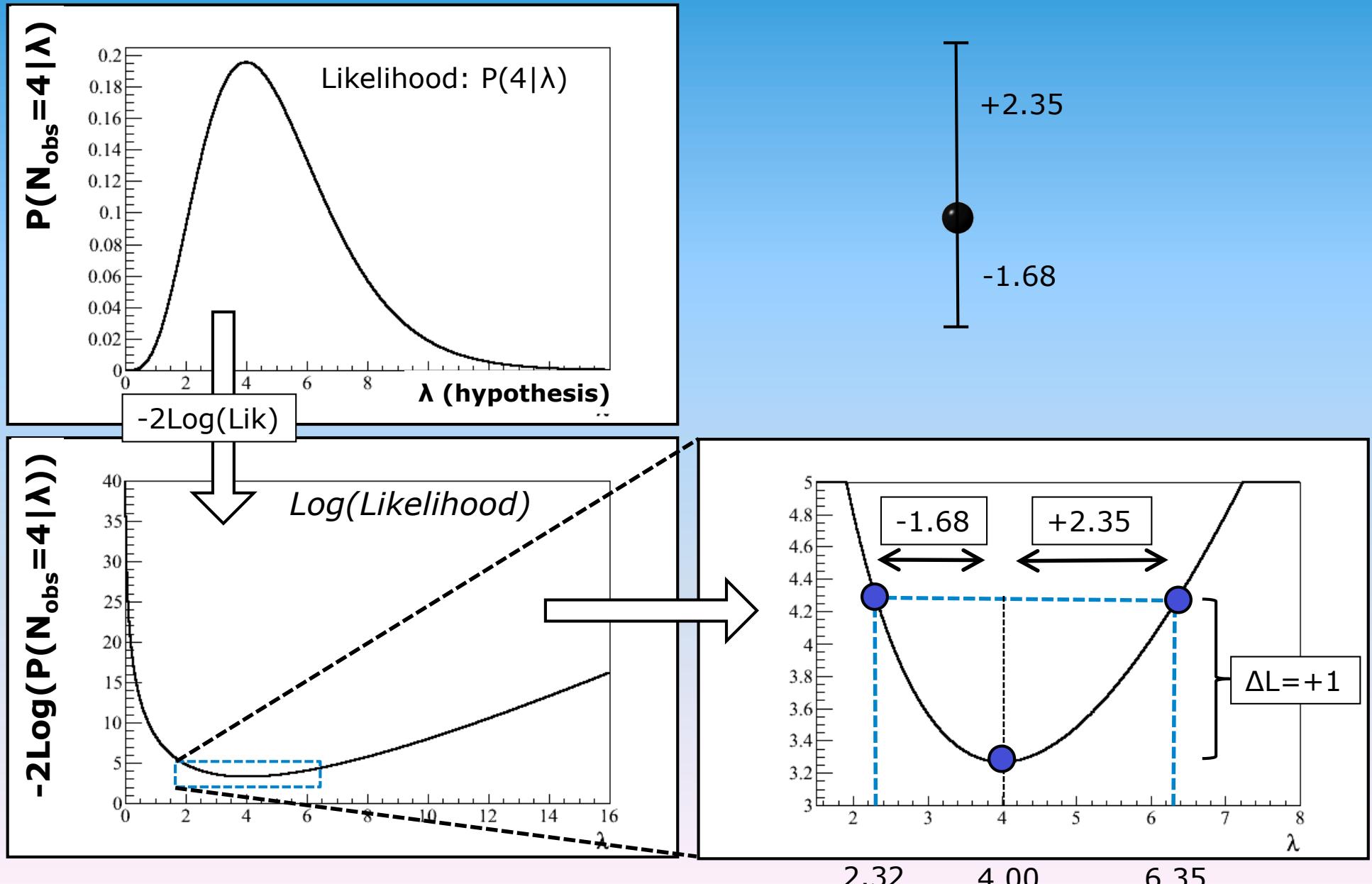
varying

Probability to observe n events  
when λ are expected

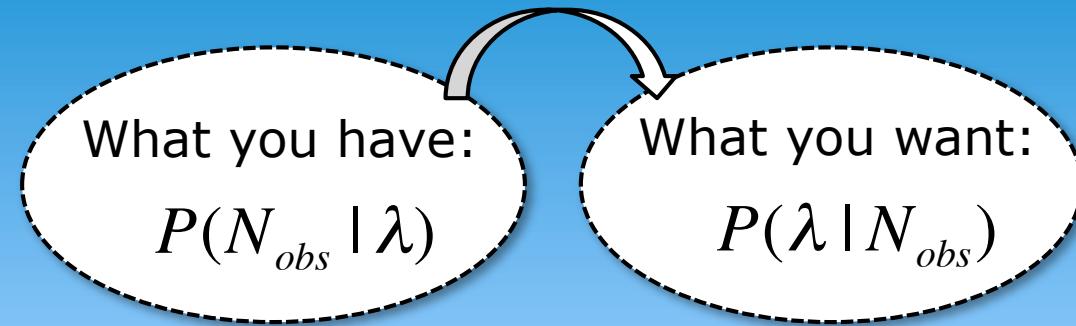


Note: normally you use  $-2\log(\text{Lik})$

# Option 2: likelihood (ratio)



# Bayesian: statement on true value of $\lambda$



$$P(\lambda | N_{obs}) = P(N_{obs} | \lambda)P(\lambda)$$



*Likelihood:* Poisson distribution

“what can I say about the **measurement** (number of observed events) given a theory expectation ?”

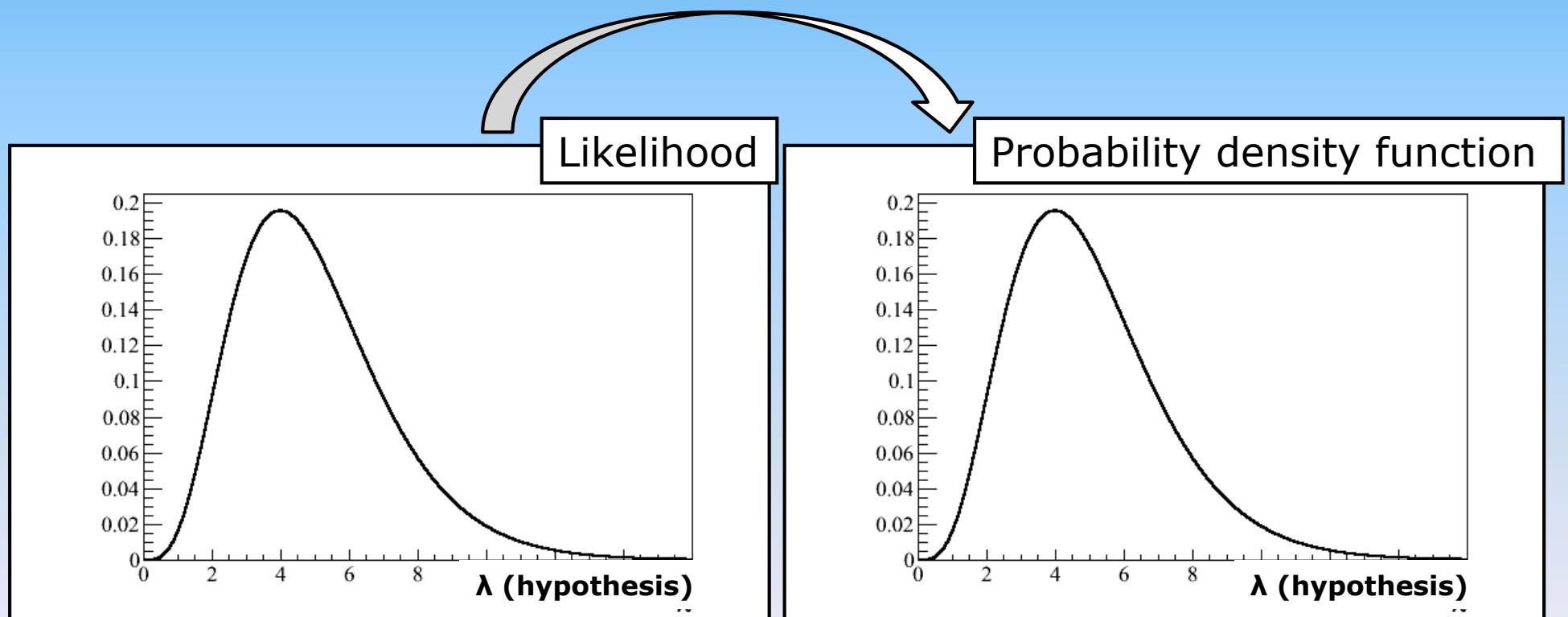
Posterior pdf for  $\lambda$ :

“what can I say about the underlying **theory** (true value of  $\lambda$ ) given that I have observed 4 events ?”

# Bayesian: statement on true value of $\lambda$

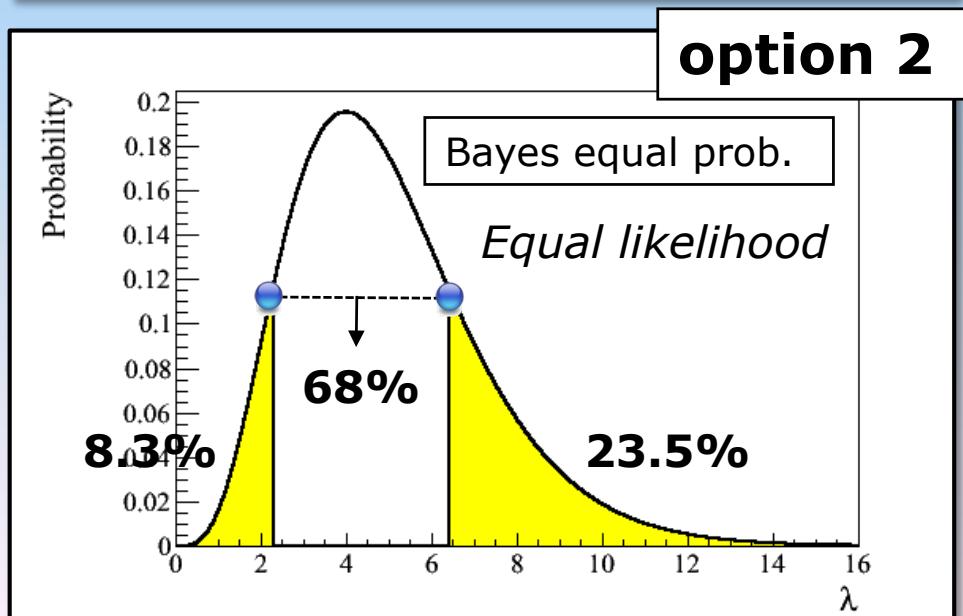
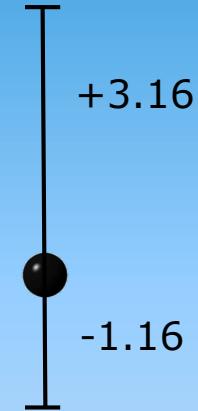
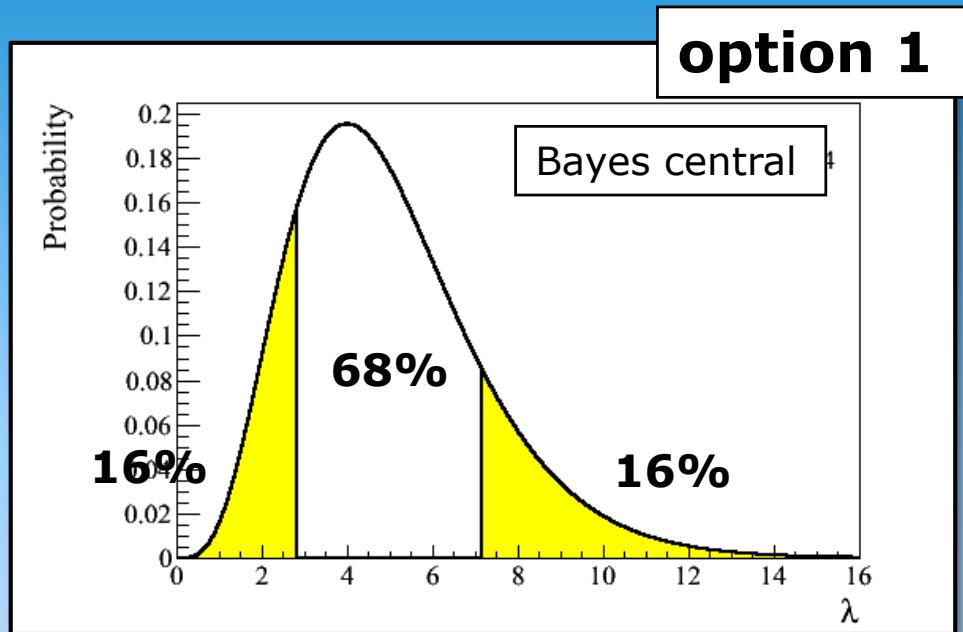
$$P(\lambda | N_{obs}) = P(N_{obs} | \lambda)P(\lambda)$$

Choice of prior  $P(\lambda)$ :  
Assume all values for  $\lambda$  are  
equally likely ("I know nothing")



Posterior PDF for  $\lambda$   
→ Integrate to get confidence interval

# Option 3 and 4: Bayesian



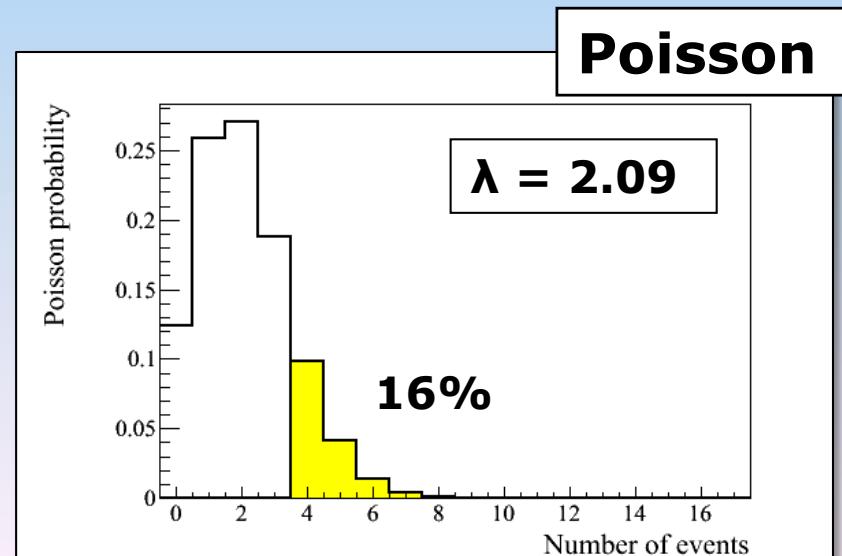
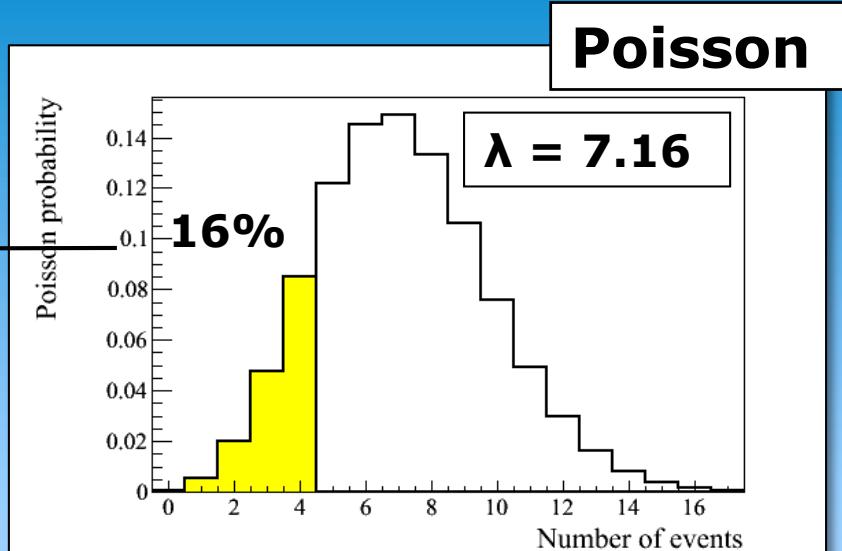
# Option 4: Frequentist

If  $\lambda < 7.16$  then probability to observe 4 events (or less) < 16%

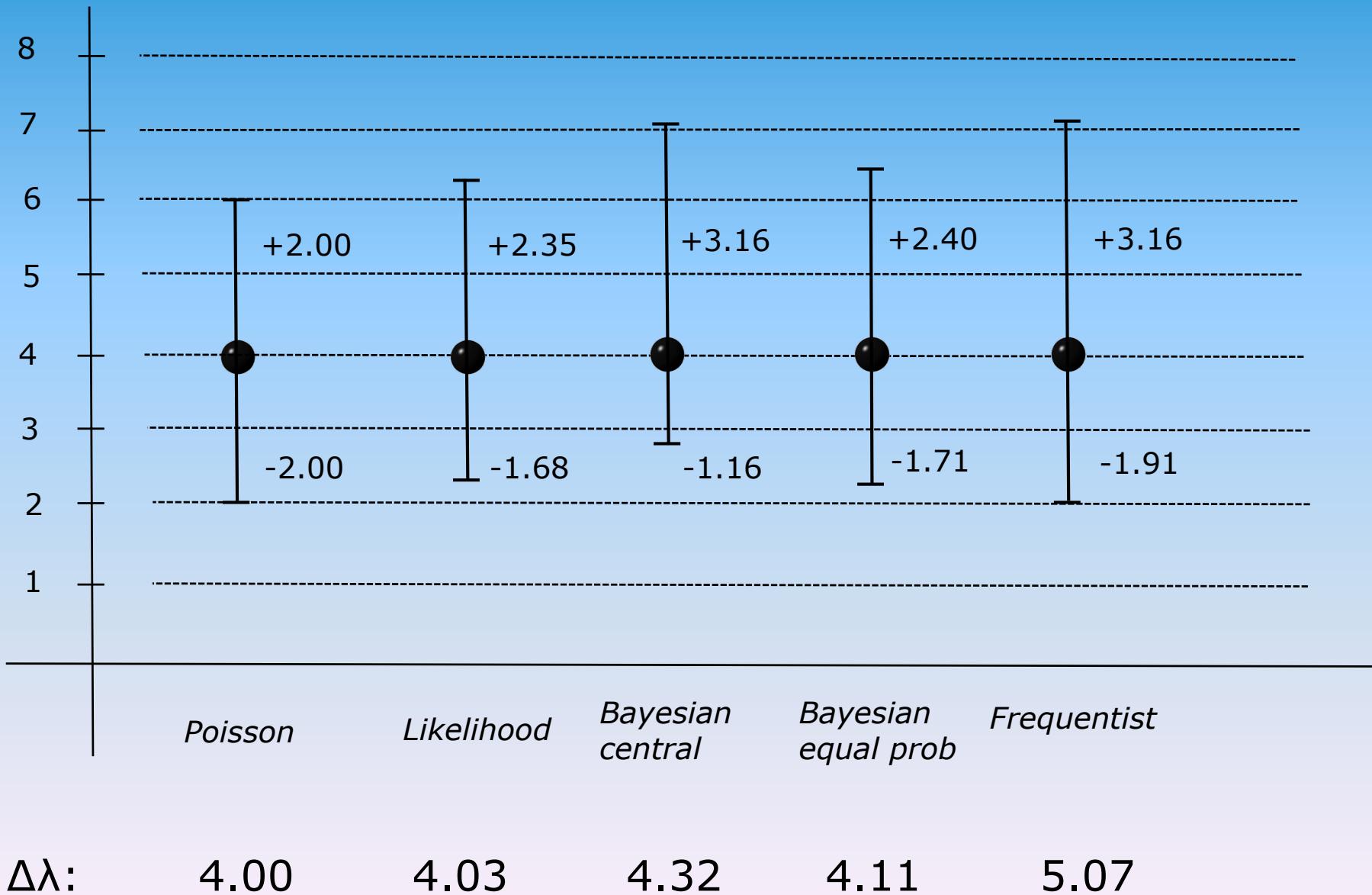
$\longrightarrow$  smallest  $\lambda$  for which  
 $P(n \leq n_{\text{obs}} | \lambda) = 0.159$

$\longrightarrow$  largest  $\lambda$  for which  
 $P(n \geq n_{\text{obs}} | \lambda) = 0.159$

**Note:** also using data that you did **not** observe



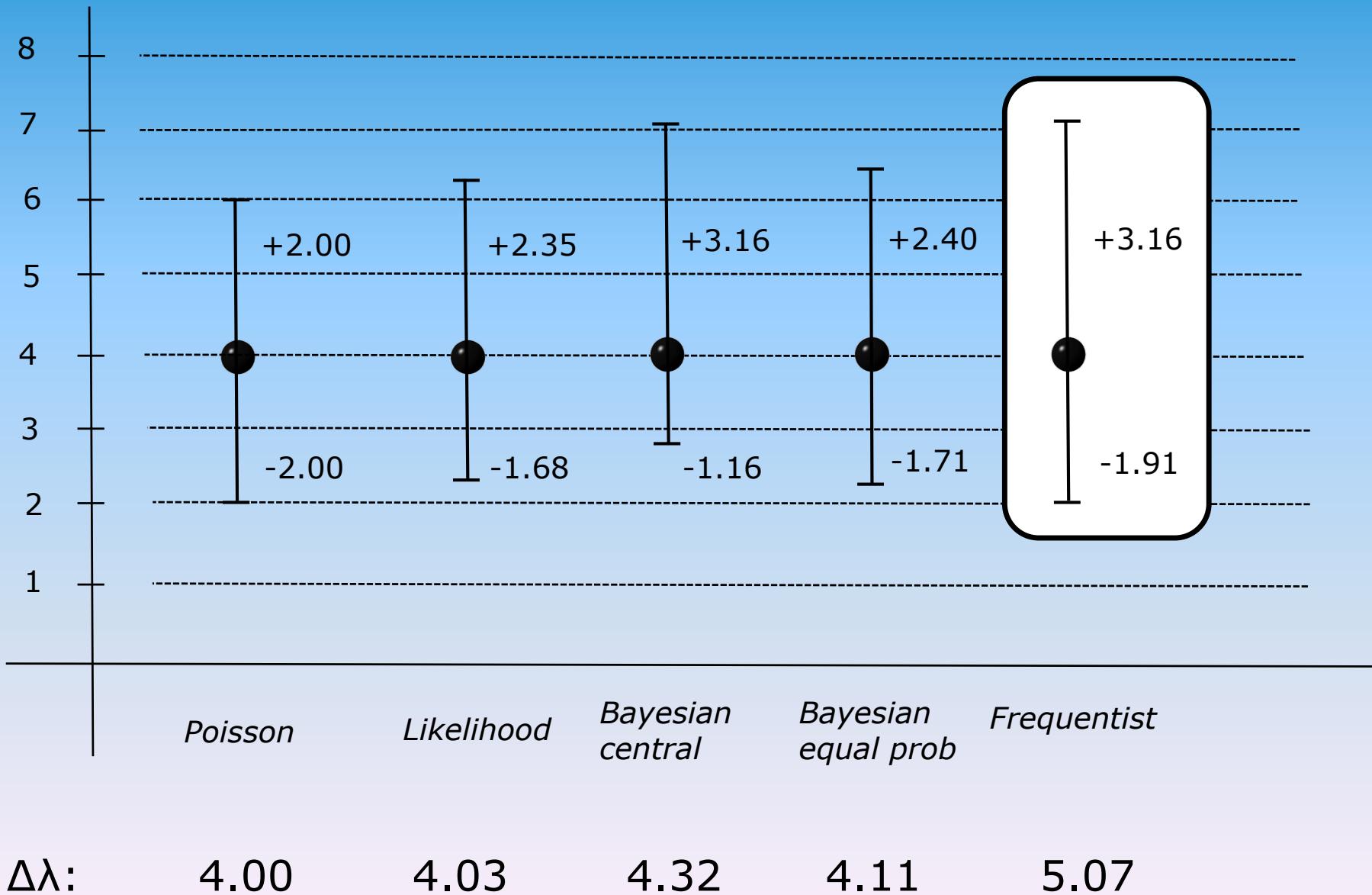
# The options

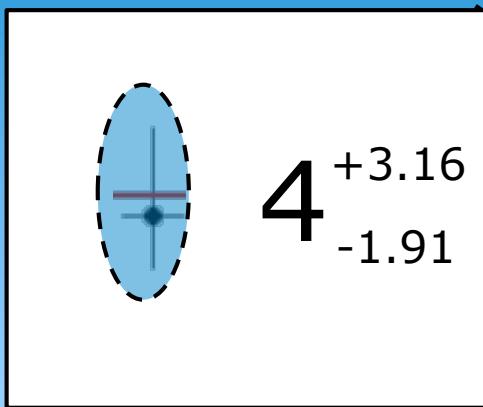


Think about it and discuss with your colleagues tonight

I'll give the answer tomorrow

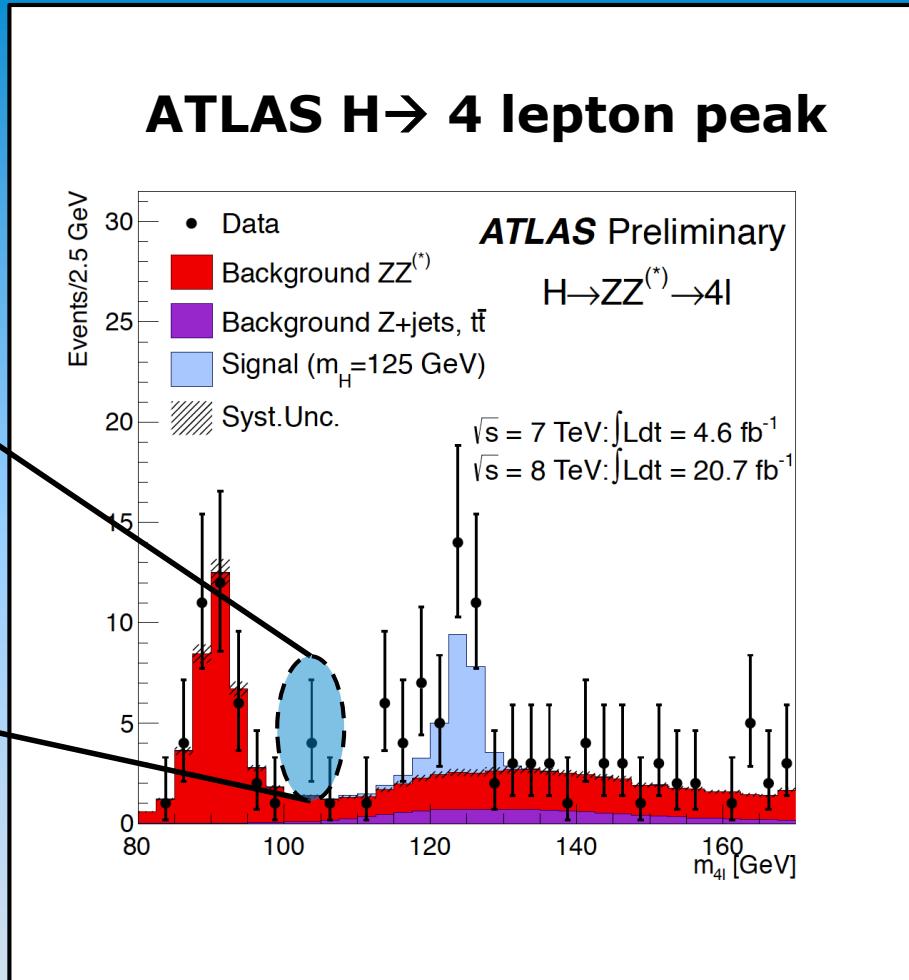
# The options





Conclusion:

- Now you know what RooFit uses
- Hope you are a bit confused



<http://www.nikhef.nl/~ivov/Statistics/PoissonError/>

BobCousins\_Poisson.pdf

→ Paper with details

PoissonError.C

→ Implementation options shown here

Ivo\_Analytic\_Poisson.pdf

→ Analytic properties (inverted) Poisson