Recent Developments in Event Generators

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The Standard Model as we know it



[ATLAS] https://twiki.cern.ch/twiki/bin/view/AtlasPublic/StandardModelPublicResults [CMS] https://twiki.cern.ch/twiki/bin/view/CMSPublic/PhysicsResultsCombined

Fermilab 1



Fermilab 2

[Buckley et al.] arXiv:1101.2599 [Campbell et al.] arXiv:2203.11110



- Signal process
- Radiative corrections
- Long-distance interactions
 - Hadronization
 - Particle decays

Divide and Conquer

- Quantity of interest: Total interaction rate
- Convolution of short & long distance physics

$$\sigma_{p_1p_2 \to X} = \sum_{i,j \in \{q,g\}} \int \mathrm{d}x_1 \mathrm{d}x_2 \underbrace{f_{p_1,i}(x_1,\mu_F^2) f_{p_2,j}(x_2,\mu_F^2)}_{\text{long distance}} \underbrace{\hat{\sigma}_{ij \to X}(x_1x_2,\mu_F^2)}_{\text{short distance}} \underbrace{$$



Creation States Fermilab 3

[Buckley et al.] arXiv:1101.2599 [Campbell et al.] arXiv:2203.11110



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Connection to QCD theory

► $\hat{\sigma}_{ij \to n}(\mu_F^2)$ → Collinearly factorized fixed-order result at N^xLO Implemented in fully differential form to be maximally useful Tree level: $d\Phi_n B_n$

Automated ME generators + phase-space integrators

1-Loop level: $d\Phi_n \left(B_n + V_n + \sum C + \sum I_n \right) + d\Phi_{n+1} \left(R_n - \sum S_n \right)$

Automated loop ME generators + integral libraries + IR subtraction 2-Loop level: It depends ...

▶ Individual solutions based on SCET, *q*^{*T*} subtraction, P2B

► $f_i(x, \mu_F^2) \rightarrow \text{Collinearly factorized PDF at NYLO}$ Evaluated at $O(1 \text{GeV}^2)$ and expanded into a series above 1GeV^2 DGLAP: $\frac{\mathrm{d}x x f_a(x, t)}{\mathrm{d} \ln t} = \sum_{b=q,g} \int_0^1 \mathrm{d}\tau \int_0^1 \mathrm{d}z \frac{\alpha_s}{2\pi} [z P_{ab}(z)]_+ \tau f_b(\tau, t) \,\delta(x - \tau z)$

Parton showers, dipole showers, antenna showers, ...

Matching:
$$d\Phi_n \ \frac{S_n}{B_n} \leftrightarrow \frac{dt}{t} dz \ \frac{\alpha_s}{2\pi} P_{ab}(z)$$

► MC@NLO, POWHEG, Geneva, MINNLO_{PS}, ...



Co-design of simulations over the years



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Directions of development

Much effort focused on parton-shower component recently

- ▶ Phenomenologically interesting: Drives jet production, *b*-tagging, ...
- Experimentally relevant: Often source of largest uncertainty
- Next to hadronization, probably the most important component of MCs

Fixed-order aspects

- Matching to NLO & merging
 - Negative weight fraction
 - Computing efficiency
- Matching to NNLO calculations
 - Semi-inclusive (Geneva, MINNLO_{PS})
 - Fully differential (Vincia)
- Matching to N³LO calculations
 - Fully differential (TOMTE)

All-order aspects

- NLL precision
- NLO splitting functions
- ► Kinematic edge effects
- Spin correlations in collinear & soft limit
- Sub-leading color effects

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- Threshold effects
- Amplitude evolution

Why matching & merging?

[Prestel,Schulz,SH] arXiv:1905.05120



• Predictions for measured N-jet rates stabilize for \approx N+2 LO ME-level jets

▶ Poor man's version of NNLO (loops emulated by legs + unitarity constraint)

Computing efficiency: The cost of multi-jet merging

[HSF Generator WG] arXiv:2004.13687, arXiv:2109.14938

- Event generation will consume significant fraction of resources at LHC soon
- Need to scrutinize both generator usage and underlying algorithms
- Dedicated effort in HEP Software Foundation (HSF)



[ATLAS] CERN-LHCC-2022-005 / LHCC-G-182



Computing efficiency: MadGraph Developments

- New code-generator in MadGraph 5 to generate CUDA, SYCL, Kokkos output for ME computation
- Vectorized code for computations on CPUs
- Included in improved MadEvent framework



[A. Valassi et al., ACAT'22 & QCD@LHC 2022]

- Performances of SYCL and Kokkos comparable to direct CUDA
- New computing strategy delivers both portability and performance

		ACAT2022			madevent		standalone	
CUDA grid size					8192			16384
$gg \rightarrow t\bar{t}ggg$	MEs	$t_{\rm TOT} = t_{\rm Mad} + t_{\rm MEs}$			Nevents/tTOT	$N_{\text{events}}/t_{\text{MEs}}$		
	precision	[sec]			[events/sec]	[MEs/sec]		
Fortran	double	1228.2 =	5.0	+ 1223.2	7.34E1 (=1.0)	7.37E1 (=1.0)	—	—
CUDA	double	19.6 =	7.4	+ 12.1	4.61E3 (x63)	7.44E3 (x100)	9.10E3	9.51E3 (x129)
CUDA	float	11.7 =	6.2	+ 5.4	7.73E3 (x105)	1.66E4 (x224)	1.68E4	2.41E4 (x326)
CUDA	mixed	16.5 =	7.0	+ 9.6	5.45E3 (x74)	9.43E3 (x128)	1.10E4	1.19E4 (x161)



Computing efficiency: Sherpa Developments

[R. Wang et al., ACAT'22]

- Study of a variety of algorithms & assessment of practicality for LHC background simulations
- First use of new color basis [Melia] arXiv:1509.03297 in a generator
- Cuda for benchmarks, portability through Kokkos



- ► Factor ~10 speedup at low multiplicity, factor ~4 at high multiplicity (fully loaded E5620 CPU (MPI) and V100 GPU)
- Currently being combined with integrator and event generation framework

Computing efficiency: Usage of analytics

[Campbell,Preuss,SH] arXiv:2107.04472, [7 M. Knobbe's talk]

- At HL-LHC, accuracy and precision requirements for a small number of processes drive computing demands:
 - $W^{\pm}/Z/\gamma$ +jets
 - ► tt+jets
 - ...
- ► Up to 2 jets, NLO matrix elements for W/Z/γ/h are known analytically
- Significant speedup out of the box (analytic vs numeric 1-loop ME only)

Merged Process	Sherpa+	Sherpa+
$n \leq 2 @ \text{NLO}$ $n \leq 5 @ \text{LO}$	OpenLoops2/MCFM	MadLoop5/MCFM
$pp \rightarrow Z + nj$	$1.83\substack{+0.20 \\ -0.12}$	$3.01\substack{+0.26\\-0.18}$
$pp \rightarrow W^+ + nj$	$1.34\substack{+0.06 \\ -0.07}$	$1.36\substack{+0.03 \\ -0.03}$
$pp \to W^- + nj$	$1.38\substack{+0.06 \\ -0.04}$	$1.38\substack{+0.07\\-0.11}$



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Fixed-order matching: Basic idea



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Fixed-order matching: Geneva

[D. Napoletano's talk at HP²]

• Use known resummation in jettiness / q_T & match to NNLO

$\mathrm{d}\sigma$	$d\sigma^{NNLL'}$	$d\sigma^{res.exp.}$	$d\sigma^{FO}$
$\mathrm{d}\Phi\mathrm{d}r$	$d\Phi dr$	$d\Phi dr$	$d\Phi \mathrm{d}r$

• Match to shower by vetoing events with $r_N(\Phi_{N+M}) > r_N$



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Fixed-order matching: Geneva

[G. Marinelli's talk at HP²]



Comparison against experimental data

• $p_{T,H}$ and ATLAS data



y_H and CMS data



Fixed-order matching: MINNLO_{PS}

[Lindert,Lombardi,Wiesemann,Zanderighi,Zanoli] arXiv:2208.12660

- WZ production at NNLO QCD × NLO EW



Fixed-order matching: MINNLO_{PS}

[Gavardi.Oleari.Re] arXiv:2204.12602

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- Di-photon production at the LHC
- QED singular contributions in real-emission corrections treated as fixed order \rightarrow split off by damping function



[ATLAS] arXiv:2107.09330

Fixed-order matching: Vincia

[C. Preuss' talk at HP²] [Campbell,Li,Preuss,Skands,SH] arXiv:2108.07133

- Fully differential matching technique akin to POWHEG
- Technical implementation based on sector antenna framework
- Configurations absent in antenna-shower approximation simulated using direct $2 \rightarrow 4$ branchings



U(N)LOPS

[Lönnblad, Prestel] arXiv:1211.4827, [Plätzer] arXiv:1211.5467



- Compute vetoed cross section & complete with real-emission
- Add Sudakov vetoed real-emission cross section & projection
- Can be implemented based on only two inputs (gray boxes)



[Lönnblad, Prestel] arXiv:1211.4827, [Li, Prestel, SH] arXiv:1405.3607

UN²LOPS



Same idea as in ULOPS, but now also adding 2-loop contribution



[Prestel] arXiv:2106.03206, [Bertone, Prestel] arXiv:2202.01082

TOMTE



► Same idea as in UN²LOPS, but now also adding 3-loop contribution

Must pay careful attention to projections (relevant for all UN^XLOPS)

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[Bertone, Prestel] arXiv:2202.01082

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- Drell-Yan lepton pair production at LHC
- Stand-in fixed-order calculation for closure tests

All-order aspects: Parton showers at NLL precision

- How to quantify logarithmic precision of parton showers? [Dasgupta,Dreyer,Hamilton,Monni,Salam] arXiv:1805.09327
- Angular ordered parton showers provably NLL accurate for global observables, but wrong recoil may invalidate this [Bewick,Ferrario Ravasio,Richardson,Seymour] arXiv:1904.11866
- Two problems in commonly used dipole showers [/ talk by S. Ferrario-Ravasio]
 - Correlations across multiple emissions due to recoil strategy
 - Color charge of initial quarks not reflected in soft, wide angle region
- Kinematics problem can be solved by
 - Partitioning of antenna radiation pattern, combined with local or semi-global recoil scheme [Dasgupta,Dreyer,Hamilton,Monni,Salam,Soyez] arXiv:2002.11114 [vanBeekveld,Ferrario Ravasio,Hamilton,Salam,Soto-Ontoso,Soyez] arXiv:2205.02237, arXiv:2207.09467
 - Additive matching of soft to collinear radiator, combined with global recoil scheme [Forshaw,Holguin,Plätzer] arXiv:2003.06400
 - Multiplicative matching of soft to collinear radiator, combined with semi-global recoil scheme [Nagy,Soper] arXiv:2011.04773
 - Multiplicative matching of soft to collinear radiator, combined with global recoil scheme [Herren,Krauss,Reichelt,Schönherr,SH] arXiv:2208.06057



All-order aspects: Spin correlations

[Hamilton,Karlberg,Salam,Scyboz,Verheyen] arXiv:2111.01161

- Azimuthal dependence of radiation pattern due to spinning gluons should be implemented
- Linear time algorithm known & used in Herwig [Collins] NPB304(1988)794, [Knowles] NPB310(1988)571
- $\begin{array}{c} p_2 \\ p_2 \\ p_3 \\ p_4 \\ p_4 \\ p_5 \\ p_6 \\$
- New: Matching to dipole radiation pattern



Higher-order corrections: Collinear evolution at NLO

Higher-order DGLAP evolution kernels obtained from factorization



- ▶ $P_{ji}^{(n)}$ not probabilities, but sum rules hold (\leftrightarrow unitarity constraint) In particular: Momentum sum rule identical between LO & NLO
- Can perform the NLO computation of P⁽¹⁾_{ji} fully differentially using modified dipole subtraction [Catani,Seymour] hep-ph/9605323

Higher-order corrections: Collinear evolution at NLO

[Prestel,SH] arXiv:1705.00742

Example: Flavor-changing NLO splitting functions

$$P_{qq'}^{(1)}(z) = C_{qq'}(z) + I_{qq'}(z) + \int d\Phi_{+1} \Big[R_{qq'}(z, \Phi_{+1}) - S_{qq'}(z, \Phi_{+1}) \Big]$$

- ▶ Real correction $R_{qq'}$ and subtraction terms $S_{qq'}$ Difference finite in 4 dimensions \rightarrow amenable to MC simulation
- Integrated subtraction term and factorization counterterm given by

$$\begin{split} \mathbf{I}_{qq'}(z) &= \int \mathrm{d}\Phi_{+1} S_{qq'}(z, \Phi_{+1}) \\ \mathbf{C}_{qq'}(z) &= \int_{z} \frac{\mathrm{d}x}{x} \left(P_{qg}^{(0)}(x) + \varepsilon \mathcal{J}_{qg}^{(1)}(x) \right) \frac{1}{\varepsilon} P_{gq}^{(0)}(z/x) \\ \mathcal{J}_{qg}^{(1)}(z) &= 2 C_F \left(\frac{1 + (1-x)^2}{x} \ln(x(1-x)) + x \right) \end{split}$$

- Analytical computation of I not needed, as I + P/ε finite generate as endpoint at s_{ai} = 0, starting from integrand at O(ε)
- ► All components of P⁽¹⁾_{qq'} eventually finite in 4 dimensions Can be simulated fully differentially in parton shower

Higher-order corrections: Collinear evolution at NLO

[Gellersen, Prestel, SH] arXiv:2110.05964

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• Effects on jet rates in $e^+e^- \rightarrow$ hadrons at LEP

Higher-order corrections: Multi-Emission Kernels

[Löschner,Plätzer] arXiv:2112.14454

- Program to define higher-order splitting functions for parton showers
- ► Sudakov-like momentum decomposition → power counting
- Reproduces known soft & double-/triple-collinear splitting functions



Looking beyond logarithmic accuracy

- Provably NLL accurate parton showers solve long-standing problem NNLL seems on the horizon, but is it the obvious target?
- ▶ Revisit well-established result: Thrust or $FC_{1-\beta}$ in $e^+e^- \rightarrow$ hadrons
- Define a shower evolution variable $\xi = k_T^2/(1-z)$
- ▶ Parton-shower one-emission probability for $\xi > Q^2 \tau$

$$R_{\rm PS}(\tau) = 2 \int_{Q^2\tau}^{Q^2} \frac{d\xi}{\xi} \int_{z_{\rm min}}^{z_{\rm max}} dz \; \frac{\alpha_s(k_T^2)}{2\pi} C_F\left[\frac{2}{1-z} - (1+z)\right] \Theta(\eta)$$

Approximate to NLL accuracy

$$R_{\rm NLL}(\tau) = 2 \int_{Q^2 \tau}^{Q^2} \frac{d\xi}{\xi} \left[\int_0^1 dz \; \frac{\alpha_s(k_T^2)}{2\pi} \frac{2 C_F}{1-z} \Theta(\eta) - \frac{\alpha_s(\xi)}{\pi} C_F B_q \right]$$



Origin of the $lpha_s ightarrow 0$ / $s ightarrow \infty$ limit

Cumulative cross section $\Sigma(\tau) = e^{-R(\tau)} \mathcal{F}(\tau)$ obtained from all-orders resummed result by Taylor expansion of virtual corrections in cutoff ε

$$\mathcal{F}(\tau) = \int \mathrm{d}^3 k_1 |M(k_1)|^2 \, e^{-R' \ln \frac{\tau}{\varepsilon v_1}} \sum_{m=0}^{\infty} \frac{1}{m!} \left(\prod_{i=2}^{m+1} \int_{\varepsilon v_1}^{v_1} \mathrm{d}^3 k_i |M(k_i)|^2 \right) \\ \times \Theta\left(\tau - V(\{p\}, k_1, \dots, k_n)\right)$$

• $\mathcal{F}(\tau)$ is pure NLL & accounts for (correlated) multiple-emission effects

- In order to make $\mathcal{F}(\tau)$ calculable, make the following assumptions
 - Observable is recursively infrared and collinear safe
 - Hold $\alpha_s(Q^2) \ln \tau$ fixed, while taking limit $\tau \to 0$
 - \rightarrow Can factorize integrals and neglect kinematic edge effects
- ► Breaks momentum conservation and unitarity for finite → Clean NLL result, but unknown kinematic corrections
- How large are effects in regions of a typical measurement?



Numerical effects away from the limit

[Reichelt,Siegert,SH] arXiv:1711.03497



Single emission effects

- 4-mom conservation
- PS sectorization
- ► k_T scale in coll. terms



- z bounds by unitarity
- k_T scale by unitarity



- 2-loop CMW in all soft terms
- 2-loop CMW overall

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- Simplest process and simplest type of observable, still sizable differences away from $\tau \to 0$ limit
- How do we quantify the precision of event generators in the intermediate region ("between" NLL and NLO) ?

Summary and Outlook

- Lots of activity in event generator development ...
 - Logarithmic precision of parton showers [PanScales, Herwig, Sherpa,...]
 - Higher-order QCD evolution kernels [Vincia,Sherpa,Herwig,...]
 - Interplay of parton showers w/ NNLL [PanScales,Sherpa,...]
 - Improved & alternative hadronization models [7 talk by T. Menzo]
- ... and matching to fixed-order calculations
 - Novel computing techniques [MadGraph5,Sherpa]
 - Resummation based NNLO matching [Geneva,MINNLOPS]
 - Fully differential (N)NNLO matching [Vincia,UN^XLOPS,TOMTE]
- Still, many improvements needed [Campbell et al.] arXiv:2203.11110
 - Systematic treatment of kinematic edge effects
 - Massive quark production & evolution
 - ▶ Other exciting areas: *v*s, HI, EIC, ...
 - ▶ ...

Exciting times ahead!



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