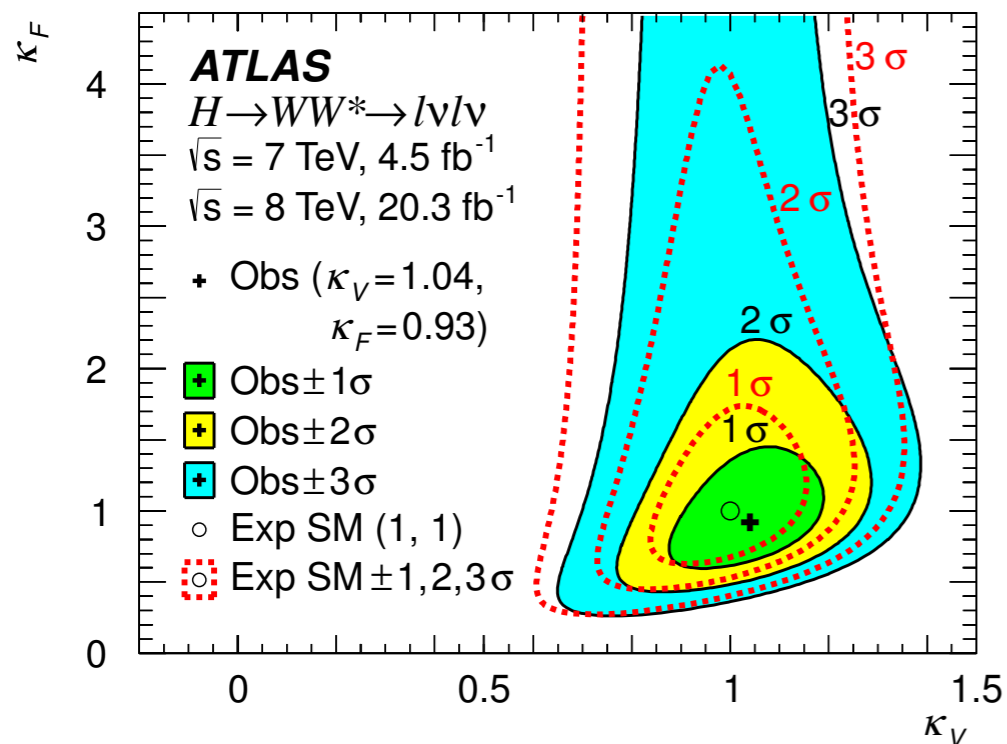
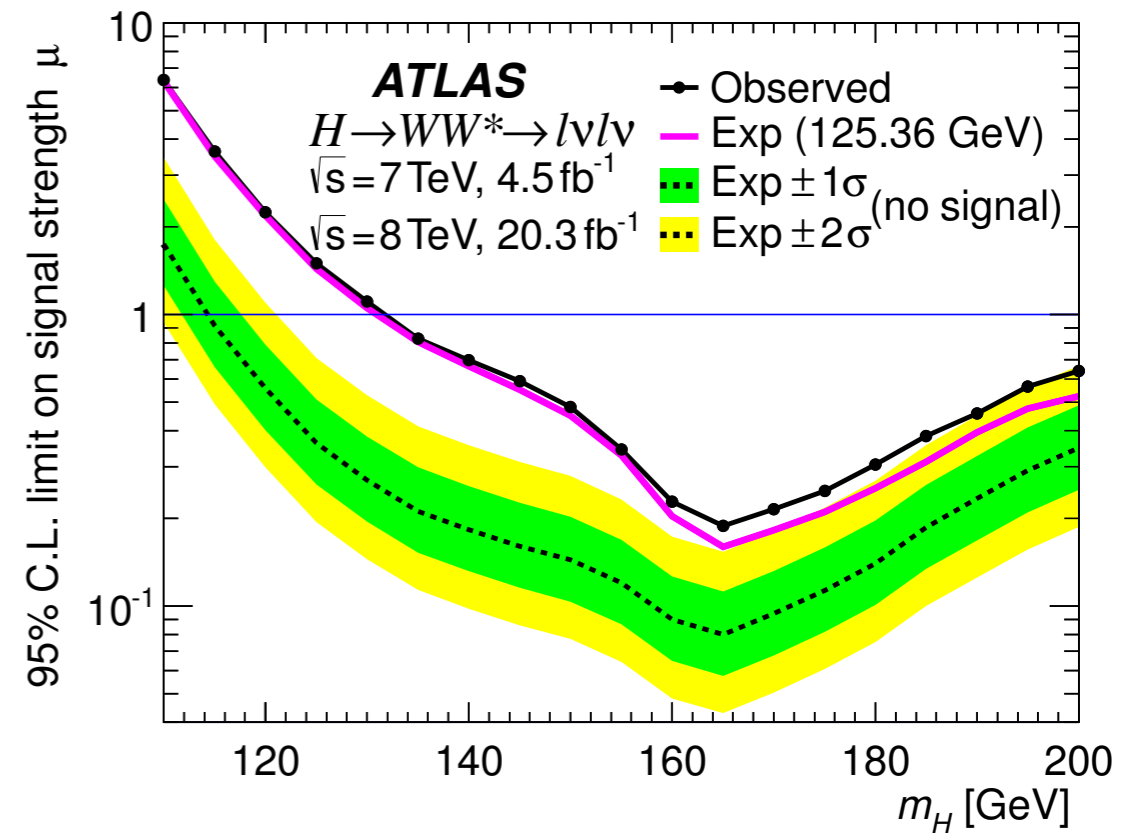
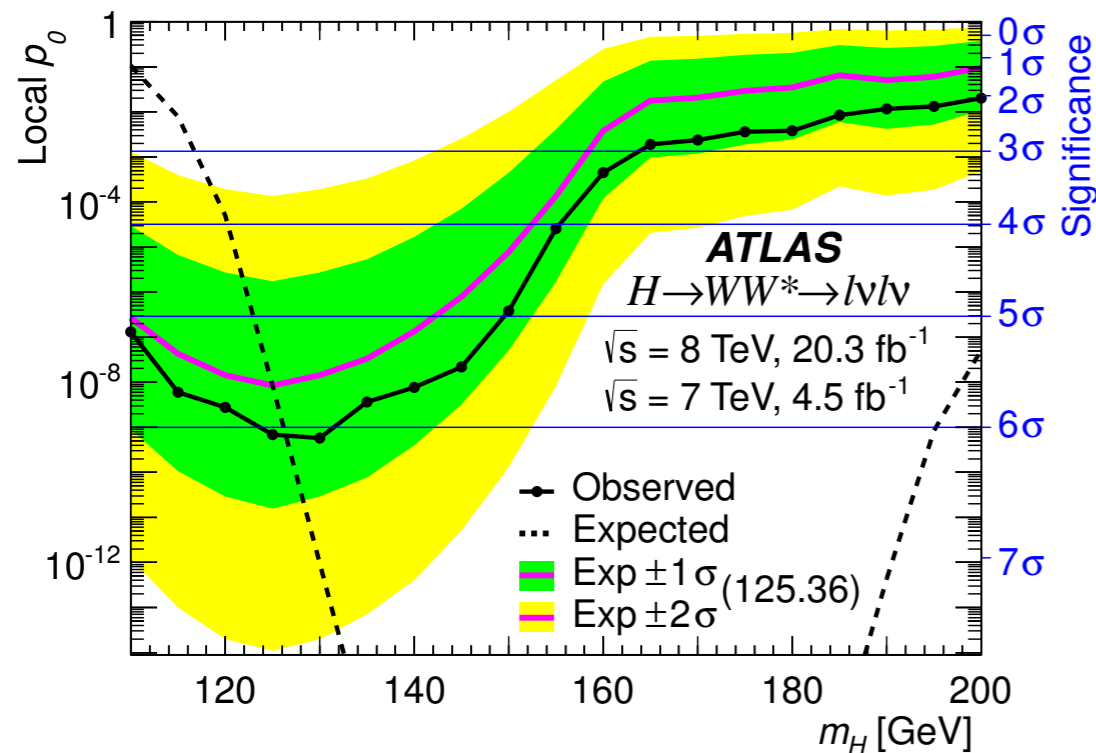


# Statistical tools in Higgs search and discovery



Slides prepared using mainly material from E. Gross and W. Vekerke talks.

# Introduction

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Enormous effort to search for Higgs signature in many decay channels

- Results → many plots with signal, background expectations, each with (systematic) uncertainties, and data
- Q: How do you conclude from this that you've seen the Higgs (or not)?
  - Want answer of type: ‘We can exclude that the Higgs exist at 95% CL’, or “The significance of the observed excess is  $5\sigma$ ”

# Quantifying discovery and exclusion – Frequentist approach

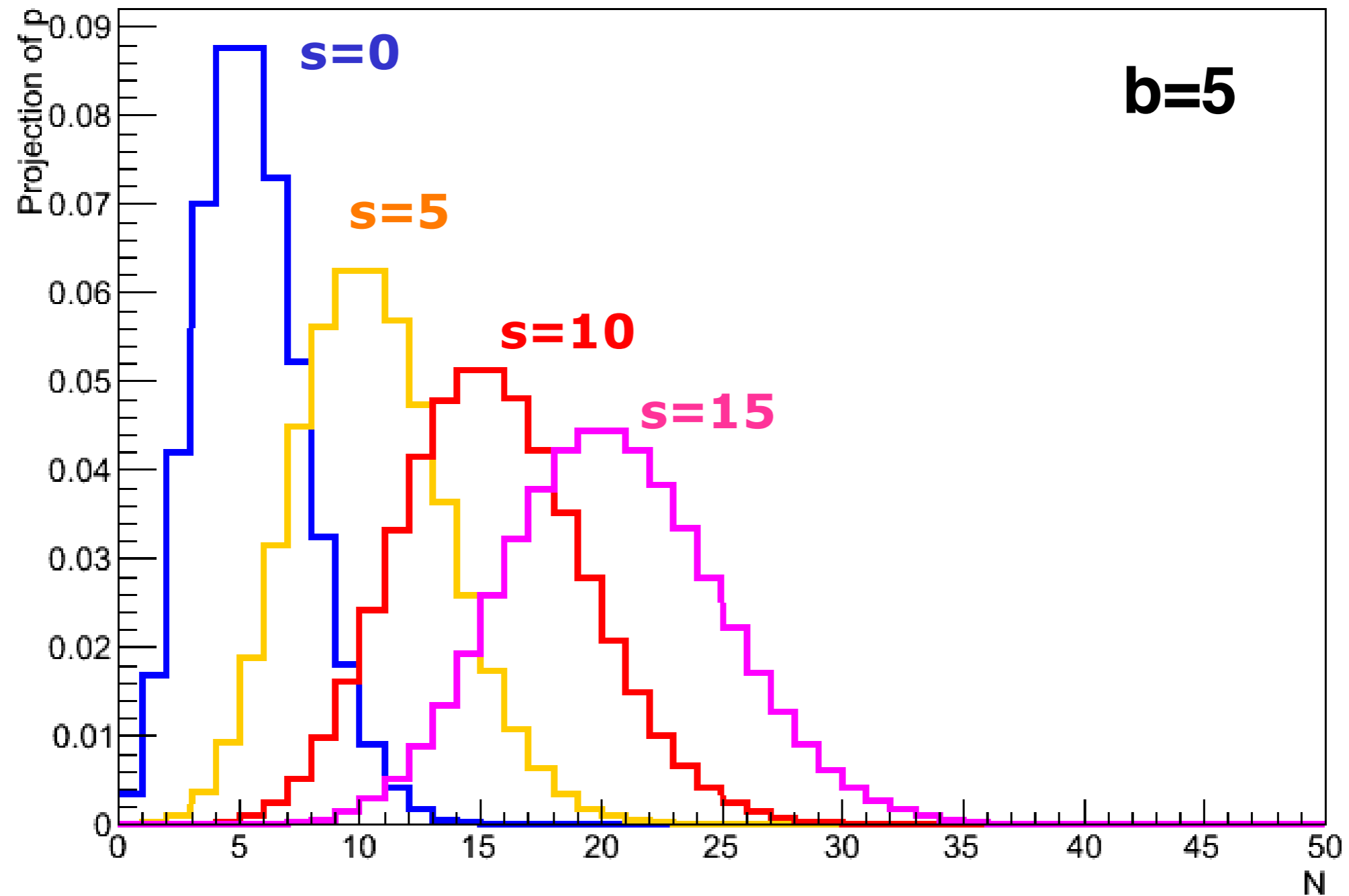
- Consider the simplest case – a counting experiment
  - Observable:  $N$  (the number of events)
  - Model  $F(N|s+b)$ : Probability to get  $N$  events given an assumed value of signal expectation ( $s$ ) and background expectation ( $b$ )

Let's assume to know exactly the expected background  $b=5$ .

$F$  is given by Poisson( $N|s+b$ )

$$F(N|y) = \frac{y^N}{N!} e^{-y} \Rightarrow F(N|s+b) = \frac{(s+b)^N}{N!} e^{-(s+b)}$$

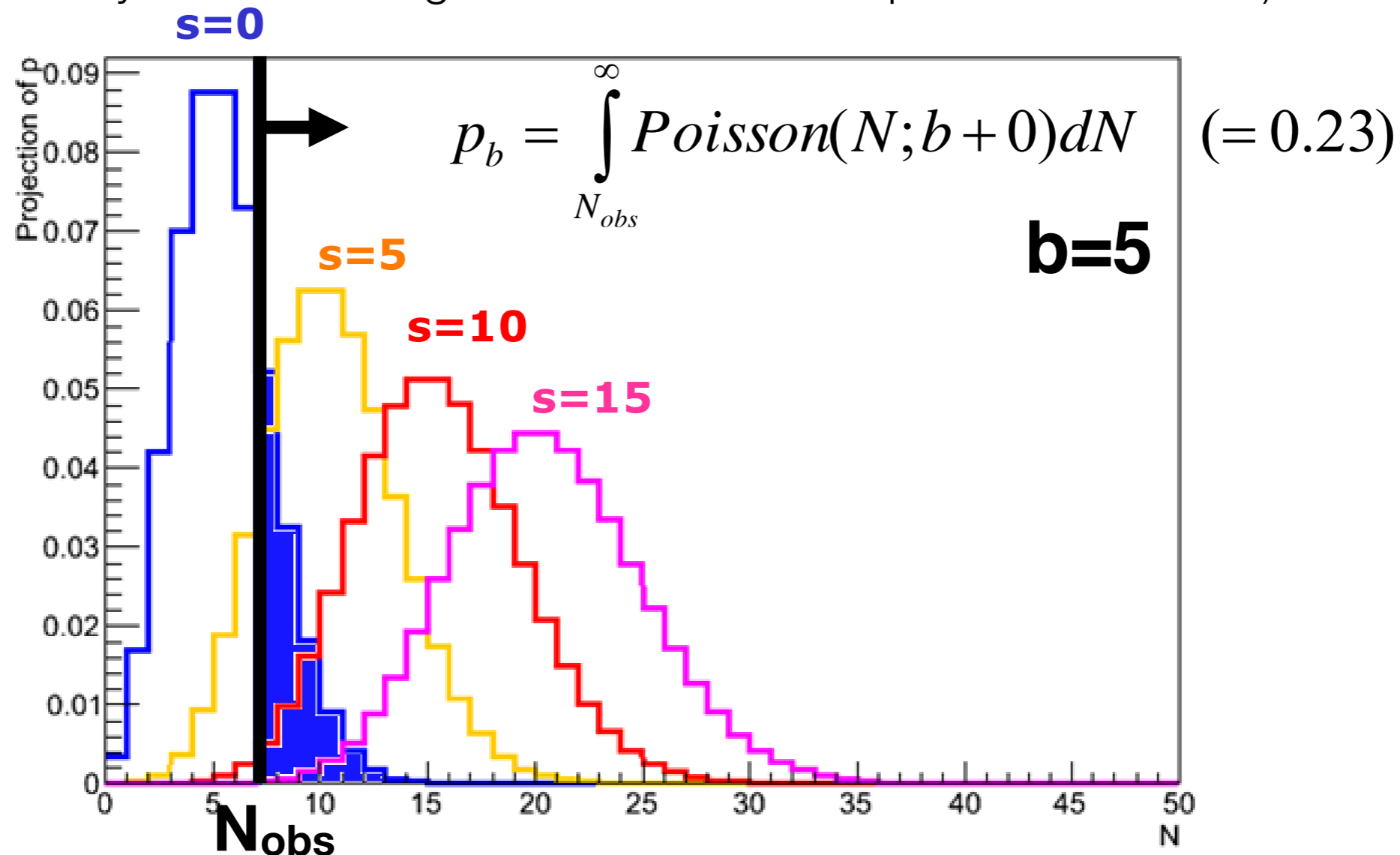
# Quantifying discovery and exclusion – Frequentist approach



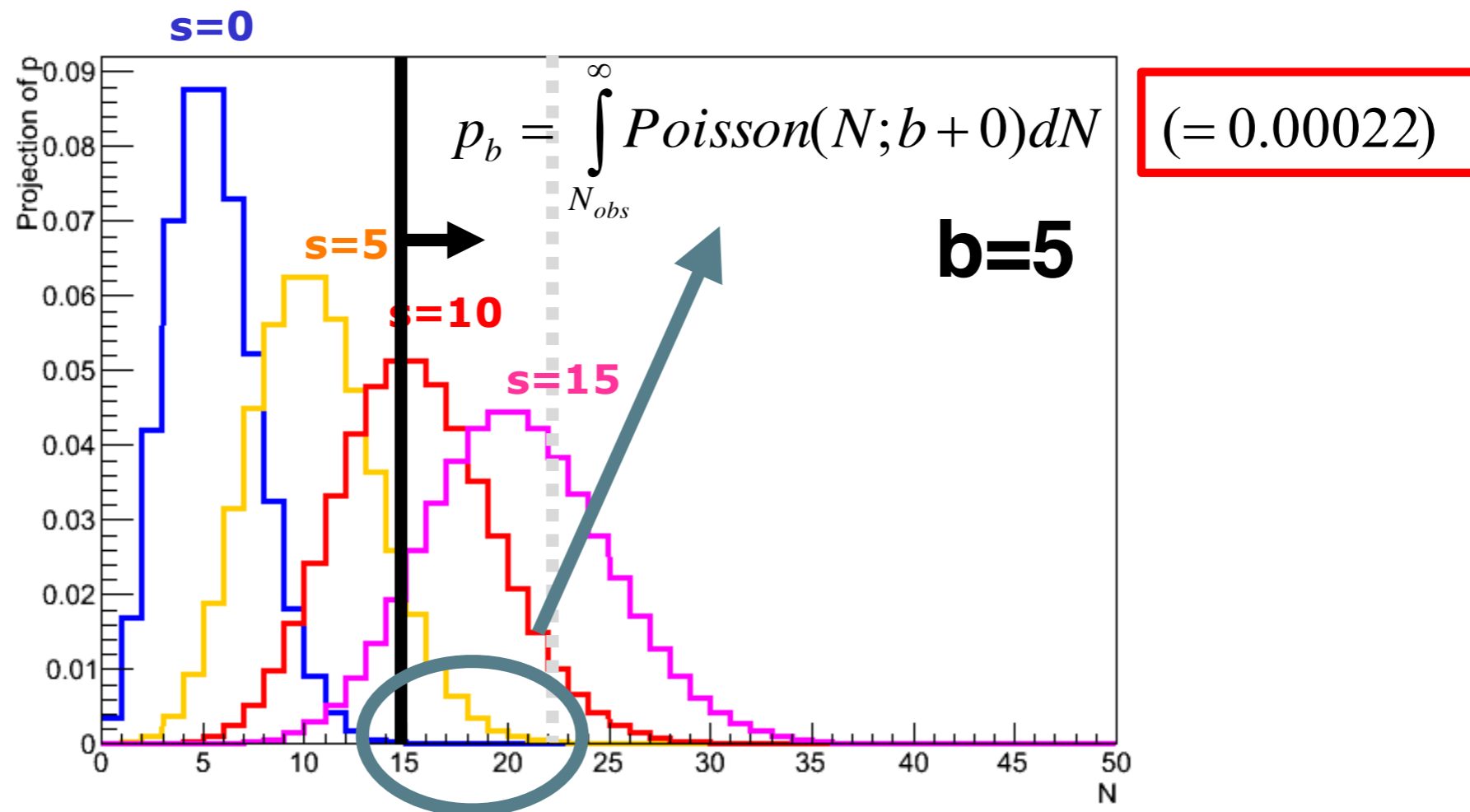


# Quantifying discovery and exclusion – Frequentist approach

- Now make a measurement  $N=N_{\text{obs}}$  (example  $N_{\text{obs}}=7$ )
- Can now define p-value(s), e.g. for bkg hypothesis
  - Fraction of future measurements with  $N=N_{\text{obs}}$  (or larger) if  $s=0$  (probability that the background can fluctuate up to  $N_{\text{obs}}$  or above)



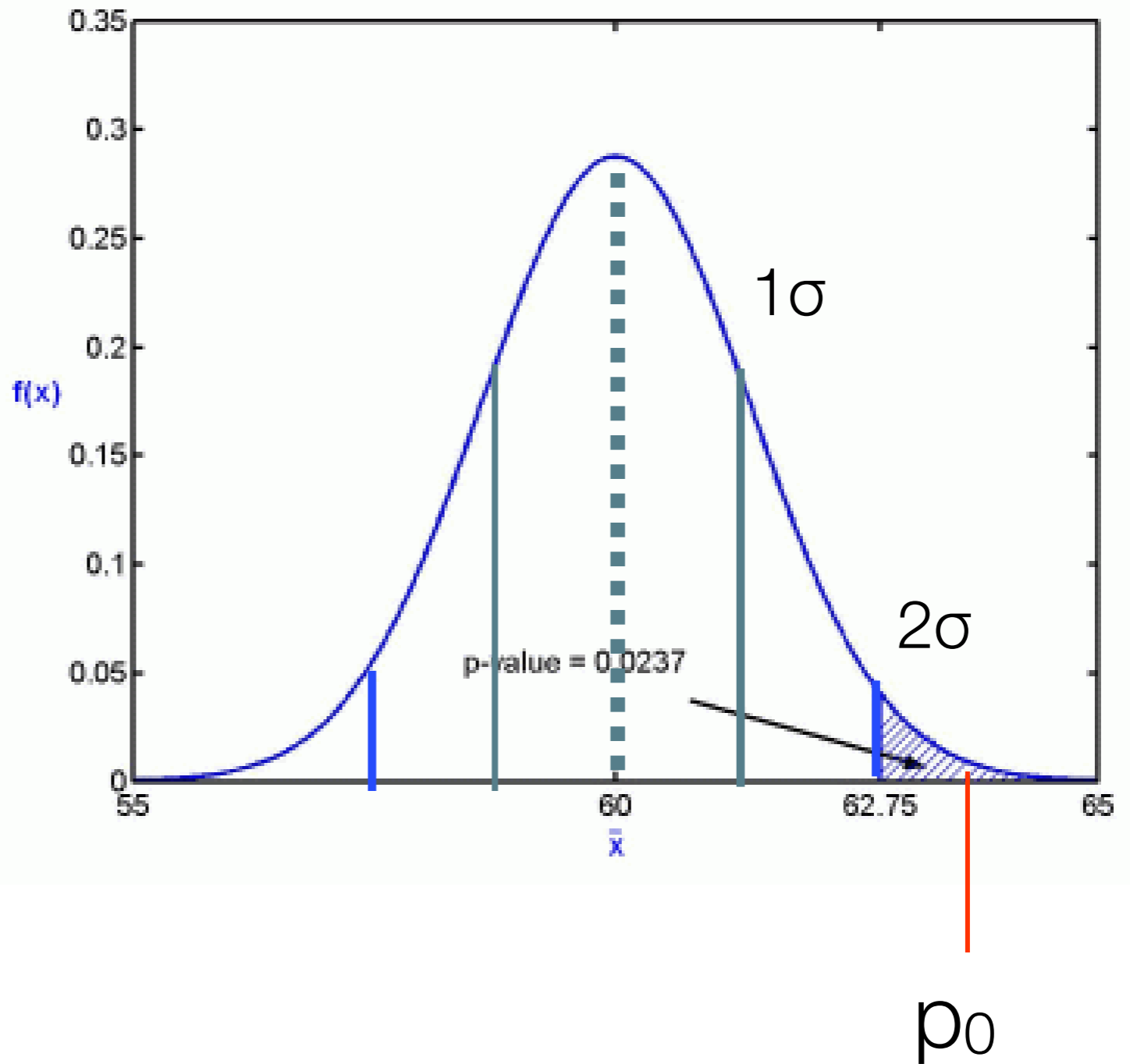
- p-values of background hypothesis is used to quantify '**discovery**' = excess of events over background expectation
- Another example:  $N_{obs}=15$  for same model, what is  $p_b$ ?



For large b the Poisson distribution becomes a gaussian distribution

# From $p_0$ to number of $\sigma$

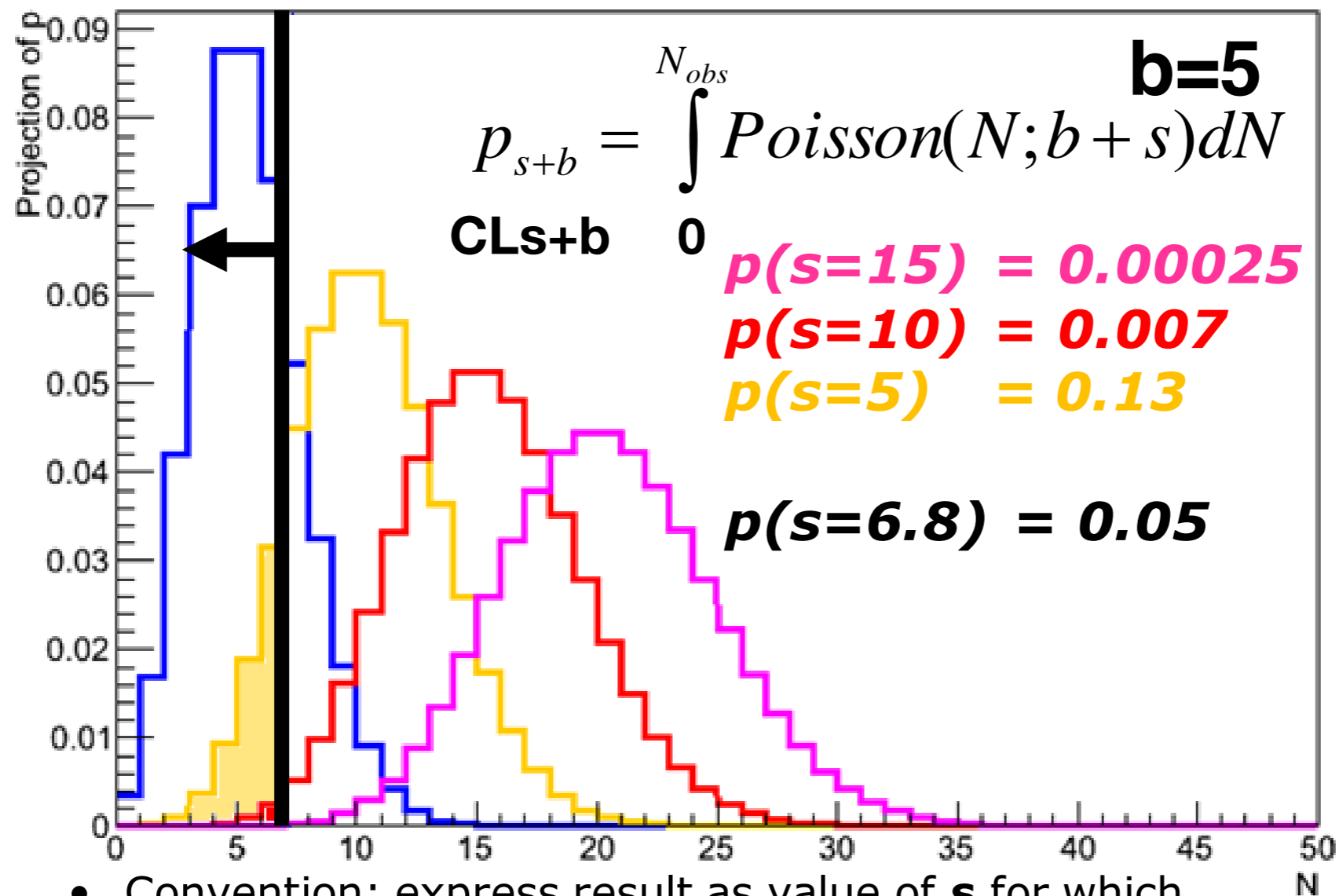
An observed excess is  $n\sigma$  if the integral of the right tail above the region delimited by the  $n\sigma$  interval is equal to the observed  $p_0$



# Quantifying exclusion – Frequentist approach

We want to exclude a signal hypothesis  $s$ .

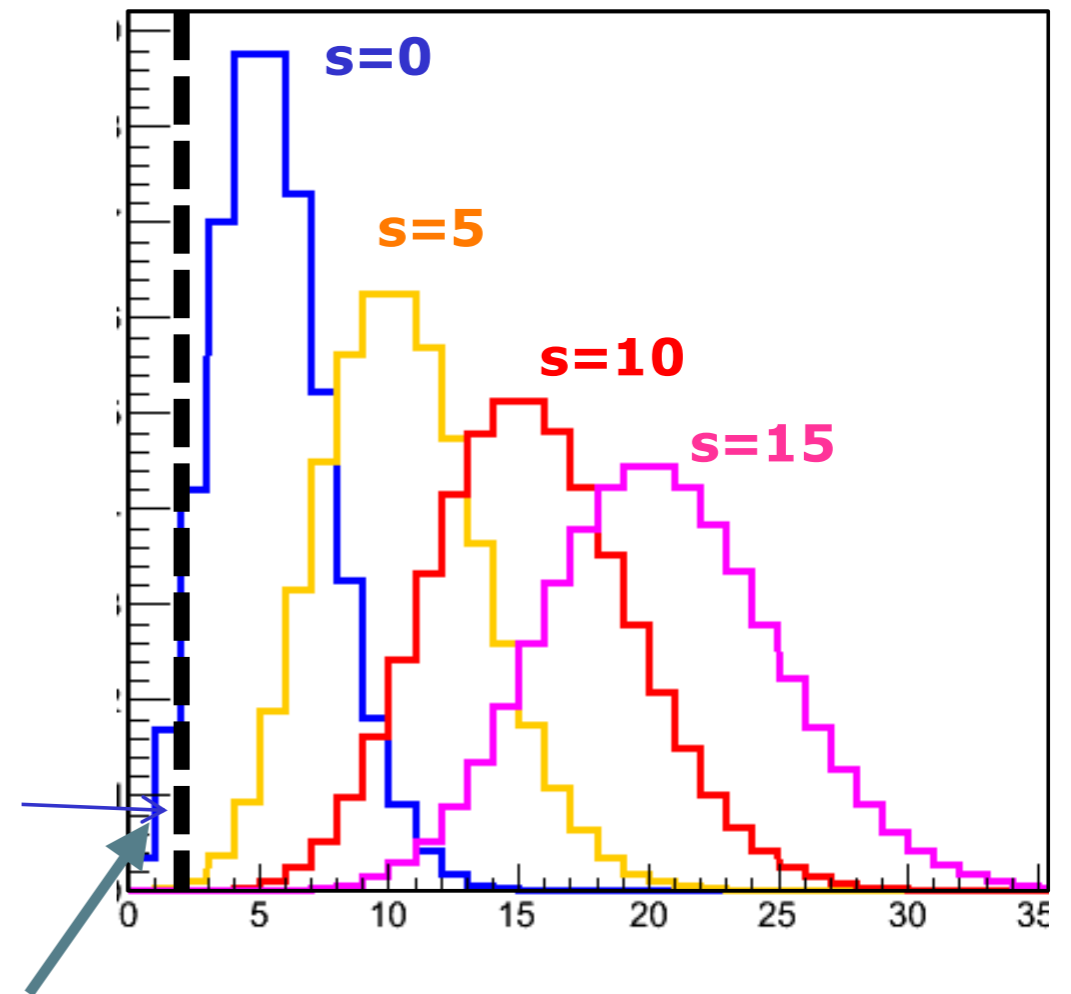
The question is: are my data compatible with the signal+background hypothesis?  
or: what is the probability that  $s+b$  under fluctuates below the observed yield  $N_{obs}$ ?



- Convention: express result as value of  $s$  for which  $p(s+b)=5\% \rightarrow$  " **$s > 6.8$  is excluded at 95% C.L.**"

# Small signals and background under-fluctuations

- $\langle N_{\text{obs}} \rangle = s+b$  leads to the physical requirement that  $N_{\text{obs}} > b$
- A very small expected  $s$  might lead to an anomaly when  $N_{\text{obs}}$  fluctuates far below the expected background,  $b$ .
- At one point DELPHI alone had  $CL_{s+b} = 0.03$  for  $m_H = 116$  GeV
- However, the cross section for 116 GeV Higgs at LEP was too small and Delphi actually had no sensitivity to observe it
- The frequentist would say: Suppose there is a 116 GeV Higgs....  
In 3% of the experiments the true signal would be rejected... (one would obtain a result incompatible or more so with  $m=116$ )  
i.e. a 116 GeV Higgs is excluded at the 97% CL.....



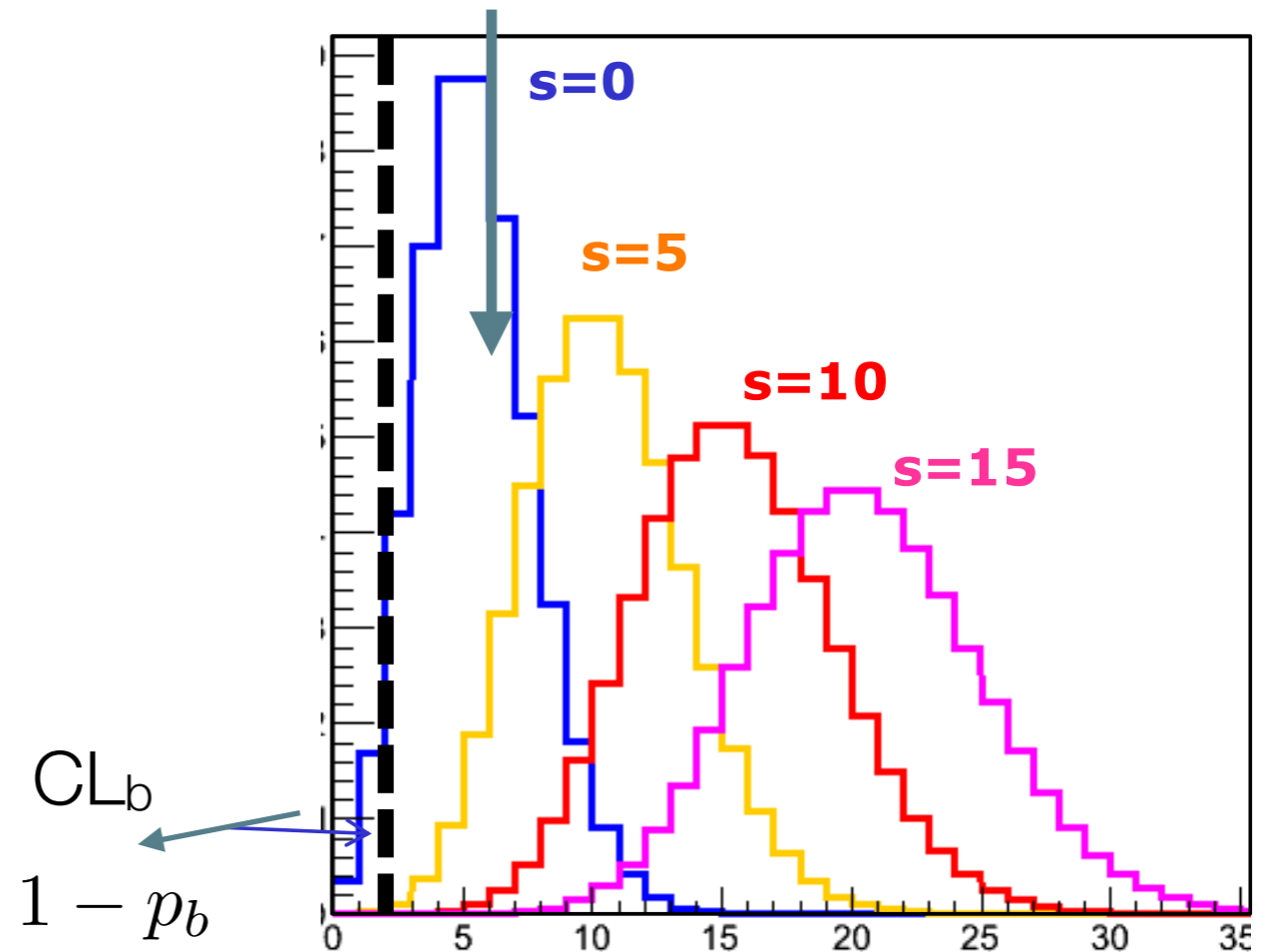
The background hypothesis is not very likely, excluding background automatically excludes any signal

The problem of this method is that it ignores sensitivity to signal. Even if you expect  $s=0.000001$  you would exclude any signal if your background under fluctuates.

# Small signals and background under-fluctuations

$$p_b = \int_{N_{\text{obs}}}^{+\infty} \text{Poisson}(N, b) dN$$

- $\langle N_{\text{obs}} \rangle = s+b$  leads to the physical requirement that  $N_{\text{obs}} > b$
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$$CL_s = \frac{CL_{s+b}}{1 - p_b}$$

if the background hypothesis is not very likely  $1 - p_b \rightarrow 0$  compensating the numerator

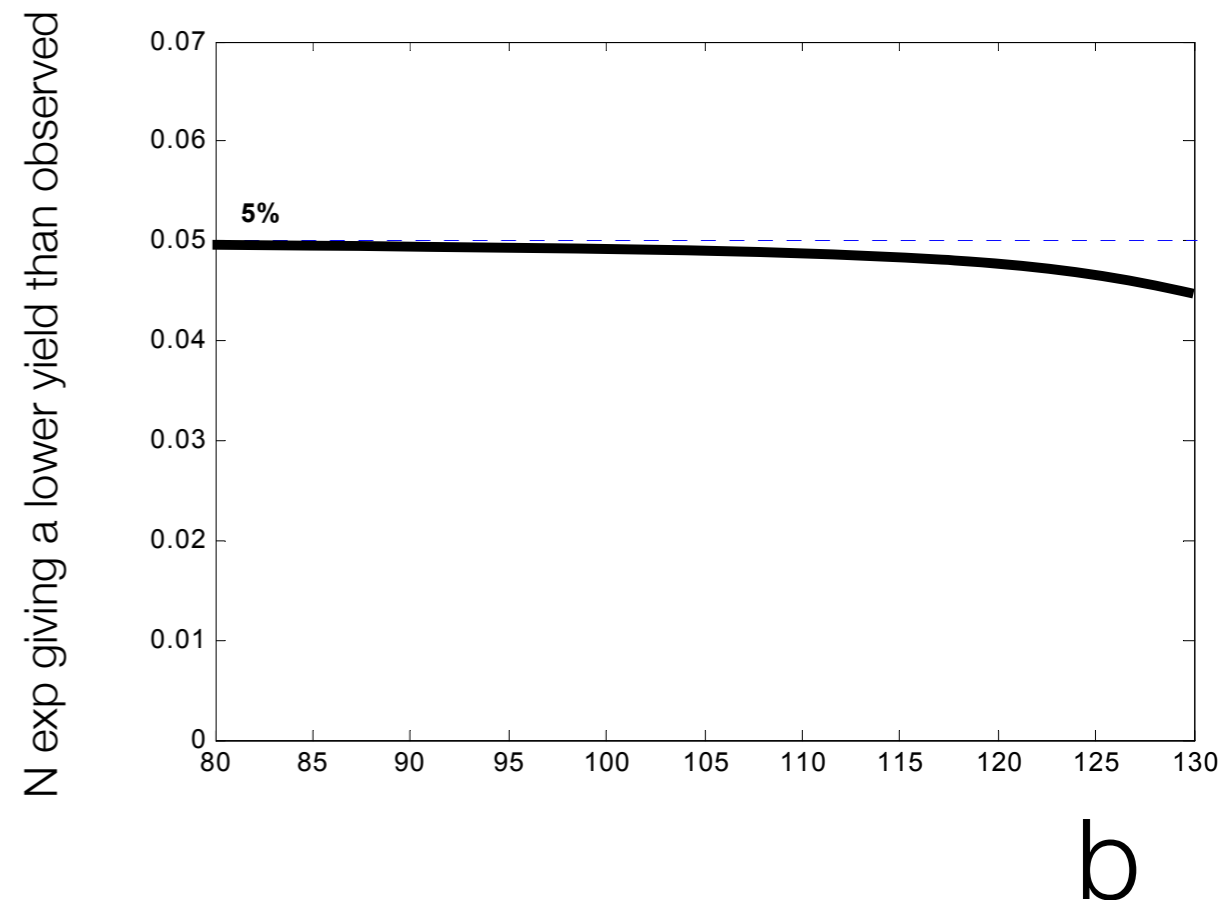
If  $s \ll b$   $CL_{s+b}/CL_b \sim 1$  (no exclusion)

# Coverage

- If we exclude a signal  $s$  at 95% C.L, we want that if we repeat the experiment many times in the  $s$  hypothesis, 95% of the times we get an event yield above the observed number of events, if such property holds we say that the C.L. is well covered
- $CL_{s+b}$  is well covered by definition (we take the tail of the poissonian that integrates to 95% to set the 95% exclusion);
- $CL_s = CL_{s+b}/CL_b$  undercovers: if we set an exclusion at 95% C.L. more than 95% of the experiments will give a number of events above the observed one for the excluded signal hypothesis  $s$

## The problem: under coverage

for low  $\sigma$  signals the true false exclusion rate is below 5% (when quoting according to this recipe a 95% CL exclusion)



# Basic Definitions

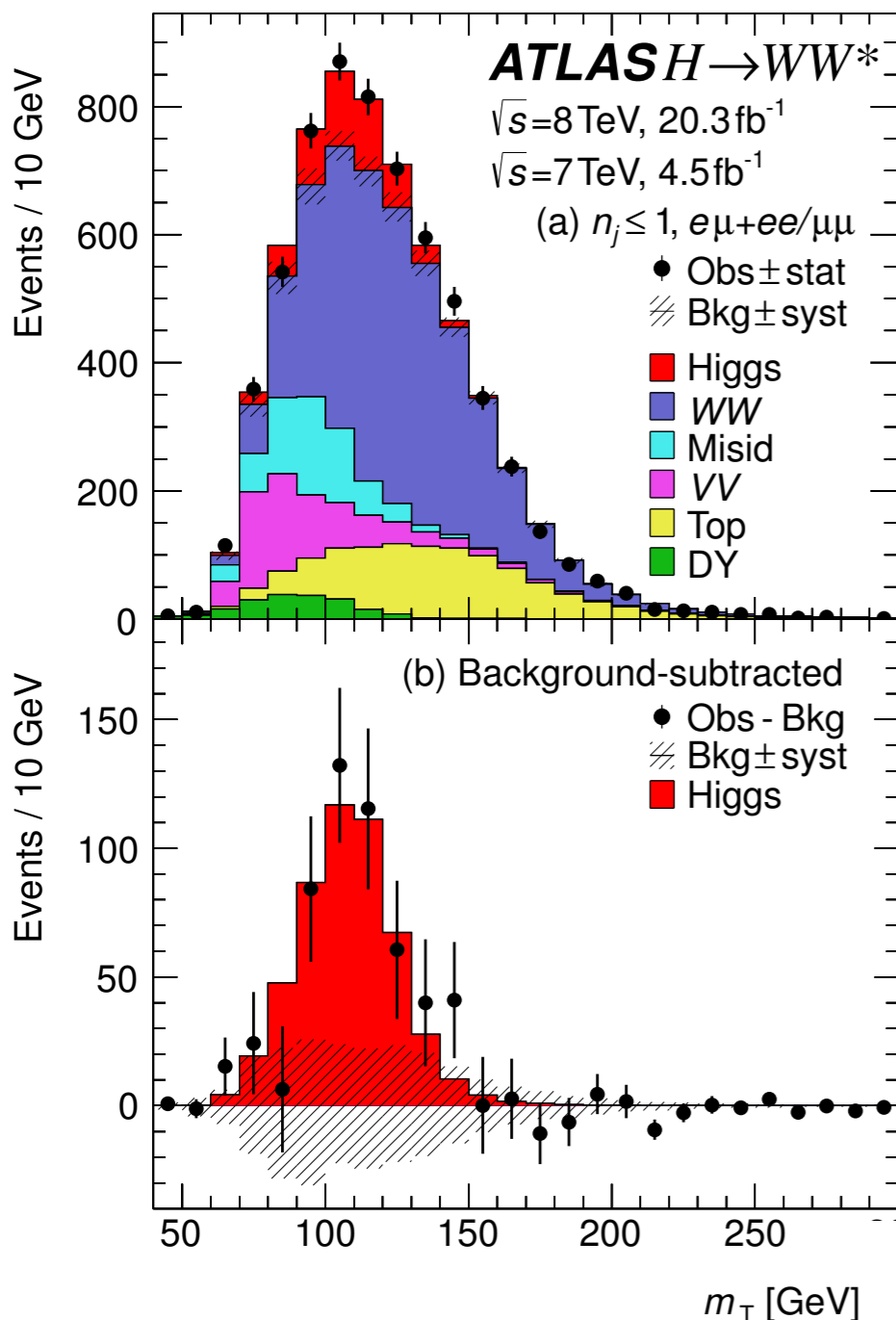
- Normally, we make **one** experiment and try to **estimate from this one experiment the confidence interval** at a specified CL% Confidence Level....
- In simple cases like Gaussians PDFs  $G(s, s_{\text{true}})$  the Confidence Interval can be calculated analytically and ensures a complete coverage  
For example 68% coverage is precise for  $\hat{s} \pm \sigma_{\hat{s}}$



- Typical Higgs search result is not a simple number counting experiment, but looks like this:

- Result is a distribution, not a single number

- Models for signal and background have intrinsic uncertainties



We have two hypotheses:

1.  $H_s$  there is a signal;
2.  $H_b$  there is only background

We have  $K$  bins, we know the acceptance in each bin  $i$ :  $\epsilon_i^b$  for background,  $\epsilon_i^s$  for signal:  $\langle N_i(H_s) \rangle = \epsilon_i^b b + \epsilon_i^s s$

$$L(N_1, \dots, N_K | H_s) = \prod_{i=1}^K \text{Poisson}(N_i, \epsilon_i^b b + \epsilon_i^s s) = \prod_{i=1}^K (\epsilon_i^b b + \epsilon_i^s s)^{N_i} e^{-\epsilon_i^b b - \epsilon_i^s s}$$

$$L(N_1, \dots, N_K | H_b) = \prod_{i=1}^K \text{Poisson}(N_i | \epsilon_i^b b) = \prod_{i=1}^K \frac{(\epsilon_i^b b)^{N_i}}{N_i!} e^{-\epsilon_i^b b}$$

# Neyman-Pearson lemma

$$L(N_1, \dots, N_K | H_s) = \prod_{i=1}^K \text{Poisson}(N_i, \epsilon_i^b b + \epsilon_i^s s) = \prod_{i=1}^K (\epsilon_i^b b + \epsilon_i^s s)^{N_i} e^{-\epsilon_i^b b - \epsilon_i^s s}$$

$$L(N_1, \dots, N_K | H_b) = \prod_{i=1}^K \text{Poisson}(N_i | \epsilon_i^b) = \prod_{i=1}^K \frac{(\epsilon_i^b)^{N_i}}{N_i!} e^{-\epsilon_i^b}$$

The most powerful discriminant is the likelihood ratio

$$\lambda(N_1, \dots, N_K | H_s, H_b) = \frac{L(N_1, \dots, N_K | H_s)}{L(N_1, \dots, N_K | H_b)}$$

A selection that maximises  $\lambda$  is such that, for a given signal efficiency  $\epsilon_s$ , it allows to have the lowest background efficiency  $\epsilon_b$

# Likelihood ratio for discovery

Discovery: what is the probability that the observed data are due to a background fluctuation?

Hypothesis 1: There is only background (we want to falsify this)

Hypothesis 2: There is a signal with arbitrary normalisation

If we expect  $\mathbf{s}$  events from MC simulation of a signal with cross section  $\sigma_{\mathbf{s}}$ , we test the  $\mathbf{s}$  hypothesis with an arbitrary multiplicative factor  $\mu$  (signal strength), i.e. we test an arbitrary signal yield  $\mu \cdot \mathbf{s}$ .

This means that if data are better described by a signal, we prefer it to the background hypothesis (in this sense we increase the separation power)

Assuming  $b$  and  $s$  are known without uncertainties (no systematic uncertainties)

$$\lambda(N_1, \dots, N_K | 0) = \frac{L(N_1, \dots, N_K | b)}{L(N_1, \dots, N_K | b + \hat{\mu}s)}$$

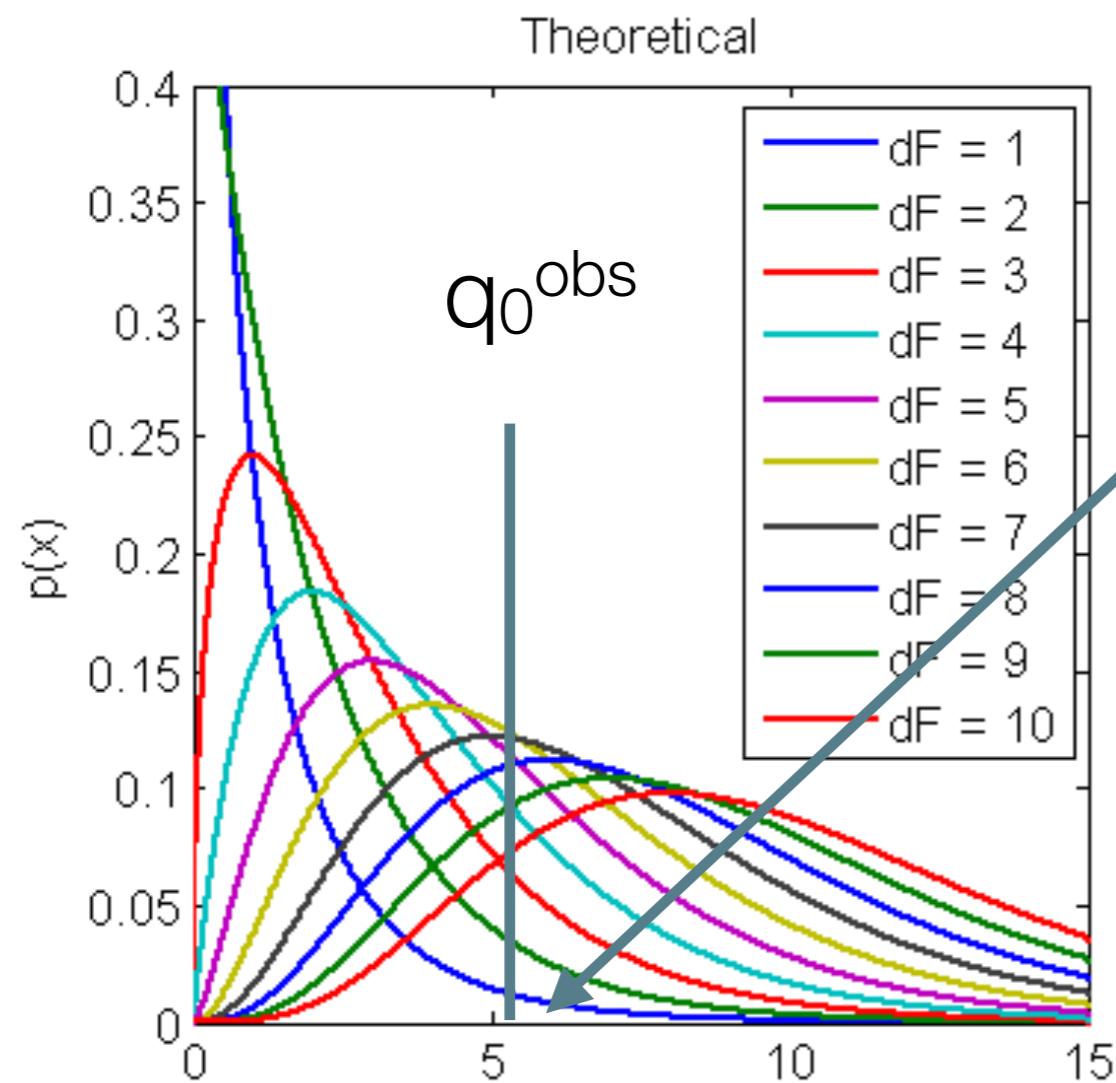
fixed number

$\hat{\mu}$  is obtained by maximising the denominator of  $\lambda$

# Likelihood ratio for discovery (the test statistics)

$$q_0 = -2 \ln \left[ \frac{L(N_1, \dots, N_K | b)}{L(N_1, \dots, N_K | b + \hat{\mu} s)} \right]$$

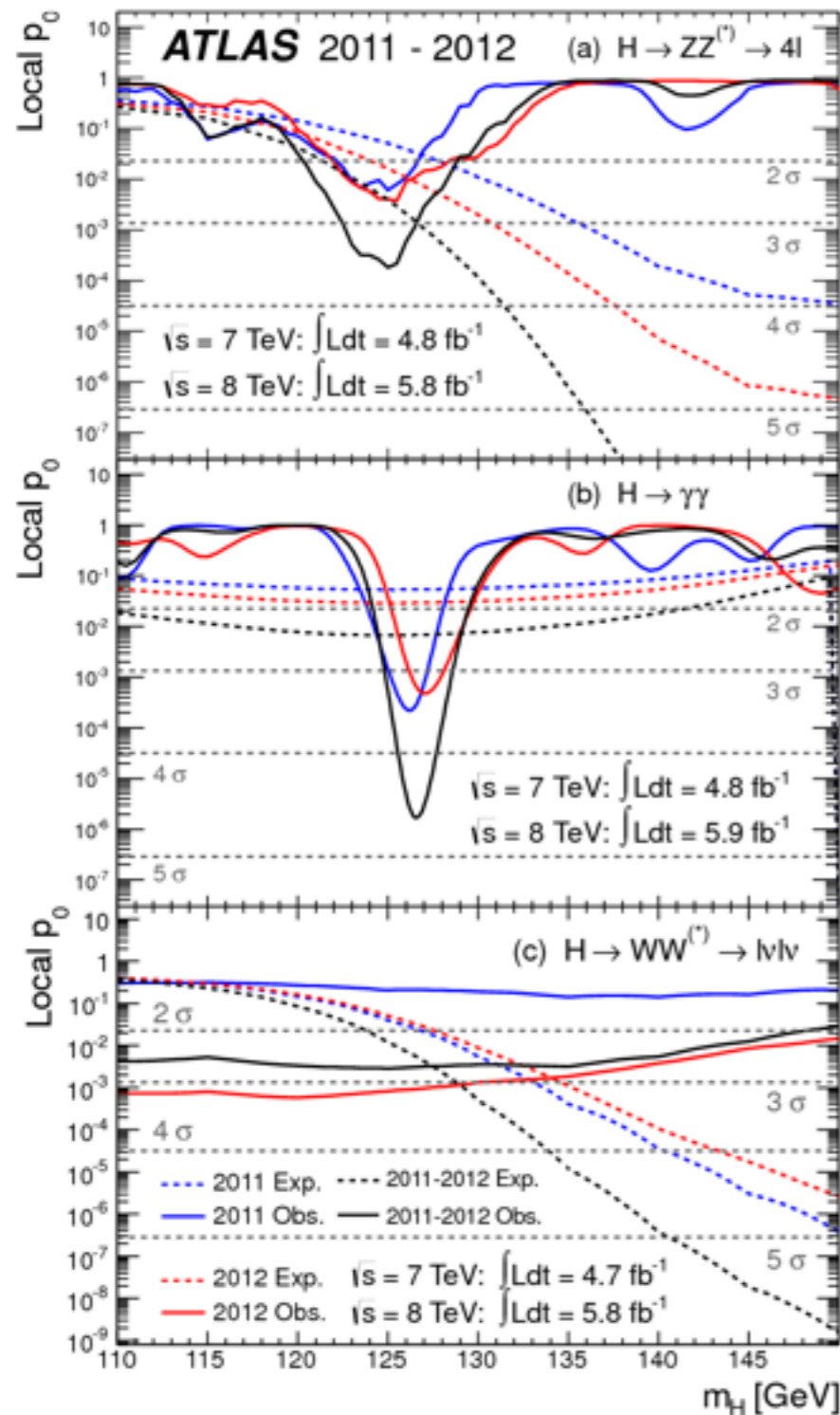
$q_0$  distributes according a  $\chi^2$  distribution with 1 degree of freedom (dF)



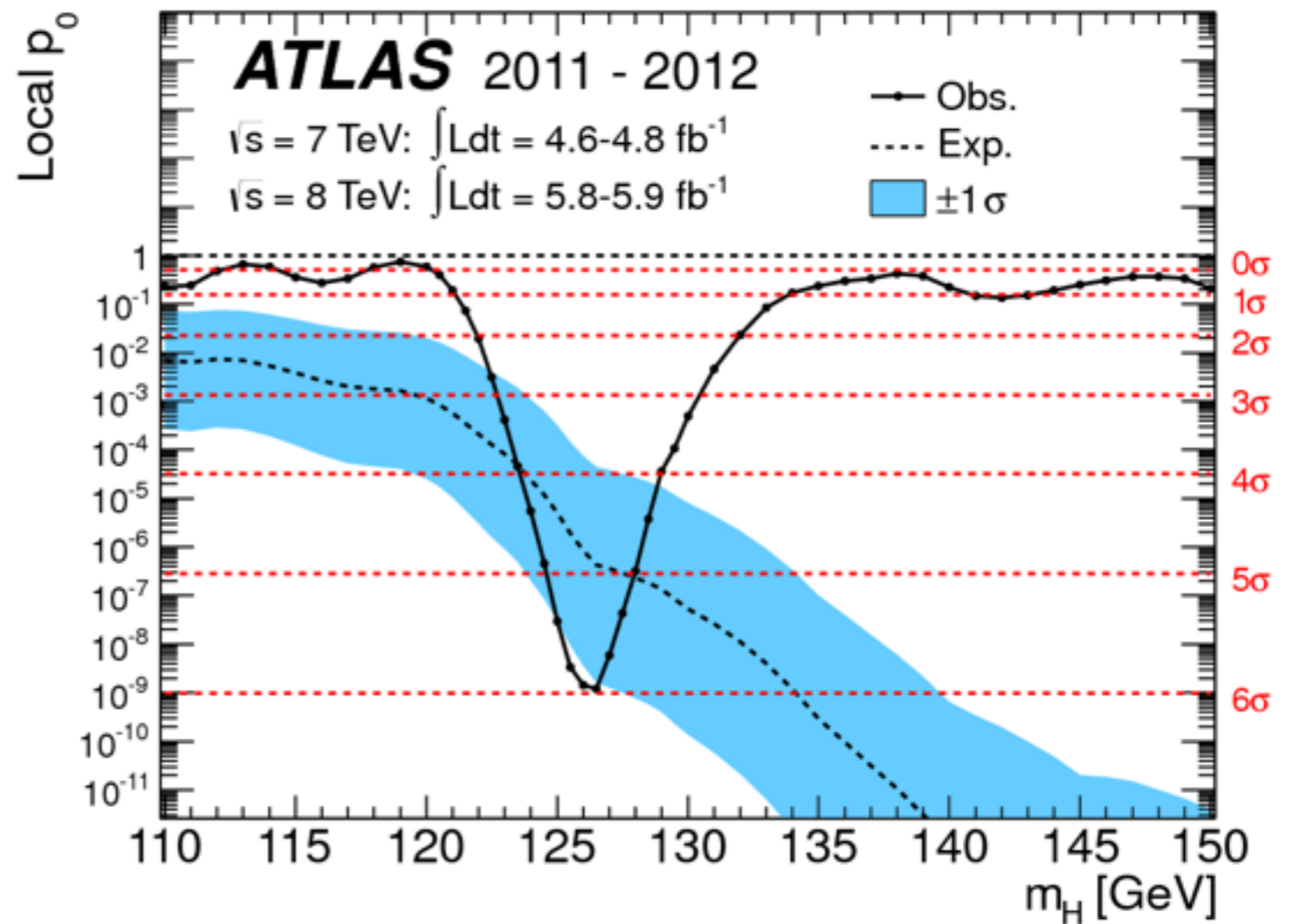
This area is the probability to have a  $q_0$  value higher than the observed one (it is the  $p_0$ )

data are not background-like,  $L$  small,  $q_0$  larger.

# Higgs discovery



$p_0$  is computed for each mass hypothesis, the mass hypothesis changes the signal distributions (this plot would have no shape in case of a single count experiment)

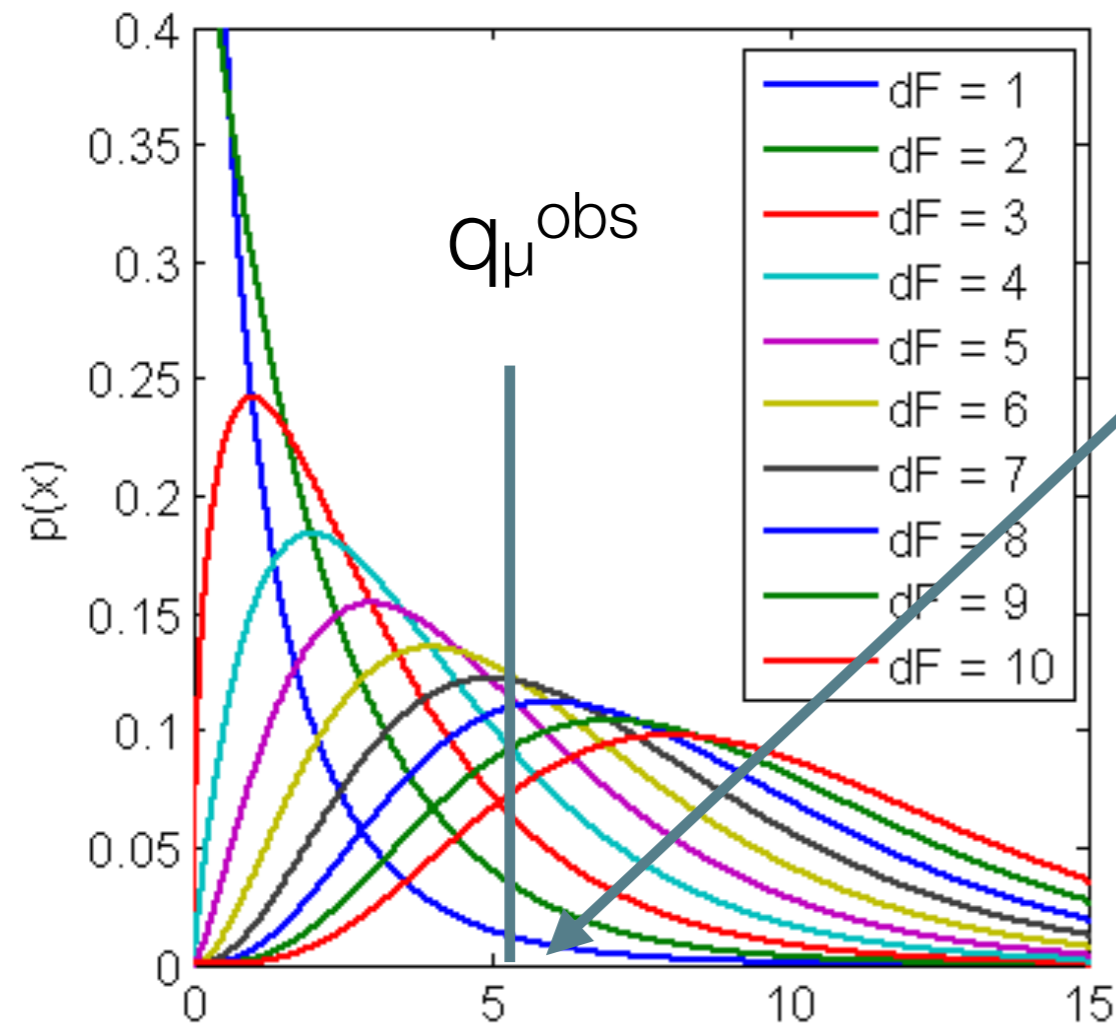


# Likelihood ratio for exclusion of signal strength $\mu$

- 1)  $H_1$  hypothesis to have a signal that is  $\mu$  times the SM expectation;
- 2)  $H_\mu$  hypothesis to have any signal with signal strength  $\mu$

$$q_\mu = -2 \ln \left[ \frac{L(N_1, \dots, N_K | b + \mu s)}{L(N_1, \dots, N_K | b + \hat{\mu} s)} \right]$$

Theoretical



$q_\mu \geq 0$  and distributes according a  $\chi^2$  distribution with 1 degree of freedom

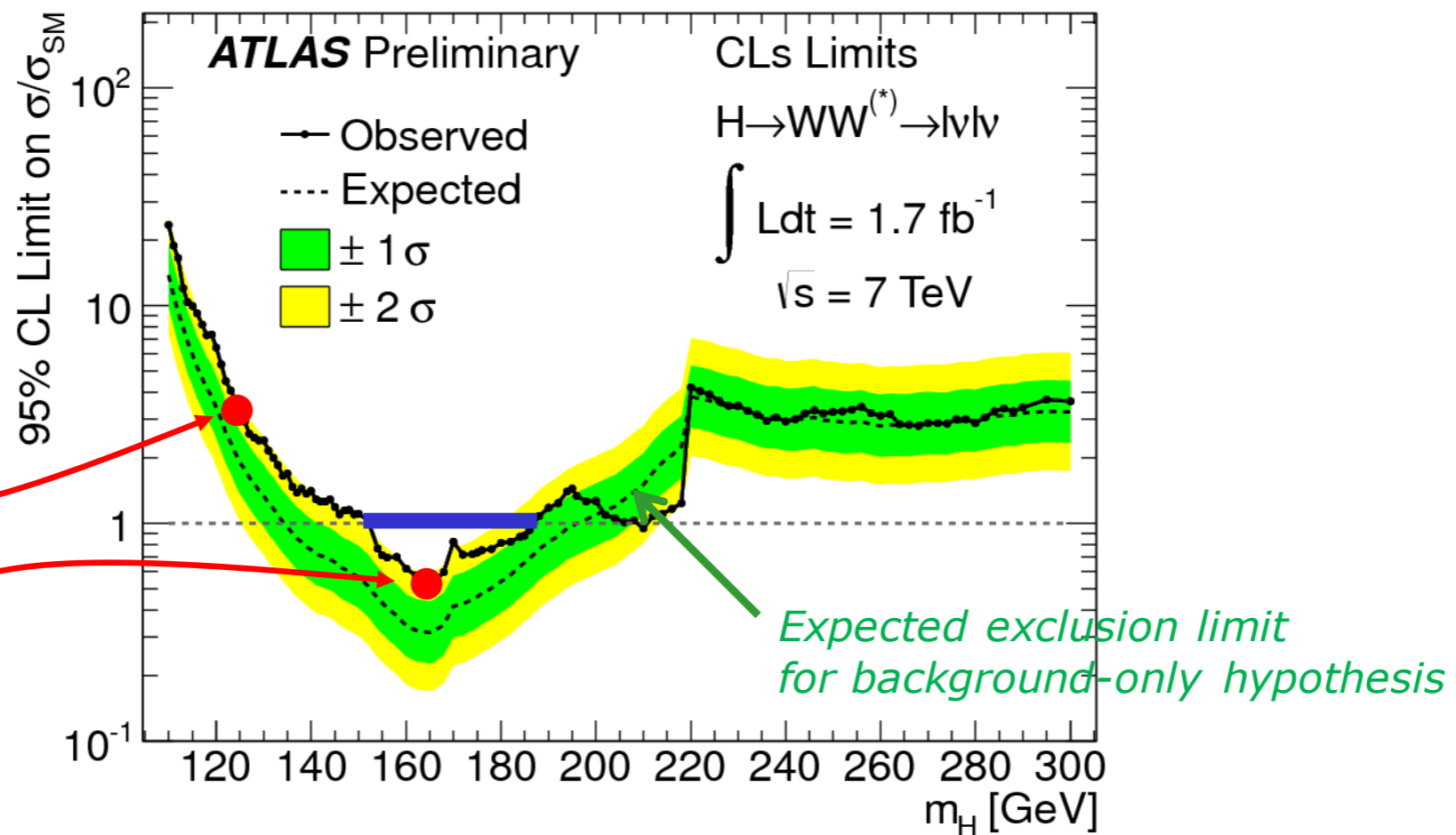
We say that a signal with a cross section  $\mu$  times larger than the SM is excluded at 95% C.L. if  $P(q_\mu > q_\mu^{\text{obs}}) < 5\%$ , coverage is exact

dF: number of degree of freedom



## Example – 95% Exclusion limit vs $m_H$ for $H \rightarrow WW$

**Example point:**  $\approx 3 \times$  SM  $H \rightarrow WW$  cross-section excluded at  $m_H = 125$  GeV



**Example point:**  $\approx 0.5 \times$  SM  $H \rightarrow WW$  cross-section excluded at  $m_H = 165$  GeV

Higgs with  $1.0 \times$  SM cross-section excluded at 95% CL for  $m_H$  in range [150, ~187]

# How does likelihood ratio behaves for small signals?

Let's assume to have 1 bin:

$$q_1 = -2\ln \left[ \frac{L(N_1, b + s)}{L(N_1, b + \hat{\mu}s)} \right] = -2\ln \left[ \frac{\text{Poisson}(N_1, b + s)}{\text{Poisson}(N_1, b + \hat{\mu}s)} \right]$$

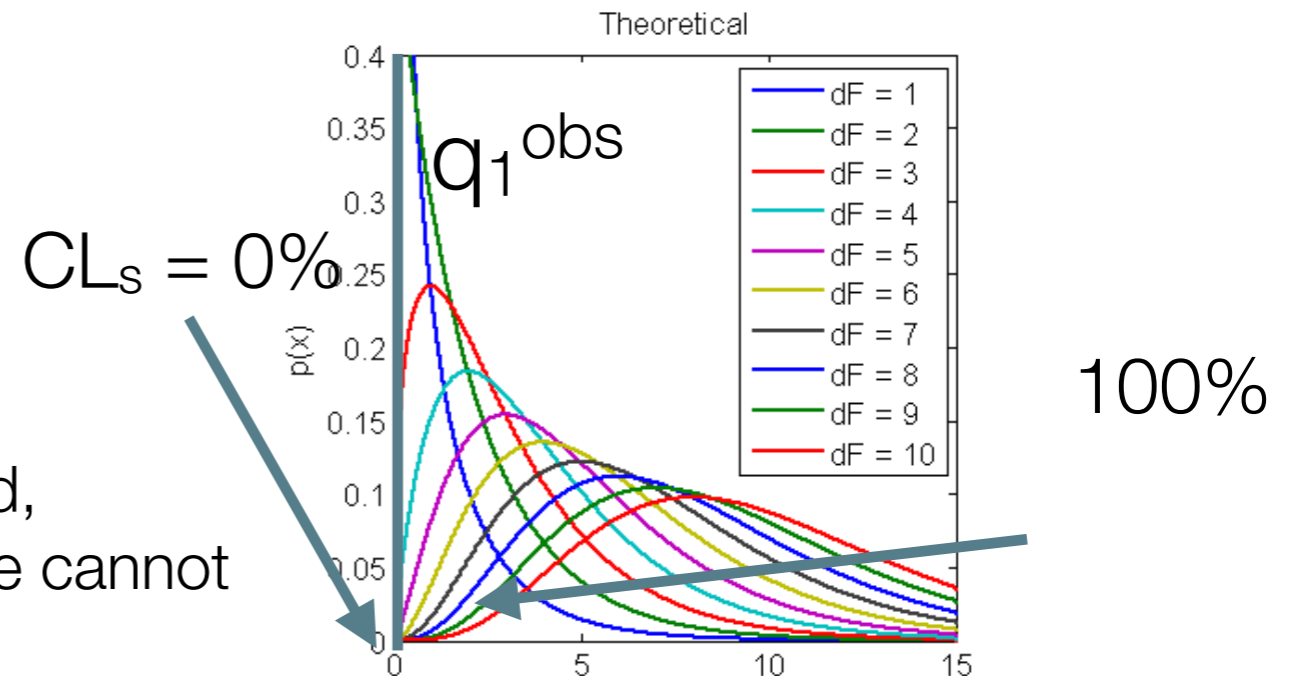
In order to evaluate  $\hat{\mu}$

$$\frac{dL}{d\mu} = \frac{d}{d\mu} \frac{(b + \mu s)^{N_1}}{N_1!} e^{-b - \mu s} = \frac{s(b + \mu s)^{N_1 - 1}}{N_1!} e^{-b - \mu s} (N_1 - b - \mu s)$$

If data under fluctuate below  $b$  the derivative is negative, so  $L$  decreases with  $\mu$  and its maximum is at  $\mu = 0 \rightarrow \hat{\mu} = 0$

$$q_1 = -2\ln \left[ \frac{L(N_1, b + s)}{L(N_1, b)} \right]$$

This term works like  $1 - p_b$  in the  $CL_s$  method, if  $s \ll b$   $L(N_1, b + s) \sim L(N_1, b)$  and  $q_1 = 0$ , so we cannot exclude the signal at any confidence level.





# Summary

---

$CL_{s+b}$ : coverage ok, but dangerous for  $s \ll b$ ;

$CL_s$ : ok, but undercoverage

Likelihood ratio: coverage ok, protected for  $s \ll b$   
can be used to test distributions

Up to know, discussed only about observation and exclusions, what about measurements?

1) Who cares of measurements?

2) Measurements are useful to look for deviations from SM, tune MC, check SM prediction: i.e.  $\sin(2\beta)$ , N.P. Kobayashi-Maskawa

I measure the Higgs mass  $m_H$ , what an error on  $m_H$  means?

# Bayesian versus frequentist (the religious war)

---

1) the error on  $m_H$  means that there is 68% probability that the true  $m_H$  is between  $m_H - \sigma_{m_H}$  and  $m_H + \sigma_{m_H}$

What this probability is?  $m_H$  has only one value... Do we mean that if we generate 100 universes in the 68% of cases  $m_H$  will lie in that interval?

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~~What this probability is?  $m_H$  has only one value... Do we mean that if we generate 100 universes in the 68% of cases  $m_H$  will lie in that interval?~~

2) it is our degree of believe..., it is like a bet: What is the probability that Juventus will win the Italian league?

In this case it is subjective, and it tries to estimate an objective number:

Given the parameters I know about Juventus potentiality to win a match, if I take a sample of those parameters and try to simulate a match, what is the fraction of times Juventus will win?

There is always something subjective in this.

# Frequentist approach (Neyman construction of conf. belt)

If the Higgs mass is  $m_H$ , 68% of the experiments will measure an interval  $[m_H^{\text{meas}} - \sigma, m_H^{\text{meas}} + \sigma]$  that will contain the value  $m_H$ .

There is no subjective statement, the probability has a strictly frequentist definition

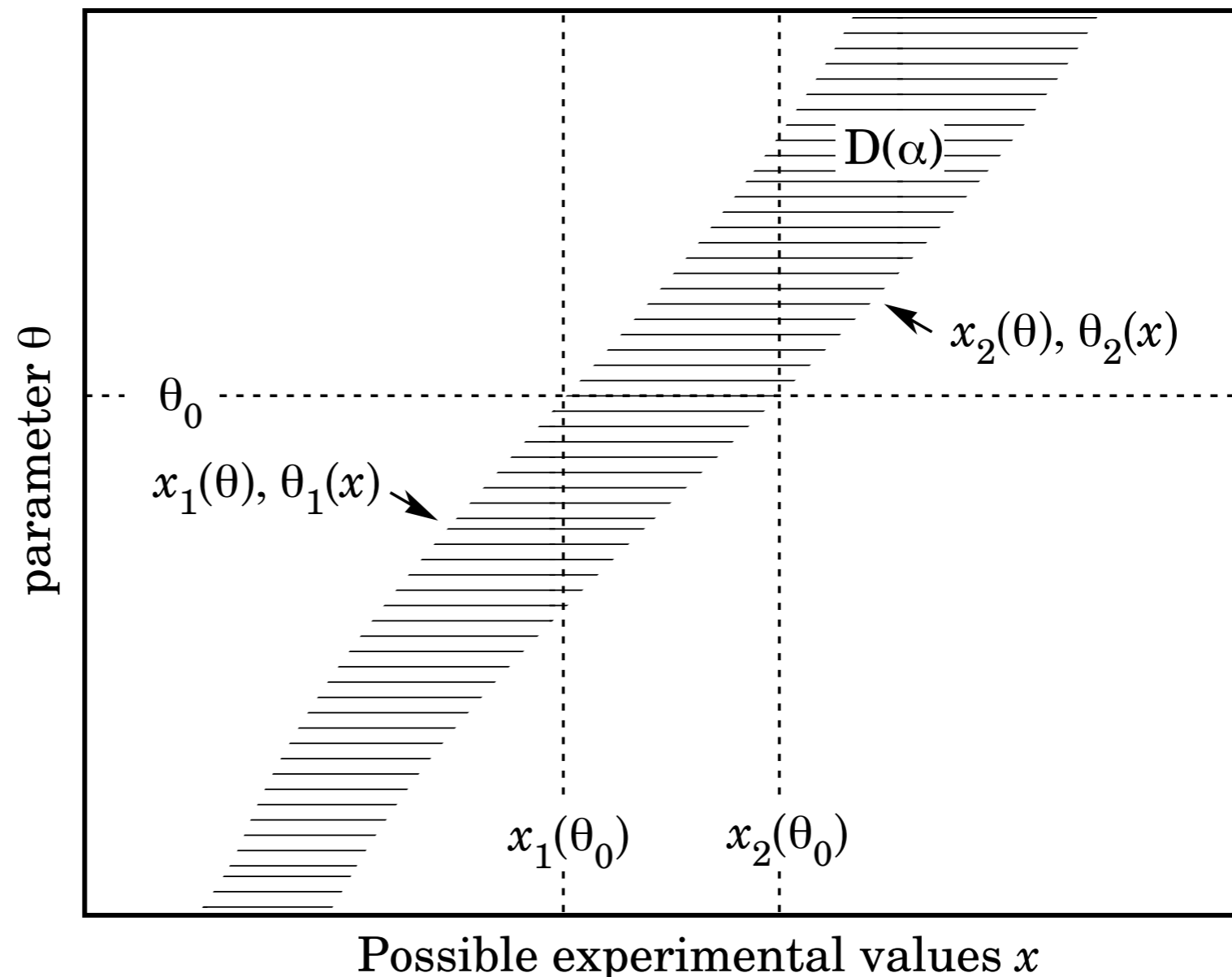
Neyman construction of confidence belt:

$f(x; \theta)$  distribution of  $x$  given  $\theta$

$$P(x_1 < x < x_2; \theta) = \int_{x_1}^{x_2} f(x; \theta) dx \geq 1 - \alpha$$

for  $1\sigma$   $1-\alpha=0.68$

when we change  $\theta$  we get two curves for  $x_1$  and  $x_2$ . We build the confidence belt using simulation.



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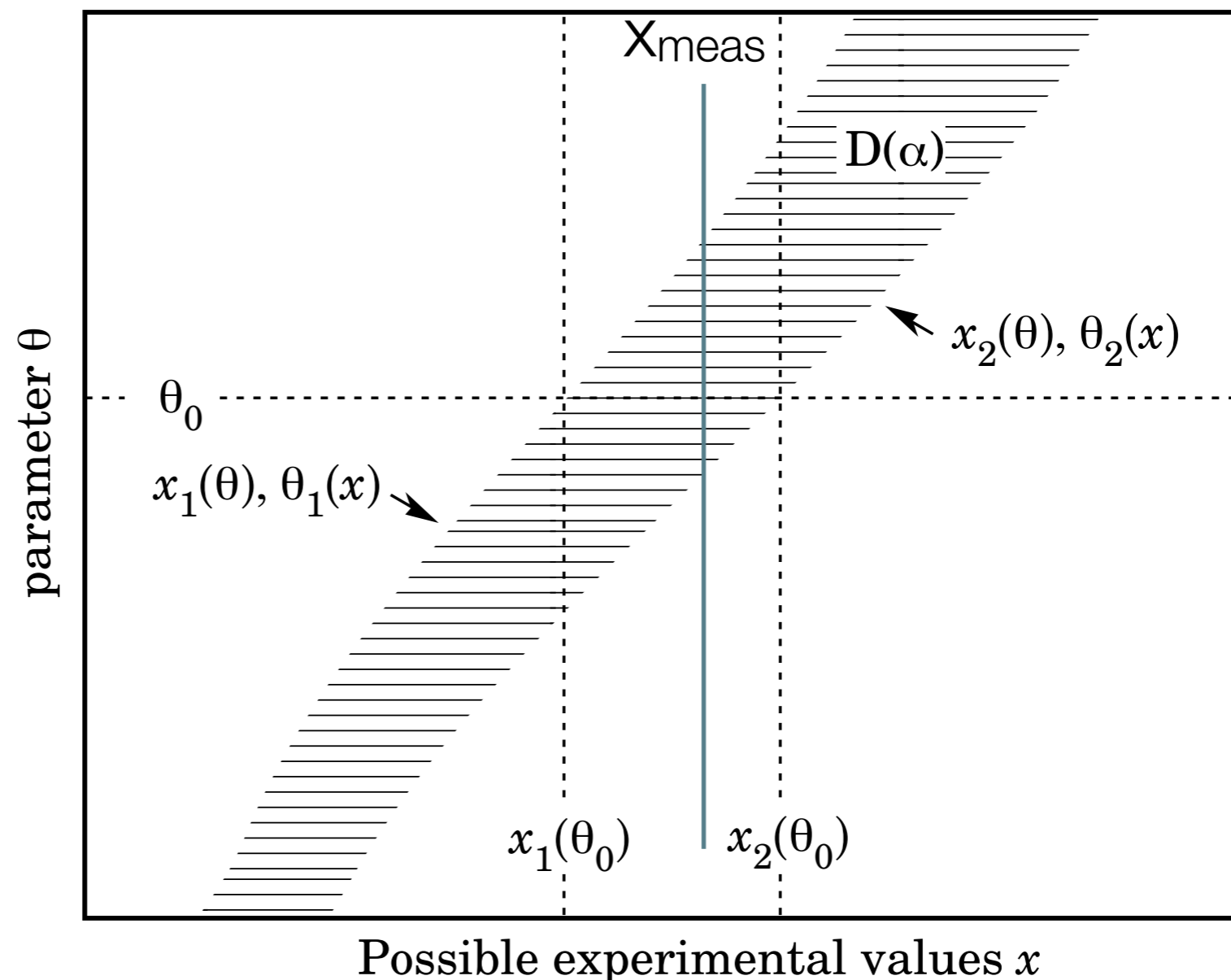
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Then we measure  $x_{\text{meas}}$



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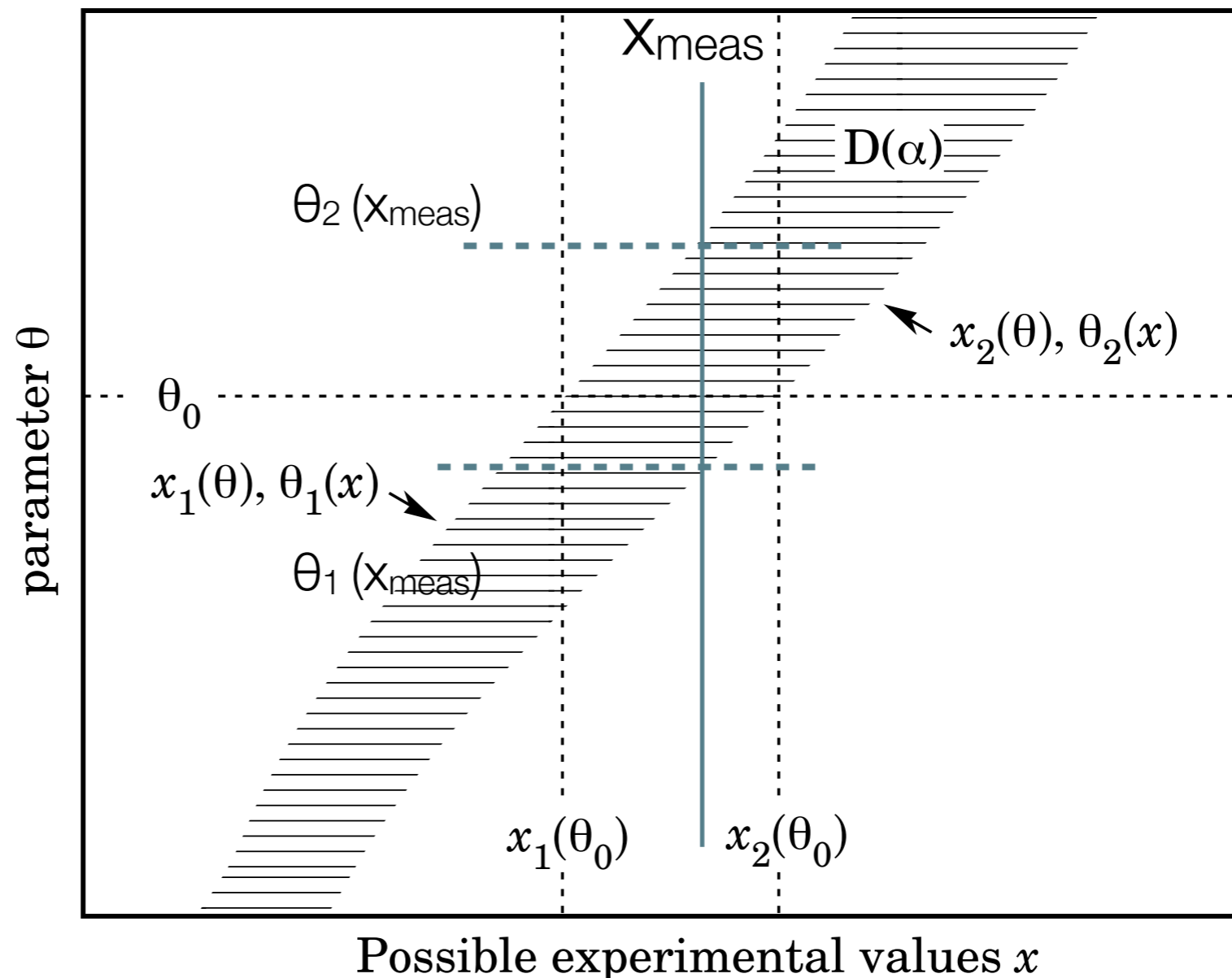
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then we measure  $x_{\text{meas}}$

we set as interval for  $\theta$  the range  $[\theta_1, \theta_2]$ .

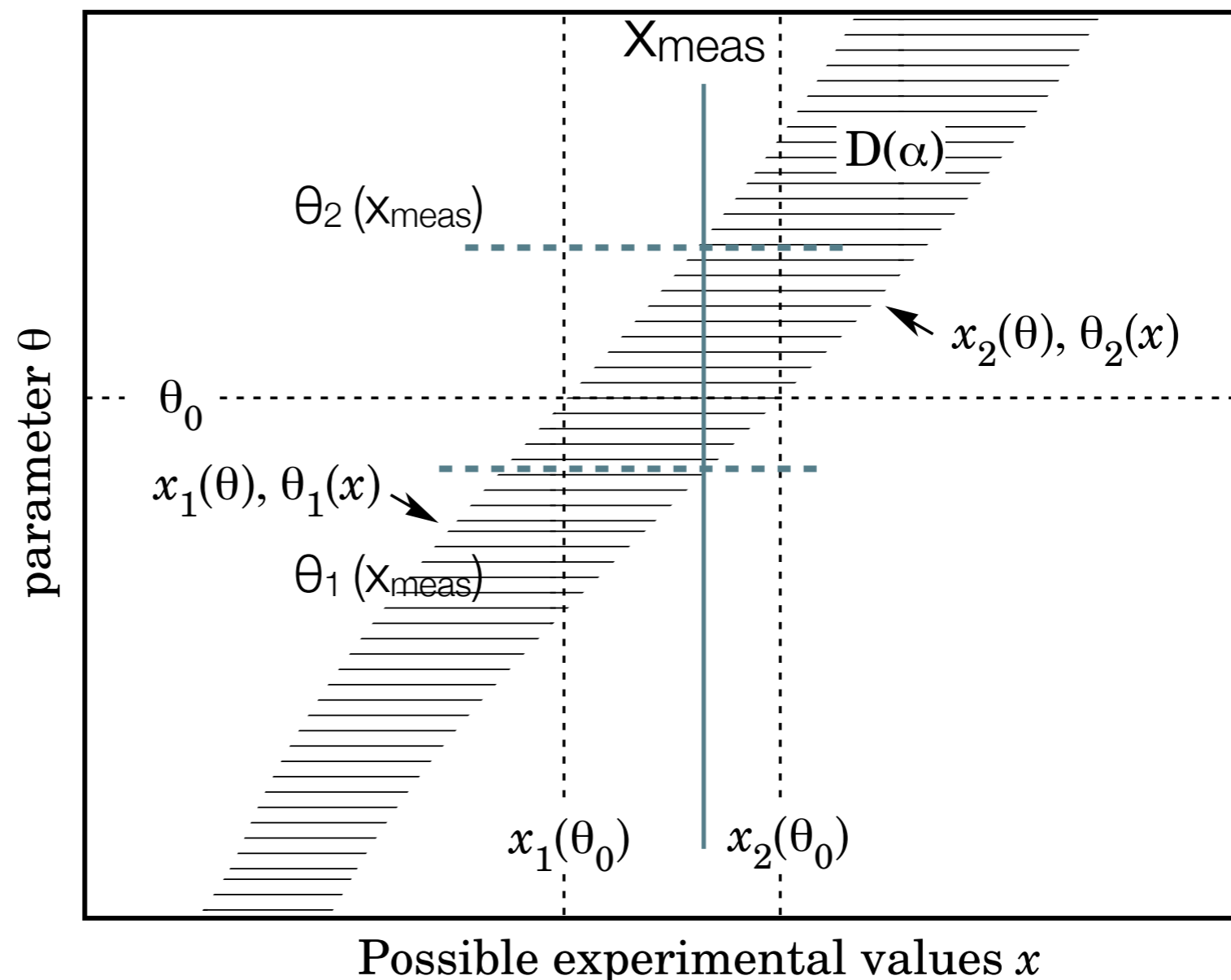


# Frequentist approach (Neyman constr. of conf. belt)

If the Higgs mass is  $m_H$ , 68% of the experiments will measure an interval  $[m_H^{\text{low}}, m_H^{\text{high}}]$  that will contain the value  $m_H$ .

There is no subjective statement, the probability has a strictly frequentist definition

if  $\theta_0$  is the true value, we will have  $x_1 < x_{\text{meas}} < x_2$  in  $1-\alpha$  of the cases (experiments) and consequently  $\theta_1 < \theta_0 < \theta_2$  in the same fraction of cases, where  $\theta_1$  and  $\theta_2$  are random variables that is the outcome of the experiment.

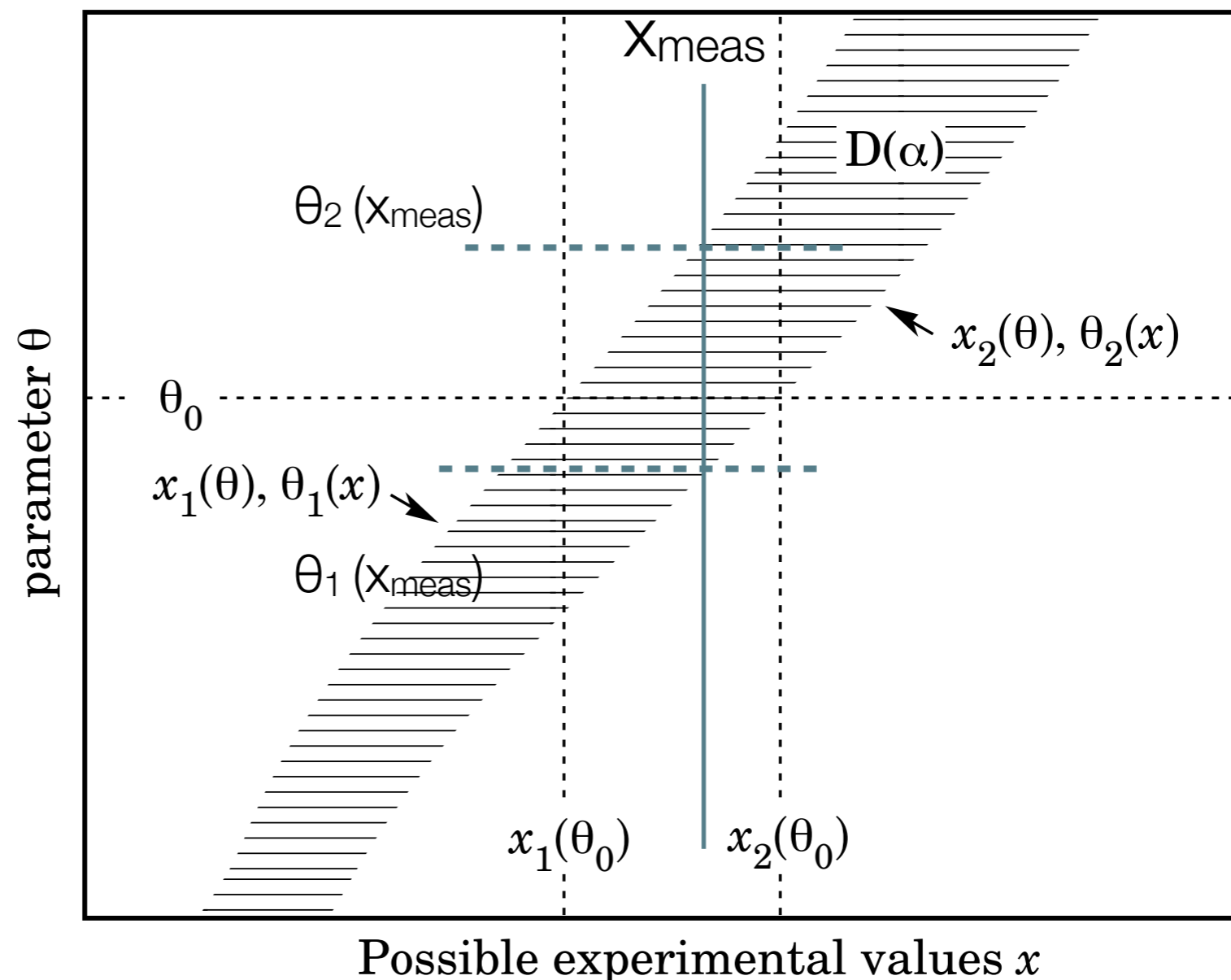




# Frequentist approach (Neyman constr. of conf. belt)

$$P(x_1 < x < x_2; \theta) = \int_{x_1}^{x_2} f(x; \theta) dx \geq 1 - \alpha$$

it is not enough to define  $x_1$  and  $x_2$ , need to add further informations: i.e. central values  $x_c$  is such that  $P(x < x_1) = P(x > x_2) = \alpha/2$



# The Bayesian Way

likelihood of measured  $x$  given  $\theta$

new distribution for  $\theta$ , improved  
after the measurement of  $x$

a-priori distribution for  $\theta$

$$p(\theta | x) = \frac{L(x | \theta) \pi(\theta)}{\int L(x | \theta) \pi(\theta) d\theta}$$

- Can the model have a probability?
- We assign a degree of belief in models parameterized by  $\theta$
- Instead of talking about confidence intervals we talk about credible intervals, where  $p(\theta|x)$  is the credibility of  $\theta$  given the data.

if  $\theta$  and  $x$  are random variables,  
this is a theorem otherwise it is the  
definition of  $p(\theta, x)$

# Nuisance Parameters (Systematics)

- Nuisance – a thing causing inconvenience or annoyance (Oxford Dictionary)
- **Systematic Errors** are equivalent in the statisticians jargon to **Nuisance parameters** – parameters of no interest...  
Will the Physicist ever get used to this jargon?
- D. Sinervo classified uncertainties into three classes classes:
  - **Class I:** Statistics like – uncertainties that are reduced with increasing statistics. Example: Calibration constants for a detector whose precision of (auxiliary) measurement is statistics limited
  - **Class II:** Systematic uncertainties that arise from one's limited knowledge of some data features and cannot be constrained by auxiliary measurements ... One has to do some assumptions. Example: Background uncertainties due to fakes, isolation criteria in QCD events, shape uncertainties.... These uncertainties do not normally scale down with increasing statistics
  - **Class III:** The “Bayesian” kind... The theoretically motivated ones... Uncertainties in the model, Parton Distribution Functions, Hadronization Models.....

# Nuisance Parameters (Systematics)

- There are two related issues:
  - Classifying and estimating the systematic uncertainties
  - Implementing them in the analysis
- The physicist must make the difference between cross checks and identifying the sources of the systematic uncertainty.
  - Shifting cuts around and measure the effect on the observable...  
Very often the observed variation is dominated by the statistical uncertainty in the measurement.

# Treatment of Systematic Errors, the Bayesian Way

- Marginalization (Integrating) (The C&H Hybrid)
  - Integrate  $L$  over possible values of nuisance parameters (weighted by their prior belief functions -- Gaussian, gamma, others...)
  - Consistent Bayesian interpretation of uncertainty on nuisance parameters
- Note that in that sense MC “statistical” uncertainties (like background statistical uncertainty) are systematic uncertainties

## Integrating Out The Nuisance Parameters (Marginalization)

$$p(\theta, \lambda | x) = \frac{L(x | \theta, \lambda)\pi(\theta, \lambda)}{\int L(x | \theta, \lambda)\pi(\theta, \lambda)d\theta d\lambda} = \frac{L(x | \theta, \lambda)\pi(\theta, \lambda)}{\text{Normalization}}$$

- Our degree of belief in  $\theta$  is the sum of our degree of belief in  $\theta$  given  $\lambda$  (nuisance parameter), over “all” possible values of  $\lambda$

$$p(\theta | x) = \int p(\theta, \lambda | x)d\lambda$$

# Priors

$$P(\theta | data) \sim \int L(data | \theta, \lambda) \pi(\lambda) d\theta d\lambda$$

- A prior probability is interpreted as a description of what we believe about a parameter preceding the current experiment
  - **Informative Priors:** When you have some information about  $\lambda$  the prior might be informative (Gaussian or Truncated Gaussians...)
    - Most would say that subjective informative priors about the parameters of interest should be avoided (“....what's wrong with assuming that there is a Higgs in the mass range [115,140] with equal probability for each mass point?”)
    - Subjective informative priors about the Nuisance parameters are more difficult to argue with
      - These Priors can come from our assumed model (Pythia, Herwig etc...)
      - These priors can come from subsidiary measurements of the response of the detector to the photon energy, for example.
      - Some priors come from subjective assumptions (theoretical, prejudice symmetries....) of our model

# Priors – Uninformative Priors

- **Uninformative Priors:** All priors on the parameter of interest should be uninformative....

IS THAT SO?

Therefore flat uninformative priors are most common in HEP.

- When taking a uniform prior for the Higgs mass  $[115, \infty]$ ... is it really uninformative? do uninformative priors exist?
  - When constructing an uninformative prior you actually put some information in it...
- **But** a prior flat in the coupling  $g$  will not be flat in  $\sigma \sim g^2$   
Depends on the metric!  
( $\rightarrow$  try Jeffrey Priors)
  - Moreover, flat priors are improper and lead to serious problems of undercoverage (when one deals with  $>1$  channel, i.e. beyond counting, one should AVOID them

–See Joel Heinrich Phystat 2005



# Choice of Priors

- A.W.F. Edwards: “Let me say at once that I can see no reason why it should always be possible to eliminate nuisance parameters. Indeed, one of the many objections to Bayesian inference is that it always permits this elimination.”

Anonymous: “Who the ---- is A.W.F. Edwards...” [http://en.wikipedia.org/wiki/A.\\_W.\\_F.\\_Edwards](http://en.wikipedia.org/wiki/A._W._F._Edwards)

- But can you really argue with subjective informative priors about the Nuisance parameters (results of analysis are aimed at the broad scientific community.. See talk by Leszek Roszkowski constrained MSSM)
- Choosing the right priors is a science by itself
- Should we publish Bayesian (or hybrid ) results with various priors?
- Should we investigate the coverage of Bayesian (credible) intervals?
- Anyway, results should be given with the priors specified

# C&H Hybrid Method

- This method is coping with the Nuisance parameters by averaging on them weighted by a posterior.
- The Bayesian nature of the calculation is in the Nuisance parameters only....
- Say in a subsidiary measurement  $y$  of  $b$ , then the posterior is  $p(b|y)$ ;  $\mu$  is the  $x$  expectation.
- C&H will calculate the p-value of the observation  $(x_o, y_o)$

$$p(x_o, y_o | \mu) = \int_0^{\infty} p(x_o | y_o, \mu) p(b | y_o) db$$

$$p(b | y_o) = \frac{p(y_o | b) p(b)}{p(y_o)}$$

$$p(y_o | b) = G(y_o | b, \sigma_b)$$

$$p(b) \text{ uniform}$$

Note:

The original C&H used the Luminosity as the Nuisance parameter....

# The Profile Likelihood Method

$$\ell(s) = \frac{L(s, \hat{b})}{L(\hat{s}, \hat{b})} \Rightarrow Q(s) = \frac{L(s, \hat{b})}{L(\hat{s}, \hat{b})} \quad -2 \ln Q(s) = -2 \ln \frac{L(s, \hat{b})}{L(\hat{s}, \hat{b})} \rightarrow \chi^2(s)$$

$$\Delta\chi^2 = 2.7 \rightarrow 90\% \text{ C.I.}$$

- The advantages of the Profile Likelihood
  - It has been with us for years..... (MINOS of MINUIT)  
(Fred James)
  - In the asymptotic limit it is approaching a  $\chi^2$  distribution

**F. James**, e.g. Computer Phys. Comm. 20 (1980) 29 -35  
W. Rolke, A. Lopez, J. Conrad. Nucl. Inst. Meth A 551 (2005) 493-503

# The Profile Likelihood for Significance Calculation

- A counting experiment with background uncertainty

$$L(n, b_{meas} | \mu, s, b) = Poiss(n | \mu s + b)G(b_{meas} | b, \sigma_b)$$

- The Likelihood-ratio

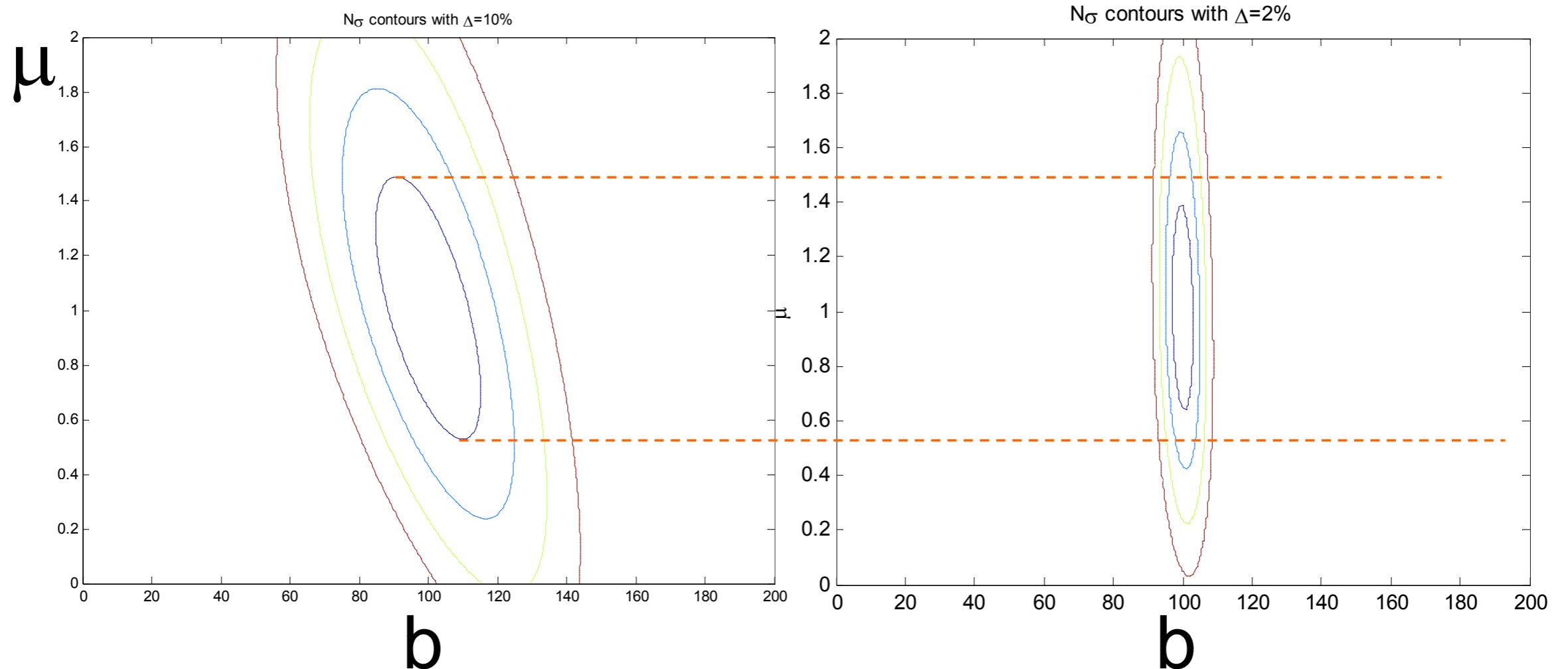
$$\lambda(\mu, b) = \frac{L(n, b_{meas} | \mu, s, b)}{L(n, b_{meas} | \hat{\mu}, s, \hat{b})}$$

Where  $\hat{s}, \hat{b}$  are MLE

$-2 \log \lambda(\mu)$  is distributed as  
a  $\chi^2$  with N degrees of freedom , N being the number of  
free parameters (parameters of interest)

(in this case N=2)

# Confidence intervals

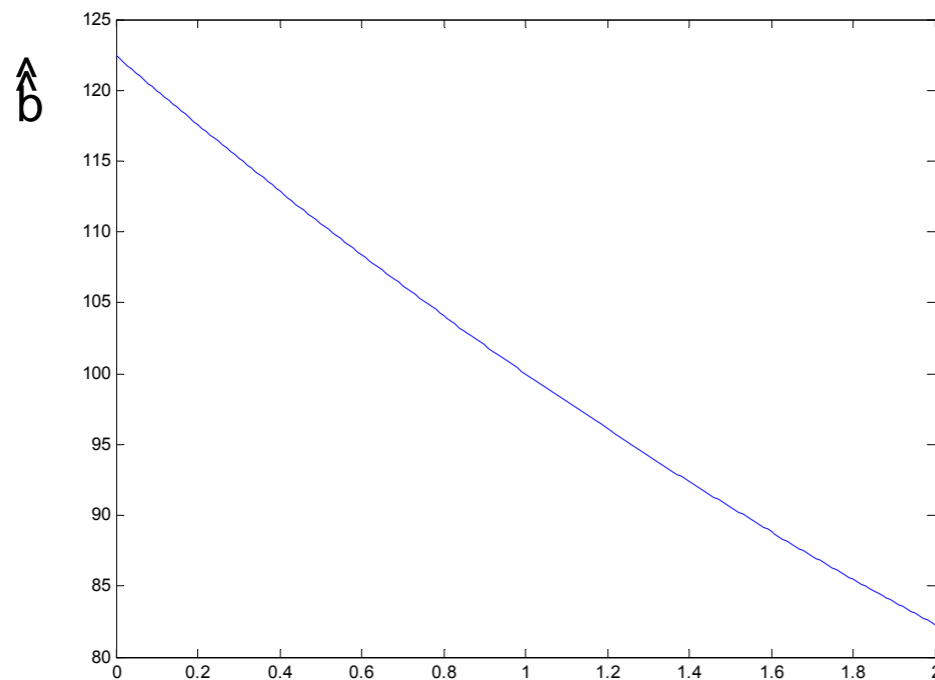


For  $N_{\text{obs}}=150$ ,  $b_{\text{meas}}=100$ ,  $s=50$

# Profiling the Likelihood

- Profile Likelihood:

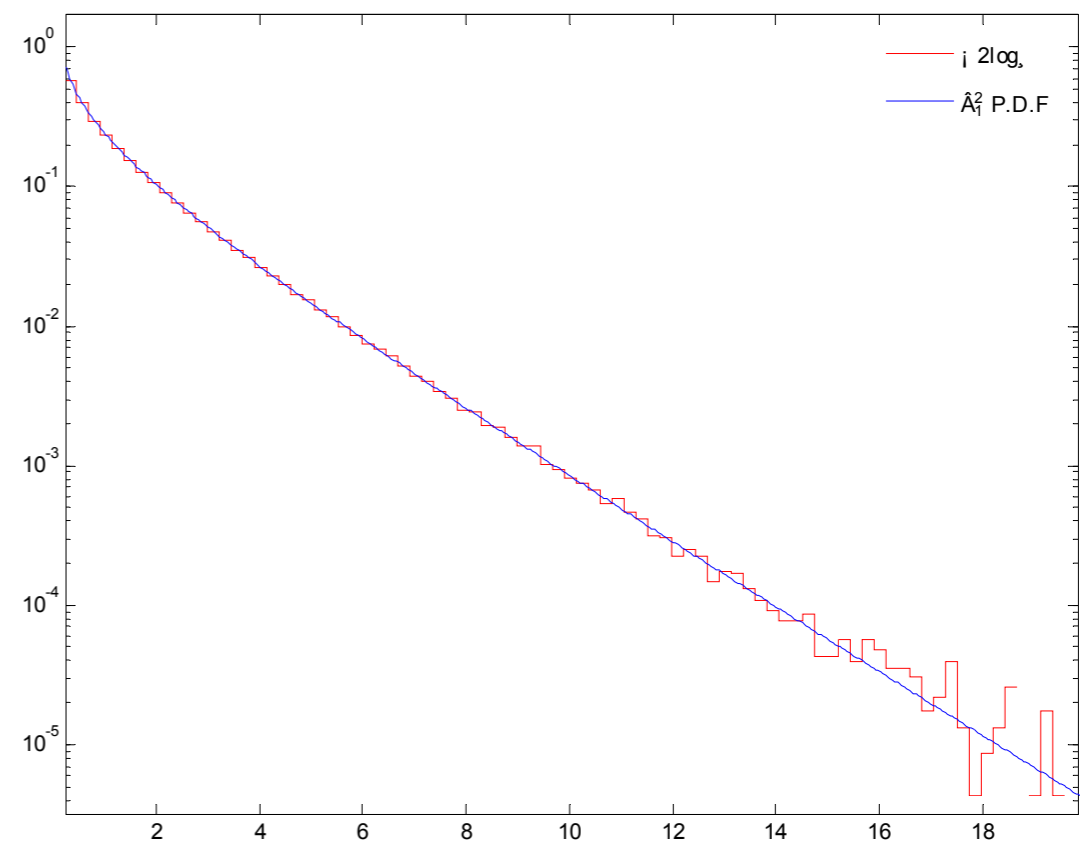
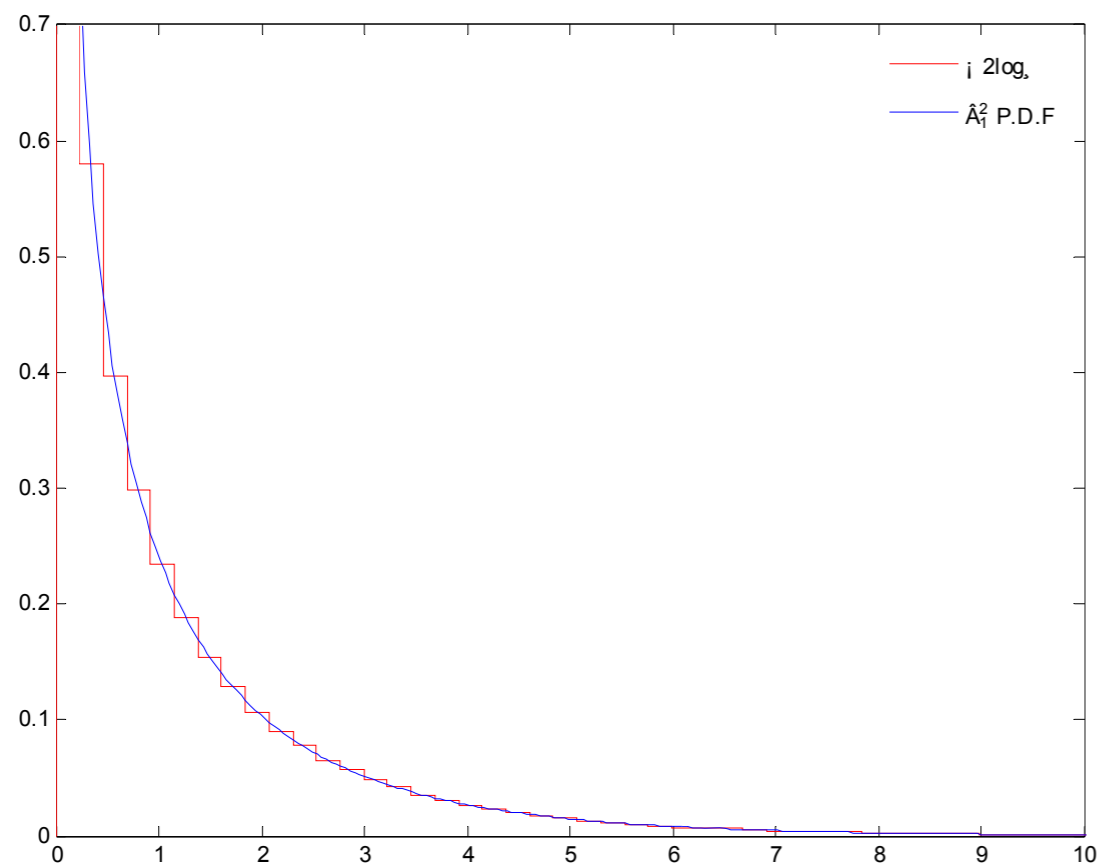
$$\hat{b}(\mu) = \frac{1}{2} \left\{ b_{meas} - \mu s - \sigma_b^2 + \sqrt{(b_{meas} + \mu s - \sigma_b^2)^2 + 4n\sigma_b^2} \right\}$$



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HC Statistics for Pedestrians, Elder, Cross-Traffic / University of Rome

- distributes as a  $\chi^2$  with 1 d.o.f
- This ensures simplicity, coverage, speed



# The Profile Likelihood for Significance Calculation

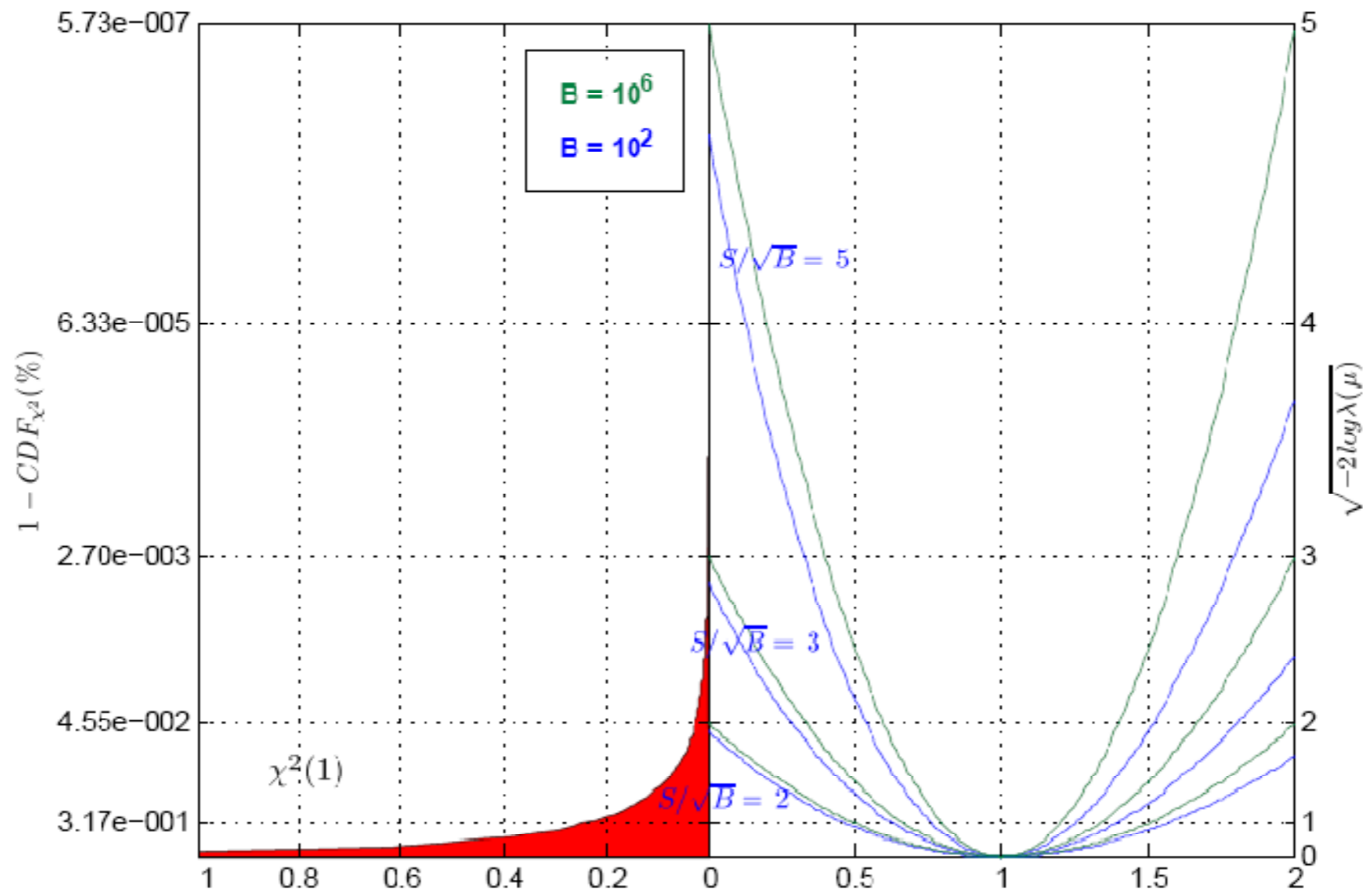
$$-2 \log \lambda(\hat{\mu} \pm N \sigma_{\hat{\mu}}) = N^2$$

$$N = \sqrt{-2 \log \lambda(\mu)}$$

- In particular if we generate **background only** experiments,  $\lambda(\mu=0)$  is distributed as  $\chi^2$  with 1 d.o.f
- Discovery has to do with a low probability of the background only experiment to fluctuate and give us a signal like result....
- To estimate a discovery sensitivity we simulate a data compatible with a signal (s+b) and evaluate for this data  $\lambda(\mu=0)$ . For this data, the MLE of  $\mu$  is 1



# 0% BG Systematics



# A Lesson in Systematic

- In absence of systematics significance can be approximated to be  $\frac{s}{\sqrt{b}}$

- However if there is systematics, say,  $\Delta b$  the significance is reduced to

$$\frac{s}{\sqrt{(\sqrt{b})^2 + (\Delta \cdot b)^2}} = \frac{s}{\sqrt{b(1 + \Delta^2 \cdot b)}} \rightarrow \frac{s}{\Delta \cdot b}$$

- For  $5\sigma$  one needs

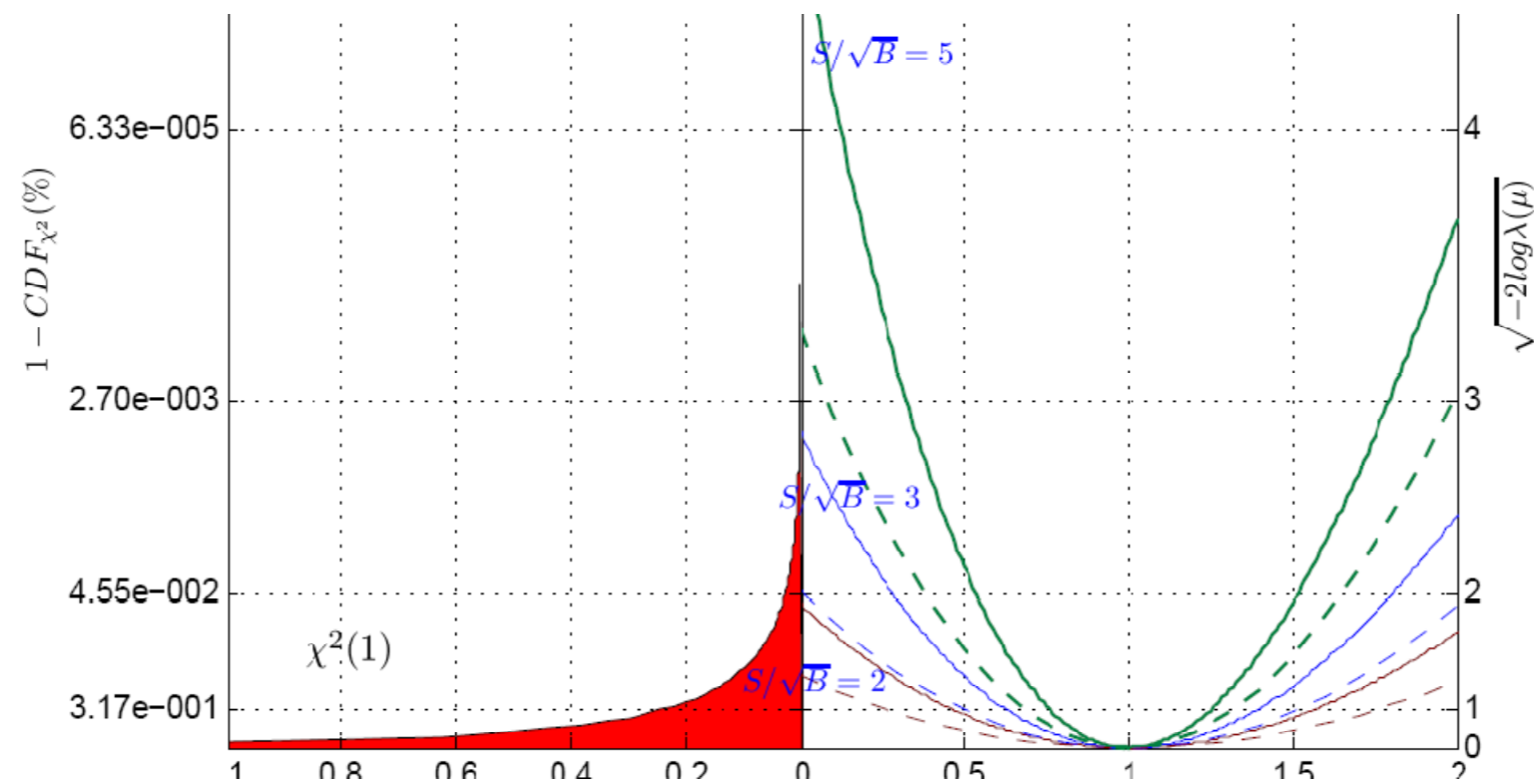
$$\frac{s}{b} > 5\Delta$$

- For 10% systematics this implies

$$\frac{s}{b} > 0.5$$

# With 10% Background Systematics

For  $b=100$  with 10% systematics, significance for  $S/\sqrt{B}=5$  drops to  $\sim 3.6$



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LHC Statistics for Pedestrians, Eleno G. Rossi, Taipei University, Jan 2008

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# Profile Likelihood

- The speed and ease allow us to produce all sorts of views in seconds!
- No numerical problems, can go up to any significance

# Why Profile Likelihood?

- For SUSY interpretations you usually have results in a grid (i.e.  $\tan\beta, m_A$ )
- Each point is a different experiment
- There are 10s-100000s of possible points per channel
- In a shape-based analysis each bin is treated like a channel....
- The difference between O(minutes) per point and O(0.1 seconds) per point is critical!

# Exclusion with Profile Likelihood

- Exclusion is related to the probability of the “would be” signal to fluctuate down to the background only region (i.e. the p-value of the s+b “observation” )
- Here we suppose the data is the background only and the exclusion sensitivity is given by

$$N = \sqrt{-2\lambda(\mu = 1)}$$

- Exclusion at the 95% C.L. means  $N=2$

---

# Signal Efficiencies Uncertainties

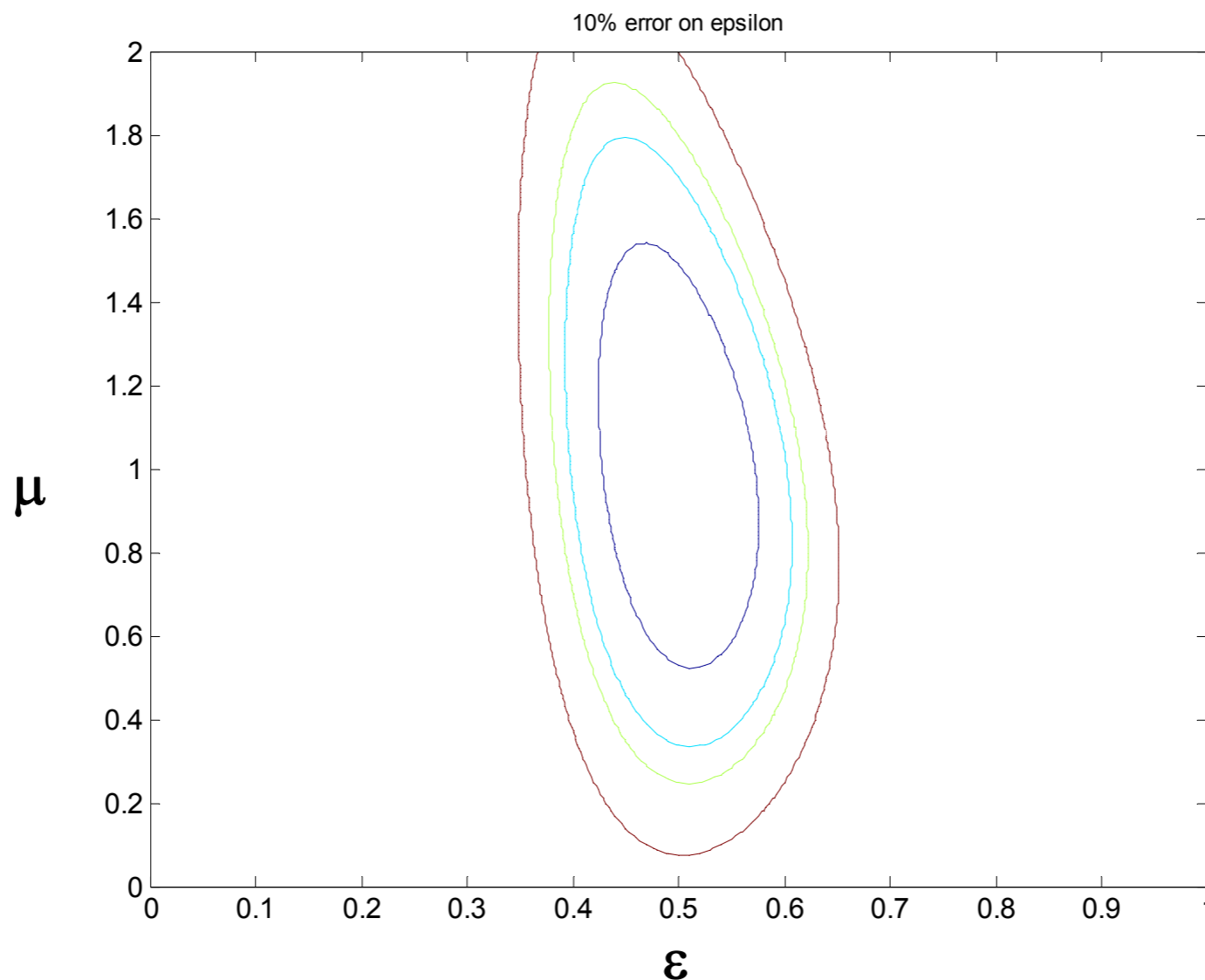
$$L(\mu\epsilon s + b)$$

- How to cope with background and efficiency systematics
- Efficiency systematics have no effect on discovery sensitivity but can have large effects on exclusion sensitivity

# Including error on signal efficiency

$$L(\mu) = \text{Pois}(n \mid \mu\epsilon s + b)G(b_{meas} \mid b)G(\epsilon_{meas} \mid \epsilon)$$

$$-2 \log \lambda(\mu, \epsilon)$$

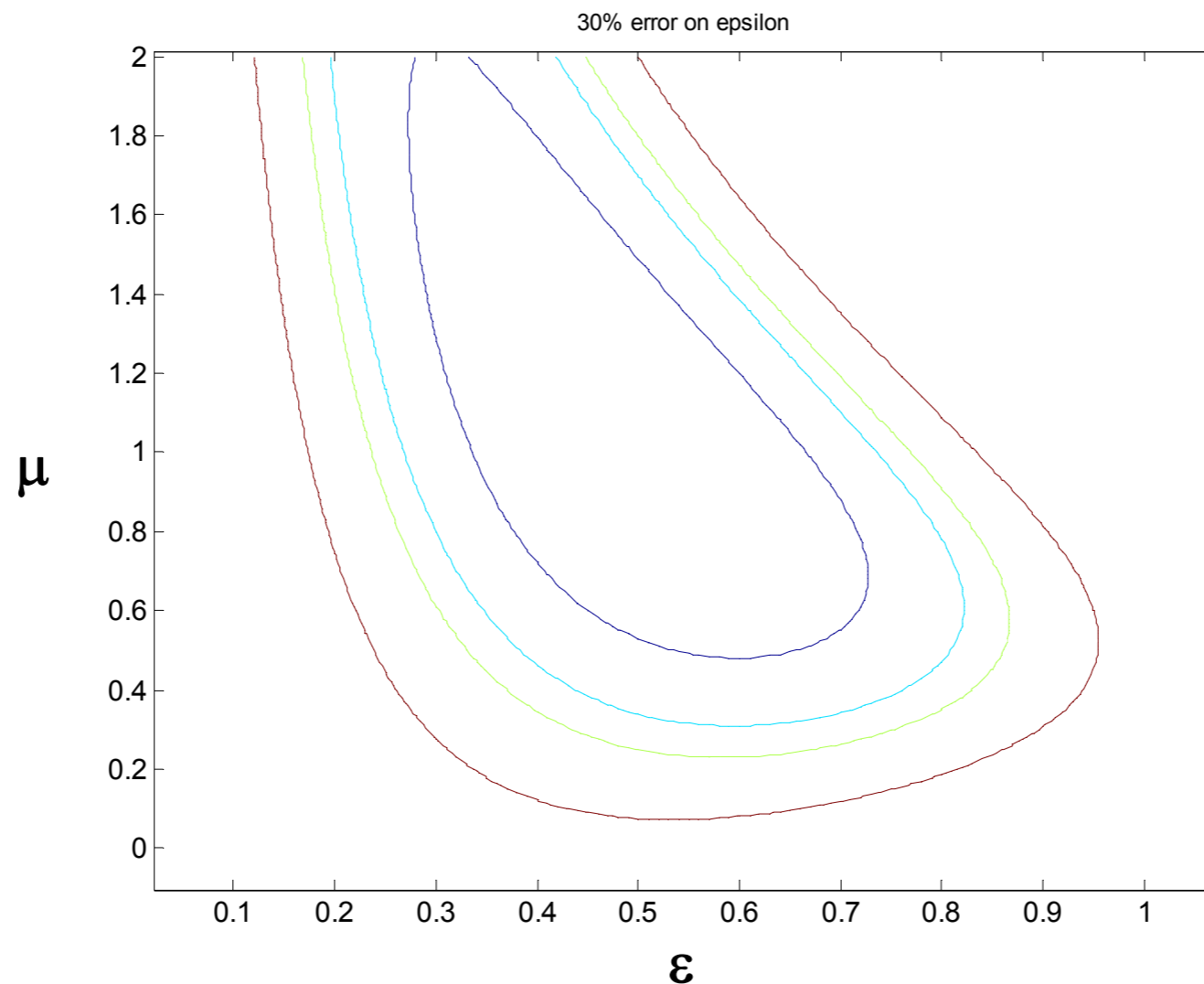




# Including error on signal efficiency

$$L(\mu) = \text{Pois}(n | \mu \varepsilon s + b) G(b_{meas} | b) G(\varepsilon_{meas} | \varepsilon)$$

$-2 \log \lambda(\mu, \varepsilon)$

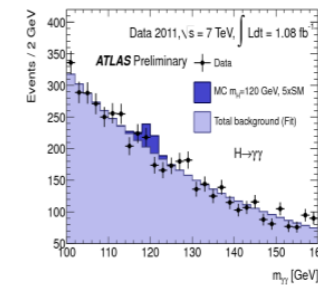
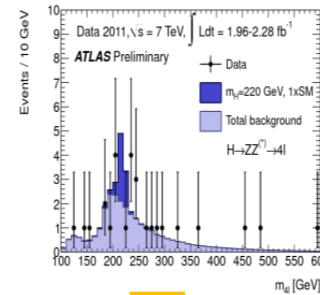
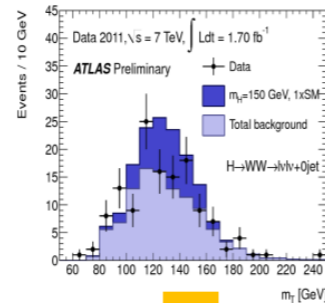


## Pros and Cons Profile Likelihood

- **CONS:**
  - The only disadvantage I see is its incapability to take the Look Elsewhere Effect in a built-in way....
  - One has to take the Look Elsewhere Effect in the LEP way (Using MC and factorize the resulting significance-need to be studied)
- **PROS:**
  - It is simple and easy to understand and apply
  - It is statistically reliable and a frequentists favorite
  - It can cope with Systematics and has the proper coverage
  - It is FAST!!!!!!  $O(0.1 \text{ Sec})$  vs  $O(\text{Minutes})$ .
  - Its probably the only method that can cope with as many as SUSY scenarios one wants!

# Combining Higgs channels (and experiments)

- Procedure: define **joint likelihood**



$$L(\mu, \theta_{comb}) = L_{H \rightarrow WW}(\mu, \theta_{WW}) \cdot L_{H \rightarrow ZZ}(\mu, \theta_{ZZ}) \cdot L_{H \rightarrow \gamma\gamma}(\mu, \theta_{\gamma\gamma}) \cdot \dots$$

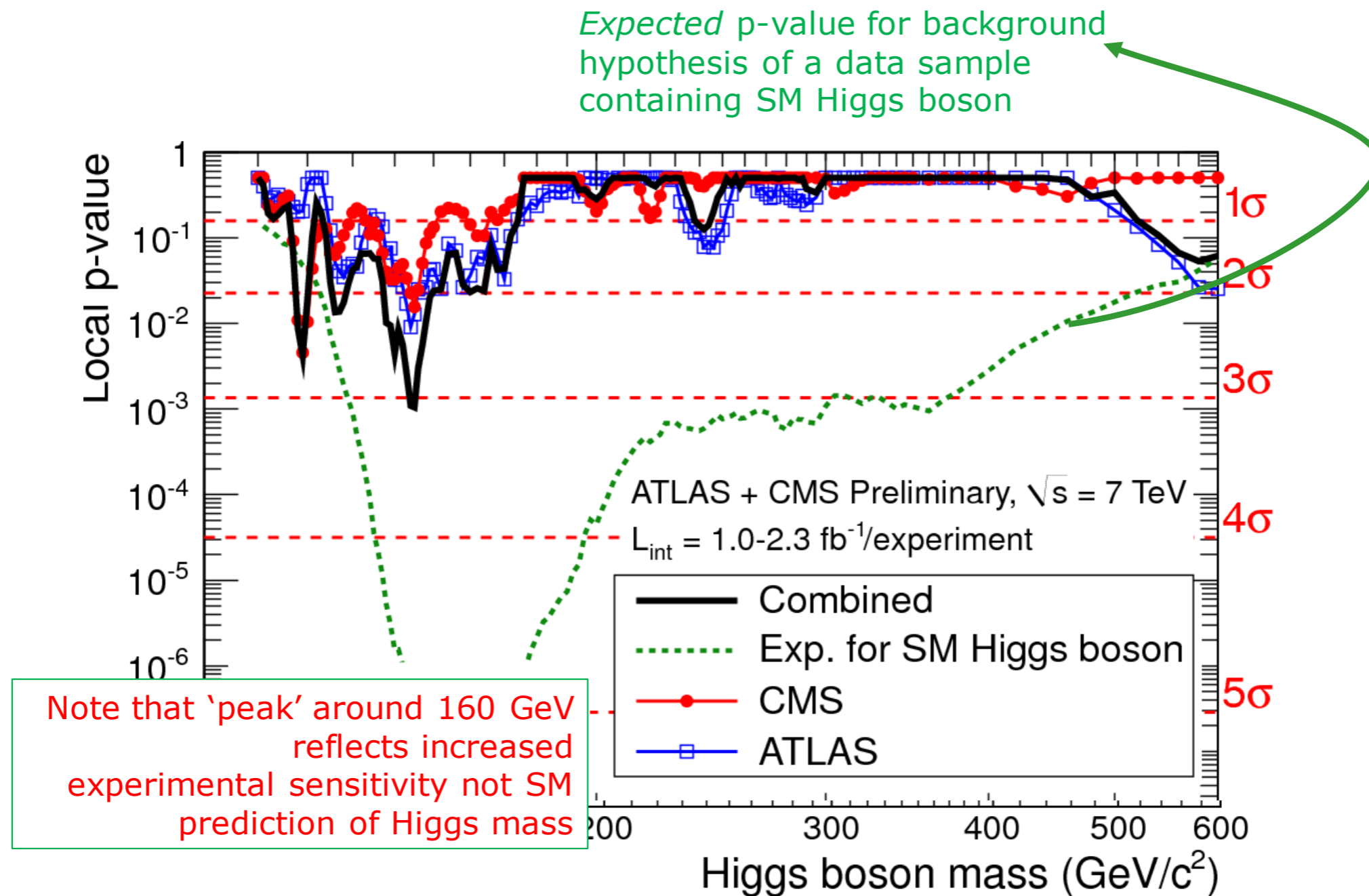
$$L(\mu, \theta_{LHC}) = L_{ATLAS}(\mu, \theta_{ATLAS}) \cdot L_{CMS}(\mu, \theta_{CMS}) \cdot \dots$$

- **Correlations between  $\theta_{WW}, \theta_{\gamma\gamma}$  etc and between  $\theta_{ATLAS}, \theta_{CMS}$  requires careful consideration!**
- The construction profile likelihood ratio test statistic from joint likelihood and proceed as usual

$$\tilde{q}_\mu = -2 \ln \frac{L(data | \mu, \hat{\theta}_\mu)}{L(data | \hat{\mu}, \hat{\theta})}$$

Wouter Verkerke, NIKHEF

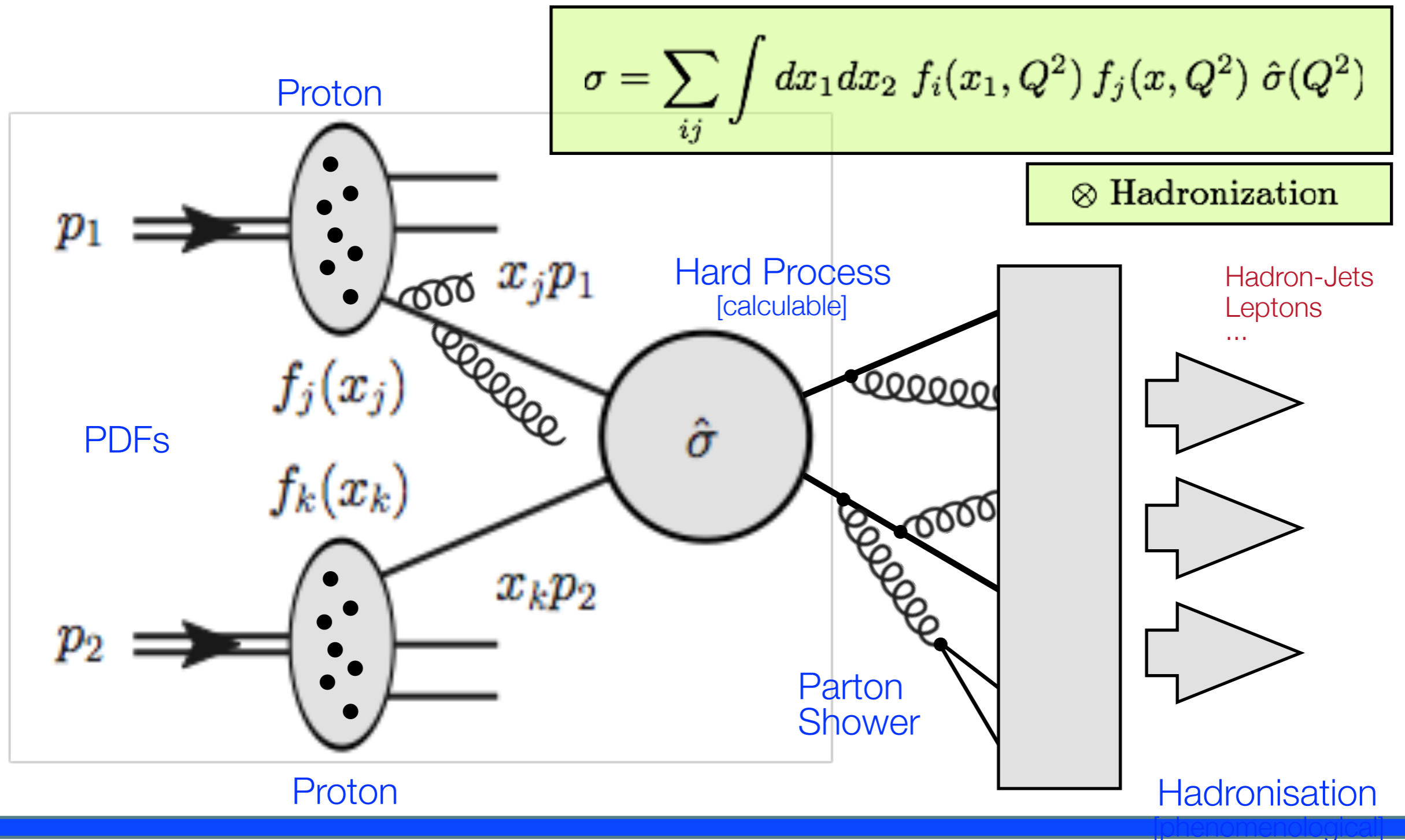
## Comb: p-value of background-only hypothesis ('discovery')



# Conclusions

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# The simulation chain



# MC simulations in particle physics

How Monte Carlo simulation works

- Numerical process generation based on **random numbers**
- Method **very powerful** in particle physics

## Event generation programs:

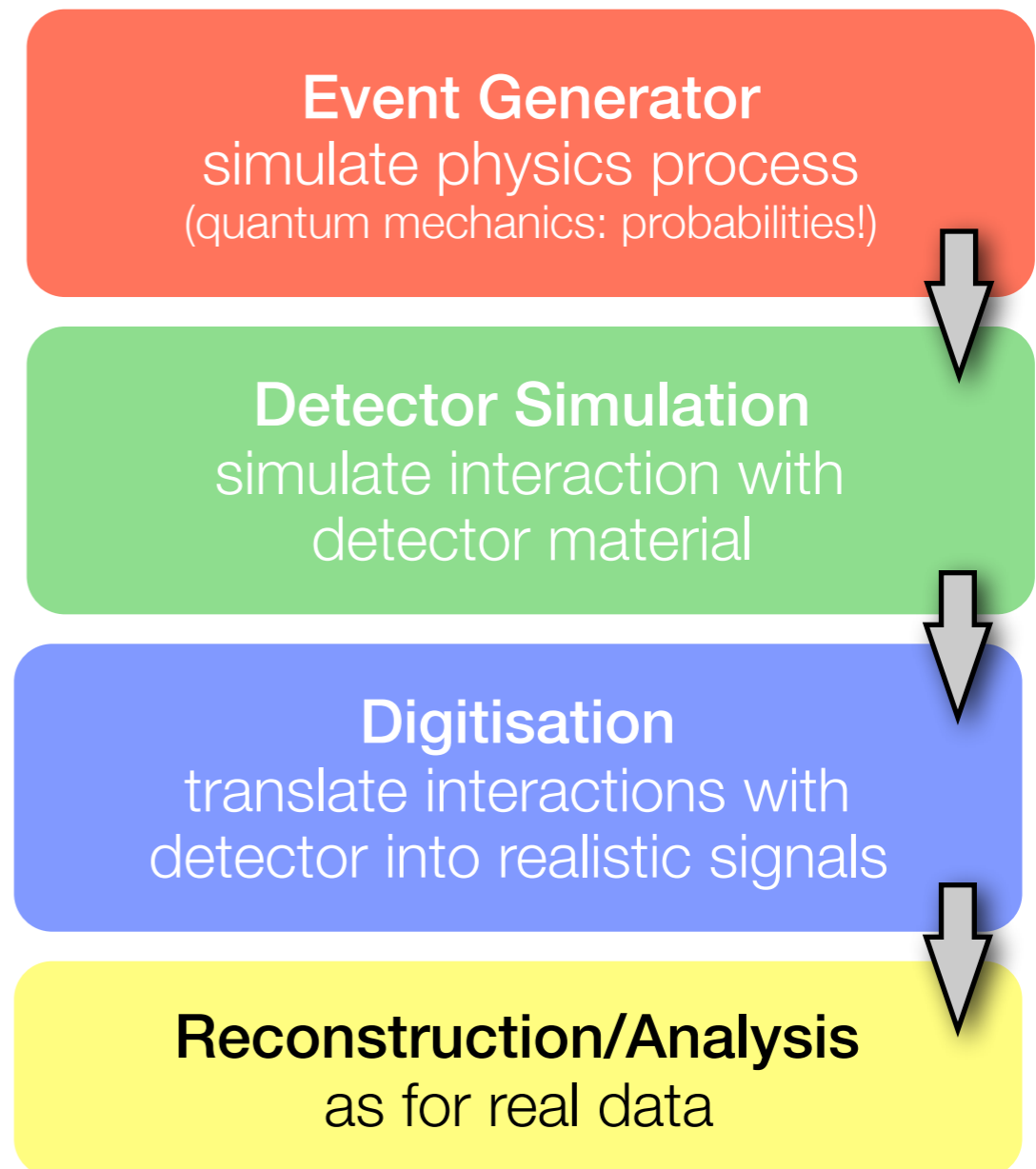
**Pythia6, Pythia8, Herwig, Herwig++,  
Sherpa ...**

**Hard partonic subprocess +  
fragmentation and hadronisation ...**

## Detector simulation:

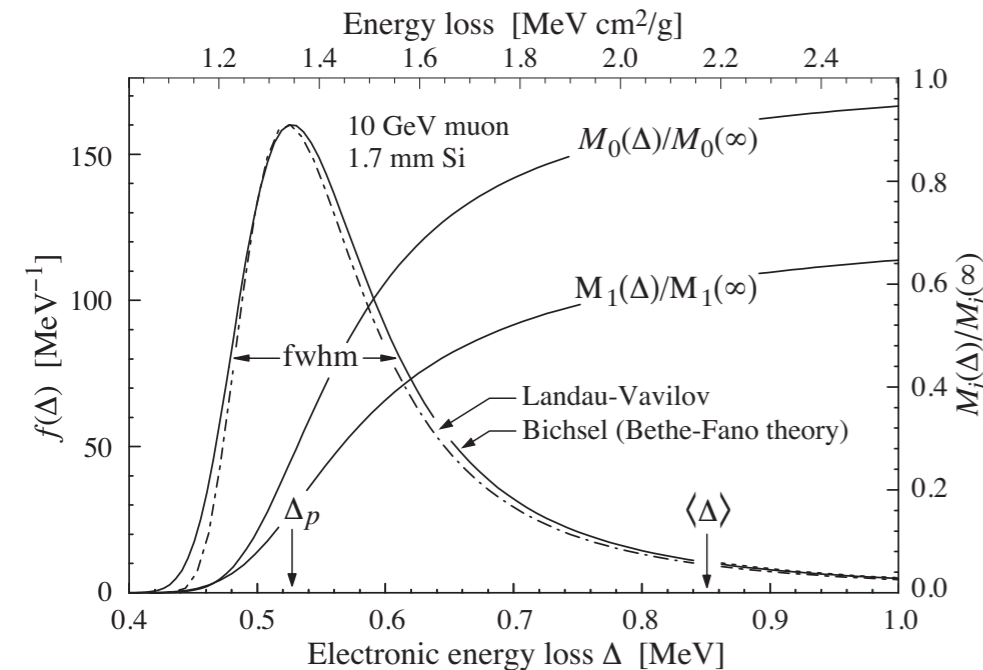
**Geant4  
Fluka low energy hadron interactions...**

**interaction & response  
of all produced particles ...**



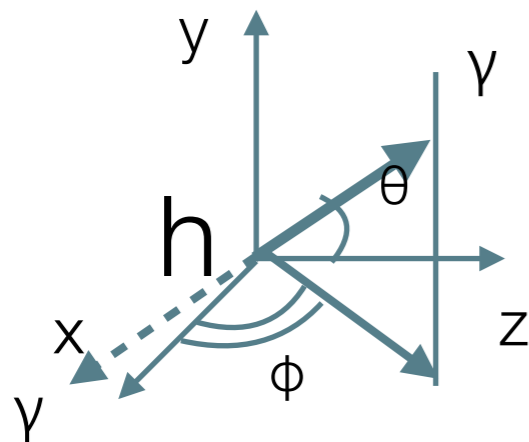
# Baseline of the simulation process

Typically, we need to generate a continuous variable following some distribution  
 i.e. energy loss of a particle in a given material segment;  
 angle of a photon in the h reference frame for the  $h \rightarrow \gamma\gamma$  decay



$$dP = f(x, ..)dx$$

↳ distribution formula  
 probability to get an  $x_0$  value between  $x$  and  $x+dx$



$$dP = f(\theta, \phi)d\theta d\phi = \text{sen}\theta d\theta d\phi$$

flat distribution in  $\phi$   
 non flat in  $\theta$



# Distribution function transformation properties

- 1) software libraries provide basic functions to produce flat distributed random numbers in the interval  $[0,1]$  (ex. root TRandom3 class), they are typically fast and accurate uniform random numbers generators;
- 2) starting from uniform distributed random numbers, it is possible to generate numbers following any distribution using different techniques

$$dP_x = f(x)dx \quad y = g(x)$$
$$x \in [x_a, x_b]$$

How “y” distributes in  $[g(x_a), g(x_b)]$ ?

$$dP_y = h(y)dy = h(y)g'(x)dx$$

Because y is a monotonic function of x the probability to have y between  $g(x)$  and  $g(x+dx)$  is equal to the probability to have x between x and  $x+dx$

$$h(y)g'(x) = f(x) \Rightarrow h(y) = \frac{f(x)}{g'(x)} = \frac{f(g^{-1}(y))}{g'(g^{-1}(y))}$$

Ex.: range map

$$[0, 1] \rightarrow [a, b] \quad y = (b - a)x + a$$

$$f(x) = 1 \quad g'(x) = b - a \quad h(y) = \frac{1}{b - a}$$

uniform

y is uniformly distributed in  $[a,b]$

# Distribution function transformation properties

Ex. 2: integration method:

$$g(x) = \frac{1}{\int_a^b f(x')dx'} \int_a^x f(x')dx' \quad g'(x) = \frac{f(x)}{\int_a^b f(x')dx'}$$

$$h(y) = \frac{f(x)}{g'(x)} = \frac{f[g^{-1}(y)]}{f[g^{-1}(y)]} \cdot \int_a^b f(x')dx' = \int_a^b f(x')dx'$$

$y$  is uniformly distributed:

- 1) generate  $y$  flat in  $[f_{\min}, f_{\max}]$ ;
- 2) compute  $x = g^{-1}(y)$ ,  $x$  will be distributed in  $g^{-1}(f_{\min}), g^{-1}(f_{\max})$

Finding  $g^{-1}(y)$  is equivalent to solve the equation:

$$\frac{1}{\int_a^b f(x')dx'} \int_a^x f(x')dx' = y$$

# Hit or miss method.

- 1) generate  $x$  flat in  $x_{\min}, x_{\max}$
- 2) generate  $y$  flat in  $0, f_{\max}$
- 3) if  $y < f(x)$  accept the event, otherwise ignore it

for a given  $x$  in  $x, x+dx$  the fraction of accepted events is proportional to  $f(x)dx \rightarrow dPx = f(x)dx$

1) advantages:

- can be used for all functions, even non continuous ...
- can be extended to N-dimension (generate  $x_1, x_2, \dots, x_n$ ),  $y$  accept if  $y < f(x_1, x_2, \dots, x_n)$

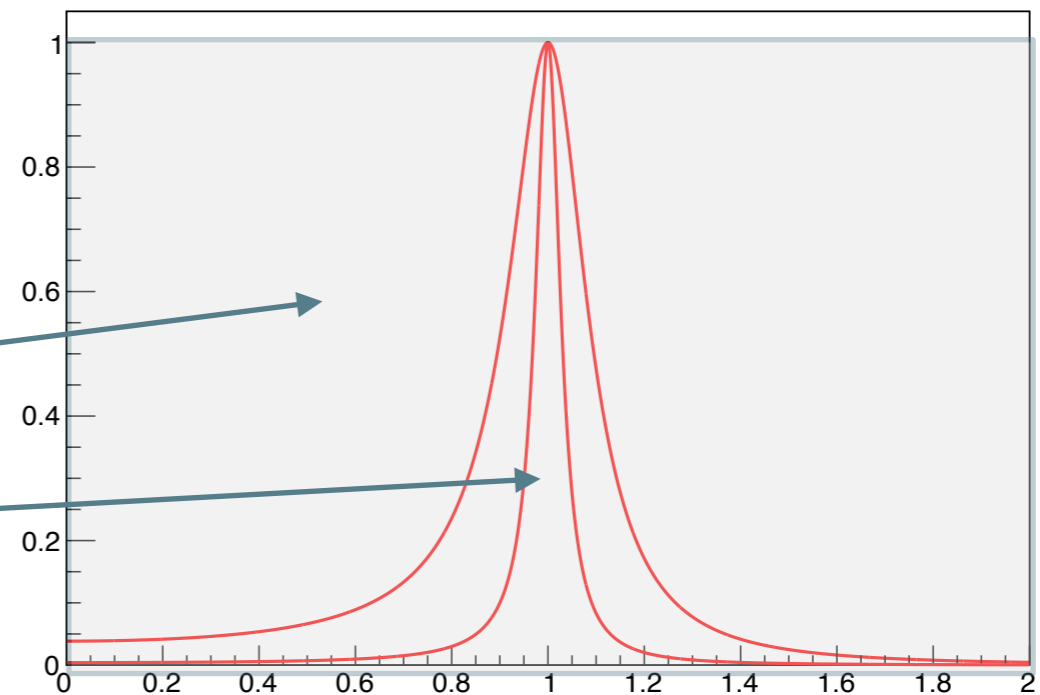
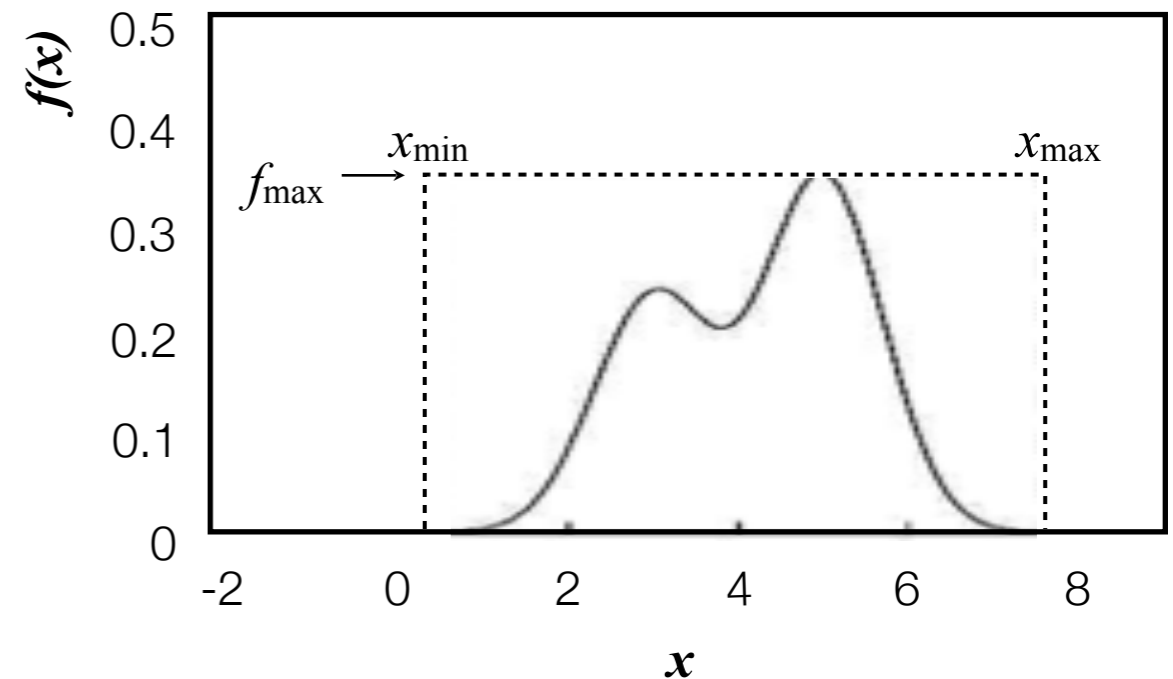
2) disadvantages

- can be extremely slow

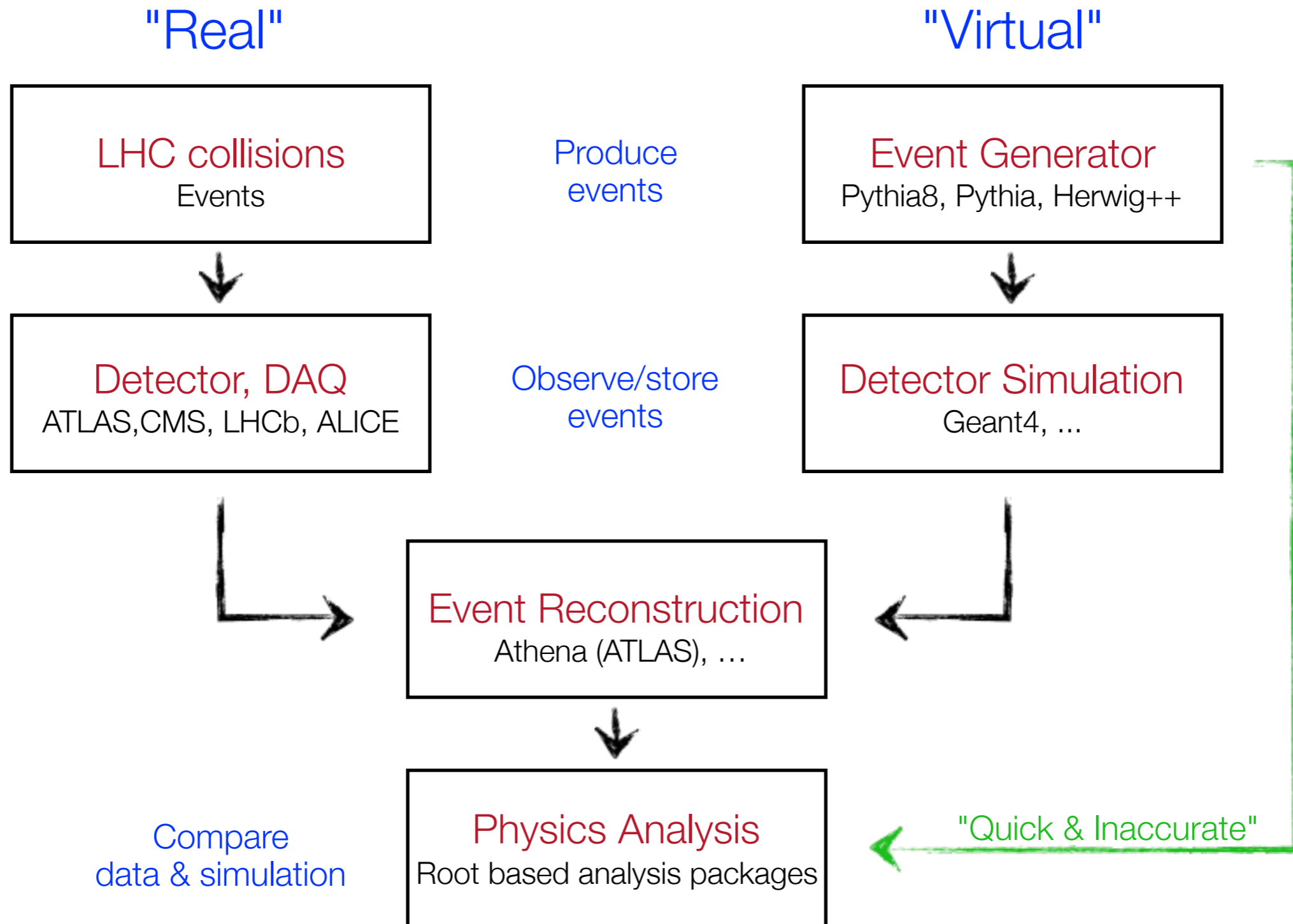
points generated uniformly in the square

points accepted only below the curve

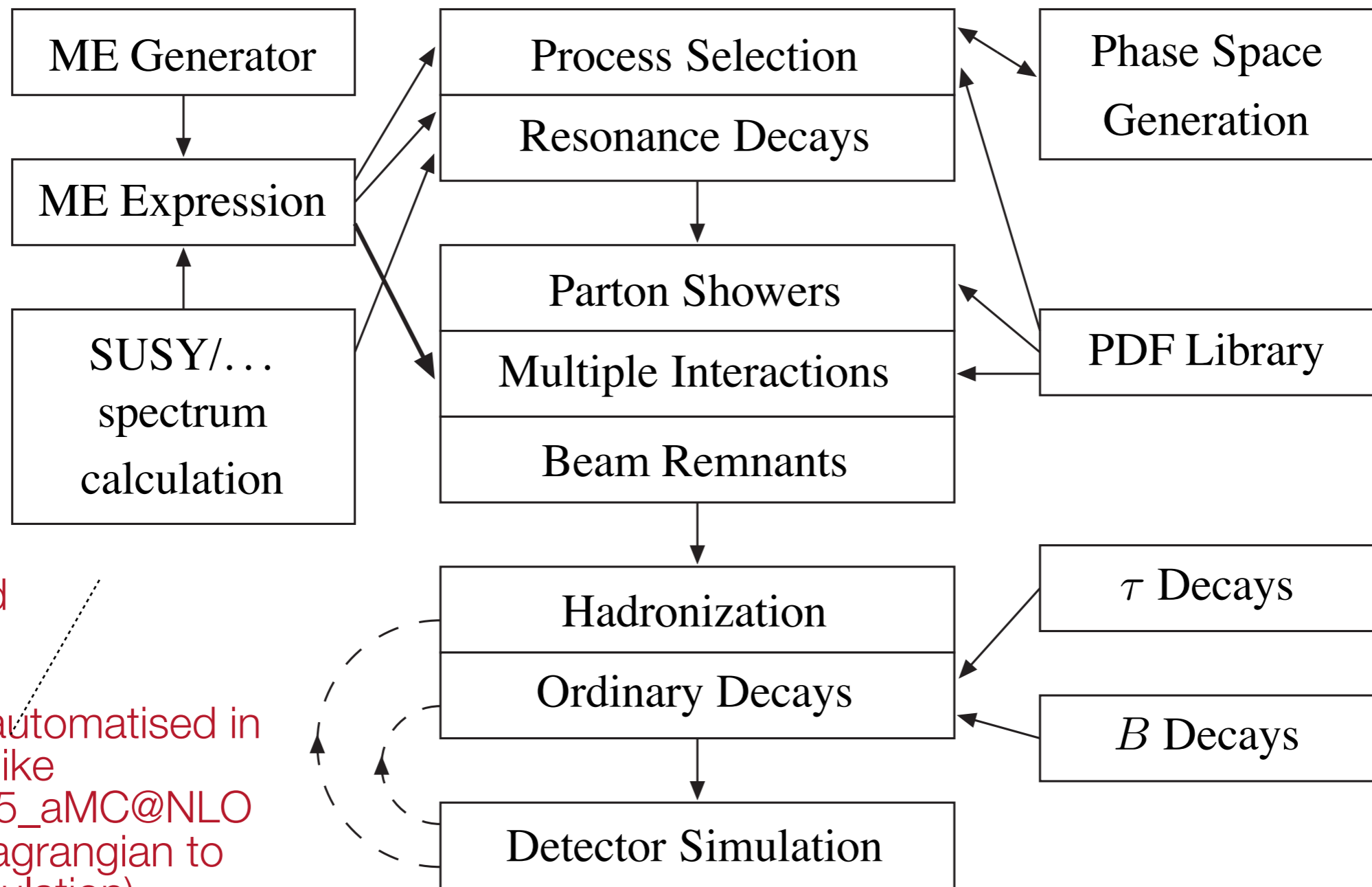
MC generators implement “smart” generation techniques to increase efficiencies



# Comparison between real and simulated events



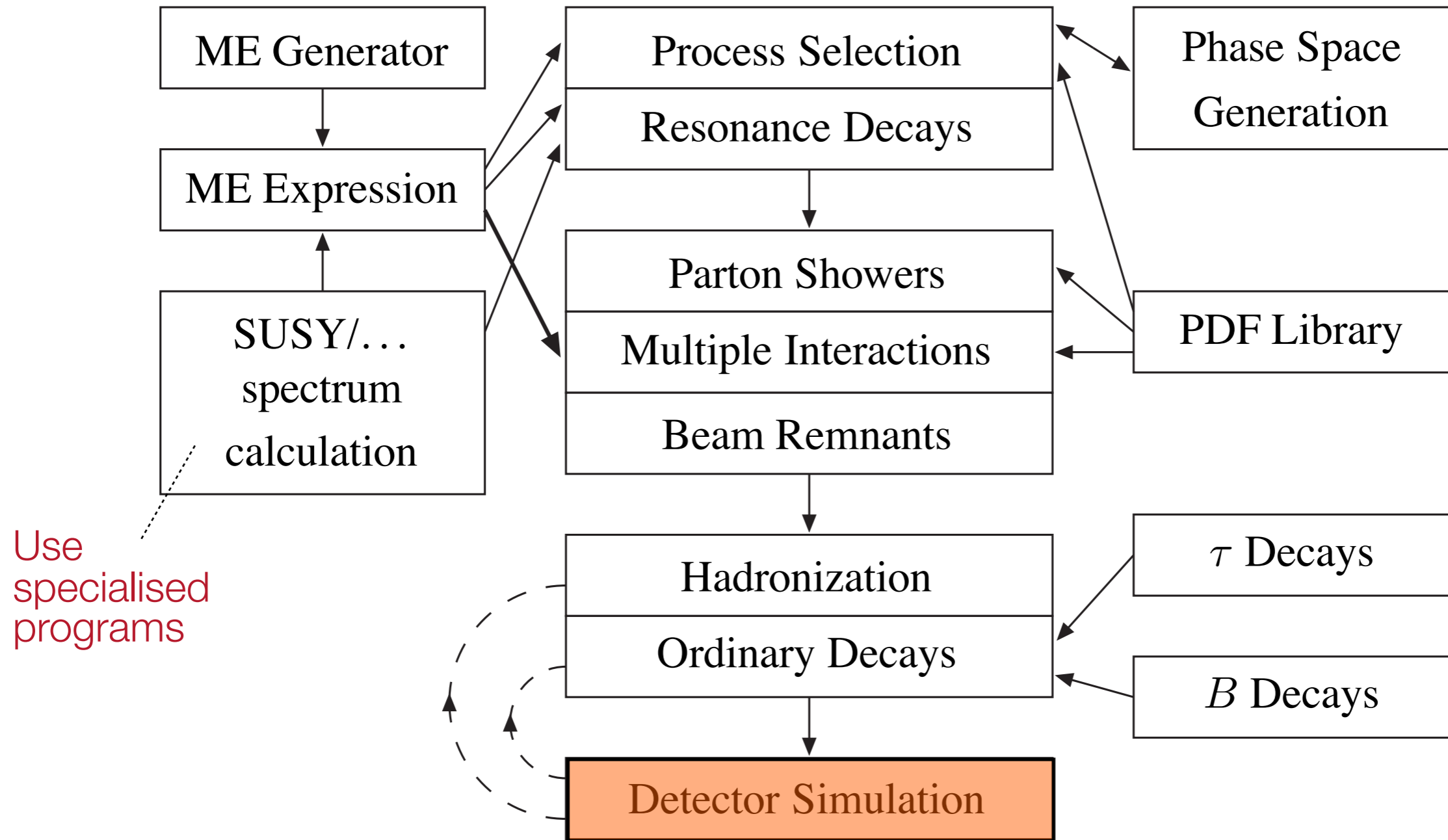
# Simulation elements



Use specialised programs

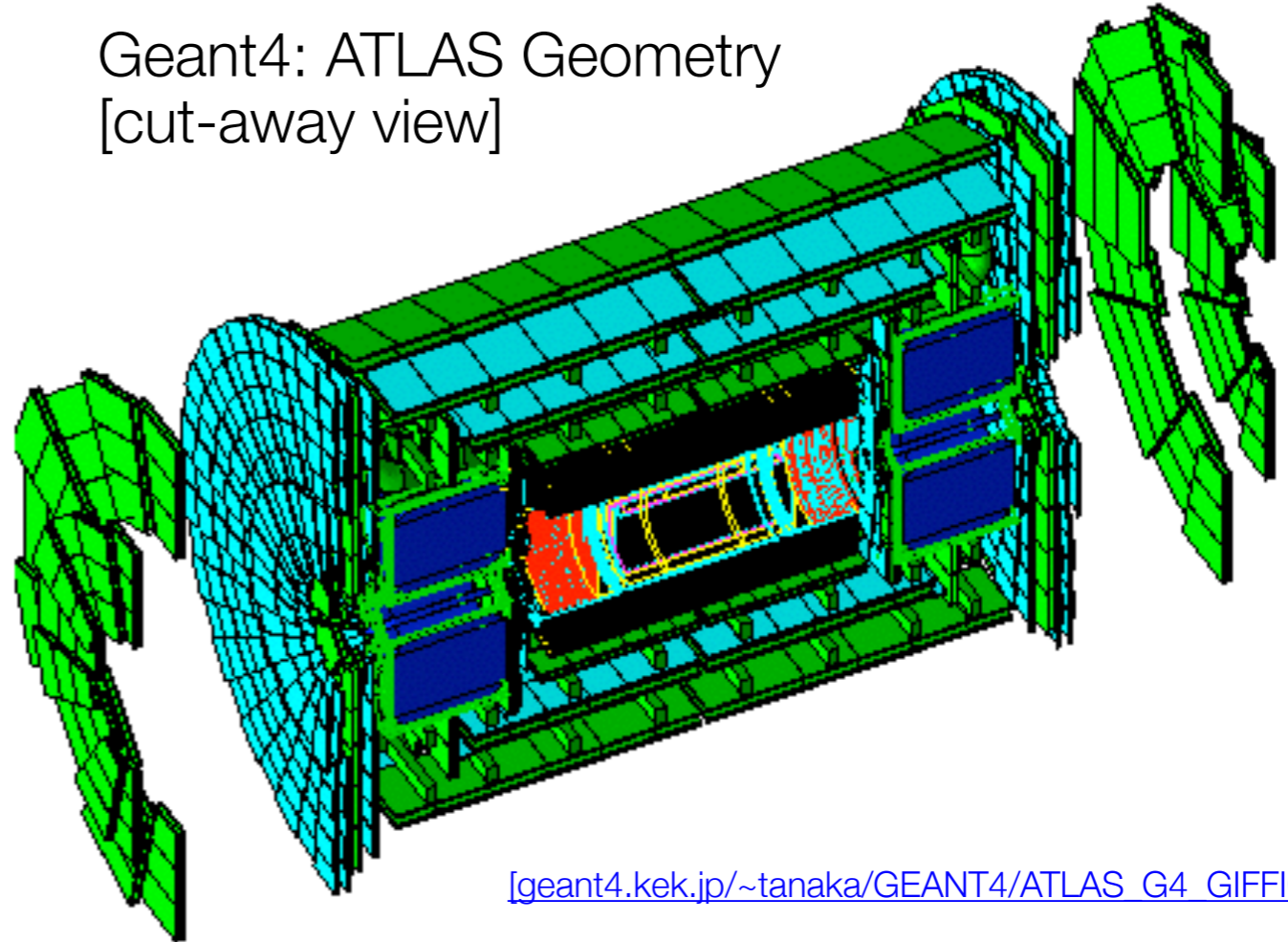
Now fully automatised in programs like Madgraph5\_aMC@NLO (from the lagrangian to the full simulation)

# Simulation elements



# GEANT Geometry And Tracking

Geant4: ATLAS Geometry  
[cut-away view]



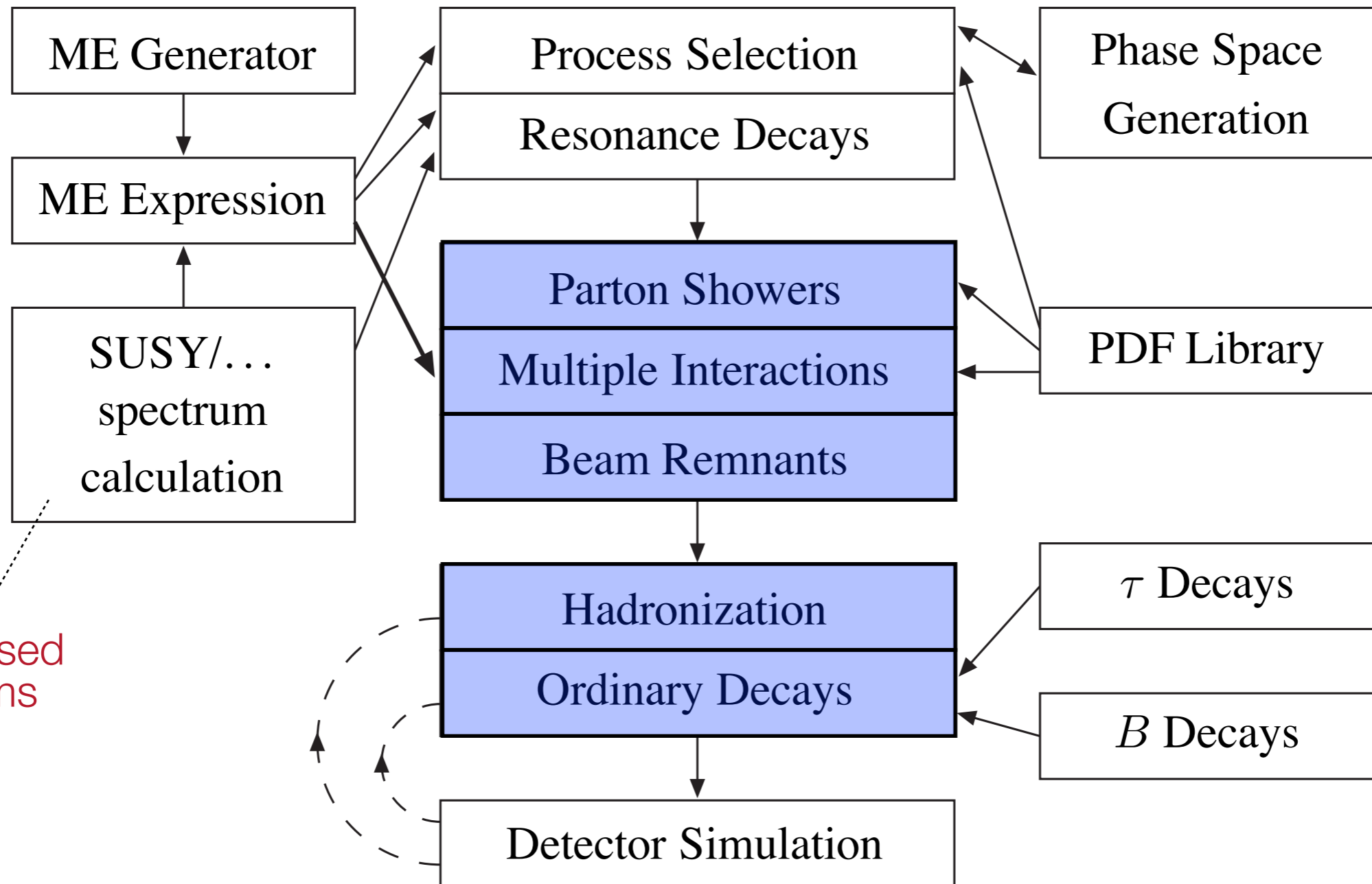
[\[geant4.kek.jp/~tanaka/GEANT4/ATLAS\\_G4\\_GIFFIG/\]](http://geant4.kek.jp/~tanaka/GEANT4/ATLAS_G4_GIFFIG/)

Detailed description of  
detector **geometry**  
[sensitive & insensitive volumes]

**Tracking** of all particles through  
detector material ...

→ **Detector response**

Developed at CERN since 1974 (FORTRAN)  
[Today: Geant4; programmed in C++]





Strong interactions:

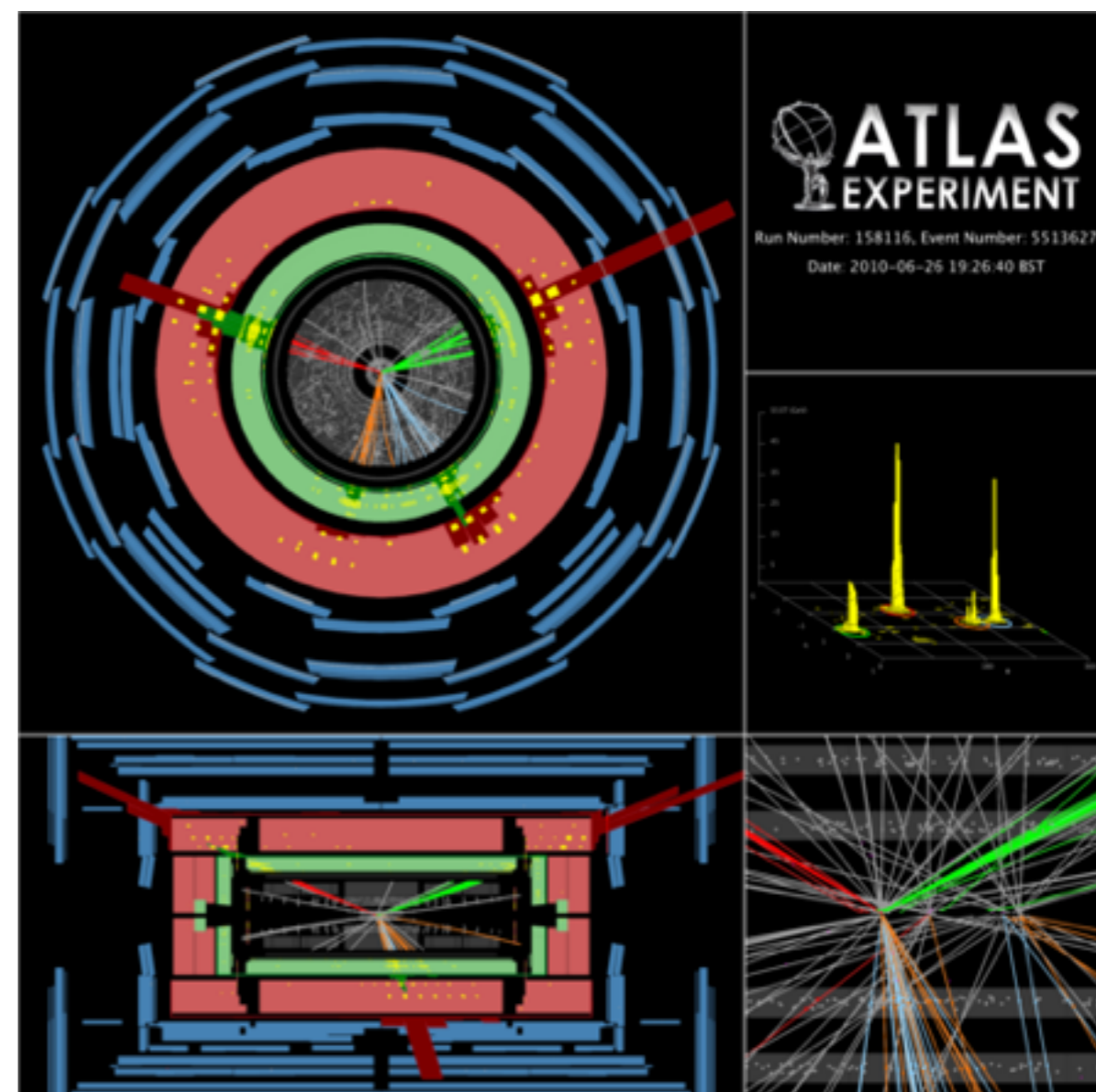
No free Quarks

Expect jets

i.e. bundles of particles at high energies  
[hadron  $p_T$  range limited w.r.t. initial parton]

First observation of jets  
in  $e^+e^-$  collisions @  $E_{CMS} > 6$  GeV  
[SPEAR, SLAC, 1975]

Later also observed in  
hadron-hadron collisions  
[e.g. @ CERN ISR]



An event with 4 jets @ LHC

Goal: **Infer parton properties from jet properties**  
[need to calculate and/or model fragmentation & hadronisation process]



## Pure **matrix element (ME)** simulation:

MC integration of cross section & PDFs, no hadronisation  
(recall: cross section =  $|\text{matrix element}|^2 \otimes \text{phase space}$ )

Useful for theoretical studies, no exclusive events generated

[Example: MCFM (<http://mcfm.fnal.gov>); many LHC processes up to NLO,  
HNNLO (<http://theory.fi.infn.it/grazzini/codes.html>) Higgs production at NNLO]

## **Event generators:**

Combination of ME and parton showers ...

Typical: generator for leading order ME  
combined with leading log (LL) parton shower MC (see later)

Exclusive events → useful for experimentalists ...

# Parton showers

A realistic simulation needs many particles in the final state, it is quite difficult (sometimes impossible) to compute a  $pp(2) \rightarrow$  many particles process

$$(2 \rightarrow n) = \dots$$

$$\dots = (2 \rightarrow 2) \oplus \text{ISR} \oplus \text{FSR}$$

**FSR: Final state radiation**  
 $Q^2 \sim m^2 > 0$  decreasing  
 [time-like shower]

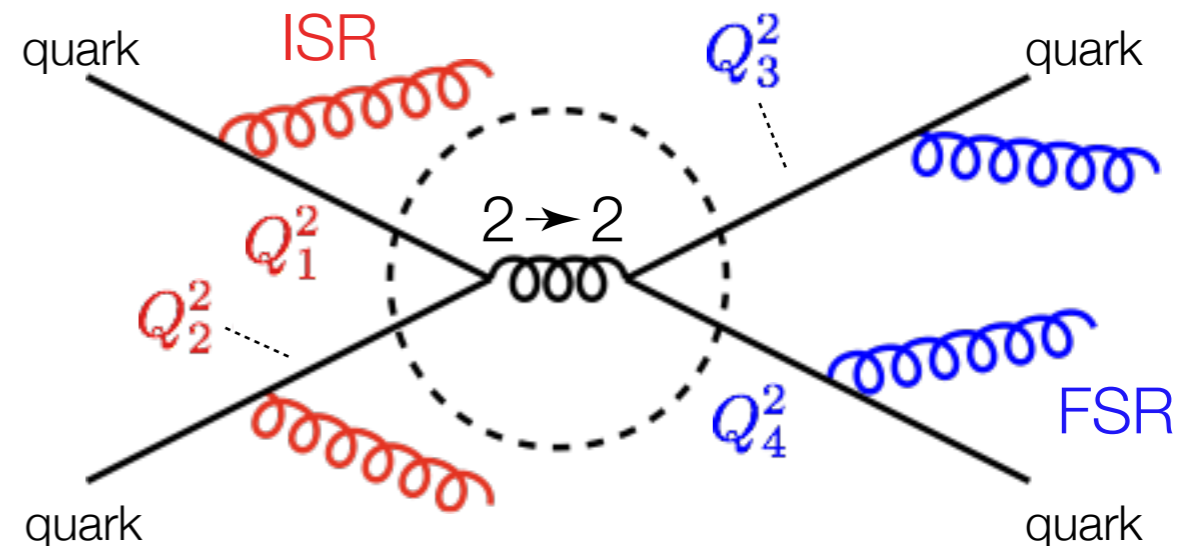
**ISR: Initial state radiation**  
 $Q^2 \sim -m^2 > 0$  increasing  
 [space-like shower]

Hard process  $[2 \rightarrow 2]$ :

$$\sigma = \iiint dx_1 dx_2 d\hat{t} f_i(x_1, Q^2) f_j(x_2, Q^2) \frac{d\hat{\sigma}_{ij}}{d\hat{t}}$$

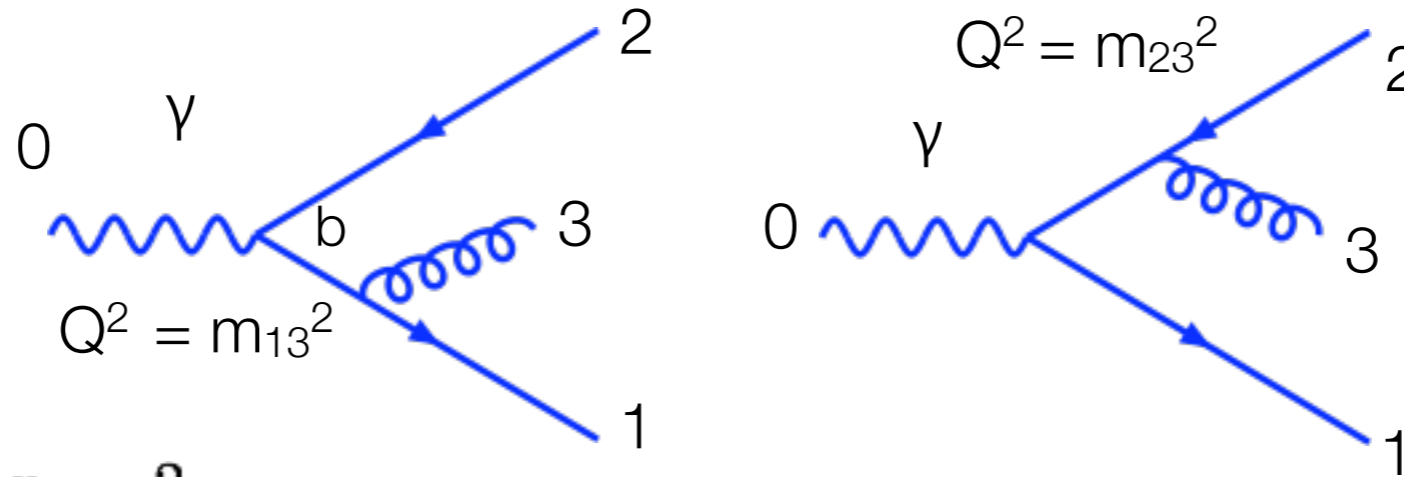
Shower evolution:

Viewed as probabilistic process, which occurs with unit total probability;  
 cross section not directly affected; only indirectly via changed event shape.



# Parton showers

$e^+e^- \rightarrow qqg$



$$x_i = \frac{2E_i}{E_{\text{cm}}} \quad x_1 + x_2 + x_3 = 2$$

Cross Section: 
$$\frac{d\sigma_{qqg}}{dx_1 dx_2} = \frac{4}{3} \frac{\alpha_s}{2\pi} \cdot \sigma_0 \cdot \frac{x_1^2 + x_2^2}{(1-x_1)(1-x_2)}$$

Cross section has large contributions for  $x_1, x_2 \rightarrow 1$

[ $m_q = 0$ ; see e.g. Halzen/Martin]

from pt balance  $1 - x_2 = \frac{m_{13}^2}{E_{\text{cm}}^2} = \frac{Q^2}{E_{\text{cm}}^2}$   $m_{13}^2 \sim 2E_1 E_2 (1 - \cos\theta) x_2 \rightarrow 1 \Rightarrow m_{13}^2 \rightarrow 0 \Rightarrow \theta \rightarrow 0$  collinear limit

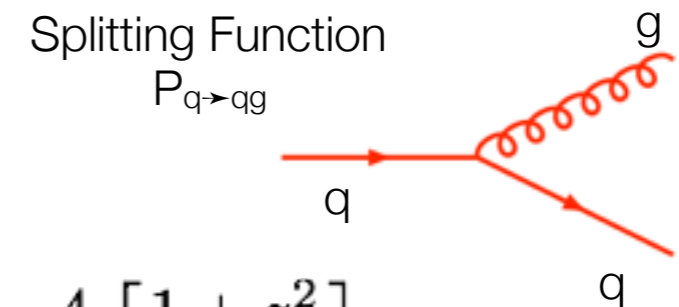
$$dx_2 = -\frac{dQ^2}{E_{\text{cm}}^2}$$

Rewrite for  $x_2 \rightarrow 1$ :  
[qg collinear limit]

$$x_1 \approx z \quad dx_1 \approx dz$$

$$x_3 \approx 1 - z$$

$$E_q = E_1 = zE_b \quad E_g = E_3 = (1-z)E_b$$



$$d\mathcal{P} = \frac{d\sigma_{qqg}}{\sigma_0} = \frac{4}{3} \frac{\alpha_s}{2\pi} \cdot \frac{dx_2}{(1-x_2)} \cdot \frac{x_1^2 + x_2^2}{(1-x_1)} dx_1 \approx \frac{\alpha_s}{2\pi} \cdot \frac{dQ^2}{Q^2} \cdot \frac{4}{3} \left[ \frac{1+z^2}{1-z} \right] dz$$

$z \rightarrow 1 \Rightarrow E_g \rightarrow 0$  soft divergence



$$d\mathcal{P}_{a \rightarrow bc} = \frac{\alpha_s}{2\pi} \frac{dQ^2}{Q^2} P_{a \rightarrow bc}(z) dz$$

Splitting probability determined by splitting functions  $P_{q \rightarrow qg}$

Analogous splitting functions used in PDF evolution

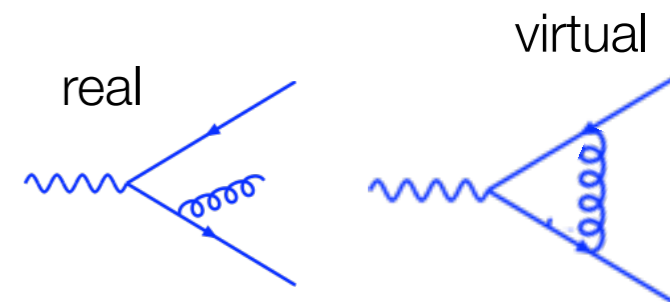
$$P_{q \rightarrow qg} = \frac{4}{3} \frac{1+z^2}{1-z}$$

$z$  : fractional momentum of radiated parton

$n_f$  : number of quark flavours

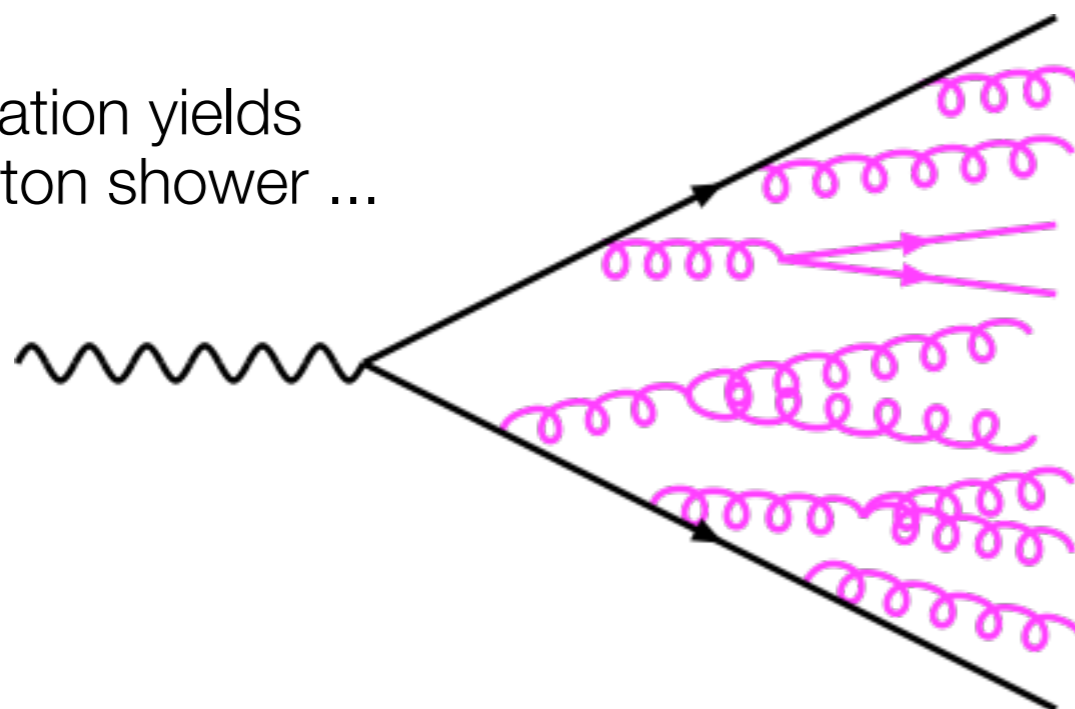
$$P_{g \rightarrow gg} = 3 \frac{(1-z(1-z))^2}{z(1-z)}$$

In NLO calculations soft and collinear divergencies cancelled by virtual contributions: they persist in LO calculations.



$$P_{g \rightarrow q\bar{q}} = \frac{n_f}{2} (z^2 + (1-z)^2)$$

Iteration yields  
parton shower ...



Need soft/collinear cut-offs to avoid non-perturbative regions ...  
[divergencies!]

Details model-dependent

e.g.  $Q > m_0 = \min(m_{ij}) \approx 1 \text{ GeV}$ ,  
 $z_{\min}(E, Q) < z < z_{\max}(E, Q)$  or  
 $p_{\perp} > p_{\perp \min} \approx 0.5 \text{ GeV}$

# Parton shower evolution 1

Conservation of total probability:

$$\mathcal{P}(\text{nothing happens}) = 1 - \mathcal{P}(\text{something happens})$$

Time evolution:

$$\mathcal{P}_{\text{nothing}}(0 < t \leq T) = \mathcal{P}_{\text{nothing}}(0 < t \leq T_1) \mathcal{P}_{\text{nothing}}(T_1 < t \leq T)$$

$$\begin{aligned} \mathcal{P}_{\text{nothing}}(0 < t \leq T) &= \lim_{n \rightarrow \infty} \prod_{i=0}^{n-1} \mathcal{P}_{\text{nothing}}(T_i < t \leq T_{i+1}) \\ &= \lim_{n \rightarrow \infty} \prod_{i=0}^{n-1} (1 - \mathcal{P}_{\text{something}}(T_i < t \leq T_{i+1})) \\ &= \exp \left( - \lim_{n \rightarrow \infty} \sum_{i=0}^{n-1} \mathcal{P}_{\text{something}}(T_i < t \leq T_{i+1}) \right) \\ &= \exp \left( - \int_0^T \frac{d\mathcal{P}_{\text{something}}(t)}{dt} dt \right) \end{aligned}$$

$e^{-x} \approx 1 - x$   
 [Taylor]

$$\rightarrow d\mathcal{P}_{\text{first}}(T) = d\mathcal{P}_{\text{something}}(T) \exp \left( - \int_0^T \frac{d\mathcal{P}_{\text{something}}(t)}{dt} dt \right)$$

# Parton shower evolution 2

Instead of evolving to later and later times  
need to evolve to smaller and smaller  $Q^2$  ...

[Heisenberg:  $Q \sim 1/t$ ]

Sudakov  
Form Factor

$$d\mathcal{P}_{a \rightarrow bc} = \underbrace{\frac{\alpha_s}{2\pi} \frac{dQ^2}{Q^2} P_{a \rightarrow bc}(z) dz}_{\text{Probability to radiated with virtuality } Q^2} \exp \left( \underbrace{- \sum_{b,c} \int_{Q^2}^{Q_{\max}^2} \frac{dQ'^2}{Q'^2} \int \frac{\alpha_s}{2\pi} P_{a \rightarrow bc}(z') dz'}_{\text{No radiation for higher virtualities i.e. for } Q^2 \dots Q_{\max}^2} \right)$$

Probability to radiated  
with virtuality  $Q^2$

No radiation for higher  
virtualities i.e. for  $Q^2 \dots Q_{\max}^2$

Note that  $\sum_{b,c} \iint d\mathcal{P}_{a \rightarrow bc} \equiv 1 \dots$

[Convenient for Monte Carlo]

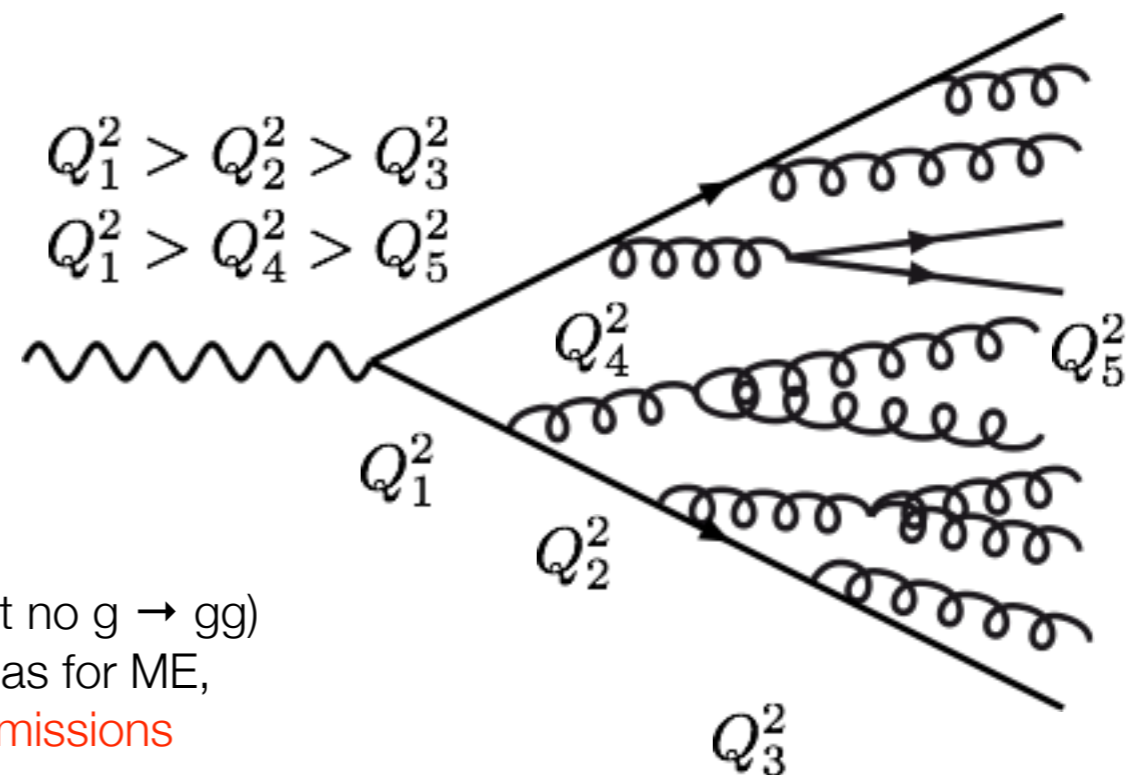
Sudakov form factor ...

... provides “time” ordering of shower ...  
[lower  $Q^2 \Leftrightarrow$  longer times]

... regulates singularity for first emission ...

But in the limit of repeated soft emissions  $q \rightarrow qg$  (but no  $g \rightarrow gg$ )  
one obtains the same inclusive  $Q$  emission spectrum as for ME,

i.e. **divergent ME spectrum  $\Leftrightarrow$  infinite number of PS emissions**





# Sudakov picture of parton showers

## Basic algorithm: Markov chain

[each step requires only knowledge only of previous step]

- (i) Start with virtuality  $Q_1$  and momentum fraction  $x_1$
- (ii) Generate target virtuality  $Q_2$  with random number  $R_T$  uniform distributed in  $[0,1]$

Probability to not have  $Q_x > Q_2$

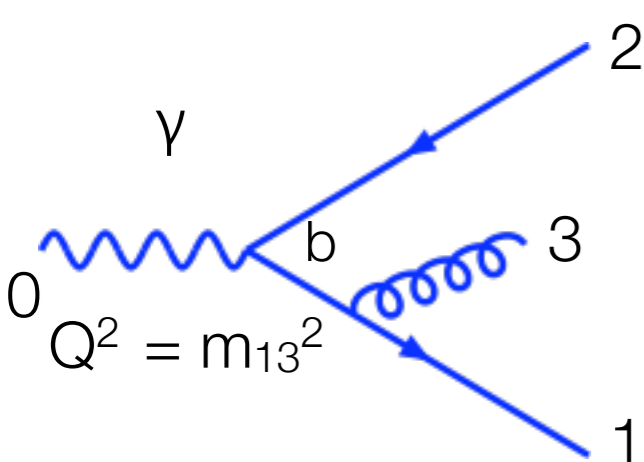
using:

$$\Delta(Q_i^2) = \exp \left( - \sum_{b,c} \int_{Q_i^2}^{Q_{\max}^2} \frac{dQ'^2}{Q'^2} \int \frac{\alpha_s}{2\pi} P_{a \rightarrow bc}(z') dz' \right) \text{ solve the equation for } Q_2 \quad R_t = \frac{\Delta(Q_2^2)}{\Delta(Q_1^2)}$$

[probability to evolve from  $t_1$  to  $t_2$  without radiation]

- (iii)  $Q_2$  known ( $x_2$  known), need to compute  $x_1 \sim z$

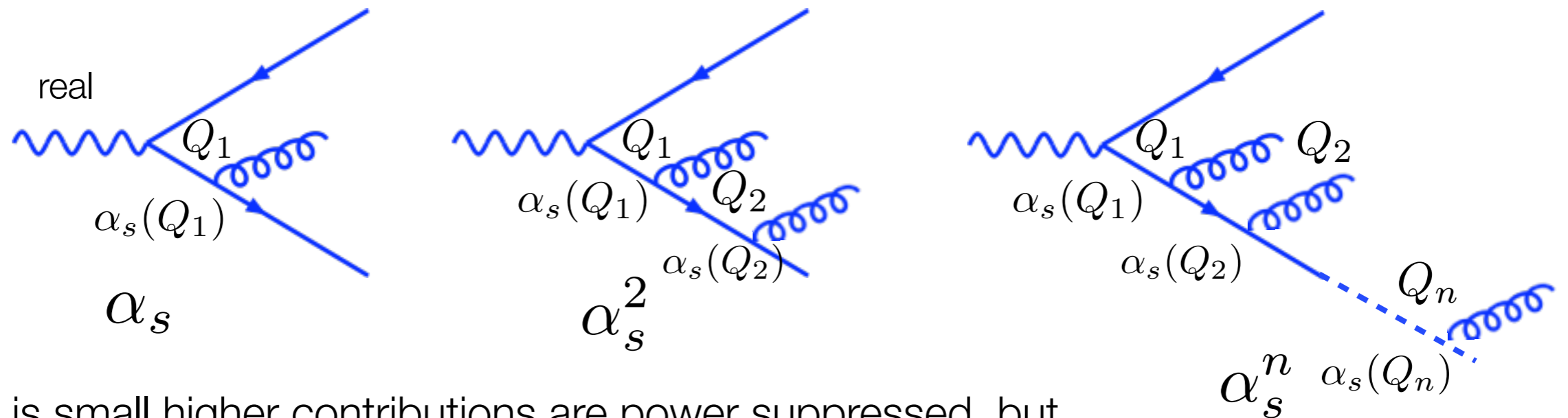
$$P_{q \rightarrow qg} = \frac{4}{3} \frac{1+z^2}{1-z} \quad R_z = \frac{\int_0^z P(z') dz'}{\int_0^1 P(z') dz'} \quad \text{flat distributed} \quad R_z \in [0, 1]$$



- (iv) Generate random azimuthal angle  $\Phi$  flat distributed

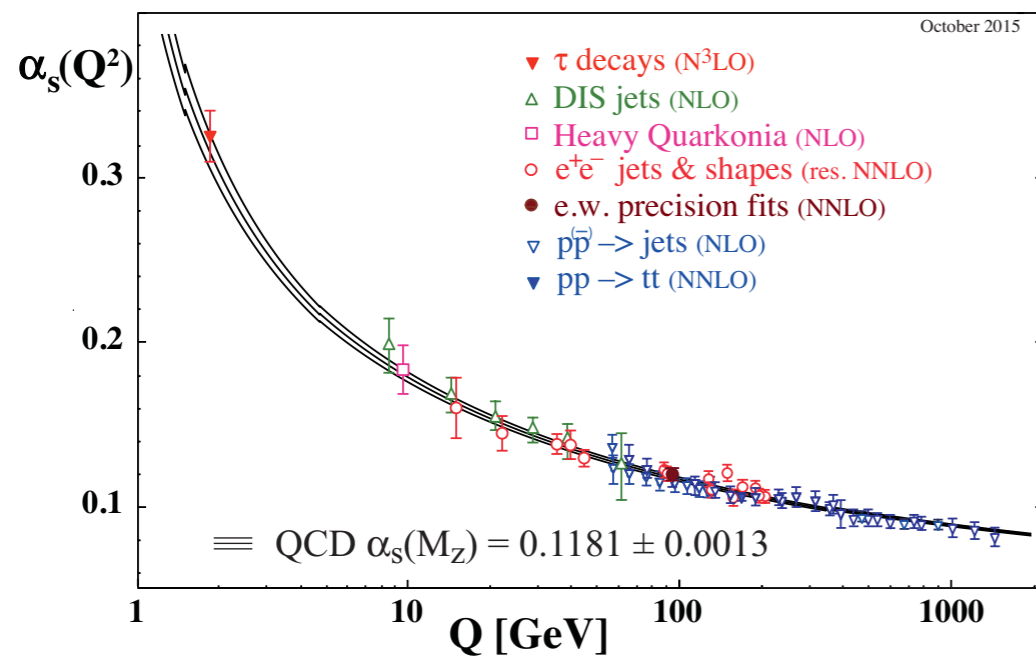
Process ends when partons are below threshold ( $p_T, Q$ )

# Parton shower and logarithmic resummation



If  $\alpha_s$  is small higher contributions are power suppressed, but...

$\alpha_s$  increases at small  $Q^2$



$$\alpha_s(Q_n) \sim \alpha_s(Q_1) \ln(Q_1/Q_n)$$

$$\alpha_s(Q_1) + \alpha_s(Q_1)\alpha_s(Q_2) + \dots + \alpha_s(Q_1) \cdot \dots \cdot \alpha_s(Q_n) \\ \sim [\alpha_s(Q_1) \ln(Q_1)]^2 \sim [\alpha_s(Q_1) \ln(Q_1)]^n$$

if  $\alpha_s(Q_1) \ln(Q_1)$  is large, the expansion is broken, PS allow to sum up all the large contribution [Leading Log resummation]

# Parton shower ordering

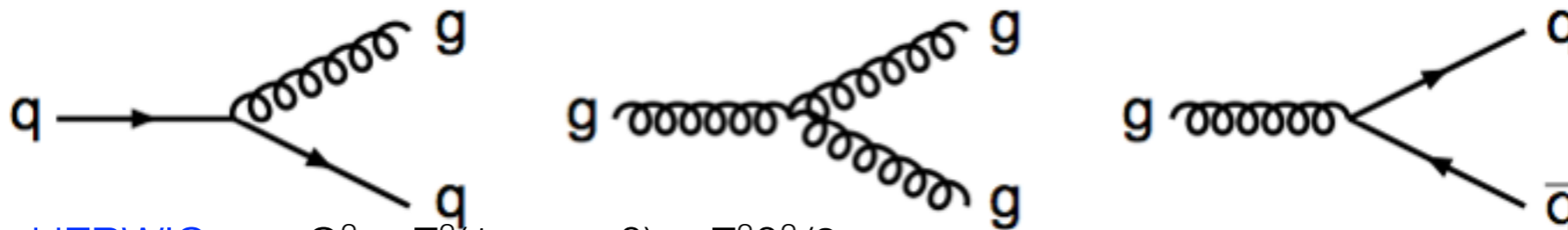
$$d\mathcal{P}_{a \rightarrow bc} = \frac{\alpha_s}{2\pi} \frac{dQ^2}{Q^2} P_{a \rightarrow bc}(z) dz \exp \left( - \sum_{b,c} \int_{Q^2}^{Q_{\max}^2} \frac{dQ'^2}{Q'^2} \int \frac{\alpha_s}{2\pi} P_{a \rightarrow bc}(z') dz' \right)$$

In the splitting function appears only  $dQ^2/Q^2$ , therefore if  $P = f(z)Q^2$   $dP/P = dQ^2/Q^2$

Three main approaches to showering in use:

$p_{\perp}^2 \approx z(1-z)m^2$   $p_{\perp}$  ordered showers       $E^2\theta^2 \approx m^2/(z(1-z))$  angular ordered showers

Two are based on the standard shower language of a  $\rightarrow bc$  successive branchings:

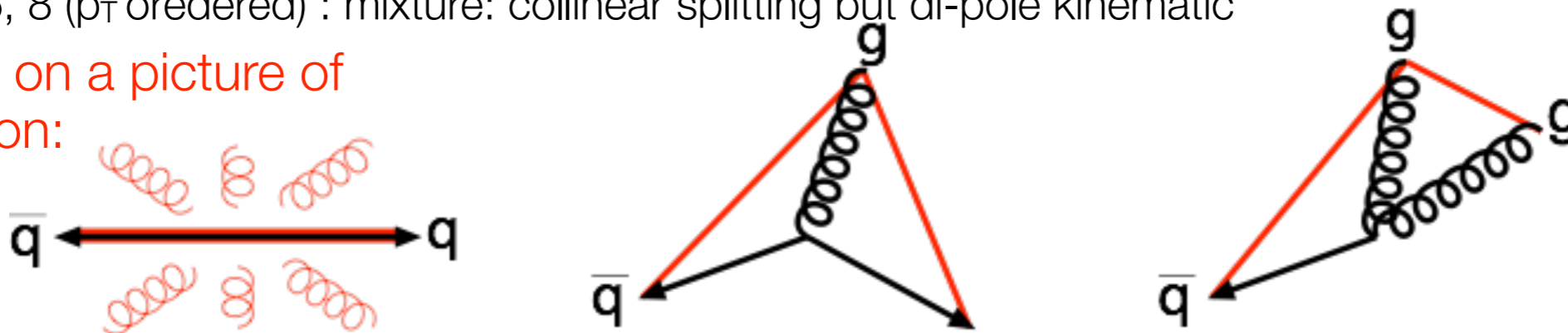


HERWIG, HERWIG++ :  $Q^2 \approx E^2(1 - \cos\theta) \approx E^2\theta^2/2$

PYTHIA, 8 (basic) :  $Q^2 = m^2$  (timelike) or  $= -m^2$  (spacelike)

PYTHIA6, 8 ( $p_{\perp}$  ordered) : mixture: collinear splitting but di-pole kinematic

One is based on a picture of dipole emission:



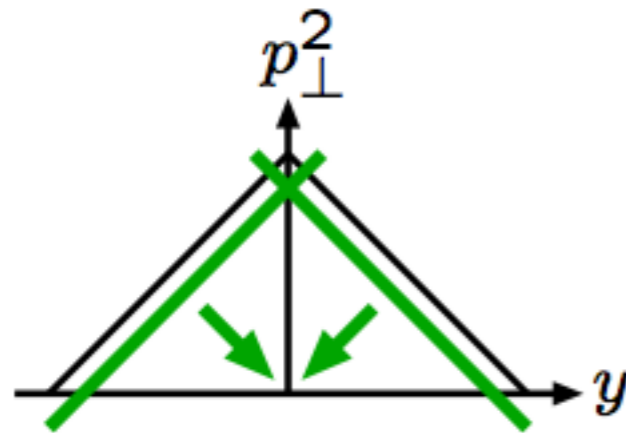
Ariadne :  $Q^2 = p_{\perp}^2$ ; FSR mainly, ISR is primitive ...

consider the full recoil and not only the branching

PYTHIA:  $Q^2 = m^2$

HERWIG/++:  $Q^2 \sim E^2 \theta^2$

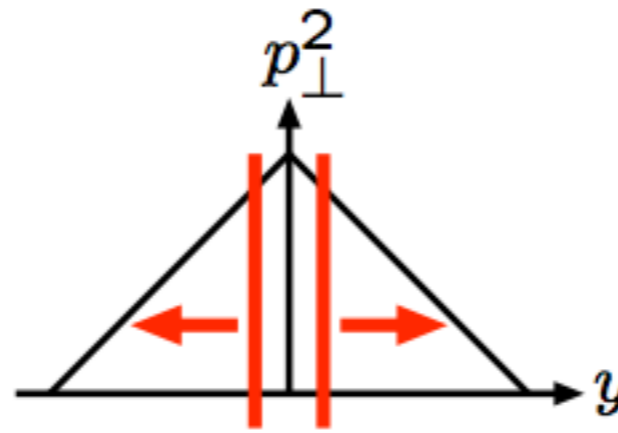
ARIADNE/Pythia8:  $Q^2 = p_{\perp}^2$



Large mass first  
[“hardness” ordered]

Covers phase space  
ME merging simple  
 $g \rightarrow qq$  simple  
not Lorentz invariant  
no stop/restart

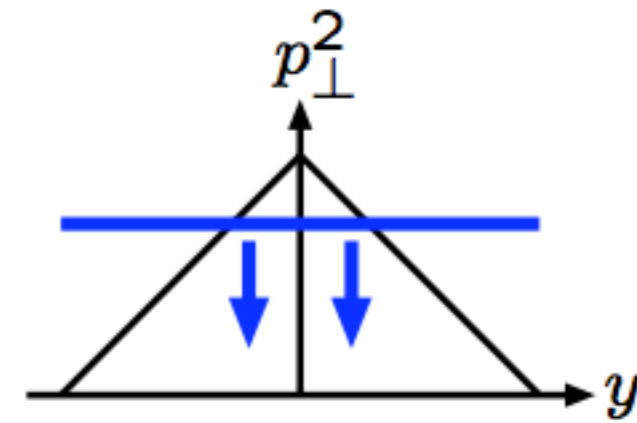
ISR:  $m^2 \rightarrow -m^2$



Large angle first  
[not “hardness” ordered]

Gaps in coverage  
ME merging messy  
 $g \rightarrow qq$  simple  
not Lorentz invariant  
no stop/restart

ISR:  $\theta \rightarrow \theta$



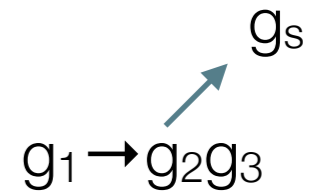
Large  $p_{\perp}$  first  
[“hardness” ordered]

Covers phase space  
ME merging simple  
 $g \rightarrow qq$  messy  
Lorentz invariant  
can stop/restart

ISR: complicated

# Color coherence

## QED: Chudakov effect (mid-fifties)



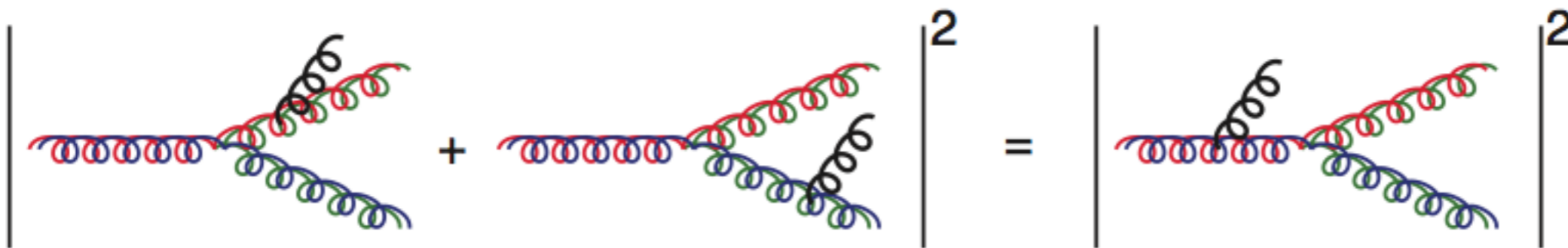
emulsion plate

reduced ionization

normal ionization

1. soft gluons see the pair of split gluons as a whole, color screening reduce their emission
2. angular ordered and  $p_T$  ordered PS reproduce the correct color coherence
3. Pythia  $Q^2$  needs a posteriori corrections

## QCD: colour coherence for **soft** gluon emission

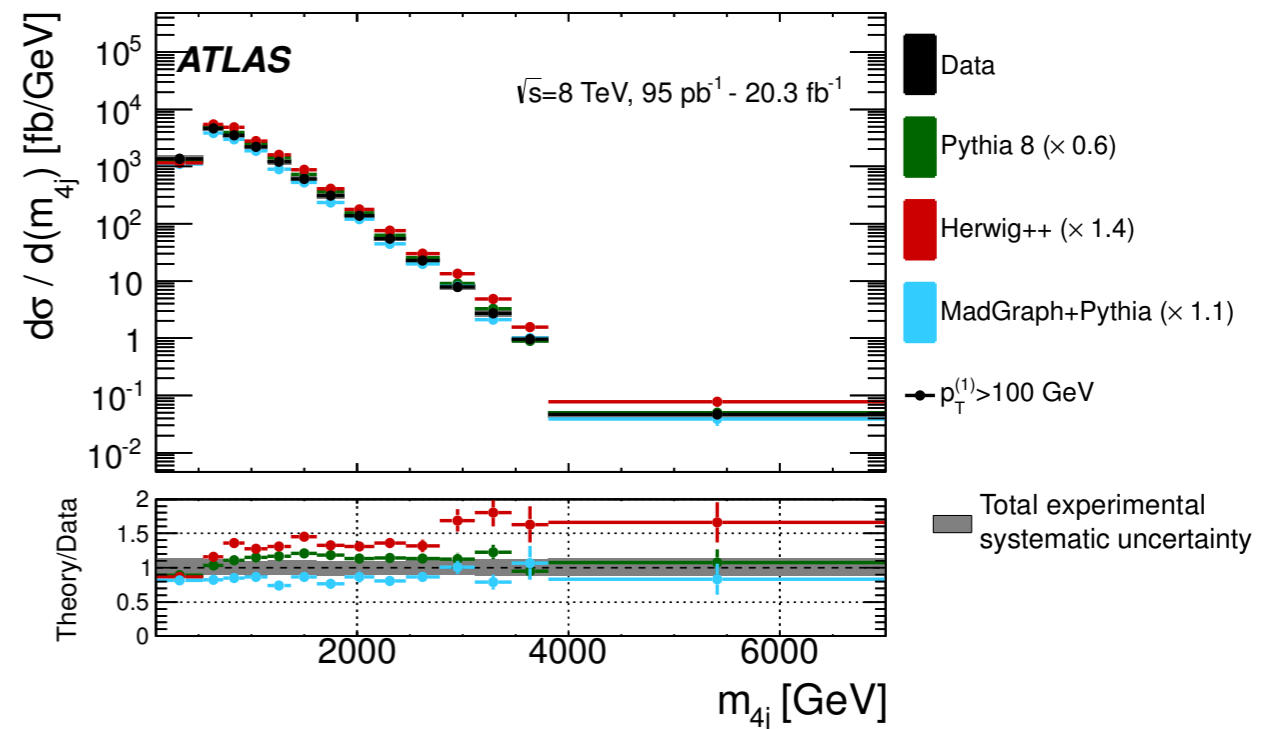
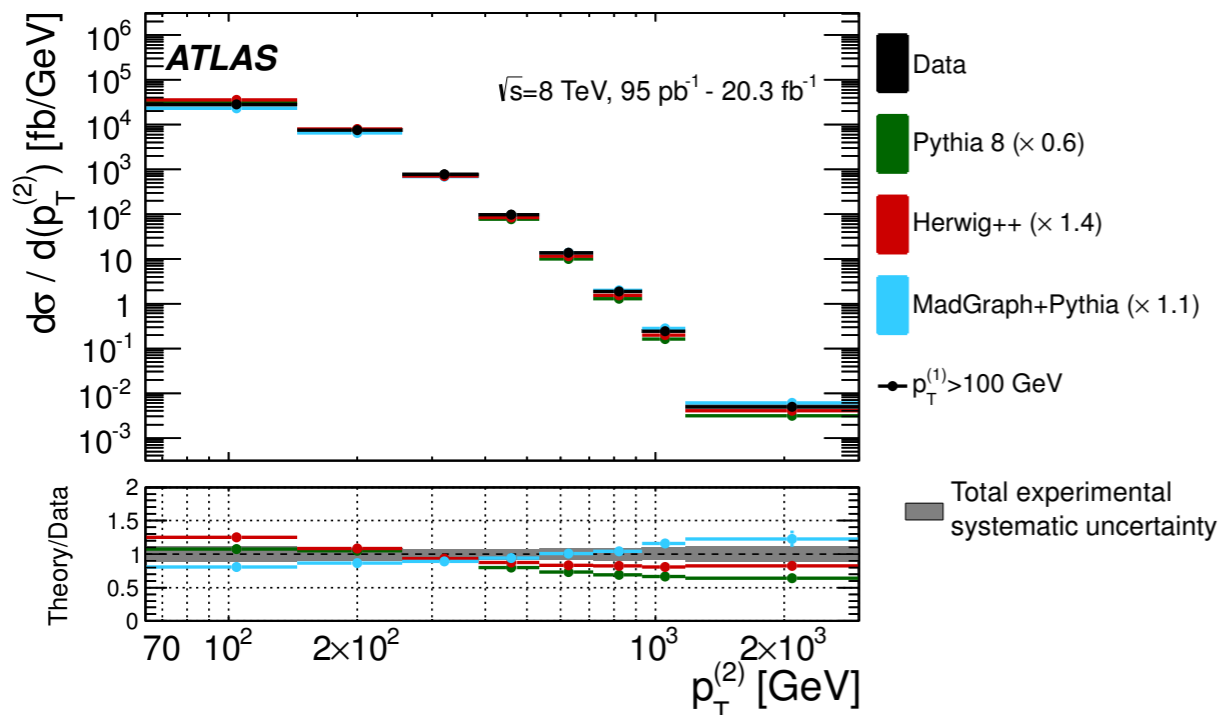
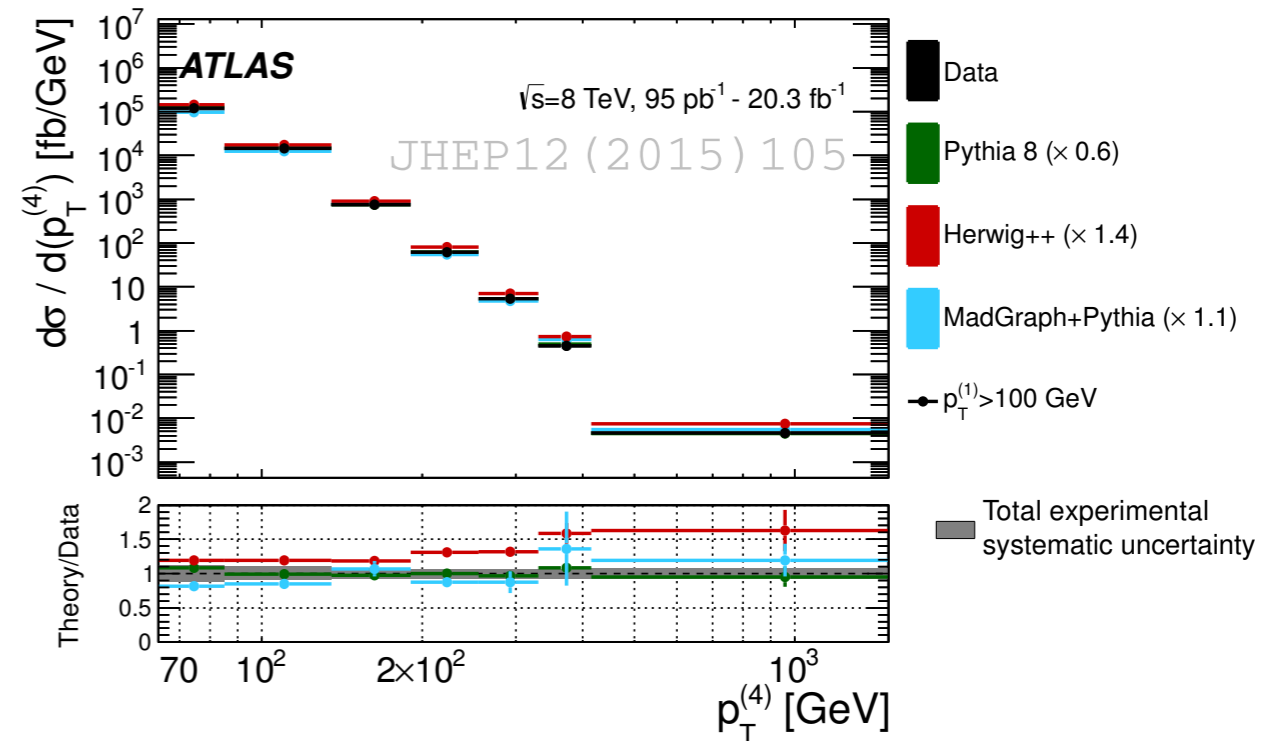
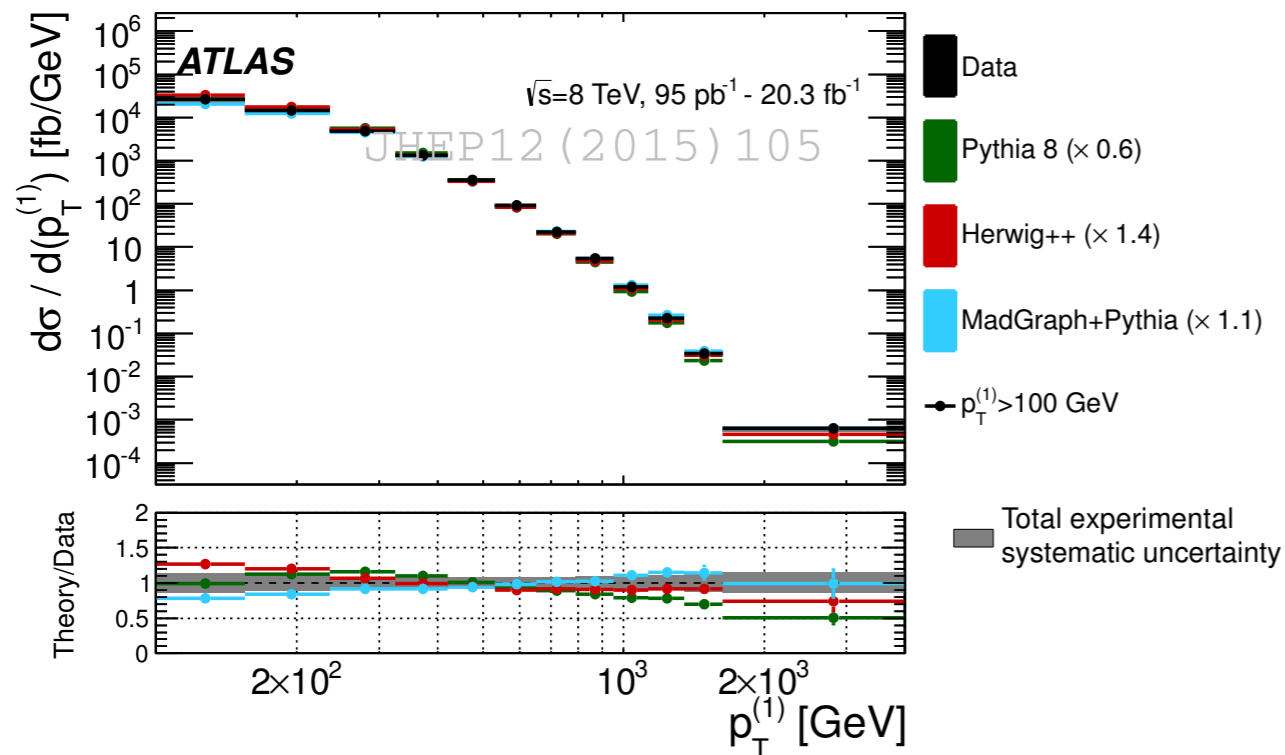


solved by  
or

- requiring emission angles to be decreasing
- requiring transverse momenta to be decreasing

# Compariosn to LHC data

4jets cross section:  $p_T^{(1)} > p_T^{(2)} > p_T^{(3)} > p_T^{(4)}$





# Example of processes implemented in Pythia6

No.	Subprocess	No.	Subprocess	No.	Subprocess	No.	Subprocess	No.	Subprocess	No.	Subprocess		
<b>Hard QCD processes:</b>		36	$f_i \gamma \rightarrow f_k W^\pm$	<b>New gauge bosons:</b>		<b>Higgs pairs:</b>		<b>Compositeness:</b>		210	$f_i \bar{f}_j \rightarrow \tilde{\ell}_L \tilde{\nu}_i^+ +$	250	$f_i g \rightarrow \tilde{q}_{iL} \tilde{\chi}_3$
11	$f_i \bar{f}_j \rightarrow f_i \bar{f}_j$	69	$\gamma \gamma \rightarrow W^+ W^-$	141	$f_i \bar{f}_i \rightarrow \gamma / Z^0 / Z'^0$	297	$f_i \bar{f}_j \rightarrow H^\pm h^0$	146	$e \gamma \rightarrow e^*$	211	$f_i \bar{f}_j \rightarrow \tilde{\tau}_1 \tilde{\nu}_\tau^+ +$	251	$f_i g \rightarrow \tilde{q}_{iR} \tilde{\chi}_3$
12	$f_i \bar{f}_i \rightarrow f_k \bar{f}_k$	70	$\gamma W^\pm \rightarrow Z^0 W^\pm$	142	$f_i \bar{f}_j \rightarrow W'^+$	298	$f_i \bar{f}_j \rightarrow H^\pm H^0$	147	$d g \rightarrow d^*$	212	$f_i \bar{f}_j \rightarrow \tilde{\tau}_2 \tilde{\nu}_\tau^+ +$	252	$f_i g \rightarrow \tilde{q}_{iL} \tilde{\chi}_4$
13	$f_i \bar{f}_i \rightarrow g g$	<b>Prompt photons:</b>		144	$f_i \bar{f}_j \rightarrow R$	299	$f_i \bar{f}_i \rightarrow A^0 h^0$	148	$u g \rightarrow u^*$	213	$f_i \bar{f}_i \rightarrow \tilde{\nu}_i \tilde{\nu}_i^*$	253	$f_i g \rightarrow \tilde{q}_{iR} \tilde{\chi}_4$
28	$f_i g \rightarrow f_i g$	14	$f_i \bar{f}_i \rightarrow g \gamma$	<b>Heavy SM Higgs:</b>		300	$f_i \bar{f}_i \rightarrow A^0 H^0$	167	$q_i \bar{q}_j \rightarrow d^* q_k$	214	$f_i \bar{f}_i \rightarrow \tilde{\nu}_\tau \tilde{\nu}_\tau^*$	254	$f_i g \rightarrow \tilde{q}_{jL} \tilde{\chi}_1^\pm$
53	$g g \rightarrow f_k \bar{f}_k$	18	$f_i \bar{f}_i \rightarrow \gamma \gamma$	5	$Z^0 Z^0 \rightarrow h^0$	301	$f_i \bar{f}_i \rightarrow H^+ H^-$	168	$q_i \bar{q}_j \rightarrow u^* q_k$	216	$f_i \bar{f}_i \rightarrow \tilde{\chi}_1 \tilde{\chi}_1$	256	$f_i g \rightarrow \tilde{q}_{jL} \tilde{\chi}_2^\pm$
68	$g g \rightarrow g g$	29	$f_i g \rightarrow f_i \gamma$	8	$W^+ W^- \rightarrow h^0$	<b>Leptoquarks:</b>		169	$q_i \bar{q}_i \rightarrow e^\pm e^* \bar{\nu}$	217	$f_i \bar{f}_i \rightarrow \tilde{\chi}_1 \tilde{\chi}_2$	258	$f_i g \rightarrow \tilde{q}_{iL} \tilde{g}$
<b>Soft QCD processes:</b>		114	$g g \rightarrow \gamma \gamma$	71	$Z_L^0 Z_L^0 \rightarrow Z_L^0 Z_L^0$	145	$q_i \bar{\ell}_j \rightarrow L Q$	165	$f_i \bar{f}_i (\rightarrow \gamma^* / Z^0) \rightarrow f_k \bar{f}_k$	218	$f_i \bar{f}_i \rightarrow \tilde{\chi}_3 \tilde{\chi}_3$	259	$f_i g \rightarrow \tilde{q}_{iR} \tilde{g}$
91	elastic scattering	115	$g g \rightarrow g \gamma$	72	$Z_L^0 Z_L^0 \rightarrow W_L^+ W_L^-$	162	$q g \rightarrow \bar{\ell} L Q$	166	$f_i \bar{f}_j (\rightarrow W^\pm) \rightarrow f_k \bar{f}_i$	219	$f_i \bar{f}_i \rightarrow \tilde{\chi}_4 \tilde{\chi}_4$	261	$f_i \bar{f}_i \rightarrow \tilde{t}_1 \tilde{t}_1^*$
92	single diffraction ( $XB$ )	<b>Deeply Inel. Scatt.:</b>		73	$Z_L^0 W_L^\pm \rightarrow Z_L^0 W_L^\pm$	163	$g g \rightarrow L Q \bar{L} Q$	<b>Extra Dimensions:</b>		220	$f_i \bar{f}_i \rightarrow \tilde{\chi}_1 \tilde{\chi}_2$	262	$f_i \bar{f}_i \rightarrow \tilde{t}_2 \tilde{t}_2^*$
93	single diffraction ( $AX$ )	10	$f_i \bar{f}_j \rightarrow f_k \bar{f}_i$	76	$W_L^+ W_L^- \rightarrow Z_L^0 Z_L^0$	164	$q_i \bar{q}_i \rightarrow L Q \bar{L} Q$	391	$f \bar{f} \rightarrow G^*$	221	$f_i \bar{f}_i \rightarrow \tilde{\chi}_1 \tilde{\chi}_3$	263	$f_i \bar{f}_i \rightarrow \tilde{t}_1 \tilde{t}_2^* +$
94	double diffraction	99	$\gamma^* q \rightarrow q$	77	$W_L^\pm W_L^\pm \rightarrow W_L^\pm W_L^\pm$	<b>Technicolor:</b>		392	$g g \rightarrow G^*$	222	$f_i \bar{f}_i \rightarrow \tilde{\chi}_1 \tilde{\chi}_4$	264	$g g \rightarrow \tilde{t}_1 \tilde{t}_1^*$
95	low- $p_\perp$ production	<b>Photon-induced:</b>		<b>BSM Neutral Higgs:</b>		149	$g g \rightarrow \eta_{bc}$	393	$q \bar{q} \rightarrow g G^*$	223	$f_i \bar{f}_i \rightarrow \tilde{\chi}_2 \tilde{\chi}_3$	265	$g g \rightarrow \tilde{t}_2 \tilde{t}_2^*$
<b>Open heavy flavour: (also fourth generation)</b>		33	$f_i \gamma \rightarrow f_i g$	151	$f_i \bar{f}_i \rightarrow H^0$	191	$f_i \bar{f}_i \rightarrow \rho_{tc}^0$	394	$q g \rightarrow q G^*$	224	$f_i \bar{f}_i \rightarrow \tilde{\chi}_2 \tilde{\chi}_4$	271	$f_i \bar{f}_j \rightarrow \tilde{q}_{iL} \tilde{q}_{jL}$
81	$f_i \bar{f}_i \rightarrow Q_k \bar{Q}_k$	34	$f_i \gamma \rightarrow f_i \gamma$	152	$g g \rightarrow H^0$	192	$f_i \bar{f}_j \rightarrow \rho_{tc}^+$	395	$g g \rightarrow g G^*$	225	$f_i \bar{f}_i \rightarrow \tilde{\chi}_3 \tilde{\chi}_4$	272	$f_i \bar{f}_j \rightarrow \tilde{q}_{iR} \tilde{q}_{jR}$
82	$g g \rightarrow Q_k \bar{Q}_k$	54	$g \gamma \rightarrow f_k \bar{f}_k$	153	$\gamma \gamma \rightarrow H^0$	193	$f_i \bar{f}_i \rightarrow \omega_{tc}^0$	<b>Left-right symmetry:</b>		226	$f_i \bar{f}_i \rightarrow \tilde{\chi}_1^\pm \tilde{\chi}_1^\mp$	273	$f_i \bar{f}_j \rightarrow \tilde{q}_{iL} \tilde{q}_{jR} +$
83	$q_i \bar{f}_j \rightarrow Q_k \bar{f}_i$	58	$\gamma \gamma \rightarrow f_k \bar{f}_k$	171	$f_i \bar{f}_i \rightarrow Z^0 H^0$	194	$f_i \bar{f}_i \rightarrow f_k \bar{f}_k$	341	$\bar{\ell}_i \bar{\ell}_j \rightarrow H_L^{\pm\pm}$	227	$f_i \bar{f}_i \rightarrow \tilde{\chi}_2^\pm \tilde{\chi}_2^\mp$	274	$f_i \bar{f}_j \rightarrow \tilde{q}_{iL} \tilde{q}_{jL}^*$
84	$g \gamma \rightarrow Q_k \bar{Q}_k$	131	$f_i \gamma_i^* \rightarrow f_i g$	172	$f_i \bar{f}_j \rightarrow W^\pm H^0$	195	$f_i \bar{f}_j \rightarrow f_k \bar{f}_i$	342	$\bar{\ell}_i \bar{\ell}_j \rightarrow H_R^{\pm\pm}$	228	$f_i \bar{f}_i \rightarrow \tilde{\chi}_1^\pm \tilde{\chi}_2^\mp$	275	$f_i \bar{f}_j \rightarrow \tilde{q}_{iR} \tilde{q}_{jR}^*$
85	$\gamma \gamma \rightarrow F_k \bar{F}_k$	132	$f_i \gamma_i^* \rightarrow f_i g$	173	$f_i \bar{f}_j \rightarrow f_i \bar{f}_j H^0$	361	$f_i \bar{f}_i \rightarrow W_L^\pm W_L^\mp$	343	$\bar{\ell}_i^\pm \gamma \rightarrow H_L^{\pm\pm} e^\mp$	229	$f_i \bar{f}_j \rightarrow \tilde{\chi}_1 \tilde{\chi}_1^\pm$	276	$f_i \bar{f}_j \rightarrow \tilde{q}_{iL} \tilde{q}_{jL}^*$
<b>Closed heavy flavour:</b>		133	$f_i \gamma_i^* \rightarrow f_i \gamma$	174	$f_i \bar{f}_j \rightarrow f_k \bar{f}_i H^0$	362	$f_i \bar{f}_i \rightarrow W_L^\pm \pi_{tc}^\mp$	344	$\bar{\ell}_i^\pm \gamma \rightarrow H_R^{\pm\pm} e^\mp$	230	$f_i \bar{f}_j \rightarrow \tilde{\chi}^0 \tilde{\chi}_1^\pm$	277	$f_i \bar{f}_i \rightarrow \tilde{q}_{jL} \tilde{q}_{iL}^*$
86	$g g \rightarrow J/\psi g$	134	$f_i \gamma_i^* \rightarrow f_i \gamma$	181	$g g \rightarrow Q_k \bar{Q}_k H^0$	363	$f_i \bar{f}_i \rightarrow \pi_{tc}^+ \pi_{tc}^-$	345	$\bar{\ell}_i^\pm \gamma \rightarrow H_L^{\pm\pm} \mu^\mp$	231	$f_i \bar{f}_j \rightarrow \tilde{\chi}^0 \tilde{\chi}_1^\pm$	278	$f_i \bar{f}_i \rightarrow \tilde{q}_{jR} \tilde{q}_{iR}^*$
87	$g g \rightarrow \chi_{0c} g$	135	$g \gamma_i^* \rightarrow f_i \bar{f}_i$	182	$q_i \bar{q}_i \rightarrow Q_k \bar{Q}_k H^0$	364	$f_i \bar{f}_i \rightarrow \gamma \pi_{tc}^0$	346	$\bar{\ell}_i^\pm \gamma \rightarrow H_R^{\pm\pm} \mu^\mp$	232	$f_i \bar{f}_j \rightarrow \tilde{\chi}^0 \tilde{\chi}_1^\pm$	279	$g g \rightarrow \tilde{q}_{iL} \tilde{q}_i^* L$
88	$g g \rightarrow \chi_{1c} g$	136	$g \gamma_i^* \rightarrow f_i \bar{f}_i$	183	$f_i \bar{f}_i \rightarrow g H^0$	365	$f_i \bar{f}_i \rightarrow \gamma \pi_{tc}^0$	347	$\bar{\ell}_i^\pm \gamma \rightarrow H_L^{\pm\pm} \tau^\mp$	233	$f_i \bar{f}_j \rightarrow \tilde{\chi}^0 \tilde{\chi}_1^\pm$	280	$g g \rightarrow \tilde{q}_{iR} \tilde{q}_i^* R$
89	$g g \rightarrow \chi_{2c} g$	137	$\gamma_i^* \gamma_j^* \rightarrow f_i \bar{f}_i$	184	$f_i g \rightarrow f_i H^0$	366	$f_i \bar{f}_i \rightarrow Z^0 \pi_{tc}^0$	348	$\bar{\ell}_i^\pm \gamma \rightarrow H_R^{\pm\pm} \tau^\mp$	234	$f_i \bar{f}_j \rightarrow \tilde{\chi}^0 \tilde{\chi}_2^\pm$	281	$b q_i \rightarrow \tilde{b}_1 \tilde{q}_{iL}$
104	$g g \rightarrow \chi_{0c}$	138	$\gamma_i^* \gamma_j^* \rightarrow f_i \bar{f}_i$	185	$g g \rightarrow g H^0$	367	$f_i \bar{f}_i \rightarrow Z^0 \pi_{tc}^0$	349	$f_i \bar{f}_i \rightarrow H_L^+ H_L^-$	235	$f_i \bar{f}_j \rightarrow \tilde{\chi}^0 \tilde{\chi}_2^\pm$	282	$b q_i \rightarrow \tilde{b}_2 \tilde{q}_{iR}$
105	$g g \rightarrow \chi_{2c}$	139	$\gamma_i^* \gamma_j^* \rightarrow f_i \bar{f}_i$	156	$f_i \bar{f}_i \rightarrow A^0$	368	$f_i \bar{f}_i \rightarrow W^\pm \pi_{tc}^\mp$	350	$f_i \bar{f}_i \rightarrow H_R^+ H_R^-$	236	$f_i \bar{f}_j \rightarrow \tilde{\chi}^0 \tilde{\chi}_2^\pm$	283	$b q_i \rightarrow \tilde{b}_1 \tilde{q}_{iR} +$
106	$g g \rightarrow J/\psi \gamma$	140	$\gamma_i^* \gamma_j^* \rightarrow f_i \bar{f}_i$	157	$g g \rightarrow A^0$	370	$f_i \bar{f}_j \rightarrow W_L^\pm Z_L^0$	351	$f_i \bar{f}_j \rightarrow f_k \bar{f}_i H_L^{\pm\pm}$	237	$f_i \bar{f}_i \rightarrow \tilde{g} \tilde{\chi}_1$	284	$b \bar{q}_i \rightarrow \tilde{b}_1 \tilde{q}_i^* L$
107	$g \gamma \rightarrow J/\psi g$	80	$q_i \gamma \rightarrow q_k \pi^\pm$	158	$\gamma \gamma \rightarrow A^0$	371	$f_i \bar{f}_j \rightarrow W_L^\pm Z_L^0$	352	$f_i \bar{f}_j \rightarrow f_k \bar{f}_i H_R^{\pm\pm}$	238	$f_i \bar{f}_i \rightarrow \tilde{g} \tilde{\chi}_2$	285	$b \bar{q}_i \rightarrow \tilde{b}_2 \tilde{q}_i^* R$
108	$\gamma \gamma \rightarrow J/\psi \gamma$	<b>Light SM Higgs:</b>		176	$f_i \bar{f}_i \rightarrow Z^0 A^0$	372	$f_i \bar{f}_j \rightarrow \pi_{tc}^\pm Z_L^0$	353	$f_i \bar{f}_i \rightarrow Z^0$	239	$f_i \bar{f}_i \rightarrow \tilde{g} \tilde{\chi}_3$	286	$b \bar{q}_i \rightarrow \tilde{b}_1 \tilde{q}_i^* R +$
<b>W/Z production:</b>		3	$f_i \bar{f}_i \rightarrow h^0$	177	$f_i \bar{f}_j \rightarrow W^\pm A^0$	373	$f_i \bar{f}_j \rightarrow \pi_{tc}^\pm Z_L^0$	354	$f_i \bar{f}_j \rightarrow W_R^\pm$	240	$f_i \bar{f}_i \rightarrow \tilde{g} \tilde{\chi}_4$	287	$f_i \bar{f}_i \rightarrow \tilde{b}_1 \tilde{b}_1^*$
1	$f_i \bar{f}_i \rightarrow \gamma^* / Z^0$	24	$f_i \bar{f}_i \rightarrow Z^0 h^0$	178	$f_i \bar{f}_j \rightarrow f_i \bar{f}_j A^0$	374	$f_i \bar{f}_j \rightarrow \gamma \pi_{tc}^\pm$	<b>SUSY:</b>		241	$f_i \bar{f}_j \rightarrow \tilde{g} \tilde{\chi}_1^\pm$	288	$f_i \bar{f}_i \rightarrow \tilde{b}_2 \tilde{b}_2^*$
2	$f_i \bar{f}_j \rightarrow W^\pm$	26	$f_i \bar{f}_j \rightarrow W^\pm h^0$	179	$f_i \bar{f}_j \rightarrow f_k \bar{f}_i A^0$	375	$f_i \bar{f}_j \rightarrow Z^0 \pi_{tc}^\pm$	201	$f_i \bar{f}_i \rightarrow \tilde{e}_L \tilde{e}_L^*$	242	$f_i \bar{f}_j \rightarrow \tilde{g} \tilde{\chi}_2^\pm$	289	$g g \rightarrow \tilde{b}_1 \tilde{b}_1^*$
22	$f_i \bar{f}_i \rightarrow Z^0 Z^0$	32	$f_i g \rightarrow f_i h^0$	186	$g g \rightarrow Q_k \bar{Q}_k A^0$	376	$f_i \bar{f}_j \rightarrow W^\pm \pi_{tc}^0$	202	$f_i \bar{f}_i \rightarrow \tilde{e}_R \tilde{e}_R^*$	243	$f_i \bar{f}_i \rightarrow \tilde{g} \tilde{g}$	290	$g g \rightarrow \tilde{b}_2 \tilde{b}_2^*$
23	$f_i \bar{f}_j \rightarrow Z^0 W^\pm$	102	$g g \rightarrow h^0$	187	$q_i \bar{q}_i \rightarrow Q_k \bar{Q}_k A^0$	377	$f_i \bar{f}_j \rightarrow W^\pm \pi_{tc}^0$	203	$f_i \bar{f}_i \rightarrow \tilde{e}_L \tilde{e}_R^* +$	244	$g g \rightarrow \tilde{g} \tilde{g}$	291	$bb \rightarrow \tilde{b}_1 \tilde{b}_1$
25	$f_i \bar{f}_i \rightarrow W^+ W^-$	103	$\gamma \gamma \rightarrow h^0$	188	$f_i \bar{f}_i \rightarrow g A^0$	381	$q_i \bar{q}_j \rightarrow q_i \bar{q}_j$	204	$f_i \bar{f}_i \rightarrow \tilde{\mu}_L \tilde{\mu}_L^*$	246	$f_i g \rightarrow \tilde{q}_{iL} \tilde{\chi}_1$	292	$bb \rightarrow \tilde{b}_2 \tilde{b}_2$
15	$f_i \bar{f}_i \rightarrow g Z^0$	110	$f_i \bar{f}_i \rightarrow \gamma h^0$	189	$f_i g \rightarrow f_i A^0$	382	$q_i \bar{q}_i \rightarrow q_k \bar{q}_k$	205	$f_i \bar{f}_i \rightarrow \tilde{\mu}_R \tilde{\mu}_R^*$	247	$f_i g \rightarrow \tilde{q}_{iR} \tilde{\chi}_1$	293	$bb \rightarrow \tilde{b}_1 \tilde{b}_2$
16	$f_i \bar{f}_j \rightarrow g W^\pm$	111	$f_i \bar{f}_i \rightarrow g h^0$	190	$g g \rightarrow g A^0$	383	$q_i \bar{q}_i \rightarrow g g$	206	$f_i \bar{f}_i \rightarrow \tilde{\mu}_L \tilde{\mu}_R^* +$	248	$f_i g \rightarrow \tilde{q}_{iL} \tilde{\chi}_2$	294	$bg \rightarrow \tilde{b}_1 \tilde{g}$
30	$f_i g \rightarrow f_i Z^0$	112	$f_i g \rightarrow f_i h^0$	<b>Charged Higgs:</b>		384	$f_i g \rightarrow f_i g$	207	$f_i \bar{f}_i \rightarrow \tilde{\tau}_1 \tilde{\tau}_1^*$	249	$f_i g \rightarrow \tilde{q}_{iR} \tilde{\chi}_2$	295	$bg \rightarrow \tilde{b}_2 \tilde{g}$
31	$f_i g \rightarrow f_k W^\pm$	113	$g g \rightarrow g h^0$	143	$f_i \bar{f}_j \rightarrow H^\pm$	385	$g g \rightarrow q_k \bar{q}_k$	208	$f_i \bar{f}_i \rightarrow \tilde{\tau}_2 \tilde{\tau}_2^*$			296	$b \bar{b} \rightarrow \tilde{b}_1 \tilde{b}_2^* +$
19	$f_i \bar{f}_i \rightarrow \gamma Z^0$	121	$g g \rightarrow Q_k \bar{Q}_k h^0$	161	$f_i g \rightarrow f_k H^\pm$	401	$g g \rightarrow t \bar{b} H^+$	209	$f_i \bar{f}_i \rightarrow \tilde{\tau}_1 \tilde{\tau}_2^* +$				
20	$f_i \bar{f}_j \rightarrow \gamma W^\pm$	122	$q_i \bar{q}_i \rightarrow Q_k \bar{Q}_k h^0$	402	$q \bar{q} \rightarrow t \bar{b} H^+$								
35	$f_i \gamma \rightarrow f_i Z^0$	123	$f_i \bar{f}_j \rightarrow f_i \bar{f}_j h^0$										
		124	$f_i \bar{f}_j \rightarrow f_k \bar{f}_i h^0$										

# Process simulation

Many specialized processes already available in Pythia8/Herwig++

but, processes usually only implemented in lowest non-trivial order ...

Need external programs that ...

1. include higher order loop corrections or, alternatively, do kinematic dependent rescaling
3. allow matching of higher order ME generators [otherwise need to trust parton shower description ...]
5. provide correct spin correlations often absent in PS ...[e.g. top produced unpolarized, while  $t \rightarrow bW \rightarrow b\nu$  decay correct]
7. simulate newly available physics scenarios ...[appear quickly; need for many specialised generators]

## Les Houches Accord ...

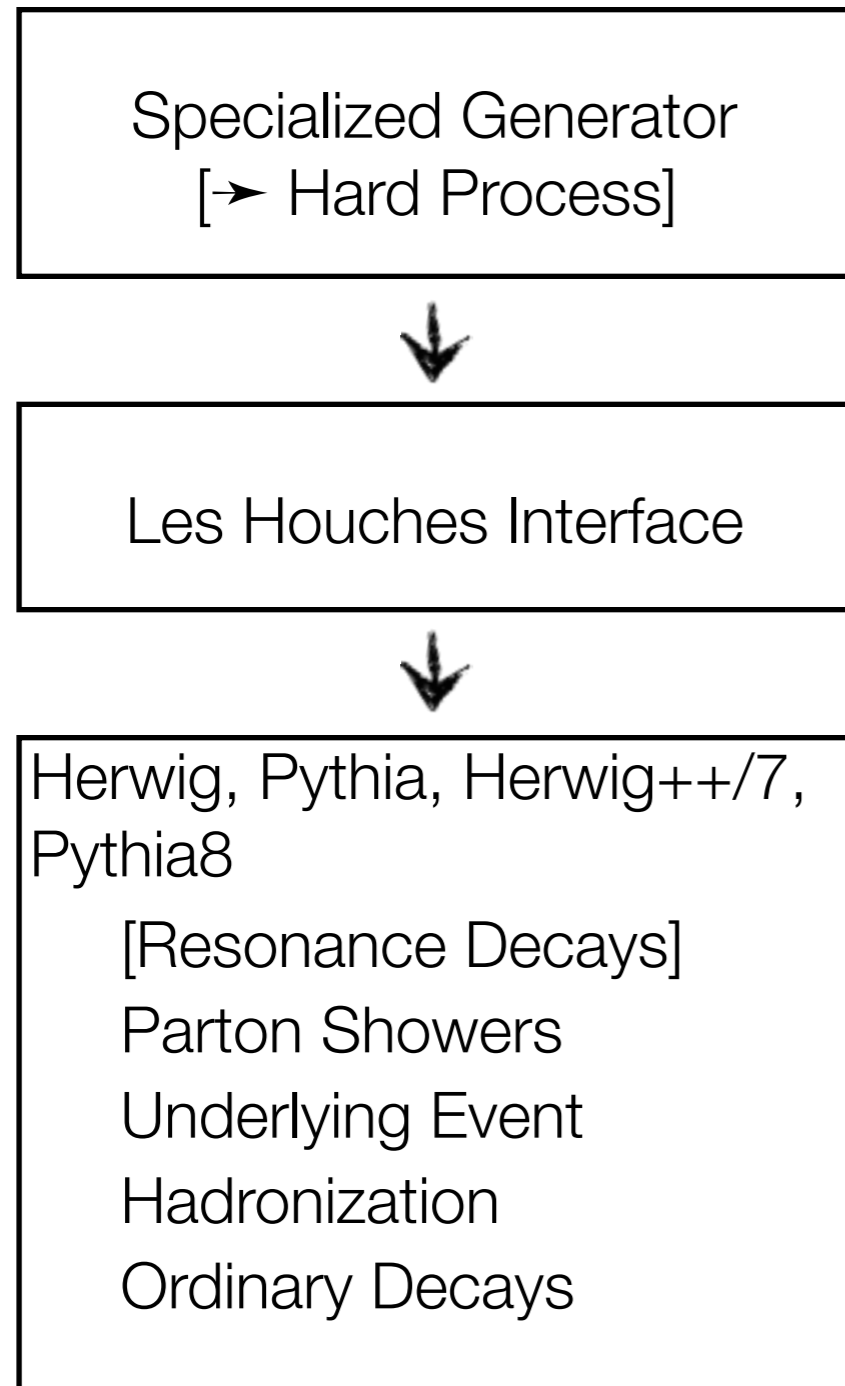
Specifies how parton-level information about the hard process and sequential decays can be encoded and passed on to a general-purpose generator.

Les Houches: regular annual meeting between theoreticians and experimentalists on MC generator developments.





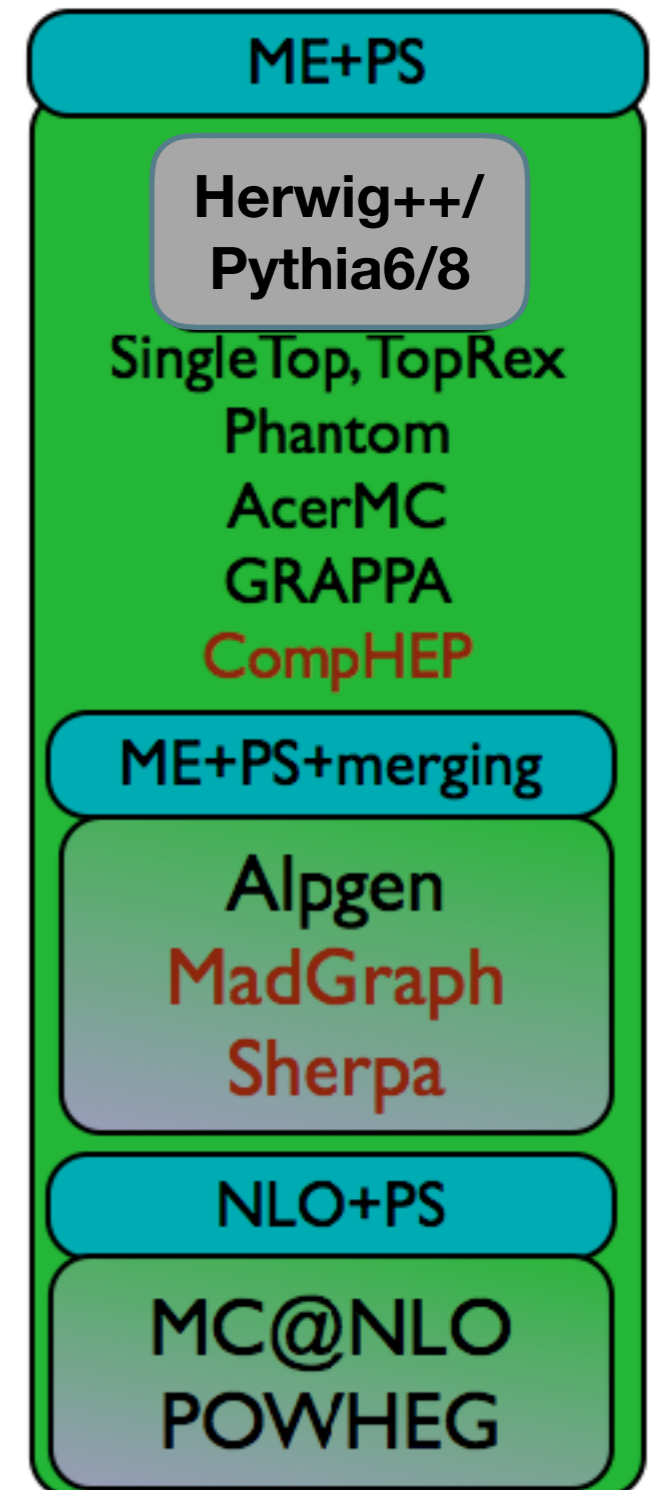
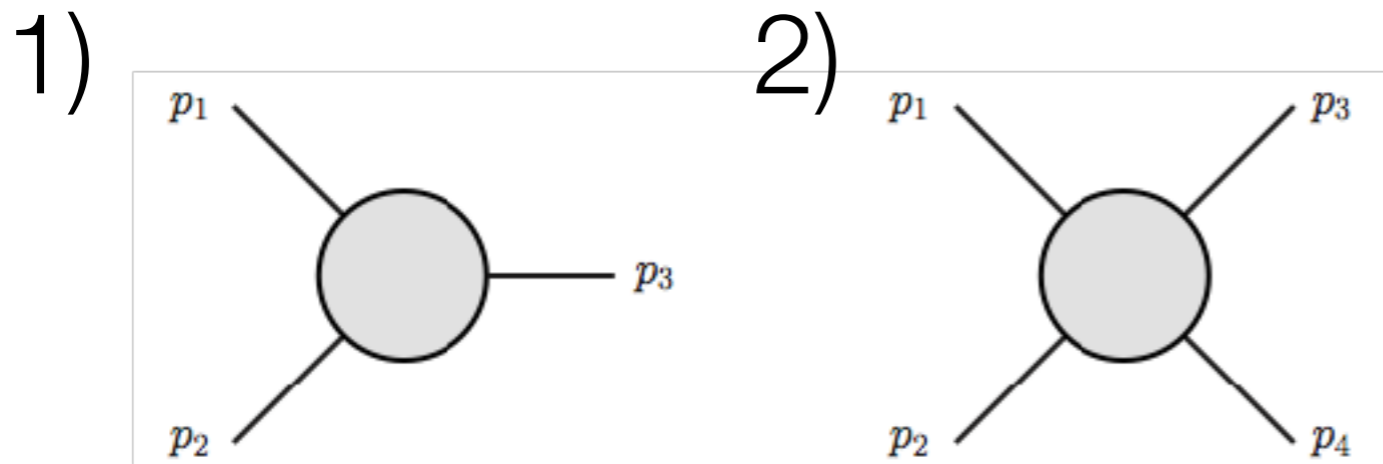
# Specialised Generators [some examples]



AcerMC	:	ttbb, .sinlr top
ALPGEN	:	W/Z + $\leq 6j$ , nW + mZ + kH + $\leq 3j$ , ...
AMEGIC++	:	generic LO
CompHEP	:	generic LO
GRACE	:	generic LO
[+Bases/Spring]	:	[+ some NLO loops]
GR@PPA	:	bbbb
MadCUP	:	W/Z+ $\leq 3j$ , ttbb
HELAS & MadGraph	:	generic LO
MCFM	:	NLO W/Z+ $\leq 2j$ , WZ, WH, H+ $\leq 1j$
O'Mega & WHIZARD	:	generic LO
VECBOS	:	W/Z+ $\leq 4j$
HRES	:	Higgs boson production @NNLO
DYNNLO	:	W/Z production @NNLO

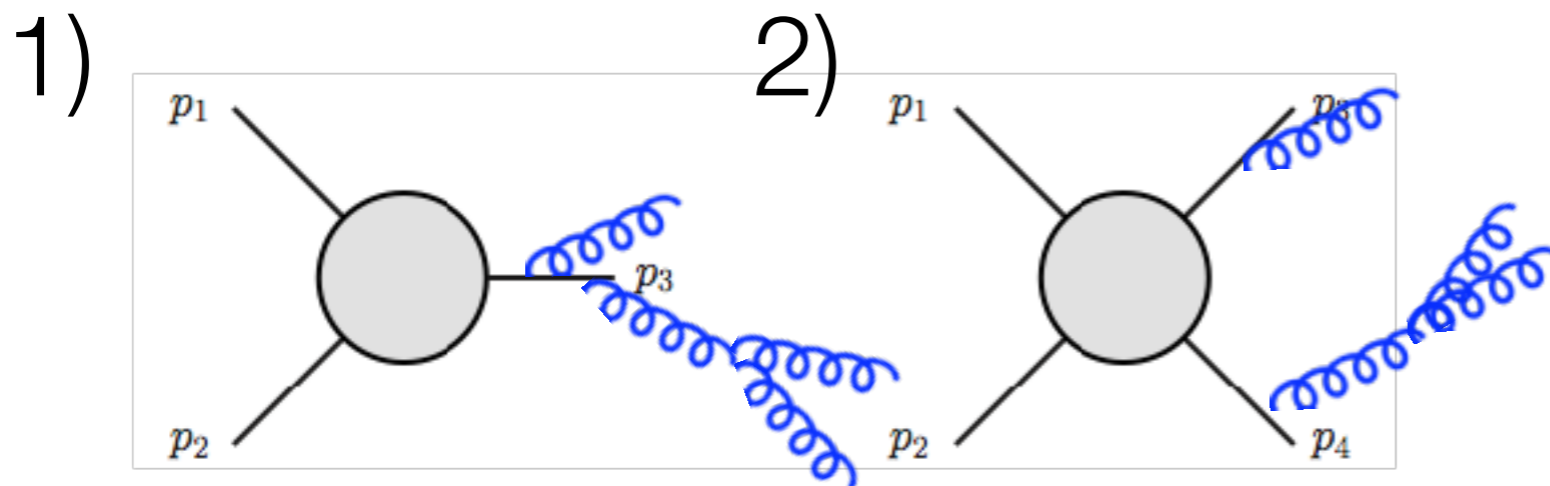
# Type I : Leading order matrix element & leading log parton shower

LO ME for hard processes  
[ $2 \rightarrow 1$  or  $2 \rightarrow 2$ ]

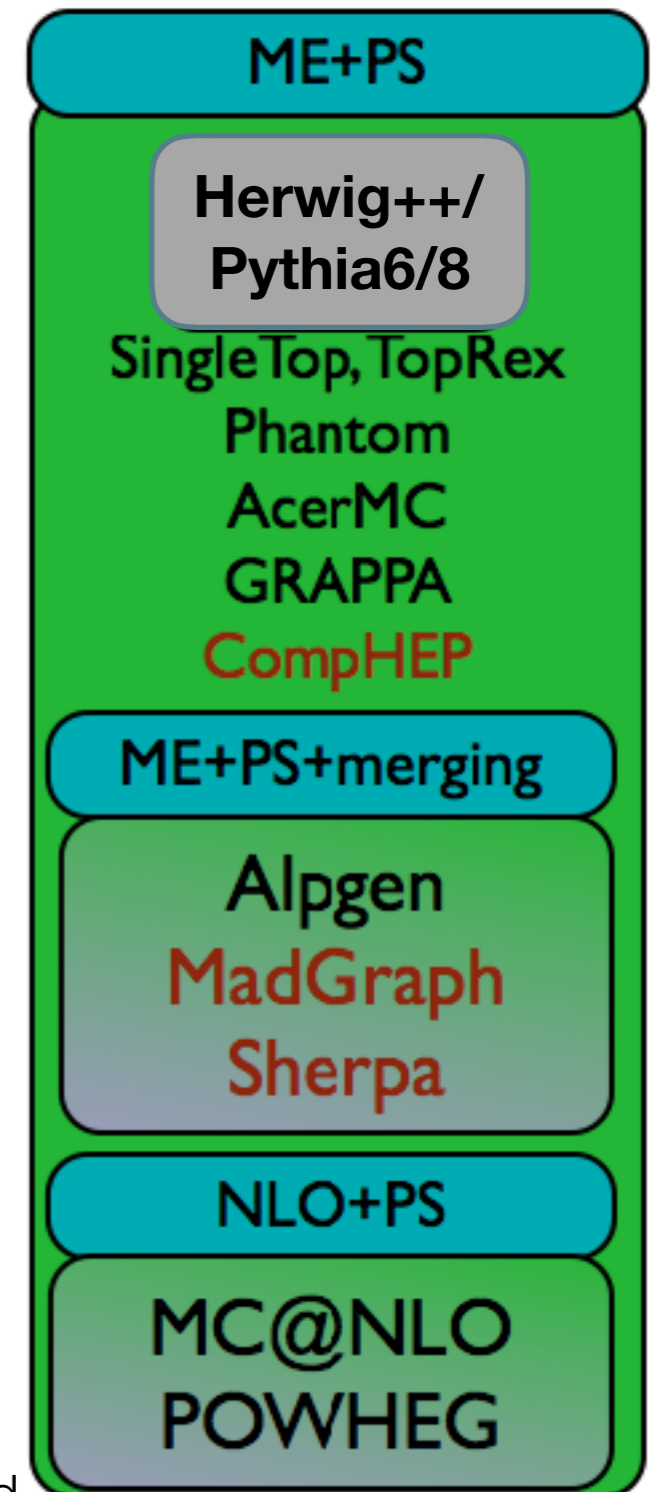


# Type I : Leading order matrix element & leading log parton shower

LO ME for hard processes  
[ $2 \rightarrow 1$  or  $2 \rightarrow 2$ ]

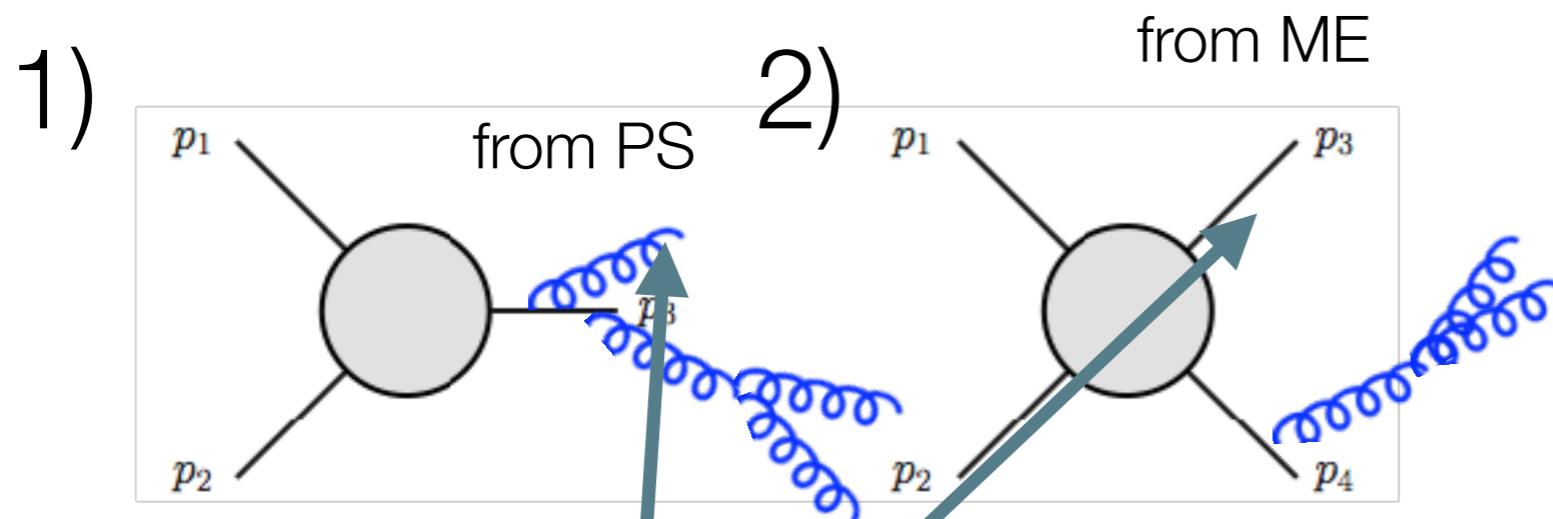


- Parton Shower: attaches gluons at each leg.
- only in soft-collinear approximation
- typically underestimate large angle/hard emission
- 1) or 2) at ME (different generations, different accuracy: cannot be combined)

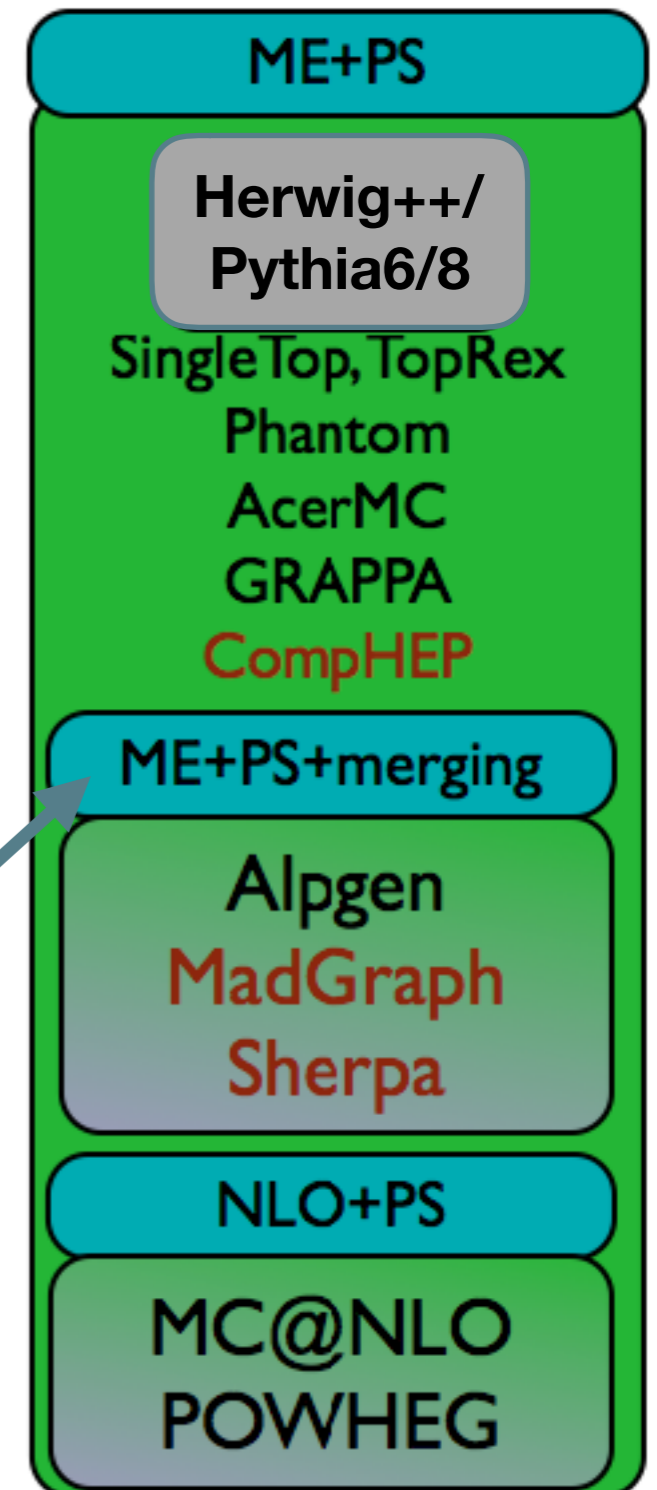


# Type 2 : Leading order matrix element & leading log parton shower + merging

LO ME for hard processes  
[ $2 \rightarrow 1$  or  $2 \rightarrow 2$ ]



- Type 1 can be improved using 1) + 2)
- use ME calculation for hard/large angle jets
- but needs to remove double-counting: merging (CKKW, MLM)
- very good description of high jet multiplicity kinematics



# Merging @LO

---

## MLM matching (simplified)

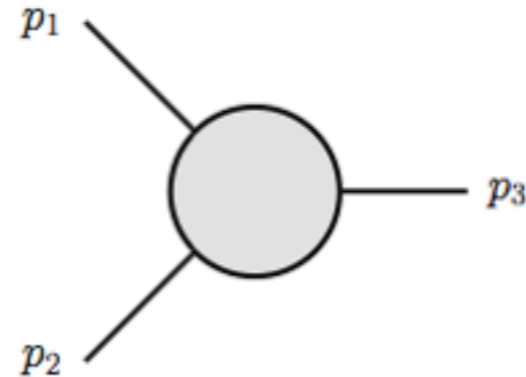
- 1) define matching cuts:  
for example  $p_{T^J} > 20 \text{ GeV}$ ,  $\Delta R=0.4$

# Merging @LO

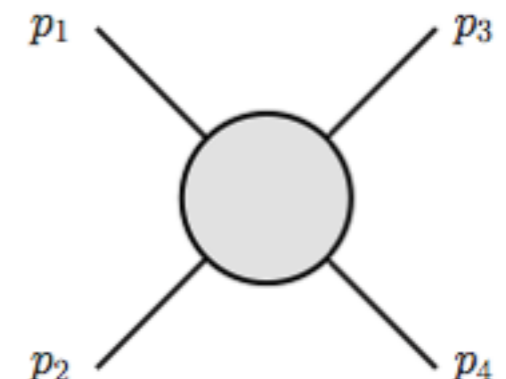
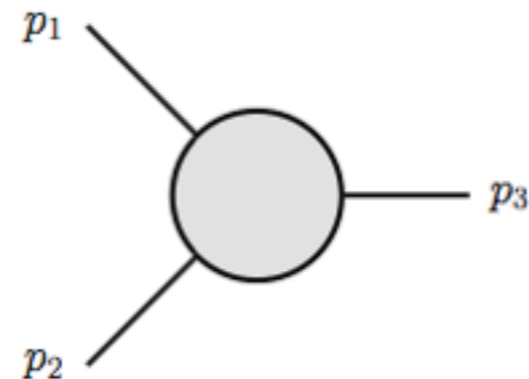
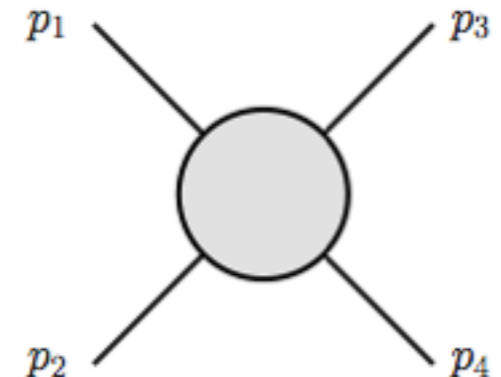
## MLM matching (simplified)

- 1) define matching cuts:  
for example  $p_{T^j} > 20 \text{ GeV}$ ,  $\Delta R=0.4$
- 2) generate ME with 1, 2, ...n jets

1 parton



2 partons

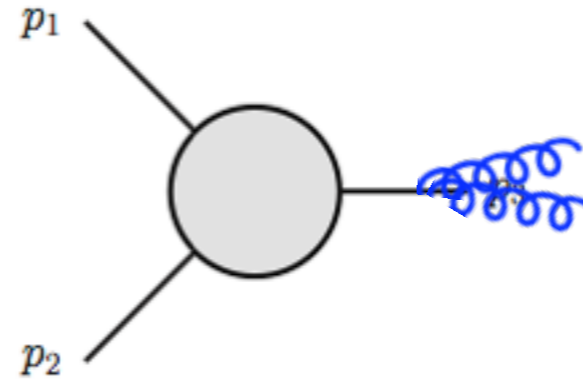


# Merging @LO

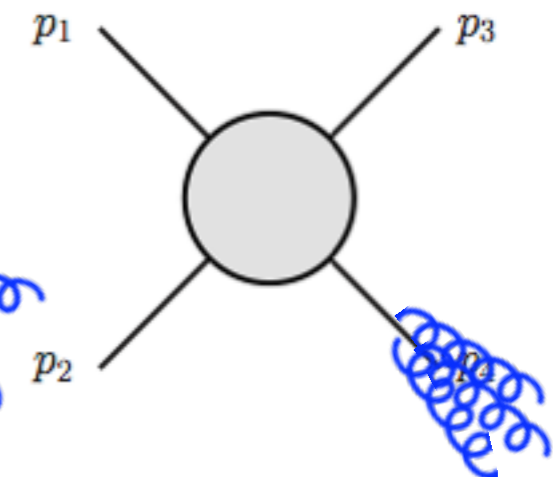
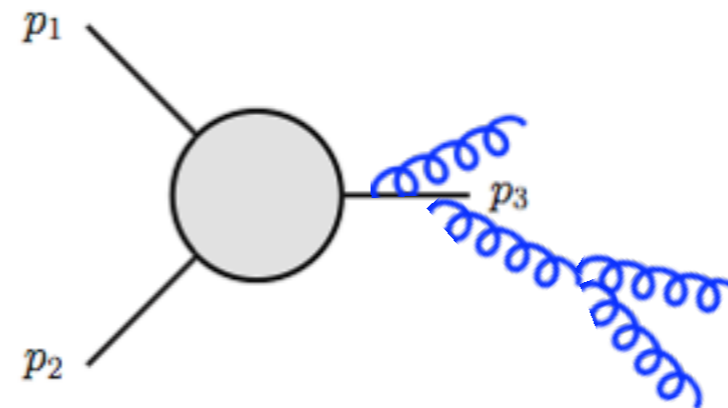
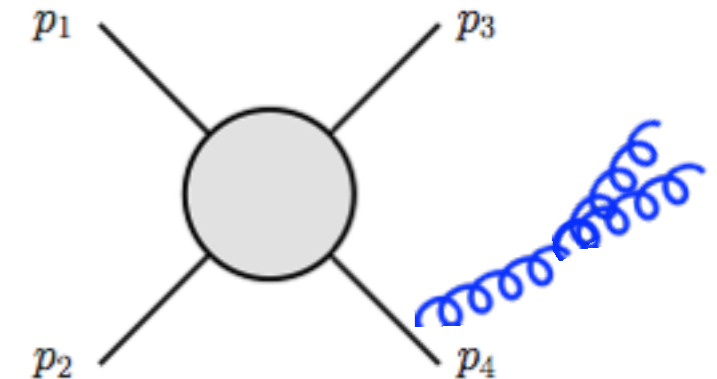
## MLM matching (simplified)

- 1) define matching cuts:  
for example  $p_T^J > 20 \text{ GeV}$ ,  $\Delta R=0.4$
- 2) generate ME with 1, 2, ...n jets
- 3) shower all events

1 parton



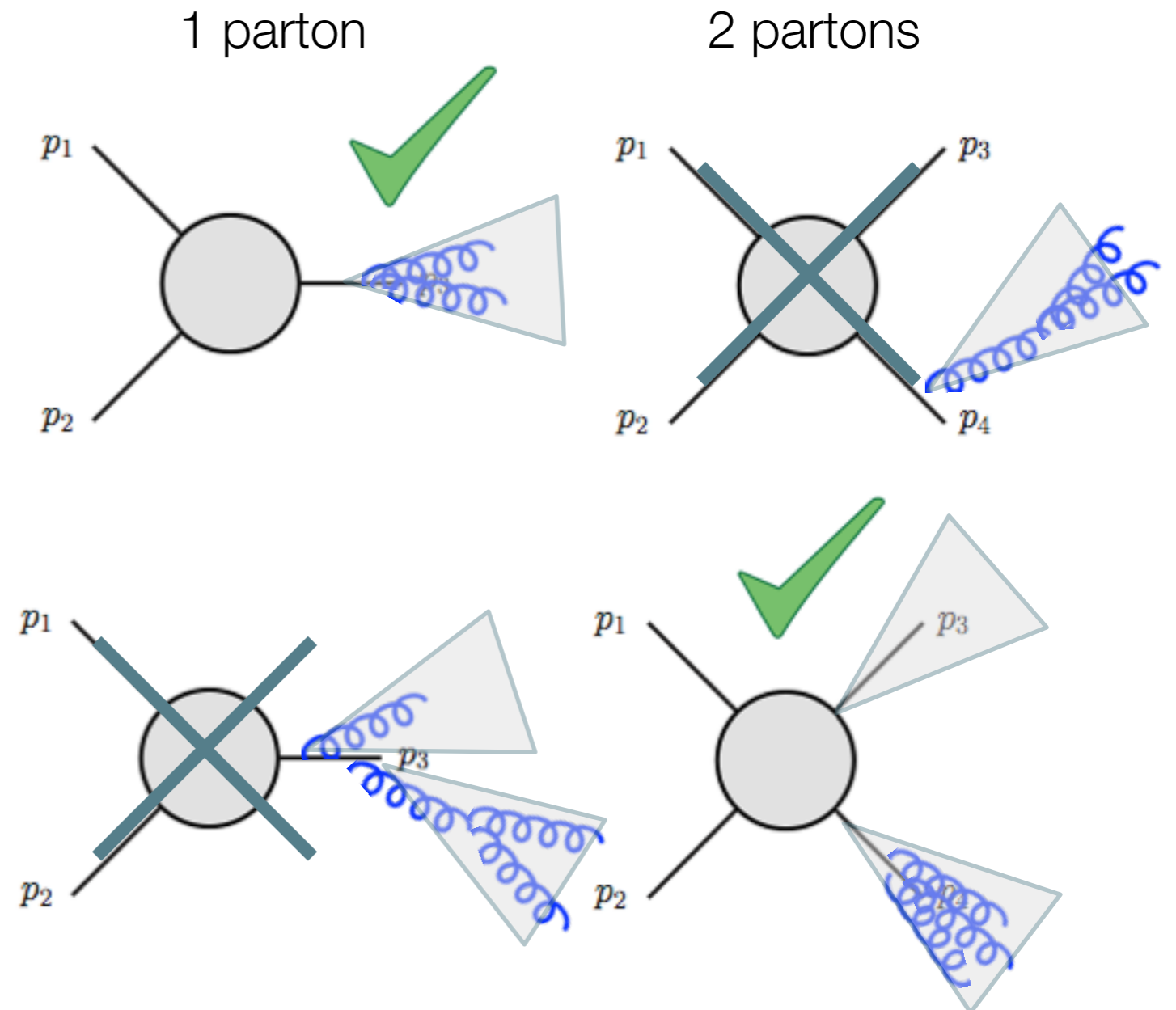
2 partons



# Merging @LO

## MLM matching (simplified)

- 1) define matching cuts:  
for example  $p_{T}^J > 20 \text{ GeV}$ ,  $\Delta R=0.4$
- 2) generate ME with 1, 2, ...n jets
- 3) shower all events
- 4) select only events where jets above the  $p_T$  threshold match with final partons





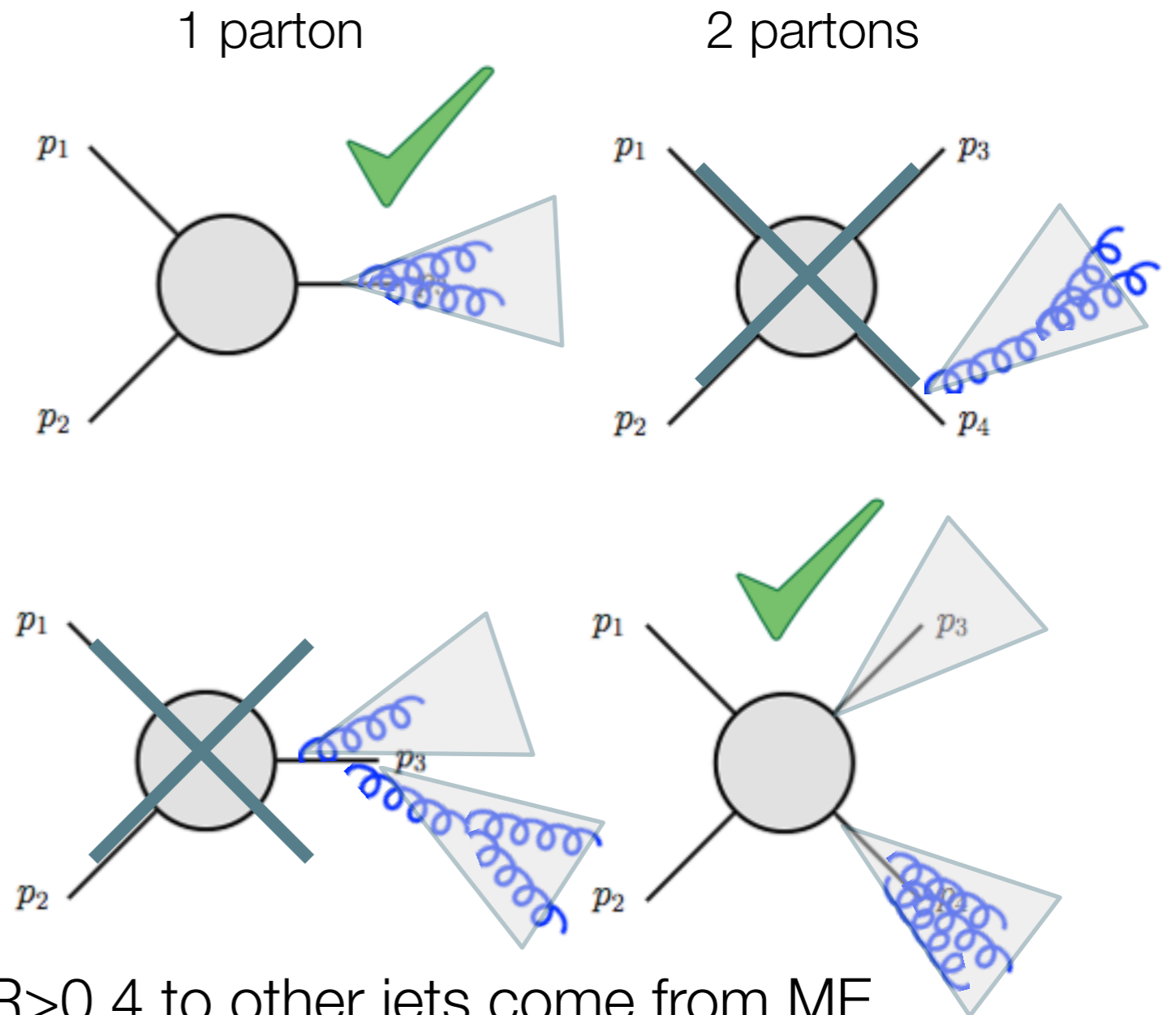
# Merging @LO

## MLM matching (simplified)

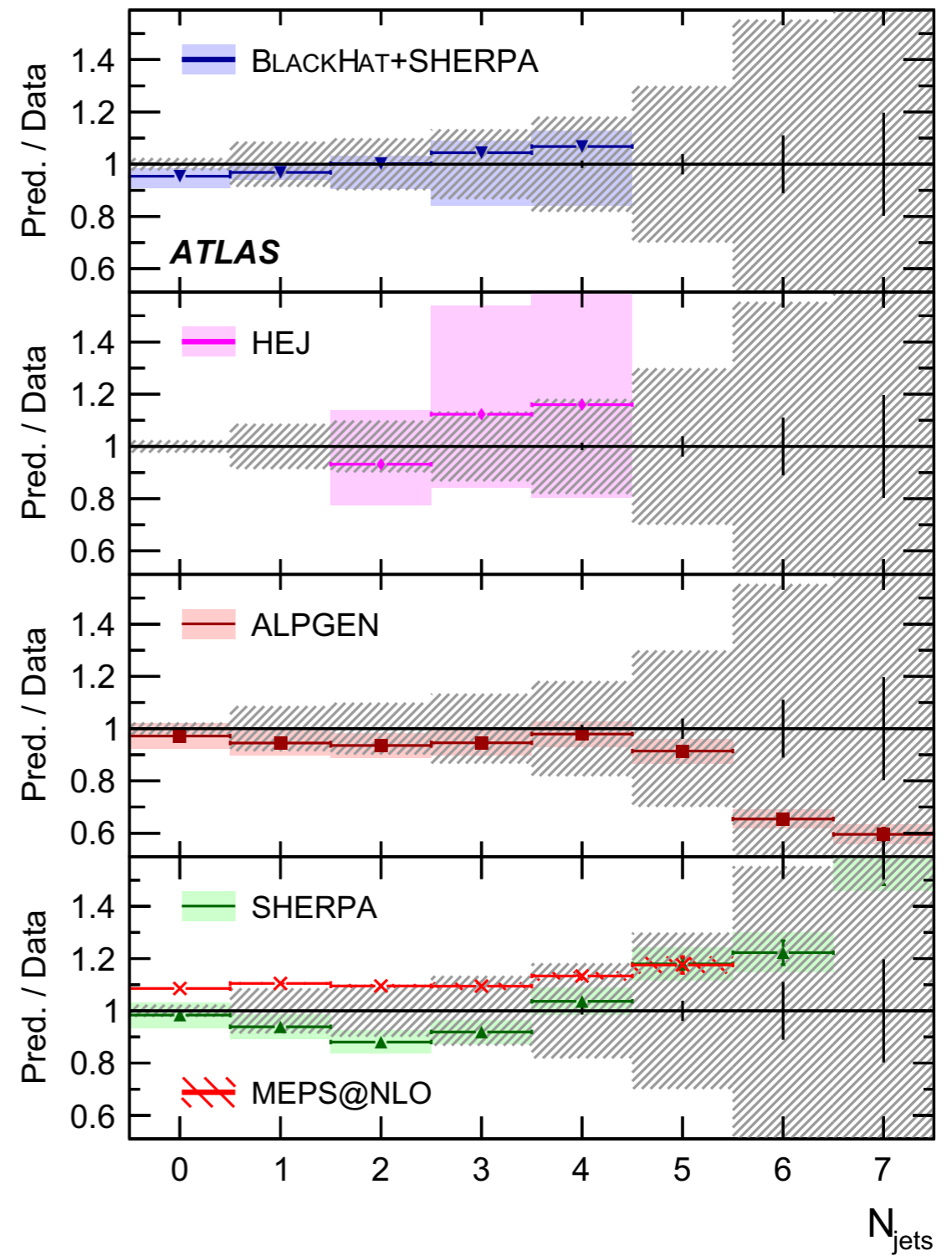
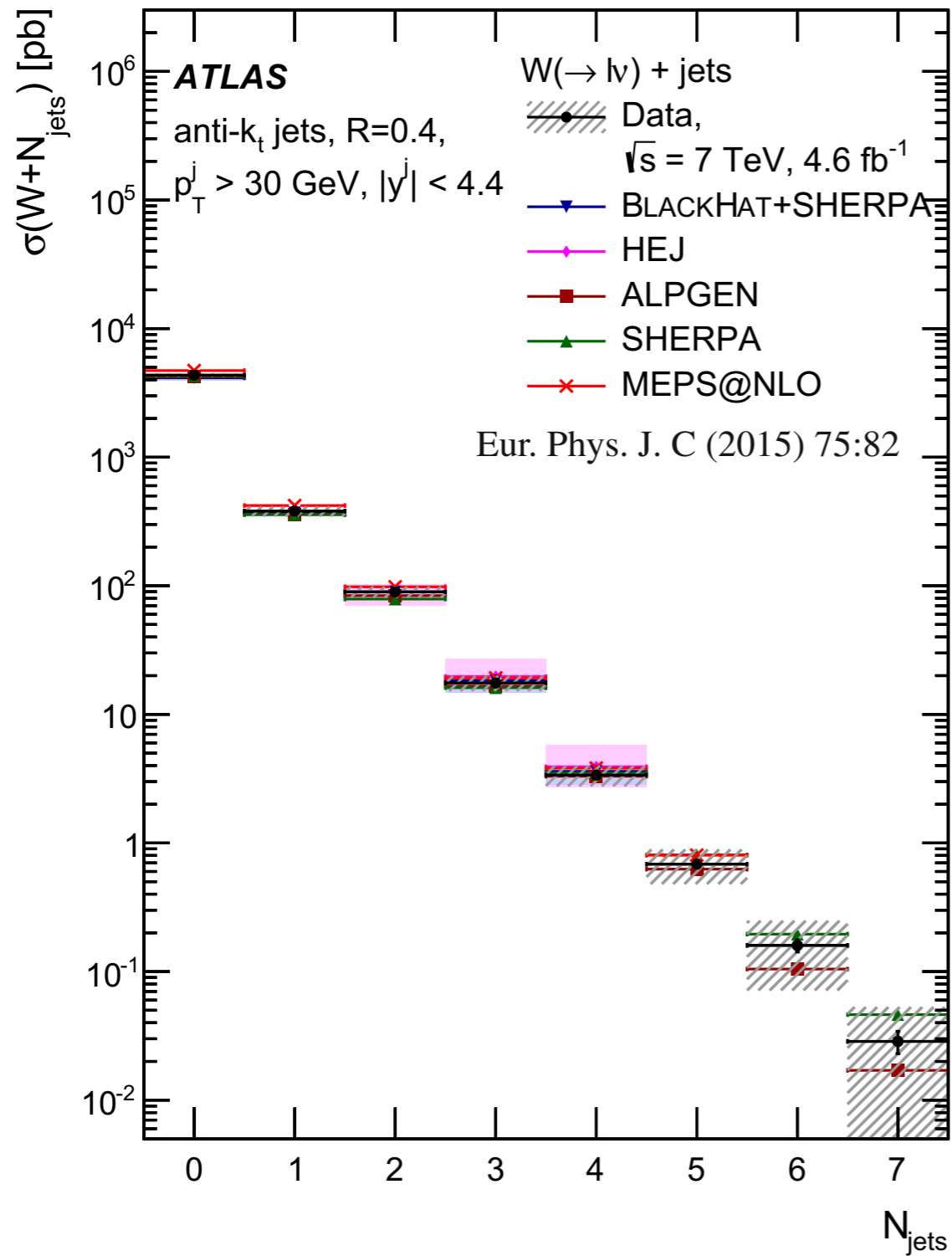
- 1) define matching cuts:  
for example  $p_{T}^J > 20 \text{ GeV}$ ,  $\Delta R=0.4$
- 2) generate ME with 1, 2, ...n jets
- 3) shower all events
- 4) select only events where jets above the  $p_T$  threshold match with final partons

### Consequences:

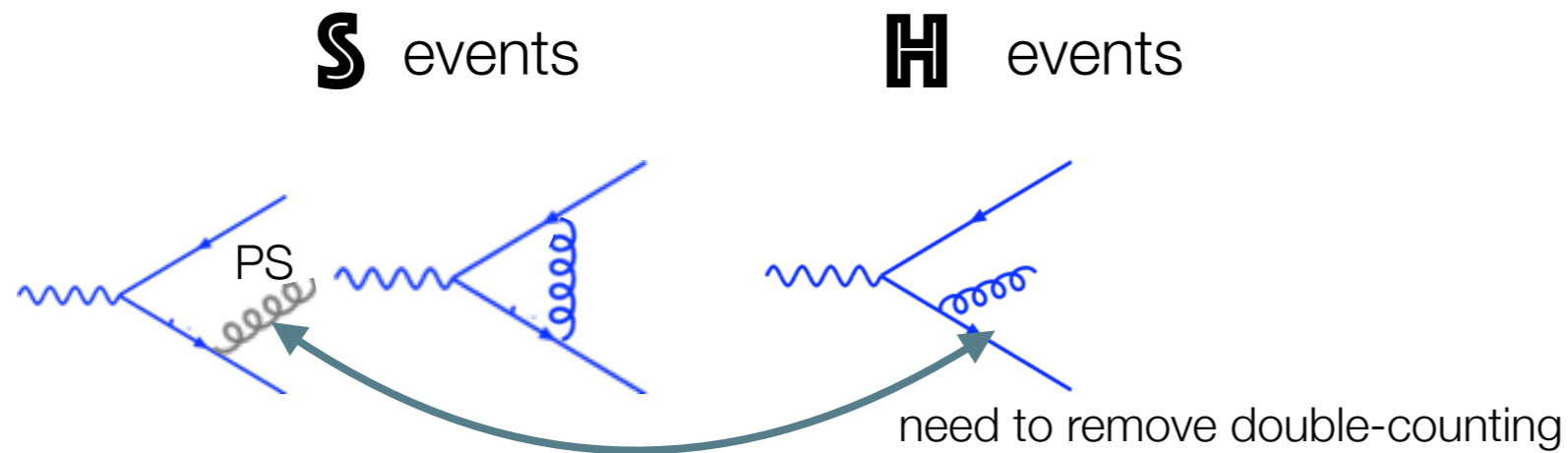
all jets with  $p_T > 20 \text{ GeV}$  and  $\Delta R > 0.4$  to other jets come from ME  
collinear and soft jets come from PS  
Use each of them where they are best.



# W+jets distributions

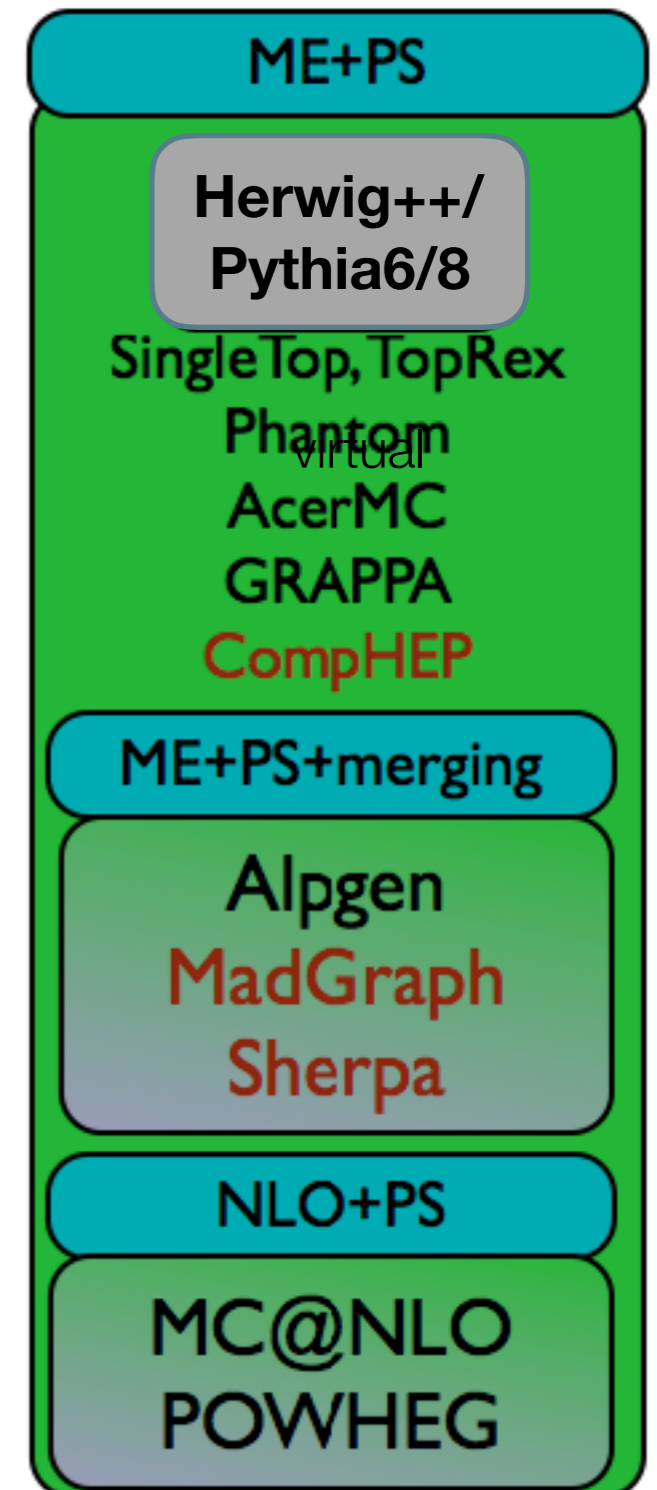


# Type III : Next-to-leading order ME & leading-log parton shower

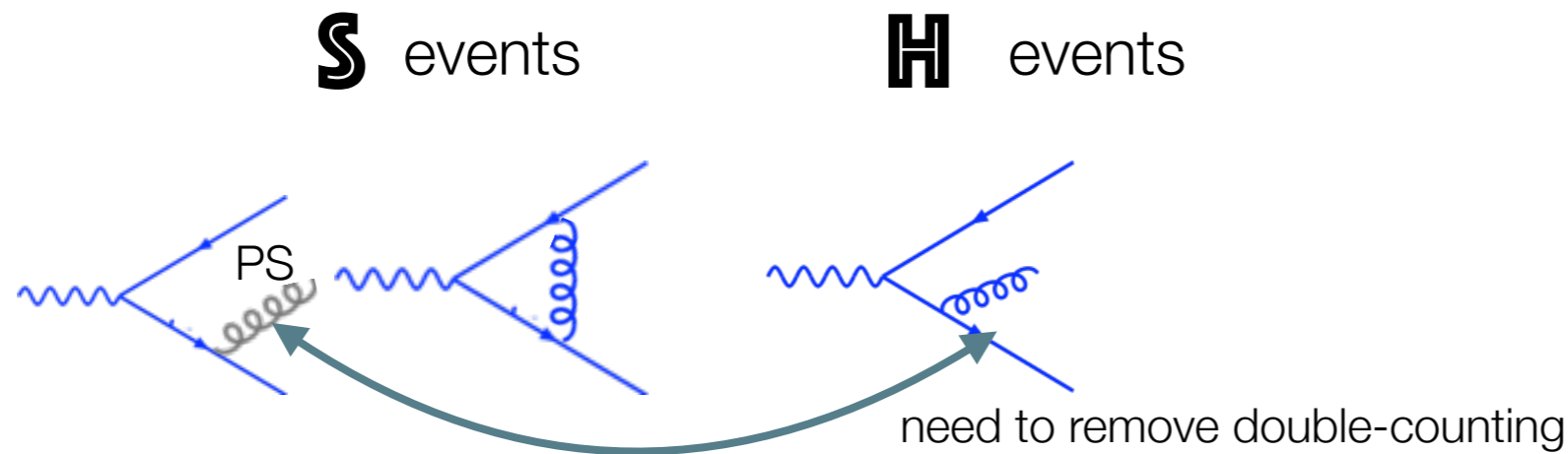


hard processes simulated at NLO accuracy including real & virtual corrections ...

improved description of cross sections & kinematic distributions



# Type III : Next-to-leading order ME & leading-log parton shower



hard processes simulated at NLO accuracy including real & virtual corrections ...

improved description of cross sections & kinematic distributions

2 Matching methods:

1. Powheg

Truncated showers:

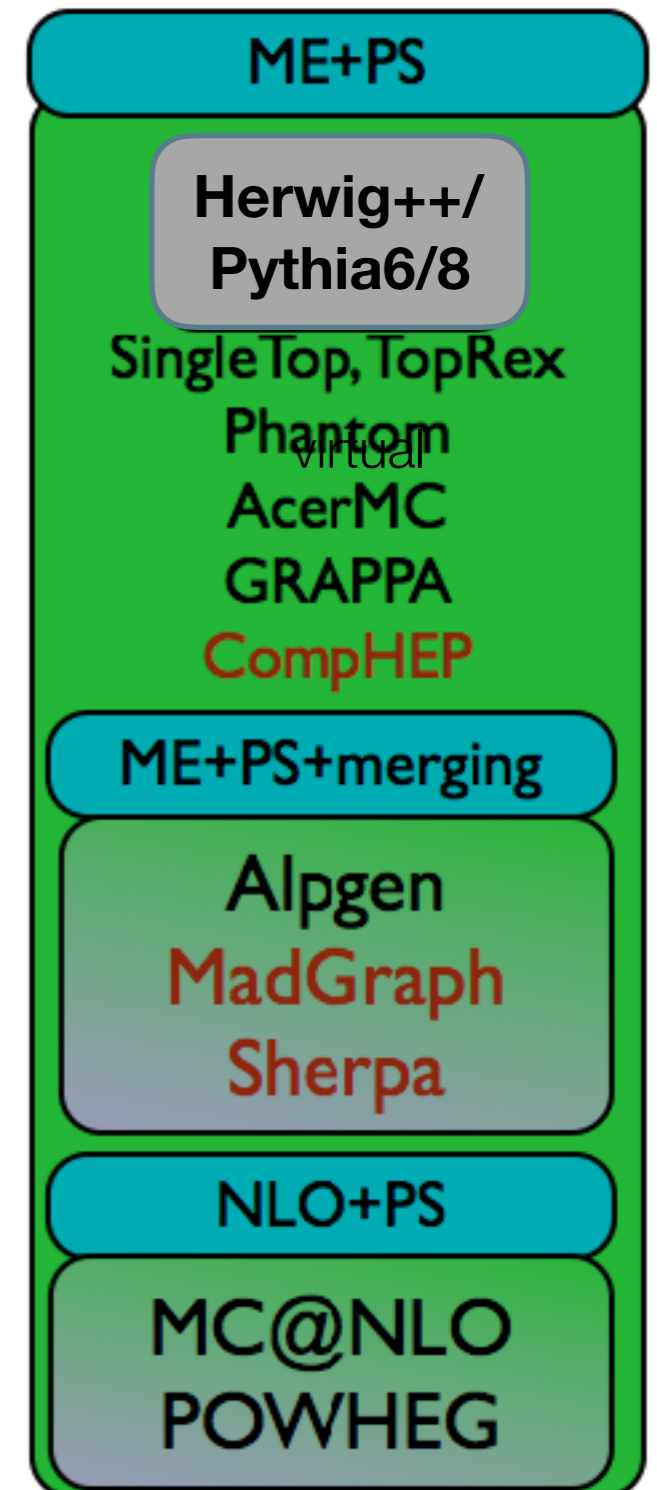
- 1) first emission produced by the ME;
- 2) don't allow the PS to produce partons harder than the first emission;
- 3) not exact at NLO (contains unbalanced higher order terms)

2. MC@NLO:

$$|ME|^2 = |ME + PS - PS(\text{up to } \alpha_s^2)|^2$$

+ Result is exact at NLO...

- produce some negative weights, need retuning for each PS

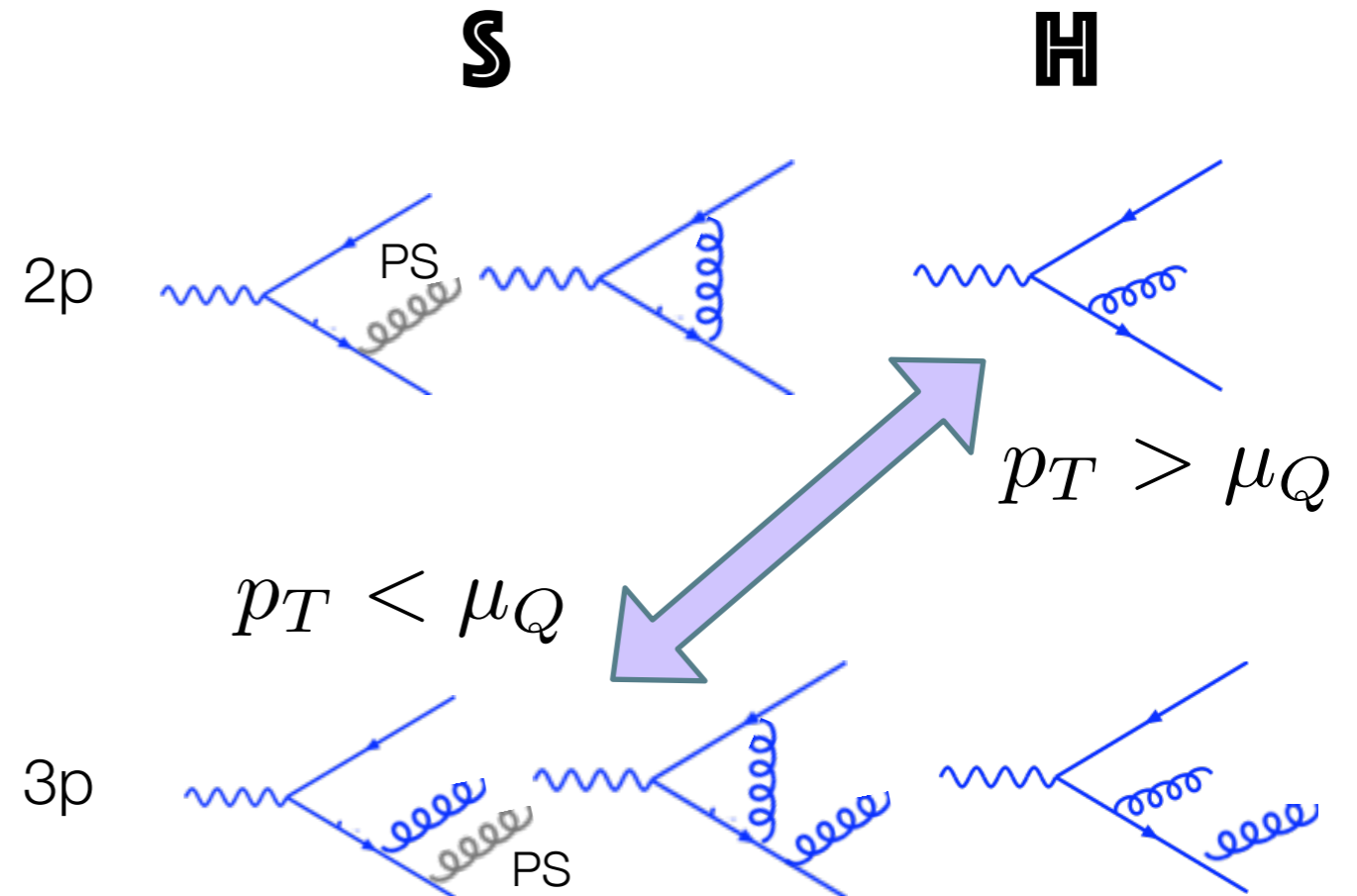


# Merging @NLO (quite new, going to be used at 13 TeV)

JHEP12(2012)061

## FxFx (Frederix-Frixione) merging

- 1) define a matching scale  $\mu_Q$ ;
- 2) don't allow **S** events with  $p_T > \mu_Q$  (those will be provided by **H** events of  $n-1$  partons NLO real emission); the restriction is imposed both at ME and on the shower starting scale  $\mu < \mu_Q$
- 3) treat the obtained events as LO ones and apply an LO-style merging (this allow to produce smoother distributions)



# Let's recap





# From partons to color neutral hadrons

## Fragmentation:

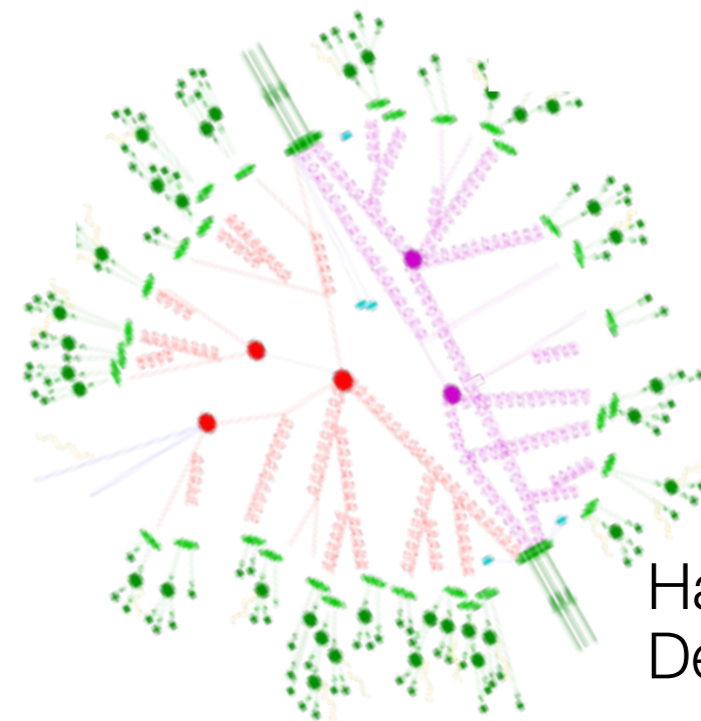
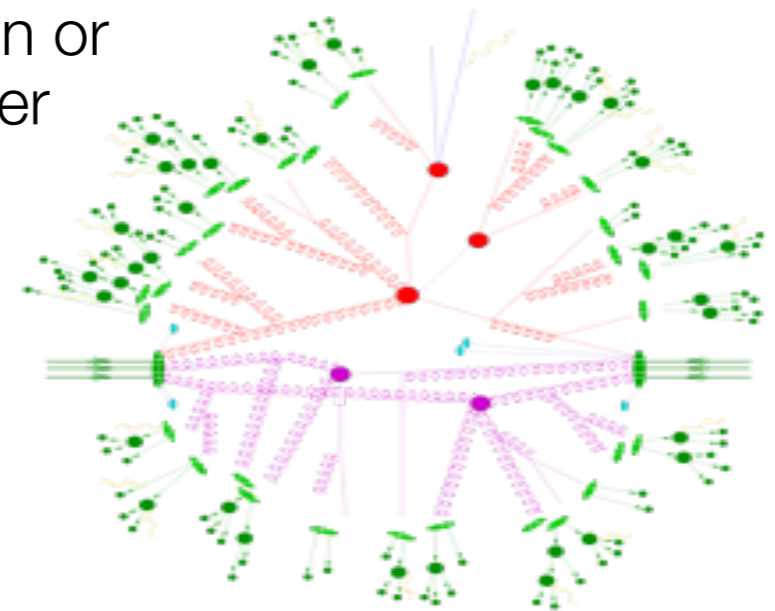
Parton splitting into other partons  
[QCD: re-summation of leading-logs]  
[“Parton shower”]

## Hadronization:

Parton shower forms hadrons  
[non-perturbative, only models]

**Decay** of unstable hadrons  
[perturbative QCD, electroweak theory]

Fragmentation or  
Parton Shower



Hadronization &  
Decays

# Non-perturbative transition from partons to hadrons ...

---

[Modelling relies on **phenomenological models** available]

Models based on MC simulations  
very successful:

Generation of **complete final states** ...

[Needed by experimentalists in detector simulation]

Caveat: **tunable ad-hoc parameters**

Most popular MC models:

Pythia/8 : **Lund string model**

Herwig/++ : **Cluster model**



# Independent fragmentation of each parton

Simplest approach:

[Field, Feynman, Nucl. Phys. B136 (1978) 1]

Start with original quark

Generate quark-antiquark pairs from vacuum

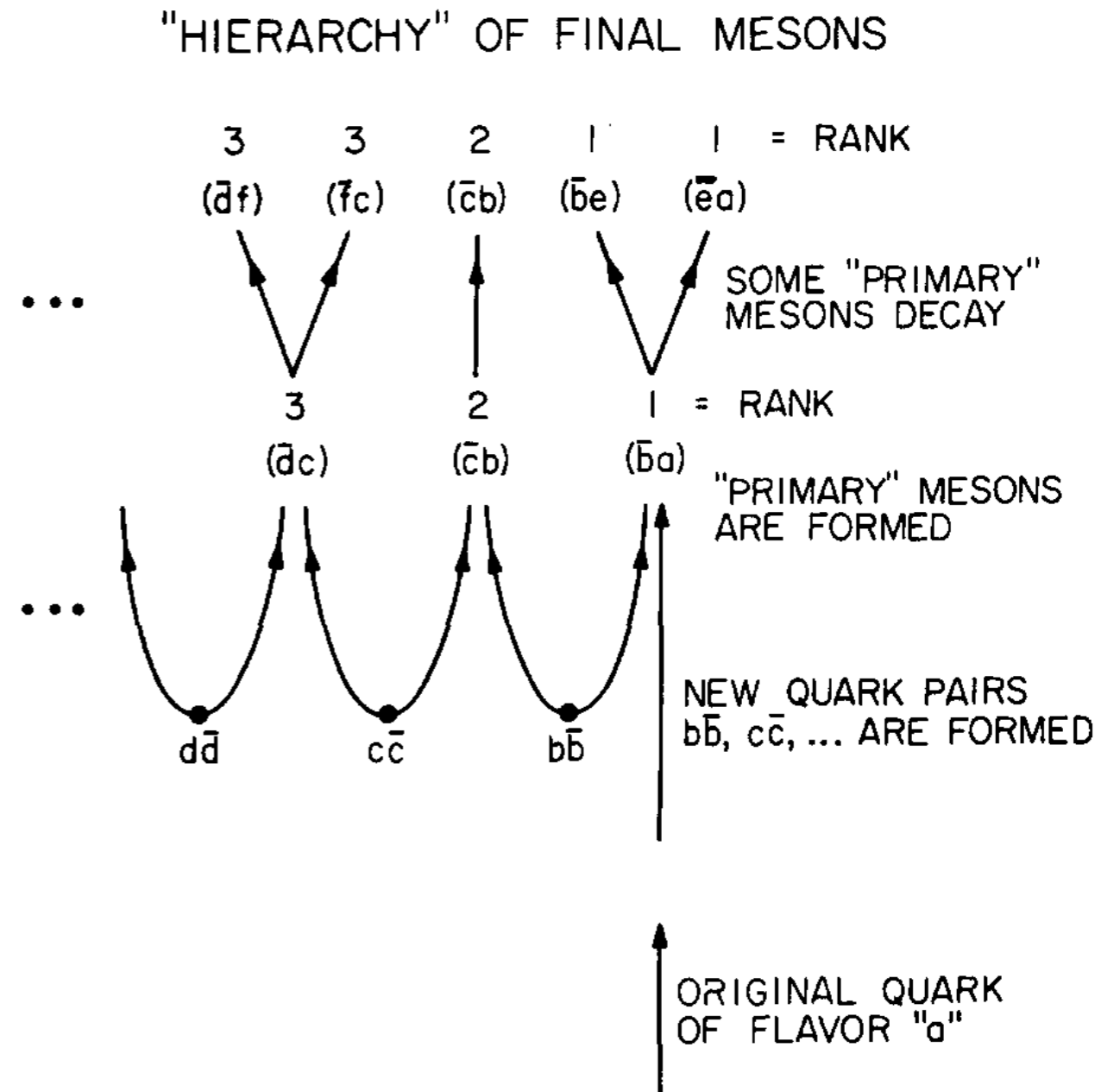
→ form "primary meson" with energy fraction  $z$

Continue with leftover quark with energy fraction  $1-z$

Stop at low energies (cut-off)

Include flavour non-perturbative fragmentation functions  $D(z)$

$D(z)$ : probability to find a meson/hadron with energy fraction  $z$  in jet ...

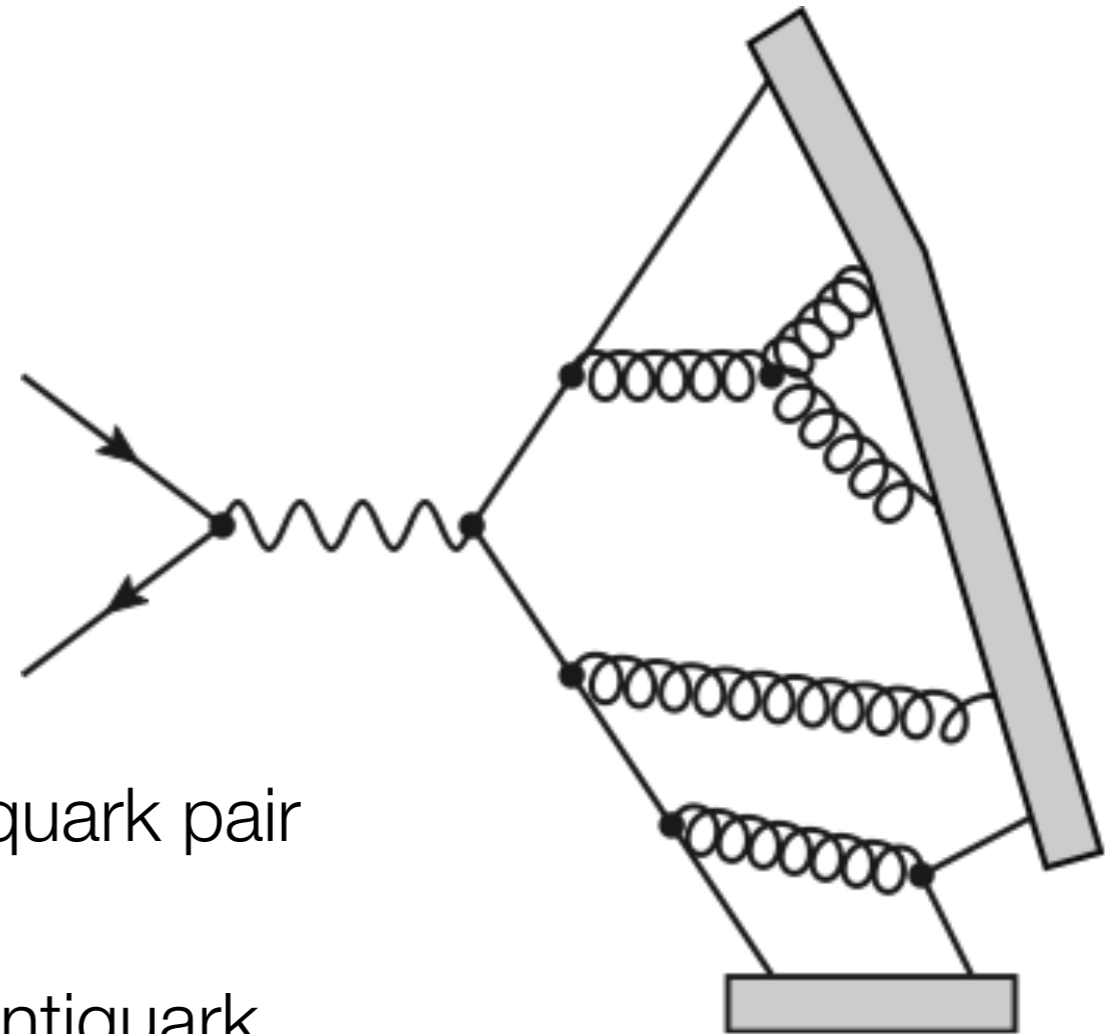
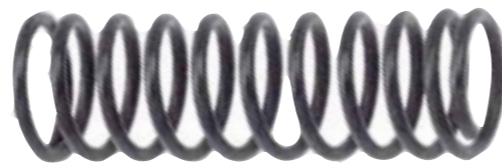


# Lund String Model

[Andersson et al., Phys. Rep. 97 (1983) 31]

QCD potential:

$$V(r) = \underbrace{-\frac{4}{3} \frac{\alpha_s(1/r^2)}{r}}_{\text{neglected}} + kr$$



String formation between initial quark-antiquark pair

- String breaks up if potential energy large enough to produce a new quark-antiquark pair
- Gluons = 'kinks' in string
- At low energy: hadron formation
- Very widely used ...  
[default in Pythia 6/8]

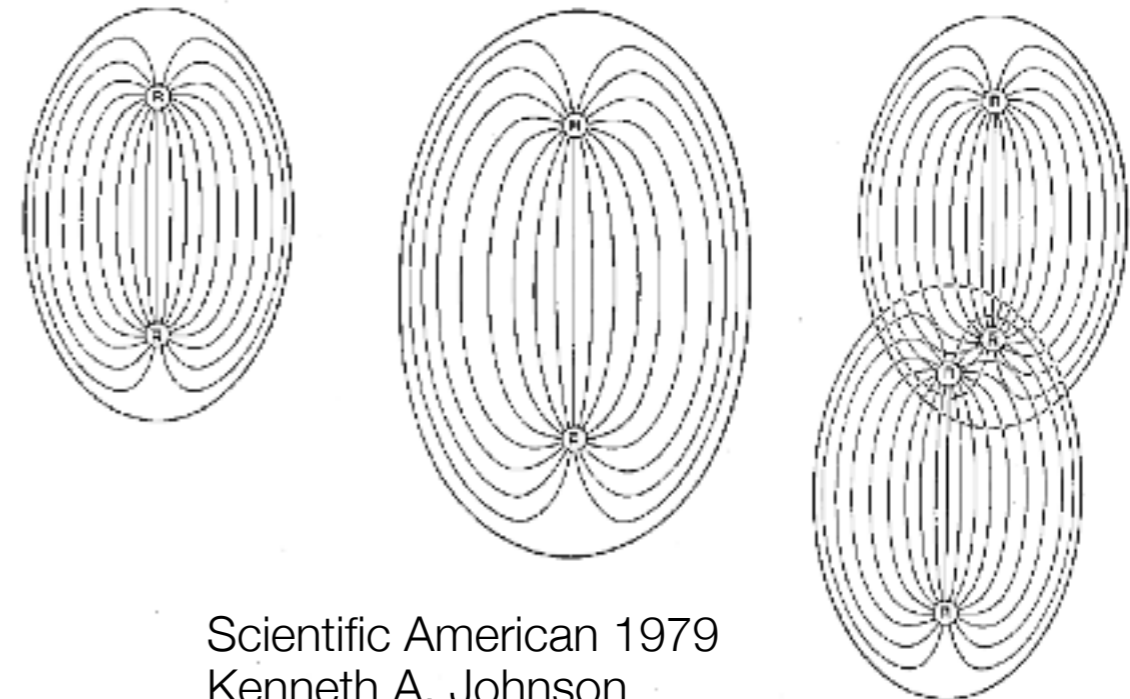
After: Ellis et al.,  
QCD and Collider Physics

# Lund String Model

Repeated string breaks for large system with pure  $V(r) = \kappa \cdot r$ , i.e. neglect Coulomb part

$$\left| \frac{dE}{dz} \right| = \left| \frac{dp_z}{dz} \right| = \left| \frac{dE}{dt} \right| = \left| \frac{dp_z}{dt} \right| = \kappa$$

Energy-momentum quantities can be read from space-time quantities ...



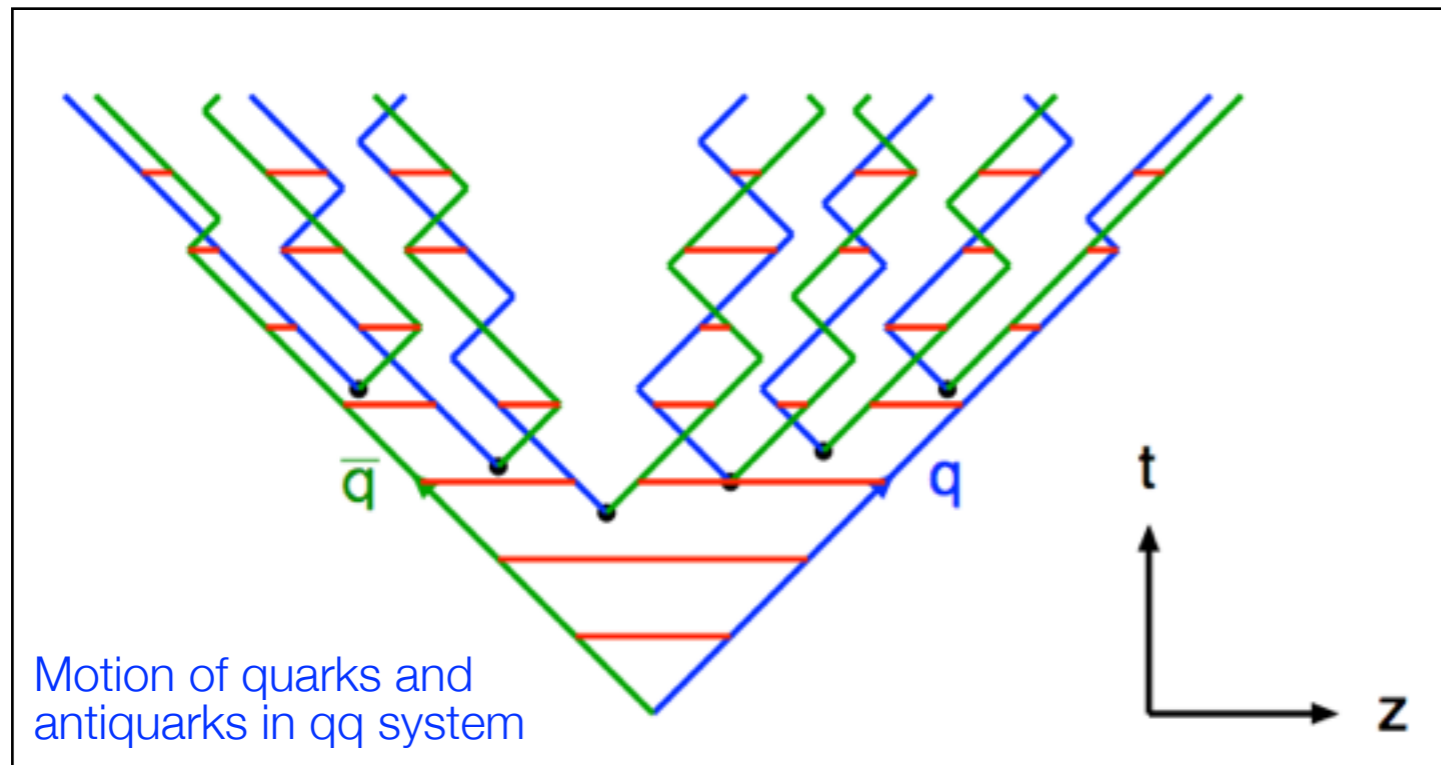
Scientific American 1979  
Kenneth A. Johnson

Simple but powerful picture of hadron production

[with extensions to massive quarks, baryons, ...]

$$\mathcal{P} \propto \exp\left(-\frac{\pi m_{\perp q}^2}{\kappa}\right) \propto \exp\left(-\frac{\pi p_{\perp q}^2}{\kappa}\right) \exp\left(-\frac{\pi m_q^2}{\kappa}\right)$$

Yields: Common Gaussian  $p_{\perp}$  spectrum  
Heavy quark suppression

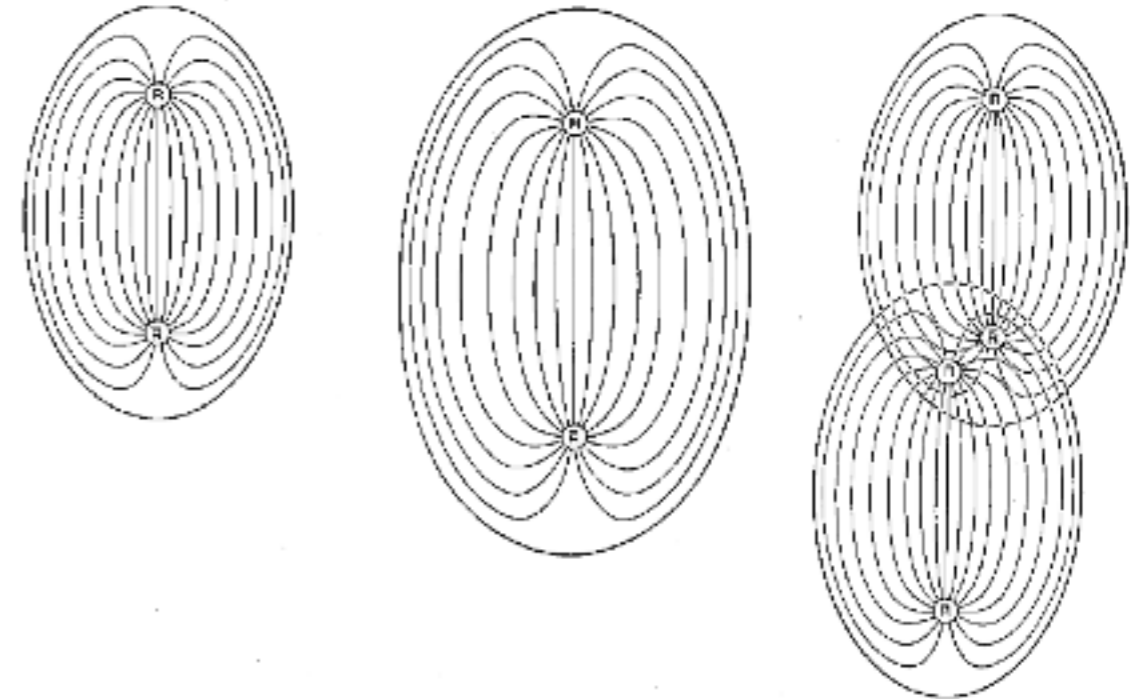


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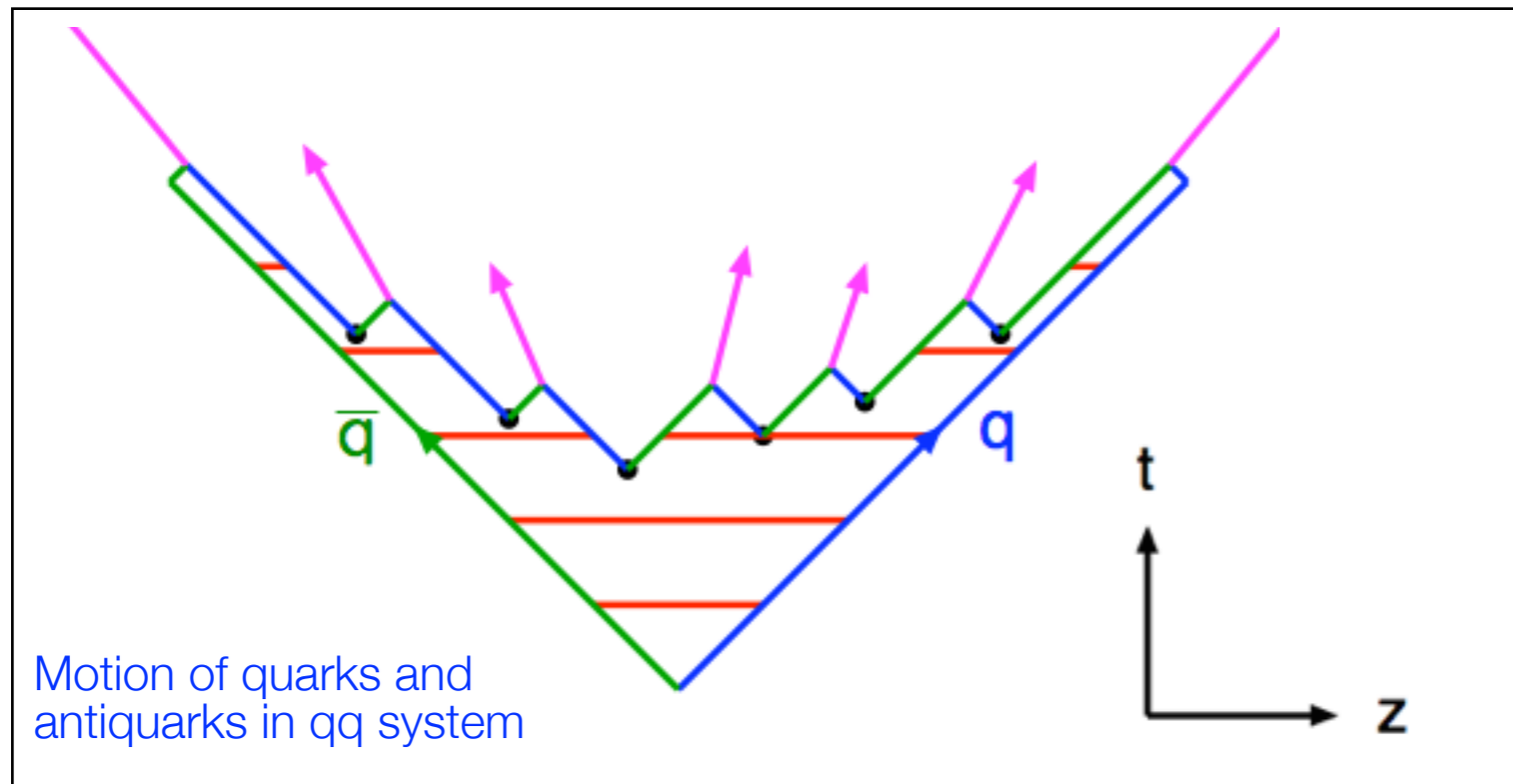
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Yields: Common Gaussian  $p_{\perp}$  spectrum  
Heavy quark suppression



# Cluster Model

[Webber, Nucl. Phys. B238 (1984) 492]

Color flow confined during hadronisation process

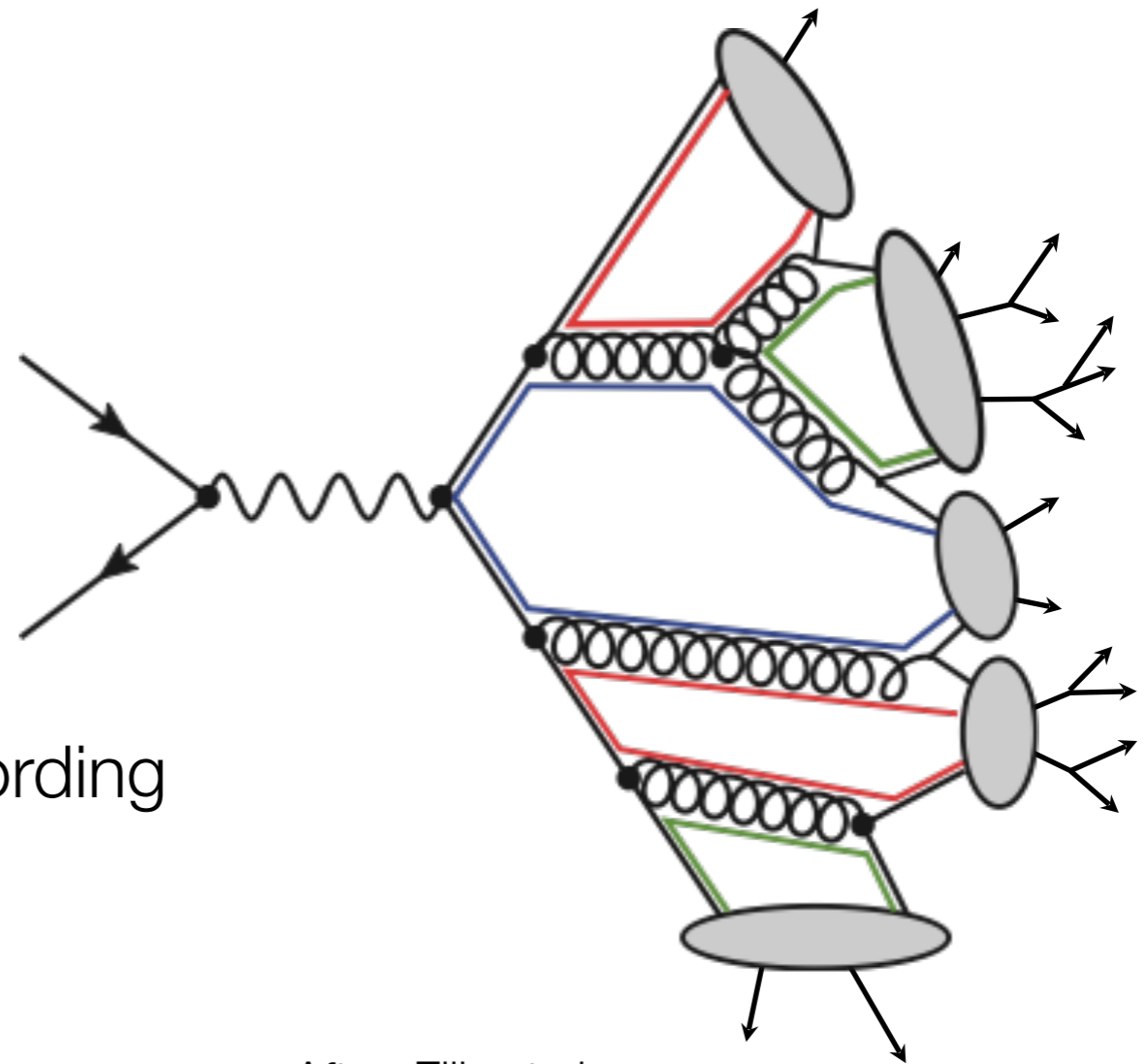
→ Formation of color-neutral parton clusters

Gluons (color-anticolor) split to quark-antiquark pairs

Clusters decay into 2 hadrons according to phase-space, i.e. isotropically

→ no free tuning parameters  
parton clusters

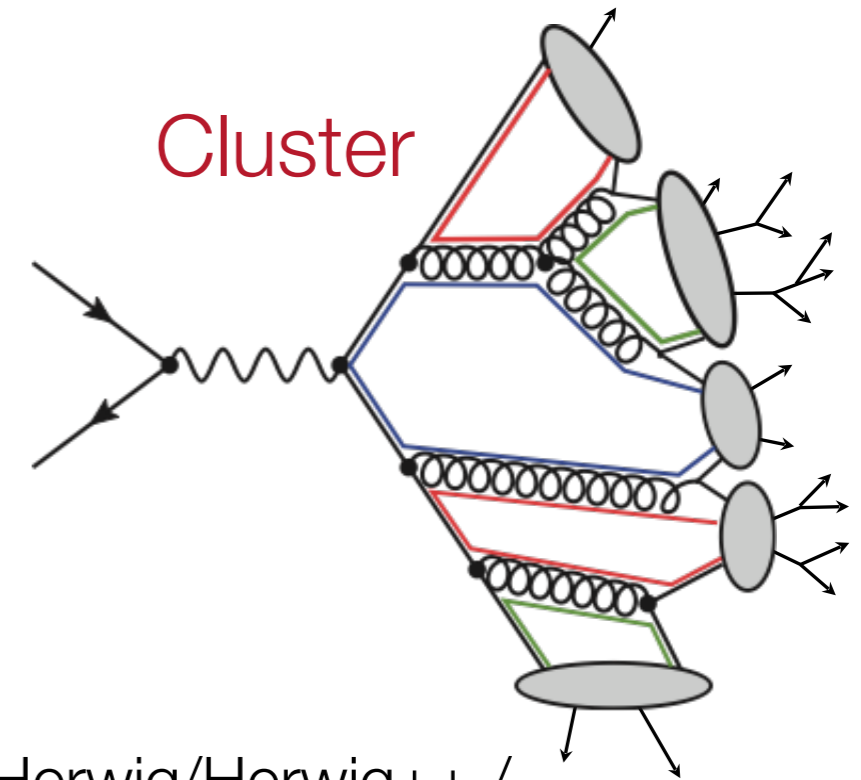
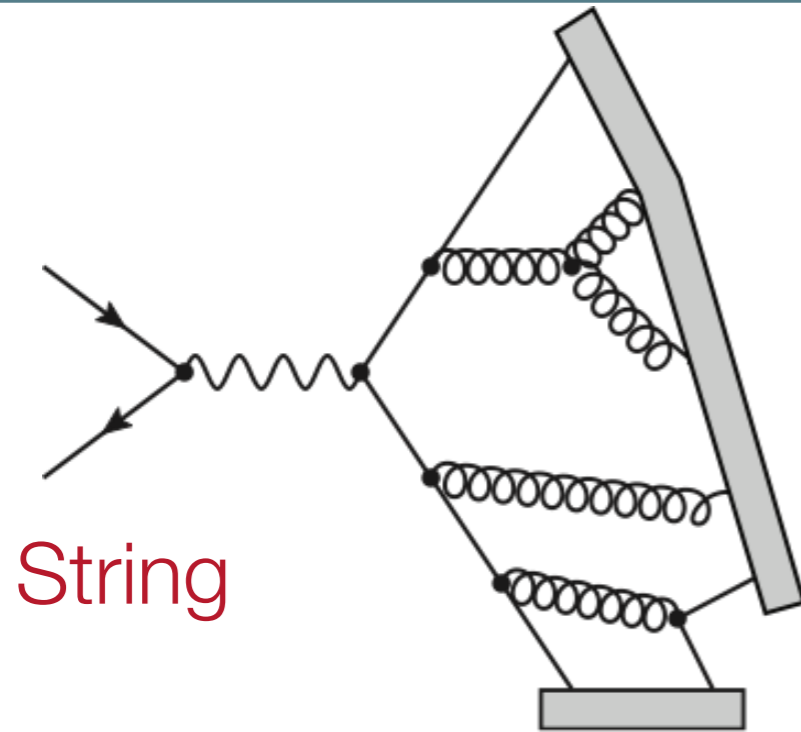
Very widely used ...  
[default in Herwig/Herwig++]



After: Ellis et al.,  
QCD and Collider Physics



# Hadronisation models summary



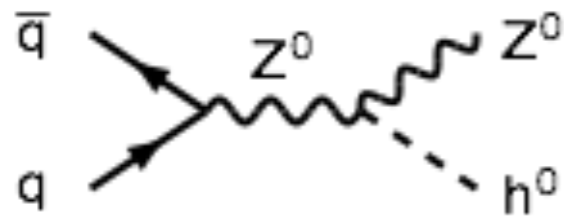
Model	Pythia6/8 (string)	Herwig/Herwig++ / Sherpa(cluster)
Energy-mom. picture	powerful predictive	simple unpredictive
Parameters	few	many
Flavour composition	messy unpredictive	simple in-between
Parameters	many	few

# Structure of basic generator process [by order of consideration]

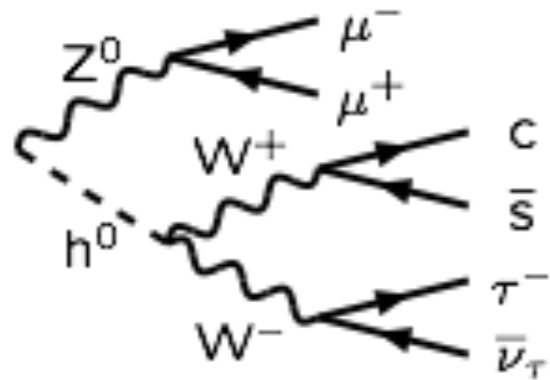
From the 'simple' to the 'complex' or from 'calculable' at large scales to 'modelled' at small

## Matrix elements (ME)

1. Hard subprocess:  
 $|M|^2$ , Breit Wigners, PDFs

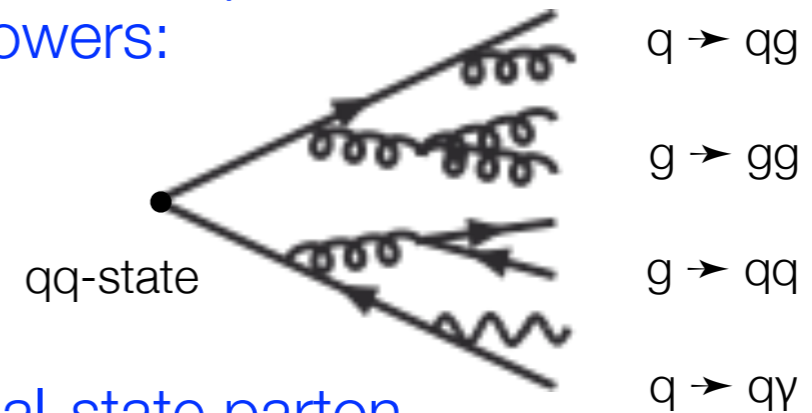


2. Resonance decays:  
 Includes particle correlations

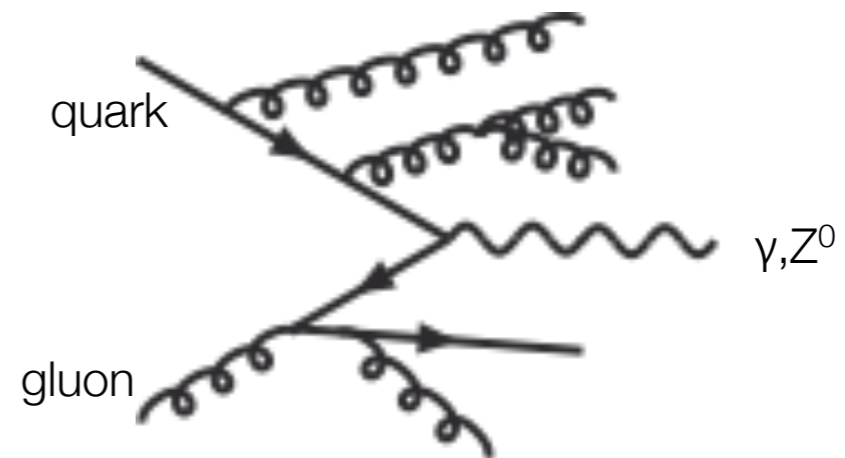


## Parton Shower (PS)

3. Final-state parton showers:



4. Final-state parton showers:

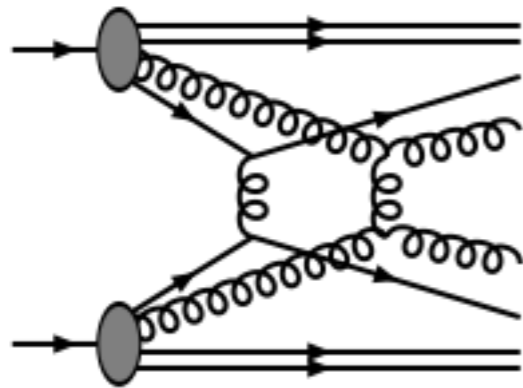


# Conclusions: Structure of basic generator process

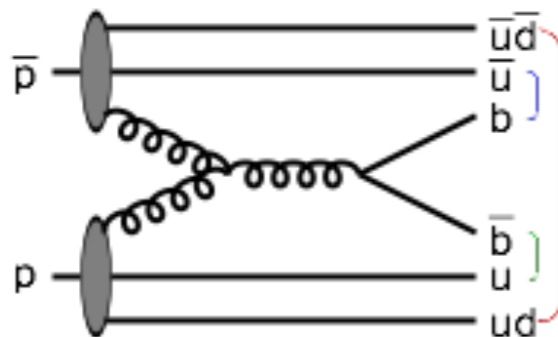
From the 'simple' to the 'complex' or  
from 'calculable' at large scales to 'modelled'; at small

## Underlying Event (UE)

5. Multi-parton interaction:

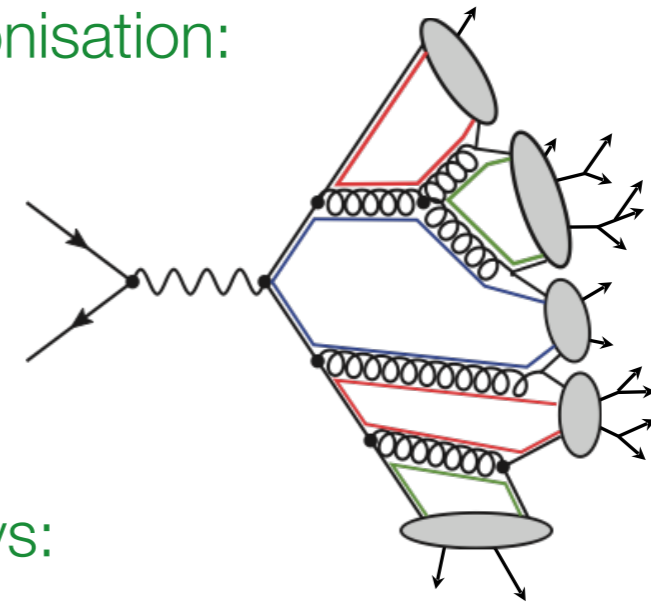


6. Beam remnants:

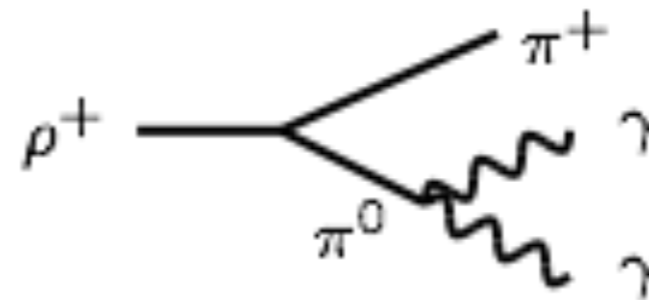


## Stable Particle State

7. Hadronisation:



8. Decays:





The DGLAP evolution equation is said to **resum large collinear logarithms**. So where are these logarithms, and where is the resummation?

Let's perform the integration of the DGLAP equation and expand the result:

$$\begin{aligned}
 f(x, t) &= f_0(x) + \int_{t_0}^t \frac{dt'}{t'} \frac{\alpha_s(t')}{2\pi} \int_x^1 \frac{dz}{z} P(z) g\left(\frac{x}{z}, t'\right) \\
 &= f_0(x) + \int_{t_0}^t \frac{dt'}{t'} \frac{\alpha_s}{2\pi} \int_x^1 \frac{dz}{z} P(z) \left\{ f_0\left(\frac{x}{z}\right) + \right. \\
 &\quad \left. + \int_{t_0}^{t'} \frac{dt''}{t''} \frac{\alpha_s}{2\pi} \int_{x/z}^1 \frac{dz'}{z'} P(z') \left[ f_0\left(\frac{x}{zz'}\right) + \dots \right] \right\} \\
 &= f_0(x) + \frac{\alpha_s}{2\pi} \ln\left(\frac{t}{t_0}\right) \int_x^1 \frac{dz}{z} P(z) f_0\left(\frac{x}{z}\right) + \\
 &\quad + \frac{1}{2!} \left[ \frac{\alpha_s}{2\pi} \ln\left(\frac{t}{t_0}\right) \right]^2 \int_x^1 \frac{dz}{z} P(z) \int_{x/z}^1 \frac{dz'}{z'} P(z') f_0\left(\frac{x}{zz'}\right) + \dots
 \end{aligned}$$

As suggested by the last step, it is indeed a resummation of all terms proportional to  $\left[ \frac{\alpha_s}{2\pi} \ln\left(\frac{t}{t_0}\right) \right]^n$ .

