

# Jet substructure : theory developments and challenges

Mrinal Dasgupta

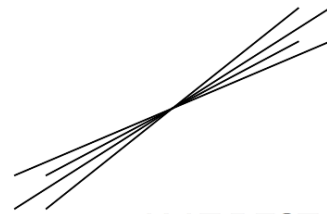
University of Manchester

ATLAS SM workshop, London, 6<sup>th</sup> September 2018

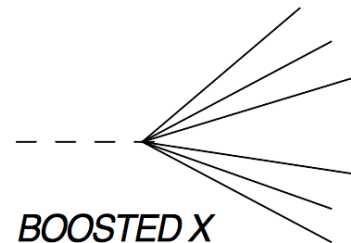
# Outline

- Introduction and basics
- Some key theory issues
- Selective review of recent developments
- Prospects and challenges

# Basic ideas



*X AT REST*



*BOOSTED X*

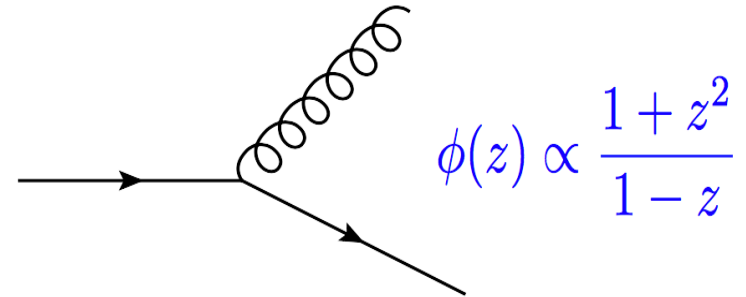
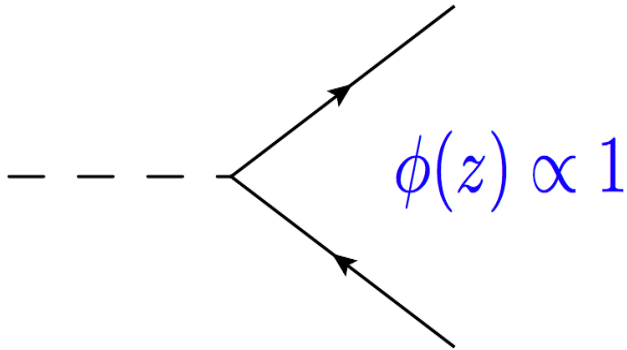
Key idea : for tagging a particle with mass  $M$  exploit boosted regime i.e.  $P_T \gg M$ .

$$\theta^2 = \frac{M^2}{p_T^2 z(1-z)}$$

Either from going to high  $p_T$  or from decay of heavy new particle

Hadronic decays reconstructed in single “fat” jet.  
Use our knowledge of QCD jets to distinguish this from background.

# Basic ideas



- Exploit the **asymmetric nature** of QCD splittings. Produce jets with single hard core or prong versus 2 pronged W/Z/H and 3 pronged t.
- Colour singlet nature of W/Z/H suppressing soft large angle radiation.

# Lots of tools

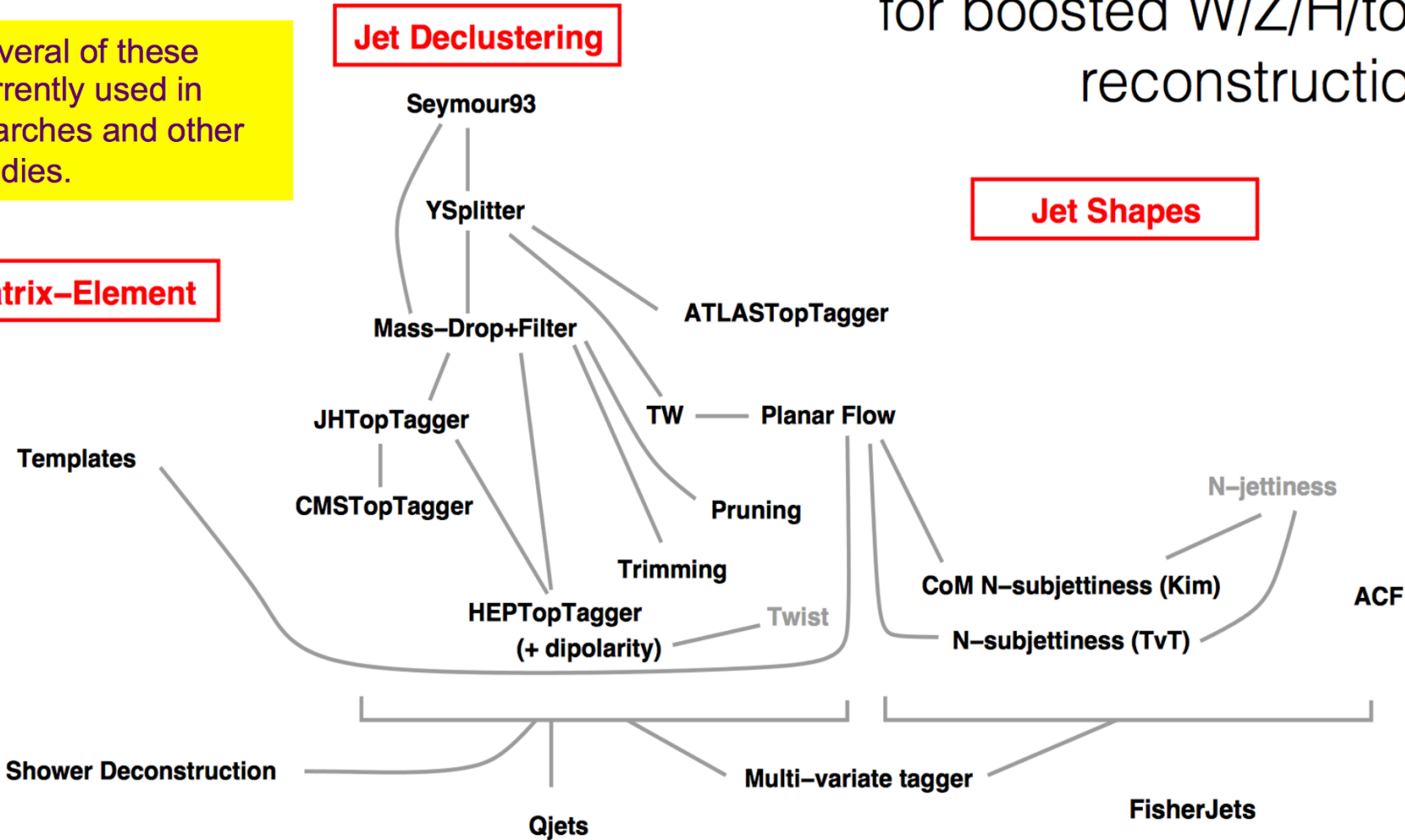
Some of the tools developed for boosted W/Z/H/top reconstruction

Several of these currently used in searches and other studies.

**Jet Declustering**

**Jet Shapes**

**Matrix-Element**



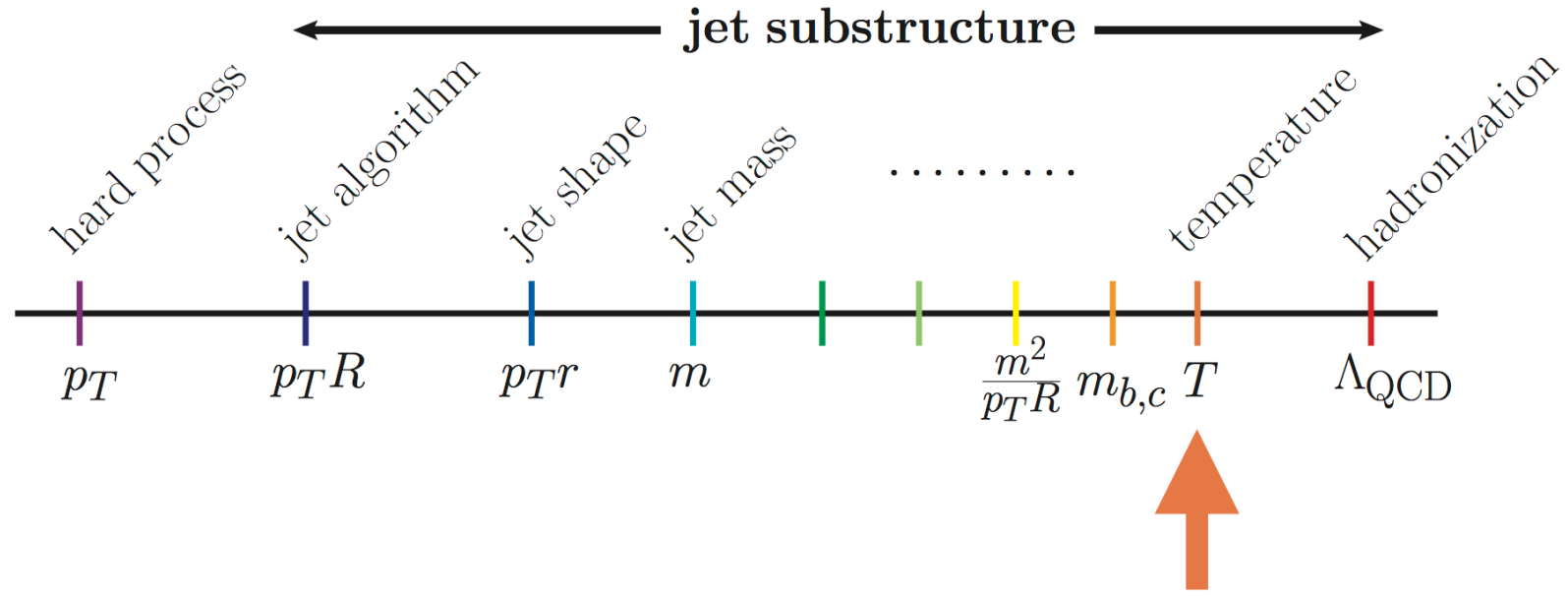
# Open questions

- Why so many tools to exploit a few physics principles?
- Do we understand the physics behind tool performance?
- How robust are various tools? E.g. does performance change with kinematics and parameters?

**How to decide which tools to use in searches and data/theory comparisons? Look to guidance from theory?**

# Theory Issues

# A multiscale problem



Taken from talk by J. Thaler at Boost 2017



# Large logarithms

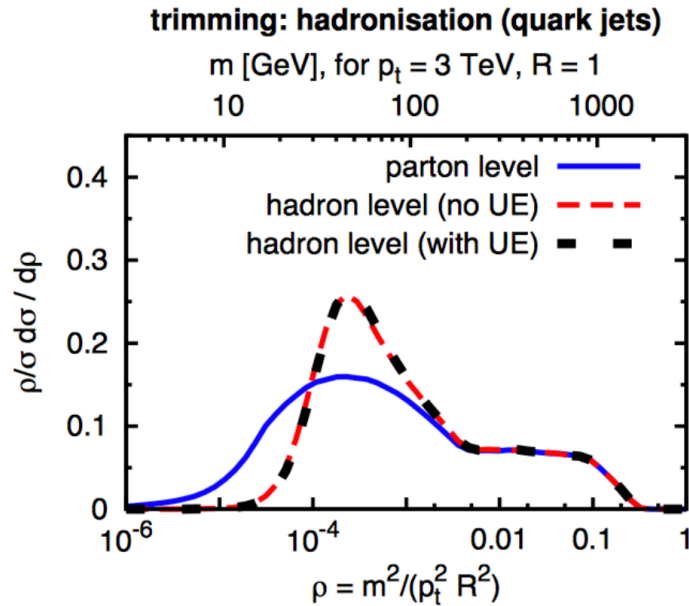
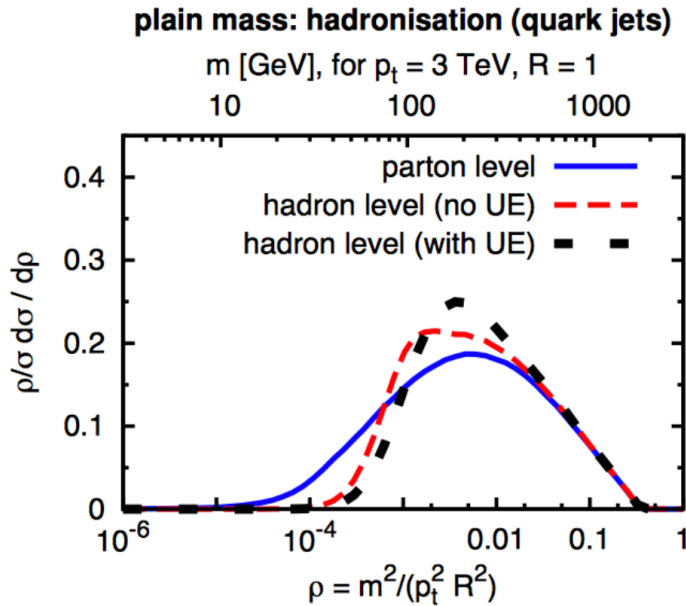
Higher order pQCD calculations are standard way to obtain better precision but are not used here.

$$\frac{1}{\sigma} \frac{d\sigma}{dm_j^2} \sim \frac{1}{m_j^2} \frac{C_i \alpha_s}{\pi} \ln \left( \frac{R^2 p_t^2}{m_j^2} \right) \quad p_t \gg m_j$$

## Affect convergence of perturbation theory

- Large logarithms in boosted regime. Fixed-order is of limited use.
- Parton showers offer a limited accuracy resummation of logarithms.
- More precise analytic resummation now possible for some observables e.g. mMDT/SoftDrop jet masses.

# Non-perturbative effects



Are these important in the TeV region? Consider that a 1 GeV gluon inside an  $R=1$  3 TeV jet can produce a jet mass of 55 GeV.

$$m_j^2 \sim \Lambda p_T R^2$$

NP bumps visible but where NP = Non-Perturbative!

**Models for hadronisation and UE but no first principles theory.**

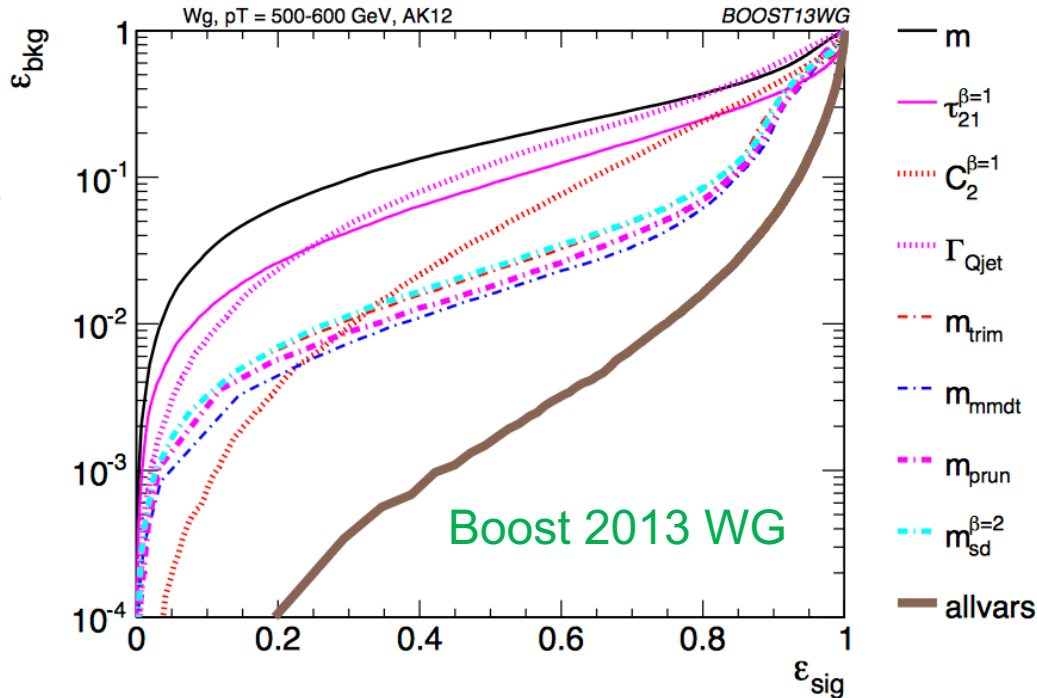
# Main approaches

- Develop substructure taggers using rough intuition and study performance with **Monte Carlo methods**.
- Look for some guidance from perturbative QCD theory - **analytic resummation**.
- Exploit recent advances in **machine learning** to develop more performant tools.

**All offer advantages but its crucial to recognise the limitations in each case.**

# Performance in MC studies

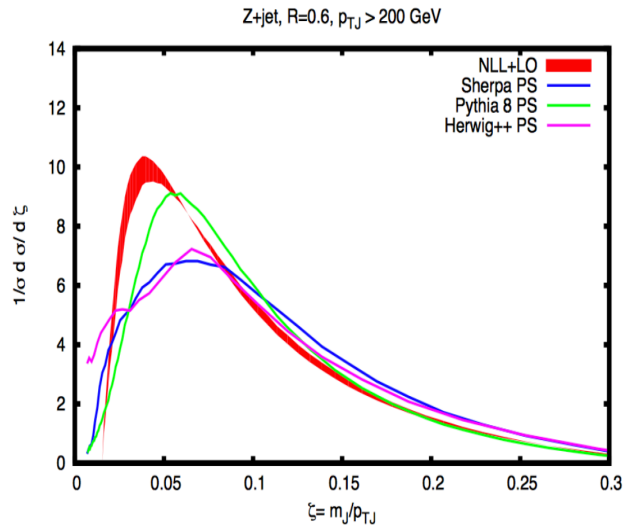
Imagine these same results with large uncertainty bands



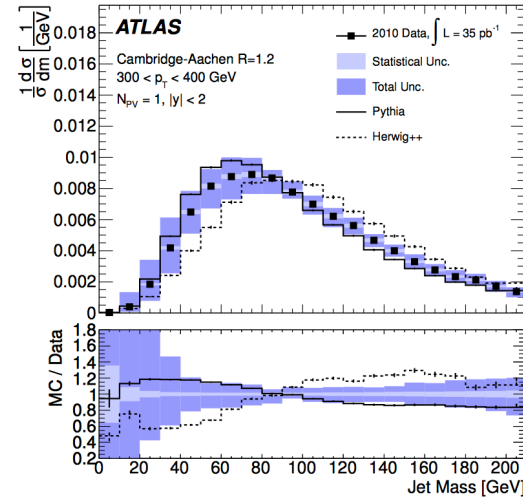
Estimating uncertainties depends on assumptions about shower accuracy. At LL level 50-100% is possible.

Simplest most common approach is to use MC results. But gives no idea about uncertainties or insight into origin of gains. Complete reliance on MC models.

# Issues with showers



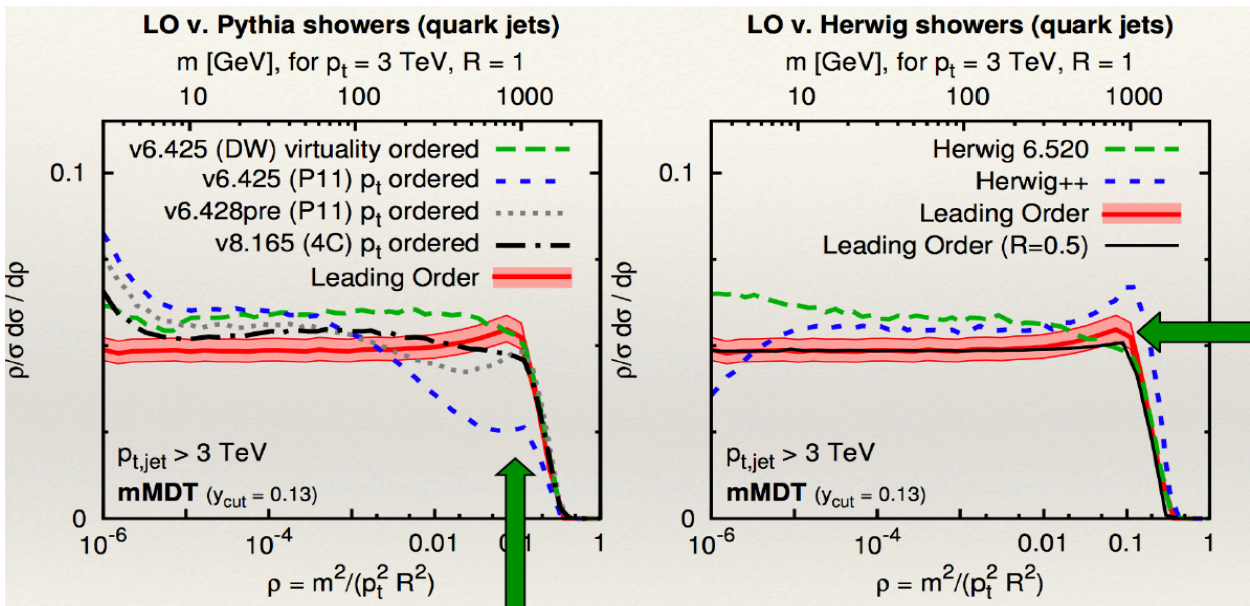
Dasgupta, Khelifa-Kerfa,  
Marzani, Spannowsky 2011



ATLAS  
collaboration  
2012

- Shower predictions often show a **substantial spread**.
- At high  $p_t > 1$  TeV the above differences would be large for 100 GeV or more in jet mass.

# Limitations of showers



**Bump at larger masses not in most showers**

**Pythia 6  $p_t$  ordered fails**

Jet masses with “mass drop” tagger

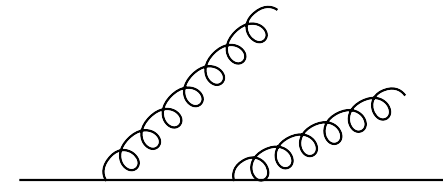
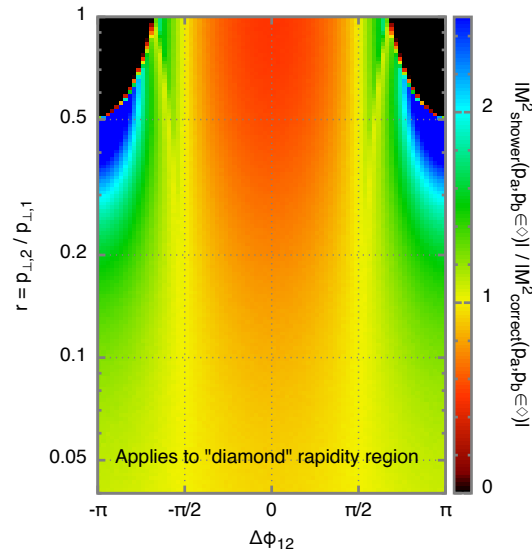
Different MC showers **don't** always agree.

Showers don't always produce relevant features and can contain flaws.

# Shower versus QCD matrix elements

MD, Dreyer, Hamilton,  
Monni, Salam 2018

ratio of dipole-shower double-soft ME to correct result

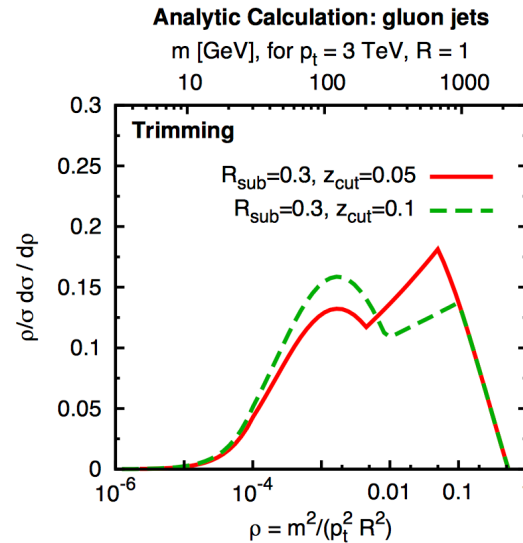
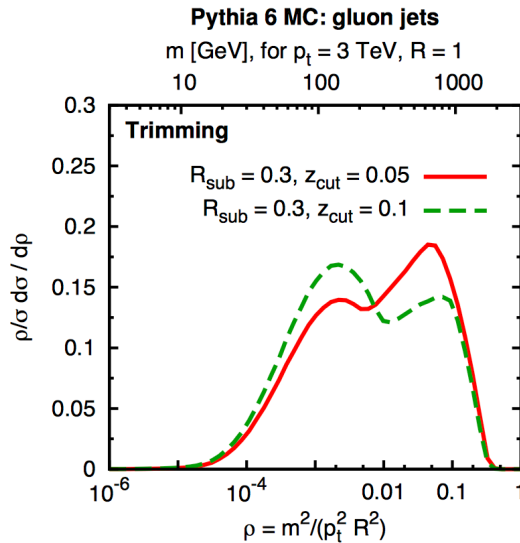


Pythia and Dire Shower two emission matrix element fails to reproduce known QCD results in **logarithmically enhanced regions**.

A concern for methods that exploit pattern of correlation between emissions e.g. machine learning based approaches?

# Jet substructure from analytics

Dasgupta,  
Fregoso, Marzani  
and Salam 2013

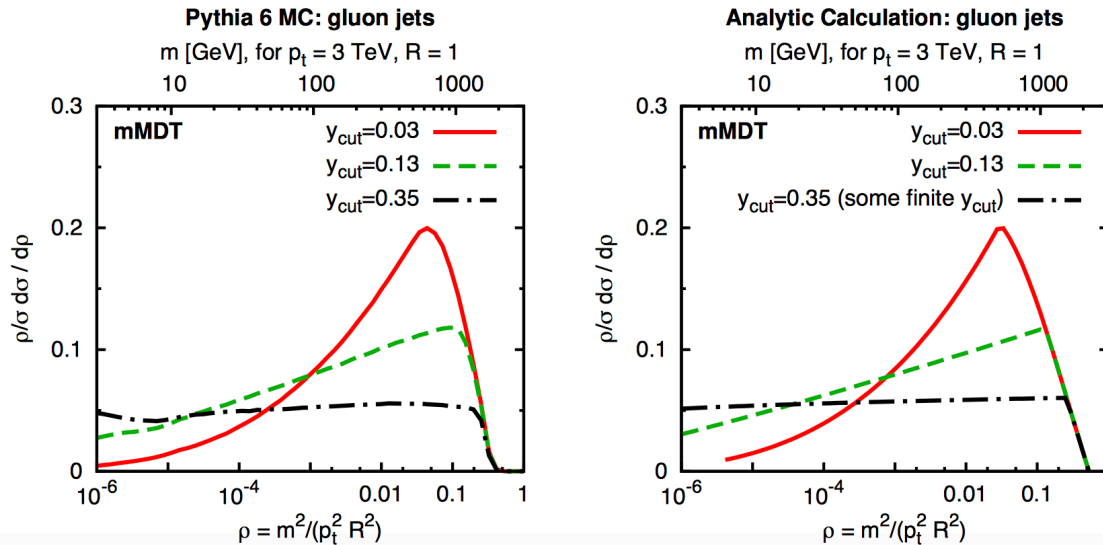


- Since 2013 analytical calculations for substructure observables developed.
- Based on perturbative QCD resummed calculations.
- Give considerable insight into taggers and their features.



# Jet substructure and analytics

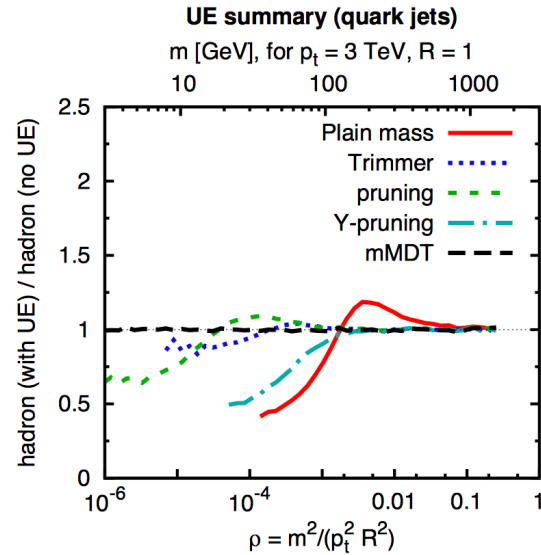
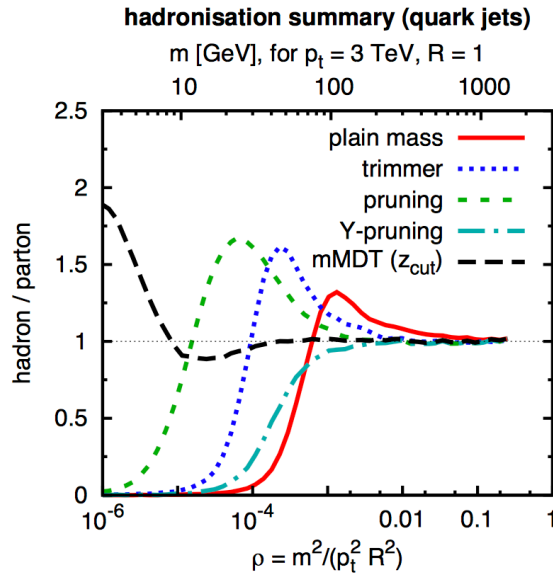
Dasgupta,  
Fregoso,  
Marzani  
and Salam  
2013



Analytical considerations led to deeper understanding but also development of more robust tools like mMDT/SoftDrop.

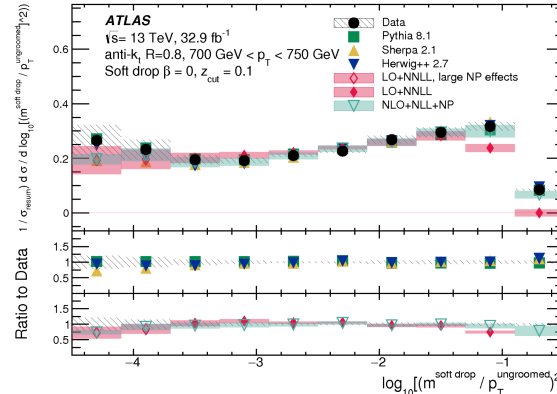
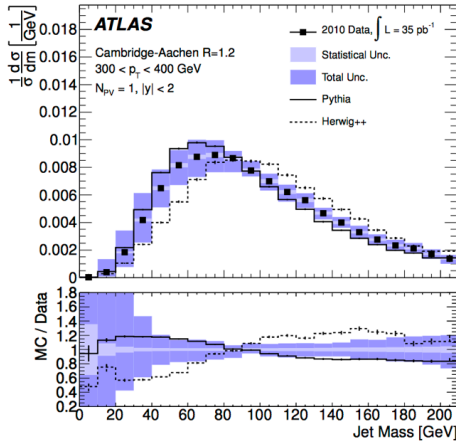
- Flat background distribution possible - better for data driven studies.
- High precision (NLL/NNLL) calculations possible for the first time for hadron collider jet masses.

# Jet substructure and analytics



mMDT Soft/Drop **more resilient by design to non-perturbative effects** than e.g. trimming. Theoretical preference for tools like this.

# Improved phenomenology for jet observables



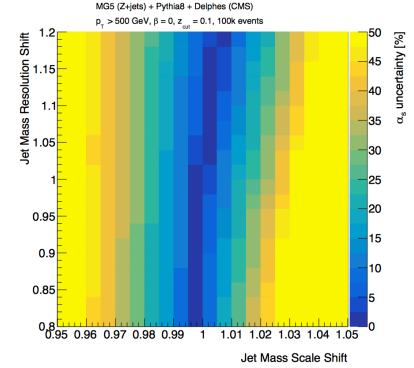
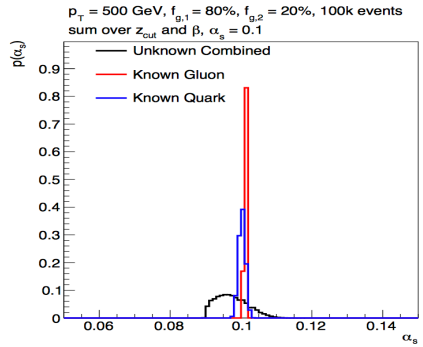
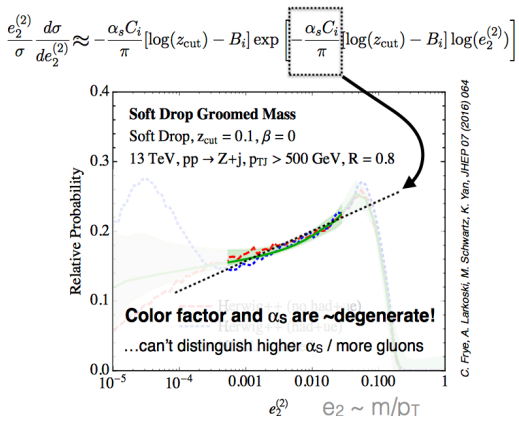
Frye, Larkoski, Schwartz,  
Yan, 2016

- Now possible to compare data with theory calculations directly for some jet observables.
- **Can still only be done for a few observables.** Important to widen the set of observables in longer term.
- But not an essential prerequisite for all substructure tools e.g. for searches.
- **MC independent analytic studies remain important to design robust tools.**

# Recent Progress

**(WITH APOLOGIES FOR MANY OMISSIONS)**

# Strong coupling from substructure?

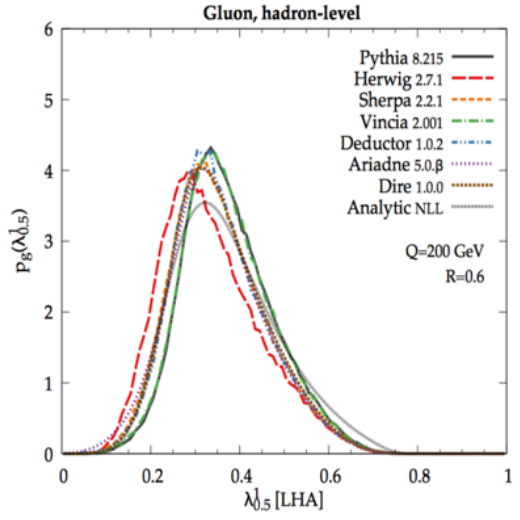
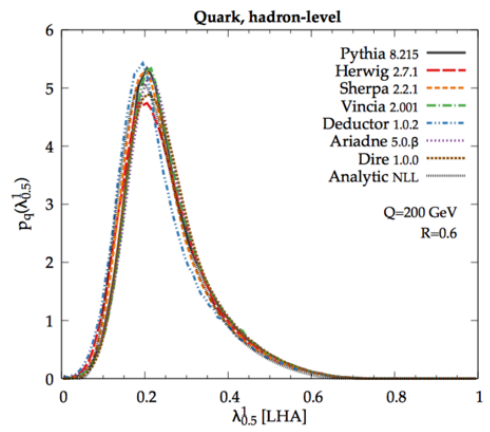


- Can we benefit from the precision calculations, small NP effects and measurements of groomed masses/angularities?
- Limiting factor is leading degeneracy with quark/gluon fraction due to Casimir scaling. Sensitivity to pdfs or need to fit quark-gluon fraction.
- 2017 Les Houches working group conclusion was that extraction of  $\alpha_s$  to within  $\sim 10\%$  is a realistic possibility with current data.

B. Nachman at BOOST 2018

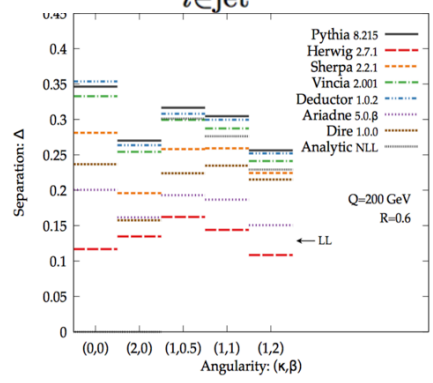
**Current world average  $\alpha_s(M_Z)$  0.1183 with  $\sim 1\%$  uncertainty!**

# Quark/gluon discrimination



Gras et. al 2017

$$\lambda_{\beta}^{\kappa} = \sum_{i \in \text{jet}} z_i^{\kappa} \theta_i^{\beta},$$

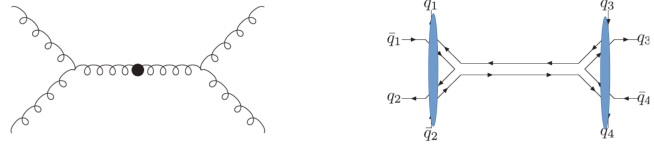


Focus on LHA with  $\kappa = 1, \beta = 0.5$

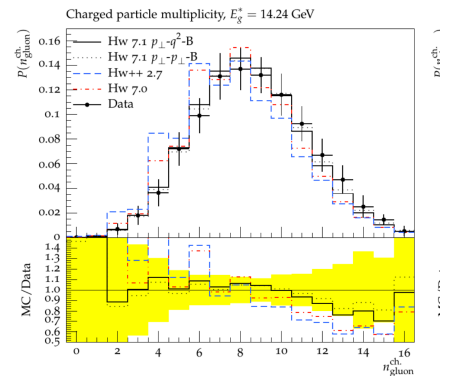
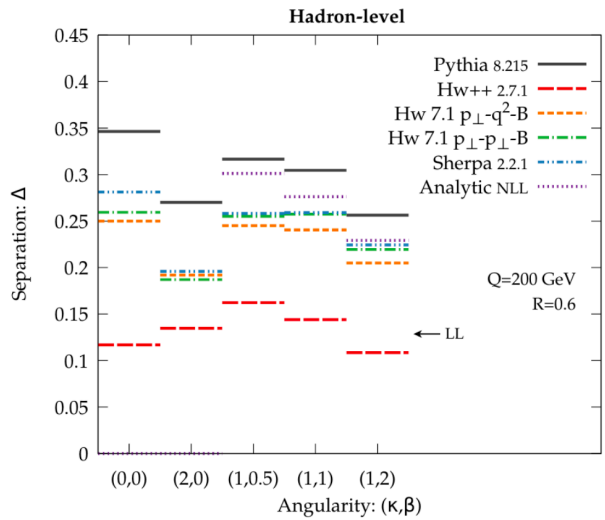
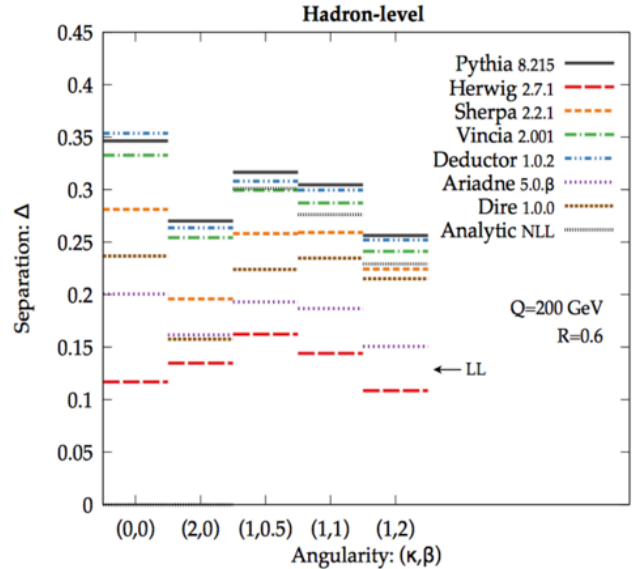
**Wide spread between generators for gluon jets. Call for LHC measurements of angularities to tune event generators and constrain gluon jets.**

$$\Delta = \frac{1}{2} \int d\lambda \frac{(p_q(\lambda) - p_g(\lambda))^2}{p_q(\lambda) + p_g(\lambda)} = 1 - 2 \int d\lambda \frac{p_q(\lambda) p_g(\lambda)}{p_q(\lambda) + p_g(\lambda)}$$

# Improvements in HERWIG



Improved colour reconnection model

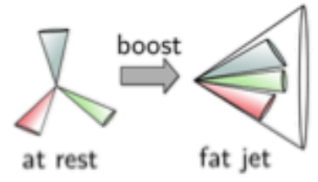
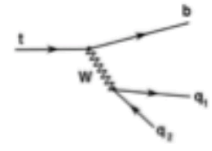


OPAL data for gluon jet charged multiplicity. Not used for tuning before!

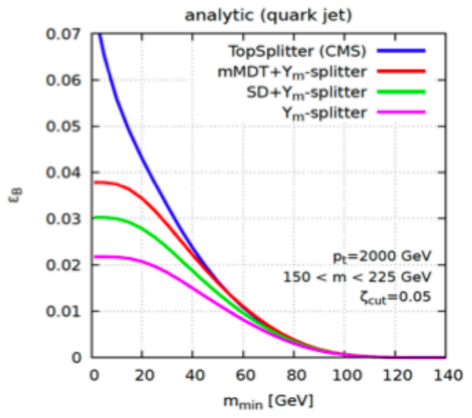
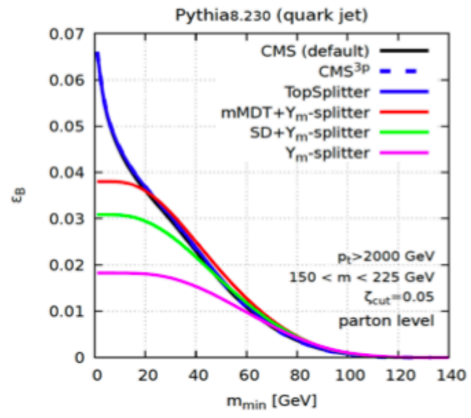
- Herwig is now more optimistic when it comes to distinguishing q/g jets.
- Spread of predictions is reduced.

# Analytics for top tagging

Top Quark Decay



Dasgupta, Guzzi,  
Rawling and Soyez 2018



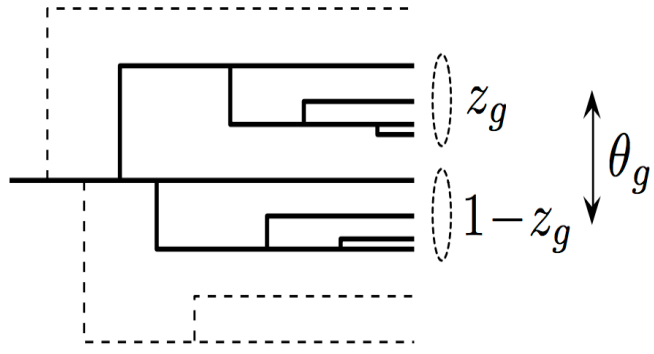
Recent progress showing CMS tagger is IRC unsafe and designing new method TopSplitter

Three pronged substructure and coloured signal.  
Harder problem than W/Z/H. Can we get analytical control?

Analytic understanding excellent for top taggers on background jets. Also reasonable for signal jets but some improvements possible.



# Extending theory reach?



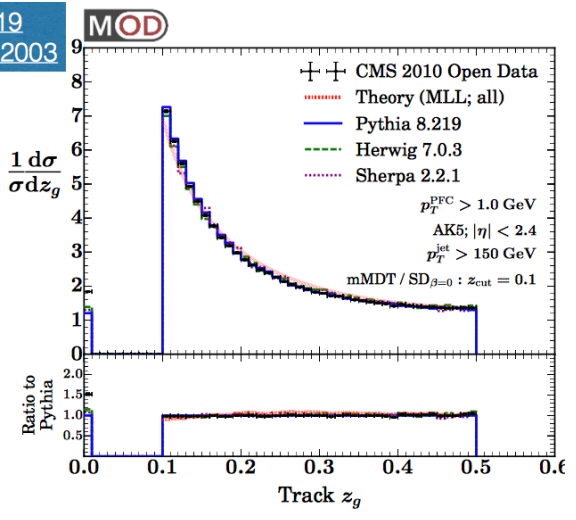
$$z = \frac{\min(p_{t,i}, p_{t,j})}{p_{t,i} + p_{t,j}}$$

Applies to mMDT/SoftDrop jets.

Decluster until find

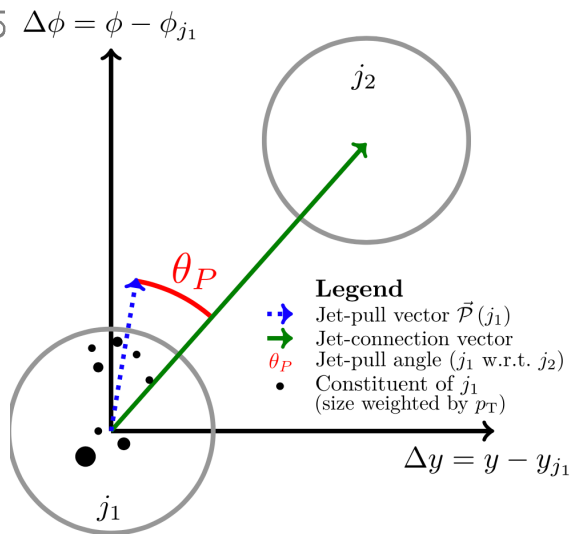
$$z > z_{\text{cut}}$$

PRL 119  
(2017) 132003

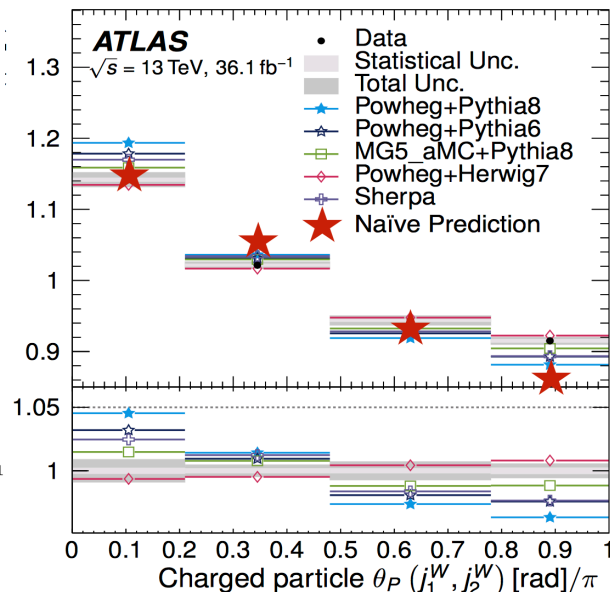


**Collinear unsafe but Sudakov safe observable. Resummation produces finite result. Do we understand corrections and uncertainties?**

# Extending theory reach?



arXiv: 1001.5027, 1805.02935  
see also: 1506.05629



Steeper than data

Shape will change with:

Running coupling

Soft wide angle is more likely than  
hard collinear

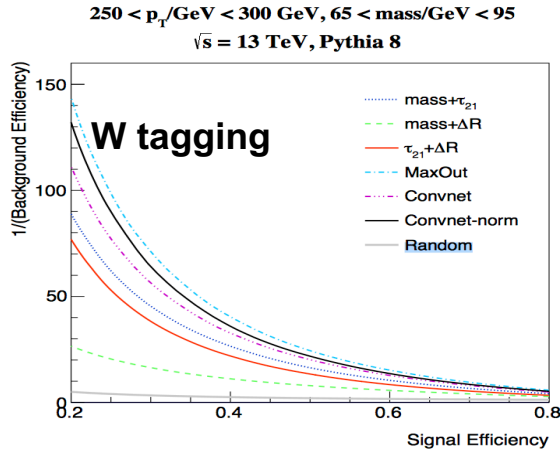
Convolving with W boost

$\theta_{12}$  isn't fixed  
Higher boosts = smaller  $\theta_{12}$   
= closer subjects

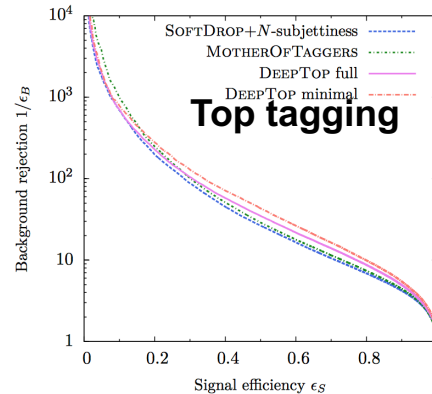
Presented by A. Larkoski at Boost 2018

Pull angle as measured by ATLAS. IRC unsafe but Sudakov safe variable. First theory results emerging. **But still work to do.**

# Deep learning methods



De Oliveira, Kagan, Mackey,  
Nachman, Schwartzmann 2016



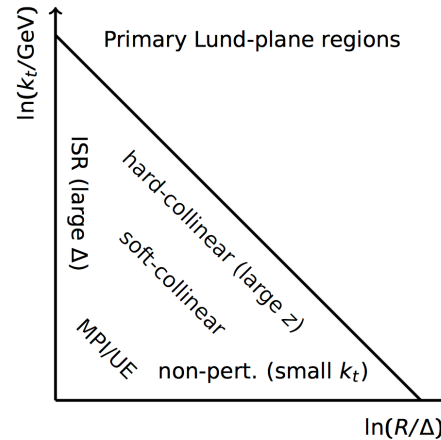
Kasieczka, Plehn, Russell.  
Schell 2016

- **Very active area. Perfect playground for ML approaches.** Wide range of methods used
- Often **substantially better than manually constructed observables** for performance
- Do we pay a price? **What features are learnt? Are they well modelled by showers, detector simulations?**

# Learning from the Lund plane

Lund diagrams in the  $(\ln z\theta, \ln \theta)$  plane are a very useful way of representing emissions.

Dreyer, Salam, Soyez  
2018



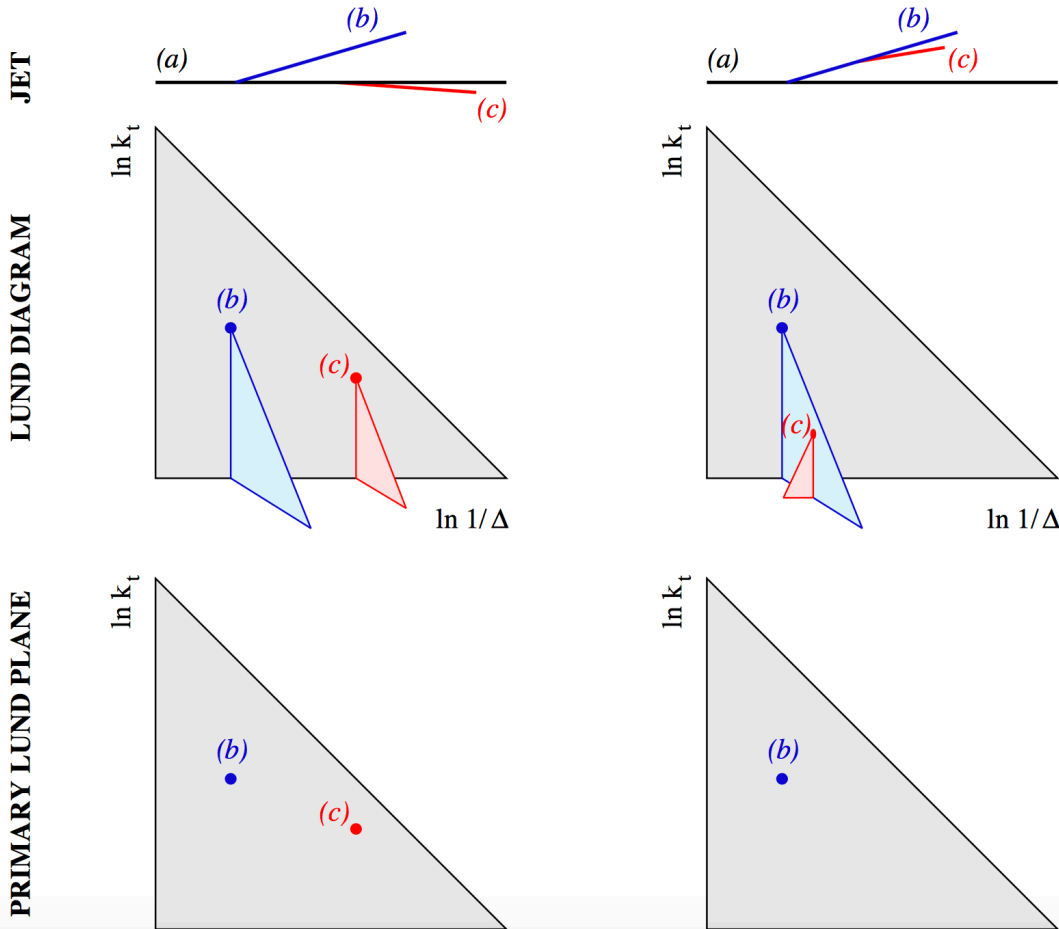
**Separation of different physics effects including non-pert.**

Density of emissions in primary Lund plane well understood theoretically.

At the heart of analytic approaches and parton showers. Can be used as an input to ML.

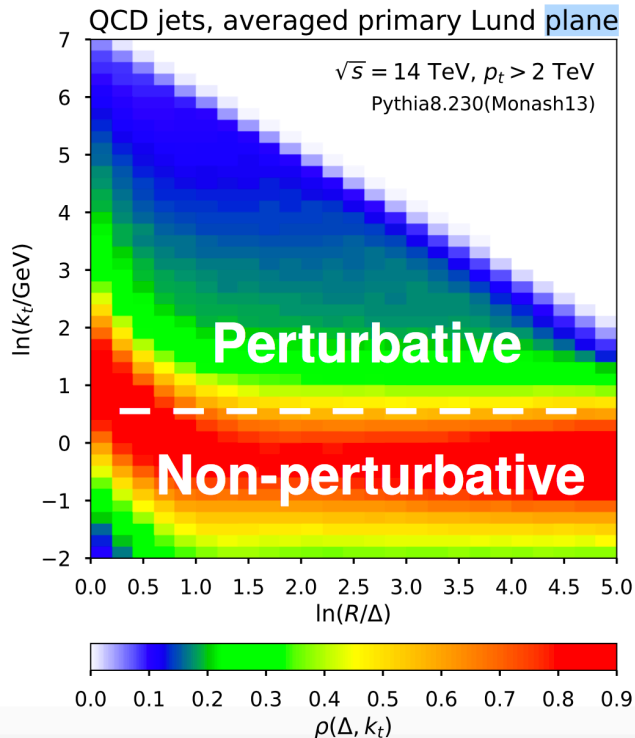
Bridges the gap between Deep learning and “Deep thinking” approaches?

# Learning from the Lund plane



Dreyer, Salam, Soyez, 2018

# QCD jets in Lund plane

ln( $k_t$ /GeV)

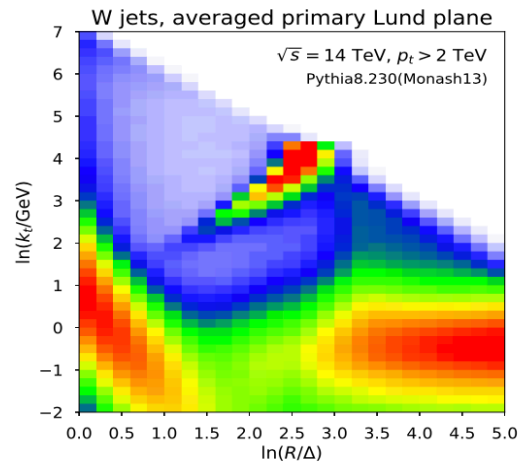
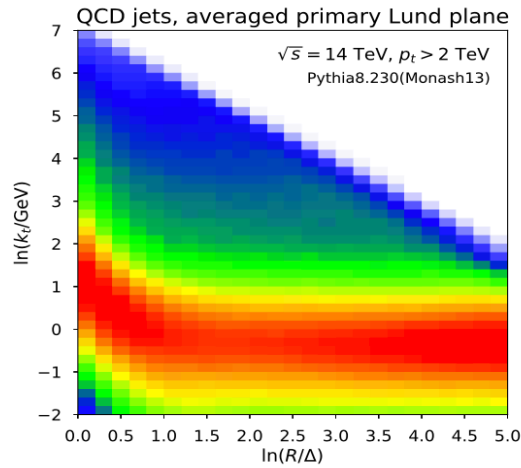
In the soft  
collinear region

$$\rho \sim 2C_F \frac{\alpha_s(k_t)}{\pi}$$

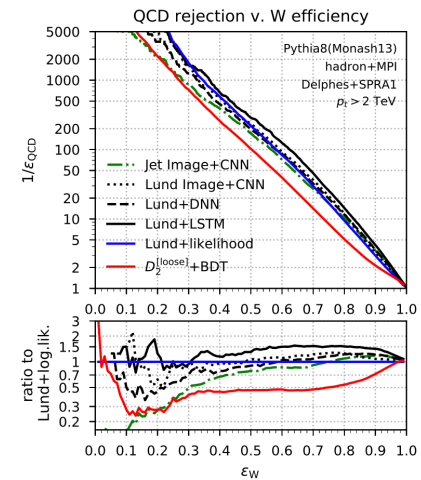
**Well understood theoretically.**  
**Applications include**  
**constraining event generator**  
**models, input to machine**  
**learning, manually designing**  
**optimal observables and**  
**direct measurements**

Dreyer, Salam, Soyez, 2018

# W tagging



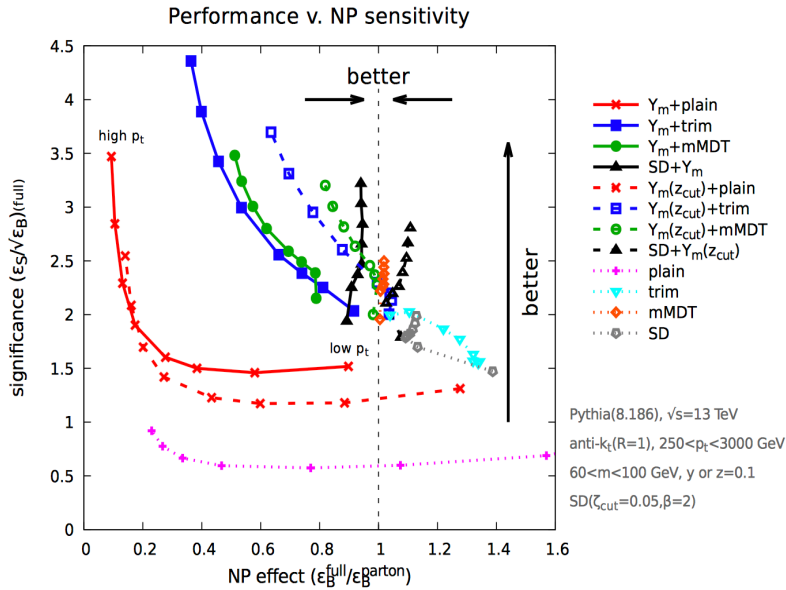
## Jet Tagging Applications (Direct Likelihood or Deep Network)



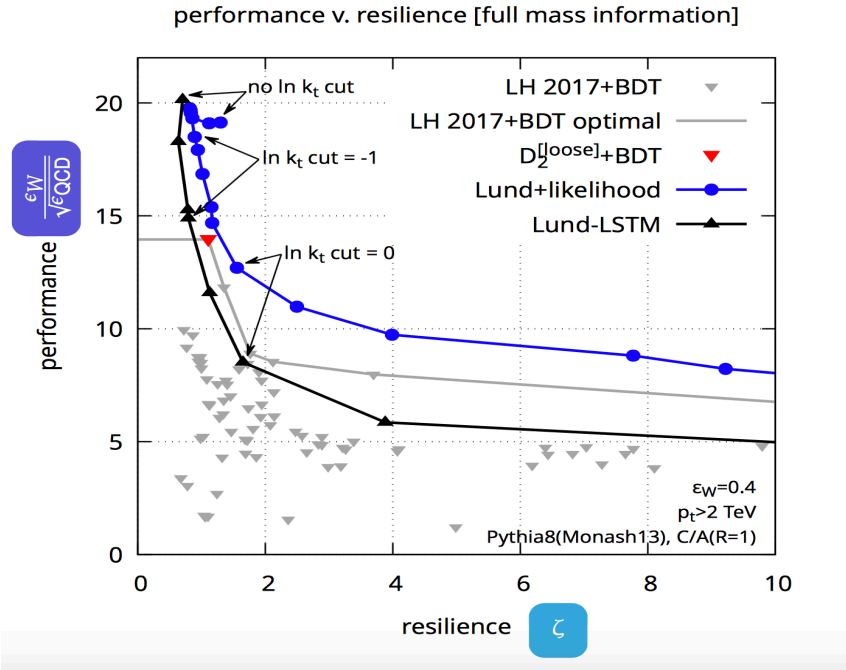
Used both log-likelihood and machine learning approach.

Dreyer, Salam, Soye, 2018

# Final thoughts : performance v resilience



Dasgupta, Powling,  
Schunk, Soyez 2016



Dreyer, Salam, Soyez, 2018

***To what extent do we want to rely on our knowledge of QCD at 1 GeV for TeV scale physics?***



# Prospects

We **need** and should look forward to

- **Further improvements in Monte Carlo event generators** (more about MC in Keith's talk).
- **Widening the scope of analytic calculations** both for precise comparisons to data but also for understanding and developing new tools.
- **Continued exploitation of machine learning advances** potentially with input from theory insight.
- **Experimental measurements** to support all of the above will be critical.

**Note also crucial exploitation of jet substructure in heavy-ion collisions : reviewed in arXiv 1808.03689**