# Simulating High Energy Collisions

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DESY Summer Student Programme 2011

# **Outline and Disclaimer**

We'll discuss:

- Basics of event generators and Monte Carlo methods.
- Hard scattering, parton showers, and in between.
- Hadronization and underlying event models.

What should not be expected:

- An unbiased view.
- A complete reference on the subject.
- Any details of available codes.

#### If there are any questions, don't hesitate to interrupt me.

#### Resources

Recommended references:

- Buckley et al.:
   General-purpose event generators for LHC physics, arXiv:1101.2599 [hep-ph]
- Ellis, Stirling, Webber:
   QCD and Collider Physics,
   Cambridge Monographs on Particle Physics
- Dissertori, Knowles, Schmelling:
   Quantum Chromodynamics: HEP Theory and Experiment, Oxford University Press

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# The Task.

Calculate cross sections for typical LHC events:

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### The Task.

Calculate cross sections for typical LHC events:

$$d\sigma \left( pp \rightarrow e^{+}e^{-}p\pi^{-}\pi^{+}\pi^{+}\pi^{-}\pi^{+}\pi^{+}K^{+}\bar{n}p\bar{n}\pi^{-}pn\bar{n}nK^{+}\right)$$

$$\pi^{-}\pi^{+}K^{-}\pi^{-}\pi^{-}\pi^{-}K^{+}\pi^{-}K^{-}\pi^{+}\pi^{+}K^{+}K^{+}\bar{p}\pi^{-}\pi^{+}\pi^{+}\bar{p}n\pi^{+}\pi^{-}$$

$$\pi^{+}\pi^{-}K^{+}K^{-}\pi^{+}\pi^{-}\pi^{-}\pi^{+}\pi^{-}K^{-}\bar{n}K^{+}K^{-}K^{-}\pi^{+}\pi^{-}\pi^{+}\pi^{-}$$

$$\pi^{+}\pi^{-}\pi^{+}n\bar{n}\pi^{+}n\pi^{-}\pi^{+}\pi^{-}\bar{n}\pi^{-}\pi^{+}\pi^{-}K^{+}\pi^{+}\pi^{-}\pi^{+}\bar{p}\bar{n}p\pi^{-}\pi^{+}\pi^{+}\pi^{-}$$

$$nK^{-}K^{+}\pi^{-}\pi^{+}p\bar{p}\pi^{-}\pi^{+}\pi^{-}\bar{n}p\pi^{-}n\pi^{+}\pi^{-}\pi^{-}\pi^{+}\pi^{-}\pi^{-}\pi^{-}\gamma\gamma\pi^{+}$$

$$\pi^{-}\gamma\gamma\gamma\gamma\bar{n}\pi^{-}\gamma\gamma\pi^{-}\pi^{+}\gamma\gamma\gamma\gamma\pi^{+}\pi^{-}\gamma\gamma\gamma\pi^{-}\gamma^{+}\gamma\gamma\pi^{-}\pi^{+}\gamma\gamma\pi^{+}\pi^{-}\pi^{-}$$

$$\pi^{+}\gamma\gamma\pi^{-}\pi^{+}\gamma\gamma\gamma\bar{n}\pi^{-}\gamma\gamma\bar{n}\pi^{+}\gamma\gamma\gamma\bar{n}\pi^{+}\gamma\gamma\pi^{-}\gamma\pi^{-}\gamma^{-}\gammae^{-}e^{+}\pi^{+}\gamma$$

$$\gamma\pi^{+}\pi^{-}\gamma\gamma K^{-}\pi^{+}\pi^{+}\bar{n}\pi^{-}\gamma\gamma\pi^{+}\gamma\gamma K^{-}\gamma\gamma...) =???$$

[Sequence of first few outgoing particles from a simulated LHC event.]

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#### The Task, Simplified.

 $d\sigma(pp \rightarrow ...) = P(i \text{ in proton } 1)P(j \text{ in proton } 2)$   $\times d\sigma(\text{hard scattering of } i, j)$   $\times P(\text{secondary scatterings})$   $\times P(\text{QCD radiation})$   $\times P(\text{partons} \rightarrow \text{hadrons})$   $\times P(\text{unstable hadrons} \rightarrow \text{stable hadrons})$ 

Still quite complex, but dealing with probabilities  $\rightarrow$  Monte Carlo methods.

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Hard partonic scattering.

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Initial state parton shower.

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#### Final state parton shower.

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#### Multiple interactions.

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#### Multiple interactions.

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Parton showers off secondary scatterings.

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#### Hadronization.

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#### Observed final state.

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# Plan.

- General structure of event generators.
- Basic Monte Carlo methods.
- Partonic cross sections.
- Parton showers.
- Dipoles and soft gluons.
- Higher orders (and parton showers). X
- Multiple interactions.
- Hadronization models.
- Decays of unstable hadrons. X
- Some highlight results.

# Basic Monte Carlo Methods.

- Monte Carlo methods: What and how.
- Sampling from a probability density.
- Monte Carlo integration.
- Importance sampling.
- From weights to events.
- The art of (pseudo-) random number generation. X
- MC methods outside HEP. 🗡

# The Task, Physics Wise.

Given some cross section differential in all momentum components ...

- Calculate the total cross section  $\sigma$ .
- With arbitrary acceptance criteria ('cuts').
- Produce a sample of events  $(p_1, ..., p_n)$  with probability density

$$\frac{1}{\sigma}\mathrm{d}\sigma(p_1,...,p_n)\;.$$

- Book histograms for arbitrary observables, and compare to data

### The Task, Technically.

Given a function  $p(x_1, ..., x_n)$ , and a volume  $V = \{(x_1, ..., x_n) \in \mathbb{R}^n | v(x_1, ..., x_n) = 1\}$  ...

Calculate

$$N(\rho, V) = \int_V p(x_1, ..., x_n) \mathrm{d}^n x \; .$$

- Produce a sample of events  $(x_1,...,x_n) \in V$  with probability density

$$\frac{1}{N(p,V)}p(x_1,...,x_n)\mathrm{d}^n x\ .$$

- Book histograms for arbitrary functions  $O(x_1, ..., x_n)$ .

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Well, we could just do numerical integrations,

$$N(p, V) = \int_V^{Gauss,...} p(x_1, ..., x_n) \mathrm{d}^n x \; .$$

Don't even need 'events', nor histograms, but calculate

$$\frac{\mathrm{d}\boldsymbol{p}}{\mathrm{d}\boldsymbol{O}} = \int_{V} \boldsymbol{p}(\boldsymbol{x}_{1},...,\boldsymbol{x}_{n}) \delta(\boldsymbol{O} - \boldsymbol{O}(\boldsymbol{x}_{1},...,\boldsymbol{x}_{n})) \mathrm{d}^{n}\boldsymbol{x}$$

the same way, and just plot into measured histograms.

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#### So what?

There are n = 3k - 4 variables for k outgoing particles.

– Watch out for convergence of numerical integrations for  $n \gtrsim 2$ .

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Flexibility: Easily add or change observables O and cut definitions v.

- Would have to adapt the numerical integrations each time.

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Flexibility: Easily add or change observables O and cut definitions v.

- Would have to adapt the numerical integrations each time.

MC methods are the only feasible way to achieve the task. We'll see how ...

Getting into Touch with MC Methods.

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# Getting into Touch with MC Methods.

We'll start off with drawing random variates in a single variable.

May seem unrelated to the problems we want to solve, yet:

- Gives a first feeling for what is going on.
- Often needed as helper for more efficient algorithms.

How to do things with some probability?

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How to do things with some probability?

Choose between two outcomes A and B with probabilities  $P_{A,B}$ . How to implement an algorithm selecting either one according to  $P_{A,B}$ ?

Have rnd() to return equally distributed random numbers  $r \in [0, 1]$ .

 $r \leftarrow \operatorname{rnd}()$ if  $r < P_A$  then return Aelse return Bend if



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How to do things with some probability?

Choose between three outcomes A, B and C with probabilities  $P_{A,B,C}$ .

 $r \leftarrow rnd()$ if  $r < P_A$  then return Aelse if  $r < P_A + P_B$  then return Belse return Cend if



Etc.

# Basic Monte Carlo Methods.

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- MC methods outside HEP. 🗡

Suppose we got  $p(x) \ge 0$  and V = [a, b] to define a probability density

$$P(x)dx = \theta(b-x)\theta(x-a)\frac{p(x)dx}{\int_a^b p(z)dz}$$

from which we are to draw random variates.

We'll assume that p is sufficiently simple such that

- we can calculate the integral of p, and
- we can solve

$$\int_a^x p(z) \mathrm{d}z = r \int_a^b p(z) \mathrm{d}z$$

for x as a function of  $r \in [0, 1]$ .

The algorithm generating events according to P(x) is simple:

$$r \leftarrow \mathbf{rnd}()$$
  

$$x \leftarrow \text{solution of}$$
  

$$\int_{a}^{x} p(z) dz = r \int_{a}^{b} p(z) dz$$
  
**return** x

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# Sampling by Inversion.

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We only solved a change of variables.

# Sampling by Inversion: Example.

Suppose we have p(x) = x on [0, 1]. Then solve  $\frac{x^2}{2} = r \frac{1}{2}$ .

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Before trying many variables: What if we cannot invert the integral?

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Before trying many variables: What if we cannot invert the integral? Suppose we know  $c \ge p(x)$ .



The frequency of hits in [x, x + dx] is directly proportional to p(x).

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Before trying many variables: What if we cannot invert the integral? Suppose we know  $c \ge p(x)$ .



Note that we did not have to know the normalization!

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Given a function  $p(x_1, ..., x_n)$ , and a volume  $V = \{(x_1, ..., x_n) \in \mathbb{R}^n | v(x_1, ..., x_n) = 1\}$  ...

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Define

$$p_V(x_1, ..., x_n) = \begin{cases} p(x_1, ..., x_n) & : & v(x_1, ..., x_n) = 1 \\ 0 & : & \text{otherwise} \end{cases}$$

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$$p_V(x_1, ..., x_n) = \begin{cases} p(x_1, ..., x_n) &: v(x_1, ..., x_n) = 1 \\ 0 &: otherwise \end{cases}$$

```
\begin{array}{l} \textbf{loop} \\ \textbf{for } i = 1..n \ \textbf{do} \\ r \leftarrow \textbf{rnd}() \\ x_i \leftarrow a_i + r(b_i - a_i) \\ \textbf{end for} \\ r' \leftarrow \textbf{rnd}() \\ \textbf{if } r' < p_V(x_1, ..., x_n)/c \ \textbf{then} \\ return \ (x_1, ..., x_n) \\ \textbf{end if} \\ \textbf{end loop} \end{array}
```

$$p_V(x_1,...,x_n) = \begin{cases} p(x_1,...,x_n) & : & v(x_1,...,x_n) = 1 \\ 0 & : & \text{otherwise} \end{cases}$$

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- − Monte Carlo methods: What and how. ✓
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Unless stated otherwise: Back to one variable.

Generalizations should be obvious now.

If not: Please ask!

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Before trying many variables: What if we cannot invert the integral? Suppose we know  $c \ge p(x)$ .



#### Note that we did not have to know the normalization!

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We actually *estimated* the normalization, if we were counting hits:



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In other words: We have just (approximately) calculated an integral!

Let's put the estimate onto a more waterproof ground.

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Let's put the estimate onto a more waterproof ground.

Averaging p over [a, b] is connected to its integral,

$$\langle p \rangle = \frac{1}{b-a} \int_a^b p(x) \, \mathrm{d}x \; .$$

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Let's put the estimate onto a more waterproof ground.

Averaging p over [a, b] is connected to its integral,

$$\langle p \rangle = \frac{1}{b-a} \int_a^b p(x) \, \mathrm{d}x \; .$$

Now estimate the average by

- recording p's value at random points  $x_i$ ,
- for a total of N points:

$$\langle p 
angle_{\text{estimate}} = rac{1}{N} \sum_{i=1}^{N} p(x_i) \; .$$

We'll call  $w_i = p(x_i)$  the weight of an event  $x_i$ .  $w_i$  is a measure of how many hits we should expect in  $[x_i, x_i + dx]$ .

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 $\langle p \rangle_{\text{estimate}}$  now got a well defined uncertainty: We *measure* p at equally distributed, independent random points.

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The variance of  $\langle p \rangle_{\text{estimate}}$  is

$$\sigma^2 \left[ \langle p \rangle_{\text{estimate}} \right] = \frac{1}{N} \left( \frac{1}{N} \sum_{i=1}^N w_i^2 - \left( \frac{1}{N} \sum_{i=1}^N w_i \right)^2 \right)$$

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#### Monte Carlo Integrals.

By recording *p*'s value at random points  $x_i$ , i = 1, ..., N we can approximately calculate its integral:

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By recording *p*'s value at random points  $x_i$ , i = 1, ..., N we can approximately calculate its integral:

$$\int_{a}^{b} p(x) \, \mathrm{d}x = (b-a) \langle p \rangle_{\text{estimate}} \pm (b-a) \sigma \left[ \langle p \rangle_{\text{estimate}} \right]$$

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Integrate  $p(x) = x^2$  on [0, 1].



Uncertainty drops as  $1/\sqrt{N}$ . Mind the independent measurements.

Integrate  $p(x) = x^2$  on [0, 1].



Doesn't really converge to the true value, right?

Integrate 
$$p(x) = x^2$$
.



Even worse: Error band just scratches true value for large N.

Monte Carlo Integrals.

# Mind the choice of your random number generator!

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Monte Carlo Integrals.

# Mind the choice of your random number generator!

Never, ever use things like:

rnd(), drand48() ...

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Integrate 
$$p(x) = x^2$$
.



Same thing, better random number generator.

How do weights connect to hits and misses?

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Assign weights

- $-w_i = c$  to any 'hit'  $x_i$ , and
- $w_j = 0$  to any 'miss'  $x_j$ .

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Assign weights

- $-w_i = c$  to any 'hit'  $x_i$ , and
- $w_j = 0$  to any 'miss'  $x_j$ .

Then  $\int_{a}^{b} p(x) dx \approx \frac{\#\text{hits}}{\#\text{hits} + \#\text{misses}} \times c(b-a)$ 

as conjectured.

But now we know how accurate this estimate is.

We still miss an explanation for  $w_{hit} = c$ .

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We still miss an explanation for  $w_{hit} = c$ .

We have actually 'measured' p(x) in units of c...

- by accepting N imes p(x)/c hits in  $[x, x + \mathrm{d}x]$ , thus
- recording the value of p(x)/c by the number of hits.

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For any hit we therefore need to multiply by the unit c we've chosen.

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- recording the value of p(x)/c by the number of hits.

For any hit we therefore need to multiply by the unit c we've chosen. Just a scaling of variables:

$$\int_a^b p(x) \mathrm{d}x = c \int_a^b \frac{p(x)}{c} \mathrm{d}x$$

True changes of variables when trying to cheat in the casino ...

## Basic Monte Carlo Methods.

- Monte Carlo methods: What and how. 🗸
- Sampling from a probability density.
- Monte Carlo integration. 🗸
- Importance sampling.
- From weights to events.
- The art of (pseudo-) random number generation. X
- MC methods outside HEP. 🗙

## Uncertainties, continued.

Mind the integral's uncertainty,

$$\sigma^2 \left[ \langle \pmb{p} 
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ight] = \langle \sigma^2 \left[ \pmb{p} 
ight] 
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 .

If p has large variance, need a very large N for a reasonable uncertainty.

### Uncertainties, continued.

Mind the integral's uncertainty,

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 .

If p has large variance, need a very large N for a reasonable uncertainty.

Connected to this is an unacceptable efficiency of hit-and-miss,

$$\epsilon = \frac{\# {\rm hits}}{\# {\rm hits} + \# {\rm misses}} \ll 1 \; .$$



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We've been honest gamblers, using equally distributed random numbers.

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We've been honest gamblers, using equally distributed random numbers.

Now we'll start to cheat.

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We've been honest gamblers, using equally distributed random numbers.

Now we'll start to cheat.

First set some notation,

$$\langle p \rangle \rightarrow \langle p \rangle_1 \; ,$$

where in general

$$\langle p \rangle_r = \int_a^b p(x) r(x) \mathrm{d}x \; .$$

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The basic ingredients to variance reduction:

- A constant function has zero variance.
- And we always have

$$\langle p \rangle_1 = \left\langle \frac{p}{r} \right\rangle_r \; .$$

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- A constant function has zero variance.
- And we always have

$$\langle p \rangle_1 = \left\langle \frac{p}{r} \right\rangle_r \; .$$

So, ideally

$$\langle p \rangle_1 = \langle 1 \rangle_p$$

with zero variance ???

What does  $\left< \frac{p}{r} \right>_r$  actually mean?

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What does  $\left< \frac{p}{r} \right>_r$  actually mean?

- A change of variables,

$$p(x)\mathrm{d}x = p(x(R))\frac{\mathrm{d}x(R)}{\mathrm{d}R}\mathrm{d}R$$

with r(x)dx = dR. Record p/r at points inside the transformed volume.

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What does  $\left< \frac{p}{r} \right>_r$  actually mean?

- A change of variables,

$$p(x)\mathrm{d}x = p(x(R))\frac{\mathrm{d}x(R)}{\mathrm{d}R}\mathrm{d}R$$

with r(x)dx = dR.

Record p/r at points inside the transformed volume.

- If r(x) is normalized to define a probability density: Record p/r at points distributed with density r.

What does  $\left< \frac{p}{r} \right>_r$  actually mean?

- A change of variables,

$$p(x)\mathrm{d}x = p(x(R))\frac{\mathrm{d}x(R)}{\mathrm{d}R}\mathrm{d}R$$

with r(x)dx = dR.

Record p/r at points inside the transformed volume.

- If r(x) is normalized to define a probability density: Record p/r at points distributed with density r.

To arrive at  $\langle 1 \rangle_{p}$  we would actually have to know the integral. Then the uncertainty is – of course – zero.

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The best we can hope for is finding a r, which is very similar to p,

$$\frac{p(x)}{r(x)} \approx \text{constant}$$
 .

And sufficiently simple, such that we can distribute points with a probability density defined by r.

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This also helps with the hit-and-miss efficiency:

If we know c such that  $c r(x) \ge p(x)$ , we can

- Propose points with density defined by r, and
- accept a hit x with probability  $\frac{p(x)}{c r(x)}$ .



Bottom line:

- Generate more points where p has large fluctuations.
- Generate less points where p is essentially constant.
- Divide out the bias introduced thereby.

#### Variance Reduction: Example.

Integrate  $p(x) = x^2$  on [0,1]. Importance sampling with r(x) = x.



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From Integrals to Hits.

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#### From Integrals to Hits.

From MC integration we obtain a sample of weighted events,  $(x_i, w_i)$ .

For event generation, we are interested in *unweighted* events,  $(x_i, c)$ . Recap that  $w_i$  is a measure of the frequency of events in  $[x_i, x_i + dx]$ .

#### From Integrals to Hits.

From MC integration we obtain a sample of weighted events,  $(x_i, w_i)$ .

For event generation, we are interested in *unweighted* events,  $(x_i, c)$ . Recap that  $w_i$  is a measure of the frequency of events in  $[x_i, x_i + dx]$ .

To get to unweighted events,

- find the maximum weight w<sub>max</sub>,
- keep each weighted event  $(x_i, w_i)$  with probability  $w_i/w_{max}$ , and
- assign common weight  $c = N(p, V)/N_{uw}$  to  $N_{uw}$  accepted events.

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## Basic Monte Carlo Methods.

- Monte Carlo methods: What and how.  $\checkmark$
- Sampling from a probability density.
- Monte Carlo integration. 🗸
- Importance sampling. ✓
- From weights to events. 🗸
- The art of (pseudo-) random number generation. X
- MC methods outside HEP. 🗙

## Basic Monte Carlo Methods: Things to Take Home.

- Pseudo-random numbers  $\rightarrow$  events with given probability density.
- Can calculate integrals with complicated boundaries and functions.
- The only choice of method when it comes to many variables.
- Apply to differential cross sections:
  - $\rightarrow$  Simulate collider events with frequency as occurring in nature.

# Plan.

- − General structure of event generators. ✓
- Basic Monte Carlo methods. 🗸
- Partonic cross sections.
- Parton showers.
- Dipoles and soft gluons.
- Higher orders (and parton showers). X
- Multiple interactions.
- Hadronization models.
- Decays of unstable hadrons. X
- Some highlight results. ∾

What did we start with?

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What did we start with?



Scatter 
$$q\bar{q} 
ightarrow e^+e^-$$
,  $gq 
ightarrow gq$ , ...

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What did we start with?



What we observe is  $pp \rightarrow e^+e^- + X$ ,  $pp \rightarrow 2$  jets + X, ...

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What did we start with?



What we observe is  $pp \rightarrow e^+e^- + X$ ,  $pp \rightarrow 2$  jets+X, ...

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The factorization theorem.

$$d\sigma (pp \to F_{hadronic} + X) = \sum_{i,j,k} \int dx_i dx_j f_{P \leftarrow i}(x_i, \mu_F^2) f_{P \leftarrow j}(x_j, \mu_F^2) d\sigma (ij \to F_{partonic,k}, \mu_F^2)$$

Formula for an *inclusive* cross section.

Works, as long as:

- We do not ask about any detail of X, and
- *F* has the same definition in terms of hadrons or partons.

A fully exclusive cross section:

$$d\sigma \left( pp \to e^+ e^- p \pi^- \pi^+ \pi^+ \pi^- \pi^+ \pi^+ K^+ \bar{n} p \bar{n} \pi^- p n \bar{n} n K^+ \dots \right) \\ \equiv d\sigma \left( F_{\text{hadronic},l} + \bar{n} \pi^- \pi^+ \pi^- K^+ \dots \right) \equiv d\sigma \left( F_{\text{hadronic},l} + X_l \right)$$

Then:

$$d\sigma (pp \to F_{hadronic} + X) = \sum_{l} d\sigma (F_{hadronic,l} + X_{l}) = \sum_{i,j,k,l} \int dx_{i} dx_{j} f_{P \leftarrow i}(x_{i}, \mu_{F}^{2}) f_{P \leftarrow j}(x_{j}, \mu_{F}^{2}) d\sigma (ij \to F_{partonic,k}, \mu_{F}^{2}) \\ \otimes P(F_{partonic,k} \to F_{hadronic,l} + X_{l})$$

Mind that this is only a heuristic argument. We can't (always) prove this from first principles, but up to now it worked remarkably well.
## Partonic Cross Sections.

A well defined recipe:

- $-~\mathrm{d}\sigma\left(ij\to \textit{F}_{\mathsf{partonic},\textit{k}}\right)$  can be calculated in perturbation theory.
- The  $\mu_F^2$  dependence of the parton distributions f as well.
- The boundary condition for the f's can be fitted to data.

At leading order, all the ingredients are positive definite and well behaved.

Use Monte Carlo methods to generate events at *parton level*  $\rightarrow$  the first cornerstone of our simulation.

## Partonic Cross Sections: To take home.

Inclusive quantities at *hadron level* can be calculated in perturbation theory at *parton level*, as long as:

- We ask for a final state definition F which equally applies to partons and hadrons.
- We do not ask about any details of stuff not entering the final state definition.

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# Plan.

- − General structure of event generators. ✓
- Basic Monte Carlo methods. 🗸
- Partonic cross sections.
- Parton showers.
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### Parton showers.

Troubles with the parton level:

- Only sufficiently inclusive observables.
- Not really a realistic final state.
- Quarks and gluons carry colour charge. Don't they radiate???

We don't observe a small number of hadrons comparable to the number of partons in a partonic cross section, but jets made out of hundreds of hadrons.

 $\rightarrow$  Add radiation as a first step towards a more realistic final state.

#### Parton showers.

- Shortcomings of the parton level.
- Radiation, and the breakdown of naive perturbation theory.
- Factorization and parton showers.

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Propagator factor (massless quarks for the time being):

$$rac{1}{q^2} = rac{1}{(p_q + p_g)^2} = rac{1}{2E_q E_g (1 - \cos heta_{qg})}$$

Diverges, whenever  $E_g \rightarrow 0$  or  $\theta_{qg} \rightarrow 0$ .

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What to do about it?

Introduce a cutoff  $\mu$ .

- If  $p_{\perp}(q,g) < \mu$  we call it one jet.
- If  $p_{\perp}(q,g) > \mu$ , we call it two jets.

No divergence for  $p_{\perp} > \mu$ . Divergence below will cancel with loop correction, when integrating over emissions with  $p_{\perp} < \mu$  (see Jürgen Reuter's lecture).





So, we're fine: Can calculate jet rates, which are finite.



So, we're fine: Can calculate jet rates, which are finite.



Is this making sense?

What happened?

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What happened?

Large logarithms, overcoming the smallness of  $\alpha_{s}$ 

$$extsf{R}_{+1 extsf{ jet}} \sim extsf{c}_2 \ lpha_{ extsf{s}} \log^2 rac{ extsf{Q}}{\mu} + extsf{c}_1 \ lpha_{ extsf{s}} \log rac{ extsf{Q}}{\mu}$$

These large contributions appear at *every* order in  $\alpha_s$ .

We'll have to take into account all of them, or: take into account any number of additional emissions.

Fixed order is only valid, if jets are well separated.

#### Parton showers.

- Shortcomings of the parton level.
- Radiation, and the breakdown of naive perturbation theory.  $\checkmark$
- Factorization and parton showers.

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Let's add one more parton from radiation.



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Whenever  $q^2$  is much smaller than any other scale in the process, the cross section factorizes:

$$\mathrm{d}\sigma_{+1\ gluon} pprox \mathrm{d}\sigma_{+0\ gluons} imes rac{lpha_s}{2\pi} rac{\mathrm{d}q^2}{q^2} P_{q 
ightarrow qg}(z) \mathrm{d}z$$

where

$$P_{q \to qg}(z) = C_F \frac{1+z^2}{1-z}$$

and z is the energy fraction of the quark with respect to its parent.

Similar results for  $g \rightarrow gg$  and  $g \rightarrow q\bar{q}$ :

$$P_{q \to qg}(z) = C_F \frac{1+z^2}{1-z}$$

$$P_{g \to gg}(z) = 2C_A \left(\frac{z}{1-z} + \frac{1-z}{z} + z(1-z)\right)$$

$$P_{g \to q\bar{q}} = T_R \left(1 - 2z(1-z)\right)$$

These are the Dokshitzer-Gribov-Lipatov-Altarelli-Parisi splitting functions.

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Let's add two more partons from radiation.



Whenever  $q_2^2 \ll q_1^2$  and  $q_1^2$  is much smaller than any other scale in the process, the cross section factorizes again,

$$\mathrm{d}\sigma_{+2 \text{ gluon}} \approx \mathrm{d}\sigma_{+0 \text{ gluons}} \times \frac{\alpha_s}{2\pi} \frac{\mathrm{d}q_1^2}{q_1^2} P_{q \to qg}(z_1) \mathrm{d}z_1 \times \frac{\alpha_s}{2\pi} \frac{\mathrm{d}q_2^2}{q_2^2} P_{q \to qg}(z_2) \mathrm{d}z_2$$

(We have to include the second gluon emitted off the first one as well).

Bottom line:

For **soft-collinear** emissions which are **strongly ordered** in a measure of hardness (i.e. from larger to smaller  $q^2$ ), we can iteratively build up a parton cascade by **independent emissions**.

The cascade will start at a  $q^2$  typical to the hard scattering.

It will terminate if we reach  $q^2$  for which perturbation theory ceases to make sense, i.e.  $q\sim 1~{\rm GeV}.$ 

We say that partons 'evolve' from larger to smaller scales.

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We have transitions (=emissions), which are independent of each other and ordered in some measure, and occur with some probability dependent on this measure.

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This is a stochastic process, more precisely, a Markovian process.

### Detour: Markovian processes.

Suppose we have a set of states  $\{i, j, k, ...\}$  and a time variable *t*.

- Given: transition rates P(j|i, t) to make a transition from state *i* to state *j* at time *t*.
- Want: probability to make a transition to state j at time t', given state i has been occupied at time t:  $\Delta(j, t'|i, t)$

One can derive a differential equation for  $\Delta(j, t'|i, t)$ :

$$\frac{\partial}{\partial t}\Delta(j,t'|i,t) = \sum_{k}\Delta(j,t'|k,t)P(k|i,t) - \Delta(j,t'|i,t)\sum_{k}P(k|i,t)$$

#### Detour: Markovian processes.

$$\frac{\partial}{\partial t}\Delta(j,t'|i,t) = \sum_{k}\Delta(j,t'|k,t)P(k|i,t) - \Delta(j,t'|i,t)\sum_{k}P(k|i,t)$$

Let us derive the probability of keeping a state, provided we can visit each state only once:

$$\frac{\partial}{\partial t} \Delta(i, t'|i, t) = -\Delta(i, t'|i, t) \sum_{k} P(k|i, t)$$
$$\Rightarrow \Delta(i, t'|i, t) = \exp\left(-\int_{t'}^{t} \sum_{k} P(k|i, \tau) d\tau\right)$$

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Ingredients to the Monte Carlo simulation:

- The probability for parton *i* to evolve from  $Q^2$  to  $q^2$  without emission:

$$\Delta_i(q^2|Q^2) = \exp\left(-\int_{q^2}^{Q^2} \frac{\alpha_s(q^2)}{2\pi} \frac{\mathrm{d}q^2}{q^2} \int_{z_-(q^2,Q^2)}^{z_+(q^2,Q^2)} \mathrm{d}z \sum_{j,k} P_{i \to jk}(z)\right)$$

This is called the 'Sudakov form factor'.

- The  $q^2$ , z-density for emission  $i \rightarrow j, k$  when starting from  $Q^2$ :

$$\frac{\alpha_{\mathfrak{s}}(q^2)}{2\pi}\frac{\mathrm{d}q^2}{q^2}\mathrm{d}z P_{i\to jk}(z)\Delta_i(q^2|Q^2)$$

Note that there is a large family of possible ordering measures  $q^2$ .

What does this have to do with the large logarithms?

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What does this have to do with the large logarithms?

Choose  $q^2 = p_\perp^2$  and calculate the two- and three-jet rates for  $e^+e^- o qar q$ :

$$R_{2} = \Delta_{q}^{2}(\mu^{2}|Q^{2}) \qquad R_{3} = 2\Delta_{q}^{2}(\mu^{2}|Q^{2}) \int_{\mu^{2}}^{Q^{2}} \Gamma_{q}(q^{2}|Q^{2}) \Delta_{g}(q^{2}|Q^{2}) \frac{\mathrm{d}q^{2}}{q^{2}}$$

Here,

$$\Gamma_q(q^2|Q^2) = \frac{\alpha_s}{2\pi} C_F\left(\ln\frac{Q^2}{q^2} - \frac{3}{2}\right) \approx \frac{\alpha_s}{2\pi} \int_{z_-(q^2,Q^2)}^{z_+(q^2,Q^2)} P_{q\to qg}(z) \mathrm{d}z$$

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Let's check the first order in  $\alpha_s$ :

$$R_{2} = 1 - 2 \int_{\mu^{2}}^{Q^{2}} \Gamma_{q}(q^{2}|Q^{2}) \frac{\mathrm{d}q^{2}}{q^{2}} + \mathcal{O}(\alpha_{s}^{2})$$
$$R_{3} = 2 \int_{\mu^{2}}^{Q^{2}} \Gamma_{q}(q^{2}|Q^{2}) \frac{\mathrm{d}q^{2}}{q^{2}} + \mathcal{O}(\alpha_{s}^{2})$$

and

$$\int_{\mu^2}^{Q^2} \Gamma_q(q^2|Q^2) \frac{\mathrm{d}q^2}{q^2} = \frac{\alpha_s C_F}{4\pi} \left( \ln^2 \frac{Q^2}{\mu^2} - \frac{3}{2} \ln \frac{Q^2}{\mu^2} \right)$$

Exactly what we expected.

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But how did it cure the problem?

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But how did it cure the problem?

$$R_{2} = \Delta_{q}^{2}(\mu^{2}, Q^{2}) \qquad R_{3} = 2\Delta_{q}^{2}(\mu^{2}, Q^{2}) \int_{\mu^{2}}^{Q^{2}} \Gamma_{q}(q^{2}|Q^{2}) \Delta_{g}(q^{2}, Q^{2}) \frac{\mathrm{d}q^{2}}{q^{2}}$$

All powers of  $\alpha_s^n \ln^{2n}$  and  $\alpha_s^n \ln^{2n-1}$ 

Sudakov form factors suppress the logarithmic behaviour in  $\Gamma,$   $\Delta(\mu^2|Q^2) \to 0$  as  $\mu^2 \to 0.$ 

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But how did it cure the problem?

$$R_{2} = \Delta_{q}^{2}(\mu^{2}, Q^{2}) \qquad R_{3} = 2\Delta_{q}^{2}(\mu^{2}, Q^{2}) \int_{\mu^{2}}^{Q^{2}} \Gamma_{q}(q^{2}|Q^{2}) \Delta_{g}(q^{2}, Q^{2}) \frac{\mathrm{d}q^{2}}{q^{2}}$$

All powers of  $\alpha_s^n \ln^{2n}$  and  $\alpha_s^n \ln^{2n-1}$ 

Sudakov form factors suppress the logarithmic behaviour in  $\Gamma$ ,  $\Delta(\mu^2|Q^2) \rightarrow 0$  as  $\mu^2 \rightarrow 0.$ 

But now  $R_2 + R_3 \neq 1$ ? We took into account *any number of emissions*  $\rightarrow$  for small enough  $\mu^2$  we start seeing 4,5,6,... jets.

So far dealt with final state radiation. What about initial state radiation? Going back to the factorization property, we actually now have:

$$\begin{split} f_{P\leftarrow q}(x,q^2) \mathrm{d}\sigma_{+1 \text{ gluon}}(x) \approx \\ f_{P\leftarrow q}\left(\frac{x}{z},q^2\right) \mathrm{d}\sigma_{+0 \text{ gluons}}(x) \times \frac{\alpha_s}{2\pi} \frac{\mathrm{d}q^2}{q^2} P_{q\rightarrow qg}(z) \frac{\mathrm{d}z}{z} = \\ f_{P\leftarrow q}(x,q^2) \mathrm{d}\sigma_{+0 \text{ gluons}}(x) \times \frac{\alpha_s}{2\pi} \frac{\mathrm{d}q^2}{q^2} P_{q\rightarrow qg}(z) \mathrm{d}z \times \frac{f_{P\leftarrow q}\left(\frac{x}{z},q^2\right)}{z \ f_{P\leftarrow q}(x,q^2)} \end{split}$$

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#### Parton showers.

- Shortcomings of the parton level.
- Radiation, and the breakdown of naive perturbation theory. 🖌
- Factorization and parton showers. ✓

## Parton showers: Things to take home.

- Simulate the bulk of radiation, i.e. soft and collinear.
- Approximation only reliable in this region of phase space.
- Takes care of large logarithms in all orders.
- Cascade of subsequent, independent emissions  $\rightarrow$  Markovian process.
- Infrared cutoff is free parameter  $\rightarrow$  fit from data.

# Plan.

- − General structure of event generators. ✓
- Basic Monte Carlo methods. 🗸
- Partonic cross sections.
- − Parton showers. ✓
- Dipoles and soft gluons.
- Higher orders (and parton showers). 🗙
- Multiple interactions.
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- Decays of unstable hadrons. X
- Some highlight results. ∾

Dipoles and soft gluons.

Cross sections factor in the soft-collinear limit.

This is what led us to parton showering.

In the soft limit, the amplitude factorizes.

 $\rightarrow$  Dipoles of partons of opposite colour charge radiate.

Important interference effect:



## Dipoles and soft gluons.

Two approaches to get soft gluon emissions right:

- Improve dipole functions to include the collinear behaviour
  - $\rightarrow$  build up a dipole cascade.
- Improve soft-collinear parton shower to account for the interference.

Coherent emission and angular ordering:



# Plan.

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- − Dipoles and soft gluons. ✓
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## Multiple interactions.



#### Appearance is intuitively clear $\rightarrow$ proton is an extended object.

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## Multiple interactions.

Intuitively clear, but what are the details of the physics behind?

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Intuitively clear, but what are the details of the physics behind? Cross section for  $pp \rightarrow 2$  jets, with a cut on the  $p_{\perp}$  of the jets.



Eventually,

$$\sigma_{pp 
ightarrow 2 ext{ jets}}(p_{\perp} > p_{\perp, \min}) > \sigma_{pp, ext{total}}$$

for small  $p_{\perp}$ -cutoff.

What is going on here?

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Eventually,

$$\sigma_{pp
ightarrow2\ ext{jets}}( extsf{p}_{\perp} > extsf{p}_{\perp, extsf{min}}) > \sigma_{pp, ext{total}}$$

for small  $p_{\perp}$ -cutoff.

What is going on here?

On average,

$$\left\langle rac{\sigma_{\it pp 
ightarrow 2 jets}}{\sigma_{\it pp,total}} 
ight
angle \geq 1$$

 $\rightarrow$  more than one hard scattering in a single collision!

Mind that  $\sigma_{pp\to 2 \text{ jets}}$  is an *inclusive* cross section, counting all scatterings. Ask for *any* two jets  $\rightarrow$  gets large just by combinatorics.

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Assume independent scatters: Poisson distribution for the number of additional scatters m

$$P_m(b,s) = rac{\langle n(b,s) 
angle^m}{m!} e^{-\langle n(b,s) 
angle}$$

Mean depends on CM energy and impact parameter  $\rightarrow$  modelled by parton luminosity:

$$\langle n(b,s) \rangle = \sum_{i,j,k,l} \int \mathcal{L}(x_i, x_j, b) \sigma_{ij \to kl}(x_i, x_j, s)$$

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Inelastic cross section:

$$\sigma_{ ext{inelastic}} = \sum_{m=1}^{\infty} \int \mathrm{d}^2 b \; P_m(b,s) = \int \mathrm{d}^2 b \left( 1 - e^{-\langle n(b,s) 
angle} 
ight)$$

Simplest models of  $\langle n(b,s) \rangle$  by geometrical arguments:

$$\langle \textit{n}(\textit{b},\textit{s}) 
angle = \textit{A}(\textit{b}) \sigma_{\textit{pp} 
ightarrow 2} \; \mathsf{jets}(\textit{s},\textit{p}_{\perp,\mathsf{min}})$$



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Unitarized cross sections:



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### Multiple interactions: To take home.

- On average, there is no single hard scattering in a single pp collision.
- Independent scatterings and unitarized inelastic cross sections.
- $p_{\perp,\min}$  and the modelling of  $\langle n \rangle$  distinguish different models.
- $p_{\perp,\min}$  and other parameters from fit to data
- Below  $p_{\perp,\min}$  we have no clue  $\rightarrow$  pure modelling.

# Plan.

- General structure of event generators. ✓
- Basic Monte Carlo methods. 🗸
- Partonic cross sections.
- Parton showers. ✓
- − Dipoles and soft gluons. ✓
- Higher orders (and parton showers). X
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- Some highlight results.

Confinement:

- QCD strongly coupled at small energy scales.
- Colour charges are bound by flux tubes.



QED

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String models.

- Meson =  $q\bar{q}$  stretching oscillating string
- Colour dipole in hard scattering acts as point like source of strings.
- String breaks up by creation of  $q\bar{q}$  if field gets too intense.



String models and gluons.

Gluons produce kinks on strings.





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Cluster models:

End of a parton shower: colour singlet ' $q\bar{q}$ ' pairs close in phase space  $\rightarrow$  colour neutral clusters with masses peaked at low values.





Spectrum is universal

 $\rightarrow$  hadronization does not care about the hard process.

Cluster models.

- Split gluons into  $q\bar{q}$  pairs.
- Find clusters.
- Decay clusters with mass above some threshold.
- Pop q ar q pair from vacuum and turn cluster into two mesons, or
- pop  $q\bar{q}Q\bar{Q}$  pair from vacuum and turn into two baryons.

# Plan.

- − General structure of event generators. ✓
- Basic Monte Carlo methods. 🗸
- Partonic cross sections. 🗸
- Parton showers. 🗸
- − Dipoles and soft gluons. ✓
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- Some highlight results. ~

# Some Highlight Results.



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Simon Plätzer (DESY Theory Group)

We certainly do have a very good understanding of what is going on in high energy collisions.

We can really simulate them, as seen in experiment.

However, no one has an ultimate understanding of the subject.

Take care to compare and validate different approaches.

Try the programs. We're happy if they are used.

Some of the major event generators:

- Sherpa http://projects.hepforge.org/sherpa
- Pythia http://home.thep.lu.se/~ torbjorn/Pythia.html
- Herwig++ [That's the one I'm working on.]
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# Thanks a lot, hoping it was interesting.

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