

# New perspectives with jet and their substructure

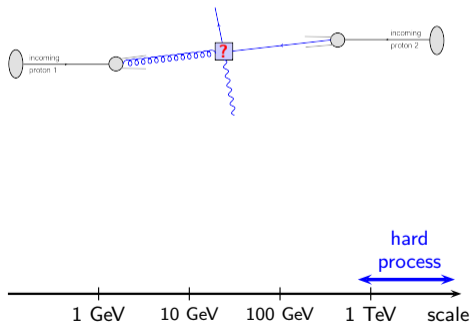
Gregory Soyez

IPhT, CNRS, CEA Saclay

Lepton-Photon 2022, January 10-14 2022

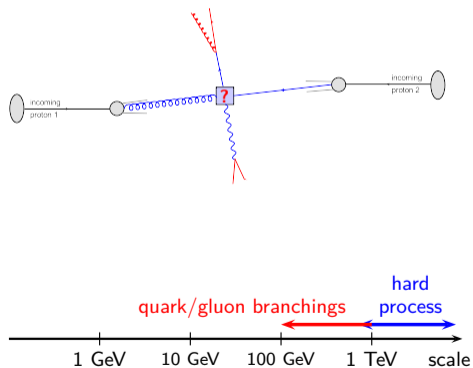
# Anatomy of a high-energy collision

Colliders study fundamental interactions at high energy



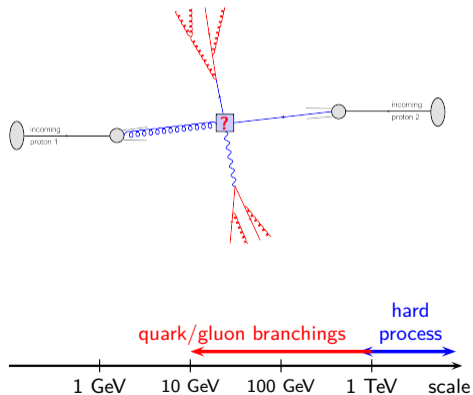
# Anatomy of a high-energy collision

Colliders study fundamental interactions at high energy



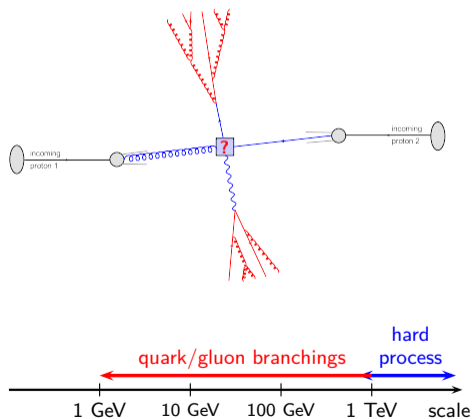
# Anatomy of a high-energy collision

Colliders study fundamental interactions at high energy



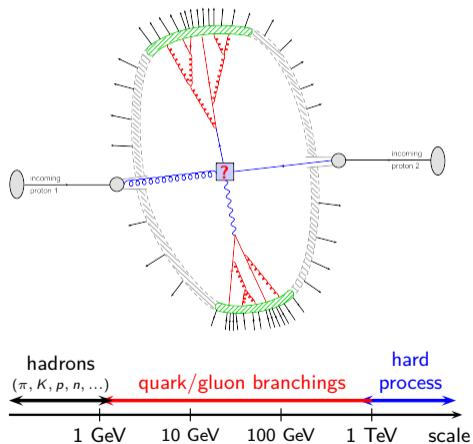
# Anatomy of a high-energy collision

Colliders study fundamental interactions at high energy



# Anatomy of a high-energy collision

## Colliders study fundamental interactions at high energy



### Hard + branchings

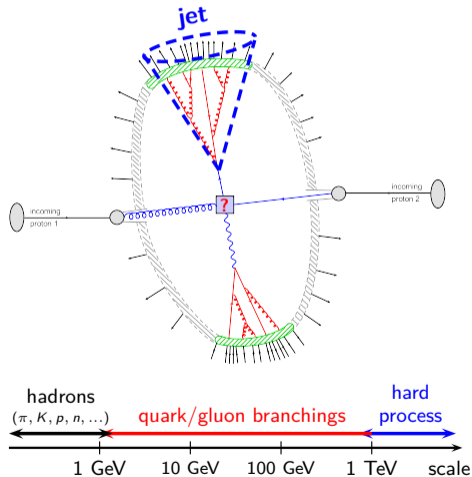
- perturbative QCD
- controlled, solid
- predictive with genuine theory uncertainties

### Hadronisation

- NON-perturbative
- needs modelling
- model-dependent

# Anatomy of a high-energy collision

Colliders study fundamental interactions at high energy



branchings mostly collinear  
(i.e. at small angles)



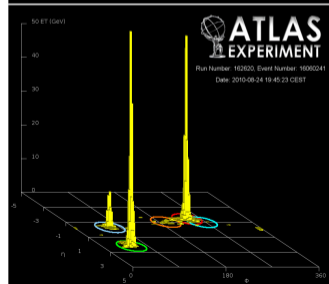
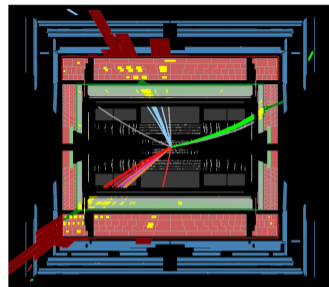
“high-energy parton”  
→ collimated shower of  
particles  $\equiv$  **JET**

**Jet  $\equiv$  proxy to hard parton**

## Central idea

**Jet  $\equiv$  proxy for hard parton**  
 $\Rightarrow$  carries info about the hard collision

- Ubiquitous at the LHC  
used in more than 60% of the analyses
- Reconstructions of jets from particles  
using dedicated **jet algorithms**  
2 main ways to see jets:
  - **QCD branchings**  $\leftrightarrow$  recombination algorithms
  - **Energy flow**  $\leftrightarrow$  cone algorithms
- **Calculable in perturbative QCD (precision effort)**  
Recent progress: NNLO, better PDFs&generators, ...





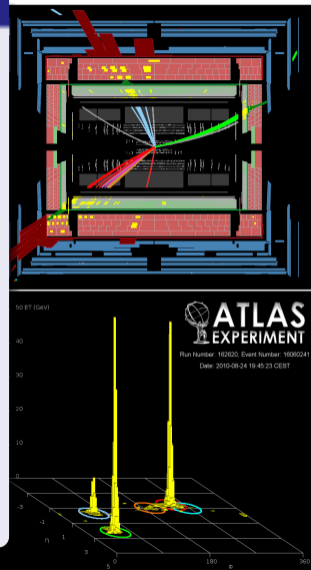
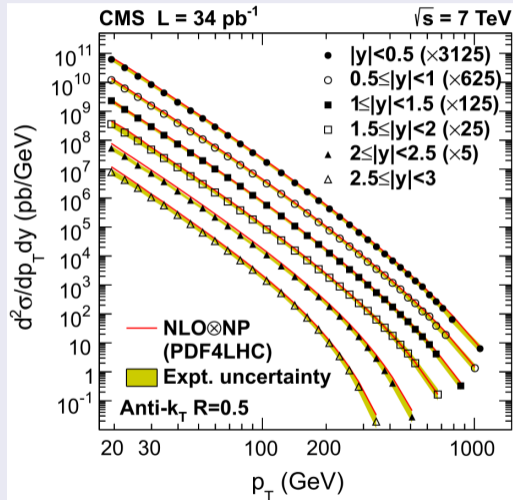
# 40 years of jets for collider phenomenology

## Jet cross-section at the LHC

### Central idea

**Jet**  $\equiv p_T$   
 $\Rightarrow$  carries info

- Ubiquitous at the LHC  
used in more than 60% of analyses
- Reconstructions of jets  
using dedicated jet algorithms
- 2 main ways to see jets  
QCD branching  
Energy
- Calculable in perturbation theory  
Recent progress: NNLO



Jets are used routinely across the whole LHC physics spectrum

(IMHO) Fun/novelties are related to jet **substructure**

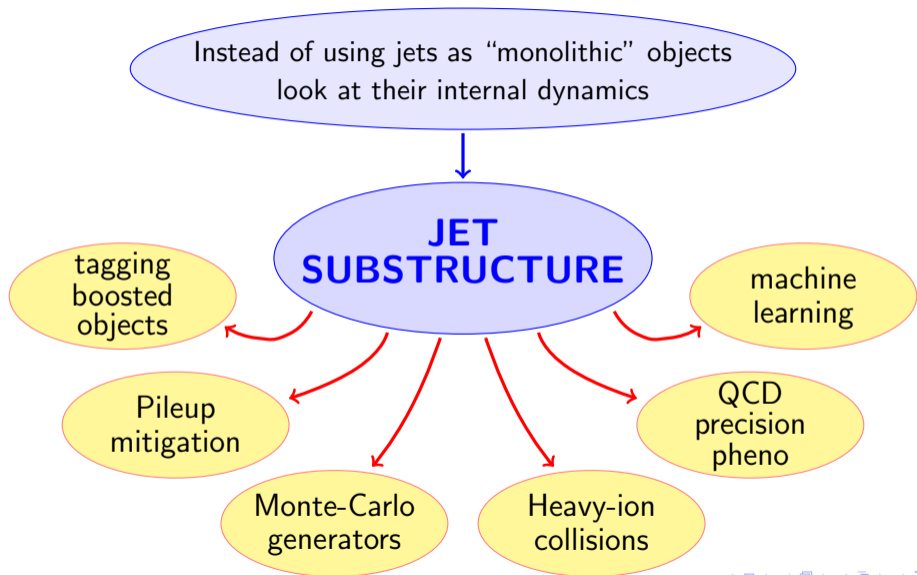
(although this has also become mostly mainstream)

⇒ this talk focuses on jet substructure

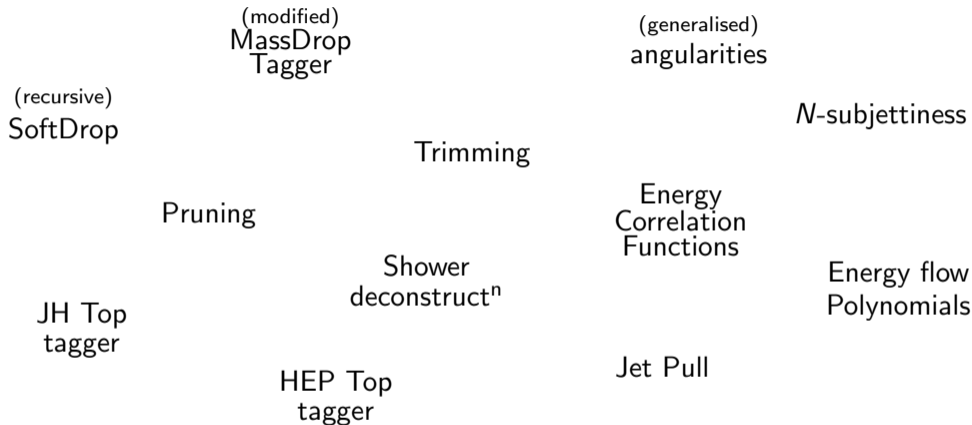
Instead of using jets as “monolithic” objects  
look at their internal dynamics



**JET  
SUBSTRUCTURE**

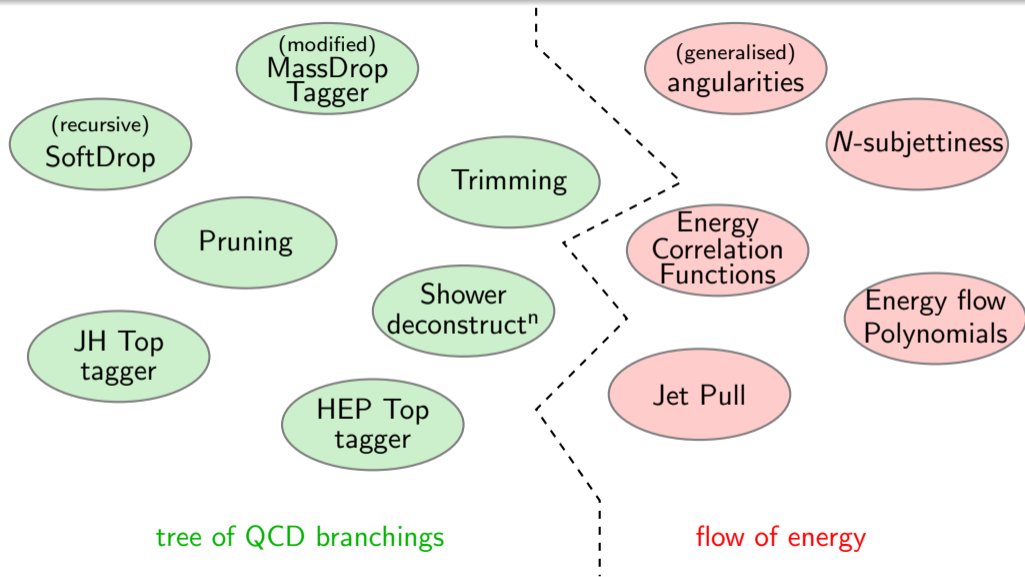


# A decade of substructure tools



\* Non-exhaustive/biased/... list

# A decade of substructure tools

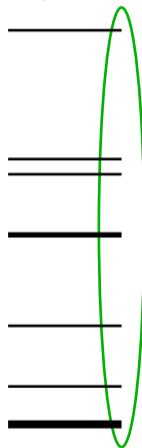


## Main idea of the talk:

focus on a single “view” of a jet  
use it to show applications in each field

# Frequent tool: Cambridge/Aachen (de-)clustering

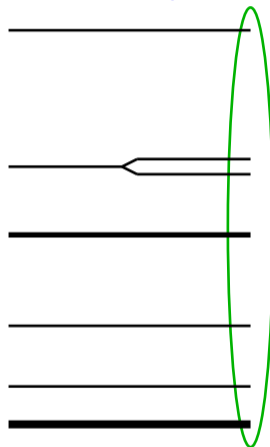
Cambridge/Aachen: iteratively recombine the closest pair





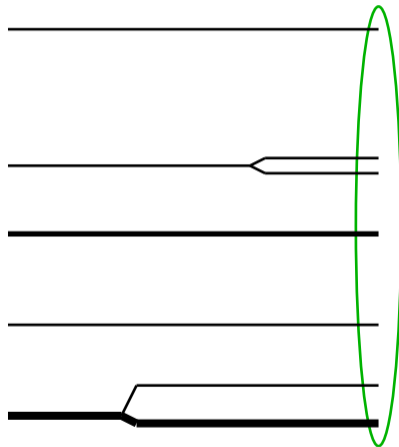
# Frequent tool: Cambridge/Aachen (de-)clustering

Cambridge/Aachen: iteratively recombine the closest pair



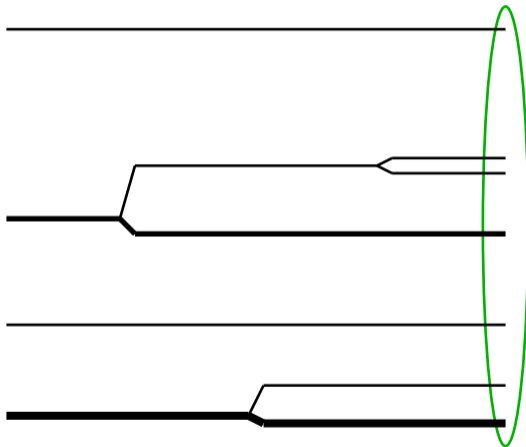
# Frequent tool: Cambridge/Aachen (de-)clustering

Cambridge/Aachen: iteratively recombine the closest pair



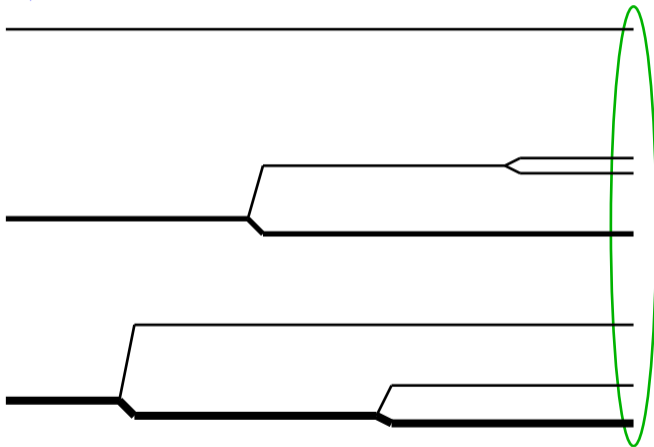
# Frequent tool: Cambridge/Aachen (de-)clustering

Cambridge/Aachen: iteratively recombine the closest pair



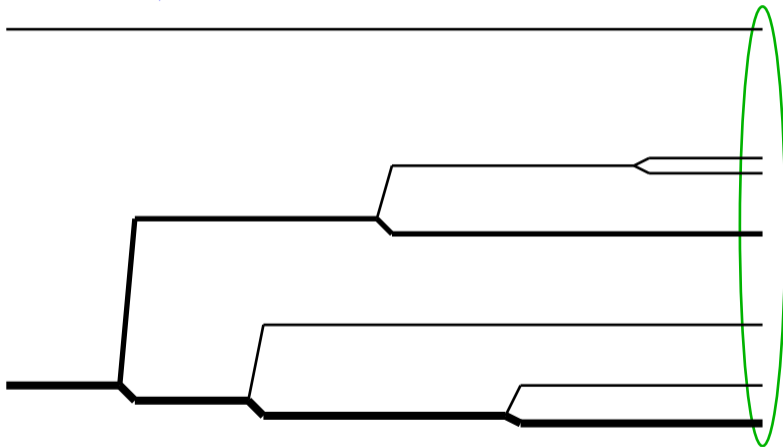
# Frequent tool: Cambridge/Aachen (de-)clustering

Cambridge/Aachen: iteratively recombine the closest pair



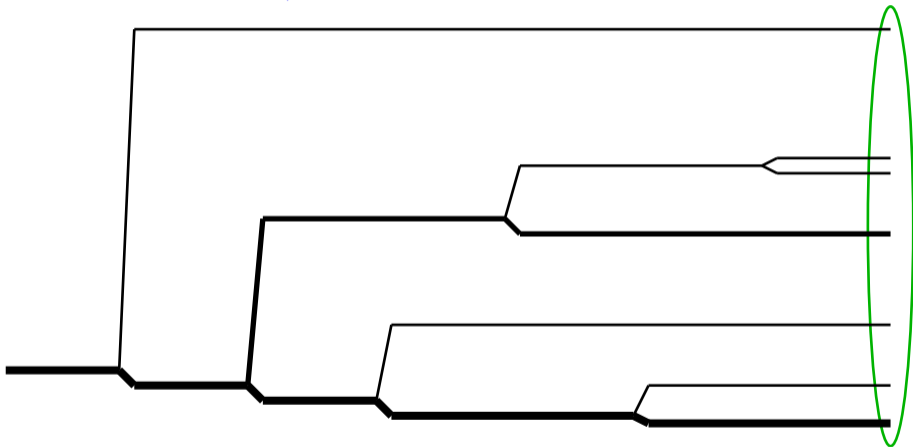
# Frequent tool: Cambridge/Aachen (de-)clustering

Cambridge/Aachen: iteratively recombine the closest pair



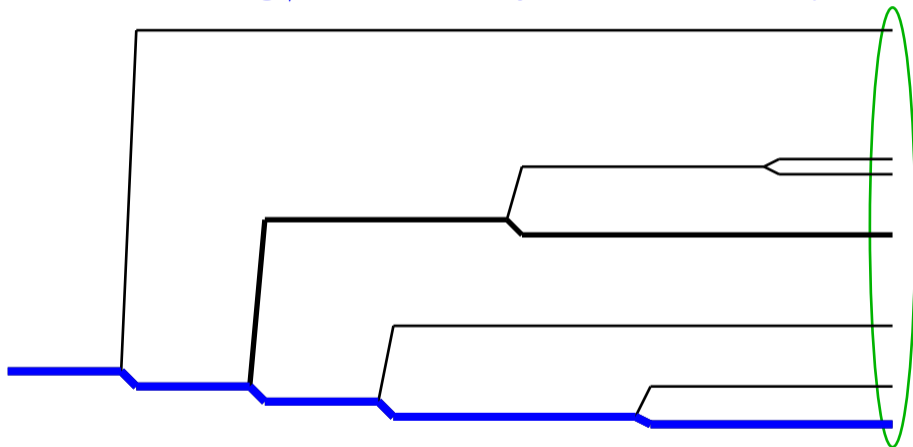
# Frequent tool: Cambridge/Aachen (de-)clustering

Cambridge/Aachen: iteratively recombine the closest pair



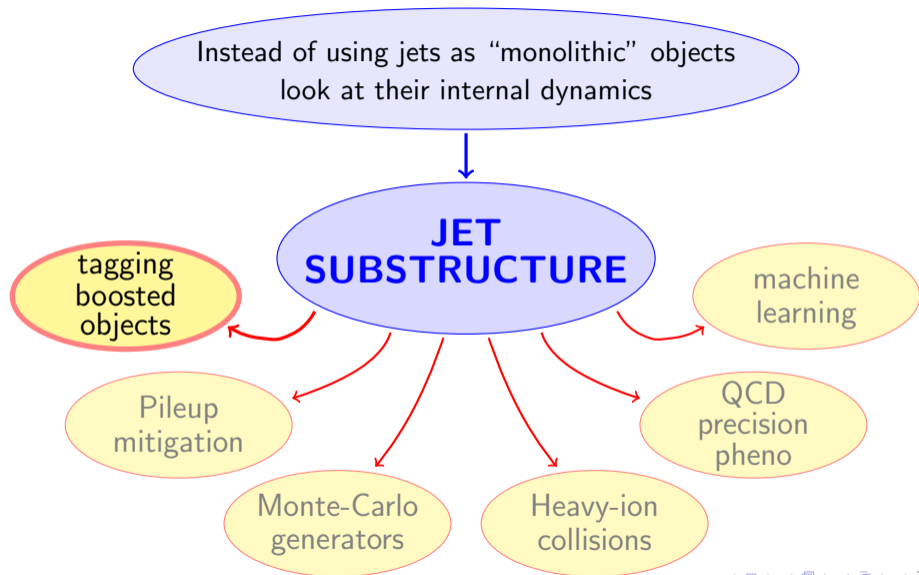
# Frequent tool: Cambridge/Aachen (de-)clustering

Cambridge/Aachen: iteratively recombine the closest pair

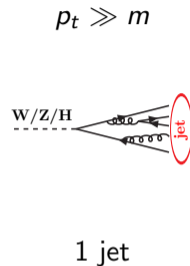
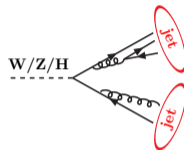
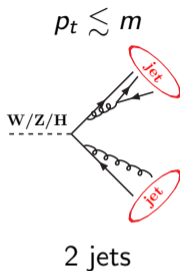


**Idea: this tree structure mimics the partonic branching cascade**

E.g.: conceptually the largest-energy ( $p_t$  or  $z$ ) branch  $\equiv$  emissions from the “leading parton”

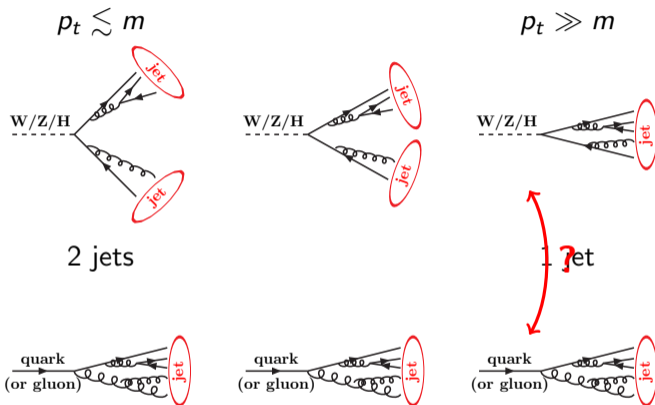






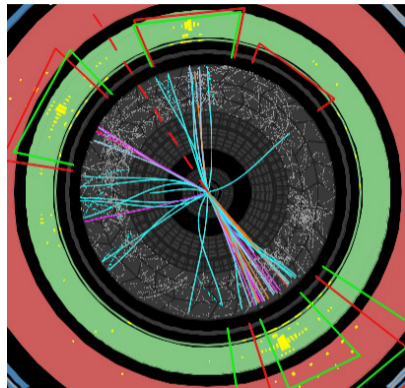
(massive) objects produced boosted (energy  $\gg$  mass) are seen as 1 jet:

$$\theta_{q\bar{q}} \sim \frac{m}{p_t}$$



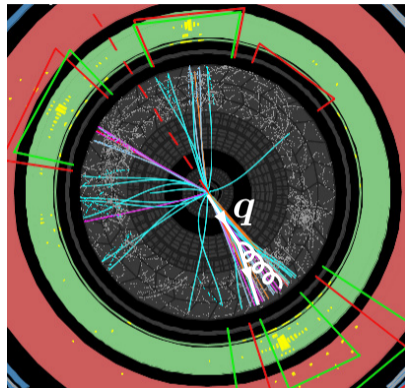
use substructure to separate from QCD jets

What jet do we have here?



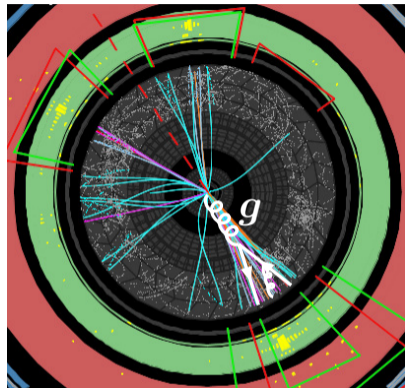
What jet do we have here?

- a quark?



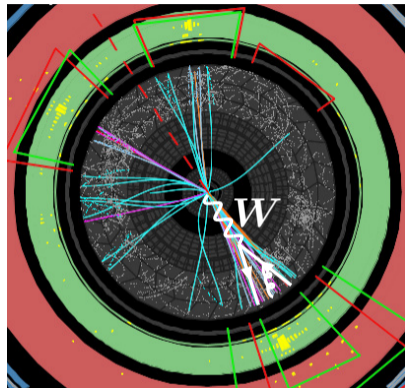
What jet do we have here?

- a quark?
- a gluon?



What jet do we have here?

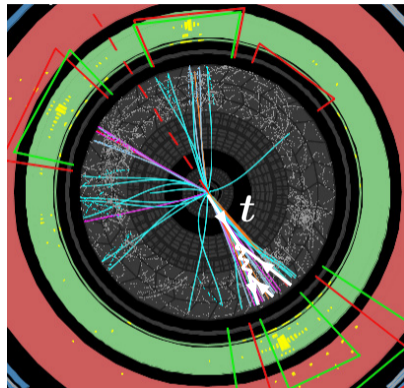
- a quark?
- a gluon?
- a  $W/Z$  (or a Higgs)?



What jet do we have here?

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

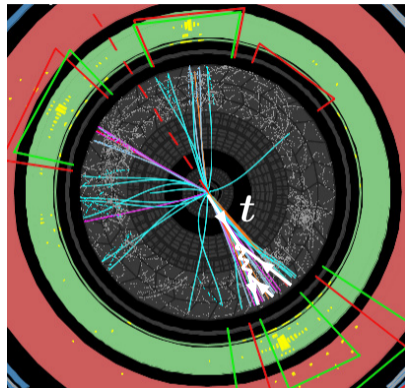
Source: ATLAS boosted top candidate



What jet do we have here?

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

Source: ATLAS boosted top candidate

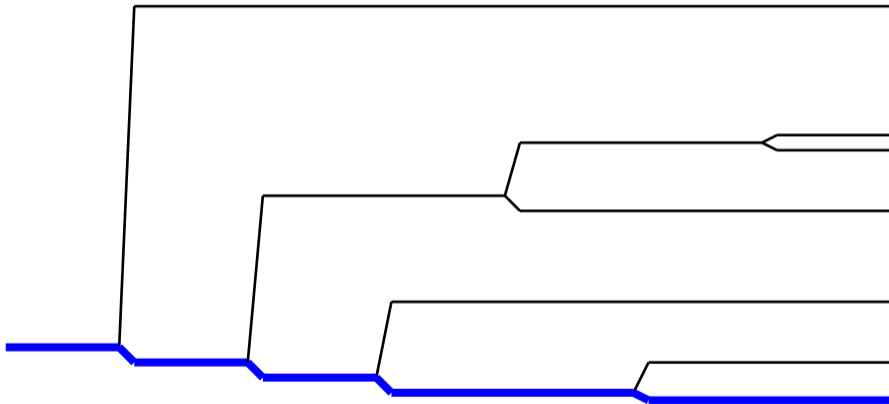


**Goal: properly identify the hard process**

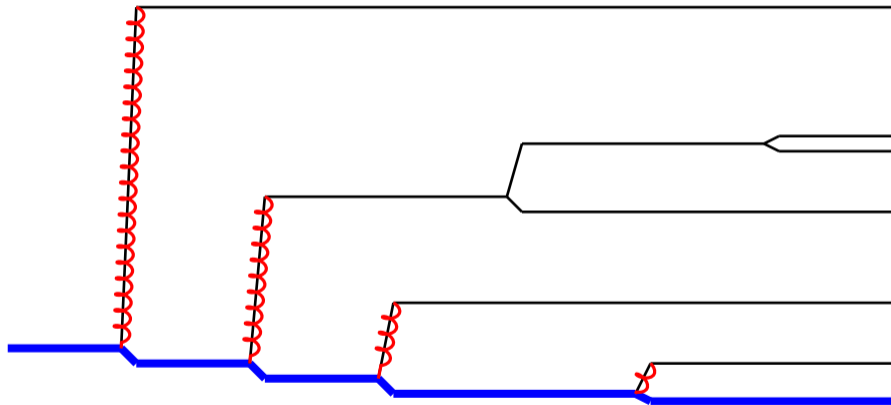
⇒ **Many applications, e.g. relevant to new physics searches**



Idea: look for hard branchings

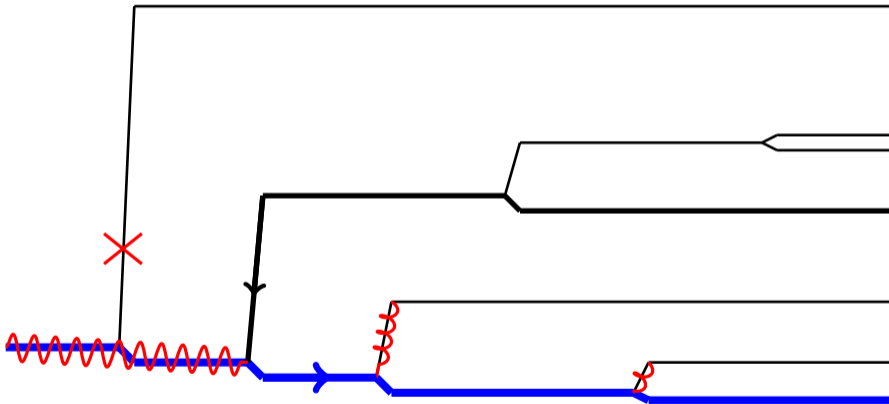


Idea: look for hard branchings



Rare hard branchings for  $q/g \rightarrow q/g + g$  ( $P(z) \sim 1/z$ )

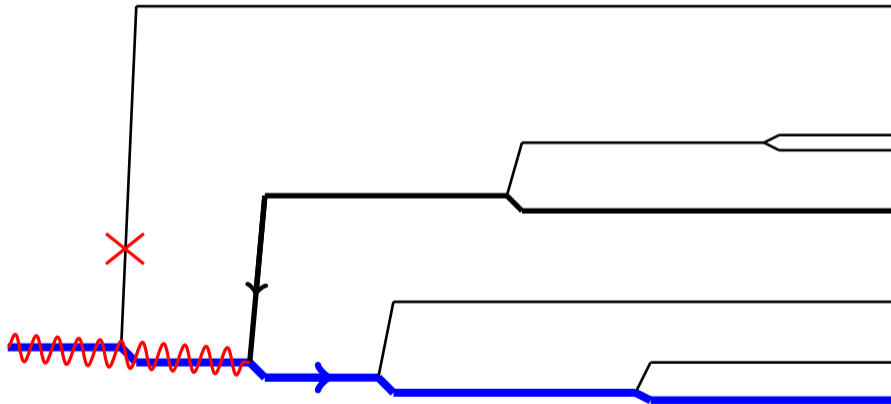
Idea: look for hard branchings



Rare hard branchings for  $q/g \rightarrow q/g + g$  ( $P(z) \sim 1/z$ )

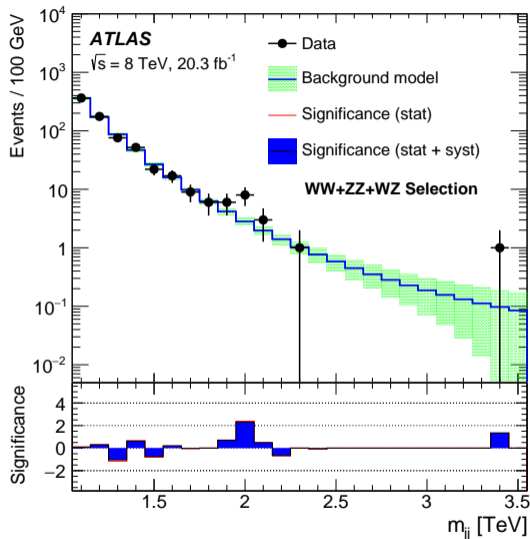
Frequent hard branchings for  $W/Z/H \rightarrow q\bar{q}$  ( $P(z) \sim 1$ ) + less radiation at large angles

Idea: look for hard branchings

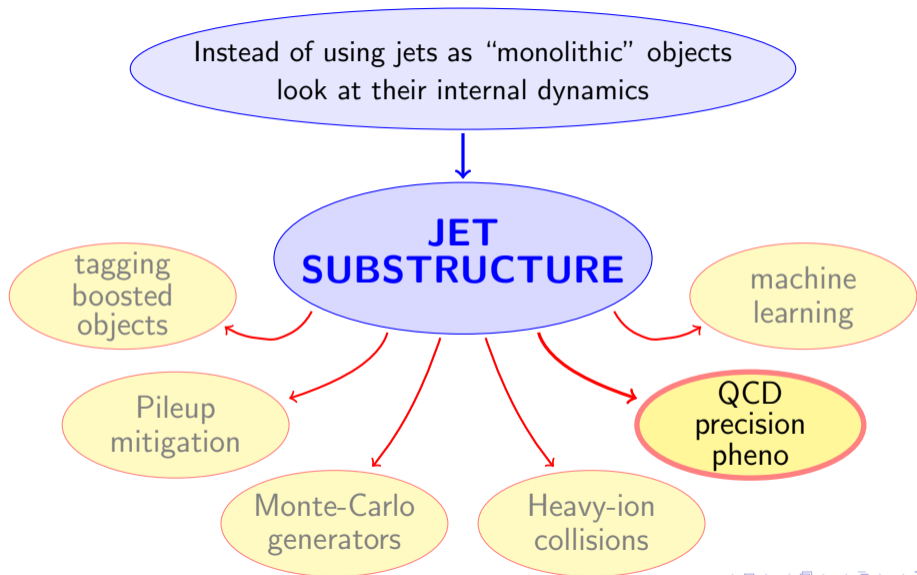


Method: search the first splitting with  $z > z_{\text{cut}}$  (+ constrain large-angle radiation)

# Searches and measurements

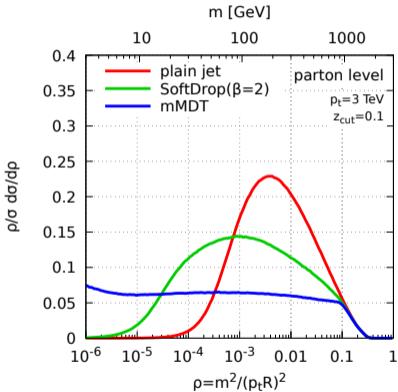


(now-gone) di-boson excess (end of Run-I)

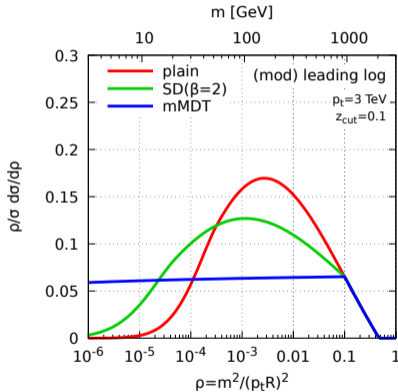


## Breakthrough 7-9 years ago: jet substructure tools are calculable

quark - Pythia (8.230)



quark - analytic

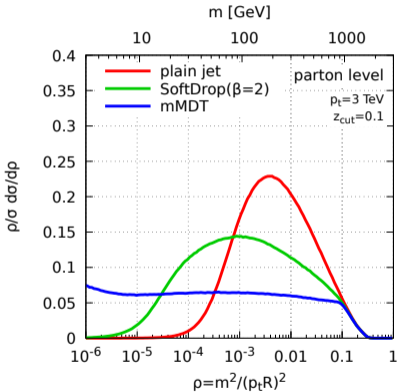


- qualitative features reproduced and understood

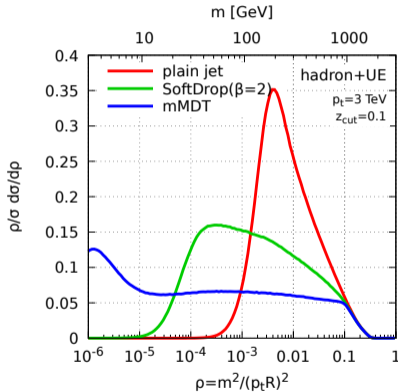
Suited for precision QCD

## Breakthrough 7-9 years ago: jet substructure tools are calculable

quark - Pythia (8.230)



quark - analytic



- qualitative features reproduced and understood

Suited for precision QCD

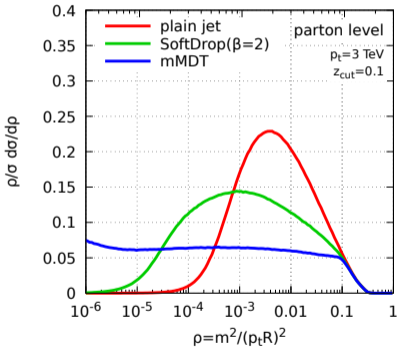


## Breakthrough 7-9 years ago: jet substructure tools are calculable

quark - analytic

m [GeV]

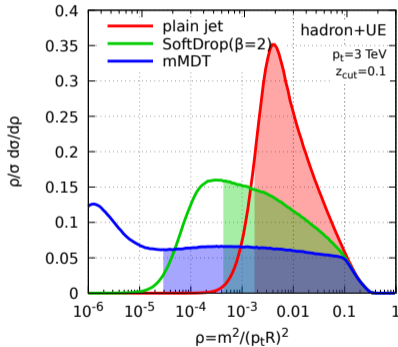
10 100 1000



quark - Pythia (8.230)

m [GeV]

10 100 1000



- qualitative features reproduced and understood
- substructure reduces non-perturbative effects

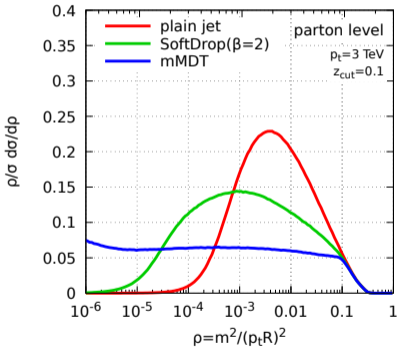
Suited for precision QCD

## Breakthrough 7-9 years ago: jet substructure tools are calculable

quark - analytic

m [GeV]

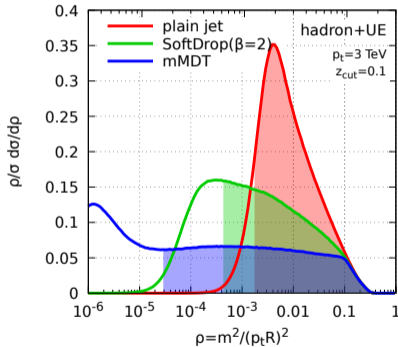
10 100 1000



quark - Pythia (8.230)

m [GeV]

10 100 1000



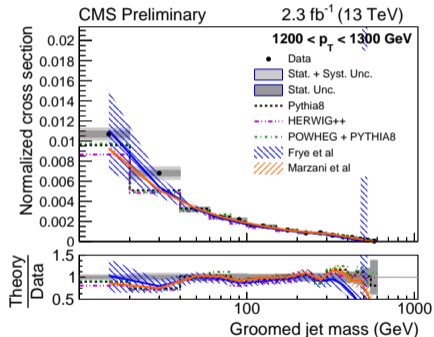
- qualitative features reproduced and understood
- substructure reduces non-perturbative effects

Suited for precision QCD

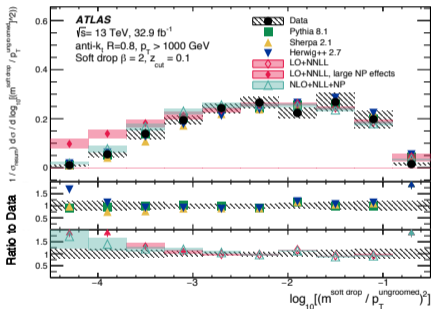
For QCDists: boosted  $\Rightarrow p_t \gg m \Rightarrow$  all-orders resummation of  $\alpha_s^n \log^n(p_t R/m)$ .

LHC measurements v. NLL+NLO and NNLL+LO predictions:

CMS-PAS-SMP-16-010



ATLAS(CERN-EP-2017-231)

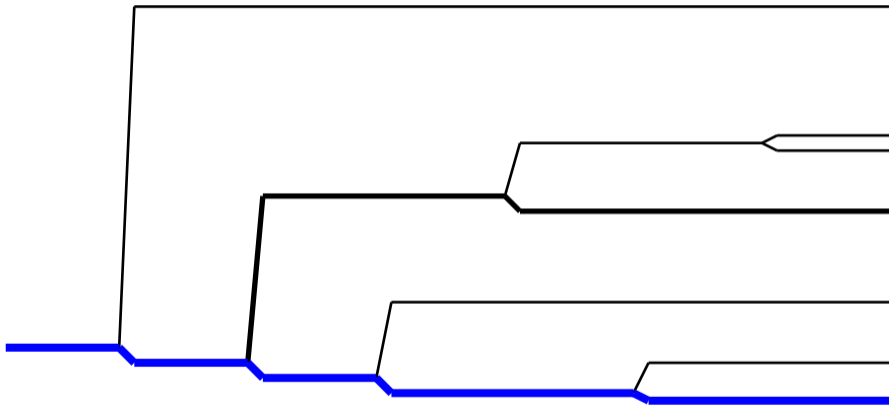


good overall agreement with the data

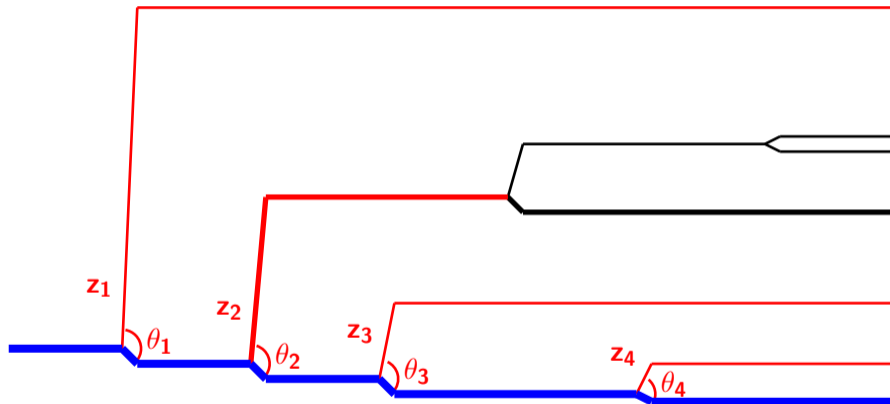
See also [arXiv:2109.03340] for a recent CMS measurement

Interesting question: Precise observable, limited NP effects  $\Rightarrow$  can we extract  $\alpha_s$ ?

# Visualising the substructure with the Lund plane



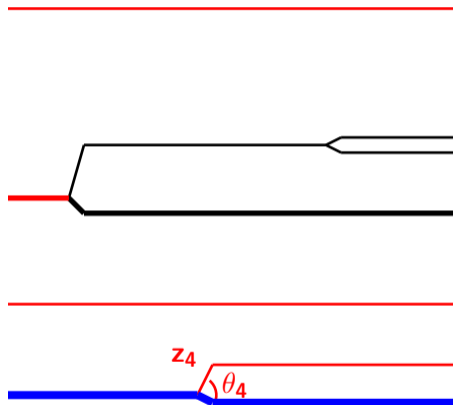
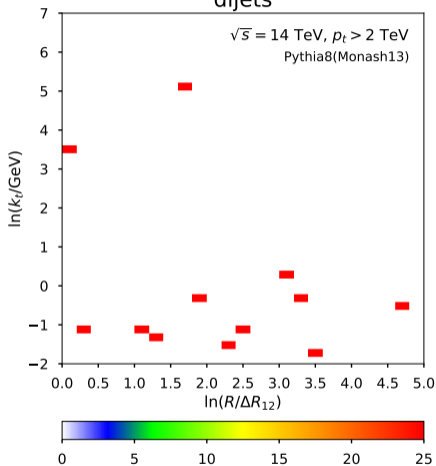
# Visualising the substructure with the Lund plane



Consider all the emissions from the hardest branch:  $\{(z_1, \theta_1), \dots, (z_n, \theta_n)\}$

# Visualising the substructure with the Lund plane

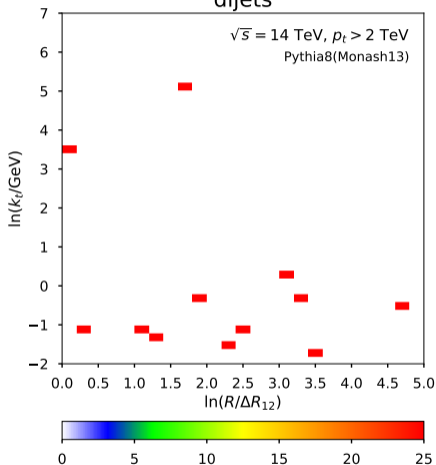
One jet  
dijets



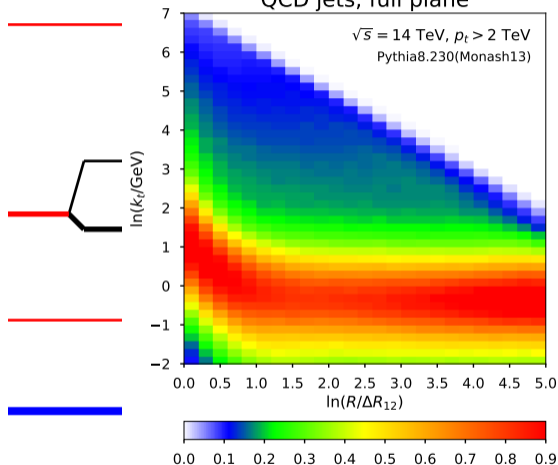
Consider all the emissions from the hardest branch:  $\{(z_1, \theta_1), \dots, (z_n, \theta_n)\}$   
Put them in the Lund plane

# Visualising the substructure with the Lund plane

One jet  
dijets

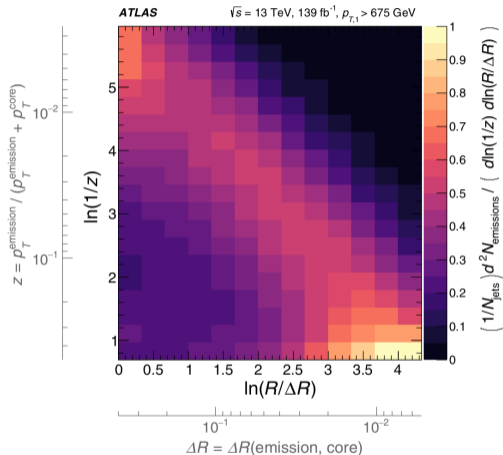


Average over jets  
QCD jets, full plane

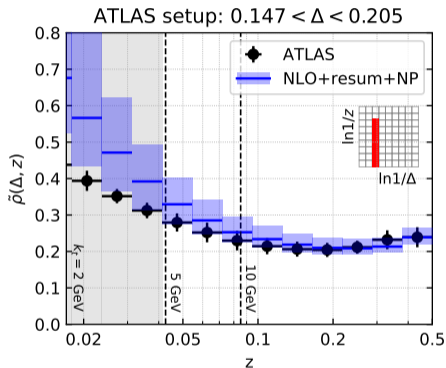


Consider all the emissions from the hardest branch:  $\{(z_1, \theta_1), \dots, (z_n, \theta_n)\}$   
Put them in the Lund plane

# Measured by ATLAS + compared to QCD analytics

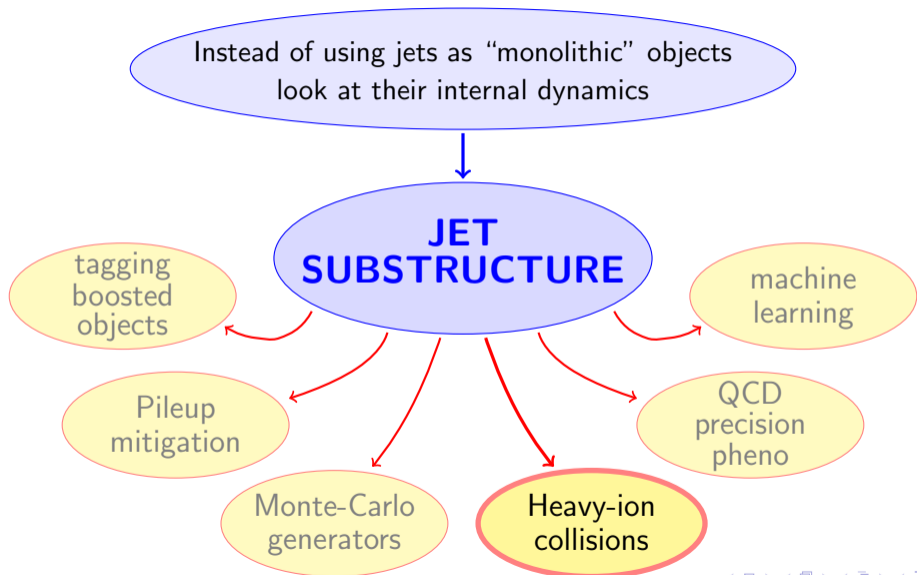


[ATLAS, CERN-EP-2020-030]

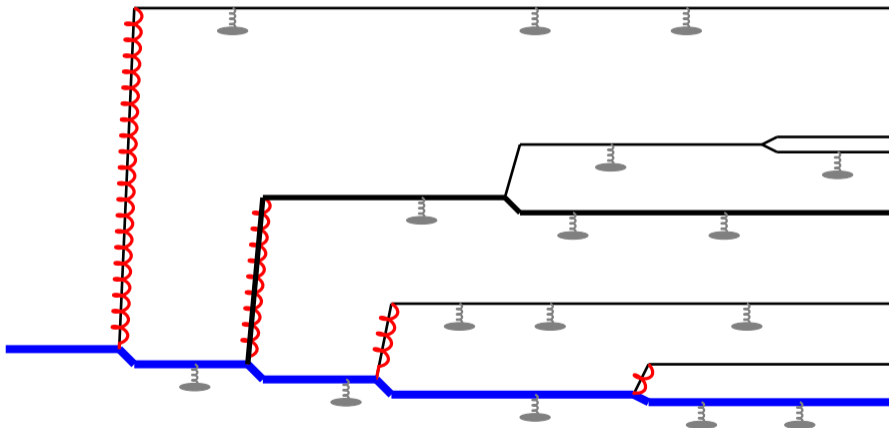


[A.Lifson, G.Salam, GS, 07]





Idea: interaction with the quark-gluon plasma

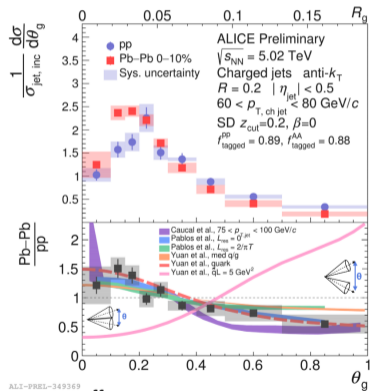
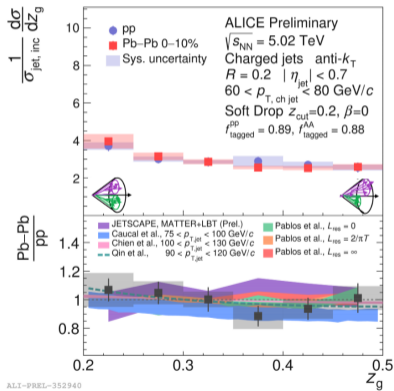


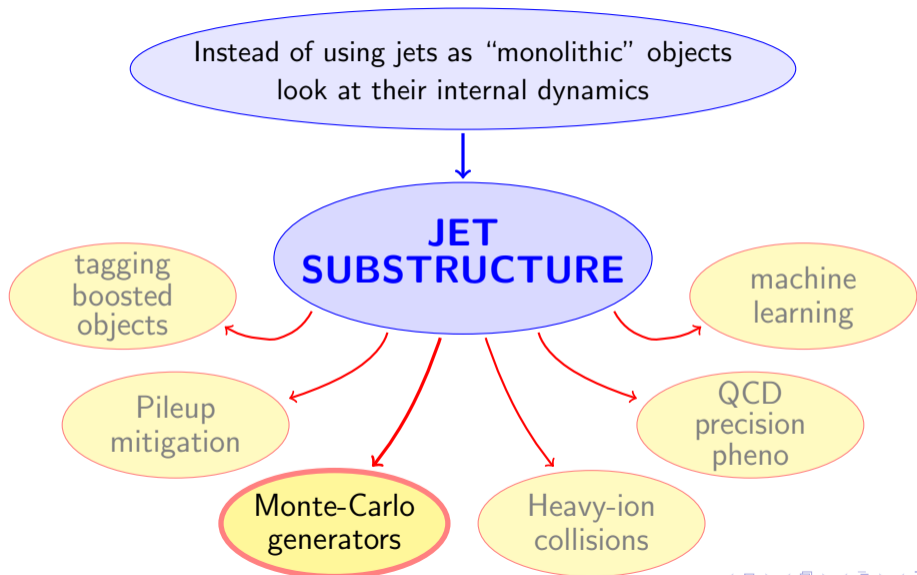
the quark-gluon plasma affects QCD radiation  $\Rightarrow$  study through jet substructure

# Recent measurement by the Alice collaboration

Lots of recent activity (experimentally, theoretically, phenomenologically, ...)

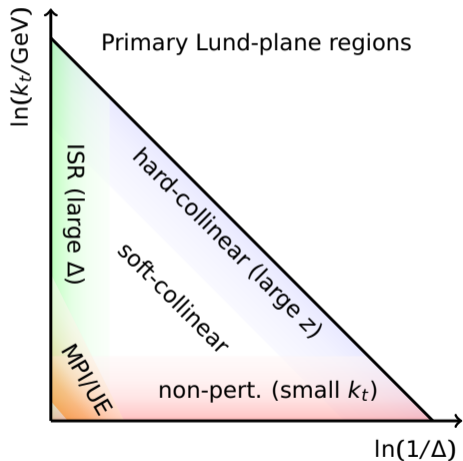
Just one example here: energy fraction and splitting angle of a hard splitting in the jet





# Substructure for MC development

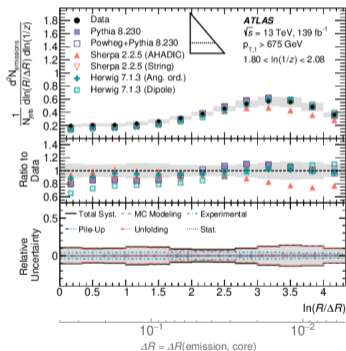
Main idea: MC generators simulate QCD dynamics, substructure probes QCD dynamics



# Substructure for MC development

Main idea: MC generators simulate QCD dynamics, substructure probes QCD dynamics

direct comparison  
between data and MC

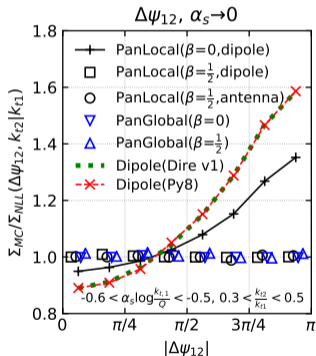
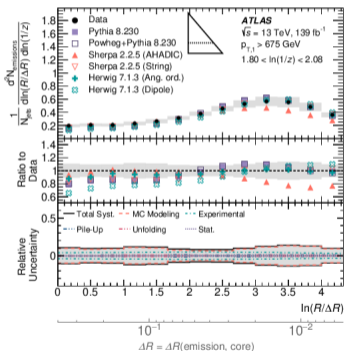


# Substructure for MC development

Main idea: MC generators simulate QCD dynamics, substructure probes QCD dynamics

direct comparison  
between data and MC

observables for  
MC accuracy



PanScales NLL showers:  
 $e^+e^-$ , colour, spin, soft spin

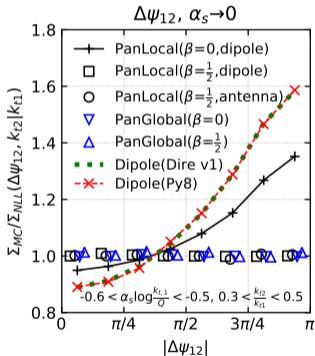
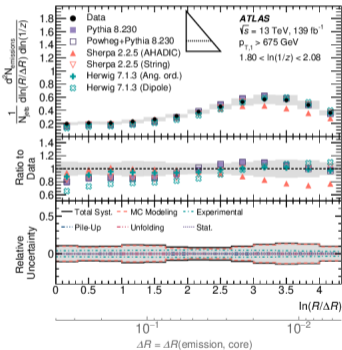
# Substructure for MC development

Main idea: MC generators simulate QCD dynamics, substructure probes QCD dynamics

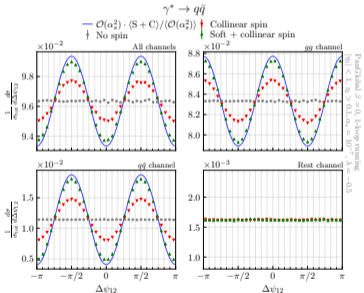
direct comparison  
between data and MC

observables for  
MC accuracy

fringe benefits: NLL resum  
of spin-dependent observables



PanScales NLL showers:  
 $e^+e^-$ , colour, spin, soft spin





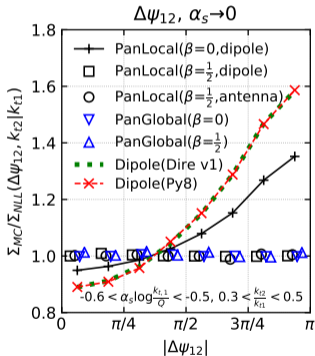
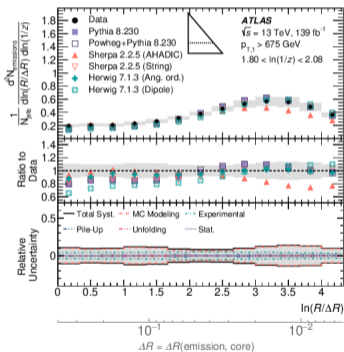
# Substructure for MC development

Main idea: MC generators simulate QCD dynamics, substructure probes QCD dynamics

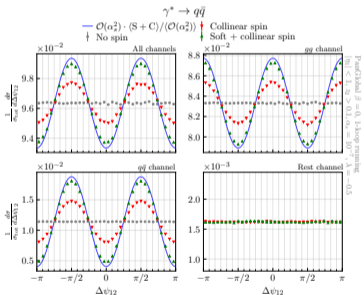
direct comparison  
between data and MC

observables for  
MC accuracy

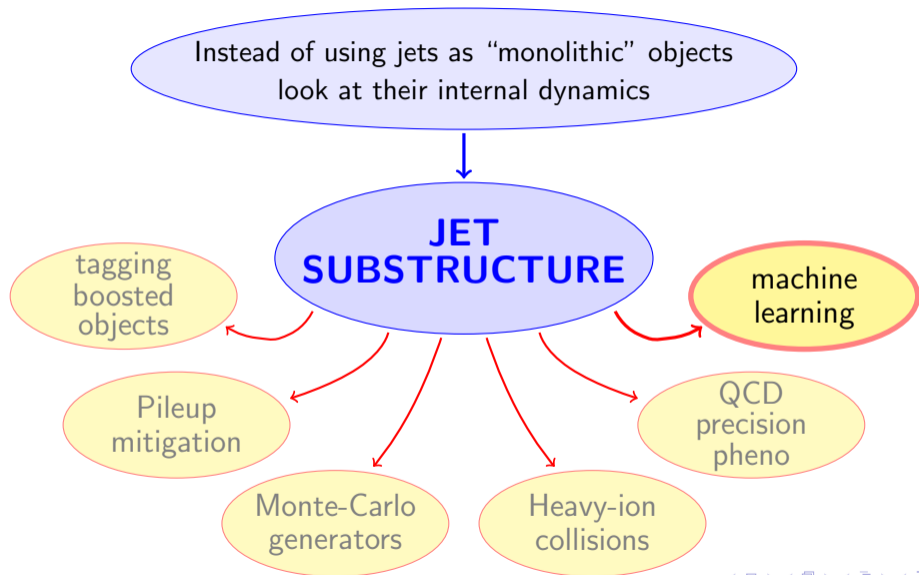
fringe benefits: NLL resum  
of spin-dependent observables



PanScales NLL showers:  
 $e^+e^-$ , colour, spin, soft spin



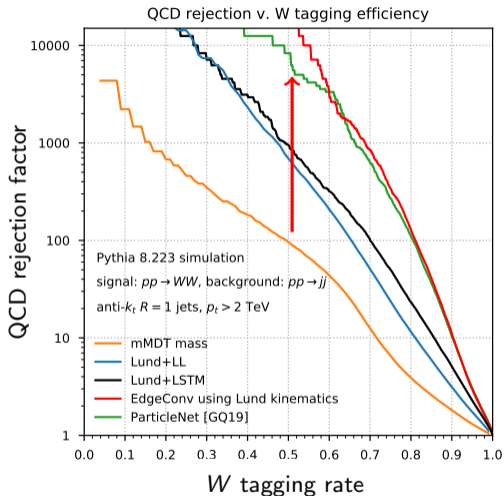
Beyond the “pure QCD interest”: better MCs  $\Rightarrow$  less modelling uncert.  $\Rightarrow$  improved searches



# The Machine-Learning revolution

- Deep Learning is now almost everywhere in high-energy physics
- substructure among pioneers ( $\gtrsim 5$  years ago)
- Most typical example: boosted jet tagging: discriminate “signal” from “background” jets  $W/Z/H/t$  v. QCD;  $q$  v.  $g$ ,  $b$  tagging, ...

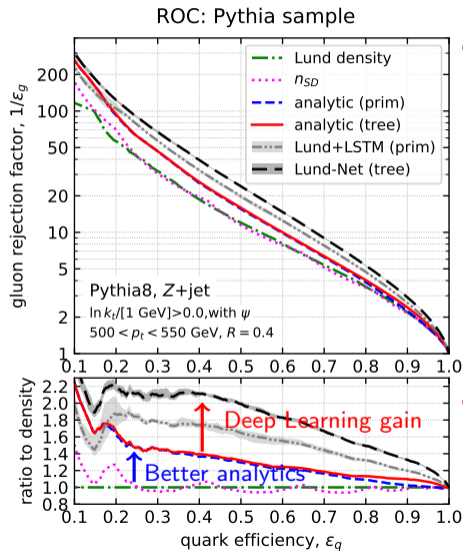
Large gains compared to “standard” techniques



[plot from Frederic Dreyer]

# The Machine-Learning revolution

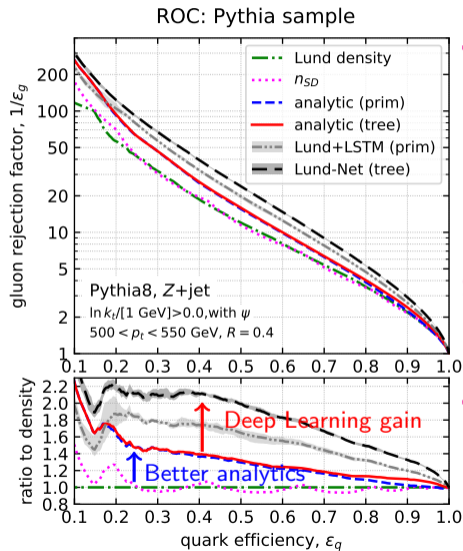
- Deep Learning is now almost everywhere in high-energy physics
- substructure among pioneers ( $\gtrsim 5$  years ago)
- Most typical example: boosted jet tagging: discriminate “signal” from “background” jets  $W/Z/H/t$  v. QCD;  $q$  v.  $g$ ,  $b$  tagging, ...



[F. Dreyer, GS, A. Takacs, 2112.09140]

# The Machine-Learning revolution

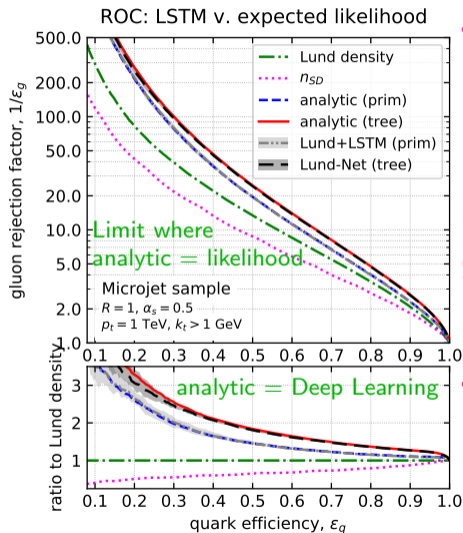
- Deep Learning is now almost everywhere in high-energy physics
- substructure among pioneers ( $\gtrsim 5$  years ago)
- Most typical example: boosted jet tagging: discriminate “signal” from “background” jets  $W/Z/H/t$  v. QCD;  $q$  v.  $g$ ,  $b$  tagging, ...
- Huge list of studies beyond this
  - applications beyond boosted tagging
  - different inputs (observables, 4-vectors, images, ...)
  - different architectures



[F. Dreyer, G.S., A. Takacs, 2112.09140]

# The Machine-Learning revolution

- Deep Learning is now almost everywhere in high-energy physics
- substructure among pioneers ( $\gtrsim 5$  years ago)
- Most typical example: boosted jet tagging: discriminate “signal” from “background” jets  $W/Z/H/t$  v. QCD;  $q$  v.  $g$ ,  $b$  tagging, ...
- Huge list of studies beyond this
  - applications beyond boosted tagging
  - different inputs (observables, 4-vectors, images, ...)
  - different architectures
- some attempts to understand what goes on in the black box
  - e.g. assess uncertainties, hints of IRC safety, understand what is learned, analytic insight



[F. Dreyer, G.S. Takacs, 2112.09140]

## Take-home messages

- **Jets are everywhere at colliders (from before LEP to after LHC)**
- **Substructure is now mainstream and is here to stay**
  - **Window on searches for new physics**
  - **Useful tool to learn about QCD**
- **Wide range of applications (Taggers, pQCD, HI, MC, ML)**

## Looking towards the future

- Jet substructure has often been a playground for new ideas
- Expect more analyses with boosted jets
- Hope for more (unfolded) substructure measurements
- Stay tuned for more deep-learning applications
- More? See [these lecture notes](#) (arXiv:1901.10342) and **BOOST (2020, 2021) talks**