

Precision jet substructure studies for the Relativistic Heavy Ion Collider with the sPHENIX detector

In collaboration with Yang-Ting Chien, Daniel Reichelt and Steffen Schumann

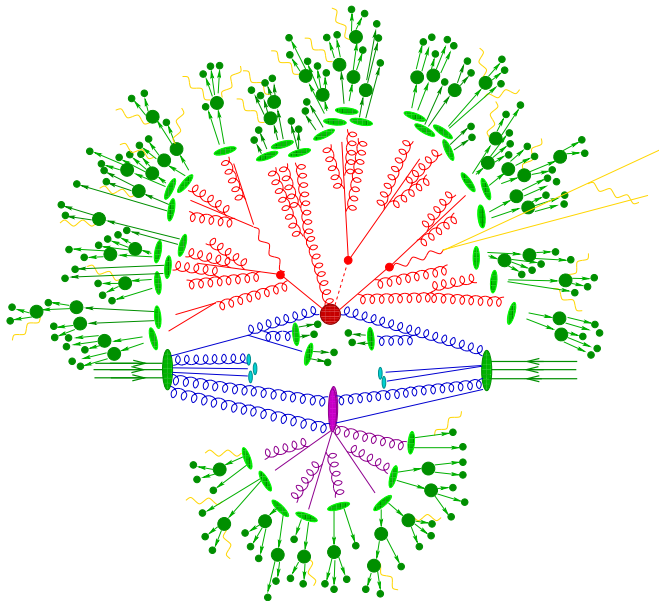
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Jefferson Lab, Newport News, VA

October 16, 2023

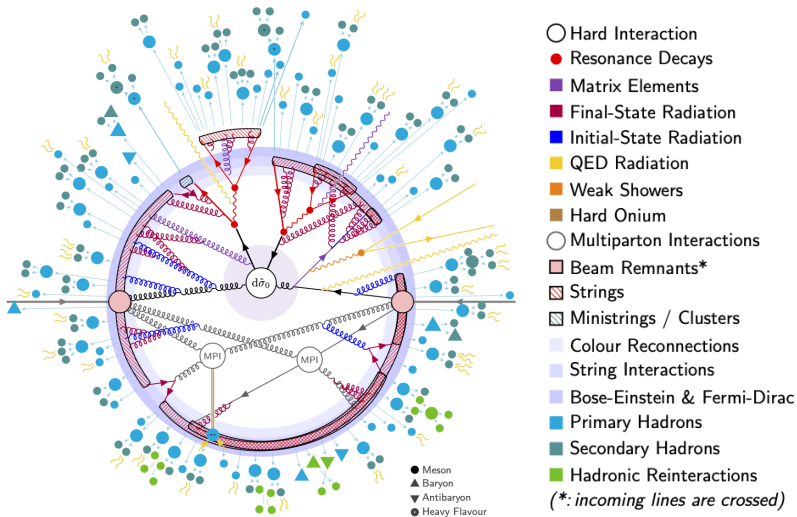


QCD is complicated!



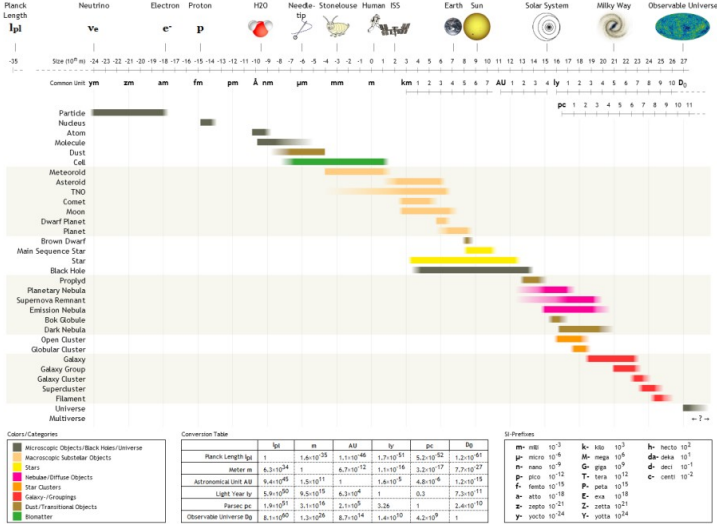
“Old event representation”, credit: [arXiv:0811.4622](https://arxiv.org/abs/0811.4622).

QCD is very complicated!



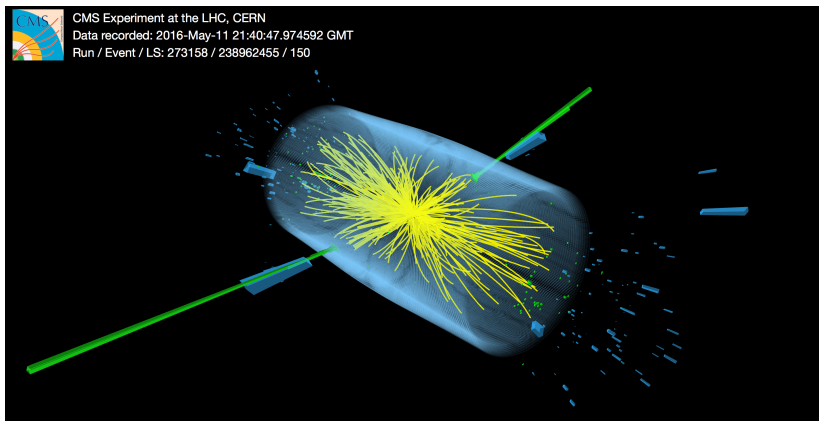
“New event representation”, credit: Peter Skunds.

Physics is all about scales!



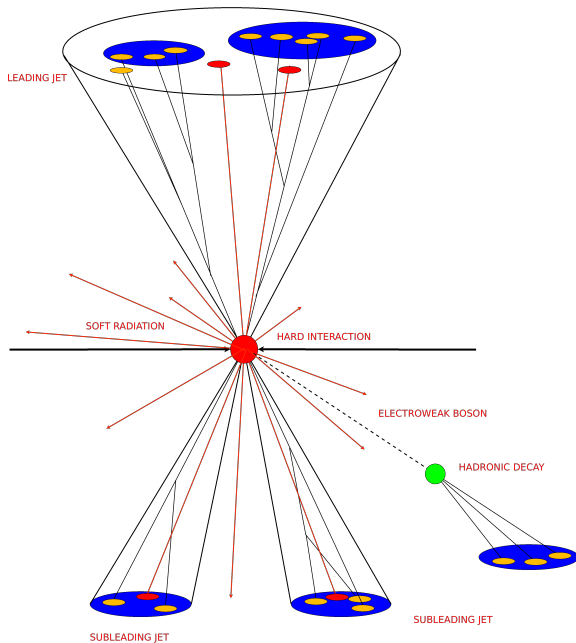
Typical scales of this Universe (credits: Wikipedia)

By studying hadrons inside jets we try to learn more about partons and their interactions

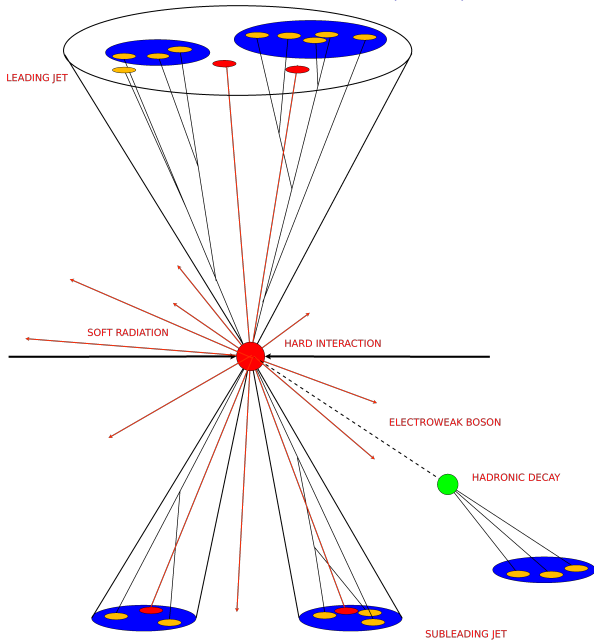


A di-jet event recorded by CMS collaboration (credits: CERN)

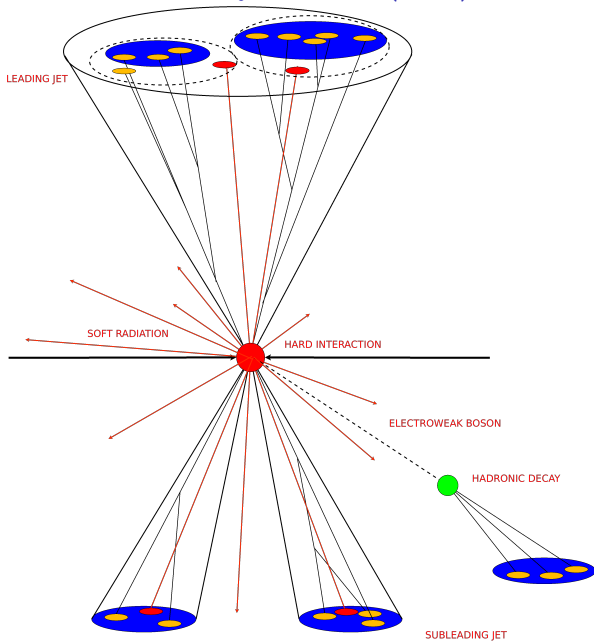
Looking inside jets



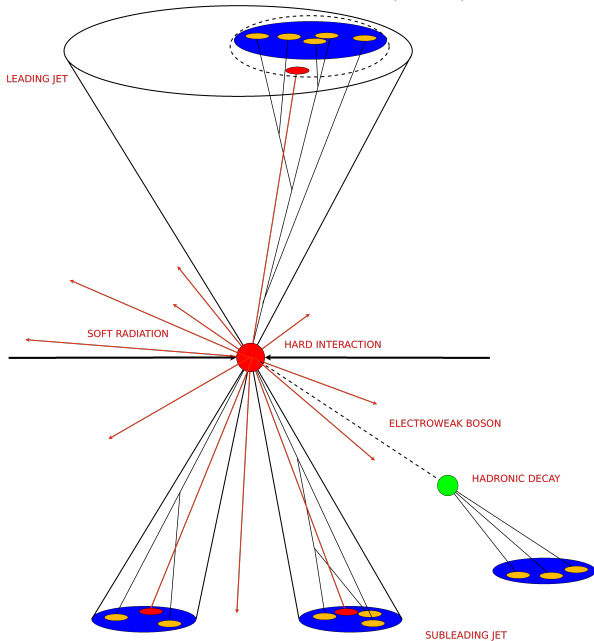
SoftDrop groomer: $\frac{\min(p_{t_i}, p_{t_j})}{p_{t_i} + p_{t_j}} > z_{\text{cut}} \left(\frac{\Delta R_{ij}}{R} \right)^\beta$



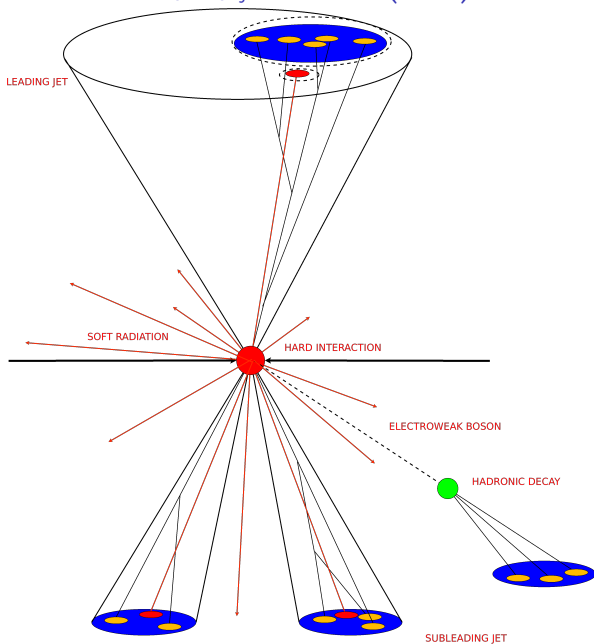
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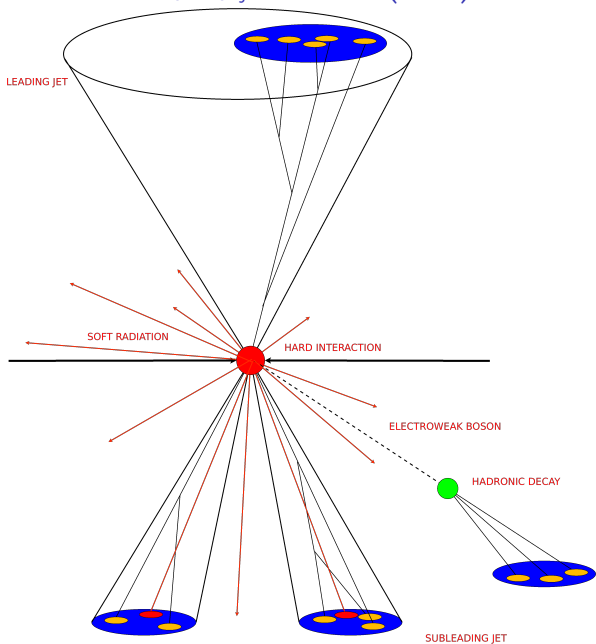
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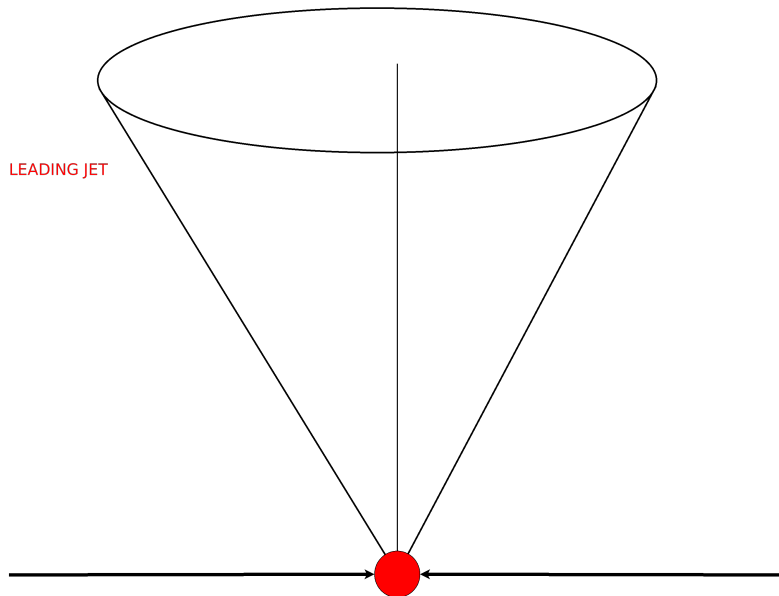
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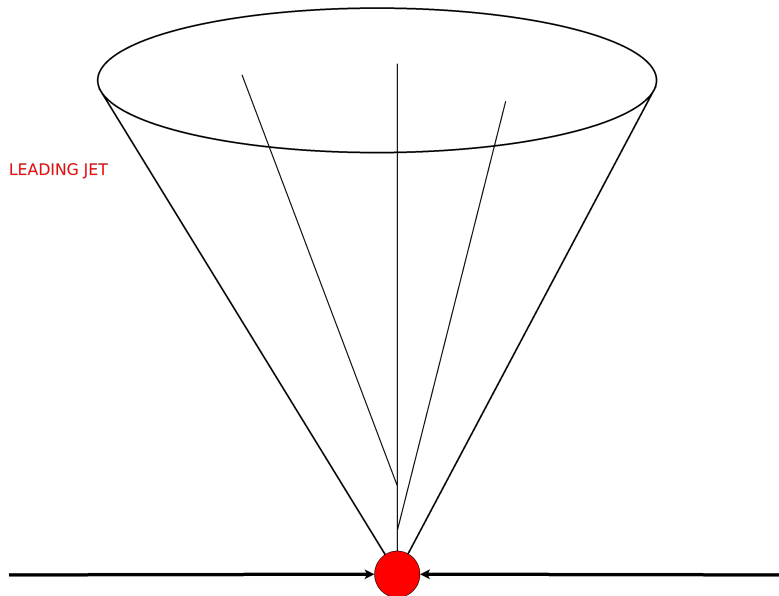
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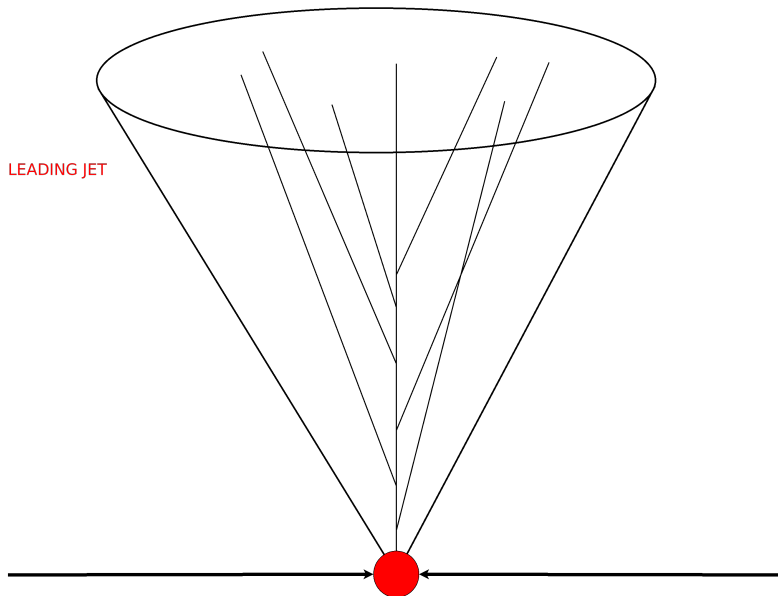
Resummation vs. Monte Carlo



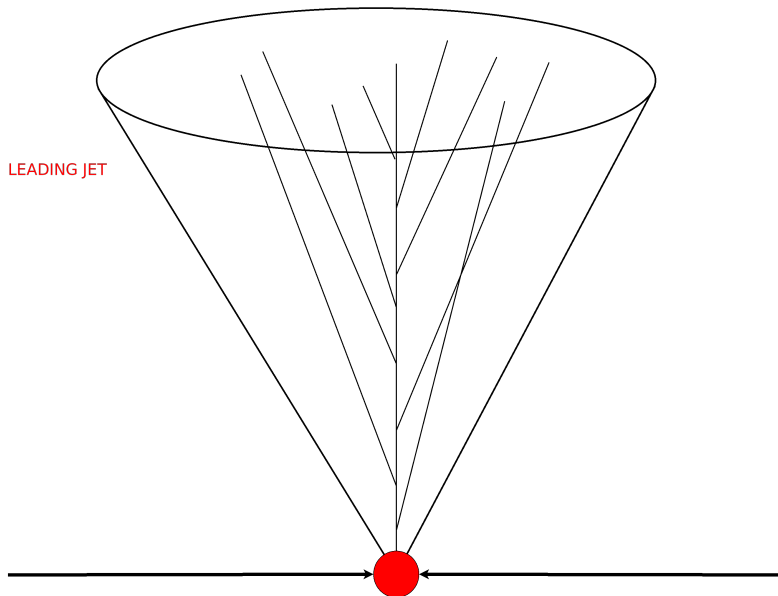
Resummation vs. Monte Carlo



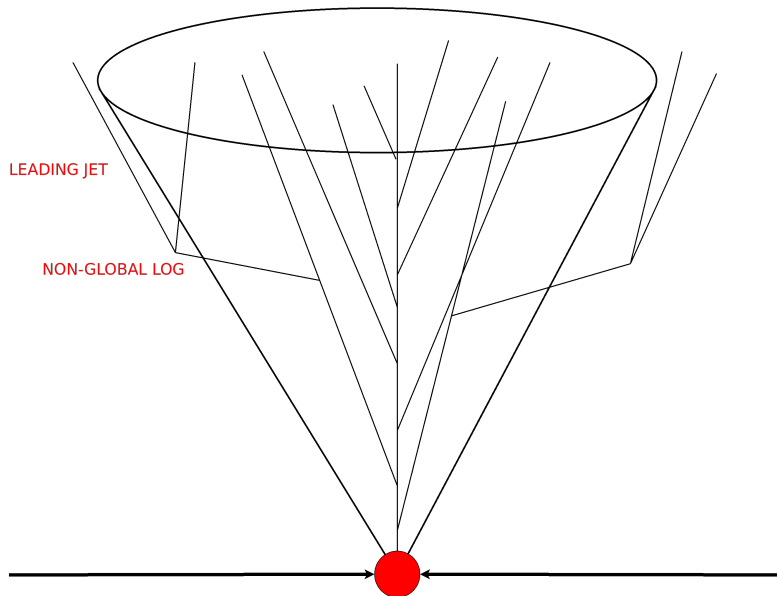
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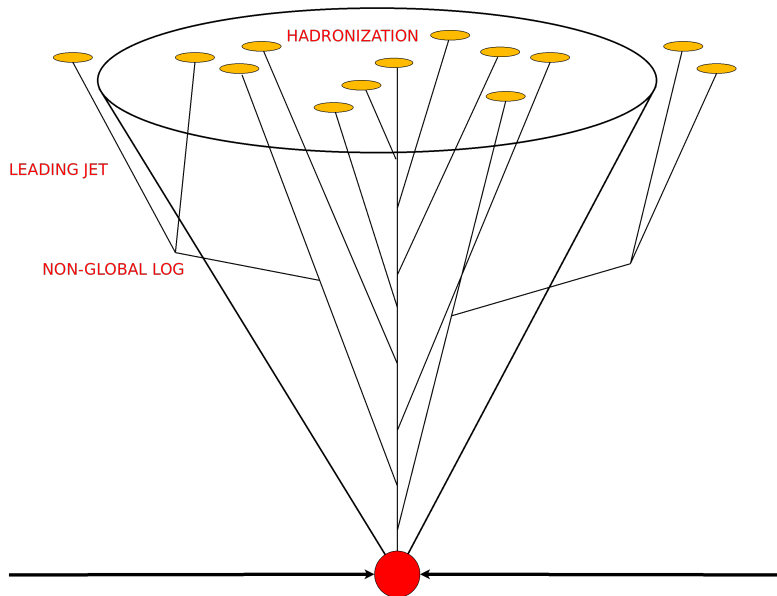
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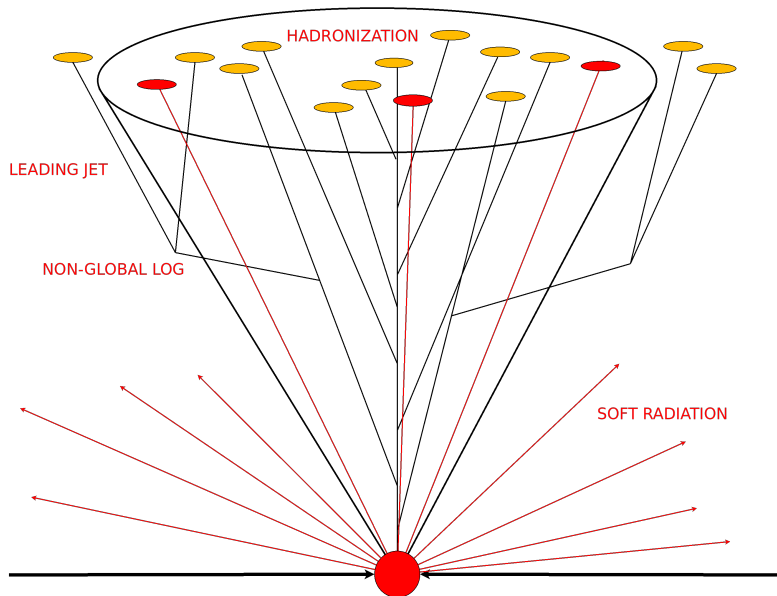
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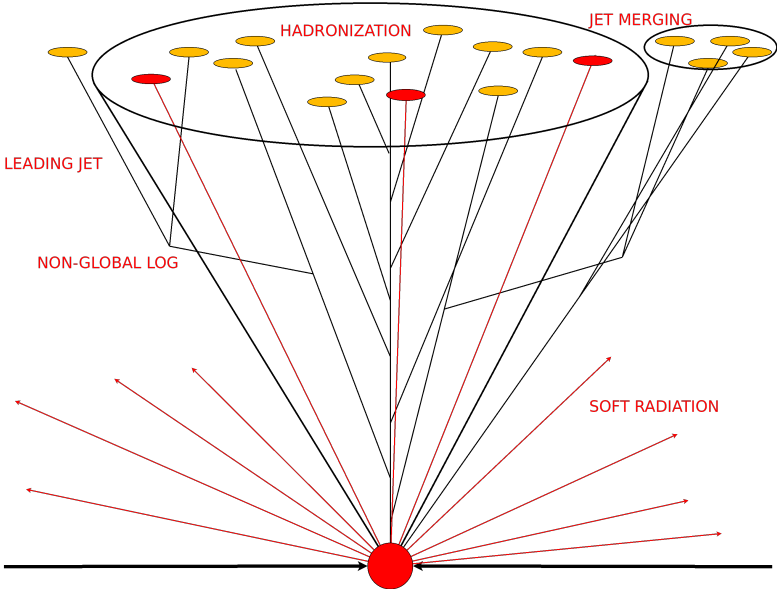
Resummation vs. Monte Carlo



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Resummation vs. Monte Carlo

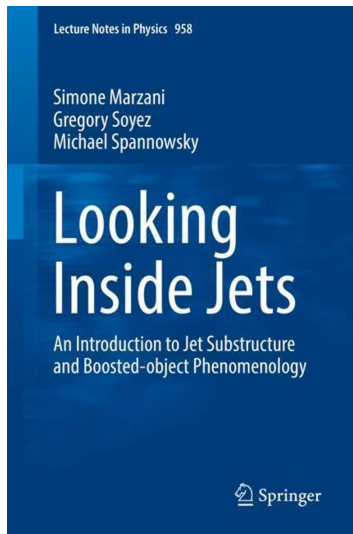


Looking inside jets



Various observables exist:

- ▶ N-subjettiness,
- ▶ **Jet angularities**,
- ▶ Energy-correlation functions,
- ▶ Lund plane projection,
- ▶ **Angular decorrelation**,
- ▶ and many others!



[More info can be found here](#)

Observable definition

The jet angularity is defined as

$$\lambda_\alpha = \sum_{i \in \text{jet}} \frac{p_{t,i}}{p_{t,\text{jet}}} \left(\frac{\Delta R_{ij}}{R} \right)^\alpha, \quad \alpha > 0$$

The angular decorrelation is defined as

$$\Delta\phi_{p_1, p_2} = \arccos \left(\frac{\vec{p}_1 \cdot \vec{p}_2}{|\vec{p}_1| |\vec{p}_2|} \right)$$

SoftDrop grooming condition:

$$\frac{\min(p_{ti}, p_{tj})}{p_{ti} + p_{tj}} > z_{\text{cut}} \left(\frac{\Delta R_{ij}}{R} \right)^\beta$$

- ▶ The LHC measurements LHA ($\lambda_{1/2}$), Jet Width (λ_1), Jet Thrust (λ_2), see, for example, [2109.03340](#)
- ▶ The theoretical predictions, see, for example [2112.09545](#), [2104.06920](#) and [2005.12279](#)
- ▶ RHIC measurements?

CAESAR formalism

The cumulative cross section for a generic observable v can be written as a sum over partonic channels δ :

$$\Sigma_{\text{res}}(v) = \sum_{\delta} \Sigma_{\text{res}}^{\delta}(v), \text{ with}$$

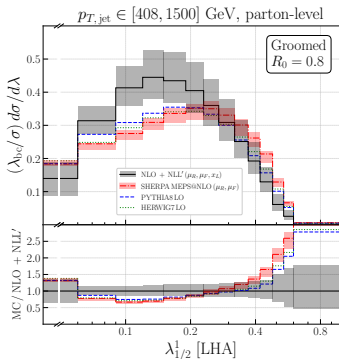
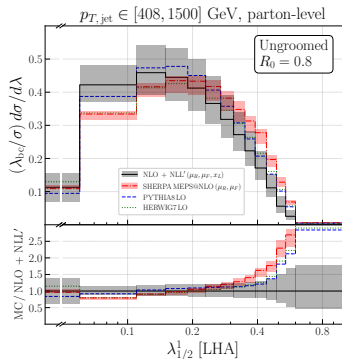
$$\Sigma_{\text{res}}^{\delta}(v) = \int d\mathcal{B}_{\delta} \frac{d\sigma_{\delta}}{d\mathcal{B}_{\delta}} \exp\left[-\sum_{l \in \delta} R_l^{\mathcal{B}_{\delta}}(L)\right] \mathcal{P}^{\mathcal{B}_{\delta}}(L) \mathcal{S}^{\mathcal{B}_{\delta}}(L) \mathcal{F}^{\mathcal{B}_{\delta}}(L) \mathcal{H}^{\delta}(\mathcal{B}_{\delta}),$$

where $L = -\ln(v)$, $\frac{d\sigma_{\delta}}{d\mathcal{B}_{\delta}}$ is the differential Born cross section, R_l is the collinear radiator for the hard legs l , \mathcal{P} is the ratio of PDFs, \mathcal{S} is the soft function, \mathcal{F} is the multiple emission function and \mathcal{H} stands for the corresponding kinematic cuts on the Born process.

CAESAR resummation plugin to Sherpa

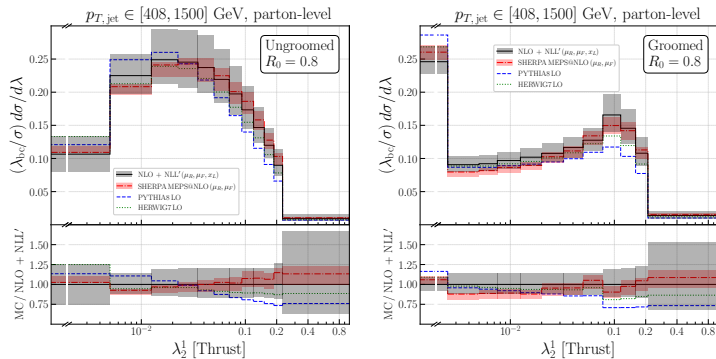
- ▶ Is using Comix matrix element generator as well as Sherpa machinery for phase-space integration and event generation.
- ▶ The NLO computations are performed using Catani-Seymour dipole subtraction.
- ▶ For the loop computations we use Recola and OpenLoops libraries.
- ▶ The resummed results are matched to the fixed order NLO computations using the multiplicative matching scheme.
- ▶ The final result is at NLO+NLL' accuracy level + corrections for the non-perturbative effects.

Monte Carlo results: LHA



Comparison of hadron-level predictions for ungroomed and groomed jet-angularities in Zj production from Pythia and Herwig (both based on the LO Zj matrix element), and MEPS@LO as well as MEPS@NLO results from Sherpa. Here we use SoftDrop with $\beta = 0$ and $z_{\text{cut}} = 0.1$.

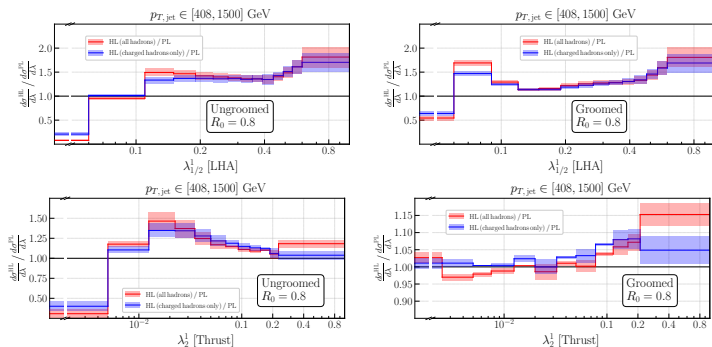
Monte Carlo results: Jet Thrust



Comparison of hadron-level predictions for ungroomed and groomed jet angularities in Zj production from Pythia and Herwig (both based on the LO Zj matrix element), and MEPS@LO as well as MEPS@NLO results from Sherpa. Here we use SoftDrop with $\beta = 0$ and $z_{\text{cut}} = 0.1$.

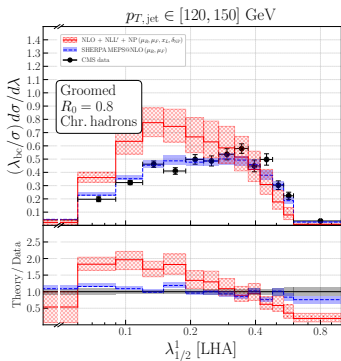
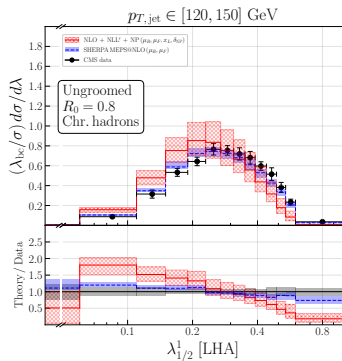
Impact of NP-corrections

One can estimate the impact of non-perturbative corrections using Monte Carlo simulations



Hadron-to-parton-level ratios with associated uncertainties extracted from MC simulations (Pythia, Herwig and Sherpa). To some extent can be seen as a jet fragmentation function.

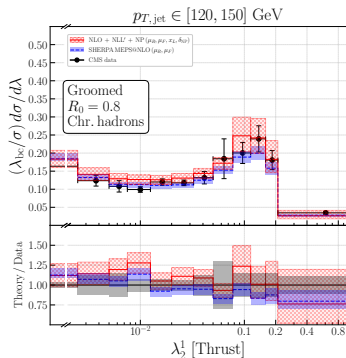
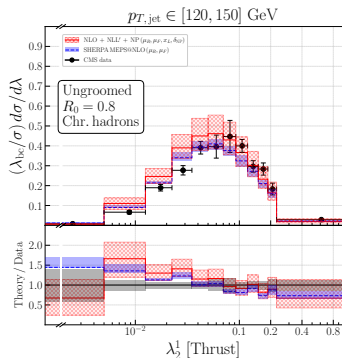
Theory vs. CMS data



Comparison against recent CMS data for the LHA angularity,
 $p_{T,\text{jet}} \in [120, 150]$ GeV.

Theory: [2112.09545](#), [2104.06920](#) (in collaboration with S. Caletti, S. Marzani, D. Reichelt, S. Schumann, G. Soyez, V. Theeuwes); CMS: [2109.03340](#)

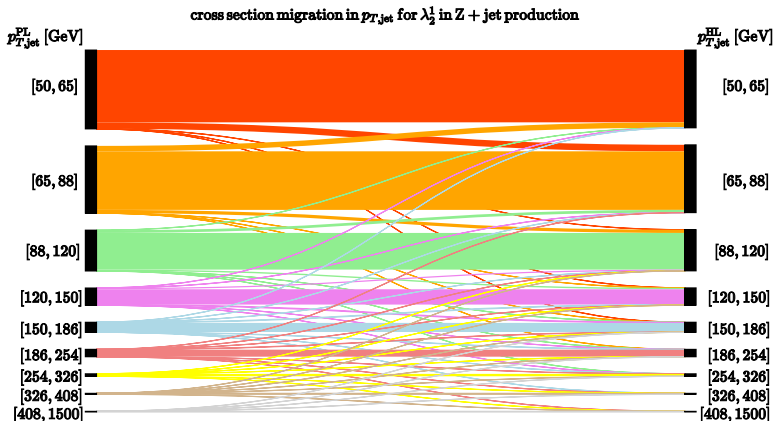
Theory vs. CMS data



Comparison against recent CMS data for the Jet Thrust angularity, $p_{T,\text{jet}} \in [120, 150] \text{ GeV}$.

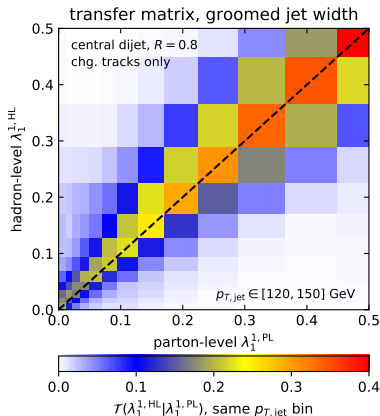
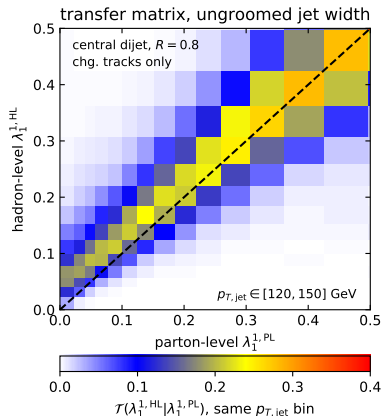
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Migration between different p_T -bins; credit S. Schumann



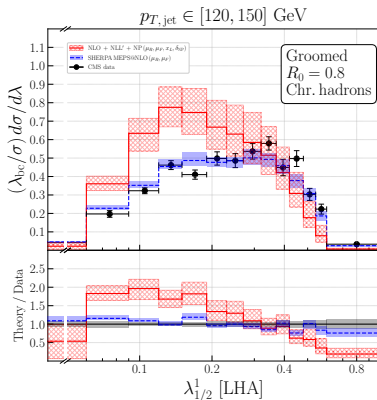
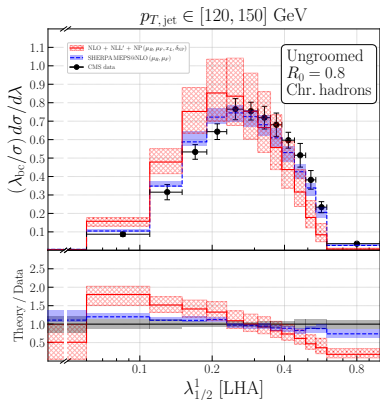
Hadronization can cause migration between different p_T -bins.

Parton to hadron level transition; credit G. Soyez



Transfer matrix $\mathcal{T}(\lambda_1^{1,HL} | \lambda_1^{1,PL})$ for the jet-width angularity for central dijet events with $R = 0.8$ and $p_{T,jet} \in [120, 150]$ GeV.

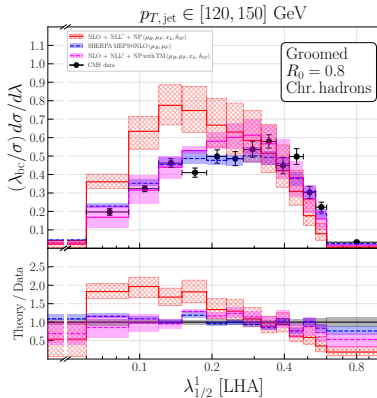
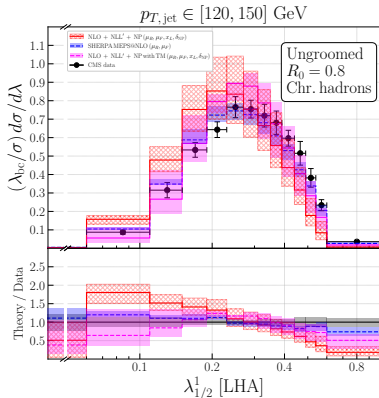
Theory (including TM) vs. CMS data



Comparison against recent CMS data for the Jet Thrust angularity, $p_{T, \text{jet}} \in [120, 150]$ GeV. Magenta band correspond to transfer matrix approach.

Theory: [2112.09545](#), [2104.06920](#) (in collaboration with S. Caletti, S. Marzani, D. Reichelt, S. Schumann, G. Soyez, V. Theeuwes); CMS: [2109.03340](#)

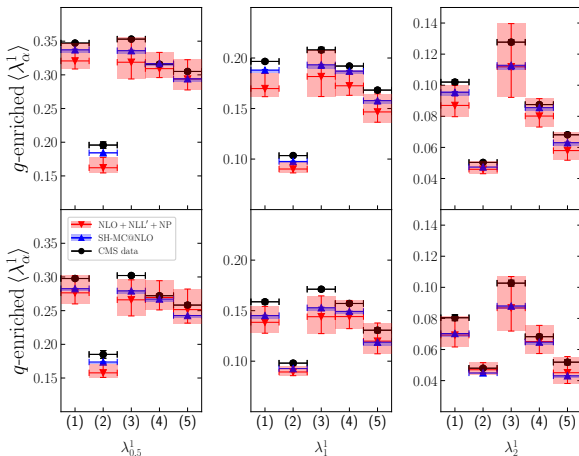
Theory (including TM) vs. CMS data



Comparison against recent CMS data for the Jet Thrust angularity, $p_{T,\text{jet}} \in [120, 150]$ GeV. Magenta band correspond to transfer matrix approach.

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Comparison against CMS data



configuration	type of jet	$p_{T,\text{jet}}$ [GeV]	g -enriched	q -enriched
(1)	ungroomed $R = 0.4$	[120,150]	dijet central	Z+jet
(2)	ungroomed $R = 0.4$	[1000,4000]	dijet central	dijet forward
(3)	ungroomed $R = 0.8$	[120,150]	dijet central	Z+jet
(4)	ungroomed $R = 0.4$ (tracks only)	[120,150]	dijet central	Z+jet
(5)	SoftDrop ($\beta = 0, z_{\text{cut}} = 0.1$) $R = 0.4$	[120,150]	dijet central	Z+jet

What about RHIC?

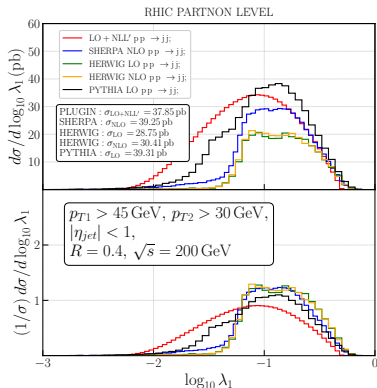
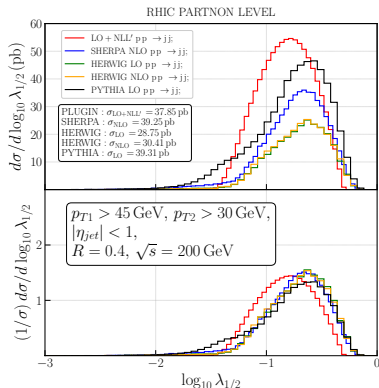
And Now for Something Completely Different

Monty Python's Flying Circus

At RHIC

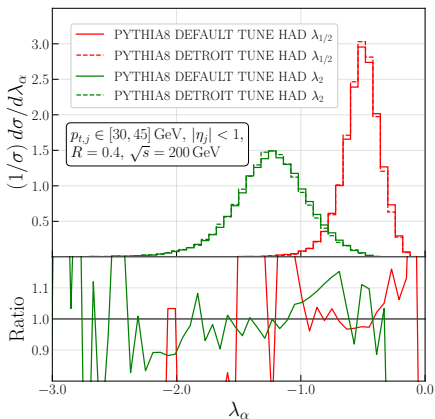
- ▶ MPIs are less relevant (\sqrt{S} is small comparing to the LHC)
- ▶ Hadronization is more important (small \sqrt{S} and small jet p_T)
- ▶ Completely different energy regime
- ▶ One can study jets in pp and AA
- ▶ Only few jet substructure studies (STAR) are available
[1705.01974](#)
- ▶ The sPHENIX data can be used to produce new tunes, to test currently available precise predictions, to get better understanding of hadronization

$$\lambda_\alpha = \sum_i z_i \left(\frac{\Delta_{i,jet}}{R} \right)^\alpha \text{ at RHIC energy, Res. vs. MC}$$



Comparison between resummed predictions matched to fixed order results (SHERPA LO + NLL' accuracy level) against MC simulations (preliminary)

$\lambda_\alpha = \sum_i z_i \left(\frac{\Delta_{i,jet}}{R} \right)^\alpha$ at RHIC energy, Detroit PYTHIA tune

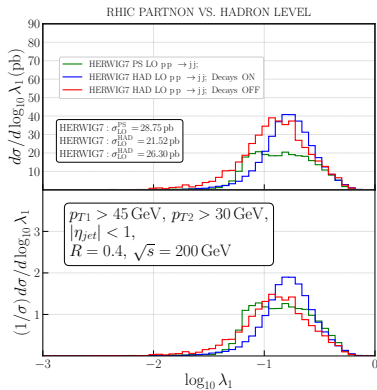
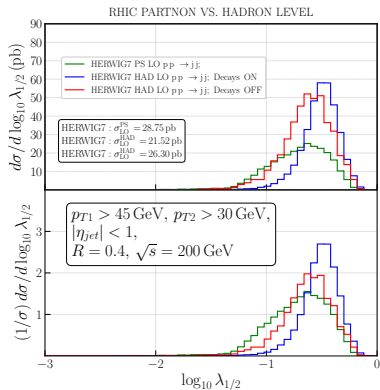


(preliminary)

Shall one make new tunes?

- ▶ There is a Detroit PYTHIA tune [2110.09447](#) for RHIC, but it mostly affect MPI
- ▶ However, MPI are almost absent at RHIC energies
- ▶ Main contribution comes from hadronization

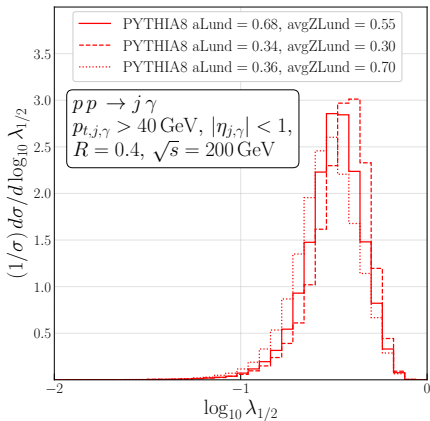
$\lambda_\alpha = \sum_i z_i \left(\frac{\Delta_{i,jet}}{R} \right)^\alpha$ at RHIC energy, hadronisation and decays



Angularities at RHIC energies are strongly affected by hadronization and decay of produced hadrons in case of jets containing a single hadron, see also Lee *et al* in [1901.09095](#). (preliminary)

Hadronization and Lund string model

New tunes?



(preliminary)

- ▶ There is a Detroit PYTHIA tune [2110.09447](#) designed to describe RHIC data, but it mostly affect MPI
- ▶ However, MPI are almost absent at RHIC energies \sqrt{S} is too small.
- ▶ Lund symmetric fragmentation function

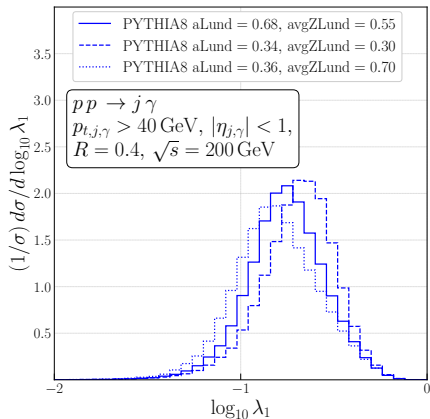
$$f(z) \sim \frac{(1-z)^a}{z} \exp(-bm^2/z)$$

- ▶ Hadron formation time

$$\langle \tau^2 \rangle = \frac{1+a}{b\kappa^2} \approx 2 \text{ fm}$$

Hadronization and Lund string model

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(preliminary)

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Hadronization and Lund string model

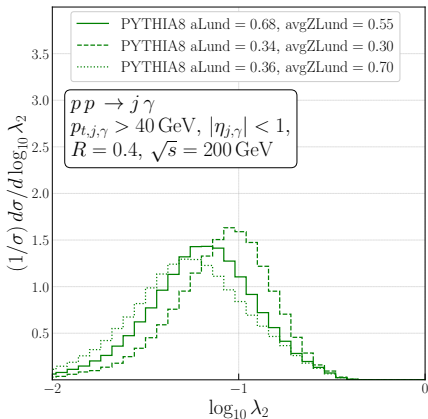
New tunes?

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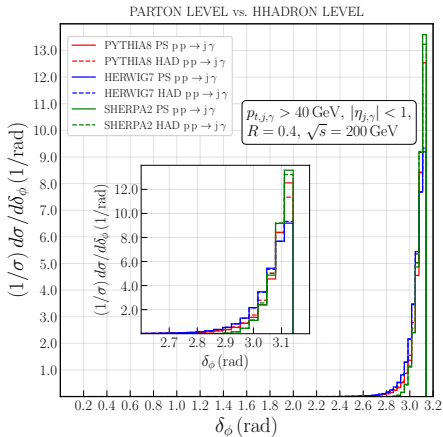
- ▶ Hadron formation time

$$\langle \tau^2 \rangle = \frac{1+a}{b\kappa^2} \approx 2 \text{ fm}$$



(preliminary)

Is $\delta\phi$ affected by NP-corrections?



(preliminary)

Angular decorrelation

- ▶ $\Delta\phi$ is an azimuthal angle between two most energetic jets (or between a leading jet and a leading photon)
- ▶ Unlike λ_α is more sensitive to radiation pattern
- ▶ Which PS-model would work better?

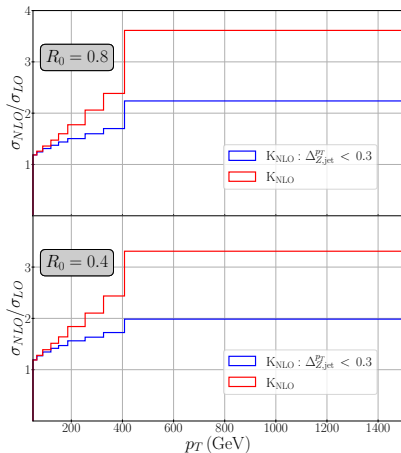
Summary and next steps:

Current results

- ▶ Resummed predictions for both groomed and ungroomed angularities λ_α ($\alpha \in [1/2, 1, 2]$) at LO + NLL' are ready, the NLO + NLL' requires some more (a way more) CPU time
- ▶ We found that angularities λ_α at RHIC energies can be used to study hadronization and potentially to produce new MC tunes
- ▶ On the other hand, angular decorrelation δ_ϕ , can be used to test various parton shower models
- ▶ δ_ϕ simulated with JEWEL shows strong dependence on the medium temperature
- ▶ Correct the resummed predictions for non-perturbative effects using corresponding parton-to-hadron transition matrices
- ▶ What about 2D observables, say primary Lund Plane?
- ▶ The sPHENIX data is needed!

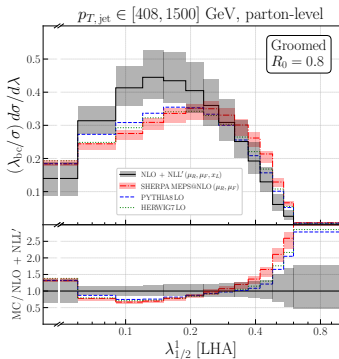
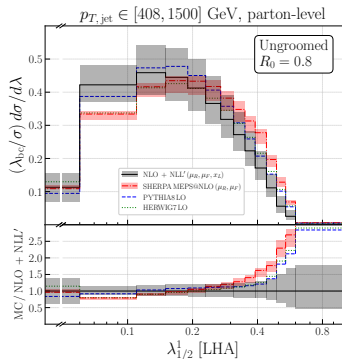
Thank you for your attention!

Monte Carlo result: K-factor



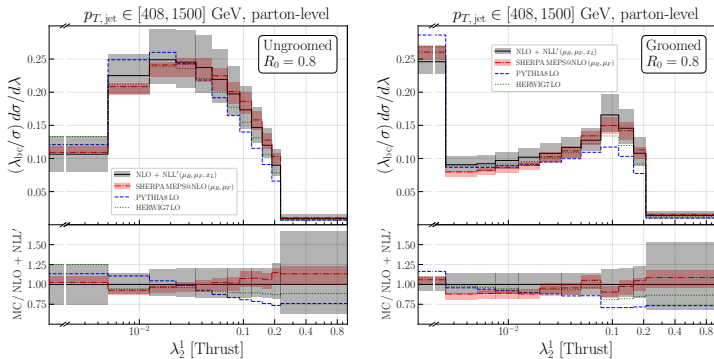
The NLO K-factor as a function of the p_{TJ} with and without $\Delta_{Z,\text{jet}}^{p_T} = |(p_{T,\text{jet}} - p_{T,\mu^+\mu^-}) / (p_{T,\text{jet}} + p_{T,\mu^+\mu^-})| < 0.3$ cut.

Monte Carlo results: LHA



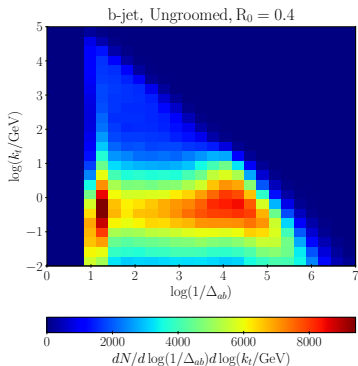
Comparison of hadron-level predictions for ungroomed and groomed jet-angularities in Zj production from Pythia and Herwig (both based on the LO Zj matrix element), and MEPS@LO as well as MEPS@NLO results from Sherpa. Here we use SoftDrop with $\beta = 0$ and $z_{\text{cut}} = 0.1$.

Monte Carlo results: Jet Thrust



Comparison of hadron-level predictions for ungroomed and groomed jet angularities in Zj production from Pythia and Herwig (both based on the LO Zj matrix element), and MEPS@LO as well as MEPS@NLO results from Sherpa. Here we use SoftDrop with $\beta = 0$ and $z_{\text{cut}} = 0.1$.

Lund plane projection



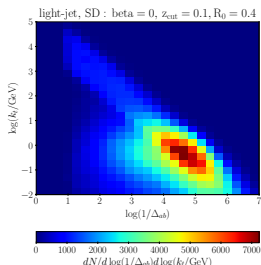
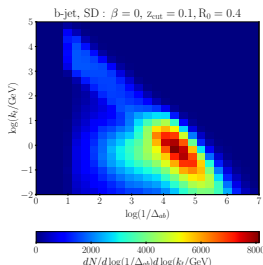
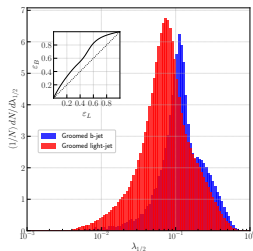
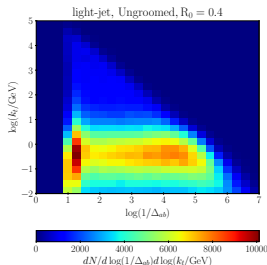
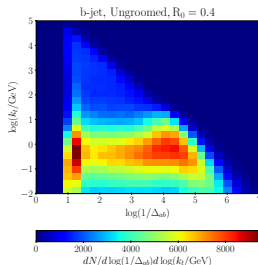
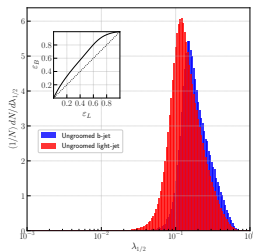
To build a Lund plane:

- ▶ Recluster your jet using CA algorithm
- ▶ Then compute:

$$\Delta_{ab} \equiv \sqrt{(y_a - y_b)^2 + (\phi_a - \phi_b)^2},$$
$$k_t \equiv p_{Tb} \Delta_{ab}.$$

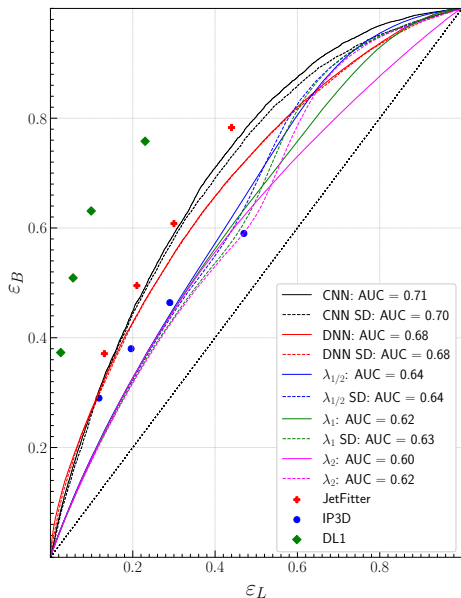
- ▶ Discard softest branch and repeat.

Lund plane projection



Observables we consider as an input for our DNN / CNN. Note that jet flavour is defined in an experimental way here.

Performance of our CNN / DNN



The ROC curves obtained for one-dimensional angularity distributions, multivariable DNN classification and Lund plane CNN classification. The single points correspond to ATLAS SV1, IP3D and DL1 b -tagging performance from [CERN-EP-2019-132](#).