

Jet Substructure: Theory

Yang-Ting Chien

LHC Theory Initiative Fellow, MIT Center for Theoretical Physics

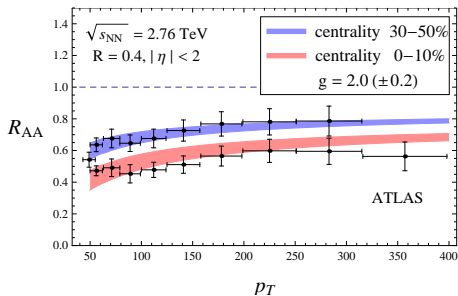
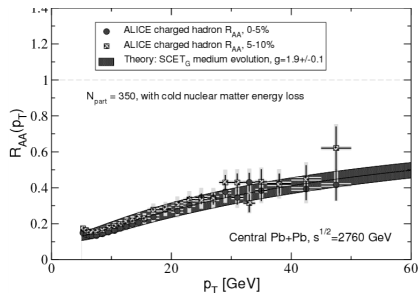
January 6, 2018
JETSCAPE workshop, LBL

Outline

- ▶ From jet quenching to jet modification
 - ▶ precision jet substructure study
 - ▶ multi-scale effective field theory
 - ▶ hadron and heavy flavor not covered in this talk
- ▶ Engineering jet substructure
 - ▶ jet grooming as artificial jet quenching
 - ▶ quark and gluon jets as independent probes
 - ▶ jet deconstruction and multivariate analysis
- ▶ Improving Monte Carlo
 - ▶ stress-testing jet quenching models with designed jet observables
 - ▶ sensitivity studies and theory boundaries
- ▶ Conclusion and outlook

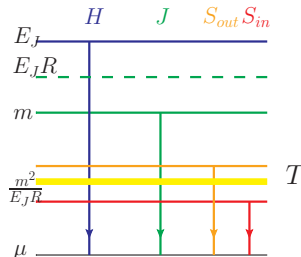
Jet quenching: hadron and jet cross section suppression

- ▶ Decade-long jet energy loss paradigm
- ▶ Going beyond moving the R_{AA} curves up and down: precision jet R_{AA} and the jet reconstruction dependence

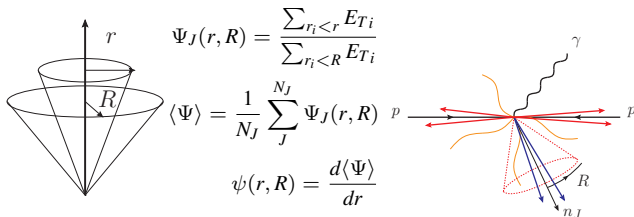


QCD radiation and jet observables

- ▶ Jets are manifestation of the infrared structure of QCD at high energy: enhancement of soft/collinear radiation
- ▶ They are multi-scaled objects with rich information about the physics across the **entire** energy spectrum
 - ▶ E_J is the **hard** scale which is the energy of the jet
 - ▶ $E_J\lambda$ is the **jet** scale and λ is the angular spread of particles ($\lambda \approx p_\perp/p_\parallel \ll 1$)
 - ▶ Relevant **soft** modes depend on the observables, e.g. for jet mass, a lower soft, seesaw scale emerges ($E_s \approx m^2/E_JR$)
 - ▶ **Medium** modes interact with and respond to jets
 - ▶ Don't forget about Λ_{QCD} at the bottom!



Sensitivity of jet observables to QCD radiation



$$\Psi_J(r, R) = \frac{\sum_{r_i < r} E_{Ti}}{\sum_{r_i < R} E_{Ti}}$$

$$\langle \Psi \rangle = \frac{1}{N_J} \sum_J \Psi_J(r, R)$$

$$\psi(r, R) = \frac{d\langle \Psi \rangle}{dr}$$

$$m^2 = \left(\sum_{i \in J} p_i \right)^2$$

$$= (p_c + p_s)^2$$

$$\approx p_c^2 + 2p_c \cdot p_s$$

$$\approx p_c^2 + 2E_J n_J \cdot p_s$$

- ▶ Jet shape has dominant contributions from energetic collinear radiation

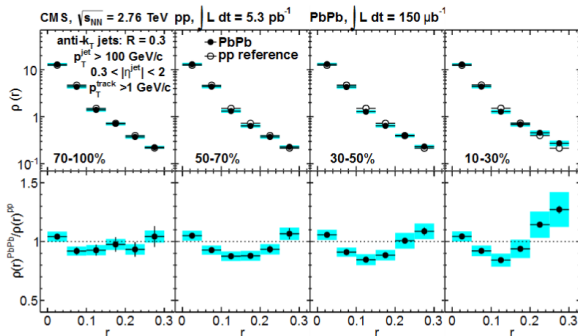
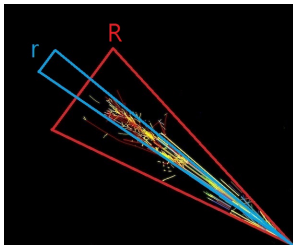
$$\Psi(r) = \frac{E_c^{<r} + E_s^{<r}}{E_c^{<R} + E_s^{<R}} = \frac{E_c^{<r}}{E_c^{<R}} + \mathcal{O}\left(\frac{E_s}{E_c}\right)$$

- ▶ Jet mass is sensitive to soft radiation

$$m^2 \approx p_c^2 + 2E_J n_J \cdot p_s, \quad \Delta m \approx E_s \frac{E_J}{m}$$

- ▶ Jet observables have different sensitivities to physics at different energy scales simply because of **kinematics**. In principle, through a series of jet measurements we will be able to map out the whole jet formation history

Jet spectroscopy of the QGP: the devil is in the detail



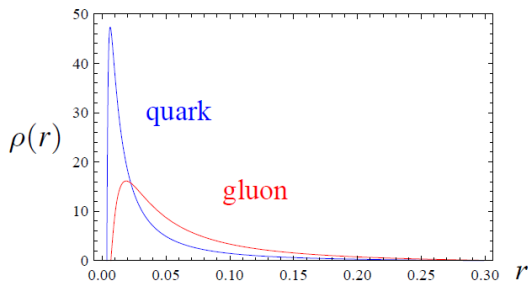
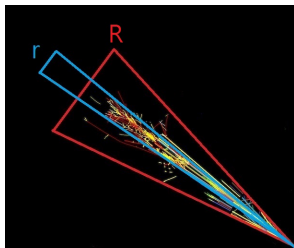
$$\Psi_J(r) = \frac{\sum_{r_i < r} E_{Ti}}{\sum_{r_i < R} E_{Ti}}$$

$$\langle \Psi \rangle = \frac{1}{N_J} \sum_J \Psi_J(r, R)$$

$$\rho(r) = \frac{d\langle \Psi \rangle}{dr}$$

- ▶ Jets have become essential tools to probe the medium dynamics
- ▶ We evaluate the observable modification by the ratio $\frac{\mathcal{O}^{AA}}{\mathcal{O}^{PP}}$
- ▶ With detailed understanding of jets and their structures we can relate their modifications to the medium properties: **the need of precise jet substructure studies**

Jet substructure calculation and resummation (see Ian's nice talk)



- ▶ Jet shapes probe the averaged energy distribution inside a jet
- ▶ The infrared structure of QCD induces Sudakov logarithms
- ▶ Fixed order calculation breaks down at small r
- ▶ Large logarithms of the form $\alpha_s^m \log^m r/R$ ($m \leq 2n$), $n = 1, \dots, \infty$ need to be resummed
- ▶ Sensitive to the partonic origin of jets and the quark/gluon jet fraction

Resummation and effective field theory

THE BASIC IDEA

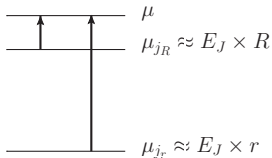
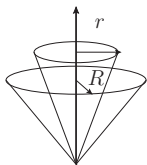
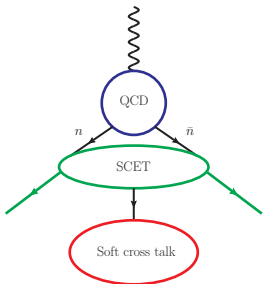
- ▶ Logarithms of *scale ratios* appear in perturbative calculations
 - ▶ Logarithms become large when scales become hierarchical

$$\log \frac{r}{R} = \log \frac{\text{scale 1}}{\text{scale 2}}$$

- ▶ In effective field theories, logarithms are resummed using renormalization group evolution between characteristic scales
 - ▶ To resum *all* the logarithms we need to identify *all* the relevant scales in EFT

Soft-Collinear Effective Theory (SCET)

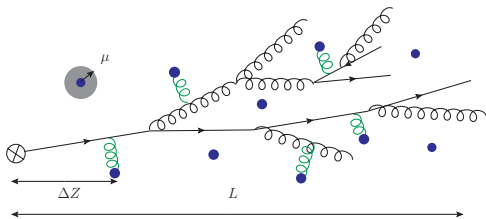
- ▶ Effective field theory techniques are most useful when there is hierarchy between characteristic energy scales
- ▶ SCET factorizes physical degrees of freedom in QCD by a systematic expansion in power counting
 - ▶ Match SCET with QCD at the hard scale by integrating out the **hard** modes
 - ▶ Integrating out the off-shell modes gives **collinear Wilson lines** which describe the collinear radiation
 - ▶ The soft sector is described by **soft Wilson lines** along the jet directions



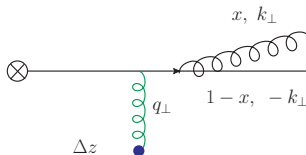
Renormalization group evolution
between μ_{j_r} and μ_{j_R} resums
 $\log \mu_{j_r} / \mu_{j_R} = \log r / R$
(Chien et al 1405.4293)

Multiple scattering in a medium and QCD bremsstrahlung

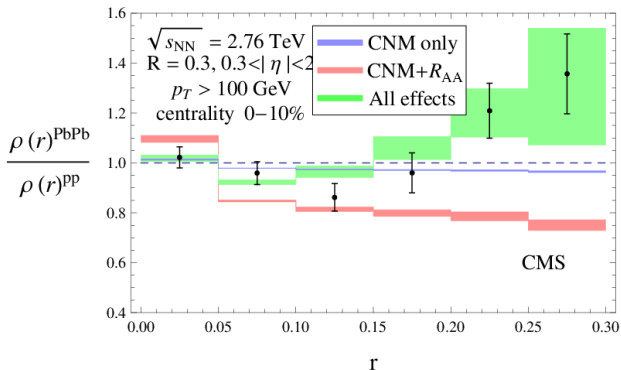
- ▶ Coherent multiple scattering and induced bremsstrahlung are the qualitatively new ingredients in the medium parton shower
- ▶ Interplay between multiple characteristic scales:
 - ▶ Debye screening scale μ
 - ▶ Parton mean free path λ
 - ▶ Radiation formation time τ



- ▶ Jet-medium interaction using SCET with background Glauber gluon fields SCET_G (Glauber-collinear: Majumder et al, Vitev et al. Glauber-soft: work in progress)
- ▶ Leading-order medium induced splitting functions $\mathcal{P}_{i \rightarrow j l}^{med}(x, k_{\perp})$ were calculated using SCET_G (Vitev et al)



First quantitative understanding of jet shape modification



- ▶ Cold nuclear matter effect is negligible
- ▶ Jet quenching increases the quark jet fraction
- ▶ Jet-by-jet the shape is broadened
- ▶ Chien et al 1509.07257 and CMS data 1310.0878

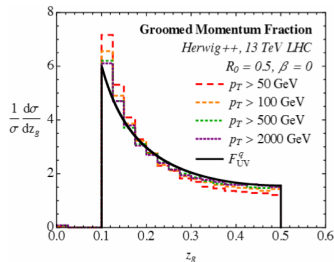
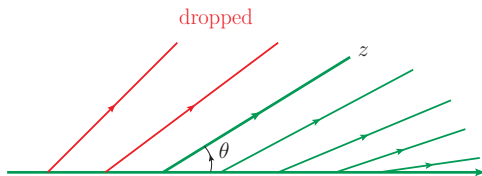
How do we isolate physics and distinguish jet quenching models?

- ▶ Whether the model relies on the low scale physics corresponds to two rough pictures of jet quenching
 - ▶ Yes. Parton showers are not affected much until the later stages. The medium depletes the partons out of the jet
 - ▶ No. The medium effects open up more channels in the jet formation process, all the way from the hard process through hadronization
- ▶ Can we test the two pictures and the role of medium response?
 - ▶ We are able to dissect radiations and pick out the components of interest
 - ▶ The idea: come up with an observable as insensitive to low scale physics as possible
 - ▶ The tool: jet grooming

Jet grooming is actually an artificial jet quenching

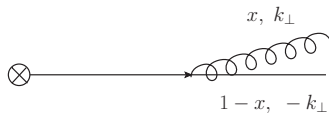
- ▶ It is a controlled way to remove soft radiation
 - ▶ A way to design sensitivity to soft physics
 - ▶ The original motivation is to mitigate radiation contaminations
- ▶ How does a jet quenching model confront with jet grooming?
 - ▶ Do they add up or interfere?
 - ▶ How are groomed jets quenched?
 - ▶ How are quenched jets groomed?

Subjet distribution

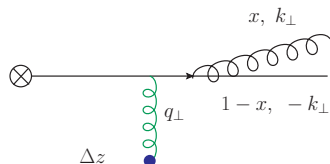


- ▶ Soft Drop: a tree-based procedure to drop soft radiation (Larkoski et al 1402.2657)
 - ▶ Recluster a jet using C/A algorithm: capturing collinear/soft splitting
 - ▶ For each branching, consider the p_T of each branch and the angle θ
 - ▶ Drop the soft branch if $z < z_{cut} \theta^\beta$, where $z = \frac{\min(p_{T,1}, p_{T,2})}{p_{T,1} + p_{T,2}}$
 - ▶ CMS used $\beta = 0, z_{cut} = 0.1, R = 0.4, \Delta R_{12} > \Delta = 0.1$ and measured z_g
 - ▶ STAR does without the ΔR_{12} cut
- ▶ z_g : the momentum fraction of the soft branch. r_g : the angle between the branches

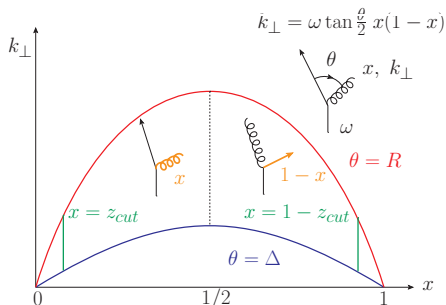
Splitting and bremsstrahlung



$$P(x, k_{\perp}) \propto \frac{1}{x k_{\perp}}$$



- ▶ In vacuum, the soft branch kinematics is closely related to the Altarelli-Parisi splitting function
- ▶ In the medium, the bremsstrahlung component modifies the soft branch kinematics

Analysis of z_g (Chien and Vitev, PRL)

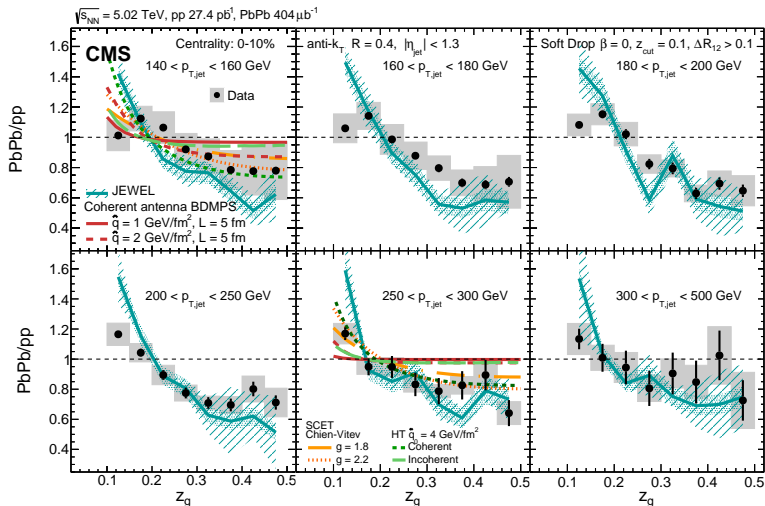
- ▶ The partonic phase space is constrained by R (jet algorithm), Δ (jet selection) and z_{cut} (jet grooming)
- ▶ At leading order, the $1 \rightarrow 2$ branching probability directly affects the subjet distribution

$$\mathcal{P}_{i \rightarrow jl}(x, k_\perp) = \mathcal{P}_{i \rightarrow jl}^{vac}(x, k_\perp) + \mathcal{P}_{i \rightarrow jl}^{med}(x, k_\perp)$$

- ▶ The distributions of z_g and r_g are calculated ($\bar{\mathcal{P}}(x) = \mathcal{P}(x) + \mathcal{P}(1-x)$)

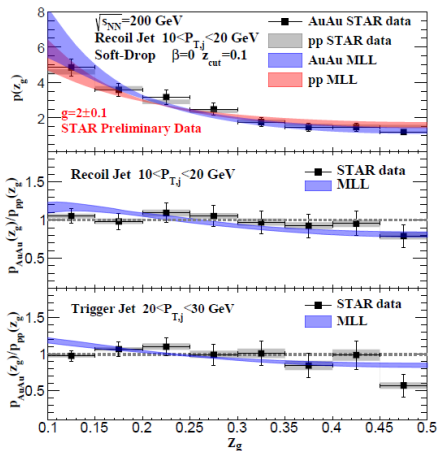
$$p_i(z_g) = \frac{\int_{k_\Delta}^{k_R} dk_\perp \bar{\mathcal{P}}_i(z_g, k_\perp)}{\int_{z_{cut}}^{1/2} dx \int_{k_\Delta}^{k_R} dk_\perp \bar{\mathcal{P}}_i(x, k_\perp)}, \quad p_i(r_g) = \frac{\int_{z_{cut}}^{1/2} dx p_{T,x}(1-x) \bar{\mathcal{P}}_i(x, k_\perp(r_g, x))}{\int_{z_{cut}}^{1/2} dx \int_{k_\Delta}^{k_R} dk_\perp \bar{\mathcal{P}}_i(x, k_\perp)}$$

Modification of the hardest branching



- ▶ Parton shower can be modified throughout the whole jet formation

Consistent with STAR preliminary data (Vitev 1801.00008)



Quark jets and gluon jets can be independent probes

- ▶ Conventionally, one studies the modification of individual jet observables
- ▶ However, correlations among jet observables contain a huge amount of information which can be exploited
- ▶ Can we study the collective modifications of *all* the features of jets?

Classification of quark and gluon jets (Chien and Elayavalli, to appear soon)

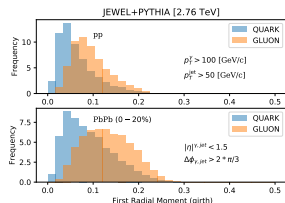
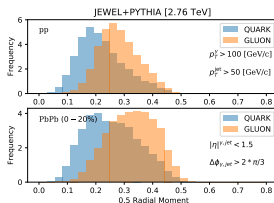
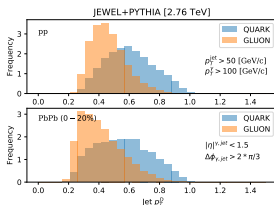
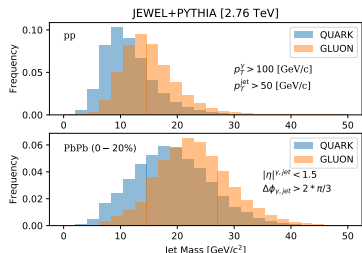
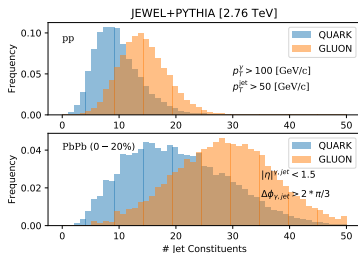
- ▶ We are able to select jets with different quark and gluon jet fractions
- ▶ One needs **all** jet features to optimize the classification of quark and gluon jets
- ▶ The idea: study how q/g discrimination changes from pp to AA
- ▶ We use the JEWEL+PYTHIA simulation (Zapp et al) as an example
- ▶ It can be applied to **all other Monte Carlo simulations (including JETSCAPE) and data**

Study the modification of the comparisons between quark and gluon jets

Multivariate analysis of a list of useful variables

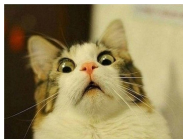
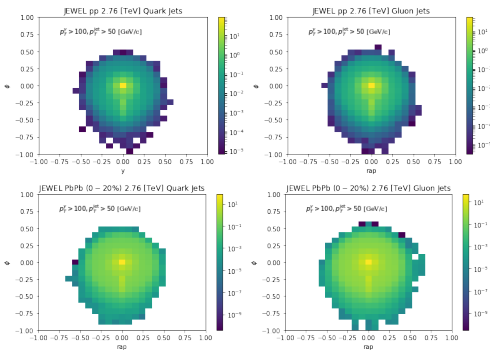
- Empirically, the following five variables together provide good discrimination power

- subjet multiplicity, jet mass, $p_T^D = \sqrt{\sum_i p_T^i{}^2} / p_T^{\text{jet}}$, radial moments $\sum_i p_T^i \Delta\theta_{\text{jet},i}^\kappa / p_T^{\text{jet}}$



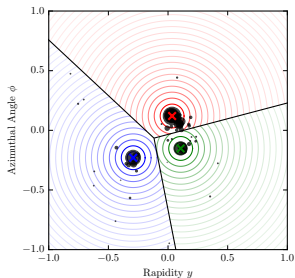
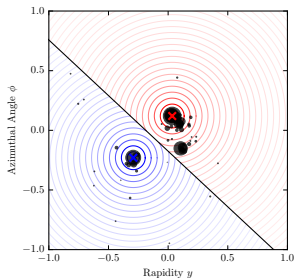
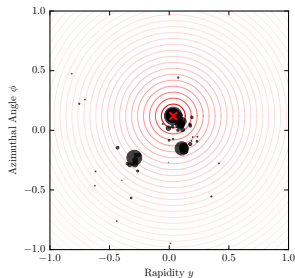
Jet image and convolutional neural network

- ▶ A fixed-dimensional representation of the energy distribution in the $y - \phi$ plane



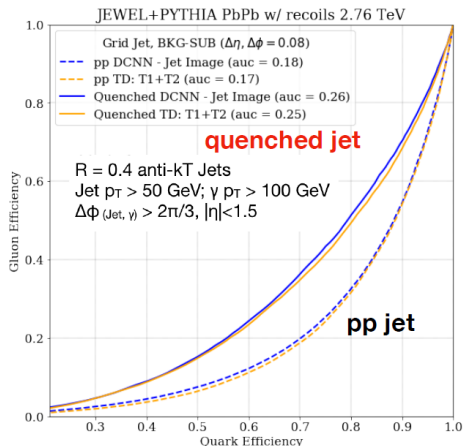
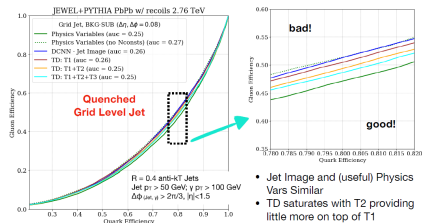
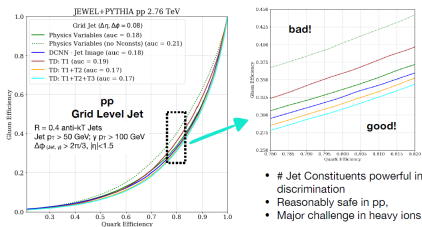
Telescoping deconstruction: subjet expansion (Chien et al 1711.11041)

- ▶ Telescoping: probing around dominate energy flows with multiple angular resolutions R
- ▶ Extract the complete information of jets from correlations among subjet 4-momenta using deep neural network
- ▶ Procedures
 - ▶ Identifying dominant energy flow directions using N soft recoil-free axes
 - ▶ Reconstruct subjets around the axes with multiple subjet radii R
 - ▶ The transverse momenta and masses of the subjets together with the positions of the axes form the telescoping deconstruction observables

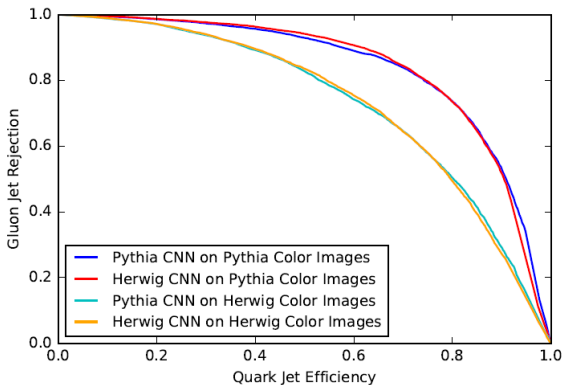


Receiver Operating Characteristic (ROC) curves (preliminary)

- ▶ In the medium, the performance drops and T2 provides little additional information
- ▶ Information contained in subleading subjects seems washed out



A story about Pythia and Herwig



- ▶ Jet substructures **are** being used to constrain and tune parton shower Monte Carlos
- ▶ Quark and gluon jets are different beats
- ▶ Are you tuning parton shower or hadronization model?
- ▶ Is the combination of perturbative and non-perturbative physics solid, or arbitrary?
- ▶ How to compare with data with all realistic complications?

How to train your model?

- ▶ "provide guidance about how best to utilize substructure measurements to test and improve Monte Carlos"
- ▶ Goal: fit all current and future jet substructure data
- ▶ Caution: since all jet quenching models manage to fit R_{AA} very well, to combine them one must limit the regions of validity of each sector to avoid double-counting: need rigorous and fundamental theory (QCD)
- ▶ One should develop perturbative tools which is systematically improvable
- ▶ Design jet substructure observable sensitive to different sectors: need a jet representation which suits heavy ion jet physics
- ▶ This is like a "new-QCD physics search"
- ▶ Once Monte Carlo fits data, one may want to do sensitivity studies and simplify the models
- ▶ Can one train Monte Carlo using machine learning techniques?

Conclusion and outlook

- ▶ Importance of flavor dependence and the role of quark/gluon jet fraction in jet substructures
- ▶ Subjet distribution provides an opportunity to test the modification of hard splitting within jets
- ▶ Although not covered in this talk, heavy flavors and hadrons continue to be important probes of the QGP
- ▶ Quark gluon discrimination provides a new method of studying jet modification
- ▶ Modifications of collective jet features provides qualitatively new insights
- ▶ The classification performance drops in heavy ion collisions simulated by JEWEL+PYTHIA
- ▶ Telescoping deconstruction is a complete and systematic framework for jet quenching studies