# New perspectives in QCD with jet substructure

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University of Vienna, January 16 2018

#### Jets are routine QCD objects

- ubiquitous in collider physics
- around since 40 years
- used in at least 60% of LHC analyses

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#### You could live a happy life by just knowing a few things

#### Concepts:

- Jets are proxies to hard partons produced in collisions
- infrared-and-collinear safe
- capture collimated parton cascades from hard scale Q to  $\mathcal{O}(1 \text{ GeV})$

#### Practically:

- obtained by running a clustering algorithm
- the LHC uses the anti- $k_t$  algorithm
- FastJet covers covers all your numerical needs for clustering

Vienna, 16/01/2018

#### The anti- $k_t$ (and generalised $k_t$ algorithm)

From all the objects to cluster, define the distances

$$d_{ij} = \min(p_{t,i}^{2p}, p_{t,j}^{2p})(\Delta y_{ij}^2 + \Delta \phi_{ij}^2), \qquad d_{iB} = p_{t,i}^{2p}R^2$$

• repeatedly find the minimal distance if  $d_{ii}$ : recombine i and j into k = i + j

if  $d_{iB}$ : call i a jet

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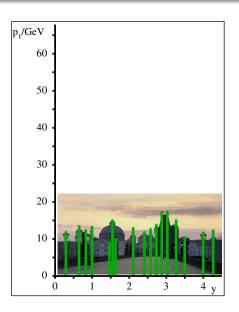
repeatedly find the minimal distance

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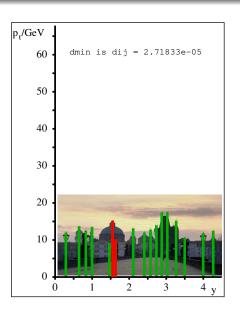
- Parameter p is (typically) one of
  - p = 1: k<sub>t</sub> algorithm (closest to QCD) [Catani,Dokshitzer,Seymour,Weber,Ellis,Soper,1993]
  - p = 0: Cambridge/Aachen (geometrical distance) [Dokshitzer,Leder,Moretti,Webber,1997]
  - p = -1: anti- $k_t$  (the LHC choice) [M.Cacciari, G.Salam, GS, 2008]



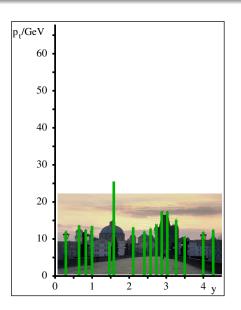
Start with your favourite picture

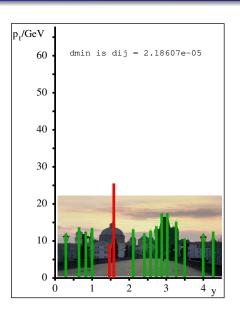


Start with your favourite picture event

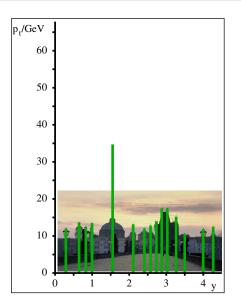


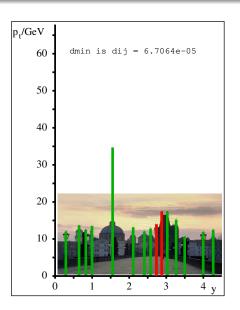
min is  $d_{ij} = 2.7 \, 10^{-5}$ 



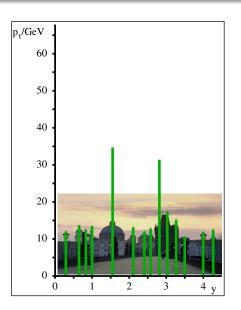


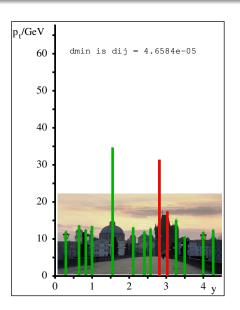
min is  $d_{ij} = 2.2 \, 10^{-5}$ 



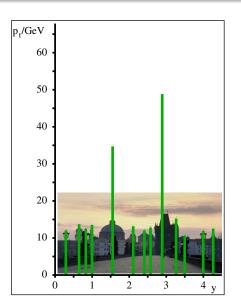


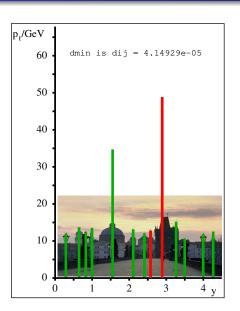
min is  $d_{ij} = 6.7 \, 10^{-5}$ 



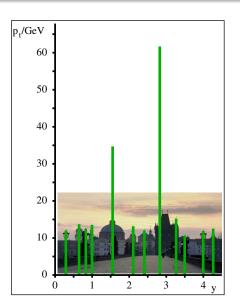


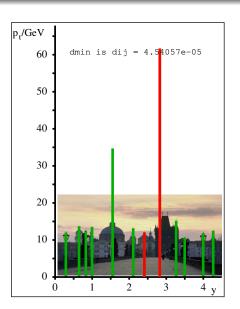
min is  $d_{ij} = 4.7 \, 10^{-5}$ 



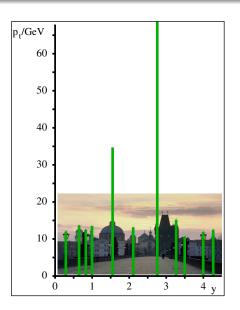


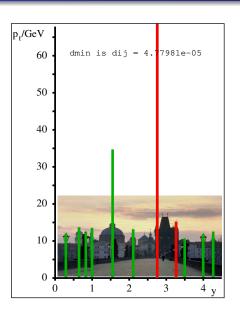
min is  $d_{ij} = 4.1 \, 10^{-5}$ 



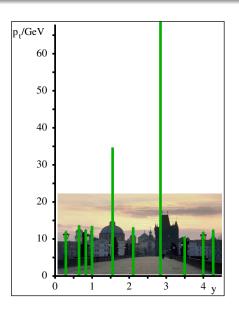


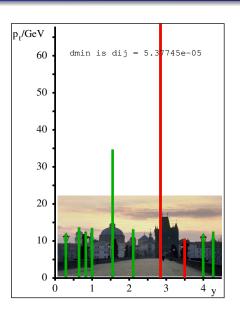
min is  $d_{ij} = 4.5 \, 10^{-5}$ 



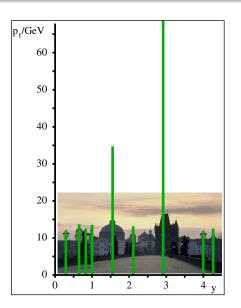


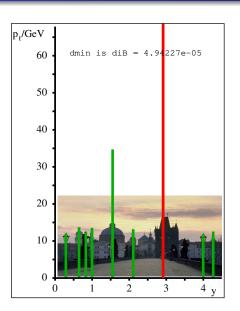
min is  $d_{ij} = 4.8 \, 10^{-5}$ 



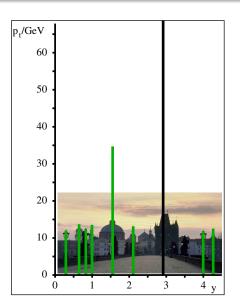


min is  $d_{ij} = 5.4 \, 10^{-5}$ 

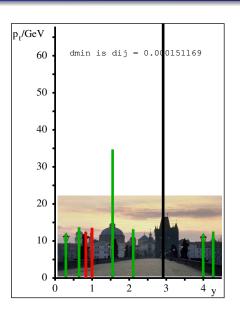




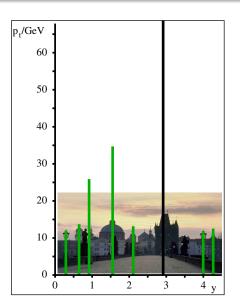
min is  $d_{iB} = 4.9 \, 10^{-5}$ 

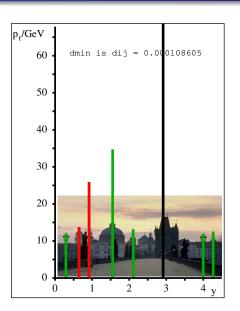


declare as a jet

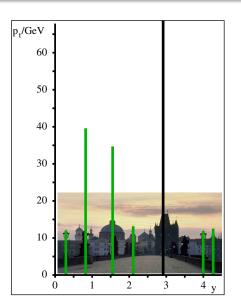


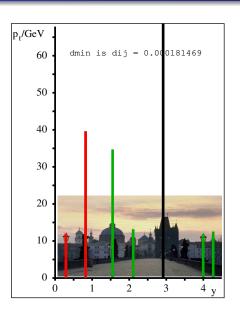
min is  $d_{ij} = 1.5 \, 10^{-4}$ 



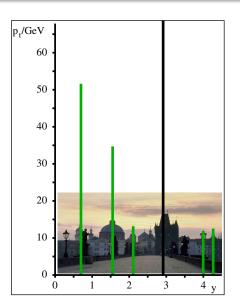


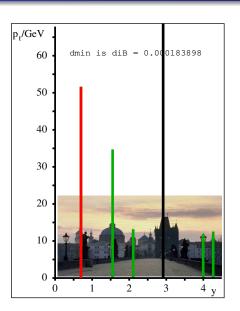
min is  $d_{ij} = 1.1 \, 10^{-4}$ 



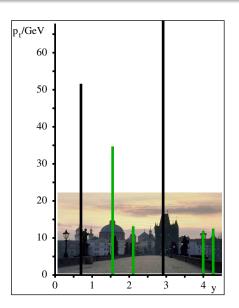


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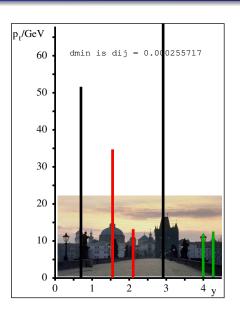




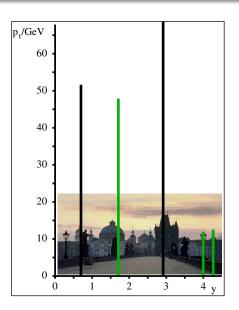
min is  $d_{iB} = 1.8 \, 10^{-4}$ 



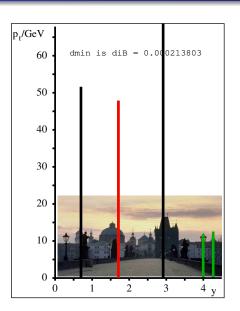
declare as a jet



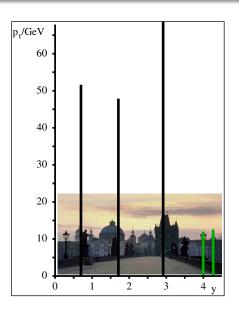
min is  $d_{ij} = 2.6 \, 10^{-4}$ 



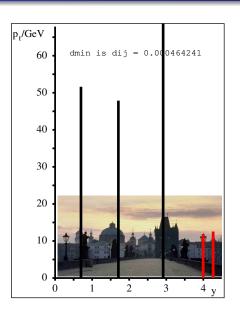
declare as a jet



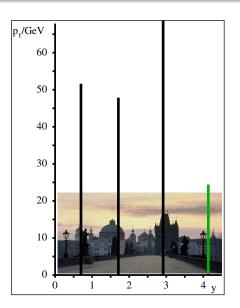
min is  $d_{iB} = 2.1 \, 10^{-4}$ 



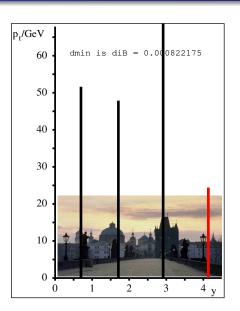
decclare as a jet



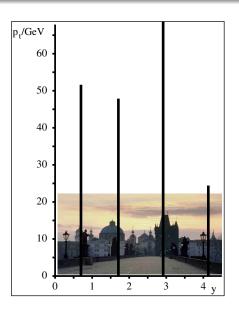
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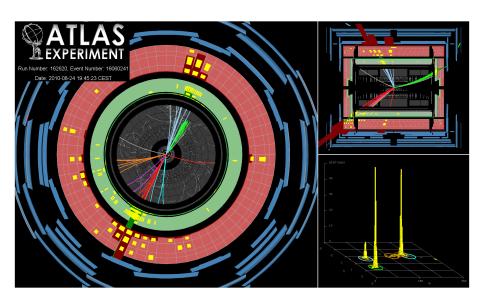
recombine them



min is  $d_{iB} = 8.2 \, 10^{-4}$ 



declare as a jet



Substructure means looking at the internal dynamics of jets (as opposed to consider jets as monolithic objects)

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#### Many useful/interesting aspects:

- boosted jet tagging (now a common search tool)
- entered the field of Heavy-Ion collisions
- rich QCD phenomenology
- precision calculations at the LHC
- many conceptual ideas

## Substructure means looking at the internal dynamics of jets (as opposed to consider jets as monolithic objects)

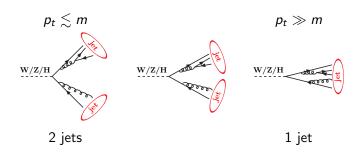
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This talk: give you a hint of all these aspects

## **Boosted objects and searches**

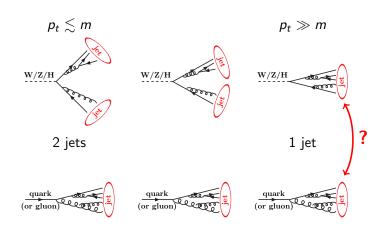
## Boosted objects



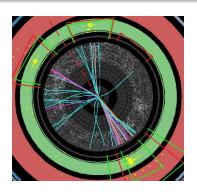
(massive) objects produced boosted (energy  $\gg$  mass) are seen as 1 jet:

$$heta_{qar{q}}\sim rac{m}{p_t}$$

## Boosted objects

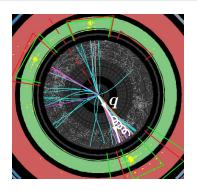


use substructure to separate from QCD jets

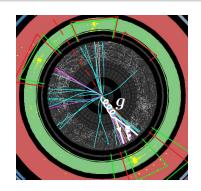


What jet do we have here?

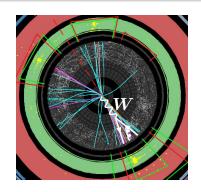
a quark?



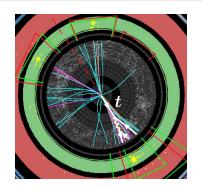
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- a quark?
- a gluon?
- $\bullet$  a W/Z (or a Higgs)?



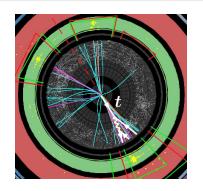
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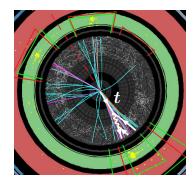
Source: ATLAS boosted top candidate



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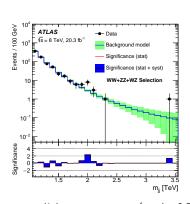
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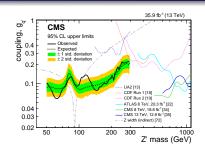
#### Many applications, all relevant to new physics searches:

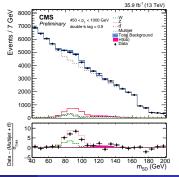
- 2-pronged decay: W/Z o qar q, H o bar b
- 3-pronged decay: t o qqb,  $ilde{\chi} o qqq$
- quark-gluon discrimination
- more exotic signatures

#### Searches and measurements



- ↑ (now-gone) di-boson excess (end of Run-I)
- ightharpoonup Search for X o qar qRegion inaccessible otherwise
- $\rightarrow$  Clear Z peak, hint of a H peak





## **Conceptual ideas**

### Like a kid in a candy store

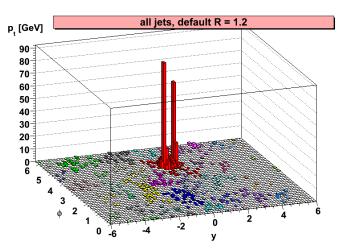
#### Compared to standard jets, substructure uses a large toolkit

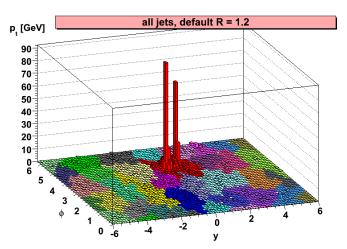
- all kinds of jet algorithms anti- $k_t$ , Cambridge/Aachen (ang-ordered),  $k_t$ , generalised  $k_t$ , winner-takes-all recomb., ...
- tools to find peaks in jets
   (modified) mass-drop, Soft Drop, trimming, JHTopTagger, ...
- tools to quantify radiation patterns in jets

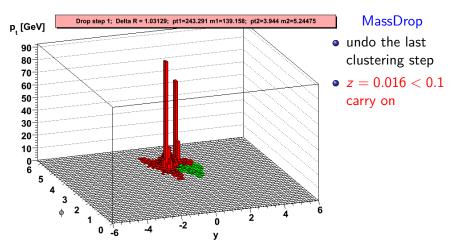
  N-subjettiness, energy-correlation functions, planar flow, ...
- tools to limit sensitivity to soft-large-angle radiation (UE, PU,...)
   filtering, trimming, pruning, Soft Drop, (m)MDT, ...

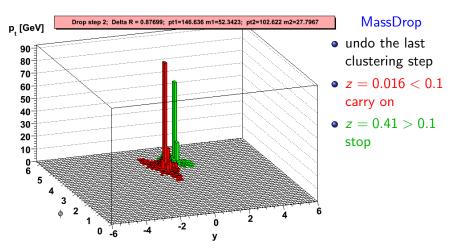
Active field for developing/studying new tools, combining them,...

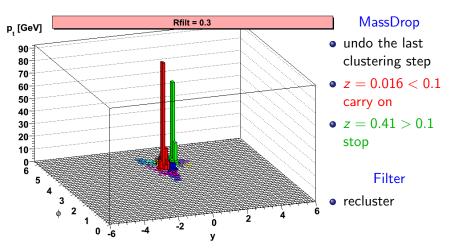
Requires both some creativity and some control over the underlying physics

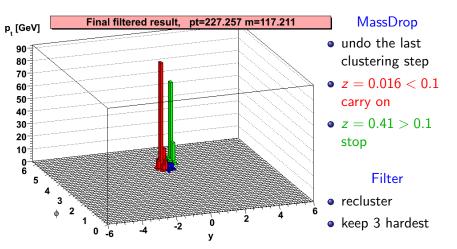




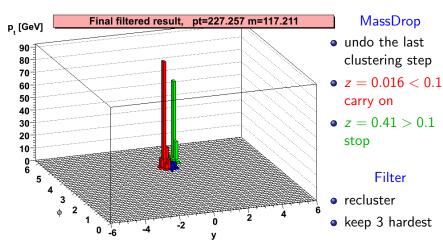








[J.Butterworth, A.Davison, M.Rubin, G.Salam, 08]



Variant: **SoftDrop**: impose  $z > z_{cut}\theta^{\beta}$ 

[A.Larkoski, S.Marzani, GS, J.Thaler, 14]

Vienna, 16/01/2018

## Study radiation: *N*-subjettiness

Given N axes/prongs in a jet (axes)  $[\neq$  options, e.g.  $k_t$  subjets]

$$\tau_N^{(\beta)} = \frac{1}{p_T R^{\beta}} \sum_{i \in \text{jet}} p_{t,i} \min(\theta_{i,a_1}^{\beta}, \dots, \theta_{i,a_n}^{\beta})$$

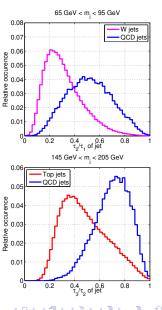
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- Measures the radiation from N prongs
- $\tau_{N,N-1} = \tau_N/\tau_{N-1}$  discriminates N-prong v. QCD
- $\tau_{21}$  smaller for W than for QCD
- $\tau_{32}$  smaller for top than for QCD

Several alternatives similar to  $\tau_N$ 



## **Expanding in new directions**

## Latest playground: deep learning

#### Machine Learning has become a major player

Many architectures:

**ANN** Artificial Neural Network

**DNN** Dense Neural Network

CNN Convolutional Neural Network

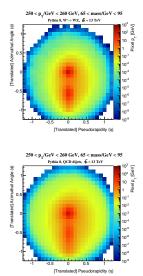
GANN Generative Adversarial Neural Network

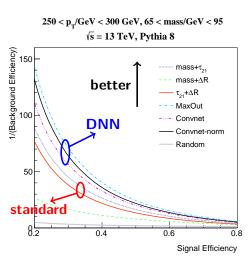
LSTM Long Short-Term Memory Neural Network

- Many approaches:
   Feed jet variables, jet constituents, jet images, ...
- Many applications: q/g, b, W, H, t tagging, pileup-mitigation, detector sim, ...

## Latest playground: deep learning

## Example 1: jet image for W vs. QCD jets using Convolutional/Dense NN





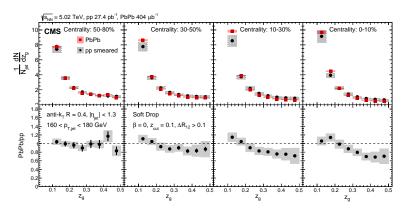
Improvement compared to standard approach

# Expanding in new directions Heavy-Ion collisions

## Measuring the splitting function

- Take a jet with large  $p_t$
- ullet apply mMDT o hard splitting
- $z_g \equiv$  mom fraction of that splitting

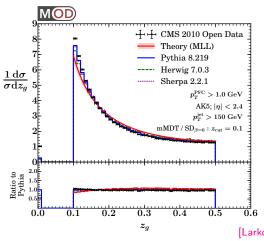
Measurement in *PbPb* shows quenching effects



Expect more to come in the (near) future...

## Measuring the splitting function

#### First "analysis" using CMS Open Data



- Open data is a heated debate
- many interesting possibilities (incl. substructure)

[Larkoski, Marzani, Thaler, Thipathee, Xue, 17]

## Rich QCD phenomenology

## Substructure from first principles (1/2)

For a long time, it was thought that the complexity of substructure techniques implies throwing the ability to make analytic calculations

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#### Main benefits of a first-principles understanding:

- understanding the dynamics at play in jet kinematics (example later)
- understand similarities and differences between methods e.g. trimming, prunng, mMDT similar at large mass, differ at low mass
- adjust substructure tools for better performance (e.g. modified MDT)
- understand parametric dependence, e.g.  $p_t$  (without generators)
- highlight a trade-off between performance and model-independence

## Substructure from first principles (2/2)

- Several interesting directions (all overviewed below)
  - Understanding how the methods work
  - Building improved tools
  - Precision QCD at the LHC
  - Funny structures in pQCD

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Substantial progress in understanding substructure, e.g.:

	peak finder	radiation
W/Z/H	mMDT, trimming, pruning Dasgupta,Fregoso,Marzani,Salam,13	$ au_{21}^{(eta=2)}$ , $\mu^2$ , $D_2^{(eta=2)}$ Dasgupta,Schunk,GS,15
	SoftDrop Larkoski,Marzani,GS,Thaler,14	$D_2^{(eta)}$ Larkoski,Moult,Neill,15-16
top	CMSTopTagger, Y-splitter Dasgupta,Guzzi,Rawling,GS,soon	next task Cacciari,Napoletano,GS,Stagnitto,18-20

Main idea:

Boosted jet 
$$\Rightarrow p_t \gg m$$
 
$$\Rightarrow \rho \equiv \frac{m^2}{p_t^2 R^2} \ll 1$$
 
$$\Rightarrow \text{expect log } \rho \text{ coming with } \alpha_s$$
 
$$\Rightarrow \text{need for all-order resummation}$$

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$$\Rightarrow \text{need for all-order resummation}$$

• Example: jet mass with one (soft-and-collinear) gluon emission

$$\begin{aligned} \mathsf{Prob}_1(>\rho) &\simeq \int_0^1 \frac{d\theta^2}{\theta^2} \frac{dz}{z} \frac{\alpha_s \, \mathsf{C}_R}{\pi} \Theta(z\theta^2 > \rho) \\ &\simeq \frac{\alpha_s \, \mathsf{C}_R}{2\pi} \log^2(1/\rho) \end{aligned} \longrightarrow 0$$

• (plain) jet mass again:

$$\mathsf{Prob}_{1}^{(\mathsf{plain})}(>\rho) \simeq \int_{0}^{1} \frac{d\theta^{2}}{\theta^{2}} \frac{dz}{z} \frac{\alpha_{s} C_{R}}{\pi} \Theta(z\theta^{2} > \rho)$$

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$$\simeq \frac{\alpha_{s} C_{R}}{2\pi} \log^{2}(1/\rho)$$

• mMDT jet mass:

$$\begin{split} \mathsf{Prob}_1^{\mathsf{(mMDT)}}(>\rho) &\simeq \int_0^1 \frac{d\theta^2}{\theta^2} \frac{dz}{z} \frac{\alpha_s \, \mathsf{C}_R}{\pi} \Theta(z\theta^2 > \rho) \, \Theta(z > z_{\mathsf{cut}}) \\ &\simeq \frac{\alpha_s \, \mathsf{C}_R}{\pi} \Big[ \log(1/\rho) \log(1/z_{\mathsf{cut}}) - \frac{1}{2} \log^2(1/z_{\mathsf{cut}}) \Big] \end{split}$$

• (plain) jet mass again:

$$\mathsf{Prob}_{1}^{(\mathsf{plain})}(>\rho) \simeq \int_{0}^{1} \frac{d\theta^{2}}{\theta^{2}} \frac{dz}{z} \frac{\alpha_{s} C_{R}}{\pi} \Theta(z\theta^{2} > \rho)$$

$$\simeq \frac{\alpha_{s} C_{R}}{2\pi} \log^{2}(1/\rho)$$

• mMDT jet mass:

$$\begin{split} \mathsf{Prob}_1^{\mathsf{(mMDT)}}(>\rho) &\simeq \int_0^1 \frac{d\theta^2}{\theta^2} \frac{dz}{z} \frac{\alpha_{\mathsf{s}} \mathsf{C}_R}{\pi} \Theta(z\theta^2 > \rho) \, \Theta(z > z_{\mathsf{cut}}) \\ &\simeq \frac{\alpha_{\mathsf{s}} \, \mathsf{C}_R}{\pi} \Big[ \log(1/\rho) \log(1/z_{\mathsf{cut}}) - \frac{1}{2} \log^2(1/z_{\mathsf{cut}}) \Big] \end{split}$$

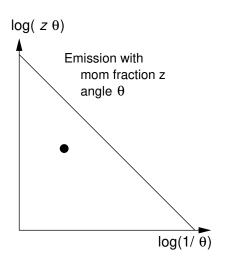
all-order result (Leading-Log): for both the "plain" jet and mMDT

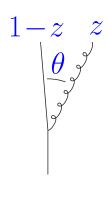
$$\mathsf{Prob}_{\mathsf{LL}}(<\rho) = \exp[-\mathsf{Prob}_1(<\rho)]$$

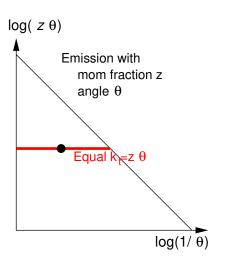


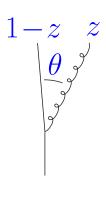
## Rich QCD phenomenology Explicit examples at LL

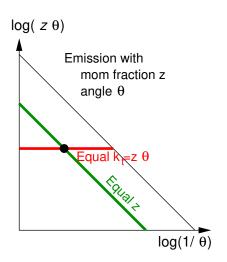
- Understanding jet substructure: revisited jet mass (plain and mMDT)
- Understanding jet substructure: N-subjettiness
- Designing new tools: Dichroic N-subjettiness

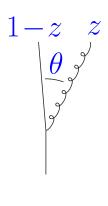


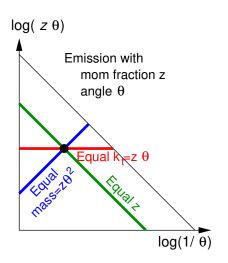


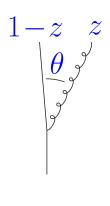


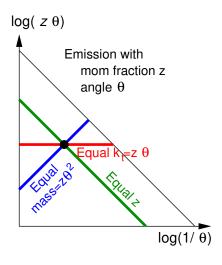












#### Observables in the soft-collinear limit

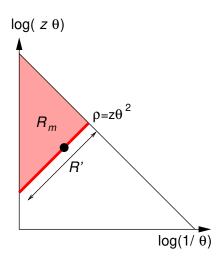
Jet "mass": 
$$(z_1\theta_1^2 \gg z_2\theta_2^2 \gg ...)$$

$$\rho \equiv \frac{m^2}{p_t^2 R^2} = \sum_{i \in \text{jet}} z_i \theta_i^2 \approx z_1 \theta_1^2$$

*N*-subjettiness:

$$\tau_1 = \rho$$

$$\tau_2 = \sum_{i=2}^n z_i \theta_i^2 \approx z_2 \theta_2^2$$



(plain) jet mass spectrum at LL

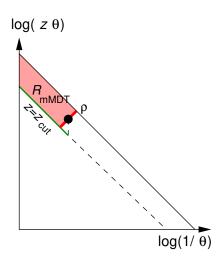
$$\frac{\rho}{\sigma} \frac{d\sigma}{d\rho} = R'_{\text{plain}} \, \exp(-R_{\text{plain}})$$

1 veto on larger-mass (Sudakov)

$$R_{
m plain} \simeq rac{lpha_s \, C_R}{2\pi} \log^2(1/
ho)$$

emission of given mass

$$R'_{\mathsf{plain}} \simeq rac{lpha_{\mathsf{s}} \mathsf{C}_{R}}{\pi} \log(1/
ho)$$



(mMDT) jet mass spectrum at LL

$$\frac{\rho}{\sigma} \frac{d\sigma}{d\rho} = R'_{\text{mMDT}} \exp(-R_{\text{mMDT}})$$

veto on larger-mass (Sudakov)

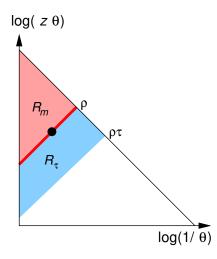
$$R_{ extsf{mMDT}} \sim rac{lpha_s \, \mathcal{C}_R}{\pi} \log(1/
ho) \log(1/z_{ extsf{cut}})$$

emission of given mass

$$R'_{
m mMDT} \sim rac{lpha_s \mathcal{C}_R}{\pi} \log(1/z_{
m cut})$$

Smaller  $R \longrightarrow \text{less bkg suppression}$ Smaller  $R' \longrightarrow \text{more bkg suppression}$ 

 $[\mathsf{M.Dasgupta}, \mathsf{A.Fregoso}, \mathsf{S.Marzani}, \mathsf{G.Salam}]$ 



jet mass with a cut  $\tau_{21} < \tau$ :

$$\left. \frac{\rho}{\sigma} \frac{d\sigma}{d\rho} \right|_{<\tau} = R'_{\text{full}} \, \exp(-R_{\text{full}} - R_{\tau})$$

The Sudakov is (roughly) changed from

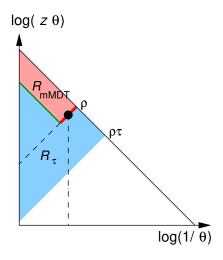
$$R_{\mathsf{full}} \sim rac{lpha_{\mathsf{s}} \, \mathsf{C}_{R}}{2\pi} \, \mathsf{log}^{2}(1/
ho)$$

to

$$rac{ extcolor{R}_{ extcolor{full}} + extcolor{R}_{ au} \sim rac{lpha_s extcolor{C}_R}{2\pi} \log^2(1/
ho au)$$

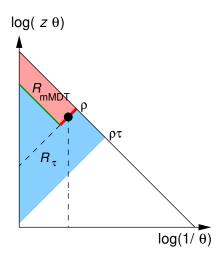
i.e. extra Sudakov suppression

 $[\mathsf{M}.\mathsf{Dasgupta}, \mathsf{L}.\mathsf{Schunk}, \mathsf{GS}]$ 



Ideally we would want:

- a large R Sudakov (like for N-subjettiness)
- a small R' pre-factor (like for mMDT)



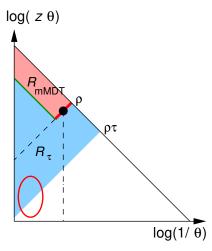
Ideally we would want:

- a large R Sudakov (like for N-subjettiness)
- a small R' pre-factor (like for mMDT)

Achieved by Dichroic N-subjettiness:

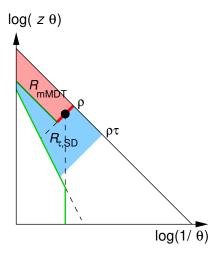
$$\tau_{21}^{(\text{dichroic})} = \frac{\tau_2^{(\text{plain})}}{\tau_2^{(\text{mMDT})}}$$

 $[\mathsf{G}.\mathsf{Salam}, \mathsf{L}.\mathsf{Schunk}, \mathsf{GS}]$ 



#### WATH OUT:

sensitivity to soft-large-angle i.e. UE, pileup, hadr., NGLs ⇒ poor control



#### **SOLUTION:**

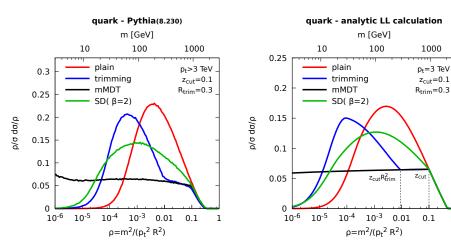
"groom" (remove) that region

Can be done by "SoftDrop"

- smaller suppression
- better control

### Understanding substructure tools

[M.Dasgupta, A.Fregoso S.Marzani, G.Salam, 13] [A.Larkoski, S.Marzani, GS, J.Thaler, 14]



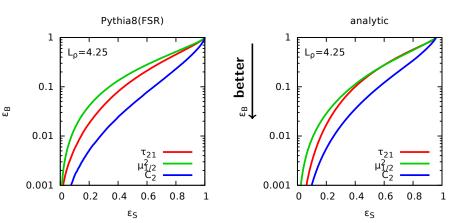
qualitative features reproduced and understood

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## Understanding substructure tools (cont'd)





qualitative features reproduced and understood

## Improving substructure tools

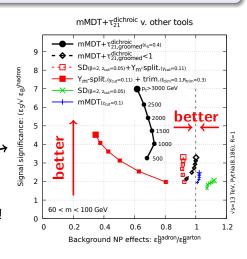
#### More recently: use acquired understanding to develop improved tools

#### Examples:

- Y-splitter+groomong
   Dasgupta,Powling,Schunk,GS,16
- New angles on ECFs
   Moult, Necib, Thaler, 16
- Dichroic *N*-subjettiness

  Salam.Schunk.GS.16

Certainly more of these in the future!



## Rich QCD phenomenology Towards precision physics

## Precision physics

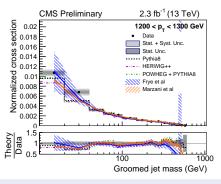
- tools like mMDT and Soft Drop cut soft radiation at large angles
  - $\Rightarrow$  only sensitive to collinear branchings
    - ⇒ process-independent
      - $\Rightarrow$  j in jj same as in Wj or Zj, ...
    - ⇒ small non-perturbative corrections
    - ⇒ amenable to precise calculations
- Recent precise calculations of the mMDDT/SD jet mass:
  - ► NNLL+LO in SCET

    (Frye,Larkoski,Schwartz,Yan; assumes small z<sub>cut</sub>)
  - NLL+NLO in "standard QCD" (Marzani,Schunk,GS; includes (LL) finite z<sub>cut</sub> for mMDT)

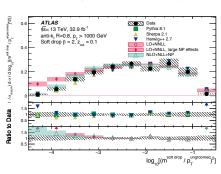
## Precision physics

#### Measurements at the LHC:

#### CMS-PAS-SMP-16-010



#### ATLAS(CERN-EP-2017-231)

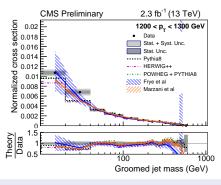


good overall agreement with the data

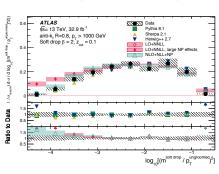
## Precision physics

#### Measurements at the LHC:





#### ATLAS(CERN-EP-2017-231)



good overall agreement with the data

Precise observable with limited sensitivity to NP effects

 $\Rightarrow$  possibility to extract  $\alpha_s$  (on-going study)

## Rich QCD phenomenology Fun facts

Some observales are ill-defined in fixed-order pQCD:

- $z_g$  not defined at  $\mathcal{O}\left(\alpha_S^0\right)$  (only 1 particle in the jet)
- many ratios  $v_2/v_1$  (like  $au_{21}= au_2/ au_1$ ) have  $v_2=v_1=0$  at  $\mathcal{O}\left(lpha_s^0\right)$
- some observables are ill-defined at any fixed order (see next slide)

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but can still be computed perturbatively thanks to resummation Example:  $r = e_{\alpha}/e_{\beta}$  with  $e_{\alpha} = \sum_{i \in \text{iet}} z_i \theta_{i, \text{iet}}^{\alpha}$ 

We can write

$$\frac{dP}{dr} = \int de_{\alpha} de_{\beta} \frac{dP}{de_{\alpha}} \frac{dP}{de_{\beta}} \delta(r - e_{\alpha}/e_{\beta})$$

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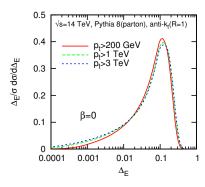
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<u>Idea</u>: the dangerous case  $e_{\beta}=0$  is absent because  $\frac{dP}{de_{\beta}}\to 0$  in that limit (Sudakov exponential)

A series of interesting results still many unknown to be explored

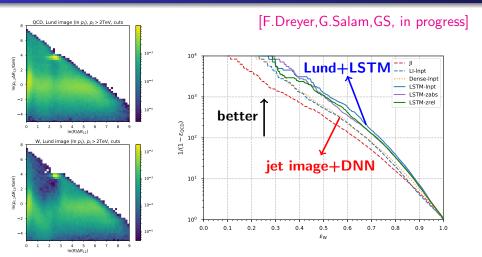
## Curiosities (2/2): $\alpha_s$ independence



LL result: 
$$Prob(<\Delta) = \frac{\log(z_{cut}) + \frac{3}{4}}{\log(\Delta) + \frac{3}{4}}$$

- What are we looking at?
  - jet with momentum p<sub>t,jet</sub>
  - apply mMDT
  - ightharpoonup after,  $p_t = p_{t, \text{mMDT}}$
  - measure  $\Delta = \frac{p_{t,jet} p_{t,mMDT}}{p_{t,jet}}$ i.e. the lost  $p_t$  fraction
- Result: at LL and fixed coupling, the  $\Delta$ distribution is  $\alpha_s$ -independent

## pQCD meets Machine Learning



QCD-motivated input to LSTM network shows great performance

#### Conclusions

#### Jet substructure has gained a lot of importance in the past decade

- Important tool for LHC physics
- exciting pQCD phenomenology
  - understanding and development of tools
  - precision pheno at the LHC
  - interesting structure emerging
- Expansion towards new horizons:
  - heavy-ion hard probes
  - machine learning

BOOST Annual meeting around 100 theorists and experimentalists discussing latest progress in substructure

# BOOST Annual meeting around 100 theorists and experimentalists discussing latest progress in substructure



July 16-20: BOOST 2018 in Paris https://indico.cern.ch/e/boost2018



