

Introduction to Monte Carlo Event Generators



Stefan Höche



SLAC NAL Theory Group

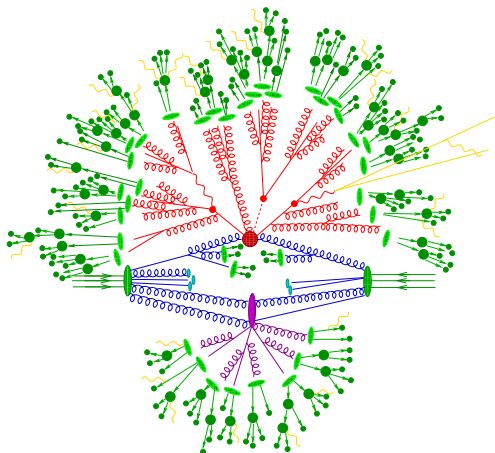
CTEQ-Fermilab School on QCD and Electroweak Phenomenology
PUPC Lima, 07/30-08/09 2012

Outline of Lecture I

- ▶ The structure of Monte Carlo events
- ▶ Matrix Elements (ME)
- ▶ Parton Showers (PS)
- ▶ Matching ME and PS at NLO

The structure of MC events

- ▶ Hard interaction
- ▶ QCD evolution
- ▶ Secondary hard interactions
- ▶ Hadronization
- ▶ Hadron decays
- ▶ Higher-order QED corrections



Event generators for LHC physics

[Buckley et al.] PR504(2011)145

Herwig

- ▶ Originated in coherent shower studies → angular ordered PS
- ▶ Front-runner in development of MC@NLO and POWHEG
- ▶ Simple in-house ME generator & spin-correlated decay chains
- ▶ Original framework for cluster fragmentation

Pythia

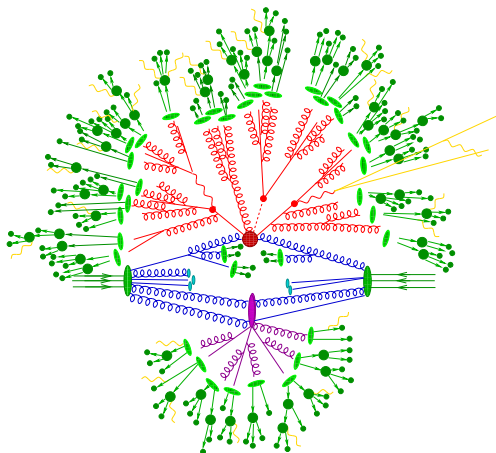
- ▶ Originated in hadronization studies → Lund string
- ▶ Leading in development of multiple interaction models
- ▶ Pragmatic attitude to ME generation → external tools
- ▶ Extensive PS development and earliest ME \otimes PS matching

Sherpa

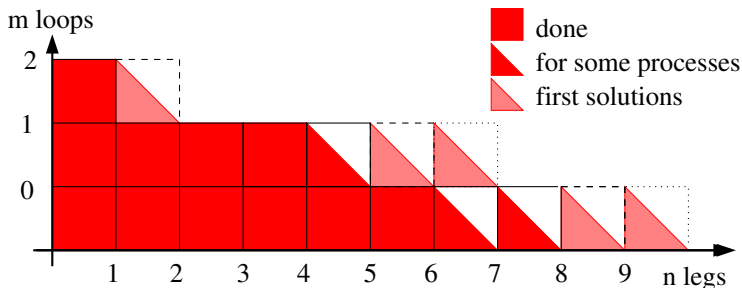
- ▶ Started with PS generator APACIC++ & ME generator AMEGIC++
- ▶ Current MPI model and hadronization pragmatic add-ons
- ▶ Leading in development of automated ME \otimes PS merging
- ▶ Automated framework for NLO calculations and MC@NLO

The structure of MC events

- ▶ **Hard interaction**
- ▶ QCD evolution
- ▶ Secondary hard interactions
- ▶ Hadronization
- ▶ Hadron decays
- ▶ Higher-order QED corrections



Availability of parton-level calculations



- ▶ Exact n -parton perturbative calculations often best
- ▶ But typically hard to do, especially for 'many' loops
- ▶ Zero loops case highly automated
- ▶ One loop case getting close

Amplitude generation

- ▶ **Textbook:** Use completeness relations to square amplitudes
sum/average over external states (helicity and color)
Computational effort grows quadratically with number of diagrams
- ▶ **Real life:** Amplitudes are complex numbers
first compute them, then add and square
Effort grows linearly with number of diagrams
- ▶ Applies to dynamical degrees of freedom only
 - ▶ Consider helicity: Polarizations depend on momenta
need to recompute for each phase-space point
 - ▶ Consider color: Mostly summed over at low multiplicity
independent of other d.o.f. → no need to recompute

Helicity

[Dixon] hep-ph/9601359
 [Dittmaier] hep-ph/9805445

- ▶ Weyl-van-der-Waerden spinors for helicity states $+/-$

$$\chi_+(p) = \begin{pmatrix} \sqrt{p^+} \\ \sqrt{p^-} e^{i\phi_p} \end{pmatrix} \quad \chi_-(p) = \begin{pmatrix} \sqrt{p^-} e^{i\phi_p} \\ -\sqrt{p^+} \end{pmatrix} \quad \begin{aligned} p^\pm &= p^0 \pm p^3 \\ p_\perp &= p^1 + ip^2 \end{aligned}$$

Basic building blocks for all amplitudes
 $+$, $-$, \perp directions define “spinor gauge”

- ▶ Massive Dirac spinors in terms of WvdW spinors

$$\begin{aligned} u_+(p, m) &= \frac{1}{\sqrt{2\bar{p}}} \begin{pmatrix} \sqrt{p_0 - \bar{p}} \chi_+(\hat{p}) \\ \sqrt{p_0 + \bar{p}} \chi_+(\hat{p}) \end{pmatrix} & \bar{p} &= \text{sgn}(p_0) |\vec{p}| \\ u_-(p, m) &= \frac{1}{\sqrt{2\bar{p}}} \begin{pmatrix} \sqrt{p_0 + \bar{p}} \chi_-(\hat{p}) \\ \sqrt{p_0 - \bar{p}} \chi_-(\hat{p}) \end{pmatrix} & \hat{p} &= (\bar{p}, \vec{p}) \end{aligned}$$

- ▶ γ^5 conveniently defined in Weyl representation

$$\gamma^5 = i\gamma^0\gamma^1\gamma^2\gamma^3 = \begin{pmatrix} -\sigma^0 & 0 \\ 0 & \sigma^0 \end{pmatrix}$$

Projection operator $P_{R,L} = P_\pm = (1 \pm \gamma^5)/2$ identifies
 lower/upper component of Dirac spinors as right-/left-handed

Helicity

- ▶ Massless polarizations constructed from $u_{\pm}(p)$ and $u_{\pm}(k)$ with external light-like gauge vector k

$$\varepsilon_{\pm}^{\mu}(p, k) = \pm \frac{\bar{u}_{\mp}(k)\gamma^{\mu}u_{\mp}(p)}{\sqrt{2}\bar{u}_{\mp}(k)u_{\pm}(p)}.$$

Defines light-like axial gauge

- ▶ For massive particles decompose momentum p using k

$$b = p - \kappa k \quad \kappa = \frac{p^2}{2pk} \quad \Rightarrow \quad b^2 = 0$$

Transverse polarizations as in massless case ($p \rightarrow b$) plus longitudinal

$$\varepsilon_0^{\mu}(p, k) = \frac{1}{m} (\bar{u}_-(b)\gamma^{\mu}u_-(b) - \kappa \bar{u}_-(k)\gamma^{\mu}u_-(k))$$

- ▶ Vertices & propagators have simpler structure
- ▶ Building blocks for Standard model complete!

Color

[Maltoni,Stelzer,Willenbrock] hep-ph/0209271

[Duhr,SH,Maltoni] hep-ph/0607057

- ▶ QCD amplitudes can be stripped of color factors
- ▶ Fundamental representation for n -gluons

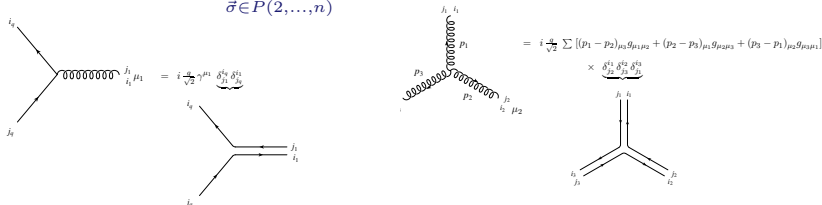
$$\mathcal{A}_n(p_1, \dots, p_n) = \sum_{\vec{\sigma} \in P(2, \dots, n)} \text{Tr}(\lambda^{a_1} \lambda^{a_{\sigma_2}} \dots \lambda^{a_{\sigma_n}}) A(p_1, p_{\sigma_2}, \dots, p_{\sigma_n})$$

- ▶ Adjoint representation for n -gluons

$$\mathcal{A}_n(p_1, \dots, p_n) = \sum_{\vec{\sigma} \in P(2, \dots, n-1)} [F^{a_{\sigma_2}} \dots F^{a_{\sigma_{n-1}}}]_{a_n}^{a_1} A(p_1, p_{\sigma_2}, \dots, p_{\sigma_{n-1}}, p_n)$$

- ▶ Color-flow representation for n -gluons

$$\mathcal{A}_n(p_1, \dots, p_n) = \sum_{\vec{\sigma} \in P(2, \dots, n)} \delta_{j_{\sigma_2}^{i_1}} \delta_{j_{\sigma_3}^{i_2}} \dots \delta_{j_1^{i_{\sigma_n}}} A(p_1, p_{\sigma_2}, \dots, p_{\sigma_n})$$



Color

- ▶ We can sample colors just like we sample momenta
- ▶ Assign one in $(r, g, b) / (\bar{r}, \bar{g}, \bar{b})$ to each external (anti-)quark & gluon
- ▶ Average number of partial amplitudes is then smallest in color-flow basis

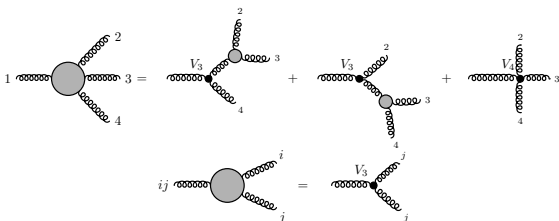
n	Average # of partials		
	Gell-Mann	Color-flow	Adjoint
4	4.83	1.28	1.15
5	15.2	1.83	1.52
6	56.5	3.21	2.55
7	251	6.80	5.53
8	1280	17.0	15.8
9	7440	48.7	56.4
10	47800	158	243

n	Time [s/ 10^4 pt]	
	CO	CD
4	1.20	1.04
5	3.78	2.69
6	14.2	7.19
7	58.5	23.7
8	276	82.1
9	1450	270
10	7960	864

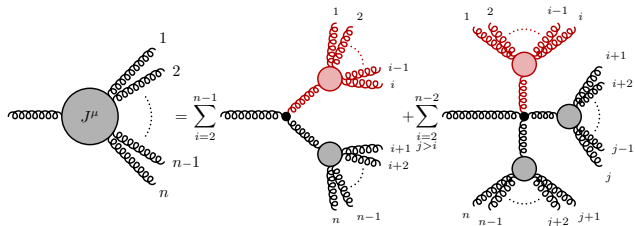
- ▶ Computational effort reduced further by not stripping amplitudes of color factors
- ▶ Evaluate dynamically at each vertex
→ straightforward computer algorithm
- ▶ Color dressing (CD) vs. color ordering (CO)

Amplitude construction

Example: Diagrams for
 $g(1)g(2) \rightarrow g(3)g(4)$



[Berends,Giele] NPB306(1988)759



Example: Currents for
 $g(1)g(2) \rightarrow g(3)g(4)$

Step 1	$J_1 = \varepsilon(1)$	$J_2 = \varepsilon(2)$	$J_3 = \varepsilon(3)$	$J_4 = \varepsilon(4)$
Step 2	J_{12}	J_{13}	J_{23}	
Step 3	J_{123}			
Step 4	$A(1, 2, 3, 4) = J_4^* J_{123}$			

Phase space

[James] CERN-68-15

[Byckling,Kajantie] NPB9(1969)568

- ▶ Need to evaluate in a process-independent way

$$d\Phi_n(p_a, p_b; p_1, \dots, p_n) = \left[\prod_{i=1}^n \frac{d^3 p_i}{(2\pi)^3 2E_i} \right] \delta^4 \left(p_a + p_b - \sum_{i=1}^n p_i \right)$$

- ▶ Use factorization properties of phase-space integral

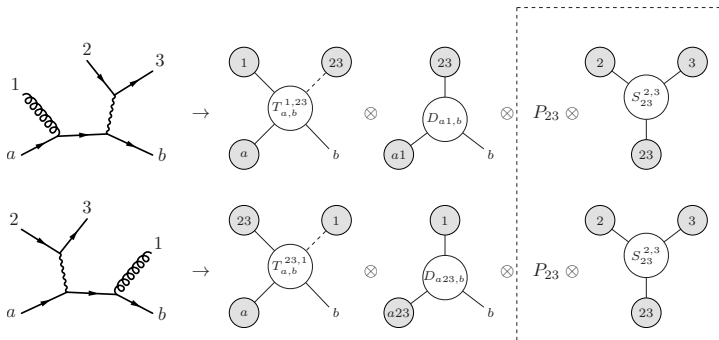
$$d\Phi_n(p_a, p_b; p_1, \dots, p_n) = d\Phi_{n-m+1}(p_a, p_b; p_{1m}, p_{m+1}, \dots, p_n) \\ \times \frac{ds_{1m}}{2\pi} d\Phi_m(p_{1m}; p_1, \dots, p_m)$$

- ▶ Apply repeatedly until only 2-particle phase spaces remain

$$d\Phi_2 = \frac{\lambda(s_{ij}, m_i^2, m_j^2)}{16\pi^2 2s_{ij}} d\cos\theta_i d\phi_i$$

$$\lambda^2(a, b, c) = (a - b - c)^2 - 4bc - \text{Källén function}$$

Phase space



- ▶ Construct one integrator per diagram and combine into multi-channel
- ▶ Intuitive notion of pole structure, multi-channel determines balance
- ▶ Factorial growth with number of diagrams can be tamed by recursion

Matrix element generation at NLO

NLO calculation

$$\left\{ \begin{array}{l}
 \text{Born term:} \quad B = \int \text{diagram} \\
 \text{Virtual terms:} \quad V = \sum 2 \text{Re} \left\{ \int \text{diagram} \right\} \\
 \text{Real terms:} \quad R = \sum \int \text{diagram}
 \end{array} \right.$$

The diagrams are represented by yellow circles with external lines and integration contours. The Born term is a single diagram. The virtual terms consist of a sum of diagrams, one of which has a white circle inside the yellow one. The real terms consist of a sum of diagrams, one of which has a white circle inside the yellow one.

- ▶ UV divergences in V removed by renormalization procedure
- ▶ V and R both still infrared divergent
- ▶ IR divergences cancel between V and R (KLN theorem)
- ▶ Exploit this fact to construct finite integrand for MC

Toy model for NLO

[Frixione,Webber] hep-ph/0204244

- ▶ Assume system of charged particles which radiates “photons” of fractional energy x .
- ▶ Predicting infrared-safe observables O amounts to computing expectation values

$$\langle O \rangle = \lim_{\varepsilon \rightarrow 0} \int_0^1 dx x^{-2\varepsilon} O(x) \left[\left(\frac{d\sigma}{dx} \right)_B + \left(\frac{d\sigma}{dx} \right)_V + \left(\frac{d\sigma}{dx} \right)_R \right]$$

- ▶ Born, virtual and real-emission contributions given by

$$\left(\frac{d\sigma}{dx} \right)_{B,V,R} = B \delta(x), \quad \left(V_f + \frac{BC}{2\varepsilon} \right) \delta(x), \quad \frac{R(x)}{x}$$

Real-emission behaves as $\lim_{x \rightarrow 0} R(x) = BC$

Virtual correction $\begin{cases} V_f & - \text{finite piece} \\ BC/2\varepsilon & - \text{singular piece} \end{cases}$

Implicit: All higher-order terms proportional to coupling α

Subtraction in the toy model

- ▶ Perform NLO calculation in subtraction method

$$\langle O \rangle_R = BC O(0) \int_0^1 dx \frac{x^{-2\varepsilon}}{x} + \int_0^1 dx \frac{R(x) O(x) - BC O(0)}{x^{1+2\varepsilon}}$$

- ▶ Second integral non-singular \rightarrow set $\varepsilon = 0$

$$\langle O \rangle_R = -\frac{BC}{2\varepsilon} O(0) + \int_0^1 dx \frac{R(x) O(x) - BC O(0)}{x}$$

- ▶ Combine everything with Born and virtual correction

$$\langle O \rangle = (B + V_f) O(0) + \int_0^1 \frac{dx}{x} [R(x) O(x) - BC O(0)]$$

Both terms separately finite

- ▶ Rewrite for further reference

$$\langle O \rangle = (B + V + I) O(0) + \int_0^1 \frac{dx}{x} [R(x) O(x) - S O(0)]$$

$I = -BC/2\varepsilon \rightarrow$ Integrated subtraction term

$S = BC \rightarrow$ Real subtraction term

QCD subtraction

- ▶ QCD subtraction a little more cumbersome due to spin and colour correlations in \mathbb{R}
- ▶ Basic features surviving from toy model are phase-space mapping and subtraction terms as products of Born times splitting operator
- ▶ Commonly used techniques
 - ▶ Dipole method
 - [Catani,Seymour] NPB485(1997)291
 - [Catani,Dittmaier,Seymour,Trocsanyi] NPB627(2002)189
 - ▶ FKS method
 - [Frixione,Kunszt,Signer] NPB467(1996)399

Matrix element generators

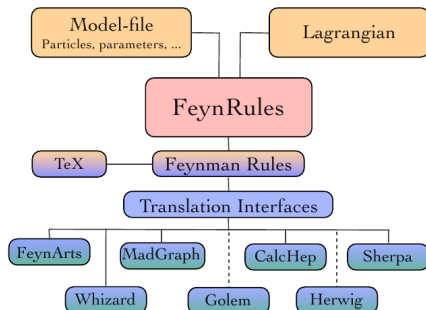
► Commonly used ME generators

	Built-in models	$2 \rightarrow$	$ M_n ^2$	$d\Phi_n$	NLO
ALPGEN	SM	8	recursive	Multi	-
AMEGIC	SM,MSSM,ADD	6	diagrams	Multi	sub
Comix	SM	8	recursive	Multi	sub
CompHEP	SM,MSSM	4	textbook	Single	-
HELAC	SM	8	recursive	Multi	sub+loop
MadEvent	SM,MSSM,UED	6	diagrams	Multi	sub(+loop)
Whizard	SM,MSSM,LH	8	recursive	Multi	sub

New physics models

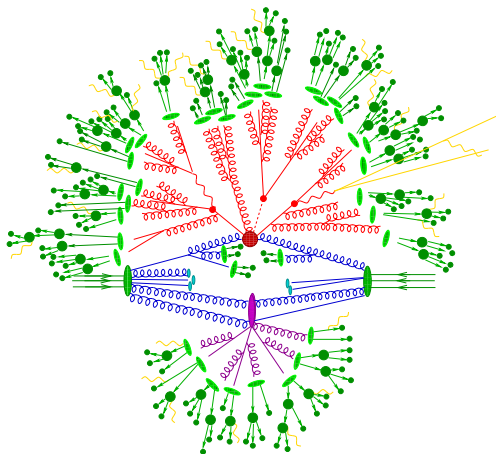
- ▶ Most ME generators suited for any physics model, but implementing Feynman rules tedious and error-prone
- ▶ Automated by FeynRules package
- ▶ Extracts vertices from Lagrangian based on minimal information about particle content
- ▶ Writes generator-specific output permitting easy cross-checks

[Christensen,Duhr] arXiv:0806.4194



The structure of MC events

- ▶ Hard interaction
- ▶ QCD evolution
- ▶ Secondary hard interactions
- ▶ Hadronization
- ▶ Hadron decays
- ▶ Higher-order QED corrections



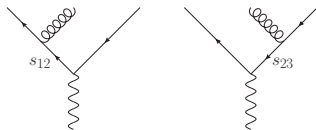
Parton evolution

- ▶ Consider $e^+e^- \rightarrow 3$ partons

$$\frac{1}{\sigma_{2 \rightarrow 2}} \frac{d\sigma_{2 \rightarrow 3}}{d \cos \theta dz} \sim C_F \frac{\alpha_s}{2\pi} \frac{2}{\sin^2 \theta} \frac{1 + (1-z)^2}{z}$$

θ - angle of gluon emission

z - fractional energy of gluon



- ▶ Divergent in

- ▶ Collinear limit: $\theta \rightarrow 0, \pi$
- ▶ Soft limit: $z \rightarrow 0$

- ▶ Separate into two independent jets

$$\frac{2d \cos \theta}{\sin^2 \theta} = \frac{d \cos \theta}{1 - \cos \theta} + \frac{d \cos \theta}{1 + \cos \theta} = \frac{d \cos \theta}{1 - \cos \theta} + \frac{d \cos \bar{\theta}}{1 - \cos \bar{\theta}} \approx \frac{d\theta^2}{\theta^2} + \frac{d\bar{\theta}^2}{\bar{\theta}^2}$$

- ▶ Independent jet evolution

$$d\sigma_3 \sim \sigma_2 \sum_{\text{jets}} C_F \frac{\alpha_s}{2\pi} \frac{d\theta^2}{\theta^2} dz \frac{1 + (1-z)^2}{z}$$

Components of the parton shower

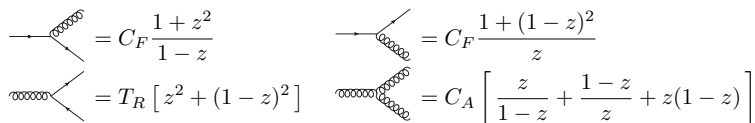
- ▶ Same equation for any variable with same limiting behavior

- ▶ Transverse momentum $k_T^2 = z^2(1-z)^2\theta^2 E^2$
- ▶ Virtuality $t = z(1-z)\theta^2 E^2$

- ▶ Call this the “evolution variable”

$$\frac{d\theta^2}{\theta^2} = \frac{dk_T^2}{k_T^2} = \frac{dt}{t} \quad \leftrightarrow \quad \text{collinear divergence}$$

- ▶ Absorb z -dependence into flavor-dependent splitting kernel $P_{ab}(z)$



The diagrams show the following relationships:

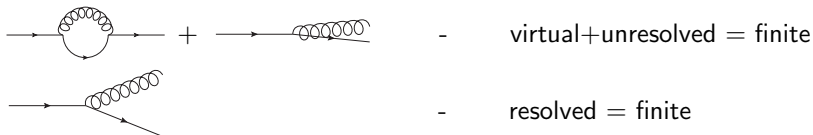
- Quark splitting (gluon emission): $\text{Diagram} = C_F \frac{1+z^2}{1-z}$
- Quark splitting (gluon absorption): $\text{Diagram} = T_R [z^2 + (1-z)^2]$
- Gluon splitting (quark emission): $\text{Diagram} = C_F \frac{1+(1-z)^2}{z}$
- Gluon splitting (gluon emission): $\text{Diagram} = C_A \left[\frac{z}{1-z} + \frac{1-z}{z} + z(1-z) \right]$

- ▶ Universal DGLAP evolution equation emerges

$$d\sigma_{n+1} \sim \sigma_n \sum_{\text{jets}} \frac{dt}{t} dz \frac{\alpha_s}{2\pi} P_{ab}(z)$$

The Sudakov form factor

- ▶ Collinear partons not separately resolveable
- ▶ Introduce finite resolution criterion, e.g. $t > t_c$



- ▶ **Unitarity / Probability conservation** \rightarrow resolved + unresolved = 1
- ▶ **Must implement no-emission probability (Poisson statistics)**

$$d\mathcal{P}_{\text{emit}}(t) = \frac{dt}{t} \int dz \frac{\alpha_s}{2\pi} P_{ab}(z) \quad \rightarrow \quad \mathcal{P}_{\text{no}}(t, t') = \exp \left\{ - \int_t^{t'} \frac{d\bar{t}}{\bar{t}} \int dz \frac{\alpha_s}{2\pi} P_{ab}(z) \right\}$$

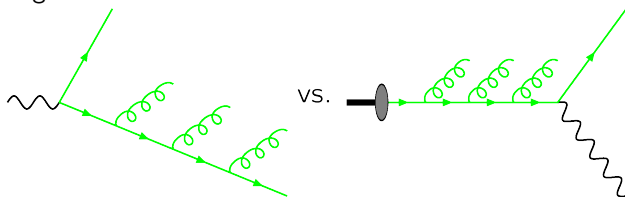
- ▶ Call $\Delta(t, t') := \mathcal{P}_{\text{no}}(t, t')$ the Sudakov form factor
- ▶ Total probability for parton produced at t' to radiate at t is

$$d\mathcal{P}(t) = d\mathcal{P}_{\text{emit}}(t) \mathcal{P}_{\text{no}}(t, t') = dt \frac{d\Delta(t, t')}{dt}$$

Initial-state evolution

[Sjöstrand] PLB175(1985)321

- ▶ Iteration leads to tree-like approximation of higher-order configuration
- ▶ Slight difference between final-state and initial-state evolution



- ▶ Initial-state emission probability must account for probability to resolve (different) parton at larger x

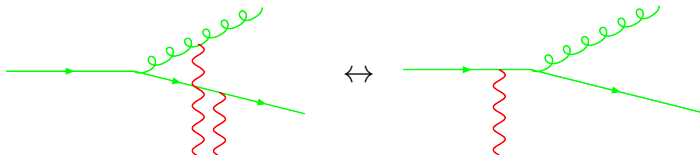
$$d\mathcal{P}_{\text{emit}}(x, t) = \frac{dt}{t} \int \frac{dz}{z} \frac{\alpha_s}{2\pi} P_{ab}(z) \frac{f_b(x/z, t)}{f_a(x, t)}$$

- ▶ Hard to implement in forward evolution (increasing t)
- ▶ Standard method is to evolve backward in initial state

Color coherence and angular ordering

[Marchesini,Webber] NPB310(1988)461

- ▶ Gluons with large wavelength not capable of resolving charges of emitting color dipole individually



- ▶ Emission occurs with combined charge of mother parton instead
- ▶ Net effect is destructive interference outside cone with opening angle defined by emitting color dipole
- ▶ Can be implemented directly by angular ordering variable or additional ordering criterion in parton showers

The MC algorithm for parton showers

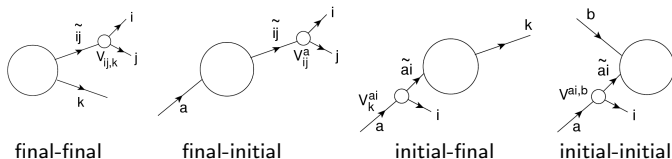
- ▶ Start with set of n partons at scale t' , which evolve collectively Sudakov form factors factorize, schematically

$$\Delta(t, t') = \prod_{i=1}^n \Delta_i(t, t') \quad \Delta_i(t, t') = \prod_{j=q,g} \Delta_{i \rightarrow j}(t, t')$$

- ▶ Use veto algorithm to find new scale t where branching occurs
 - ▶ Generate t using overestimate $\alpha_s^{\max} P_{ab}^{\max}(z)$
 - ▶ Determine “winner” parton i and select new flavor j
 - ▶ Select splitting variable according to overestimate
 - ▶ Accept point with weight $\alpha_s(k_T^2) P_{ab}(z) / \alpha_s^{\max} P_{ab}^{\max}(z)$
- ▶ Construct splitting kinematics and update color flow
- ▶ Continue until $t < t_c$

Dipole showers

- ▶ In parton showers, there is no such thing as a collinear limit
But who absorbs recoil when a splitting parton goes off mass-shell?
- ▶ No answer in DGLAP evolution equations \leftrightarrow collinear limit
Ambiguity introduces large uncertainties, especially at large t
- ▶ Natural solution provided by $2 \rightarrow 3$ splittings
Spectator kinematics enters splitting probability
- ▶ Basic concept of dipole showers

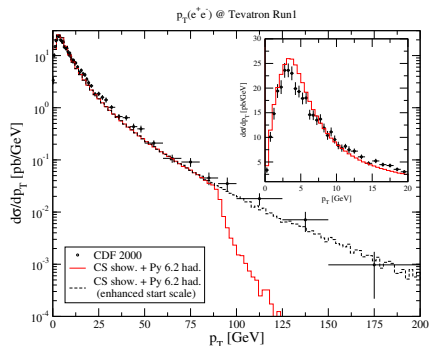


Parton-shower programs

► Publicly available generators

	Evolution variable	Splitting variable	Coherence
Ariadne	dipole- k_{\perp}^2	Rapidity	2 → 3 kernel
Herwig	$E^2\theta^2$	Energy fraction	AO
Herwig++	$(t - m^2)/z(1 - z)$	LC mom fraction	AO
Pythia 6.x	t	Energy fraction	Enforced
Pythia 8	k_{\perp}^2	LC mom fraction	Enforced
Sherpa 1.1.x	t	Energy fraction	Enforced
Sherpa 1.2.x	dipole- k_{\perp}^2	LC mom fraction	2 → 3 kernel
Vincia	dipole- k_{\perp}^2	LC mom fraction	2 → 3 kernel

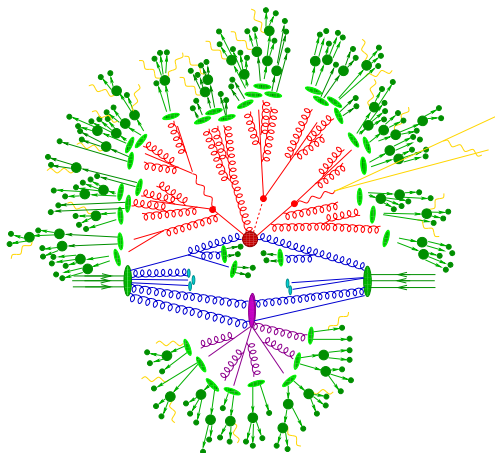
Effects of the parton shower



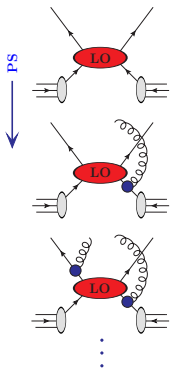
- ▶ Example: Drell-Yan lepton pair production at Tevatron
- ▶ If ME computed at leading order, then parton shower is only source of transverse momentum

The structure of MC events

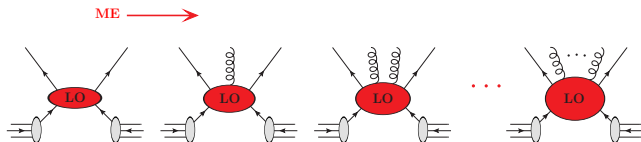
- ▶ Hard interaction
- ▶ QCD evolution
- ▶ Secondary hard interactions
- ▶ Hadronization
- ▶ Hadron decays
- ▶ Higher-order QED corrections



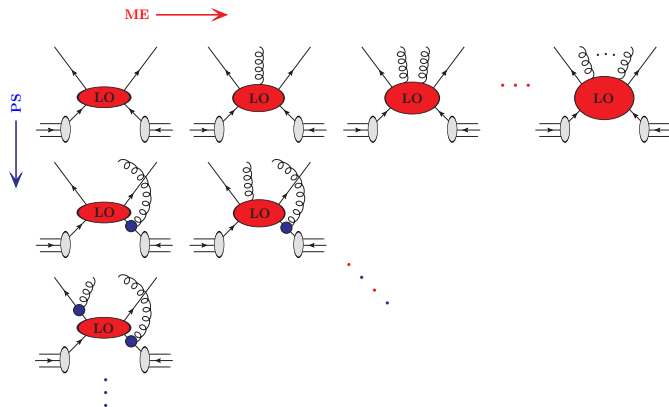
Parton showers



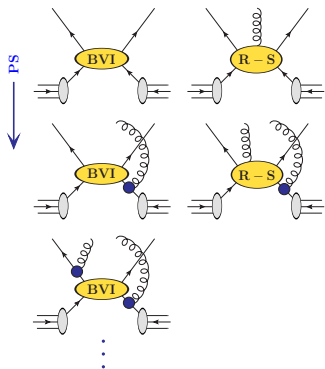
Matrix elements



Matrix elements & parton showers



NLO-PS matching



Parton showers from the fixed-order perspective

- ▶ Start with leading-order parton-level event

$$d\sigma_{\text{MC}} = d\Phi_n B_n(\Phi_n)$$

Φ_n - point in n -particle phase space

B_n - Leading order (Born) matrix element

- ▶ Generate emissions according to Sudakov form factor

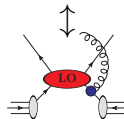
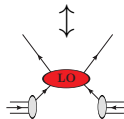
$$\Delta_n^{(\text{PS})}(t', t'') = \exp \left\{ - \int_{t'}^{t''} d\Phi_1 K_n(\Phi_1) \right\}$$

$d\Phi_1 \propto dt dz d\phi/2\pi$ - one-emission phase space

$K_n = \sum_{a,b} \frac{\alpha_s}{2\pi t} P_{ab}$ - sum of evolution kernels for n -particle final state

- ▶ Differential event rate up to first emission

$$d\sigma_{\text{MC@LO}} = d\Phi_n B_n(\Phi_n) \left[\Delta_n^{(\text{PS})}(t_c, \mu_Q^2) + \int_{t_c}^{\mu_Q^2} d\Phi_1 K_n(\Phi_1) \Delta_n^{(\text{PS})}(t(\Phi_1), \mu_Q^2) \right]$$



Modified subtraction

[Frixione,Webber] hep-ph/0204244

- ▶ Revisit toy model for NLO

$$\langle O \rangle = (B + V + I) O(0) + \int_0^1 \frac{dx}{x} [R(x) O(x) - S O(0)]$$

- ▶ In parton showers, any number of “photons” can be emitted
- ▶ Emission probability controlled by Sudakov form factor

$$\Delta(x_1, x_2) = \exp \left\{ - \int_{x_1}^{x_2} \frac{dx}{x} K(x) \right\}$$

Evolution kernel behaves as $\lim_{x \rightarrow 0} K(x) = R(0)/B = C$

- ▶ Define generating functional of PS \rightarrow
 $\mathcal{F}_{\text{MC}}^{(n)}(x) \leftrightarrow$ PS starting from n emissions at x
- ▶ $\mathcal{F}_{\text{MC}}^{(n)}(x)$ now replaces observable O Naively:
 - $O(0) \Leftrightarrow$ start MC with 0 emissions $\rightarrow \mathcal{F}_{\text{MC}}^{(0)}$
 - $O(x) \Leftrightarrow$ start MC with 1 emission $\rightarrow \mathcal{F}_{\text{MC}}^{(1)}(x)$

Modified subtraction

- ▶ Combined generating functional would be

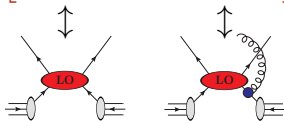
$$\left[(B + V + I) - \int_0^1 \frac{dx}{x} S \right] \mathcal{F}_{\text{MC}}^{(0)} + \int_0^1 \frac{dx}{x} R(x) \mathcal{F}_{\text{MC}}^{(1)}(x)$$

- ▶ This is wrong because

$$\mathcal{F}_{\text{MC}}^{(0)} = \Delta(x_c, 1) + \int_{x_c}^1 \frac{dx}{x} K(x) \Delta(x, 1)$$

- ▶ So $B \mathcal{F}_{\text{MC}}^{(0)}$ generates an $\mathcal{O}(\alpha)$ term that spoils NLO accuracy

$$\left(\frac{d\sigma}{dx} \right)_{\text{MC}} O(x) = B \left[- \frac{K(x)}{x} O(0) + \frac{K(x)}{x} O(x) \right]$$



Modified subtraction

- ▶ The proper MC@NLO is obtained by subtracting this $\mathcal{O}(\alpha)$ contribution

$$\mathcal{F}_{\text{MC@NLO}} = \underbrace{\left[(B + V + I) + \int_0^1 \frac{dx}{x} (BK(x) - S) \right]}_{\text{NLO-weighted Born cross section}} \mathcal{F}_{\text{MC}}^{(0)} + \int_0^1 \frac{dx}{x} \underbrace{[R(x) - BK(x)]}_{\text{modified subtraction}} \mathcal{F}_{\text{MC}}^{(1)}(x)$$

- ▶ Like at fixed order, both terms are separately finite
- ▶ We call events from the first term **S-events** (Standard) and events from the second term **H-events** (Hard)
- ▶ For further reference, define $D^{(K)}(x) := BK(x)$ as well as

$$\bar{B}^{(K)} = (B + V + I) + \int_0^1 \frac{dx}{x} (D^{(K)}(x) - S), \quad H^{(K)}(x) = R(x) - D^{(K)}(x)$$

→ compact notation

$$\mathcal{F}_{\text{MC@NLO}} = \bar{B}^{(K)} \mathcal{F}_{\text{MC}}^{(0)} + \int_0^1 \frac{dx}{x} H^{(K)}(x) \mathcal{F}_{\text{MC}}^{(1)}(x)$$

MC@NLO

[Frixione,Webber] hep-ph/0204244

- ▶ Apply toy model to QCD, but include $1/x$ -terms in coefficient functions
Also need to sum over all flavor contributions at real-emission level

$$\bar{B}_n^{(K)}(\Phi_n) = \left(B_n(\Phi_n) + \tilde{V}_n(\Phi_n) + I_n(\Phi_n) \right) + \int d\Phi_1 \left(D_n^{(K)}(\Phi_{n+1}) - S_n(\Phi_{n+1}) \right)$$

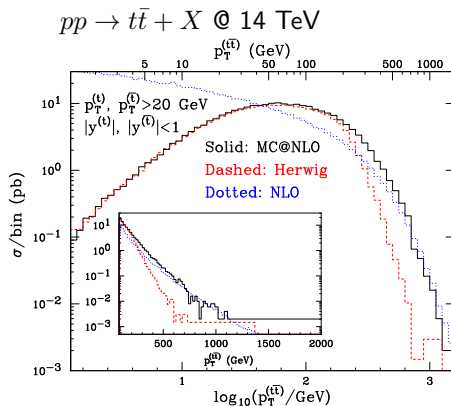
$$H_n^{(K)}(\Phi_{n+1}) = R_n(\Phi_{n+1}) - D_n^{(K)}(\Phi_{n+1})$$

- ▶ Full differential event rate up to first emission

$$d\sigma_{\text{MC@NLO}} = d\Phi_n \bar{B}_n^{(K)}(\Phi_n) \left[\Delta_n^{(\text{PS})}(t_c, \mu_Q^2) \leftrightarrow \text{B} \right] + \int_{t_c}^{\mu_Q^2} d\Phi_1 K_n(\Phi_1) \Delta_n^{(\text{PS})}(t(\Phi_1), \mu_Q^2) \left[\text{B} \leftrightarrow \text{LO} \right] + d\Phi_n \int d\Phi_1 H_n^{(K)}(\Phi_{n+1})$$

MC@NLO features

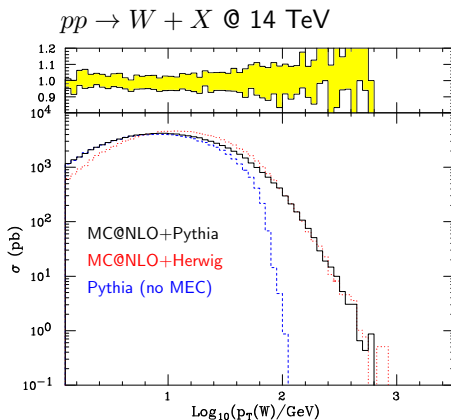
[Nason,Webber] arXiv:1202.1251



- MC@NLO interpolates smoothly between real-emission ME and PS

MC@NLO features

[Torrielli,Frixione] arXiv:1002.4293



- ▶ MC@NLO with different PS agree at high $p_T \leftrightarrow$ NLO
- ▶ Differences at low p_T due to differences in PS

POWHEG

[Nason] hep-ph/0409146

- ▶ Aim of the method: Eliminate negative weights from MC@NLO
- ▶ Set $D_n^{(R)} := R_n \rightarrow$ no \mathbb{H} -events $\Rightarrow \bar{B}_n^{(R)}$ positive in physical region
- ▶ Differential event rate up to first emission is

$$d\sigma_{\text{POWHEG}} = d\Phi_n \bar{B}_n^{(R)}(\Phi_n) \left[\Delta_n^{(R)}(t_c, s_{\text{had}}) + \int_{t_c}^{s_{\text{had}}} d\Phi_1 \frac{R_n(\Phi_{n+1})}{B_n(\Phi_n)} \Delta_n^{(R)}(t(\Phi_1), s_{\text{had}}) \right]$$

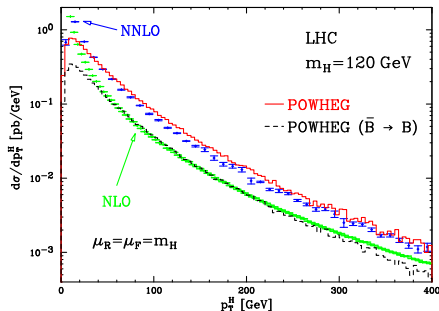
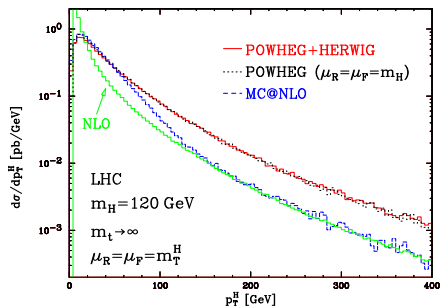
- ▶ μ_Q^2 has changed to hadronic centre-of-mass energy squared, s_{had} , as full phase space for real-emission correction, R_n , must be covered
- ▶ Absence of \mathbb{H} -events leads to enhancement of high- p_T region by

$$K = \frac{\bar{B}_n}{B_n} = 1 + \mathcal{O}(\alpha_s)$$

Formally beyond NLO, but sizeable corrections in practice

POWHEG features

[Alioli,Nason,Oleari,Re] arXiv:0812.0578



- ▶ Large enhancement at high $p_{T,h}$
- ▶ Can be traced back to large NLO correction
- ▶ Fortunately, NNLO correction is also large $\rightarrow \sim$ agreement

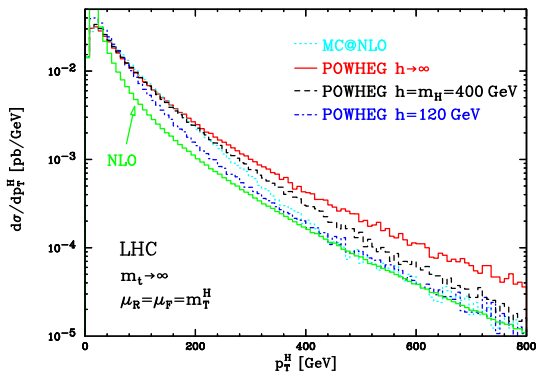
Improved POWHEG

- ▶ To avoid problems in high- p_T region, split real-emission ME into singular and finite parts as $R_n = R_n^s + R_n^f$
- ▶ Treat singular piece in \mathbb{S} -events and finite piece in \mathbb{H} -events
Similar to MC@NLO with redefined PS evolution kernels
- ▶ Differential event rate up to first emission

$$\begin{aligned}
 d\sigma_{\text{POWHEG}} = & d\Phi_n \bar{B}_n^{(\text{R}^s)}(\Phi_n) \left[\Delta_n^{(\text{R}^s)}(t_c, s_{\text{had}}) \right. \\
 & \left. + \int_{t_c}^{s_{\text{had}}} d\Phi_1 \frac{R_n^s(\Phi_{n+1})}{B_n(\Phi_n)} \Delta_n^{(\text{R}^s)}(t(\Phi_1), s_{\text{had}}) \right] + d\Phi_n \int d\Phi_1 R_n^f(\Phi_{n+1})
 \end{aligned}$$

POWHEG features

[Alioli, Nason, Oleari, Re] arXiv:0812.0578



- Singular real-emission part here defined as

$$R_n^s = R \frac{h^2}{p_T^2 + h^2}$$

- Can “tune” NNLO contribution by varying free parameter h

Summary

- ▶ MC event generators use factorization to split simulated events into stages
- ▶ Fixed-order perturbative calculation describes production of hard objects, e.g. jets, leptons
- ▶ Parton shower describes evolution of jets and potentially production of additional jets
- ▶ Parton showers can be matched to fixed-order NLO to improve the description of Born-level observables

Stating the problem

- ▶ We want to compute expectation values of observables

$$\langle O \rangle = \sum_n \int d\Phi_n P(\Phi_n) O(\Phi_n)$$

Φ_n - Point in n -particle phase-space

$P(\Phi_n)$ - Probability to produce Φ_n

$O(\Phi_n)$ - Value of observable at Φ_n

- ▶ Problem #1: Computing $P(\Phi_n)$
- ▶ Problem #2: Performing the integral
- ▶ Typically, problem #2 is harder to solve
This is where MC event generators come in

Numerical integration

- ▶ Assume one-dimensional integral

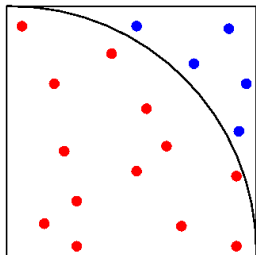
$$I = \int_a^b dx f(x)$$

- ▶ Can be approximated numerically by sum over M rectangles of size $\Delta x = (b - a)/M$

$$I = \sum_{i=0}^{M-1} f(a + i\Delta x)\Delta x$$

- ▶ Error of numerical estimate is linear in Δx
- ▶ Trapezoids instead of rectangles reduce error $\rightarrow \propto (\Delta x)^2$
 $f(a + i\Delta x) \rightarrow [f(a + i\Delta x) + f(a + (i + 1)\Delta x)]/2$
- ▶ Generic problem of the method: Number of points scales like M^n where n is the number of dimensions. Impossible to compute multi-particle observables

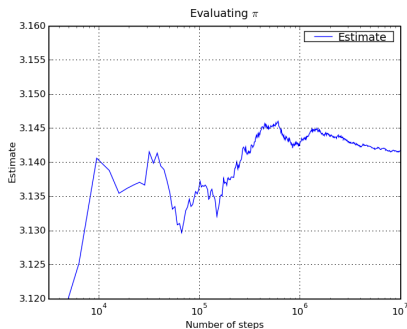
The hit-or-miss method



$$\frac{\text{Hits}}{\text{Misses} + \text{Hits}} \rightarrow \frac{\pi}{4}$$

Throw random points (x,y) ,
with x, y in $[0,1]$

For hits: $(x^2 + y^2) < r^2 = 1$



Importance sampling

- ▶ In many cases we can approximate the integral of $f(x)$ with some known function $g(x)$ such that primitive $G(x)$ is known
- ▶ This amounts to a variable transformation

$$I = \int_a^b dx g(x) \frac{f(x)}{g(x)} = \int_a^b dG(x) w(x) \quad \text{where} \quad w(x) = \frac{f(x)}{g(x)}$$

- ▶ Integral and error estimate are

$$I = [G(b) - G(a)] \langle w \rangle \quad \sigma = [G(b) - G(a)] \sqrt{\frac{\langle w^2 \rangle - \langle w \rangle^2}{N - 1}}$$

N - Number of MC events (points)

- ▶ MC error scales as $1/\sqrt{N}$
independent of number of dimensions!
- ▶ Note that I is independent of $g(x)$, but σ is not
→ suitable choice of $g(x)$ can be used to minimize error

Selection from a known distribution

- ▶ Random number generators produce uniform pseudo-random numbers in $[0, 1]$
- ▶ Assume we want points following the distribution $g(x)$ with known primitive $G(x)$ instead
- ▶ Probability of producing point in $[x, x + dx]$ is $g(x) dx$
- ▶ We can generate x according to

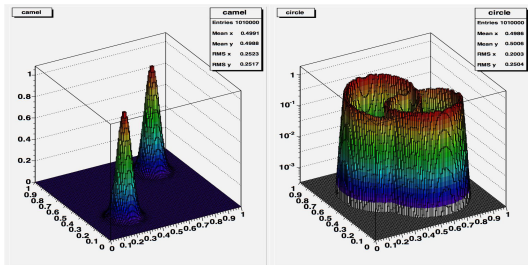
$$\int_a^x dx' g(x') = R \int_a^b dx' g(x')$$

where R is a uniform random number in $[0, 1]$

$$x = G^{-1} \left[G(a) + R(G(b) - G(a)) \right]$$

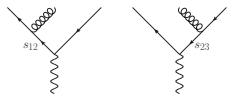
Stratified sampling

- ▶ Can divide interval $[a, b]$ into M bins
- ▶ Inside each bin, use a flat distribution g_i
- ▶ Choose $g_i = \max f(x)$ in interval i
- ▶ Problem: strongly peaked distributions
→ large variance due to inappropriate interval size
- ▶ Define intervals dynamically, such that each contributes equally to total variance → Vegas/Foam



The multi-channel method

- ▶ Assume function $f(x)$ which behaves roughly like $g_1(x) + g_2(x)$
- ▶ Practical example: Tree-level matrix element with divergences in s_{12} and s_{23}



- ▶ Define multi-channel

$$g(x) = \sum_i \alpha_i g_i(x)$$

α_i - multi-channel weight

$g_i(x)$ - single channel

- ▶ Since all integrals $G_i(x)$ are known, event generation is easy
- ▶ Adjust weights such that each channel contributes equally to total variance \rightarrow stratified sampling is a special case

Poisson distributions

- ▶ Assume nuclear decay process described by $g(x)$
- ▶ Nucleus can decay only if it has not decayed already
Must account for survival probability \leftrightarrow Poisson distribution

$$\mathcal{G}(x) = g(x)\Delta(x, b) \quad \text{where} \quad \Delta(x, b) = \exp\left\{-\int_x^b dx' g(x')\right\}$$

- ▶ If $G(x)$ is known, then we also know the integral of $\mathcal{G}(x)$

$$\int_x^b dx' \mathcal{G}(x') = \int_x^b dx' \frac{d\Delta(x', b)}{dx'} = 1 - \Delta(x, b)$$

- ▶ We can generate events by requiring $1 - \Delta(x, b) = 1 - R$

$$x = G^{-1}\left[G(b) + \log R\right]$$

The veto algorithm

- ▶ Veto algorithm \leftrightarrow Hit-or-miss method for Poisson distributions
 - ▶ Generate event according to $\mathcal{G}(x)$
 - ▶ Accept with $w(x) = f(x)/g(x)$
 - ▶ If rejected, continue generating from x
- ▶ Probability for immediate acceptance

$$\frac{f(x)}{g(x)} g(x) \exp \left\{ - \int_x^b dx' g(x') \right\}$$

- ▶ Probability for acceptance after one rejection

$$\frac{f(x)}{g(x)} g(x) \int_x^b dx_1 \exp \left\{ - \int_x^{x_1} dx' g(x') \right\} \left(1 - \frac{f(x_1)}{g(x_1)} \right) g(x_1) \exp \left\{ - \int_{x_1}^b dx' g(x') \right\}$$

- ▶ For n intermediate rejections we obtain n nested integrals $\int_x^b \int_{x_1}^b \cdots \int_{x_{n-1}}^b$
- ▶ Disentangling yields $1/n!$ and summing over all possible rejections gives

$$f(x) \exp \left\{ - \int_x^b dx' g(x') \right\} \sum_{n=0}^{\infty} \frac{1}{n!} \int_x^b dx' [g(x') - f(x')] = f(x) \exp \left\{ - \int_x^b dx' f(x') \right\}$$