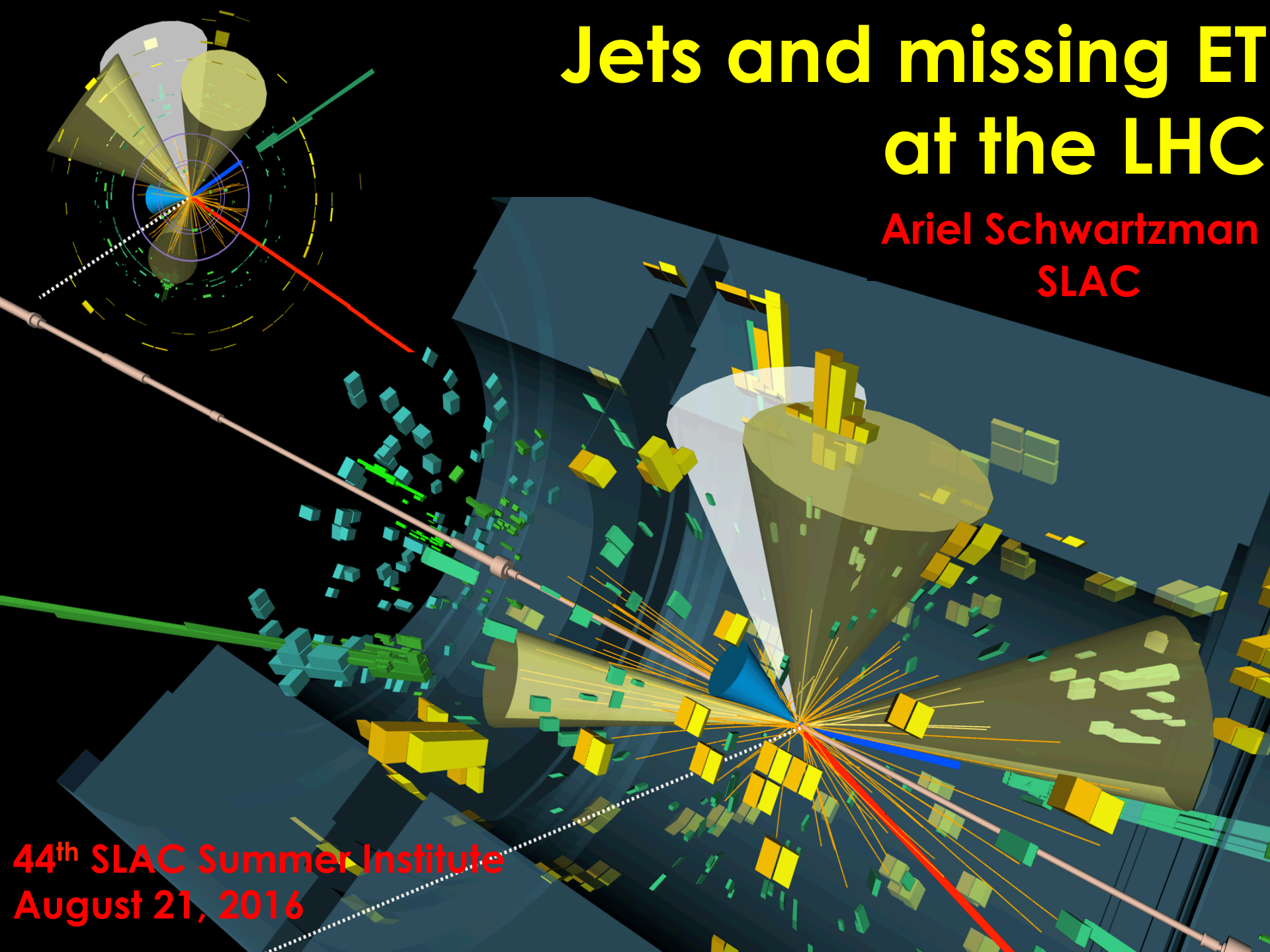


# Jets and missing ET at the LHC

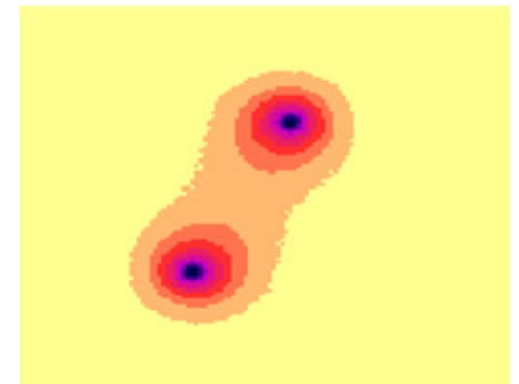
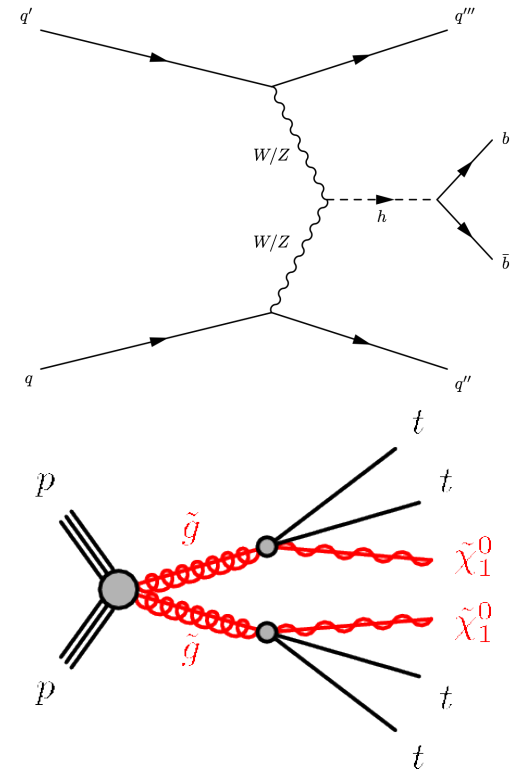
Ariel Schwartzman  
SLAC



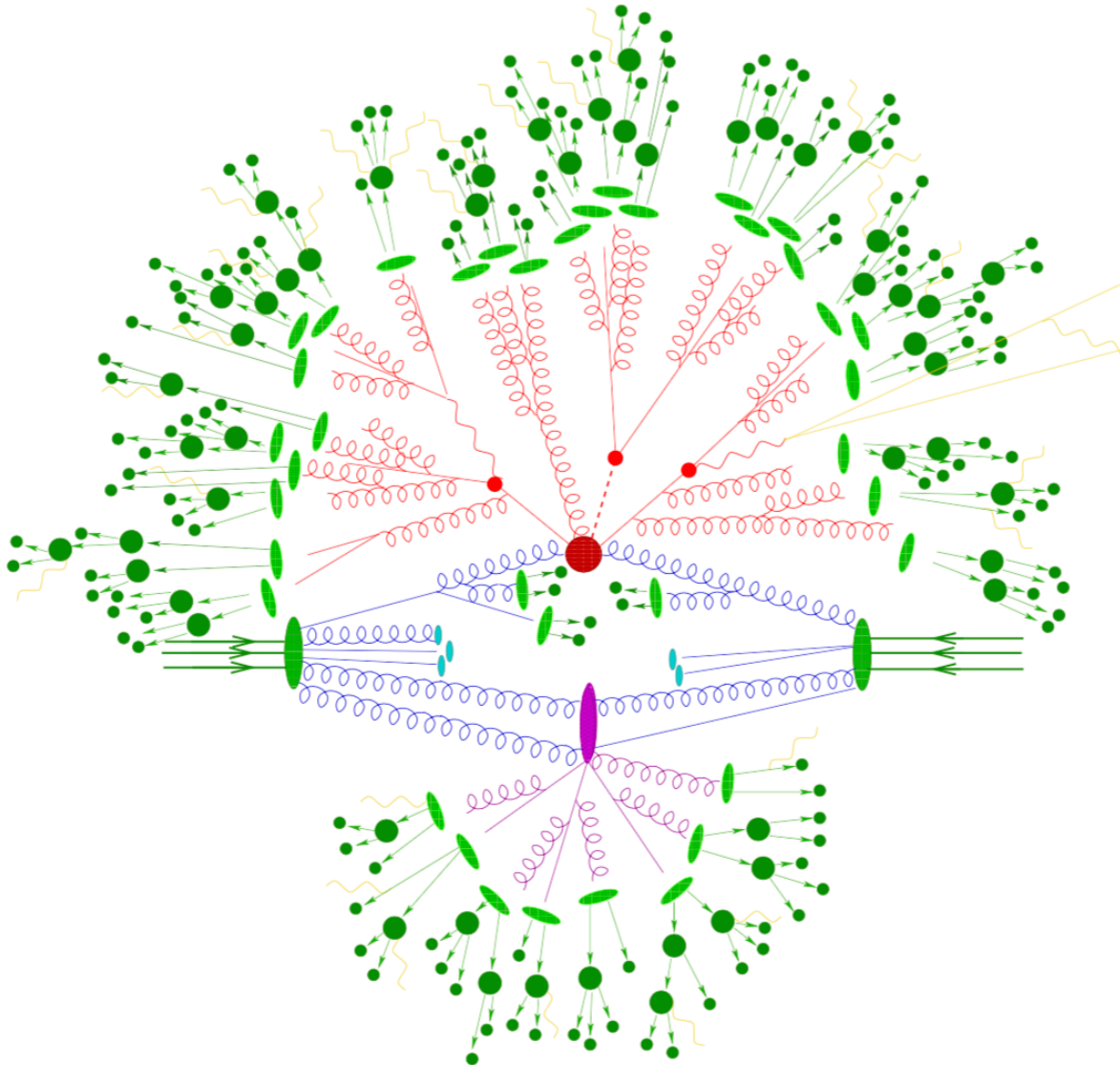
44<sup>th</sup> SLAC Summer Institute  
August 21, 2016

# Jets and Missing ET

- Jets are one of the most prominent physics signatures at high energy colliders
- Individual jets are proxies for quark and gluons
- Combinations of jets are used to identify heavy electroweak particles (W,Z,H bosons and the top quark)
  - crucial signatures for searches of new phenomena and precision measurements
- Jets have internal structure: quantum properties

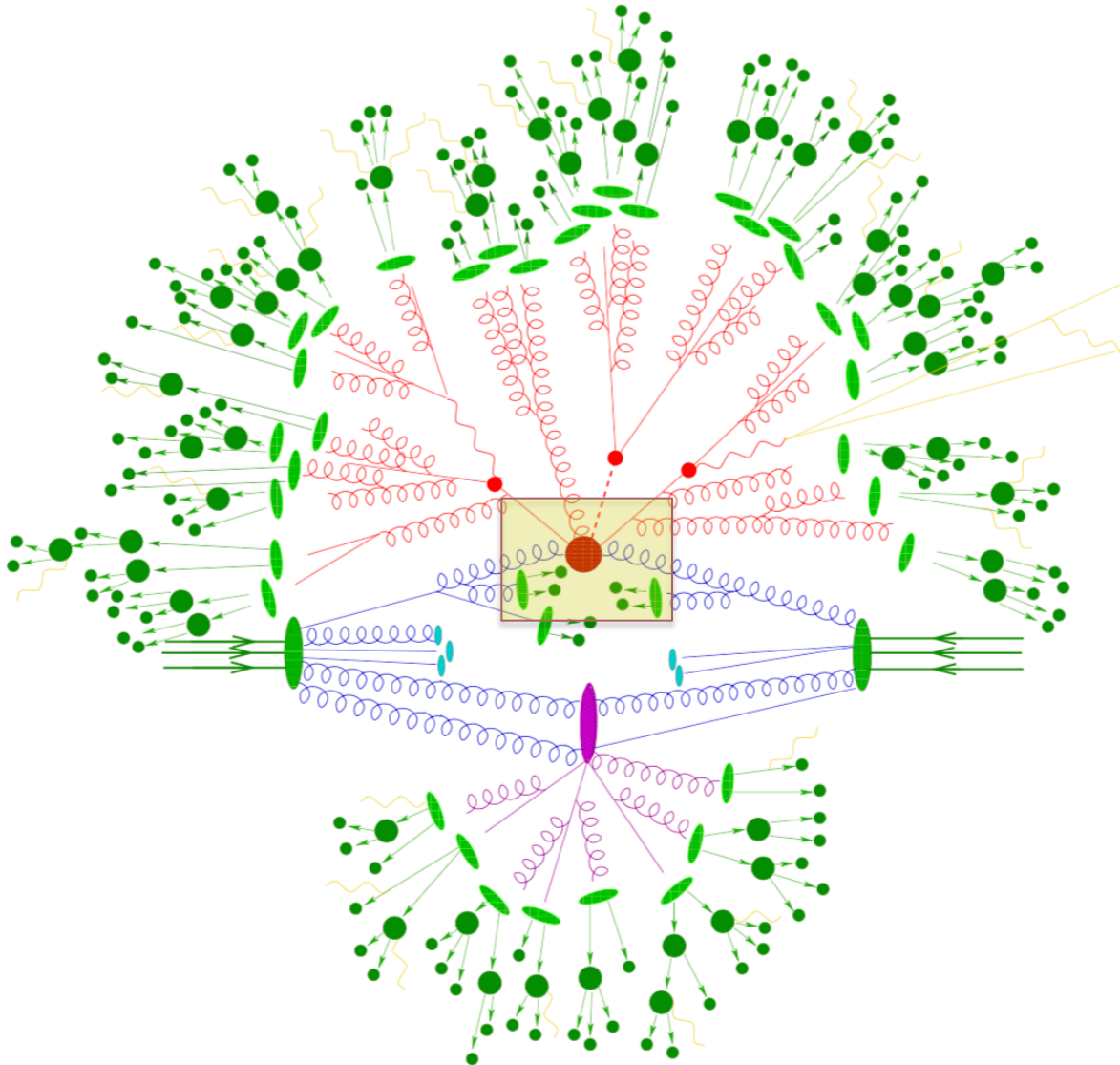


# Jets and jet algorithms (I)



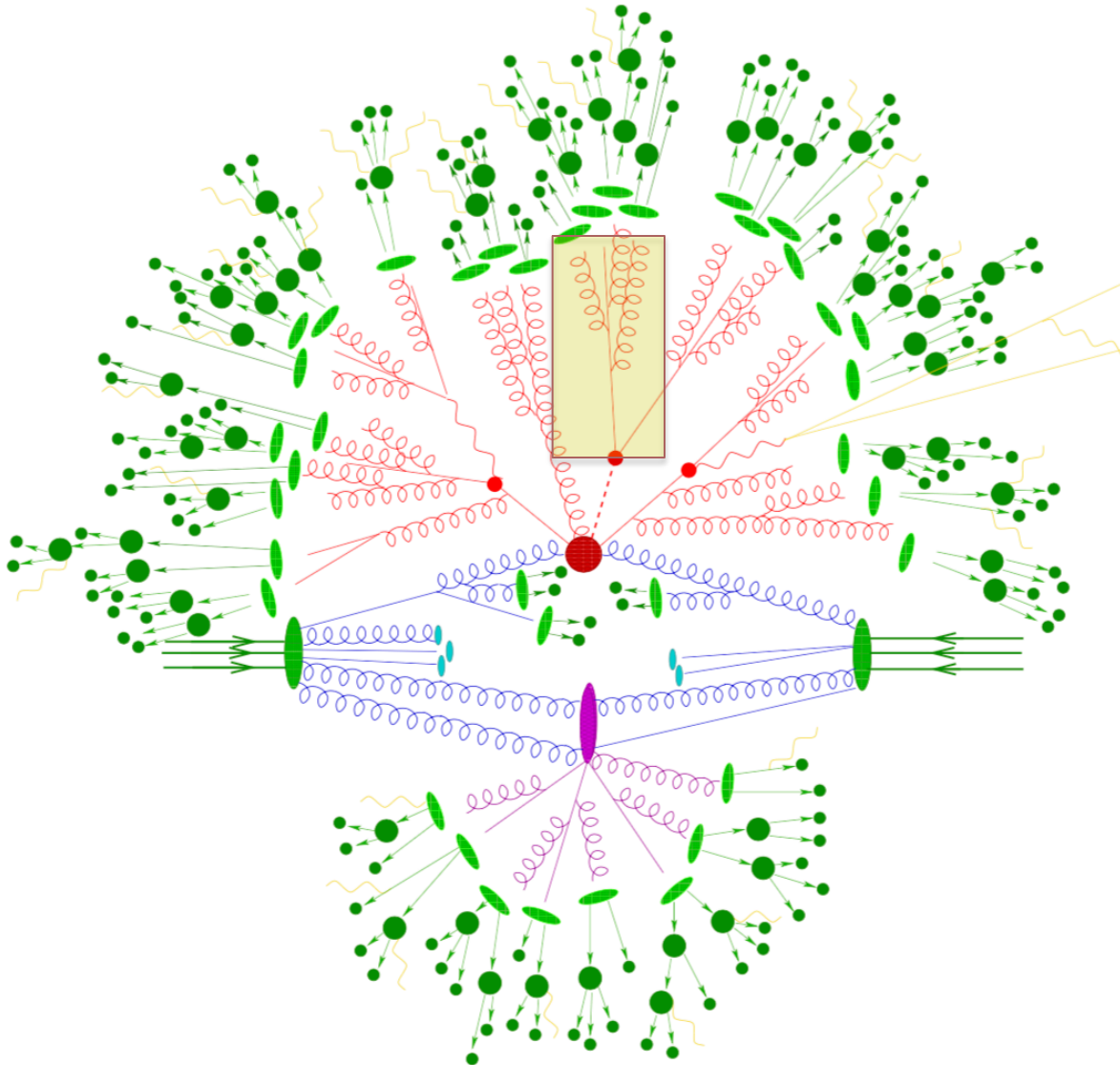
- Quark and gluons (partons) produced at short distances (hard process)
- As they propagate they radiate more partons (parton shower)
- Form uncolored hadrons (hadronization)

# Jets and jet algorithms (I)



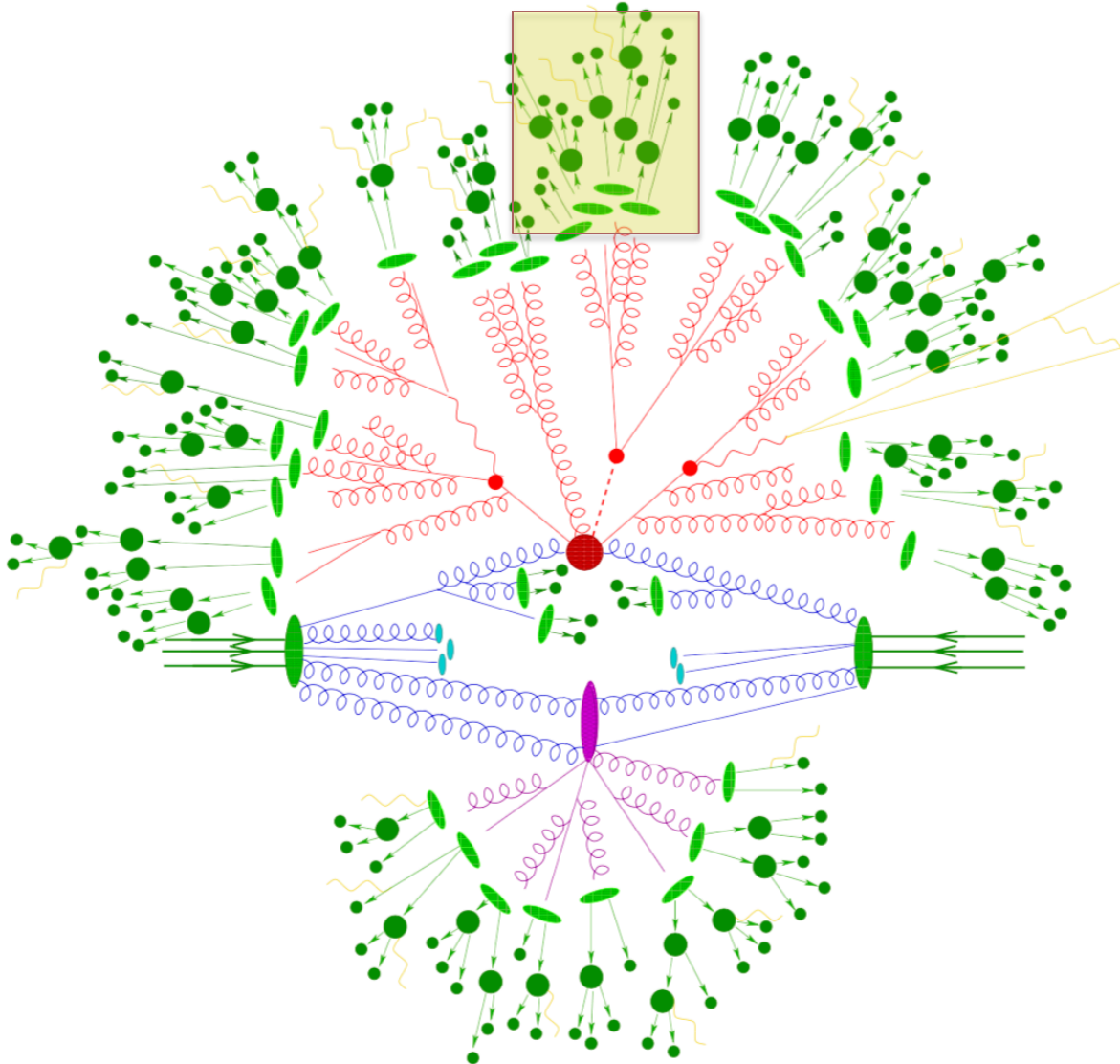
- **Quark and gluons (partons) produced at short distances (hard process)**
- As they propagate they radiate more partons (parton shower)
- Form uncolored hadrons (hadronization)

# Jets and jet algorithms (I)



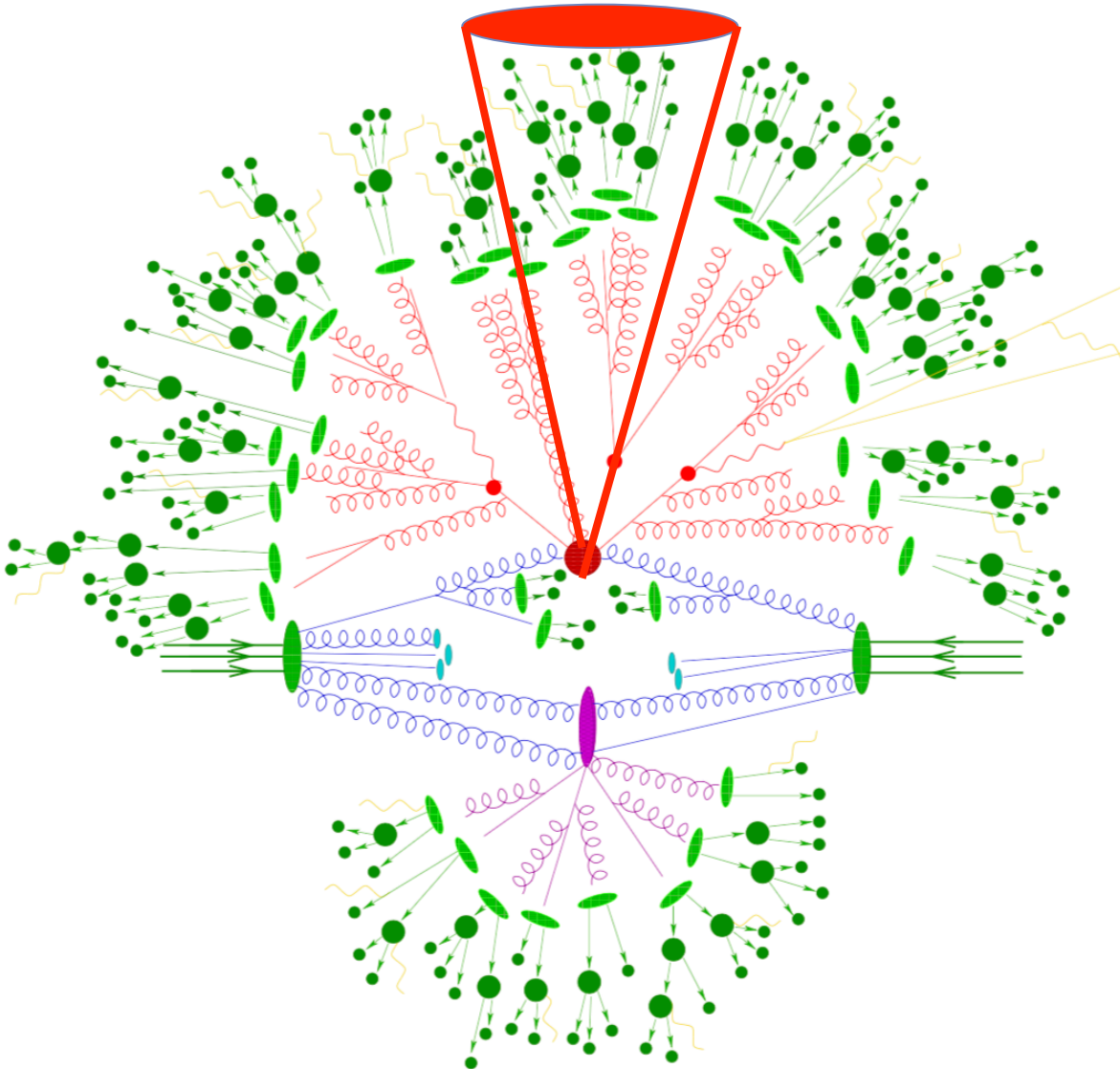
- Quark and gluons (partons) produced at short distances (hard process)
- **As they propagate they radiate more partons (parton shower)**
- Form uncolored hadrons (hadronization)

# Jets and jet algorithms (I)



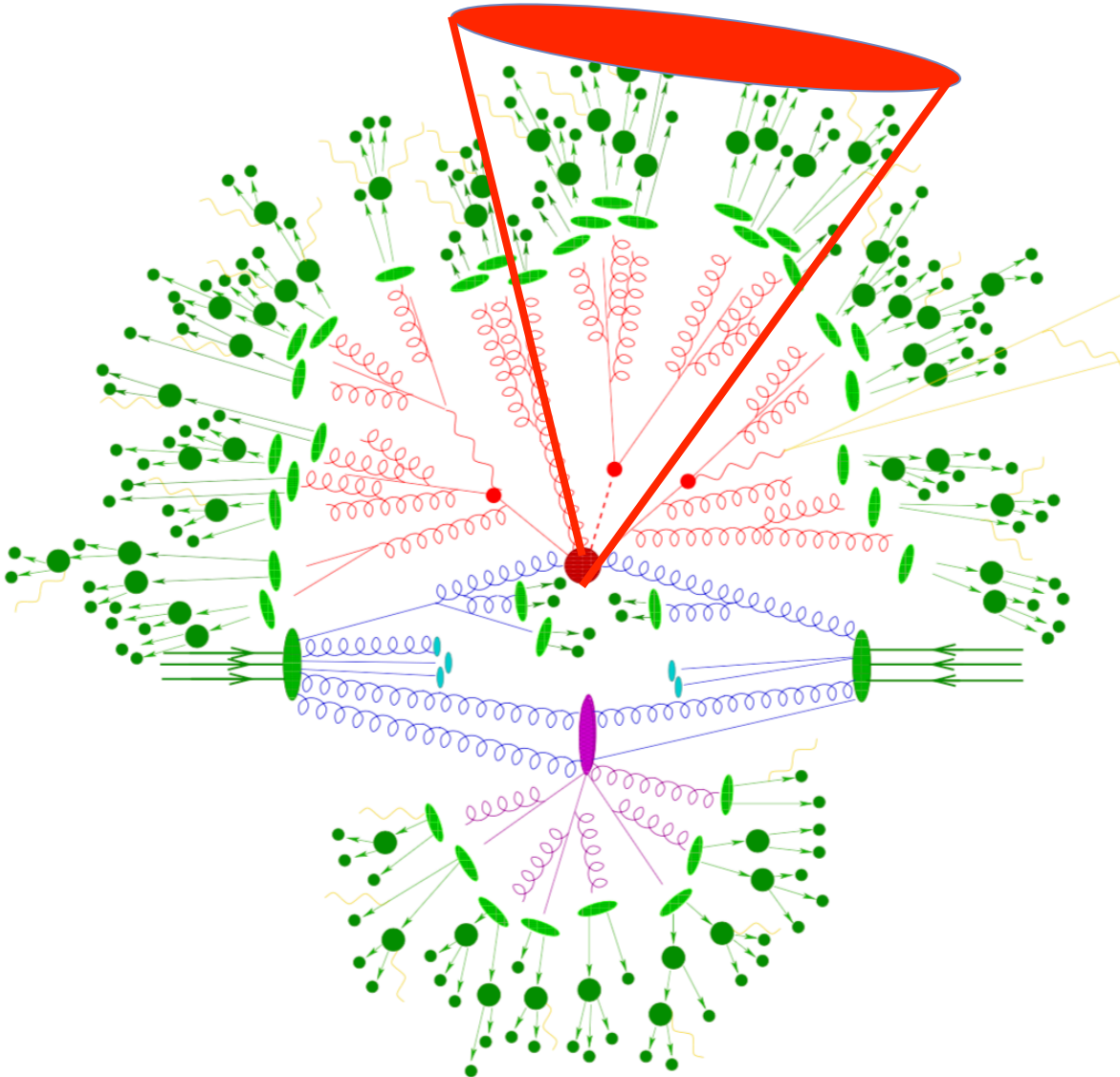
- Quark and gluons (partons) produced at short distances (hard process)
- As they propagate they radiate more partons (parton shower)
- **Form uncolored hadrons (hadronization)**

# Jets and jet algorithms (I)



- Quark and gluons (partons) produced at short distances (hard process)
- As they propagate they radiate more partons (parton shower)
- Form uncolored hadrons (hadronization)
- **Jets: tools to organize the event**

# Jets and jet algorithms (I)

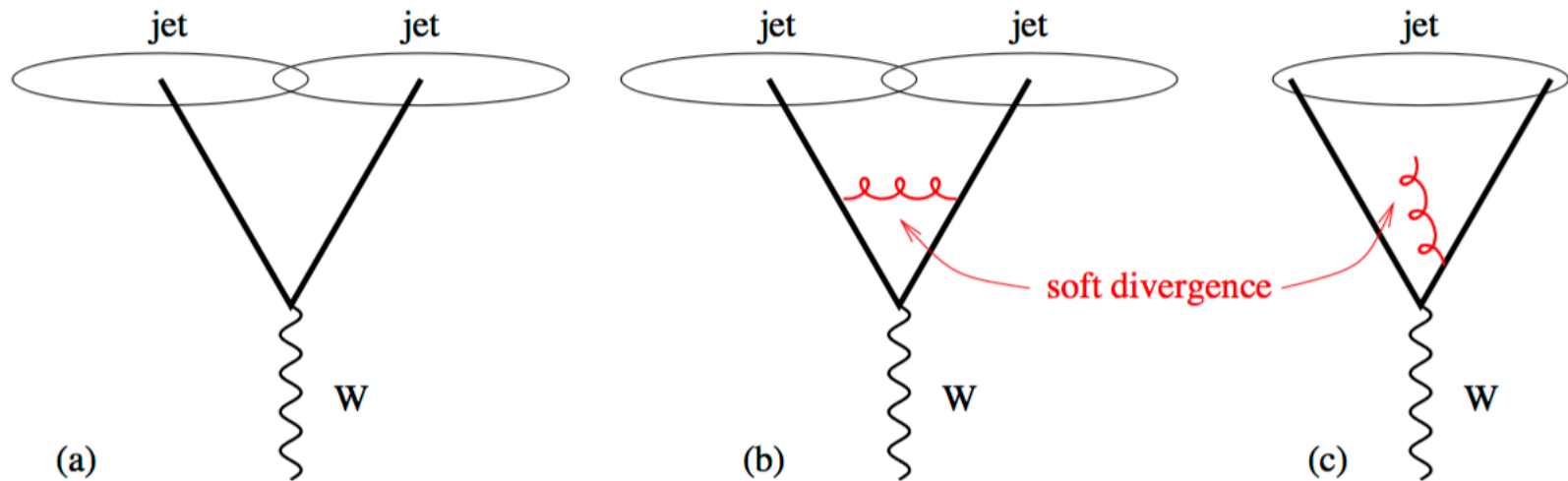


- Quark and gluons (partons) produced at short distances (hard process)
- As they propagate they radiate more partons (parton shower)
- Form uncolored hadrons (hadronization)
- **Jets: tools to organize the event**



# Jets and jet algorithms (II)

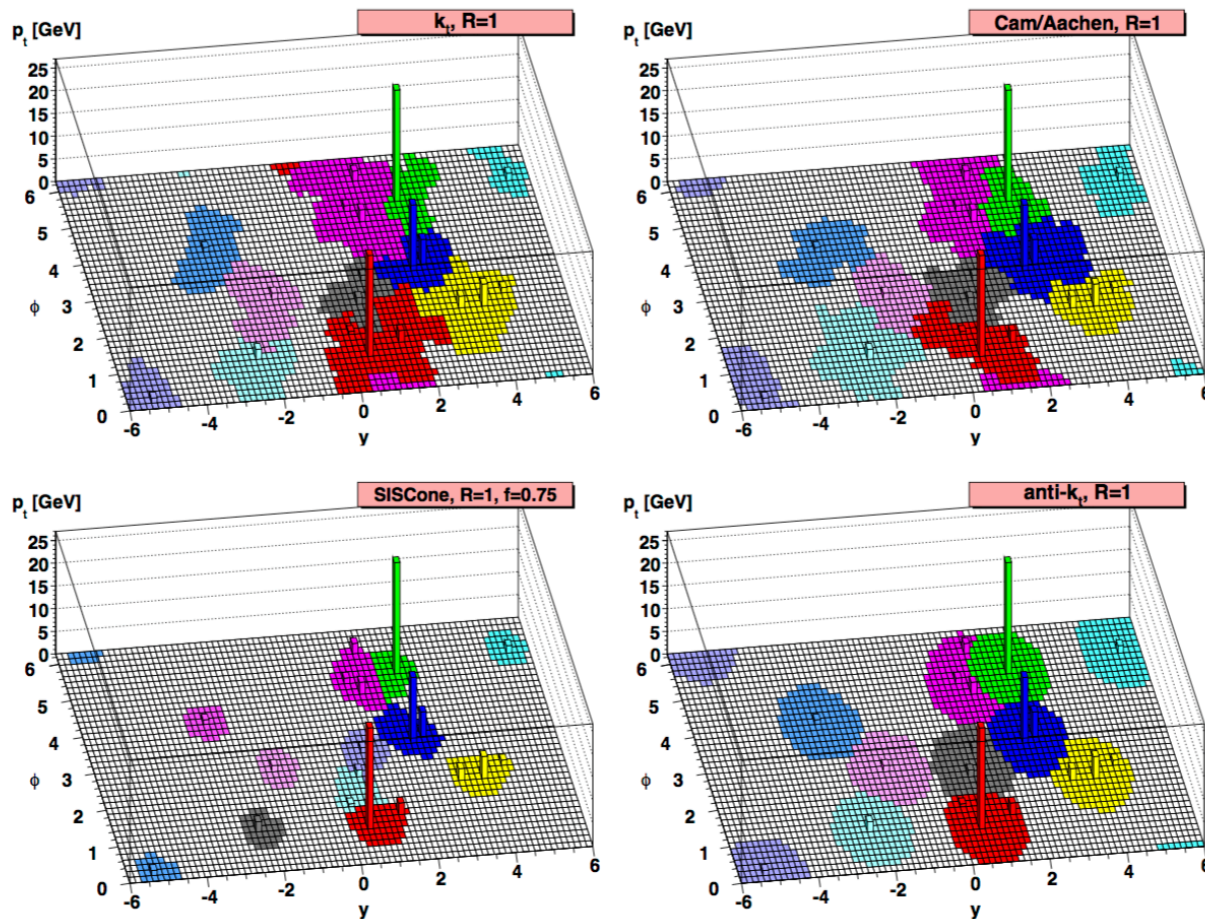
- Jet algorithms: set of rules to group particles together and to assign a momentum to the resulting jet
- Infrared and collinear safe



- LHC uses sequential recombination jet algorithms
  - $K_T$ , C/A, **anti- $k_T$**

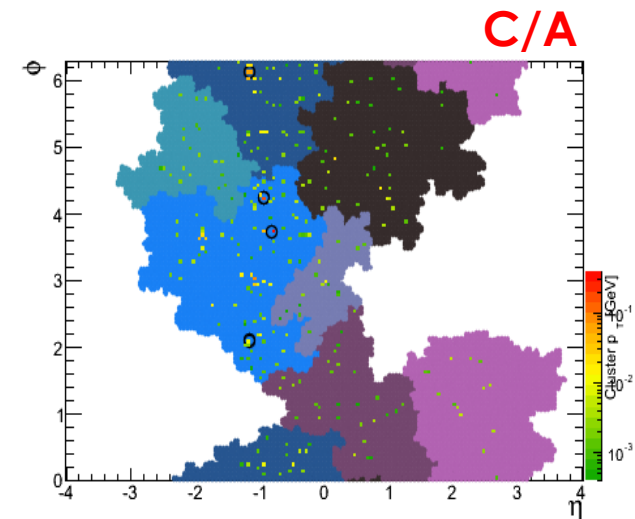
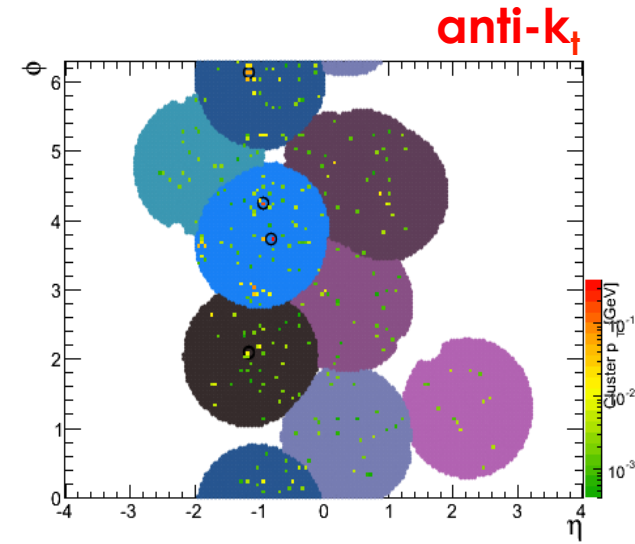
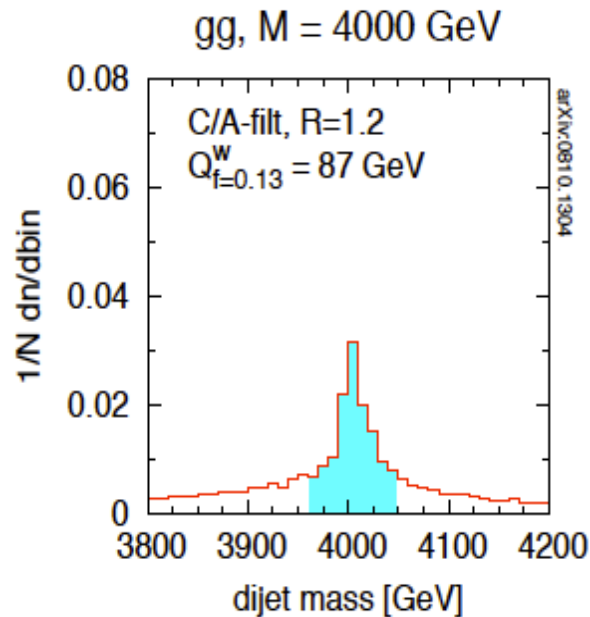
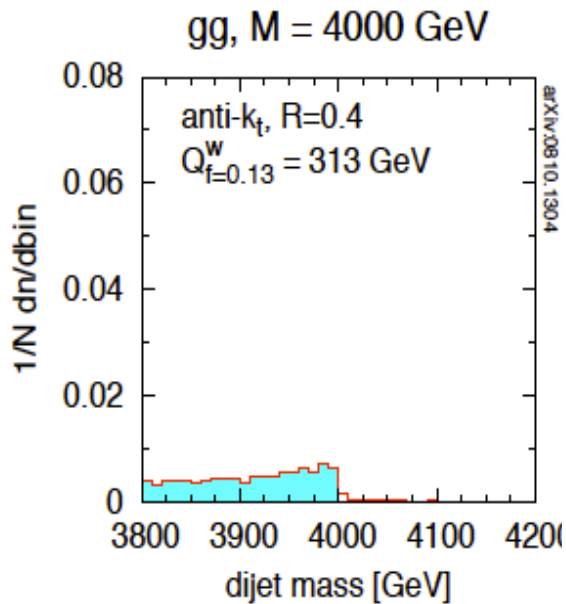
# Jets and jet algorithms (III)

$$d_{ij} = \min(p_{ti}^{2p}, p_{tj}^{2p}) \frac{\Delta R_{ij}^2}{R^2}, \quad d_{iB} = p_{ti}^{2p}$$

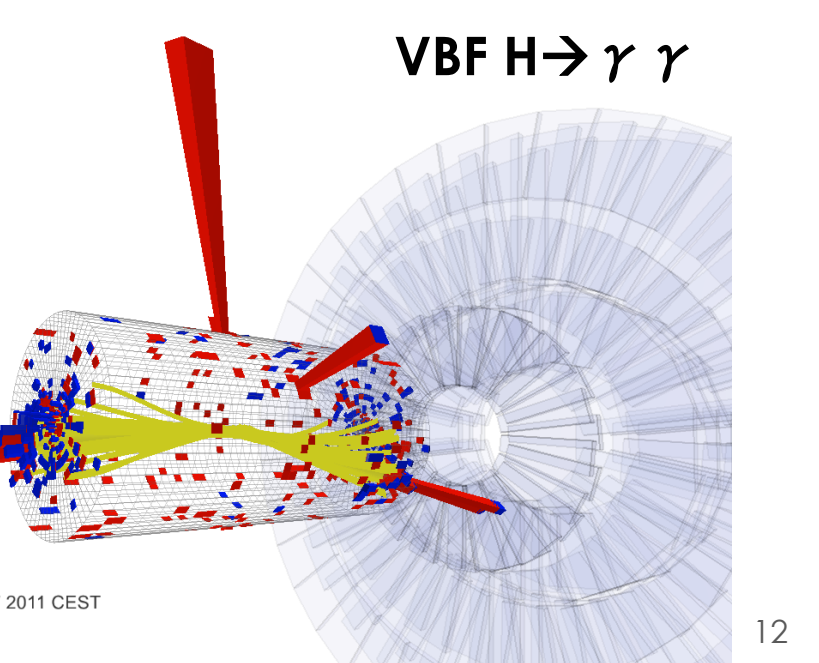
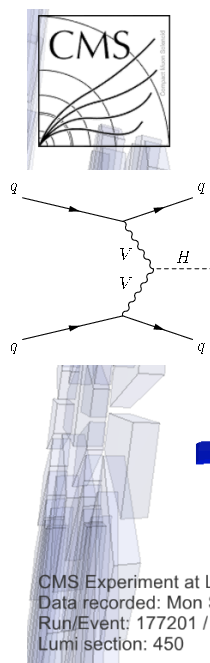
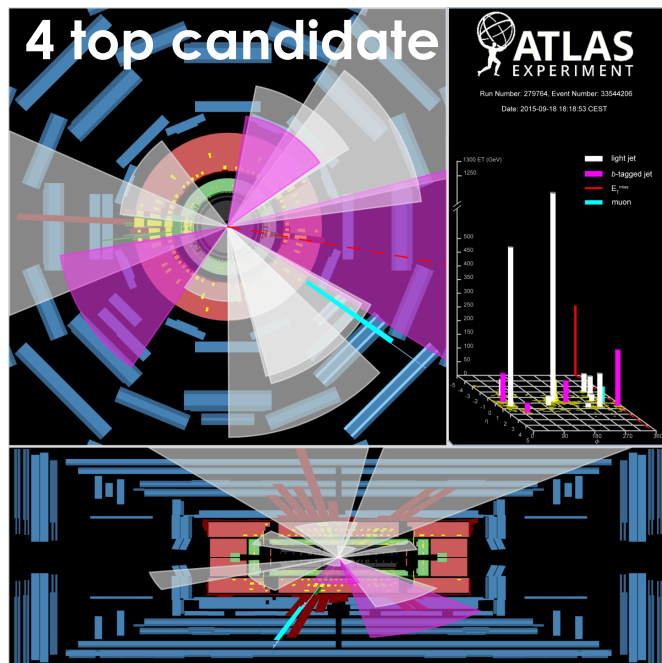
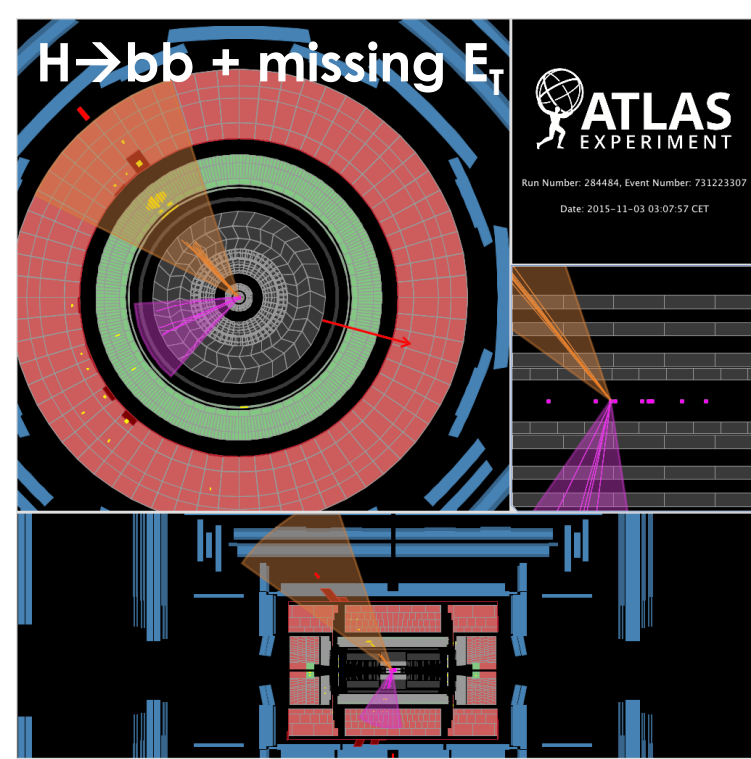
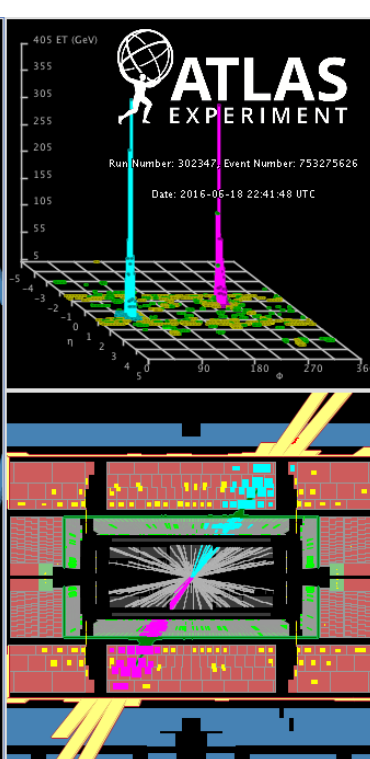
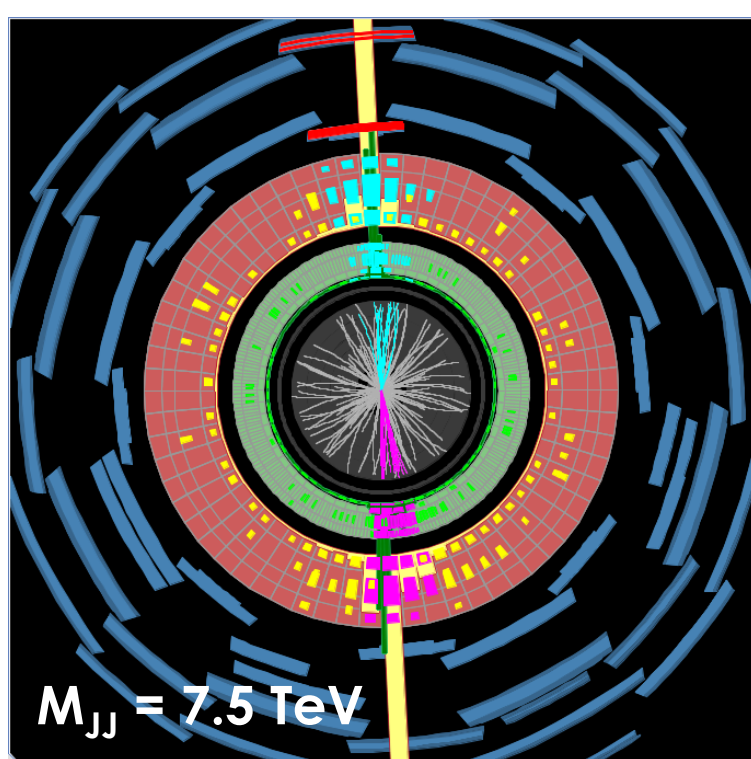


# Jets and Missing ET

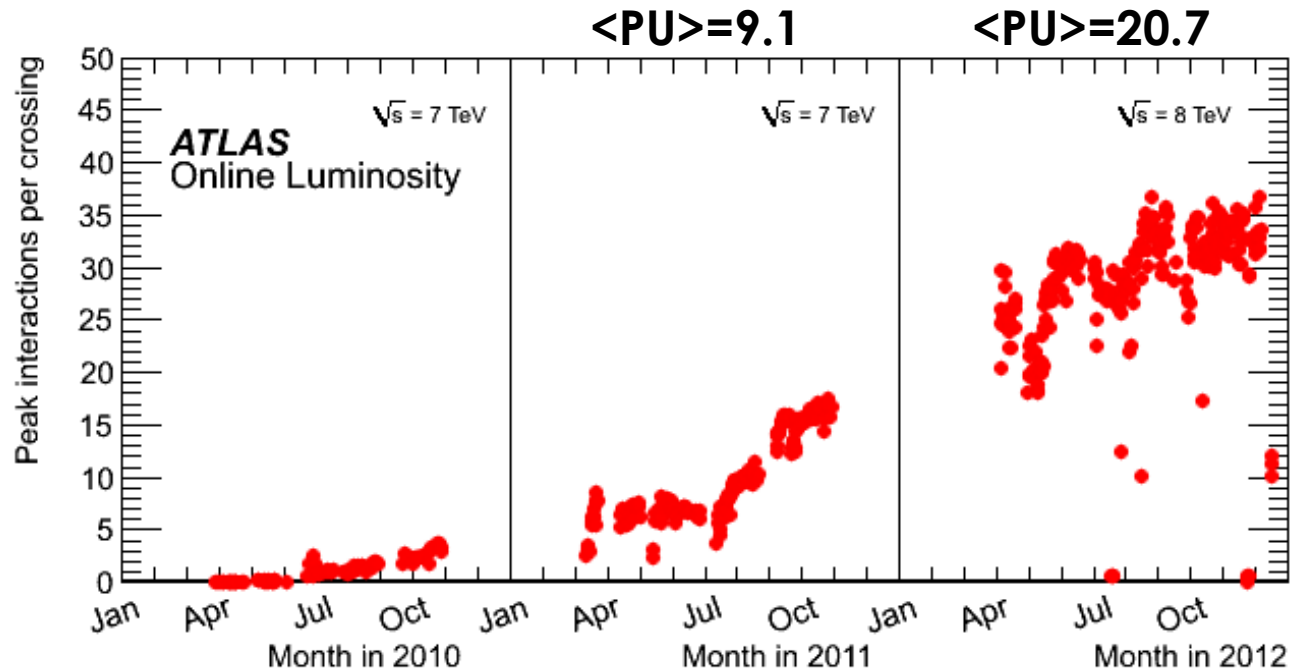
- Jets are *tools* to organize and interpret events
- Multiple interpretation of events



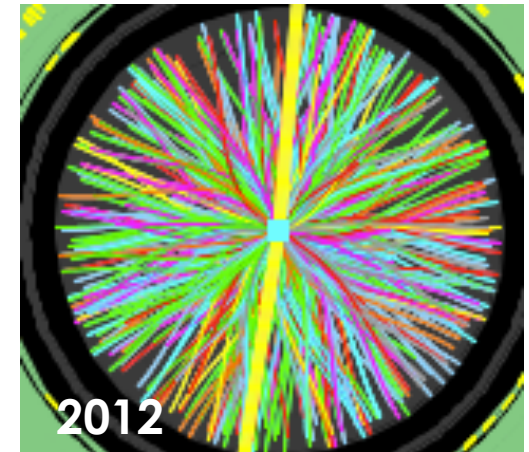
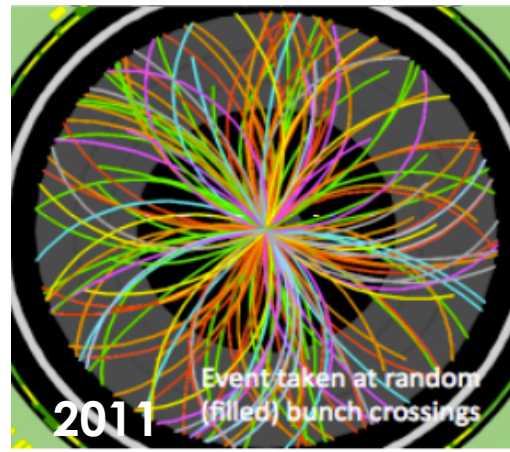
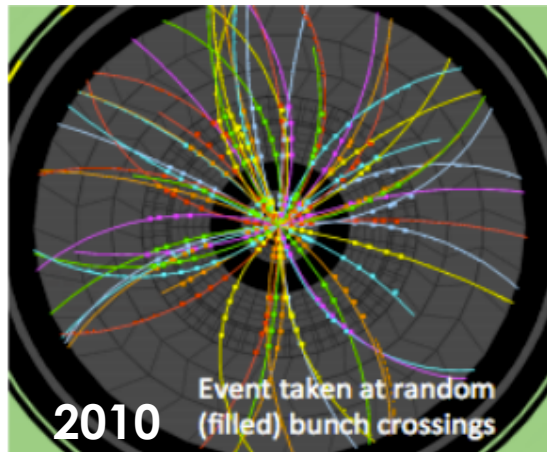
G. Salam



# Pile-up in Run 1



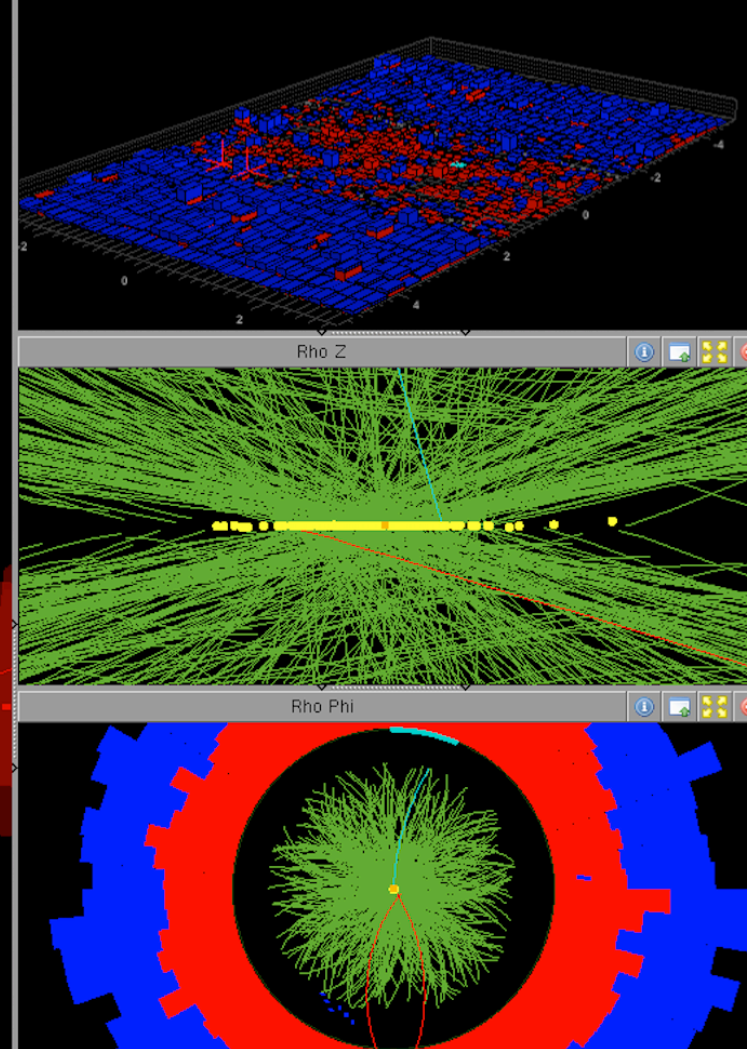
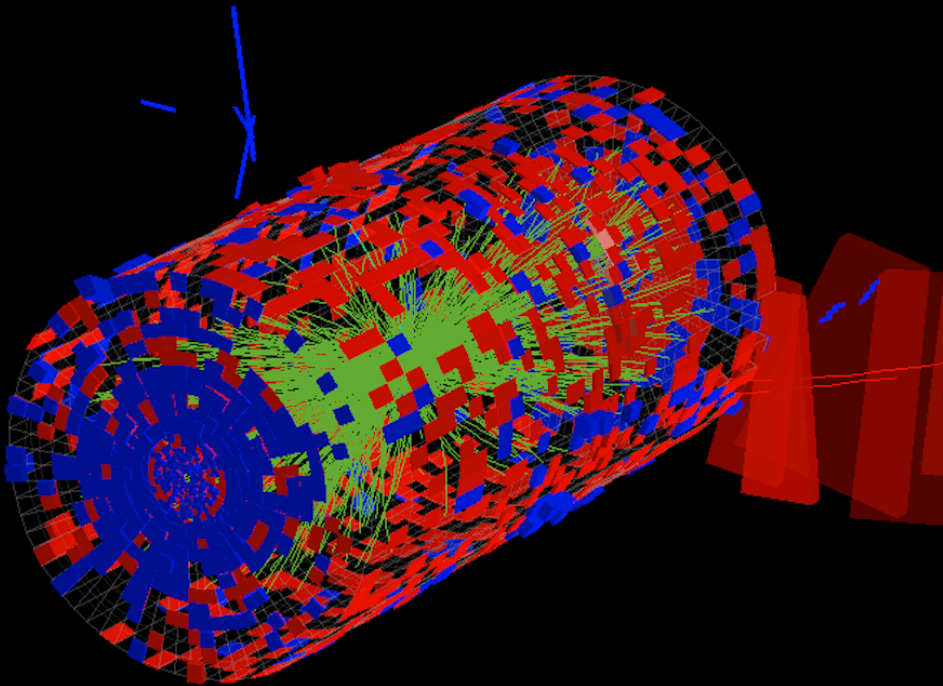
HL-LHC  
 $\langle \text{PU} \rangle \sim 200!$



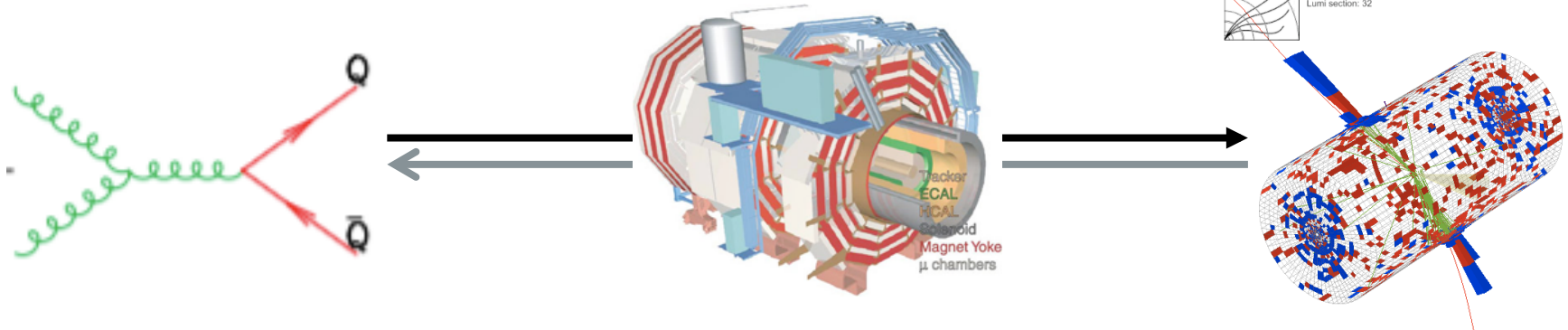
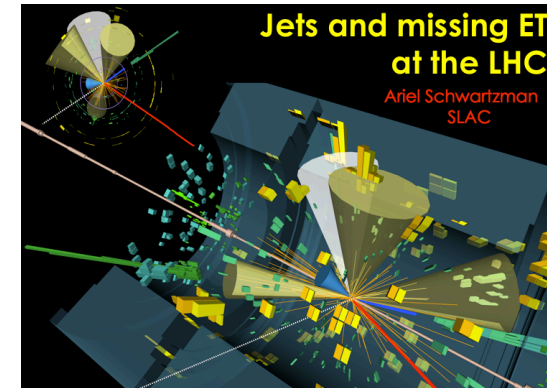
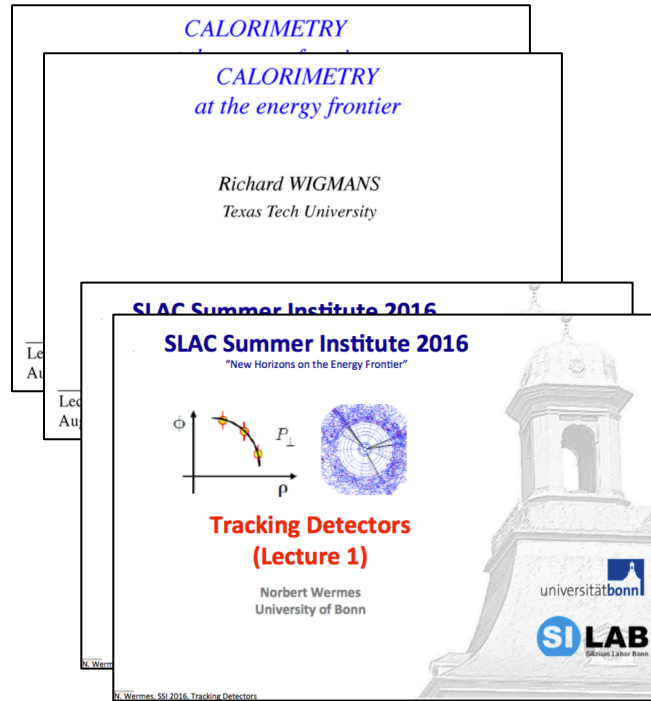
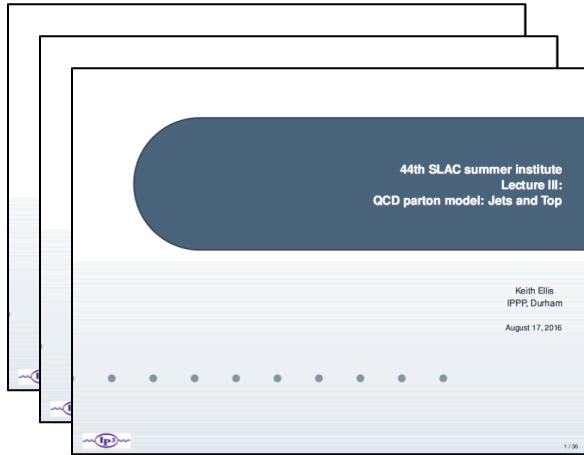
# High pile-up

**78 pile-up vertices!**

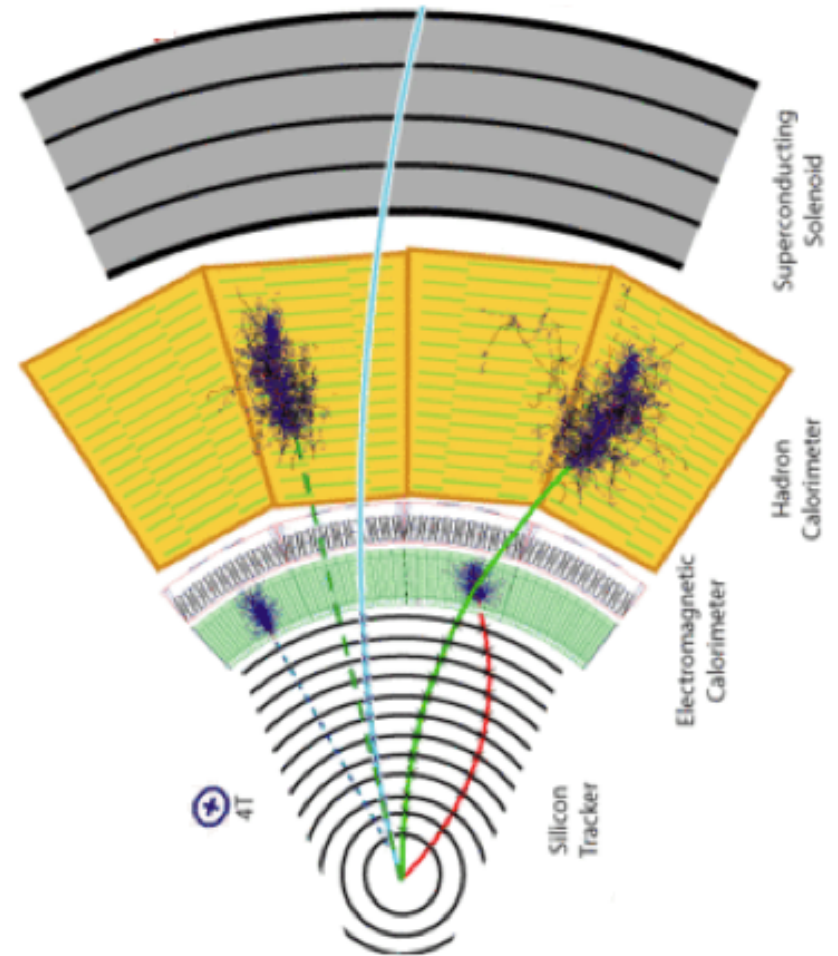
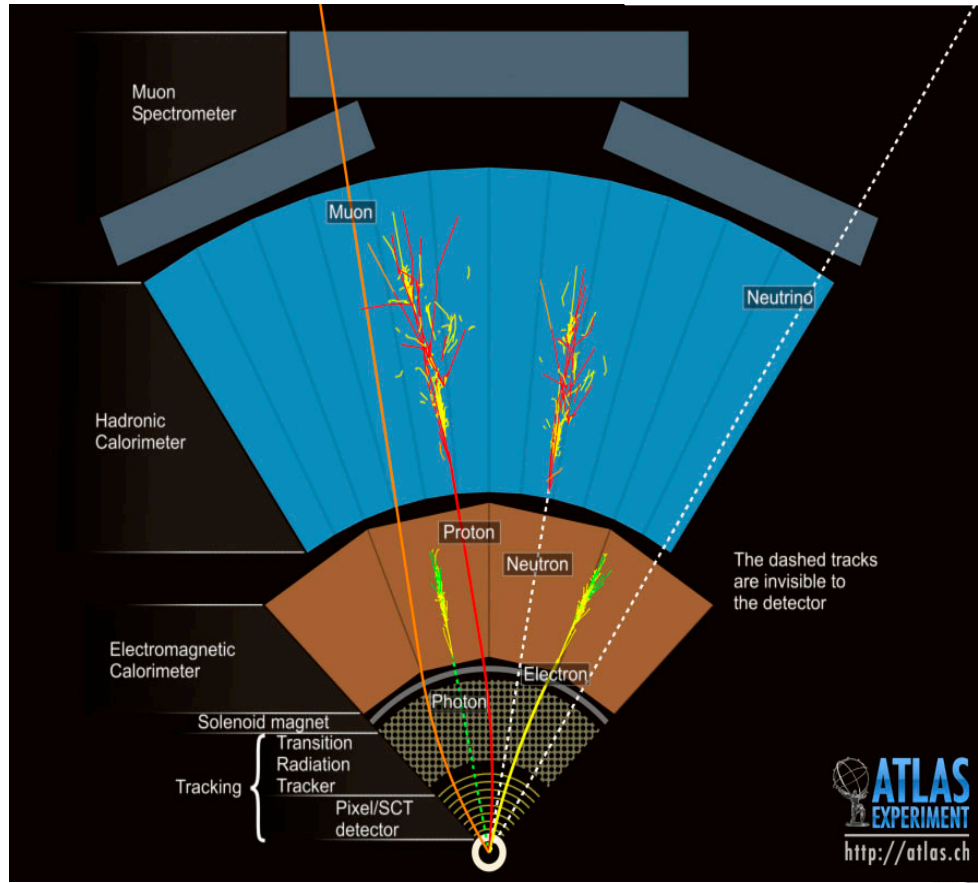
CMS high pile-up run 198609



# Goal of this talk



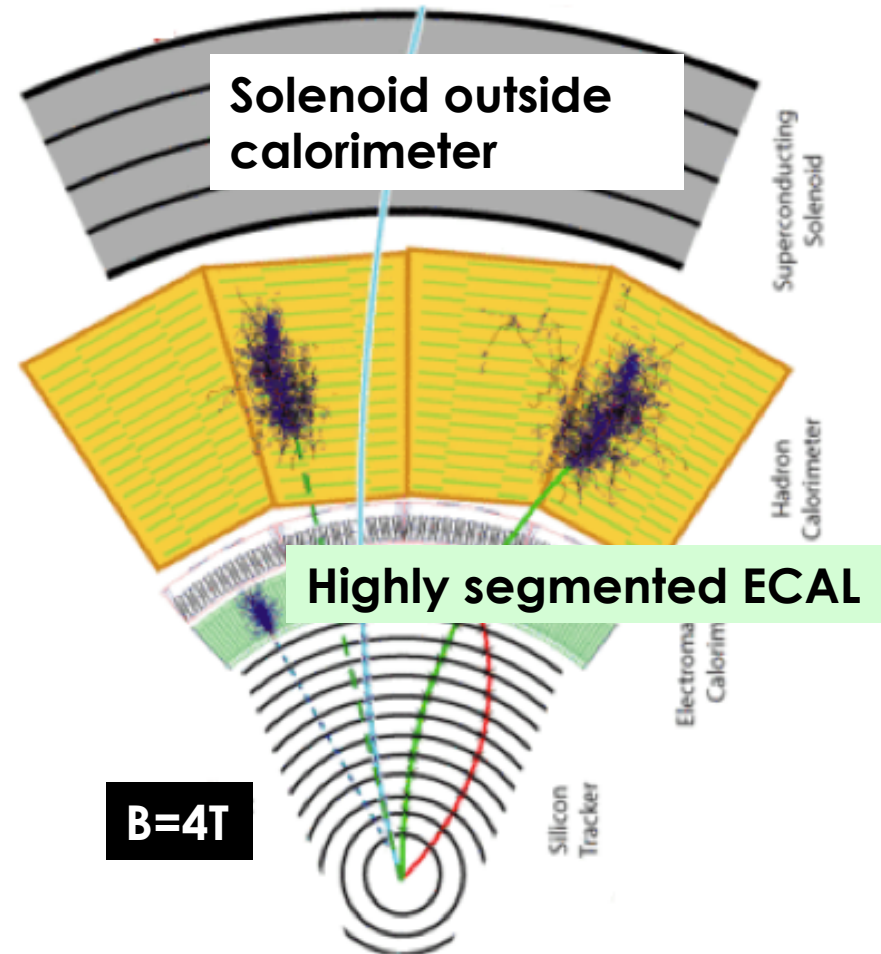
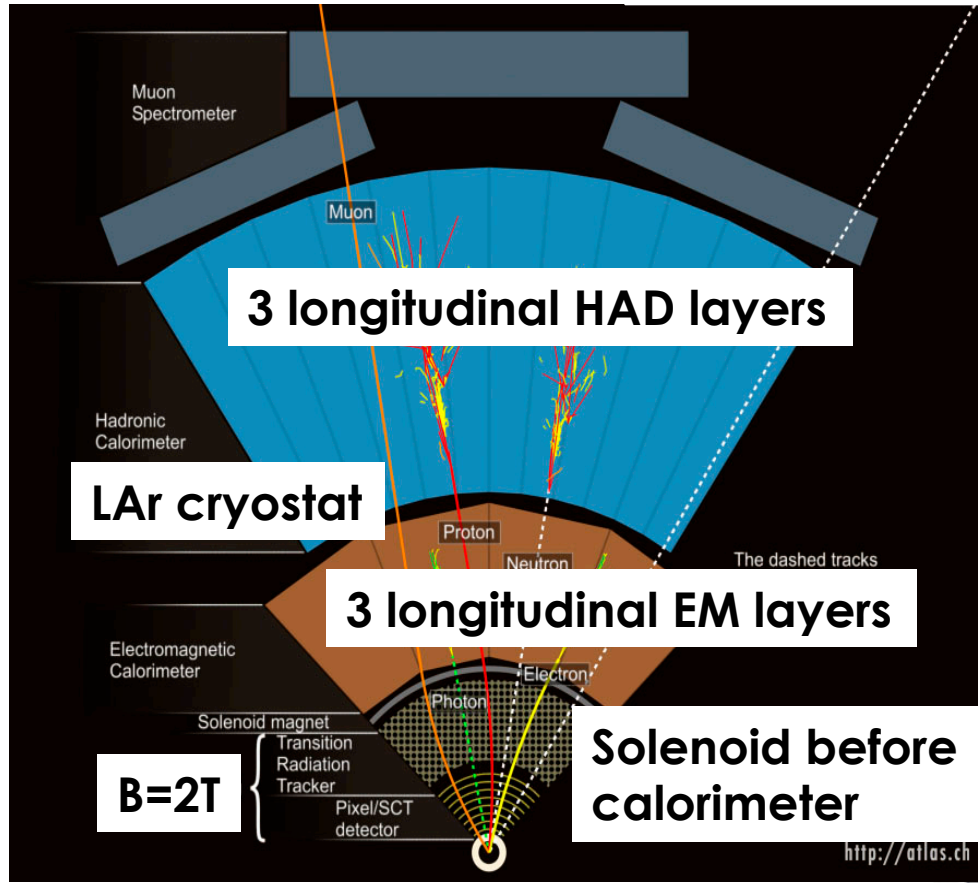
# ATLAS and CMS Detectors



- Electron
- Charged Hadron (e.g. Pion)
- - - Neutral Hadron (e.g. Neutron)
- - - Photon

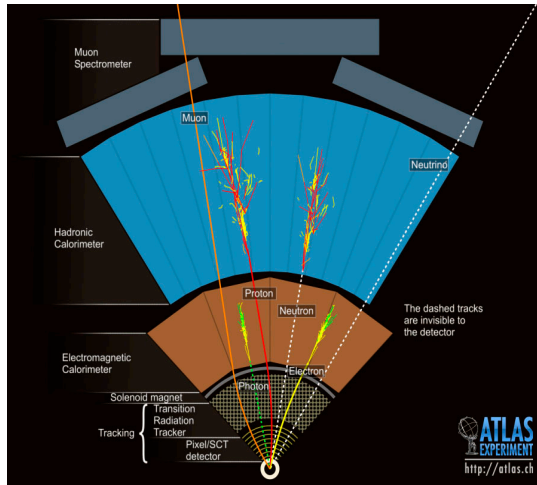


# ATLAS and CMS Detectors



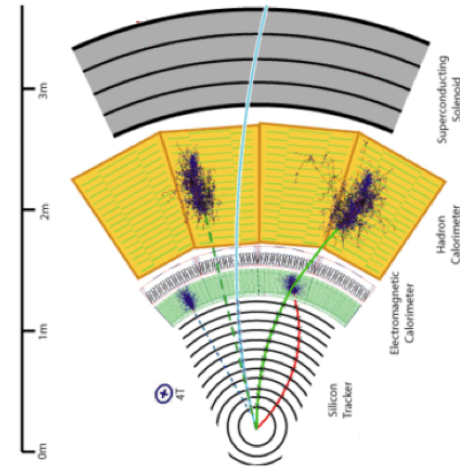
- Electron
- Charged Hadron (e.g. Pion)
- - - Neutral Hadron (e.g. Neutron)
- - - Photon

# ATLAS and CMS Detectors



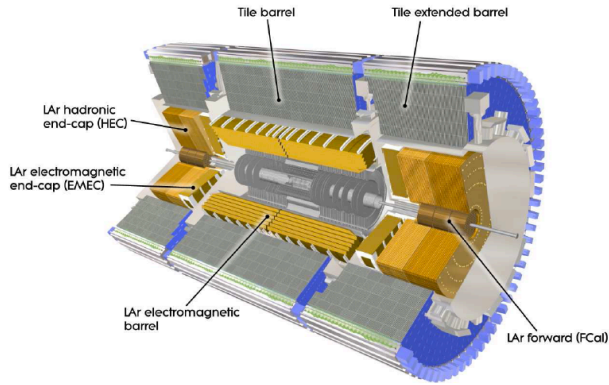
Excellent hadron energy resolution  
Longitudinal EM/HAD segmentation  
Fine transverse segmentation

Can use shower shape information and 3-dimensional clustering to identify and calibrate EM/HAD energy depositions → **More handles for calorimeter-based jet reconstruction and calibration**

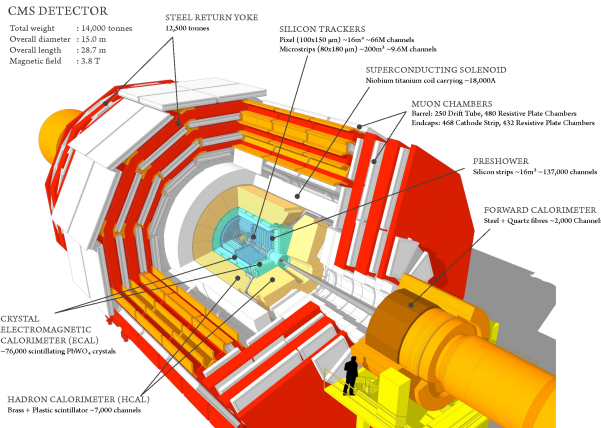


High magnetic field  
Very fine transverse EM granularity  
Low  $p_T$  tracking  
Good separation between photons and pion showers  
Low  $p_T$  charged particles do not reach the calorimeter → **need to integrate tracking with calorimeter information**

# Jet reconstruction overview



**ATLAS**



**CMS**

# Jet reconstruction at ATLAS

- **Topological clustering**

- Three-dimensional clustering algorithm at the level of individual calorimeter cells

## Noise suppression

limit the formation and grow of clusters from electronic and pileup noise

Reduce pile-up contributions before jet finding

## Local calibration

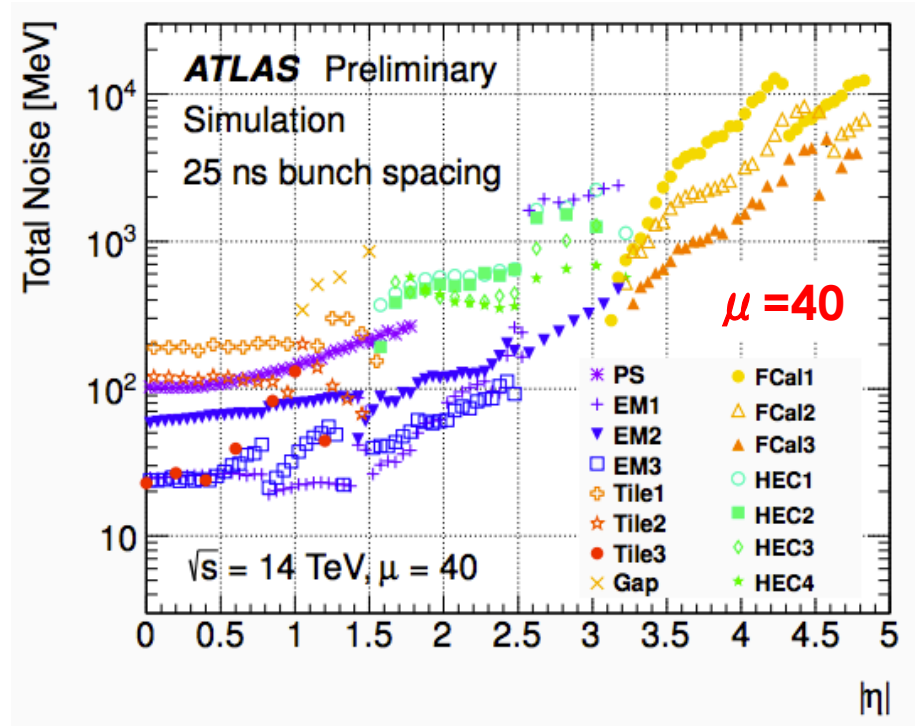
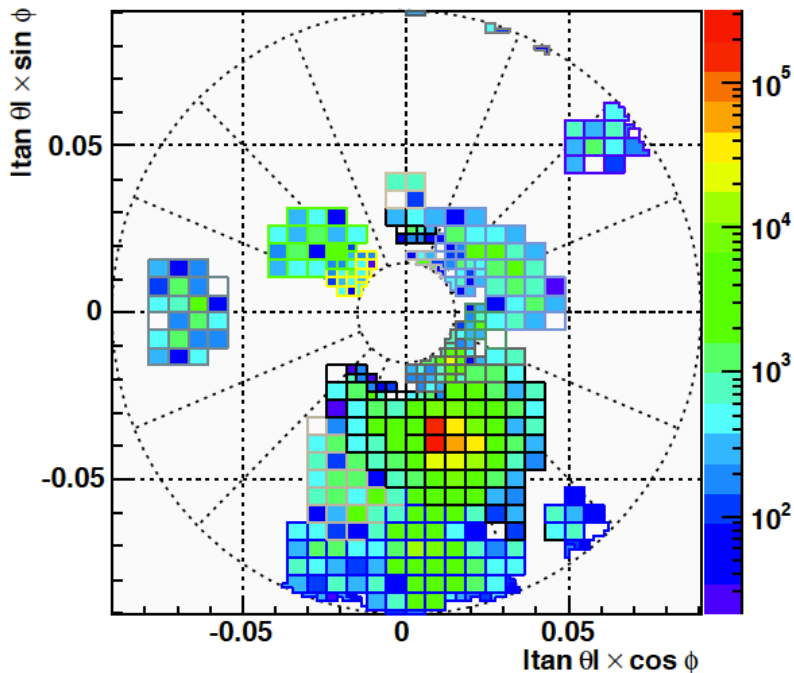
EM/HAD classification and calibration

Improves the linearity of the jet energy response and the energy resolution

# Jet reconstruction at ATLAS

- **Topological clusters:**
  - 3D nearest-neighbor algorithm that clusters calorimeter cells with energy significance ( $|E_{\text{cell}}| / \sigma$ )  $> 4$  for the seed,  $> 2$  for neighbors, and  $> 0$  at the boundary
- **Sigma noise ( $\sigma$ ):** electronic + pileup noise
  - Adjusted with  $\mu$  for **pileup noise suppression**

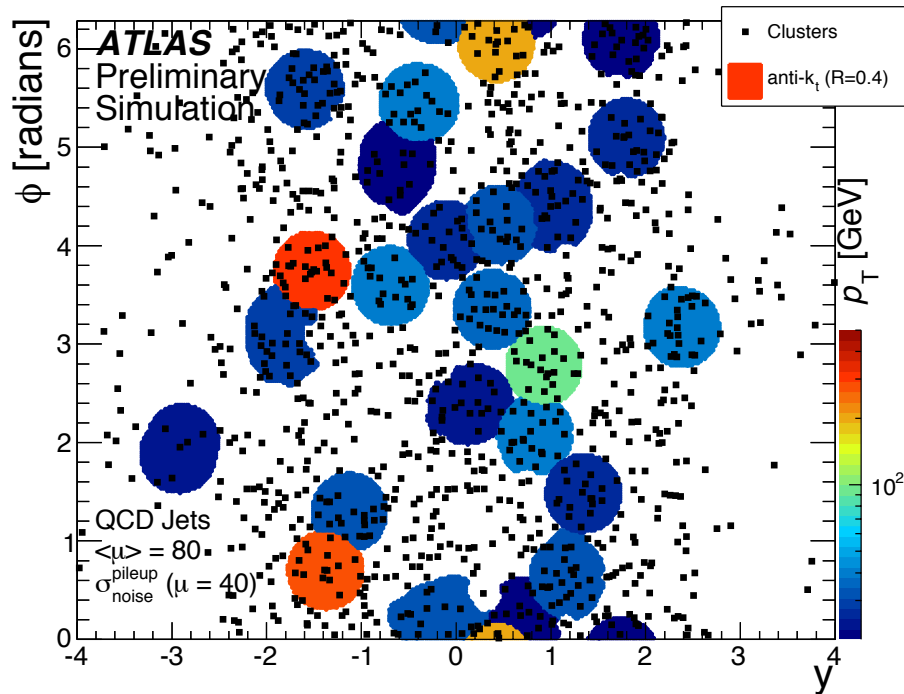
2010:  $\sigma(\mu=0)$   
 2011:  $\sigma(\mu=8)$   
 2012:  $\sigma(\mu=30)$



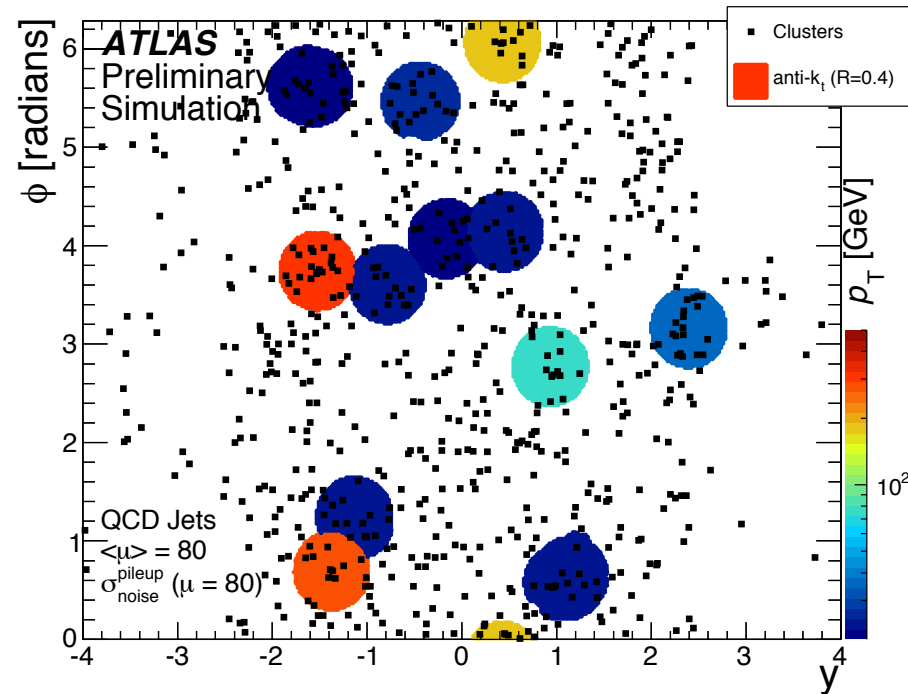
# Topoclustering pile-up suppression

$\mu=80$

$\mu=80$



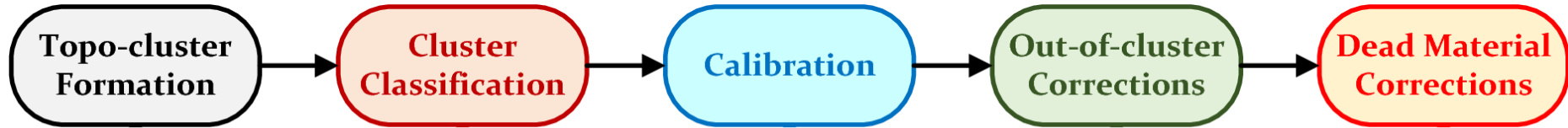
$\sigma_{noise}^{pileup} (\mu = 40)$



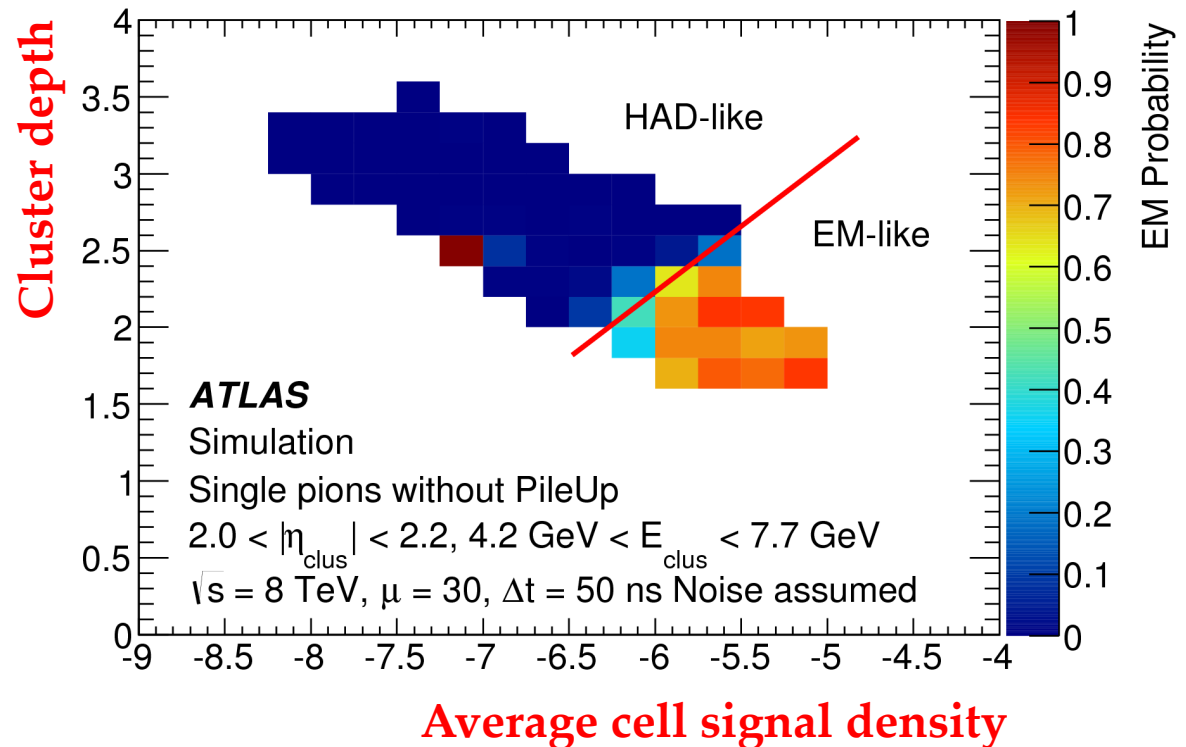
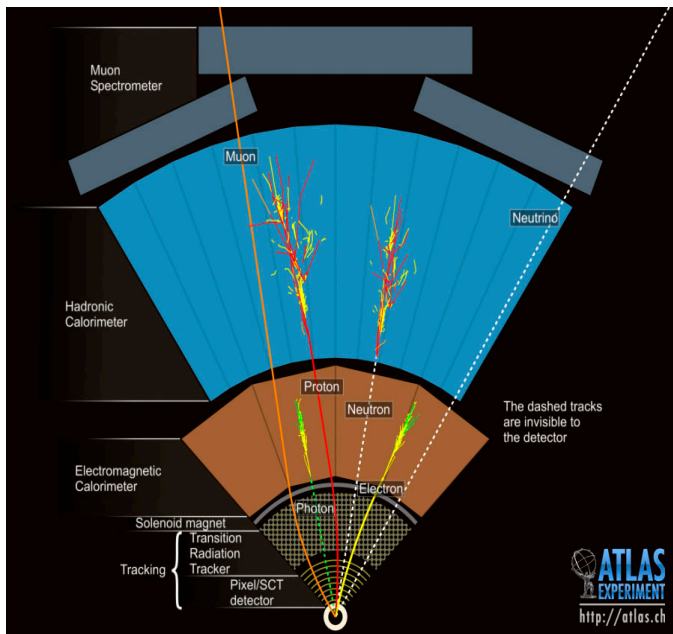
$\sigma_{noise}^{pileup} (\mu = 80)$

**Sigma noise provides particle (cluster) level pile-up suppression**

# Local cluster calibration



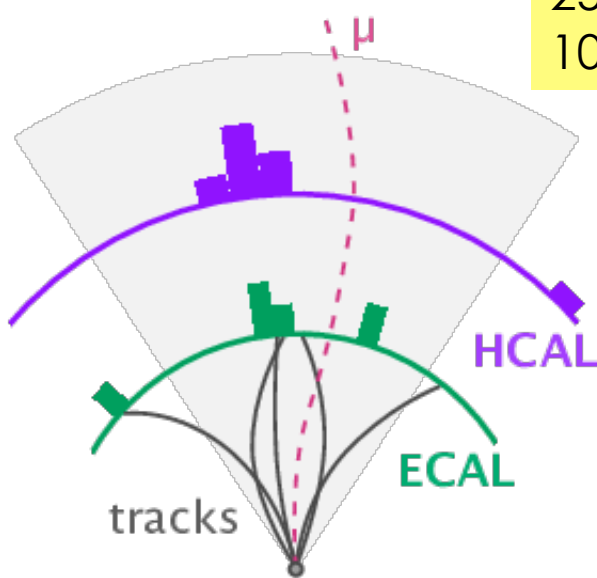
Use local cluster shape information to classify and calibrate EM/HAD clusters. Calibrations derived using single pion Monte Carlo



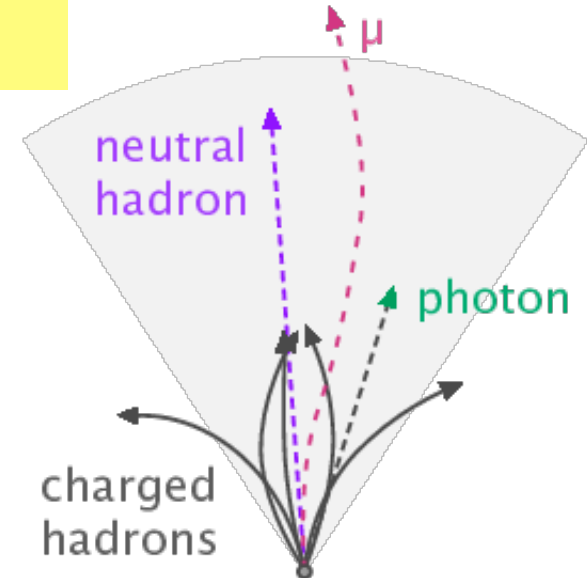
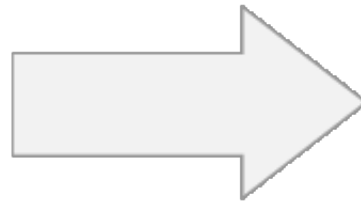
# CMS Particle Flow

- **Reconstruct individually each particle combining tracking and calorimeter information:**
  - Relies on high granularity and resolution of ECAL and **high magnetic field** to separate individual showers

65% charged hadrons → Tracker  
25% photons → ECAL  
10% neutral hadrons → HCAL



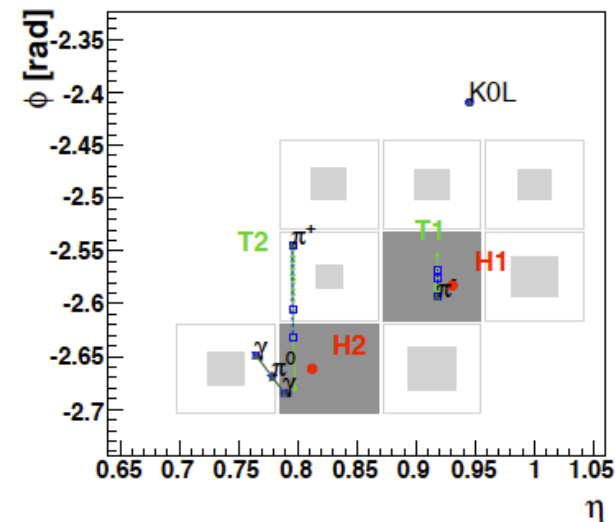
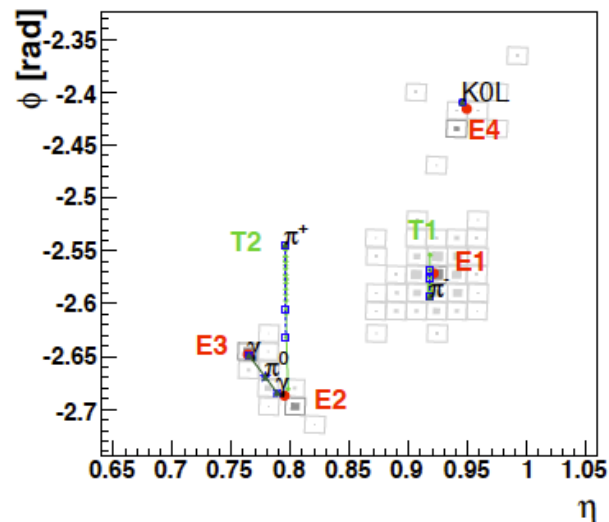
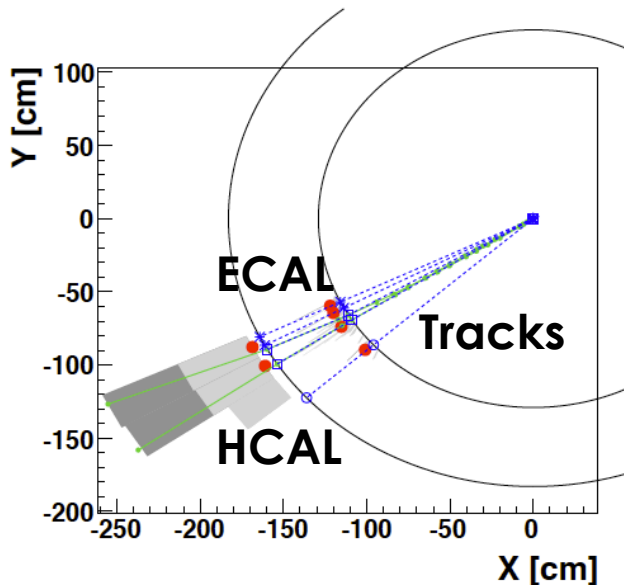
Detector level



Particle Flow



# Particle Flow

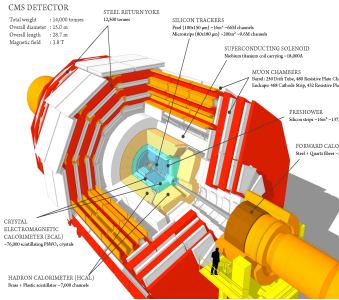


65% charged hadrons  $\rightarrow$  Tracker  
 25% photons  $\rightarrow$  ECAL  
 10% neutral hadrons  $\rightarrow$  HCAL

**Average (large fluctuations)**

- **Performance limited by confusion:** ability to separate individual particle showers)
  - Need High granularity, B field

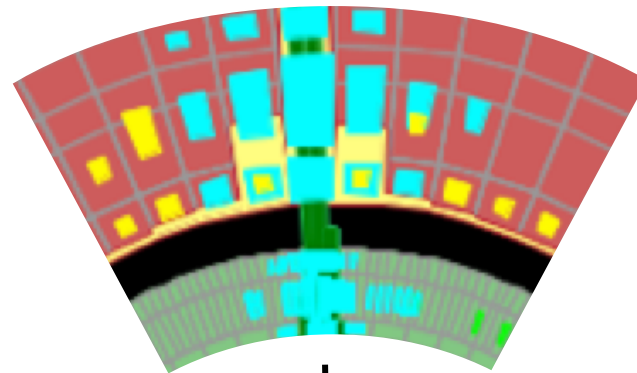
# Jet calibration overview



Jet energy response:

$$R(E, \eta) = \left\langle \frac{E^{reco}}{E^{truth}} \right\rangle$$

- Calorimeter non-compensation
- Inactive regions of the detector
- Energy deposits below thresholds
- Particles not included in the jets
- Pile-up
- *Data / Monte Carlo scale*

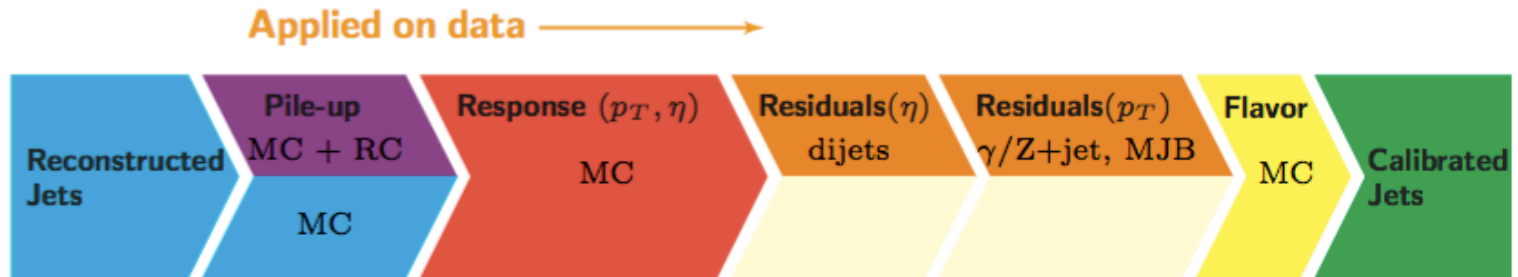


Reconstructed jet

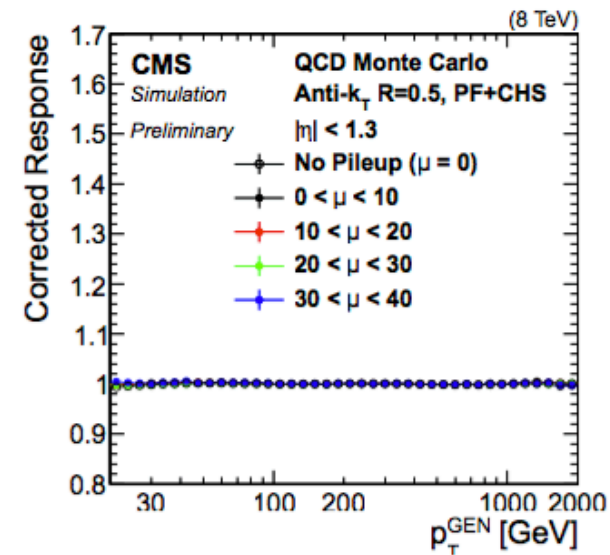
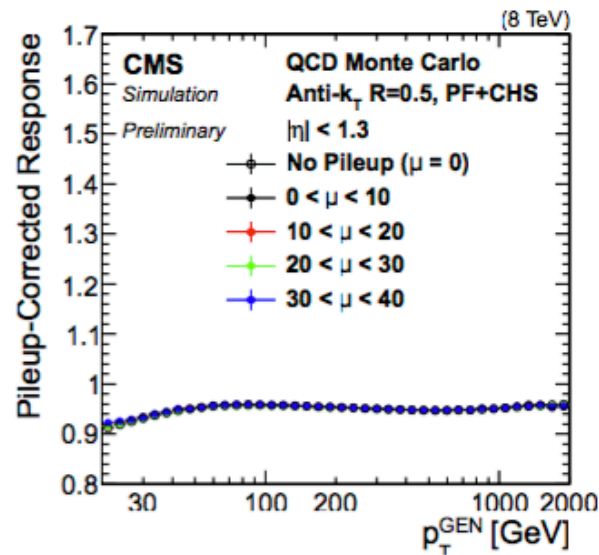
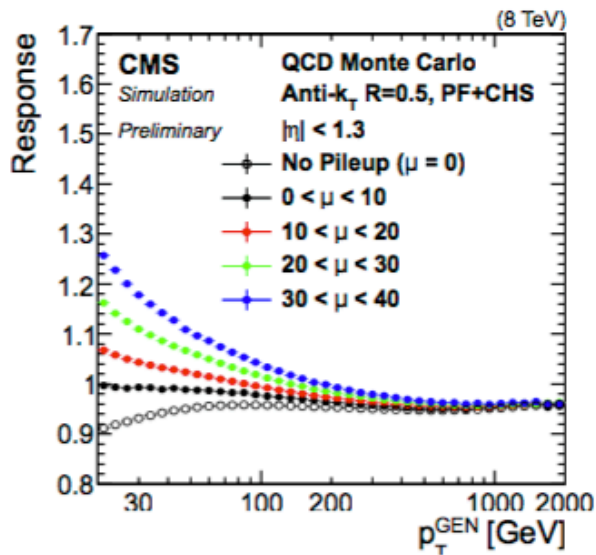
Calibration

Particle (truth) jet

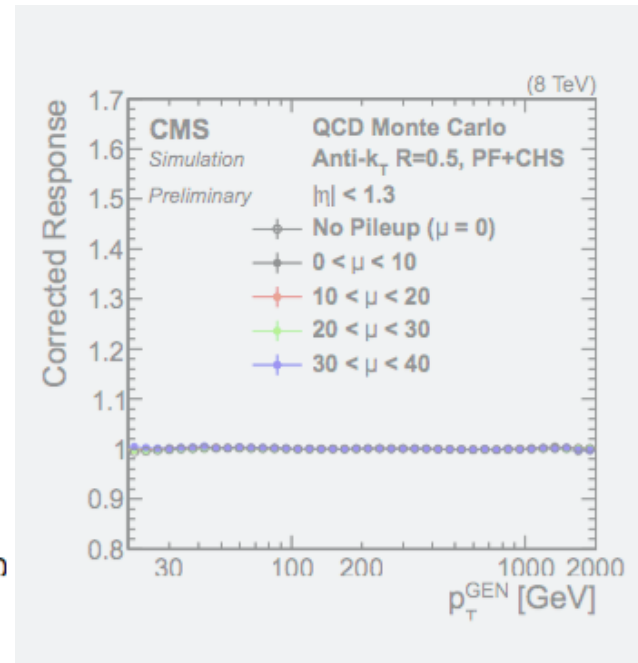
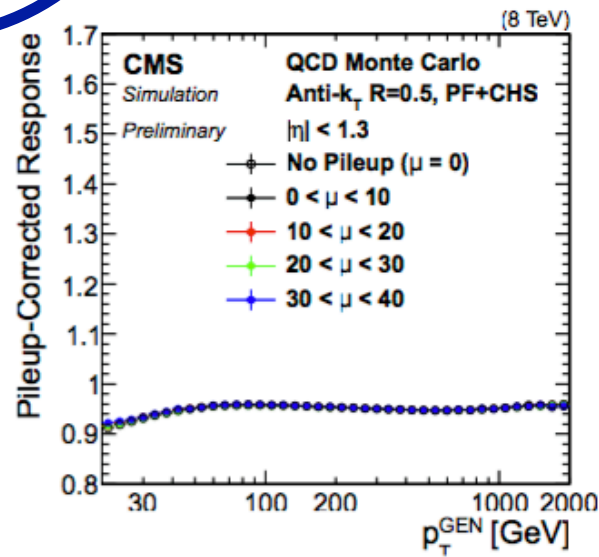
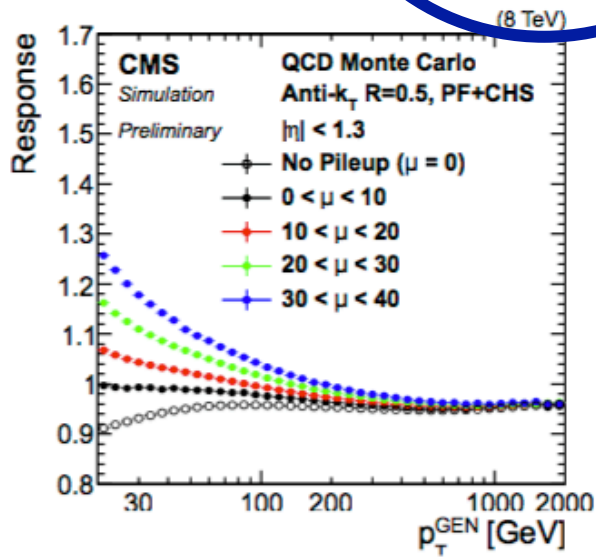
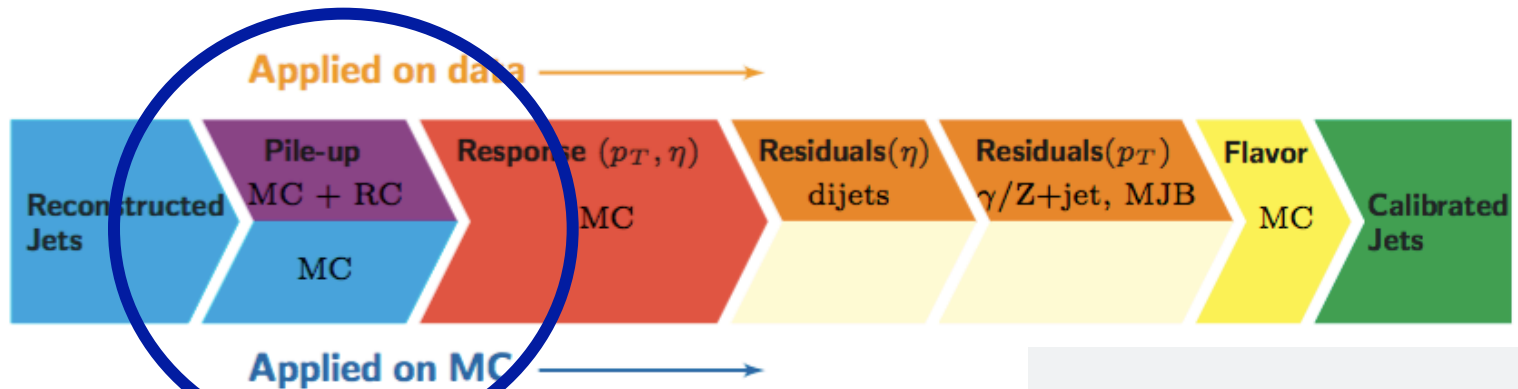
# Jet calibration overview



Applied on MC  $\longrightarrow$

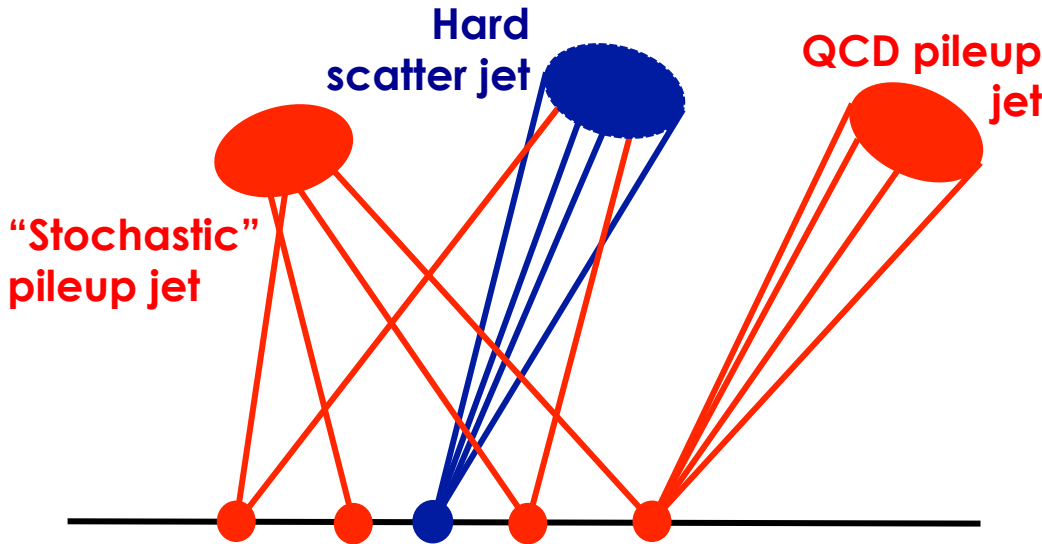


# Jet calibration overview



# The challenge of pile-up

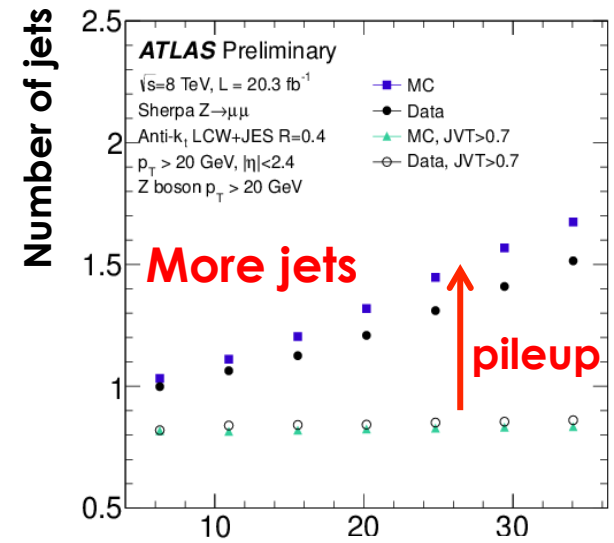
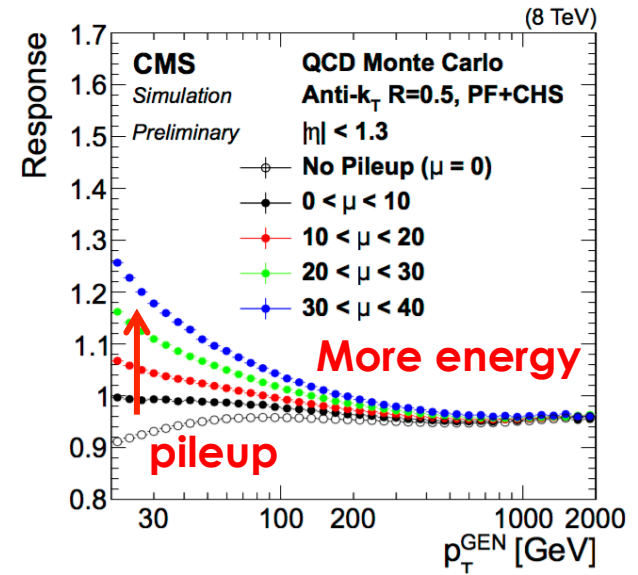
One the most difficult challenges at the LHC



Additional energy (offset)

Fluctuations:

- Reduce accuracy of the jet energy and mass determination
- Additional fake pileup jets



# Pileup mitigation: four key ideas

## Constituent level pile-up suppression

Topo-clustering (ATLAS)  
Charged Hadron Subtraction  
and PUPPI (CMS)

## Area-Median Subtraction

$$p_T^{jet,corr} = p_T^{jet} - \rho \times A_T^{jet}$$

## Jet-Vertex Tagging

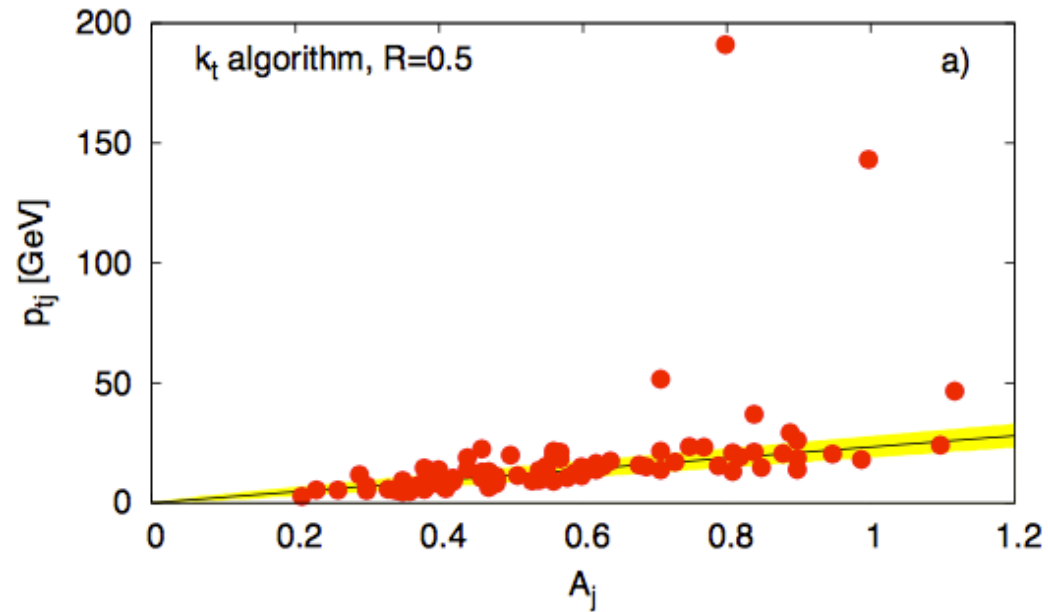
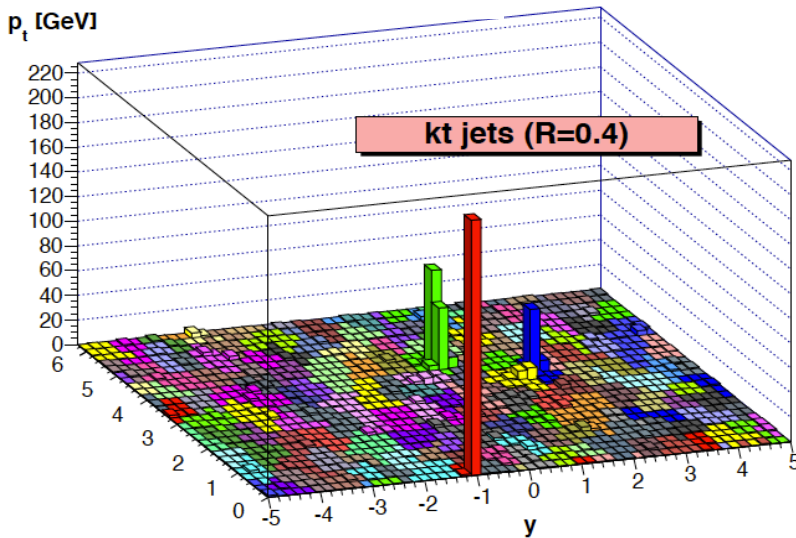
Use of tracking information to  
reject jets from pileup

## Grooming

Reduce local  
fluctuations of pileup  
(Large-R jets)

# Pileup subtraction (I)

arXiv:0707.1378 [hep-ph]



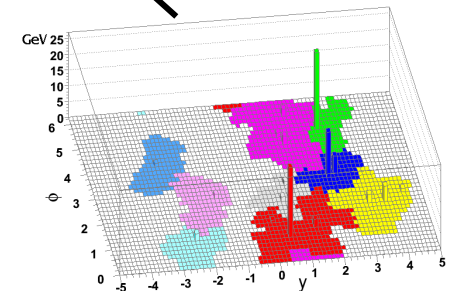
$$p_T^{jet,corr} = p_T^{jet} - \rho \times A_T^{jet}$$

**Jet Area:**

susceptibility to diffuse noise contamination

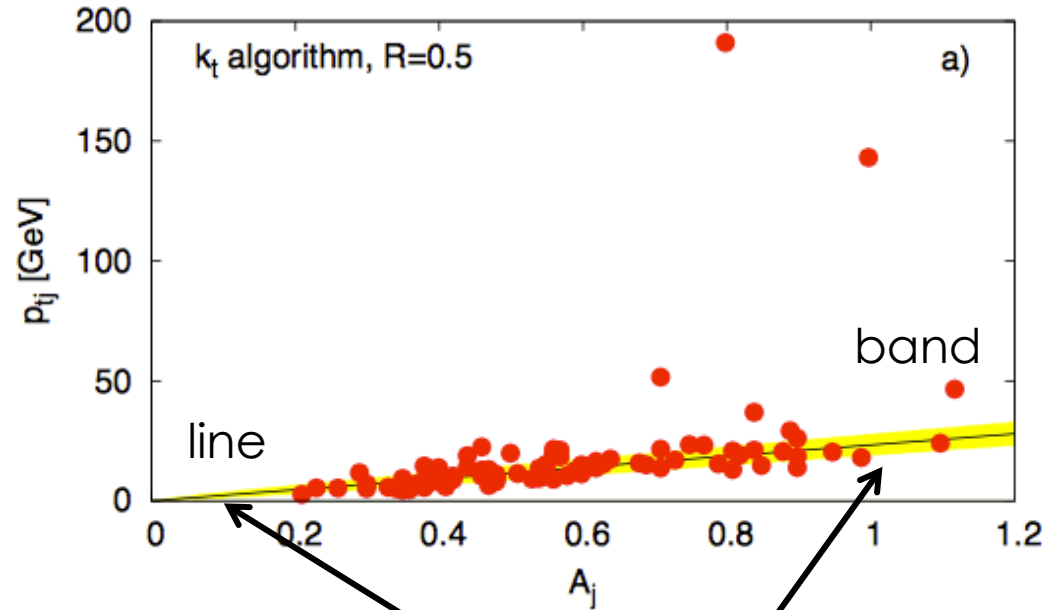
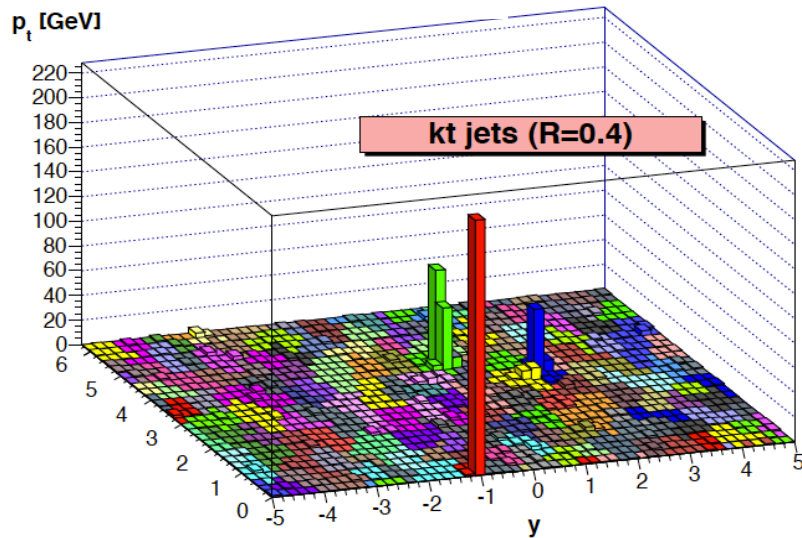
**Event-by-event**  
estimate of  
diffuse noise

$$\rho = \text{median} \left[ \left\{ \frac{p_{Tj}}{A_j} \right\} \right]$$



# Pileup subtraction (II)

arXiv:0707.1378 [hep-ph]



$$\Delta p_T = \rho A \pm \sigma_\rho \sqrt{A}$$

Geometrical  
contamination

Fluctuations in  
the noise from  
point to point  
in the event

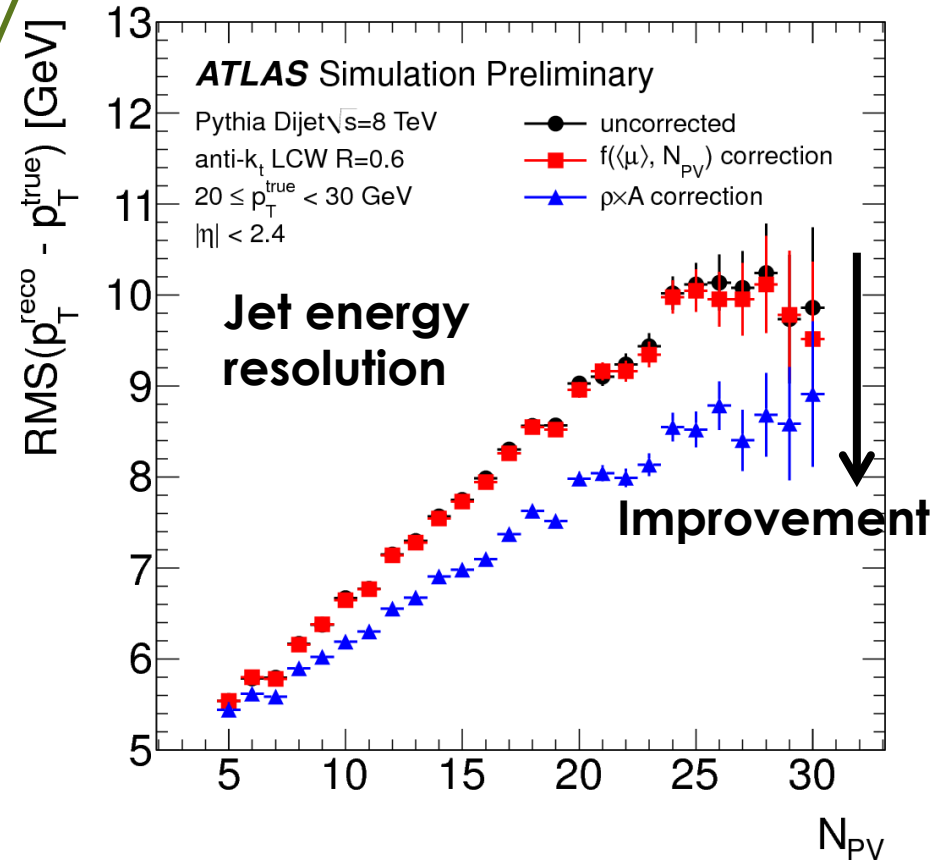
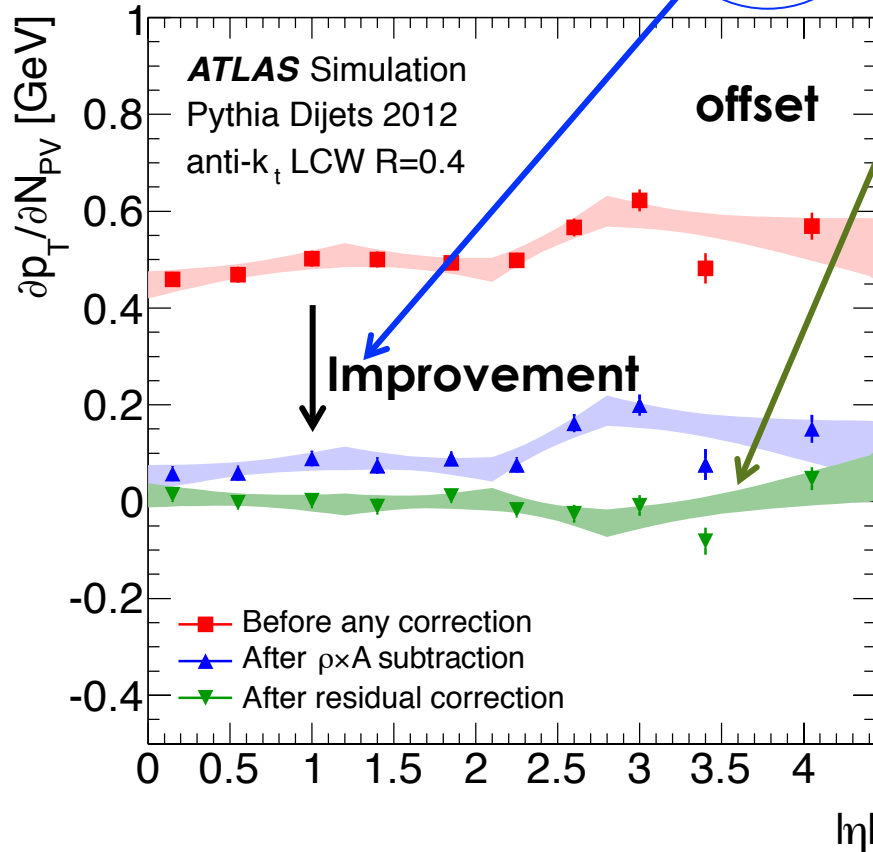
$$p_T^{jet,corr} = p_T^{jet} - \rho \times A_T^{jet}$$



# Pileup subtraction

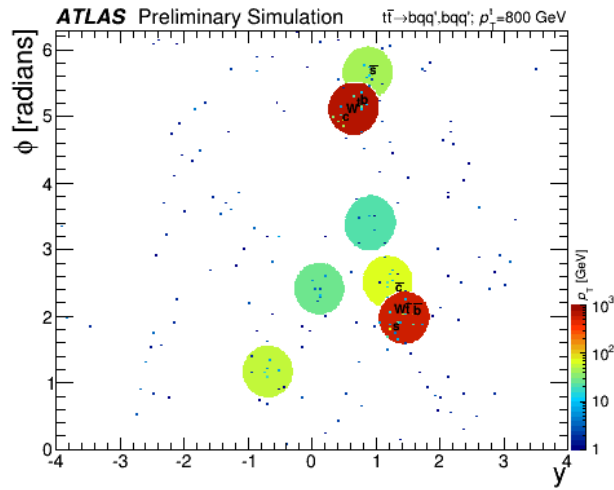
$$p_T^{\text{corr}} = p_T - \rho A_T - \alpha(N_{\text{PV}} - 1) - \beta\langle\mu\rangle$$

Residual correction

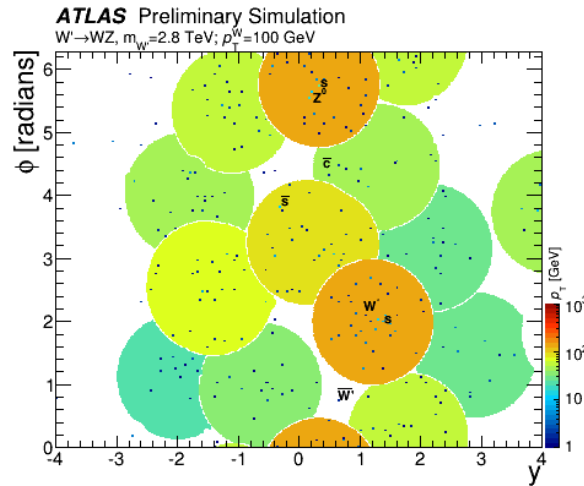


- Significant improvement of the jet  $p_T$  resolution
- **10-20% reduction in jet-by-jet pileup fluctuations**

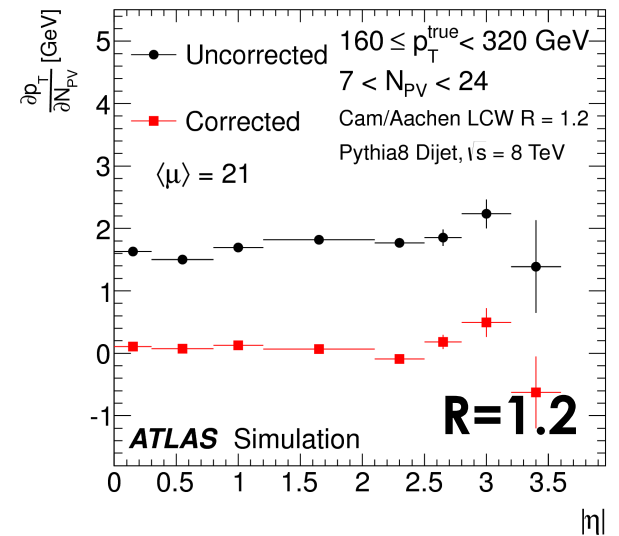
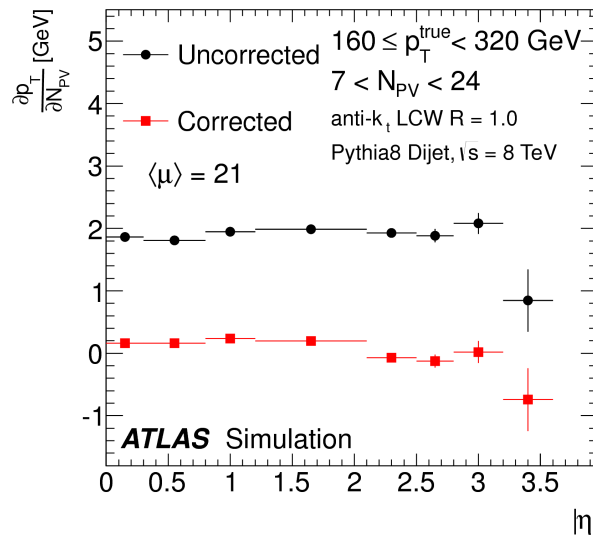
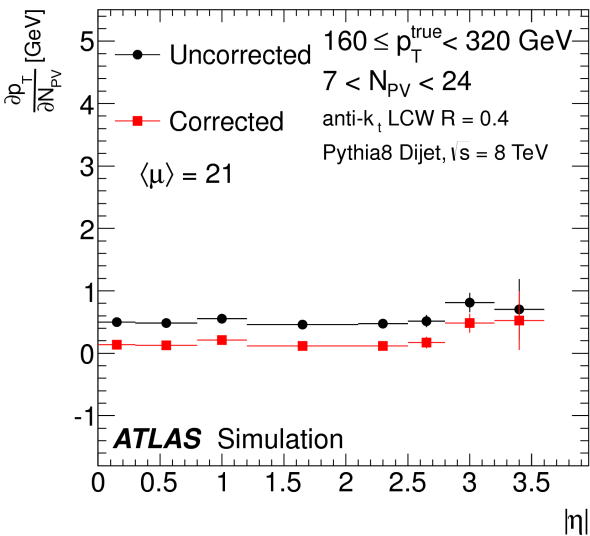
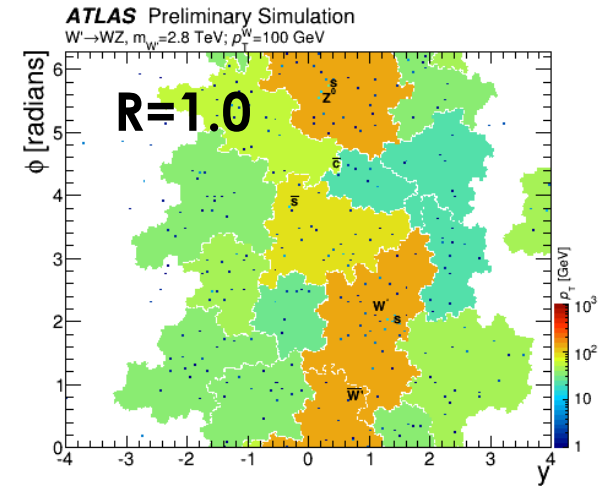
# anti- $k_T$ R=0.4



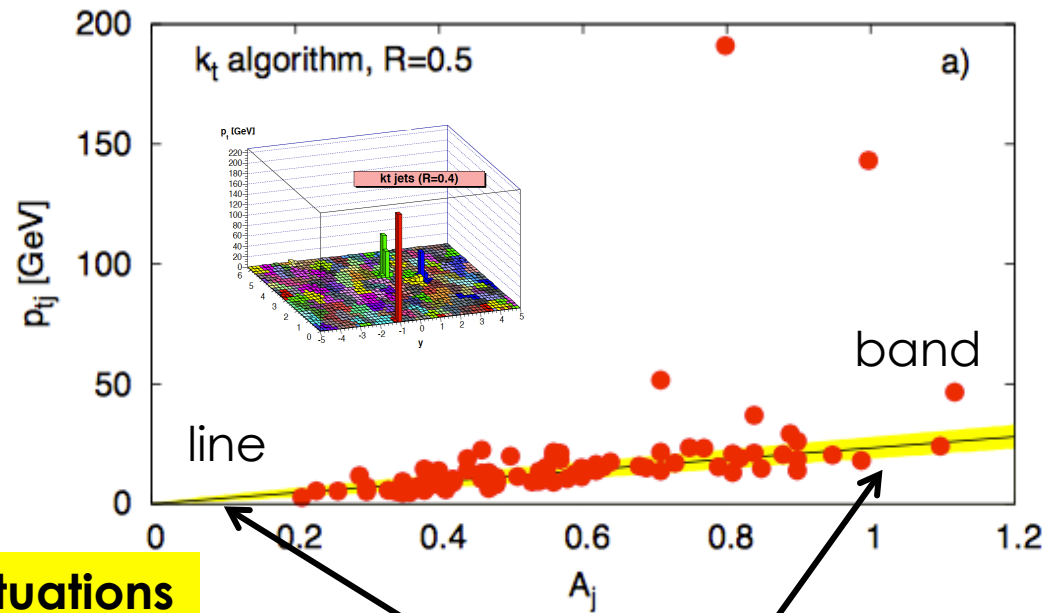
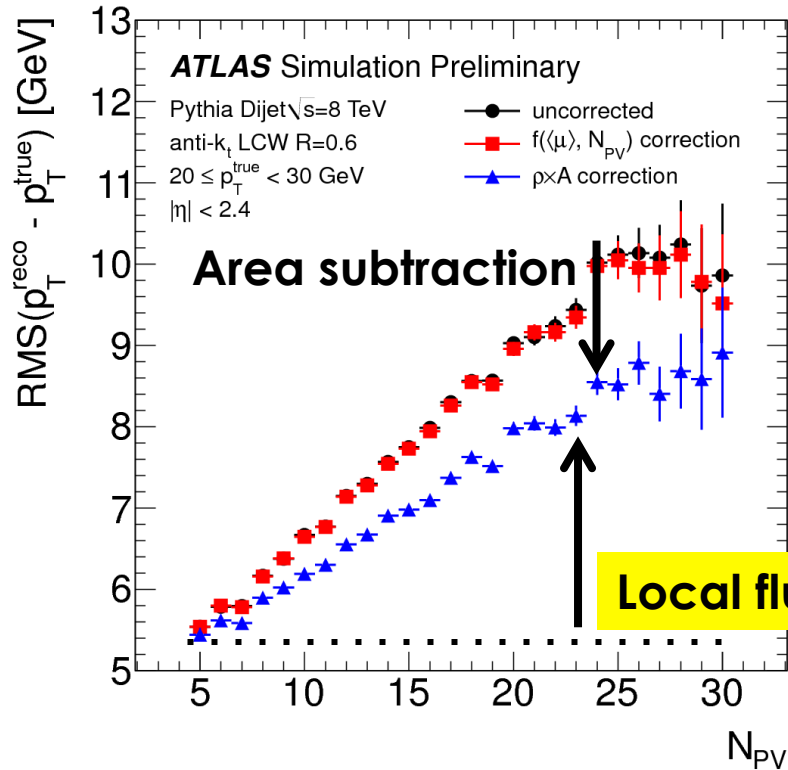
# anti- $k_T$ R=1.0



# C/A large-R



# Local pile-up fluctuations



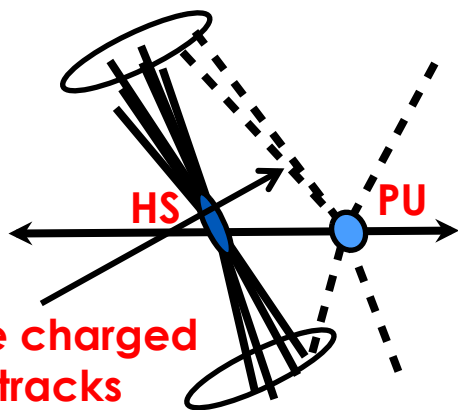
$$\Delta p_T = \rho A \pm \sigma_\rho \sqrt{A}$$

Geometrical  
contamination

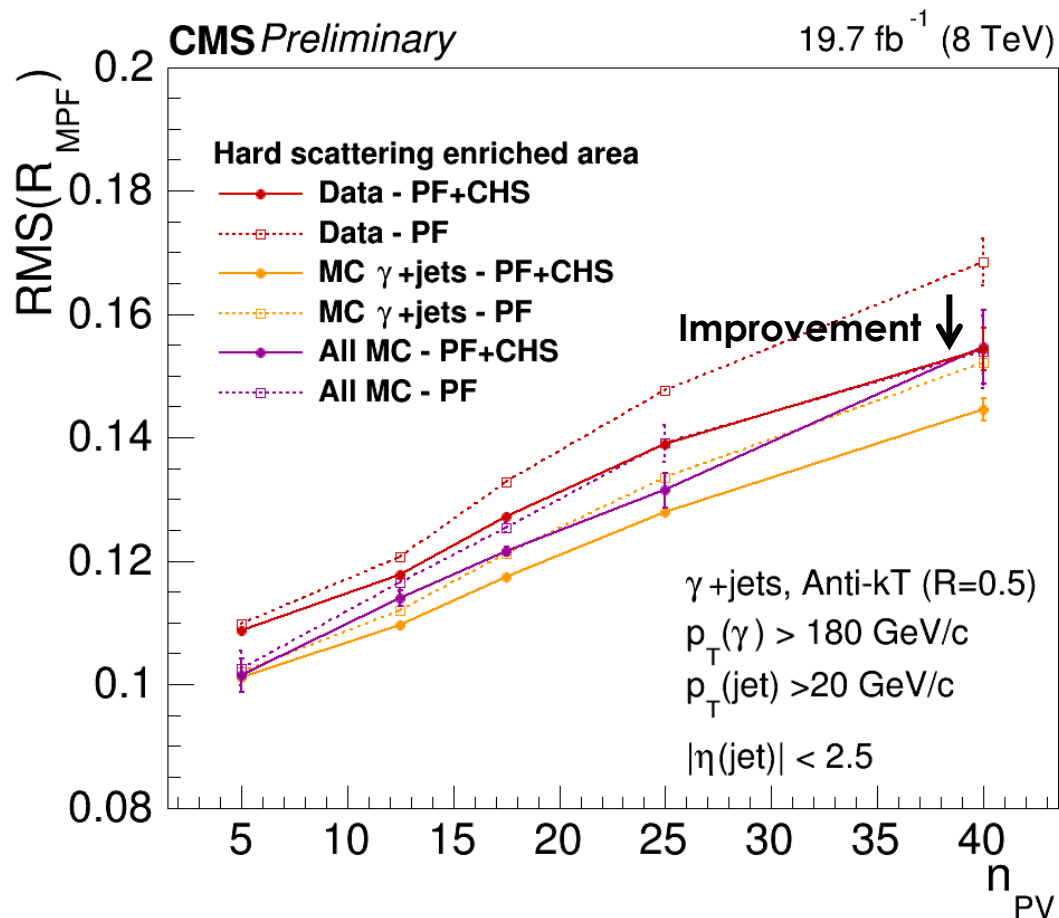
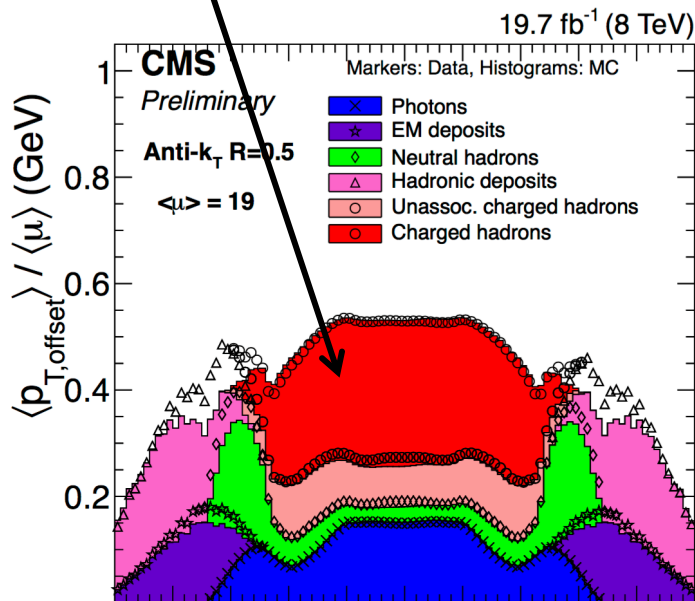
Fluctuations in  
the noise from  
point to point in  
the event: **local  
fluctuations**

$$p_T^{jet,corr} = p_T^{jet} - \rho \times A_T^{jet}$$

# CMS Charged Hadron Subtraction

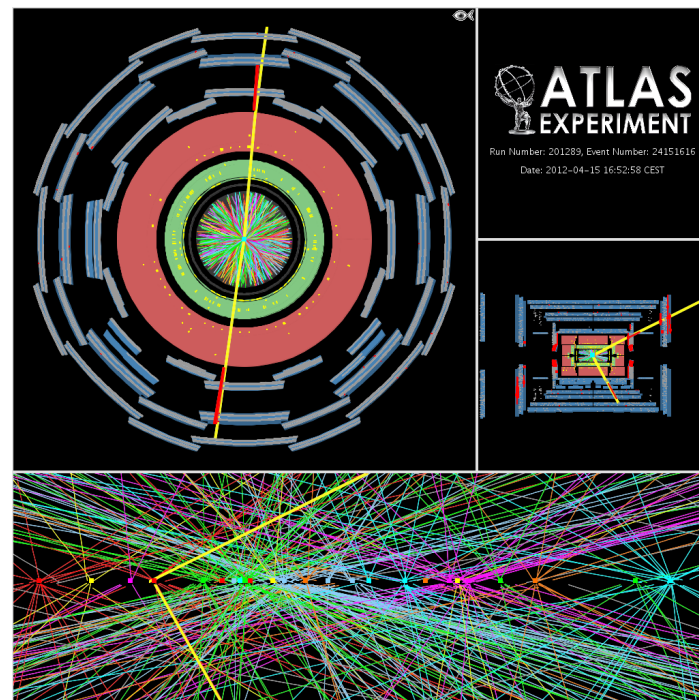
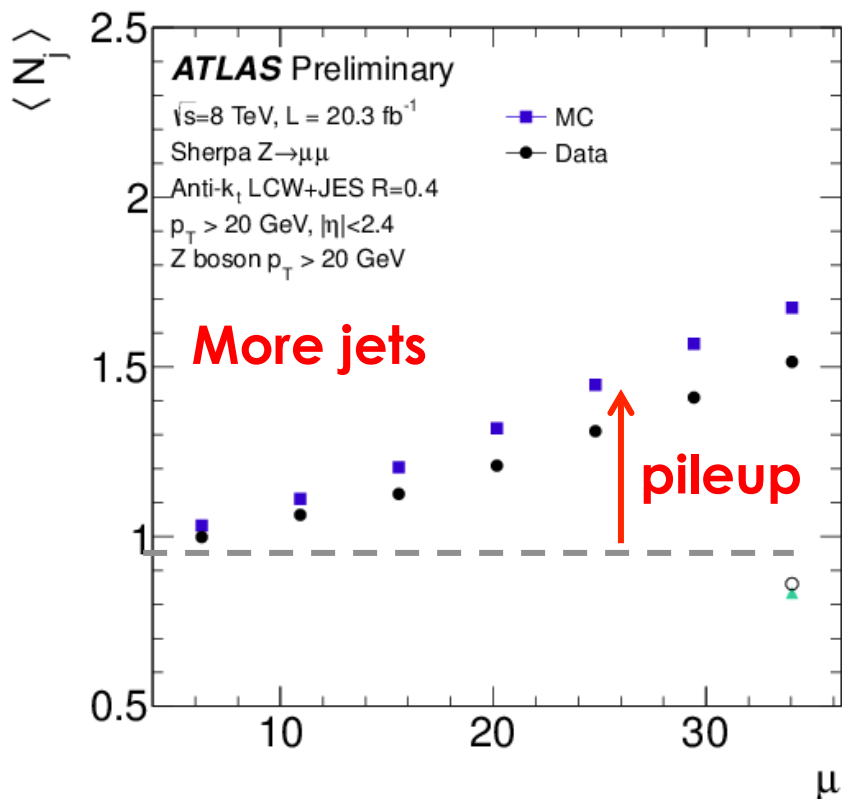


Remove charged pile-up tracks



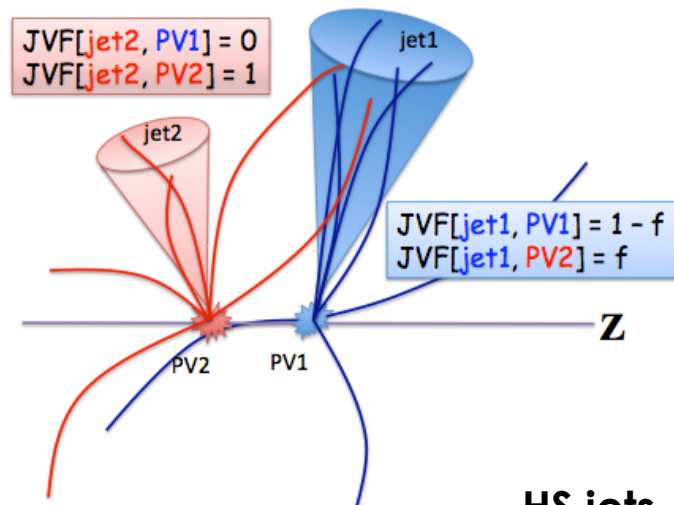
# Rejecting jets from pileup

- Pileup can create **pileup jets**:
  - QCD jets originating from a pileup vertex
  - Random combination of particles from multiple pileup interactions (“stochastic pileup jets”)



# Jet Vertex Tagging / JetID

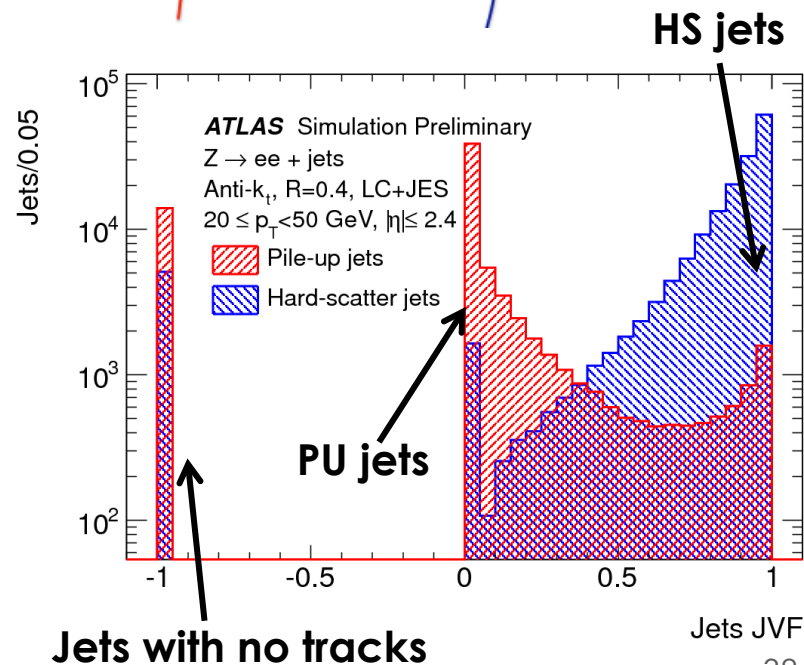
- **Jet vertex fraction algorithm (JVF)**
  - Tag and reject pileup jets using tracking and vertexing information



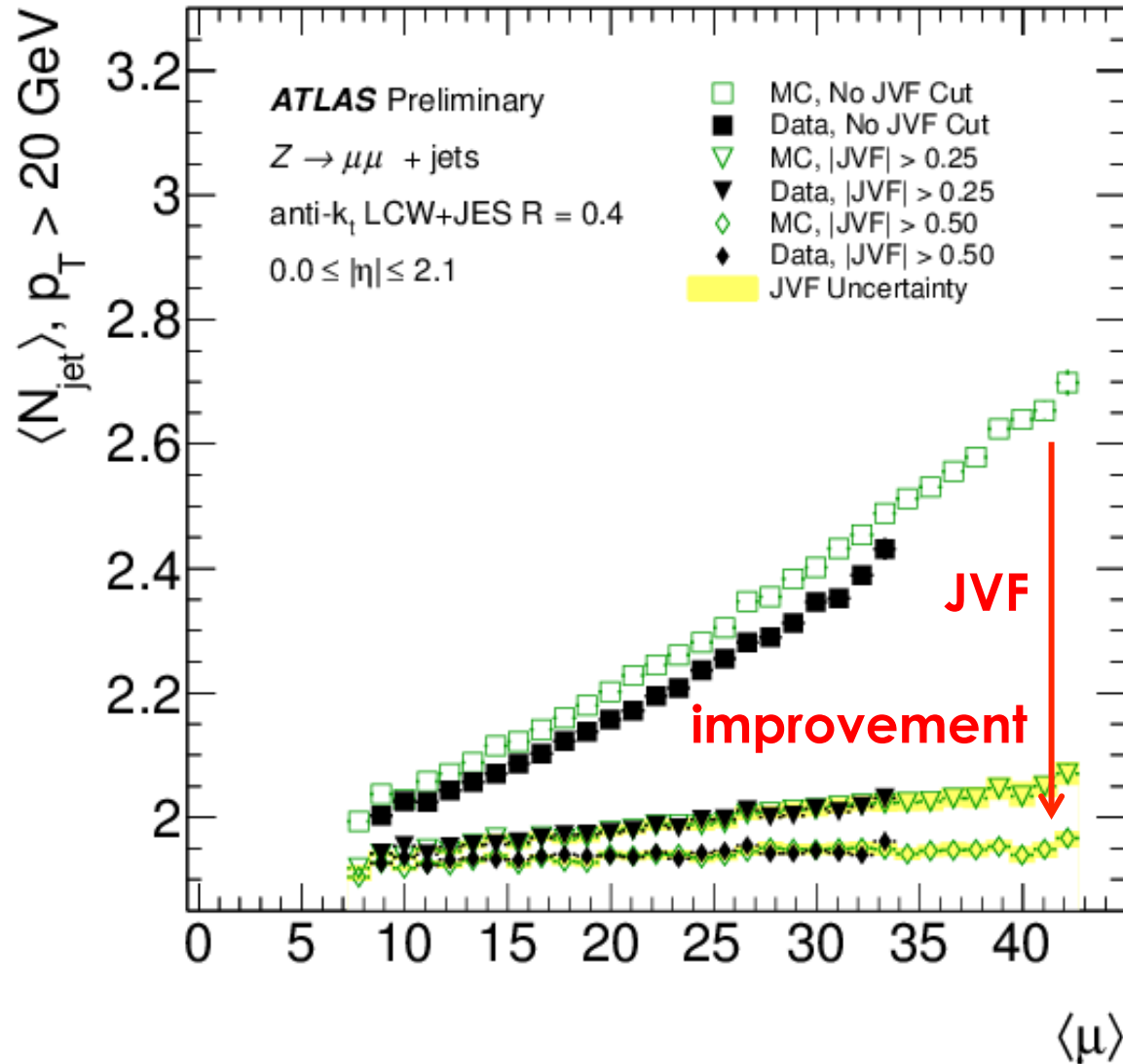
$$JVF = \frac{\sum p_T^{trk}(PV_0)}{\sum p_T^{trk}(PV_0) + \sum p_T^{trk}(PU_n)}$$

**ATLAS-CONF-2013-083**

**CMS PU Jet ID: CMS PAS JME-13-005**

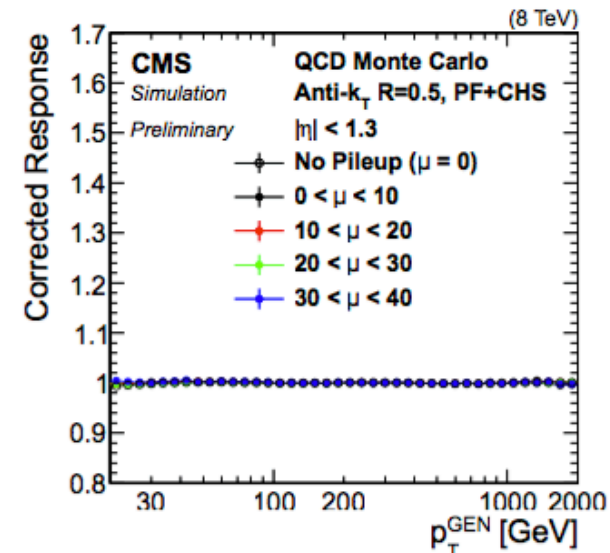
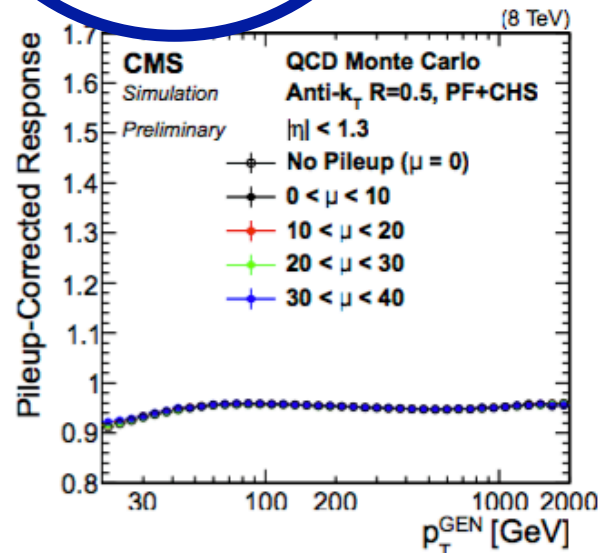
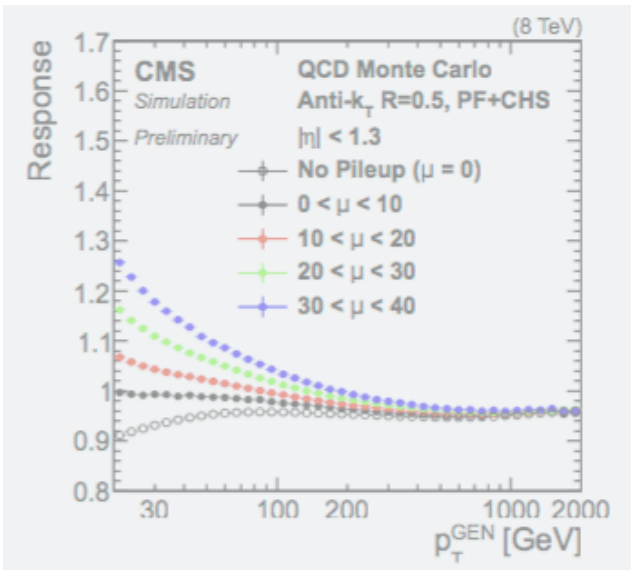
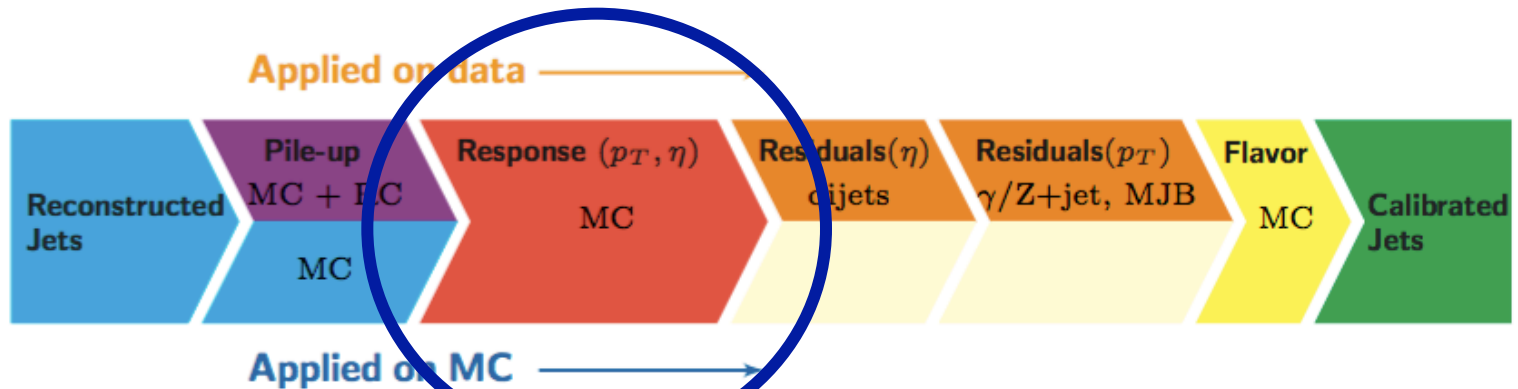


# JVF pileup jet suppression



- JVF restores the  $N_{\text{jet}}$  distribution as a function of pileup
- Improves the data/MC agreement

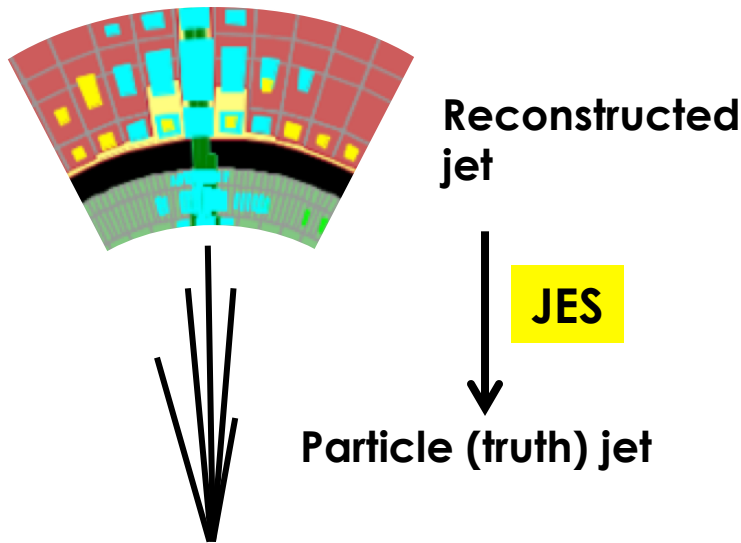
# Jet calibration overview



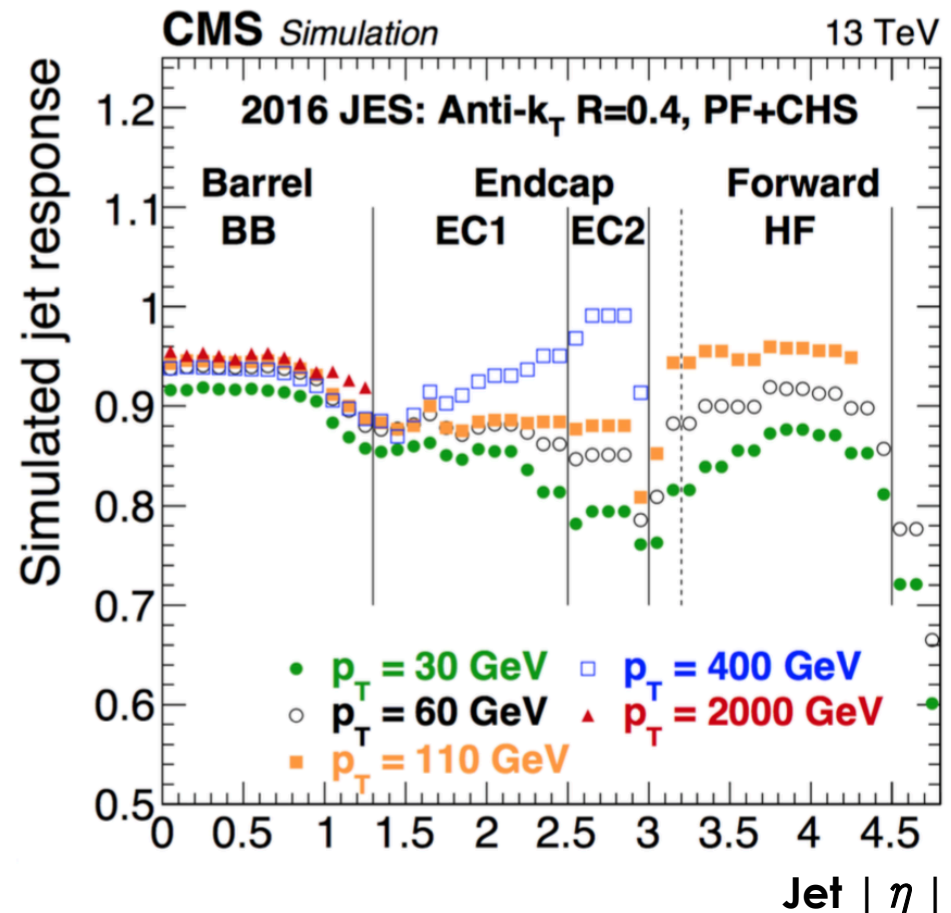


# Jet energy scale correction

- Multiplicative factor (JES) derived as a function of jet  $p_T$  ( $E$ ) and  $\eta$  in di-jet Monte Carlo events:  $JES = 1 / R(E, \eta)$

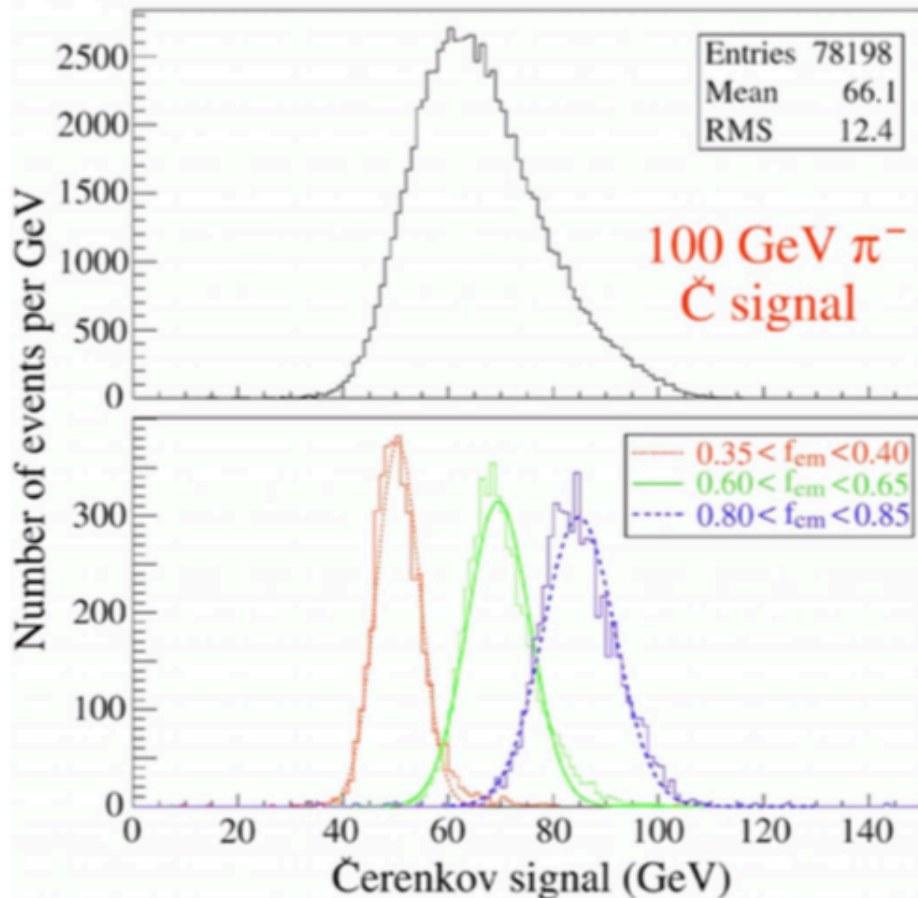


$$R(E, \eta) = \left\langle \frac{E^{reco}}{E^{truth}} \right\rangle$$



# Reducing fluctuations (I)

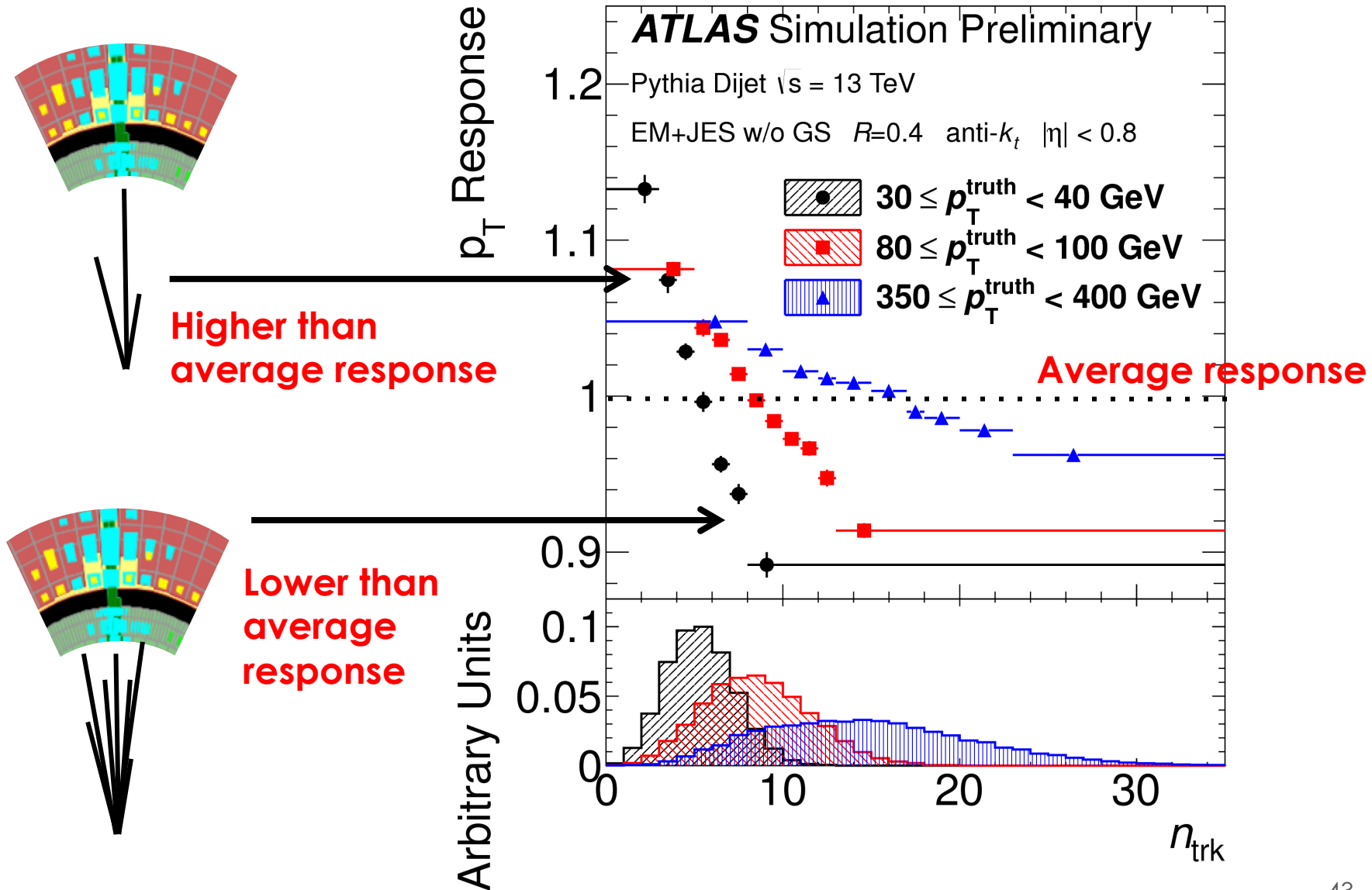
DREAM: Effect of event selection based on  $f_{em}$



In non-compensating ( $e/h > 1$ ) calorimeters, the energy resolution is driven by the large fluctuations in the EM shower fraction

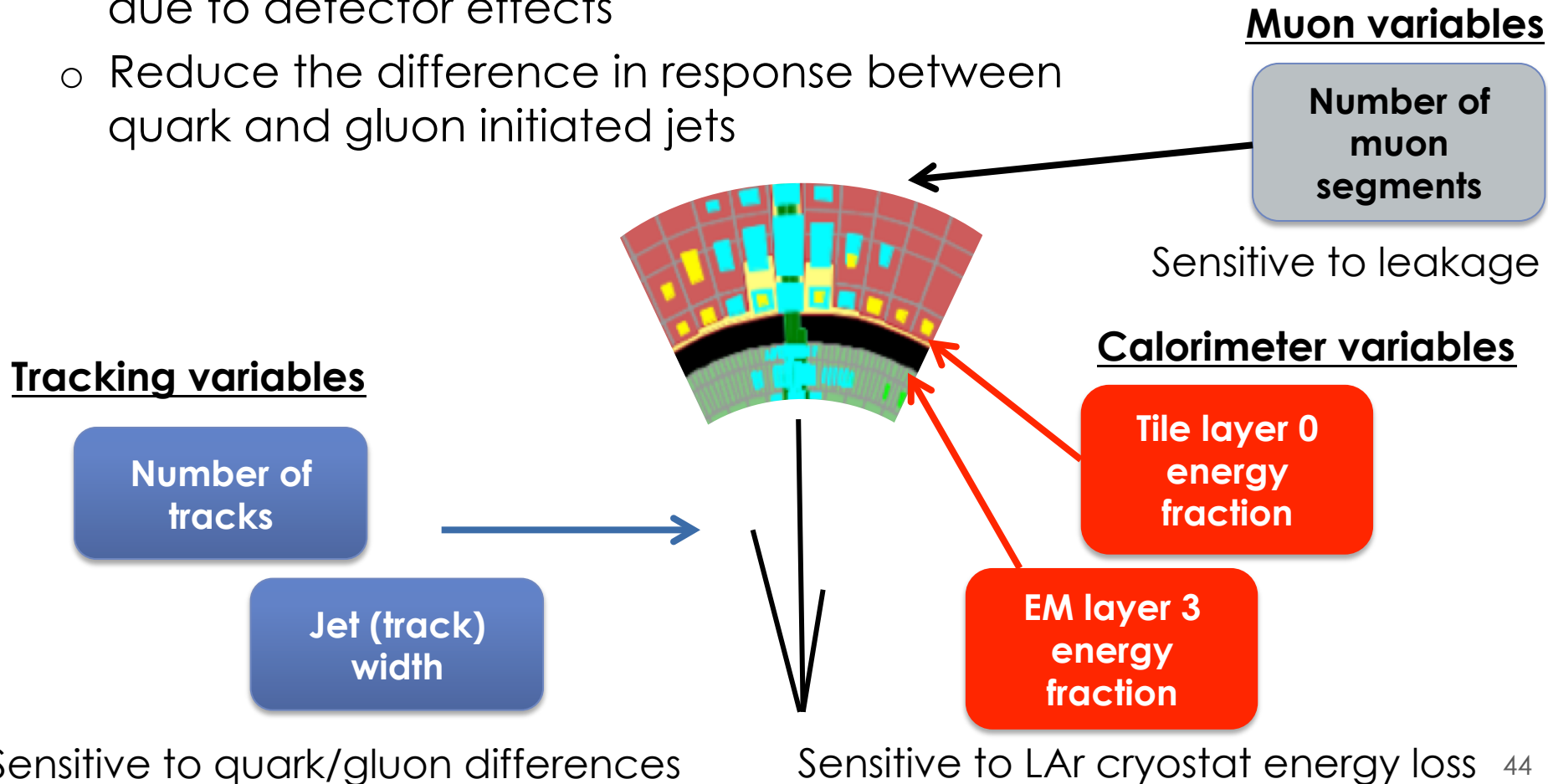
ATLAS uses a method *inspired* by dual-readout calorimetry to improve the jet energy resolution

# Reducing fluctuations (II)



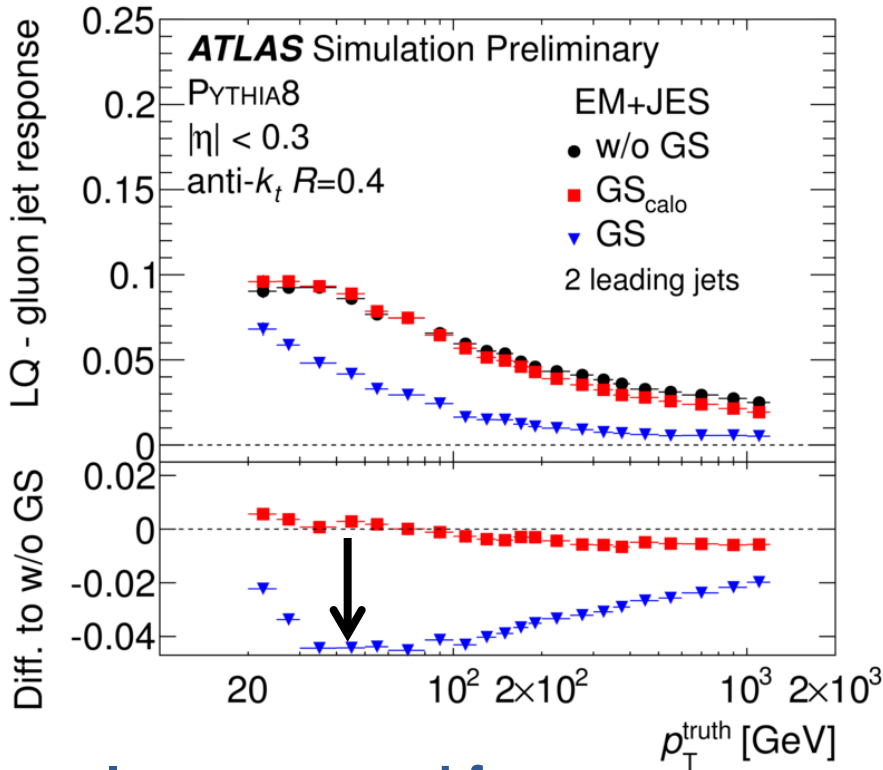
# Global Sequential Calibration

- Use jet-by-jet information to correct the response of **each jet individually** after the average JES correction
  - Reduce fluctuations in the jet energy response due to detector effects
  - Reduce the difference in response between quark and gluon initiated jets



# Global Sequential Calibration

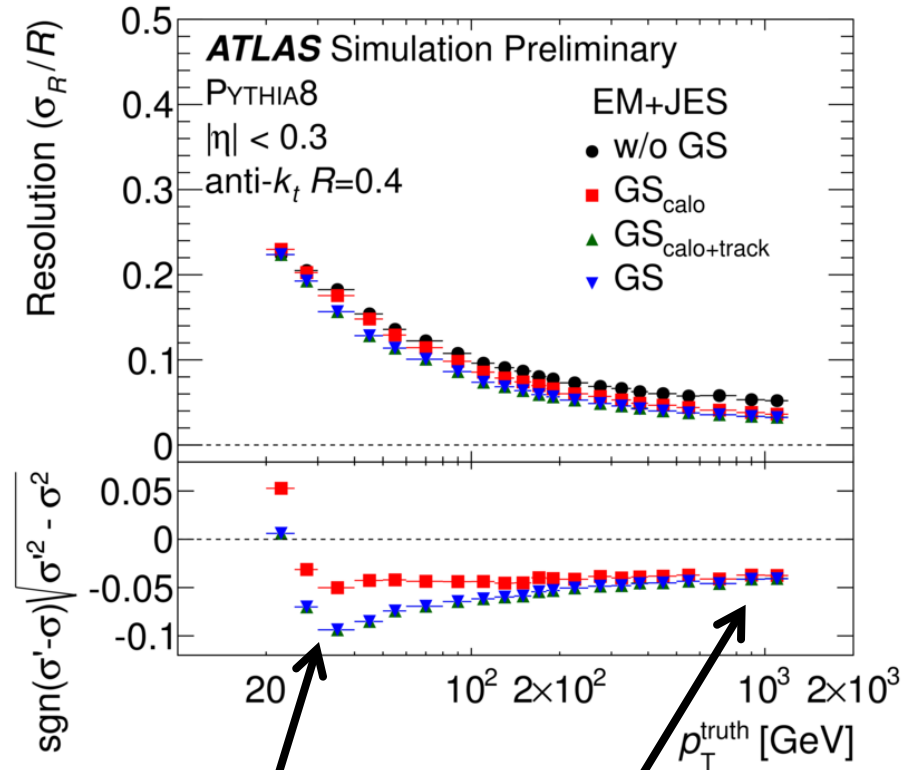
## Quark/Gluon response difference



Improvement from tracking variables

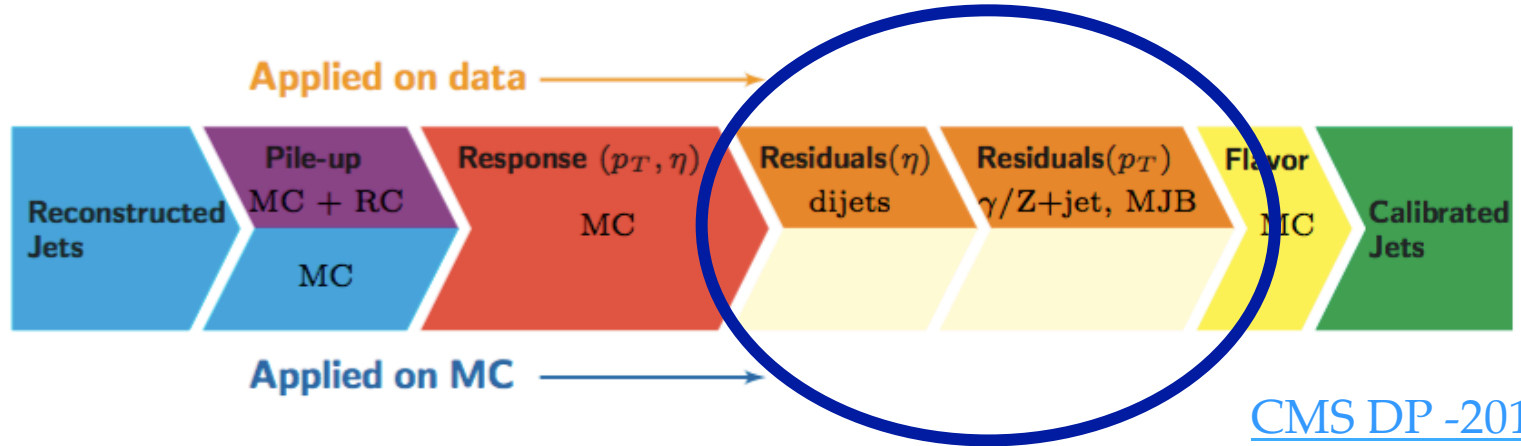
Improvement from tracking variables at low  $p_T$

## Jet energy resolution



Improvement from calorimeter variables at high  $p_T$

# Jet calibration overview



[CMS DP -2016/020](#)  
[JETM-2016-002](#)

## Residual *in situ* jet energy scale correction:

- Brings the energy response of jets in data and MC to agreement, reducing a major source of systematic uncertainty

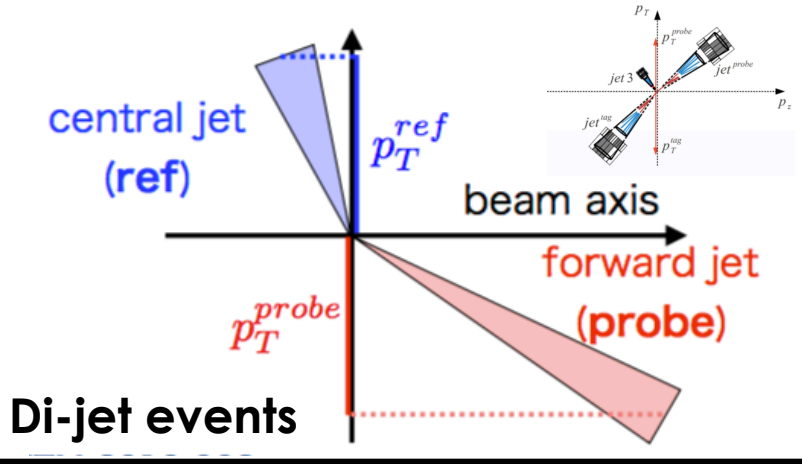
$$JES^{in\,situ} = \frac{\left\langle p_T^{jet} / p_T^{ref} \right\rangle_{MC}}{\left\langle p_T^{jet} / p_T^{ref} \right\rangle_{DATA}}$$

Reference objects:  
 $Z, \gamma, jets$

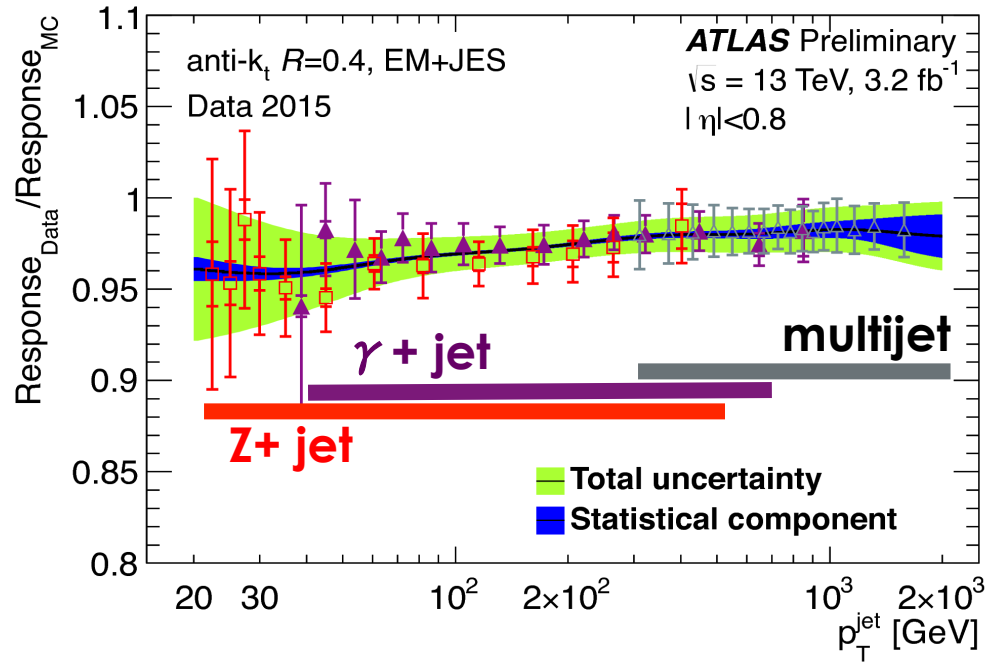
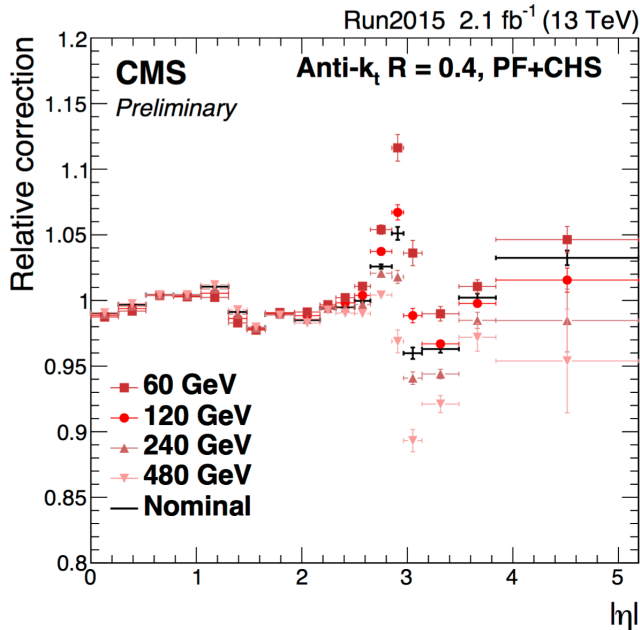
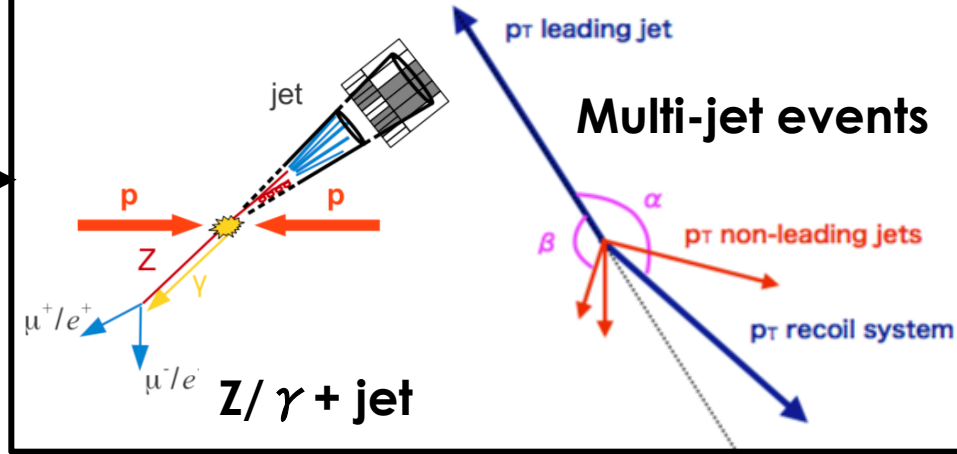
- Jet energy scale uncertainty determined by the **uncertainty on the measurement of the jet response in data**

# In situ jet energy calibration

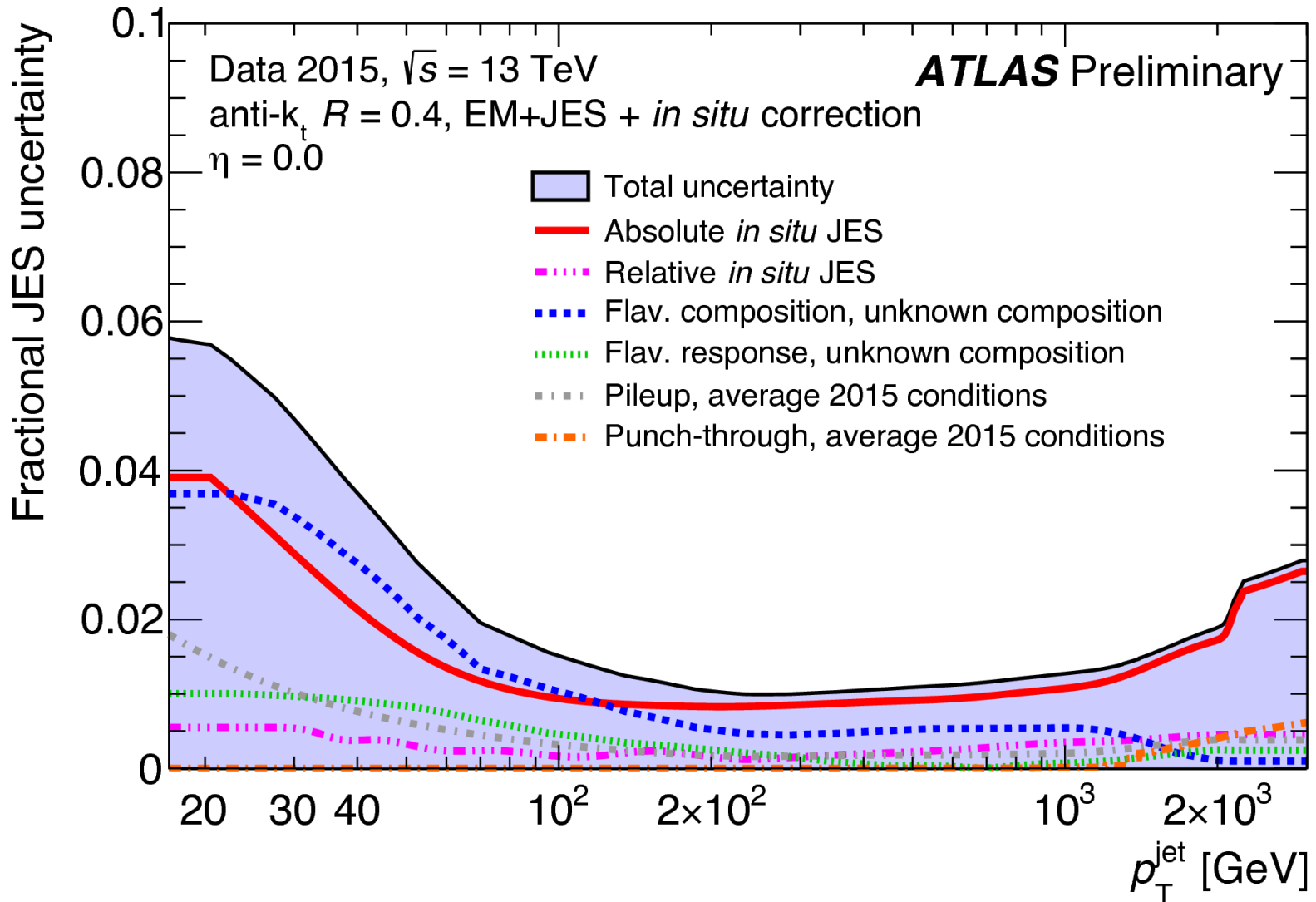
## Relative $\eta$ inter-calibration



## Absolute $p_T$ calibration



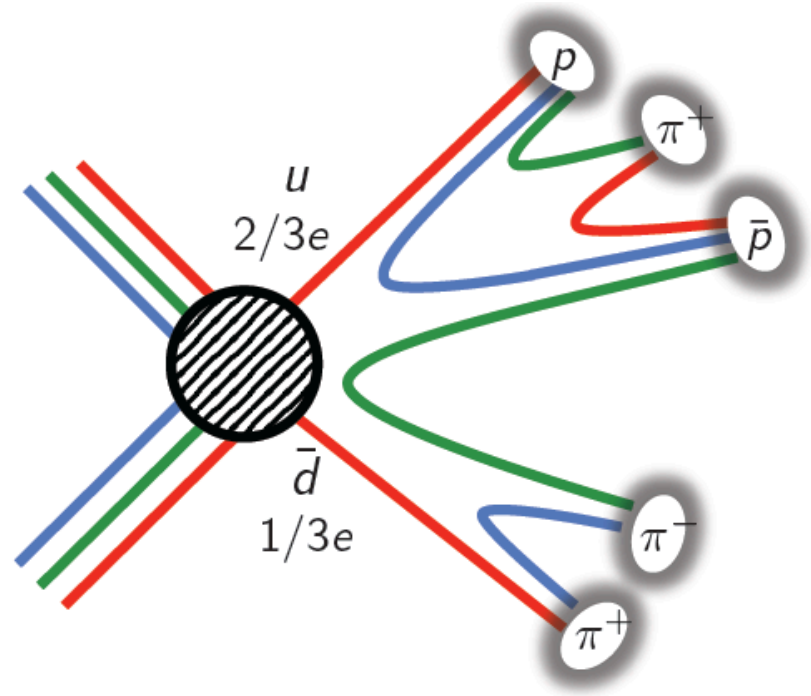
# Systematic uncertainties





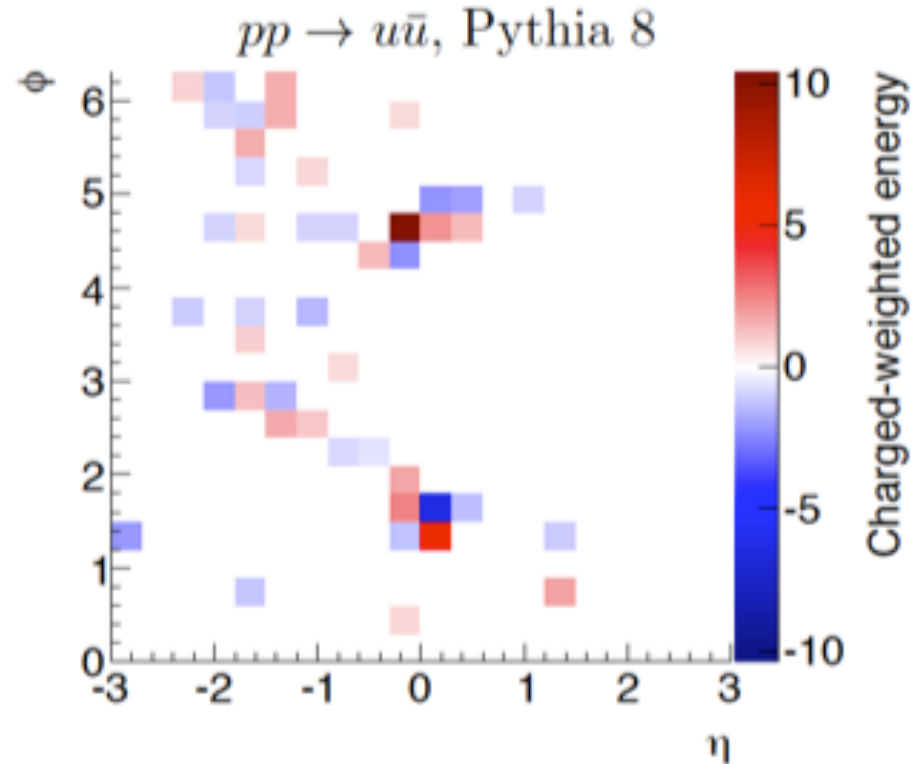
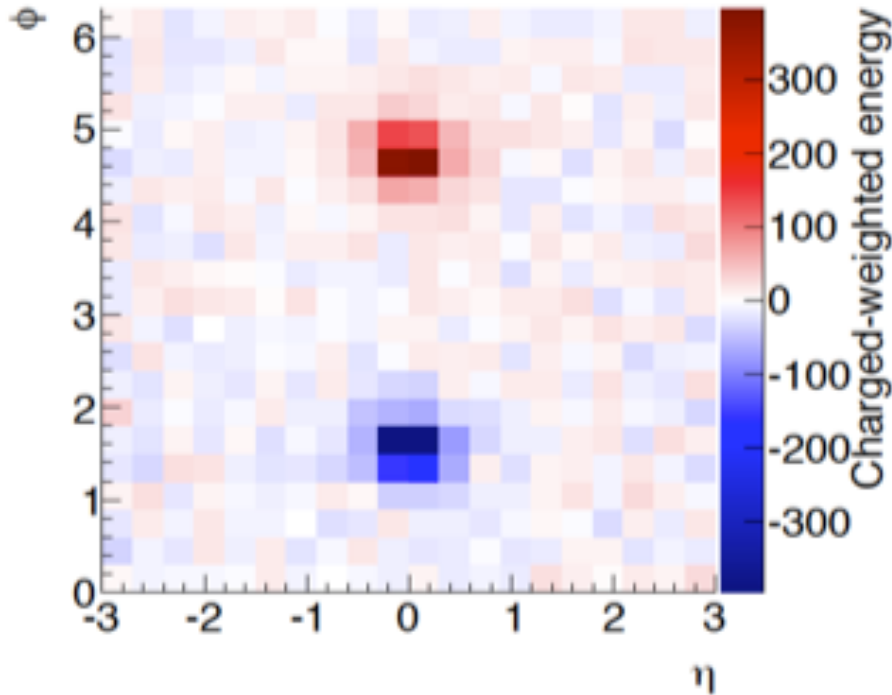
# Jet quantum properties

- Exploit the internal jet (and event) substructure to measure jet quantum properties:
  - **Electric charge**
  - Color charge
    - **Quark vs. gluons**
    - **Color connections between jets**
- Tools to enhance precision measurements (Higgs, VBF final states) and to characterize new physics



# Jet charge (I)

$pp \rightarrow u\bar{u}$ , Pythia 8  
(re-showered 10k times)



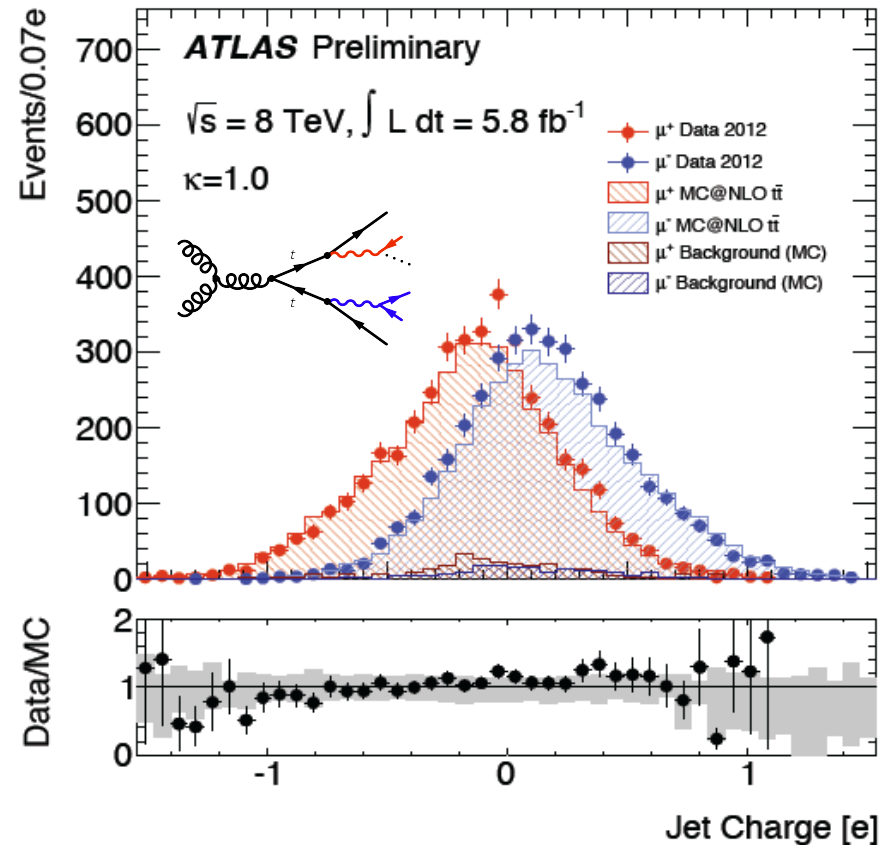
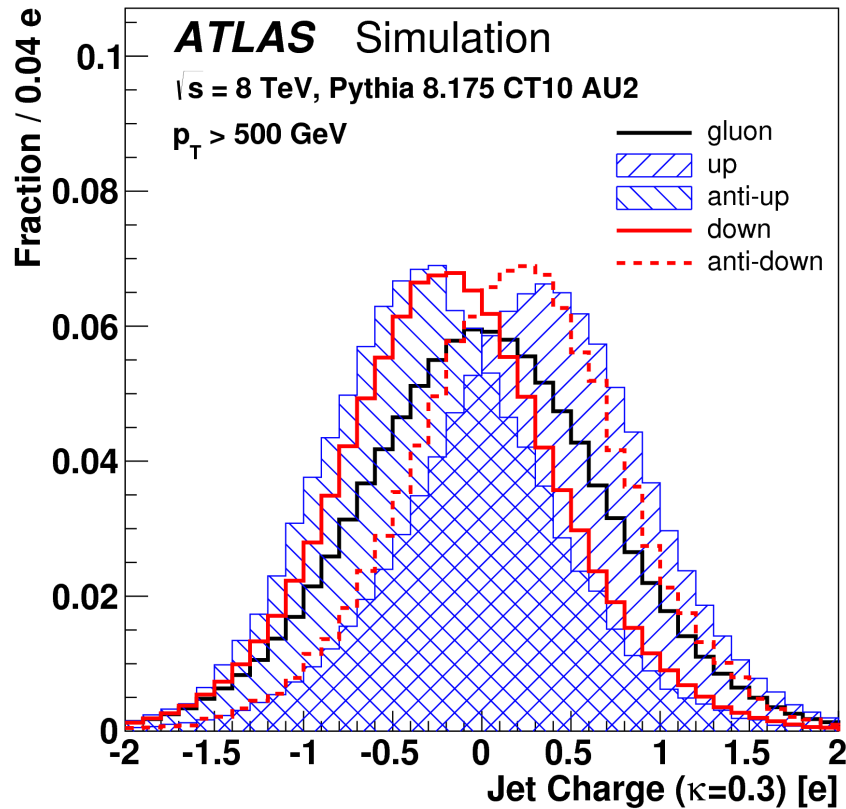
## Weighted sum over track

charges is an experimental handle on the electric charge of jets (Field, Feynman, 1978)

$$Q_j = \frac{1}{(p_{T_j})^\kappa} \sum_{i \in \text{tracks}} q_i \times (p_T^i)^\kappa$$

# Jet charge (II)

ATLAS-CONF-2013-086  
CMS PAS SMP-15-003



$$Q_j = \frac{1}{(p_{T_j})^\kappa} \sum_{i \in \text{tracks}} q_i \times (p_T^i)^\kappa$$

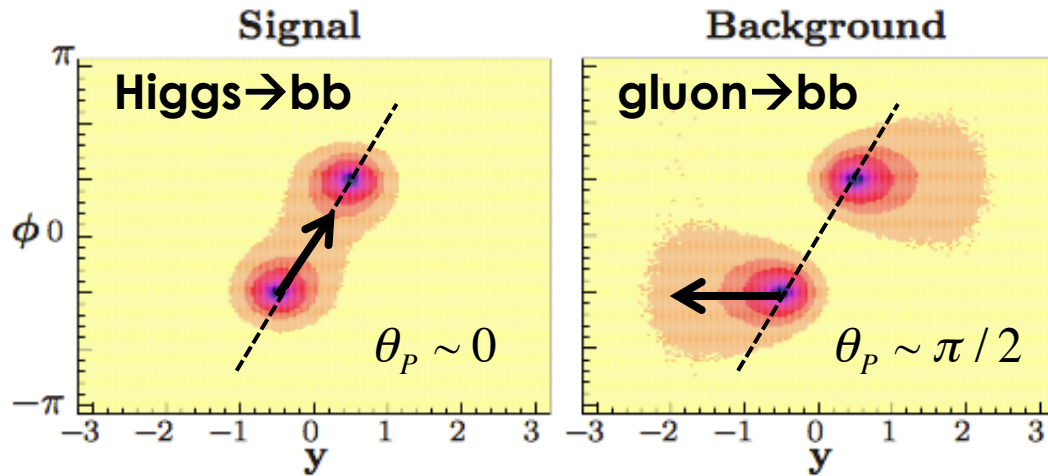
# Color flow: jet pull (I)

- Observable designed to be sensitive to the color connections between the hard-scatter partons initiating the jets

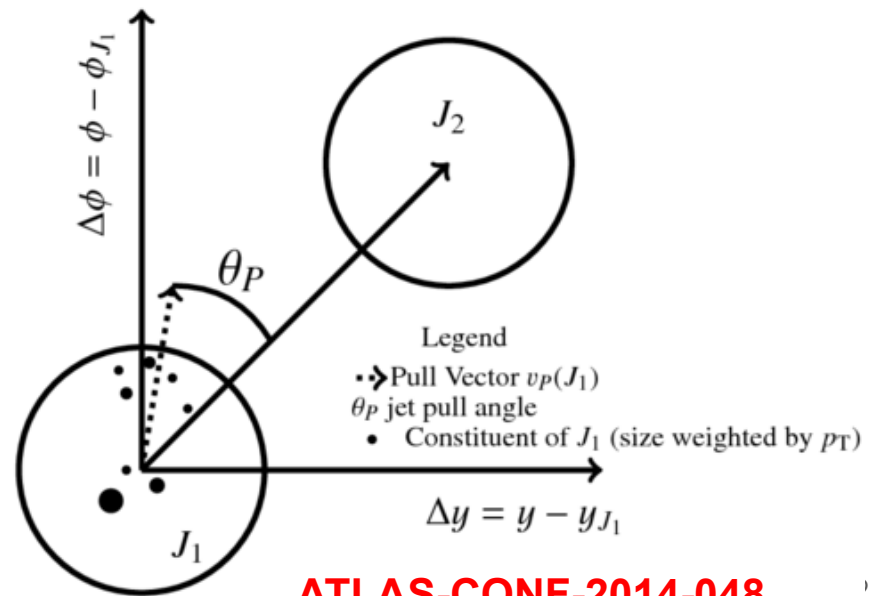
- Multiple physics applications (QCD, Higgs, new particle searches...)

**Jet Pull Vector** 
$$\sum_{i \in J} \frac{p_T^i |r_i|}{p_T^J} \vec{r}_i$$

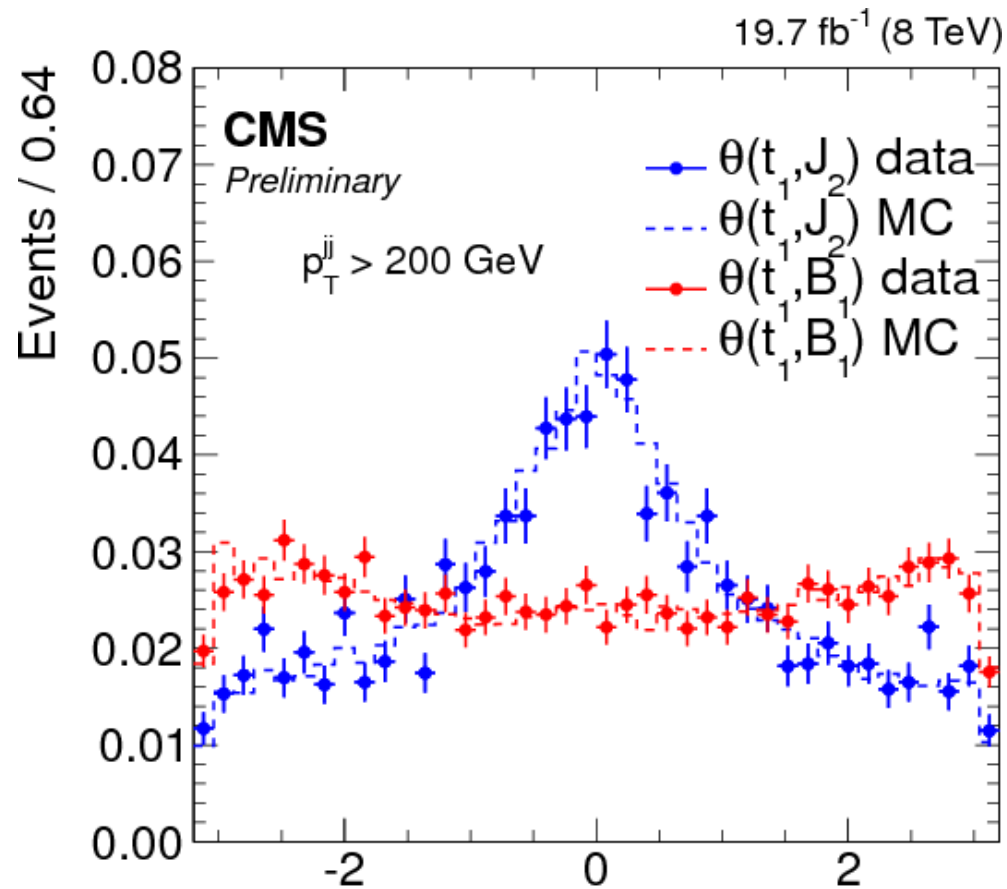
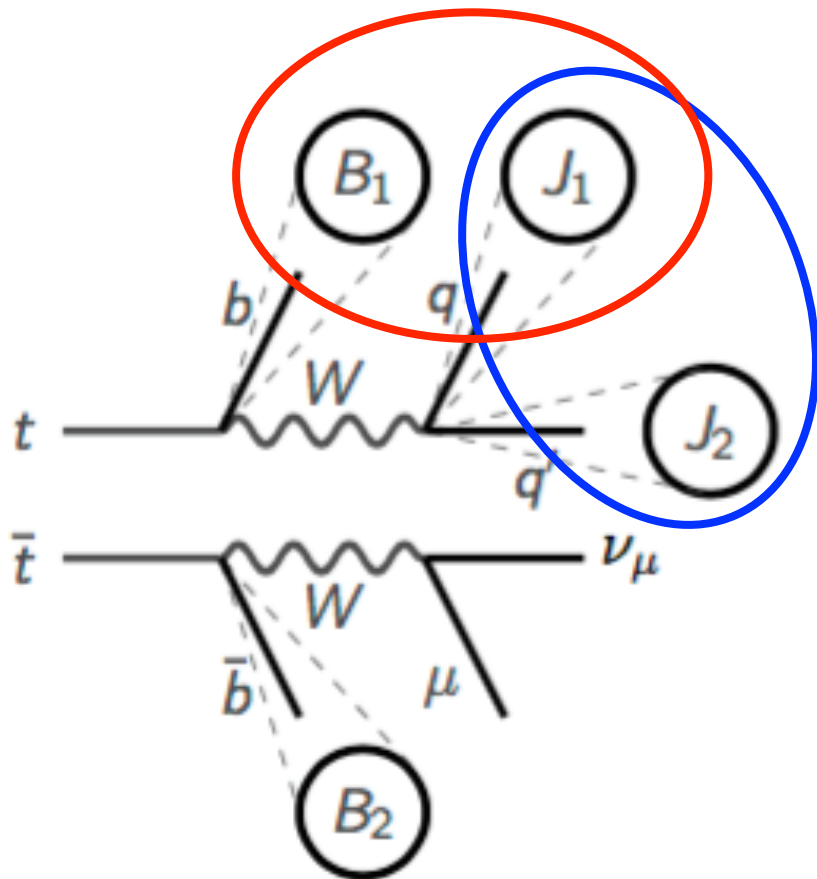
$\theta_p(J_1, J_2)$  = angle between  $J_1$  pull vector and the vector connecting  $J_1$  and  $J_2$



**Jet Superstructure (Schwartz and Gallicchio)**  
arXiv:1001.5027



# Color flow: jet pull (II)



- Study jet pull in data using jets from hadronic W's in  $t\bar{t}$  events

**CMS-PAS-JME-14-002**  
**ATLAS-CONF-2014-048**

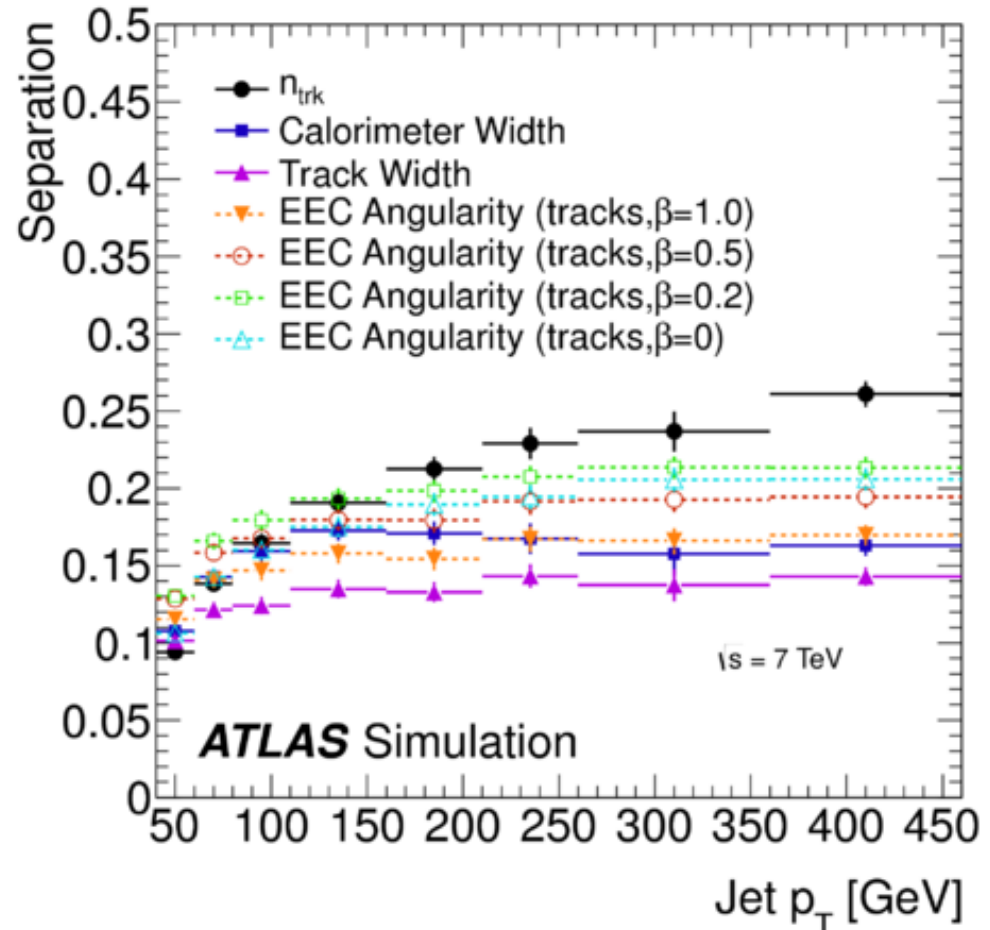
$\theta_P$

# Quark-gluon jet tagging

- Distinguish quark from gluon initiated jets using jet properties that result from the **different color charge between quark ( $C_F=4/3$ ) and gluon ( $C_A=3$ )** partons

$$\frac{\langle N_g \rangle}{\langle N_q \rangle} = \frac{C_A}{C_F} = \frac{9}{4}$$

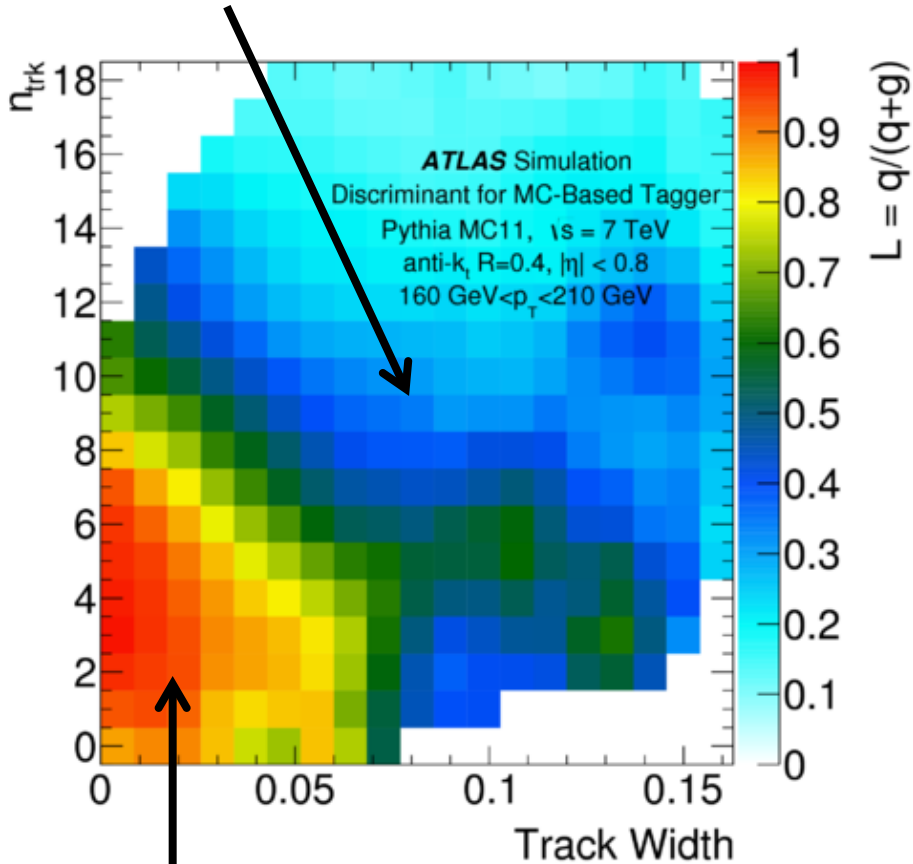
- Gluons are expected to have more particles, be wider, and have a softer particle spectrum



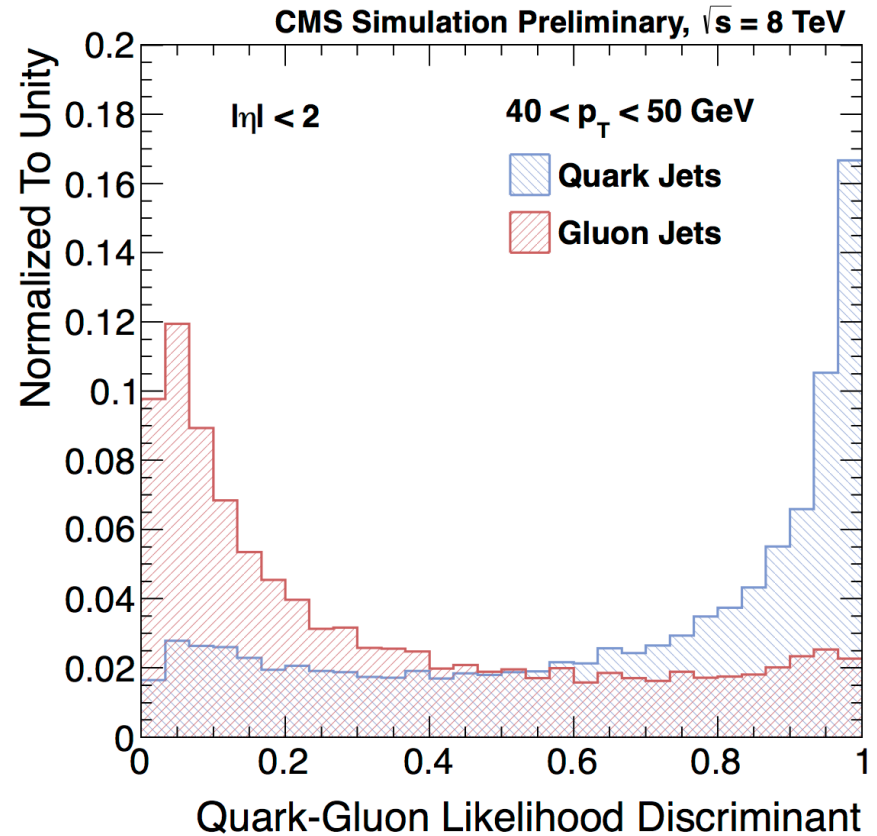
**Eur. Phys. J. C (2014) 74: 3023**  
**CMS-PAS-JME-13-002**

# Quark-gluon jet tagging

Glun-like

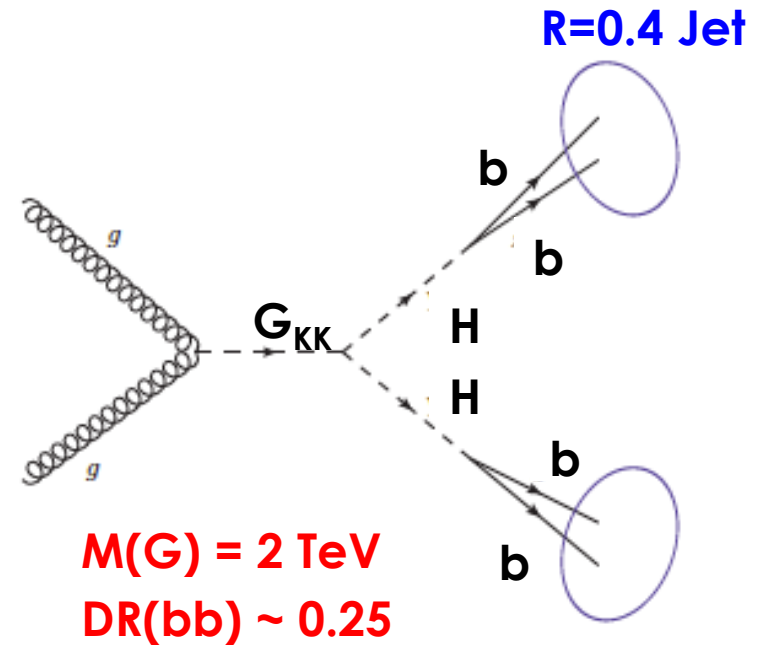
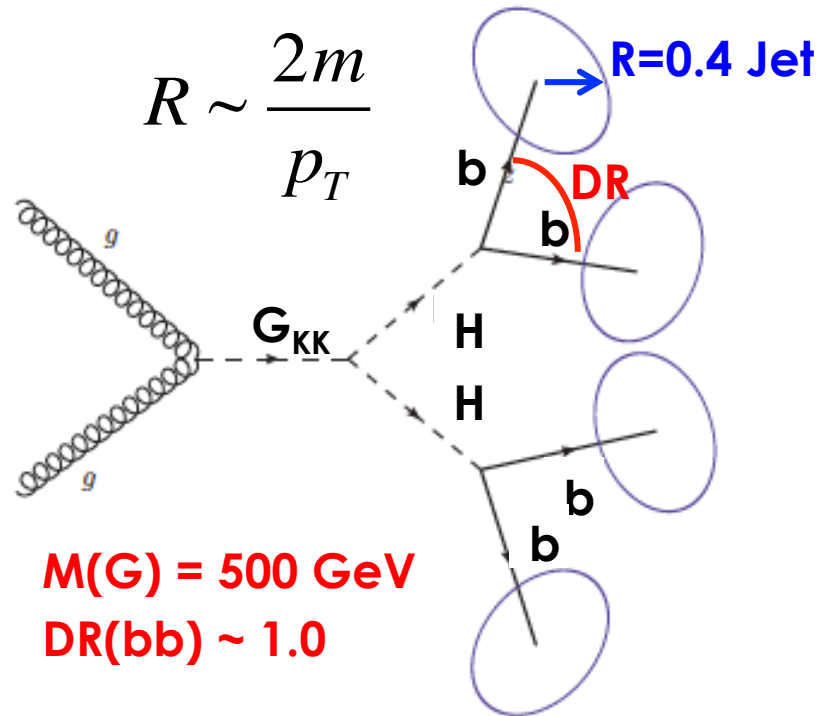


Quark-like



# Boosted EW objects

Due to the large hierarchy of scales at the LHC ( $\sqrt{s} \gg M_{EW}$ ), heavy electroweak particles can be highly boosted



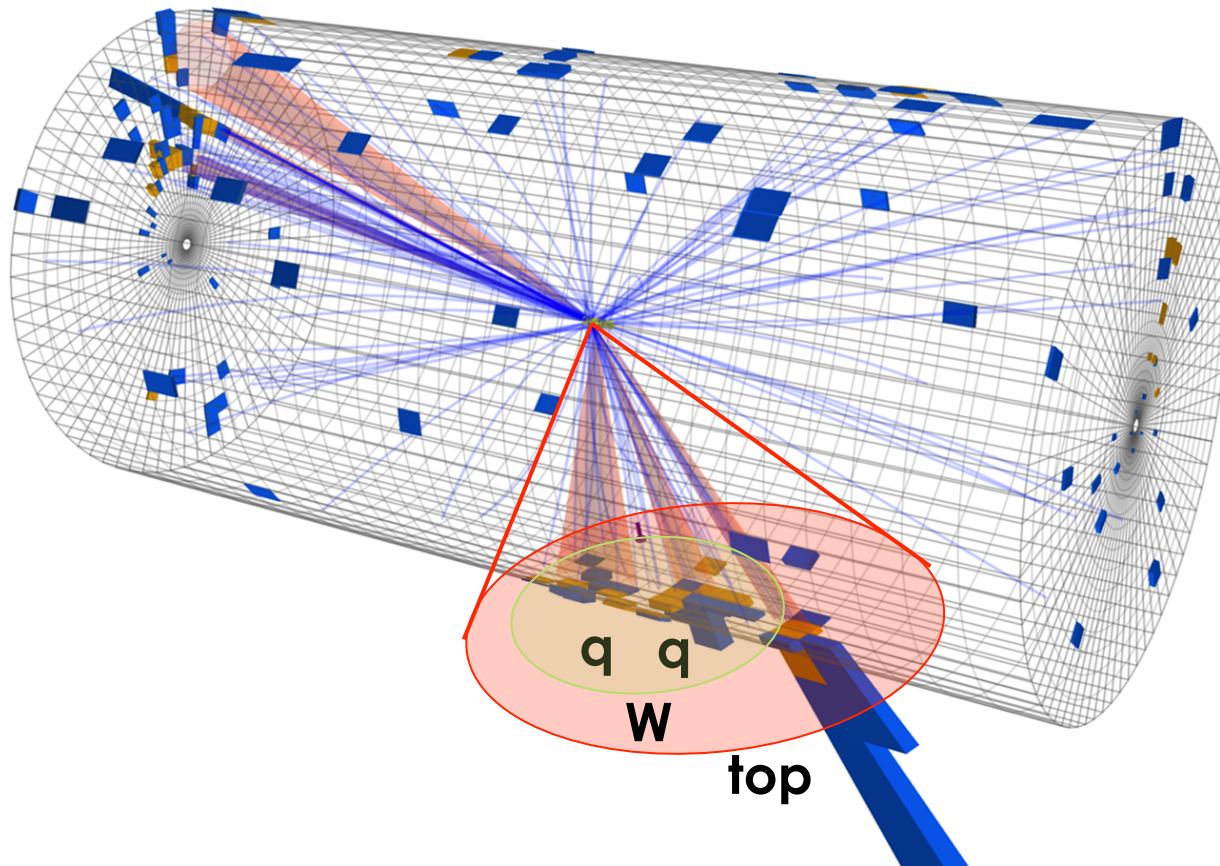
**Boosted regime:** EW decay products are collimated and merged within a single jet





CMS Experiment at LHC, CERN  
Data recorded: Sun Jul 12 07:25:11 2015 CEST  
Run/Event: 251562 / 111132974  
Lumi section: 122  
Orbit/Crossing: 31722792 / 2253

# Boosted top pair candidate event



# Jet substructure

## Use large radius jets + internal jet structure:

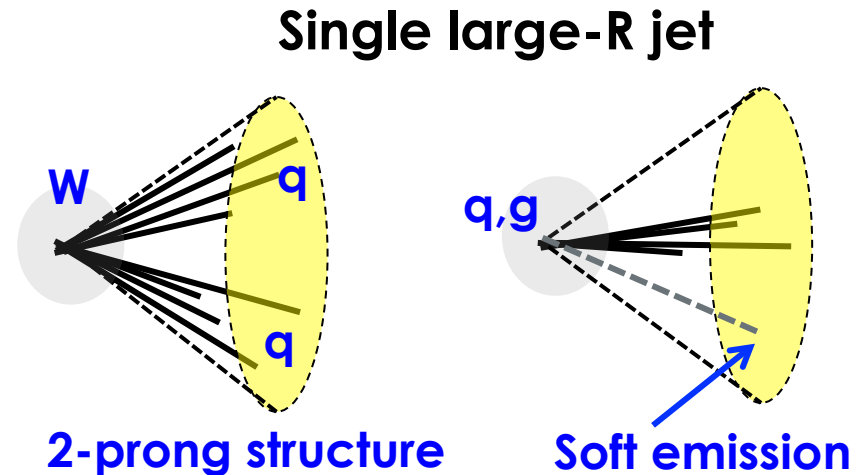
Large-R jets from the decay of a massive particle have different characteristics than jets originating from quarks and gluons (soft divergences in QCD)

See K. Ellis' lecture 3

- **Two main challenges:**

- **Very large QCD background**
- **High pileup**

- Contamination proportional to the area of the jet:
  - x6 increase from  $R=0.4$  to  $R=1.0$



- **Jet mass**
- **N-prong structure**
- **Radiation pattern**

# Jet substructure

Two major ideas:

## Tagging

Identify the internal structure of jets

**Reduce QCD background**

## Grooming

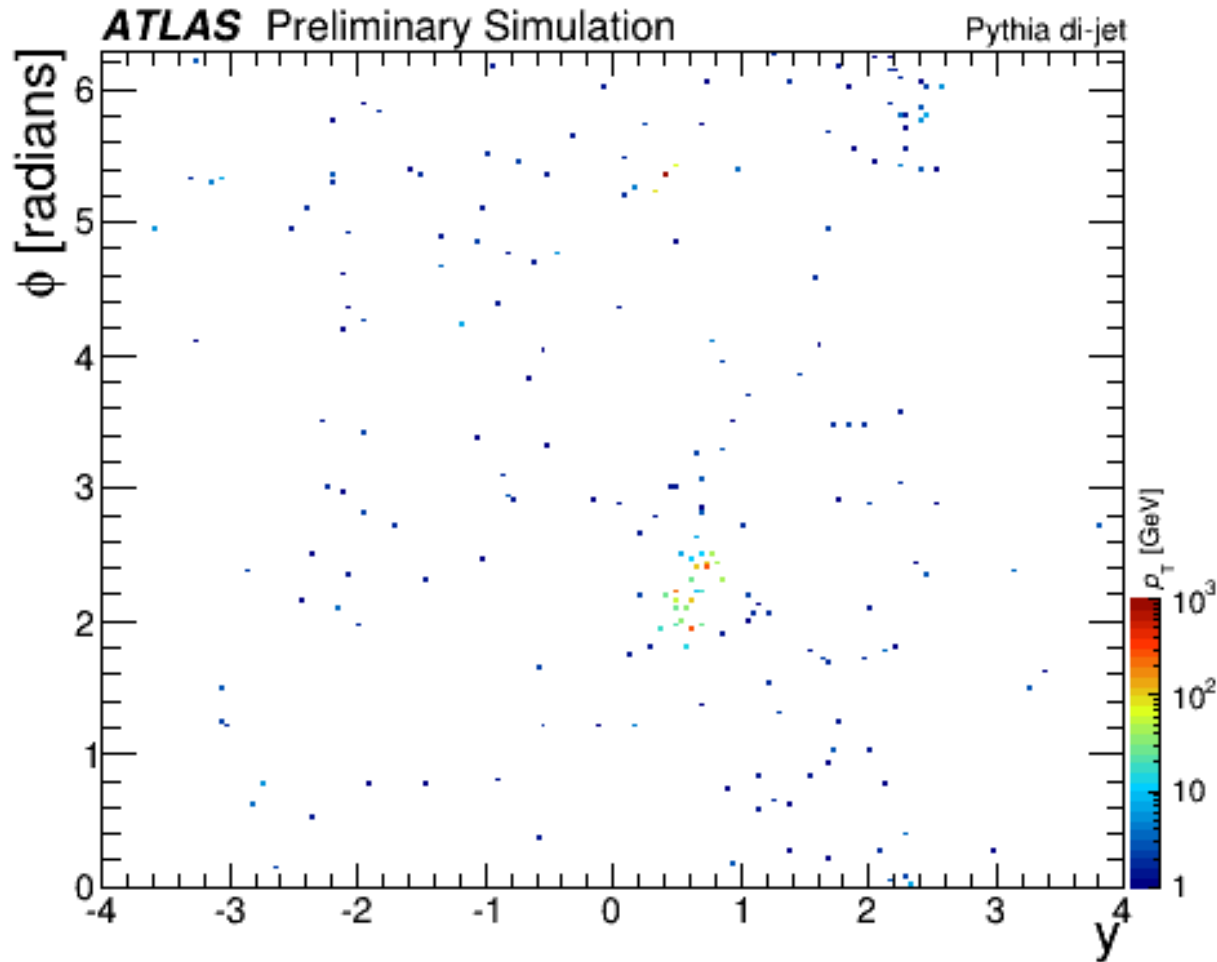
Reduce contamination from pile-up

**Improve the signal mass resolution**

## Many techniques!

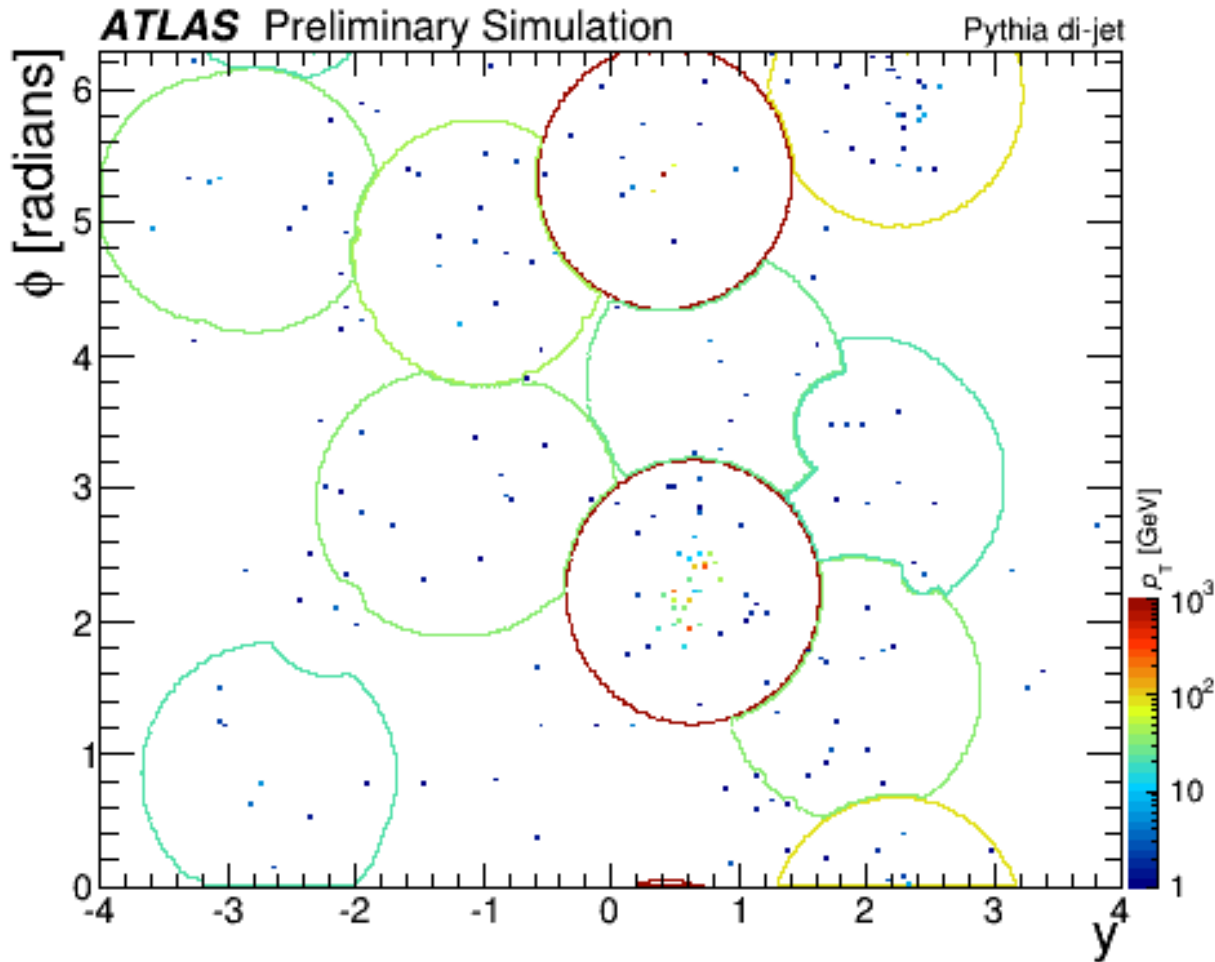
- trimming, filtering, pruning, mass drop, soft drop, HEPTopTagger, Shower Deconstruction, N-subjettiness, planar flow, energy correlations, template method, jet images,...

# Jet trimming (1/4)



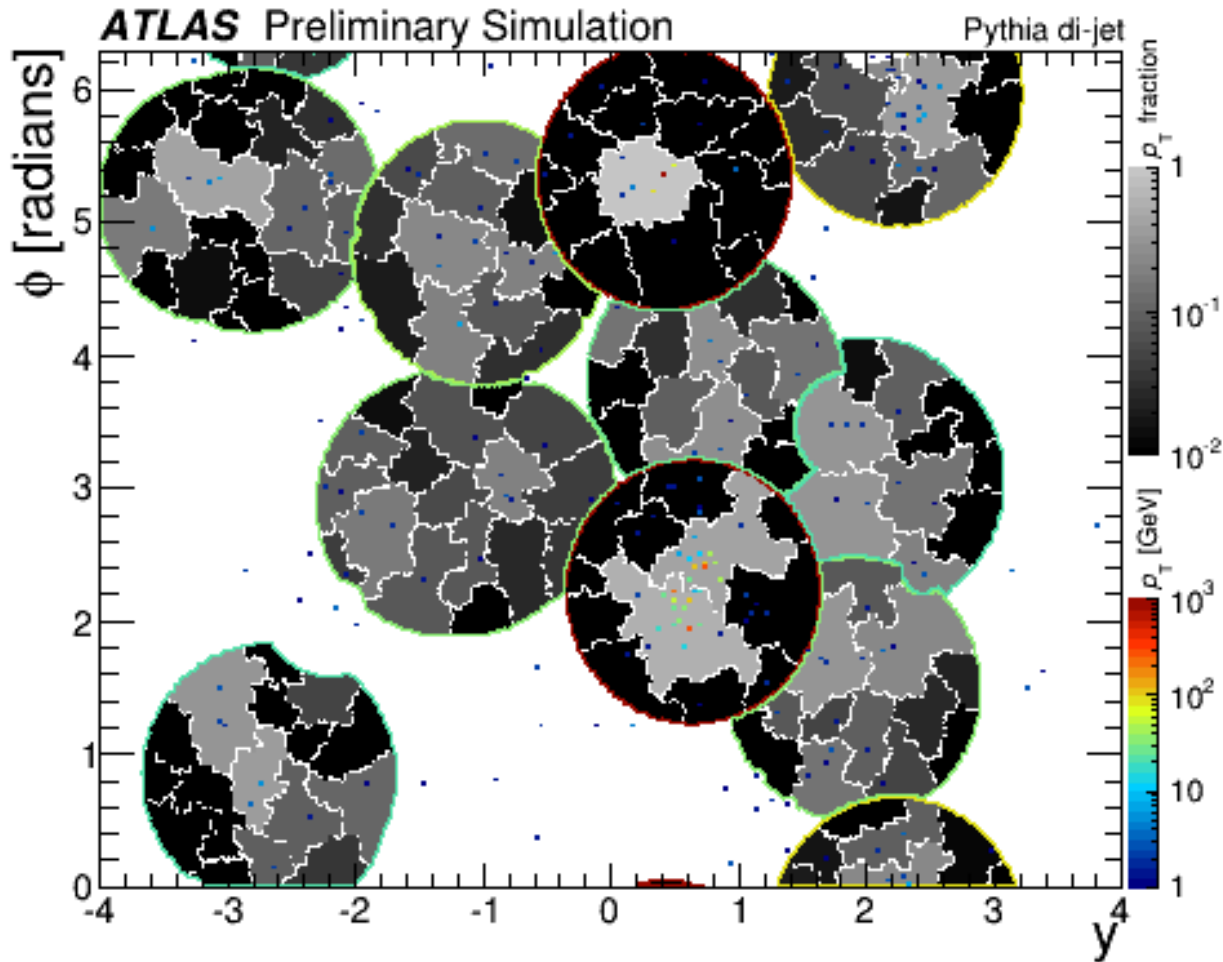
Pythia di-jet event (QCD background)

# Jet trimming (2/4)



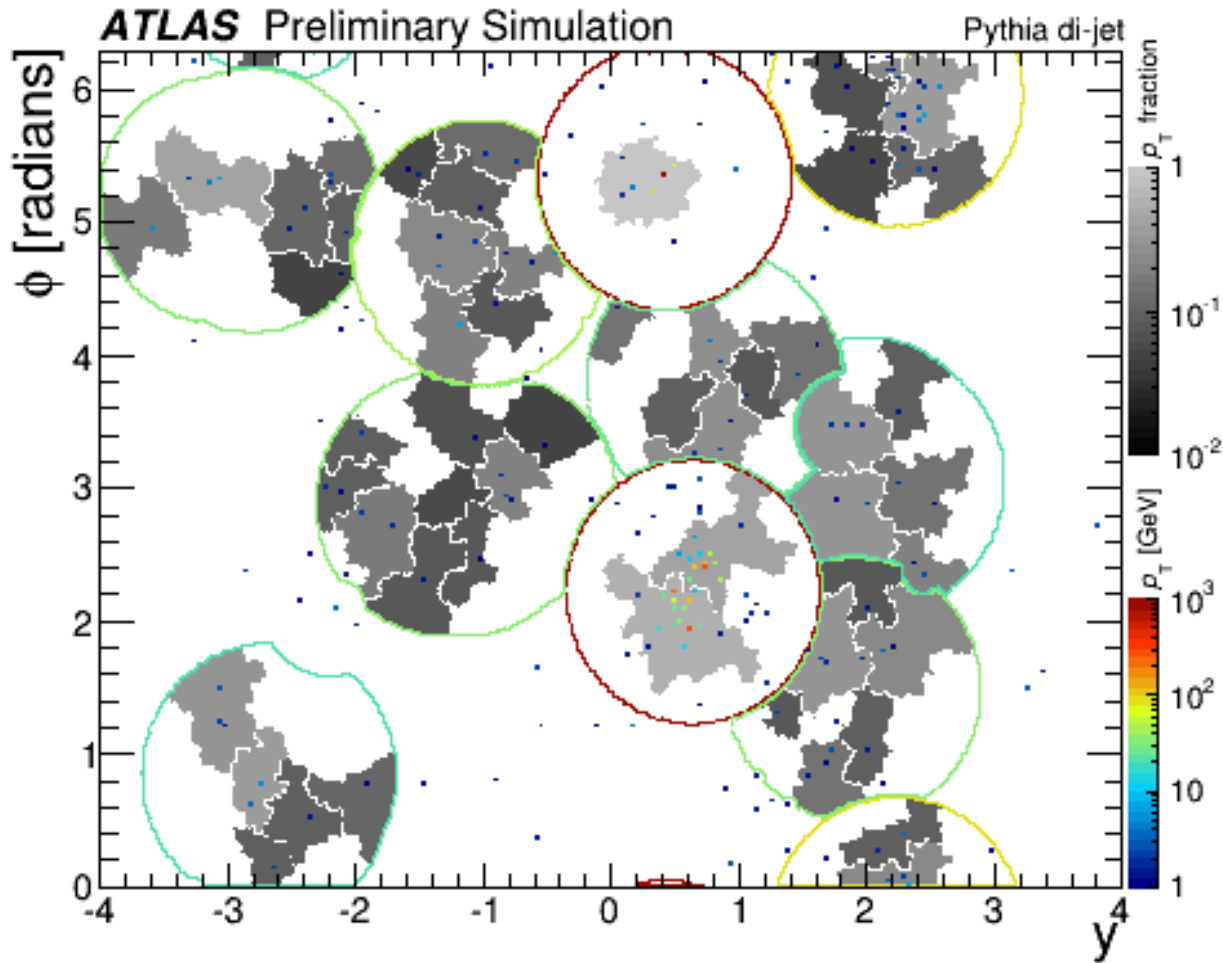
**Anti- $k_T$  ( $R=1.0$ ) jet built from topo-clusters ( $p_T > 20$  GeV)**

# Jet trimming (3/4)



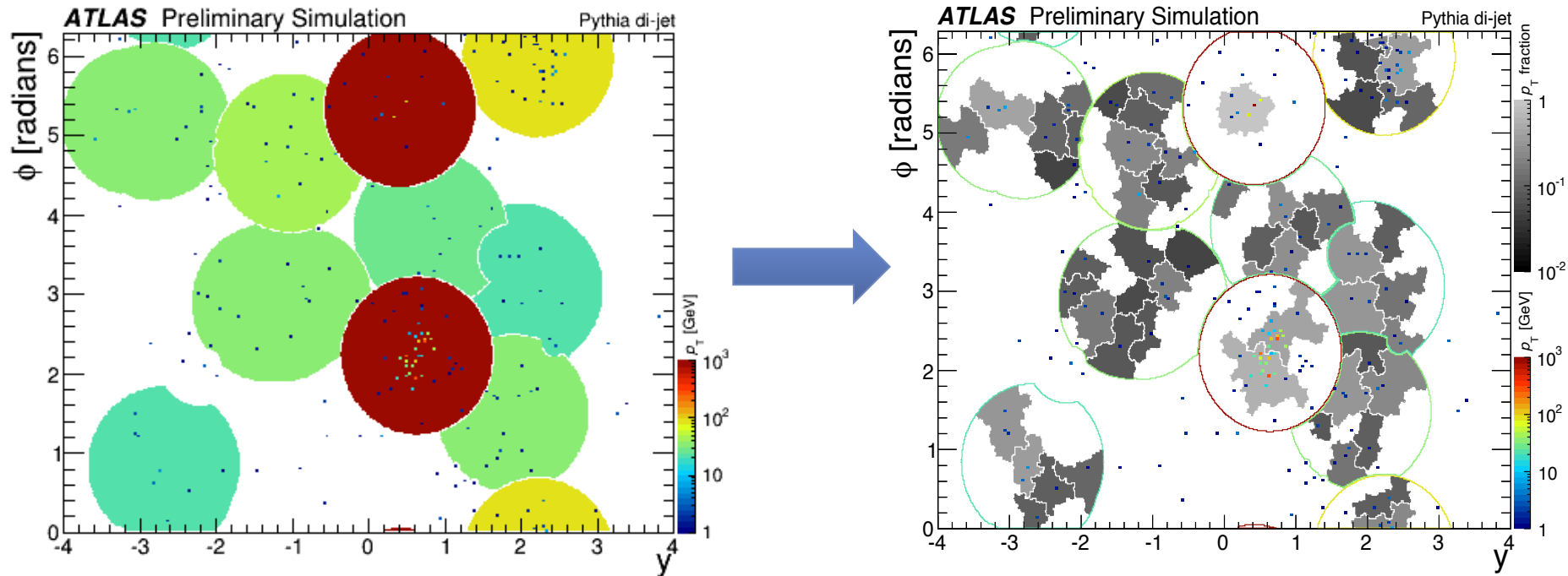
Re-cluster jet constituents with the  $k_t$   $R=0.3$  jet algorithm: **subjets**

# Jet trimming (4/4)



Remove soft subjets if  $p_T^{subject} < f_{cut} \cdot p_T^{jet}$

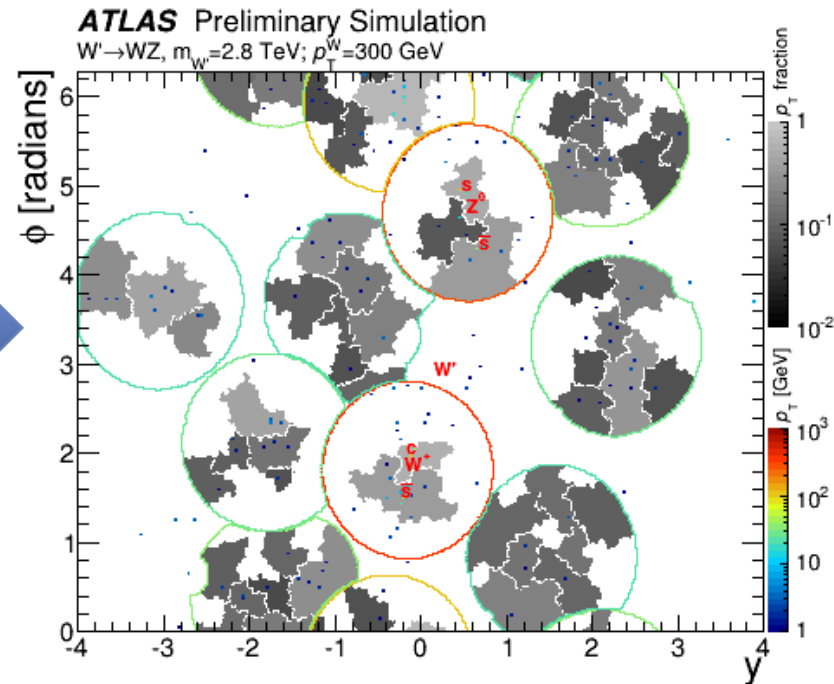
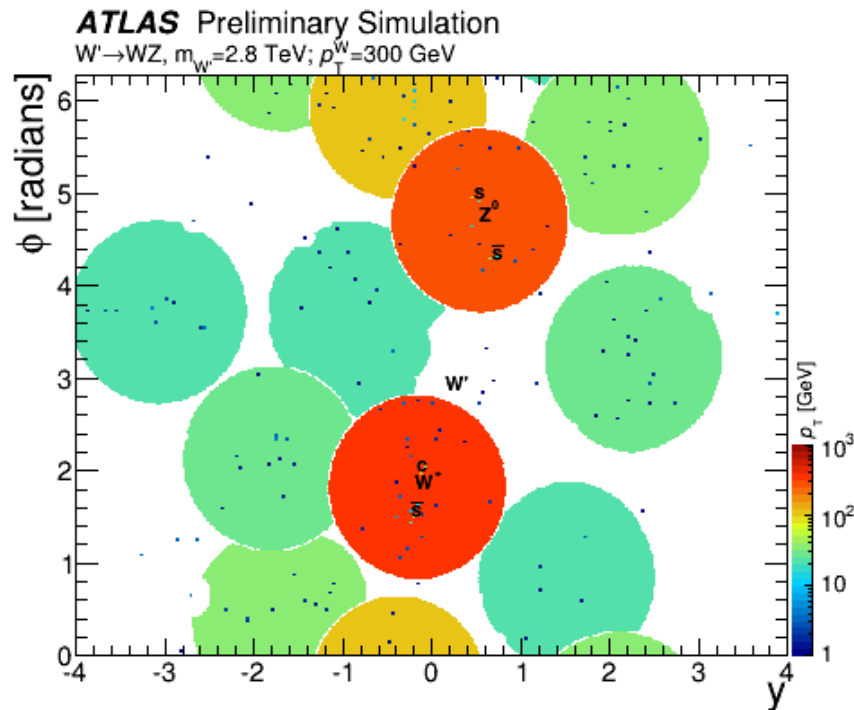
# Jet trimming (QCD)



**Grooming effectively reduces the area of jet, reducing the jet sensitivity to pileup fluctuations**



# Jet trimming (W/Z)

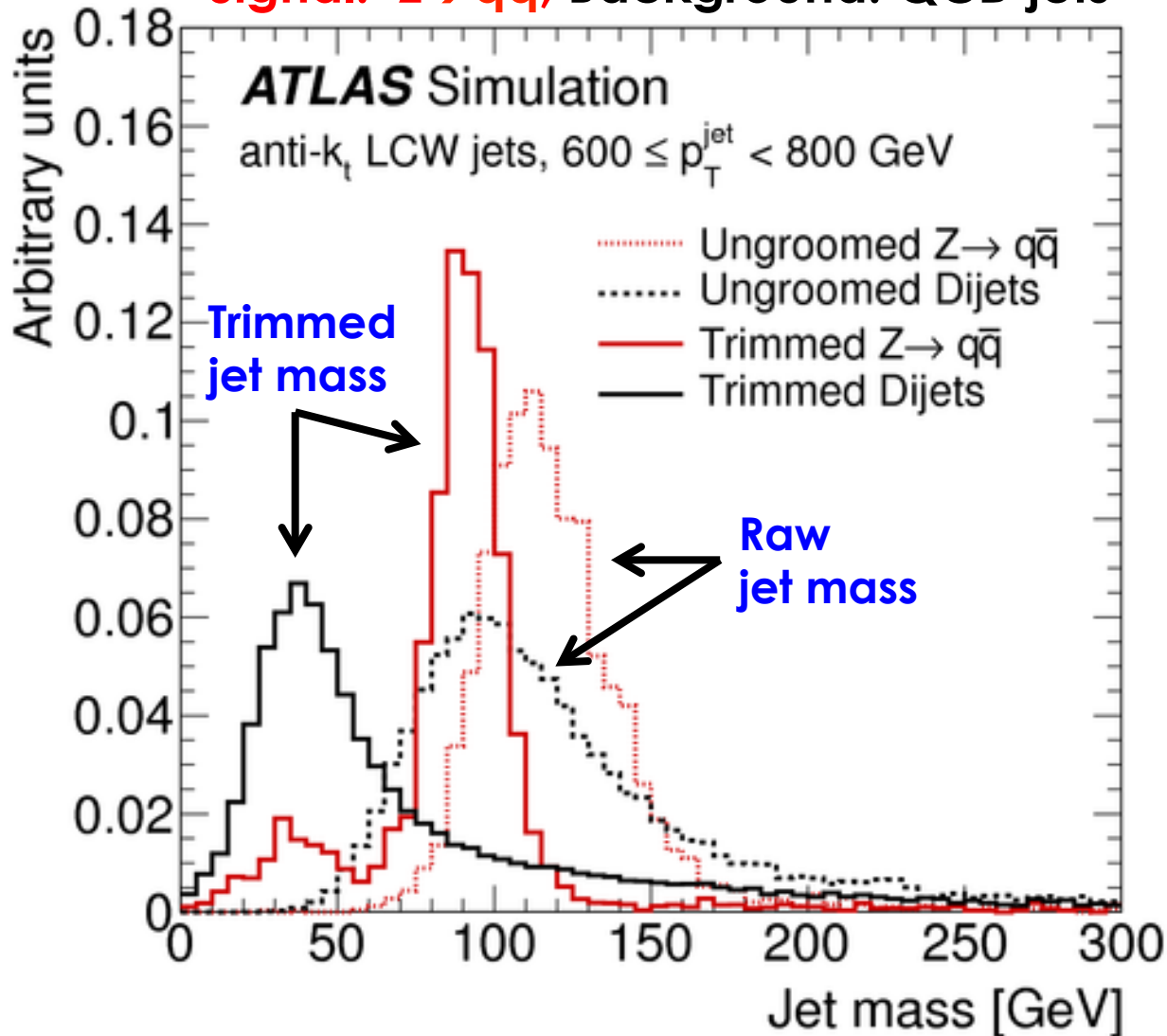


**Grooming retains the hard n-prong structure of boosted electroweak objects**

# Trimming performance

JHEP09 (2013) 076

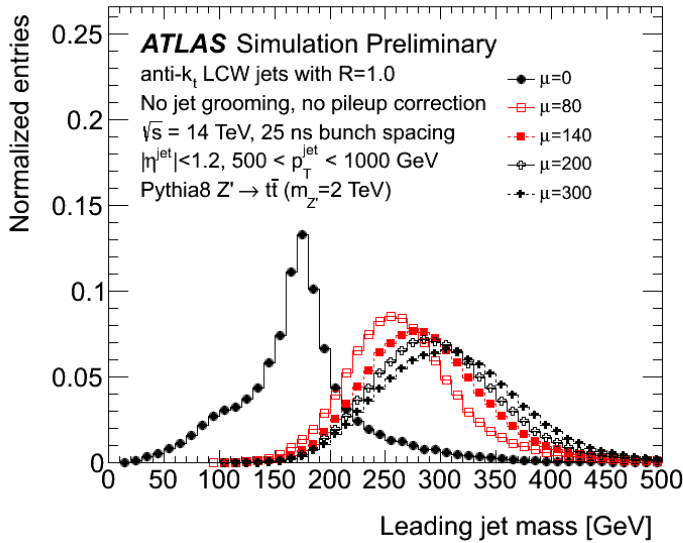
Signal:  $Z \rightarrow qq$ , Background: QCD jets



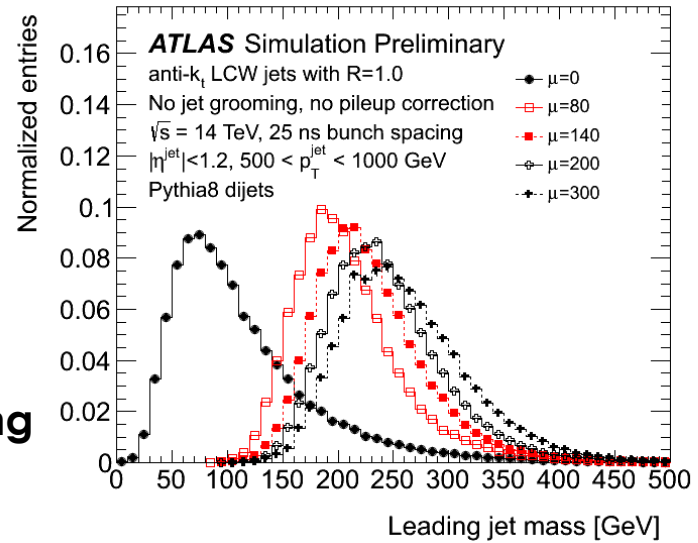
- **Improved mass resolution**  
(sharpens the mass peak)
- **Reduced QCD background**  
(improved S/B)

# Top quark mass with 300 PU

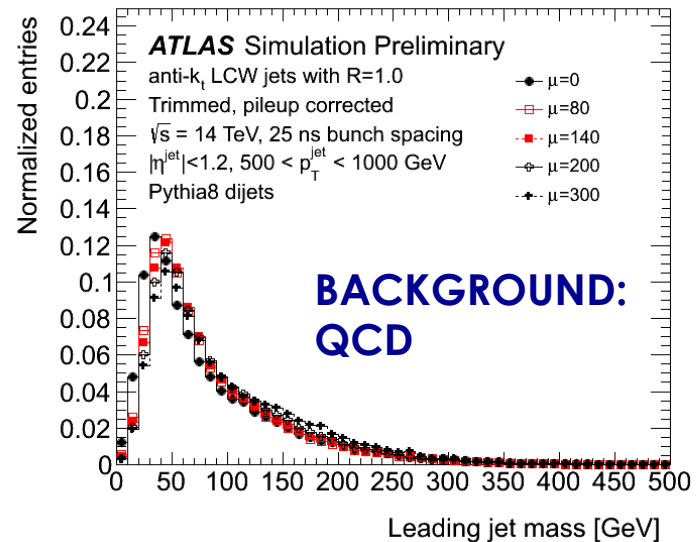
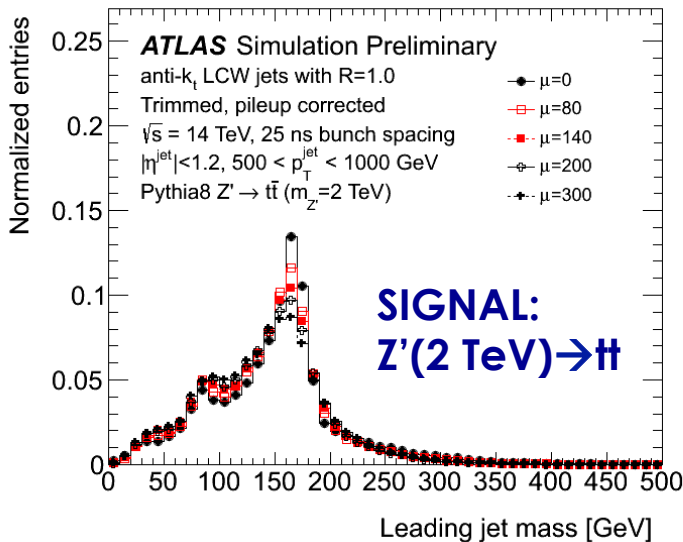
**SIGNAL:  $Z'(2\text{ TeV}) \rightarrow t\bar{t}$**



**BACKGROUND: QCD**



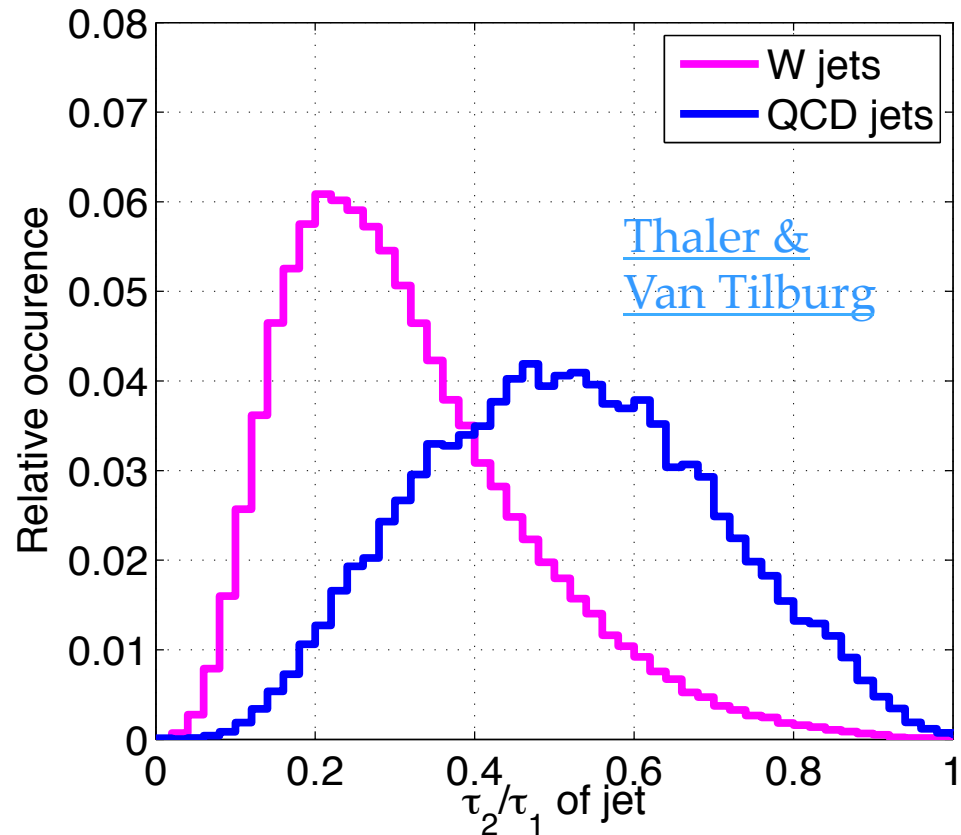
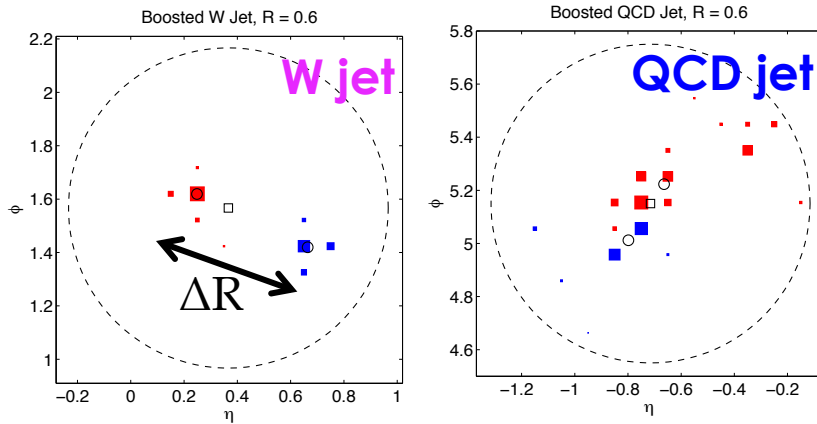
grooming



# W jet tagging

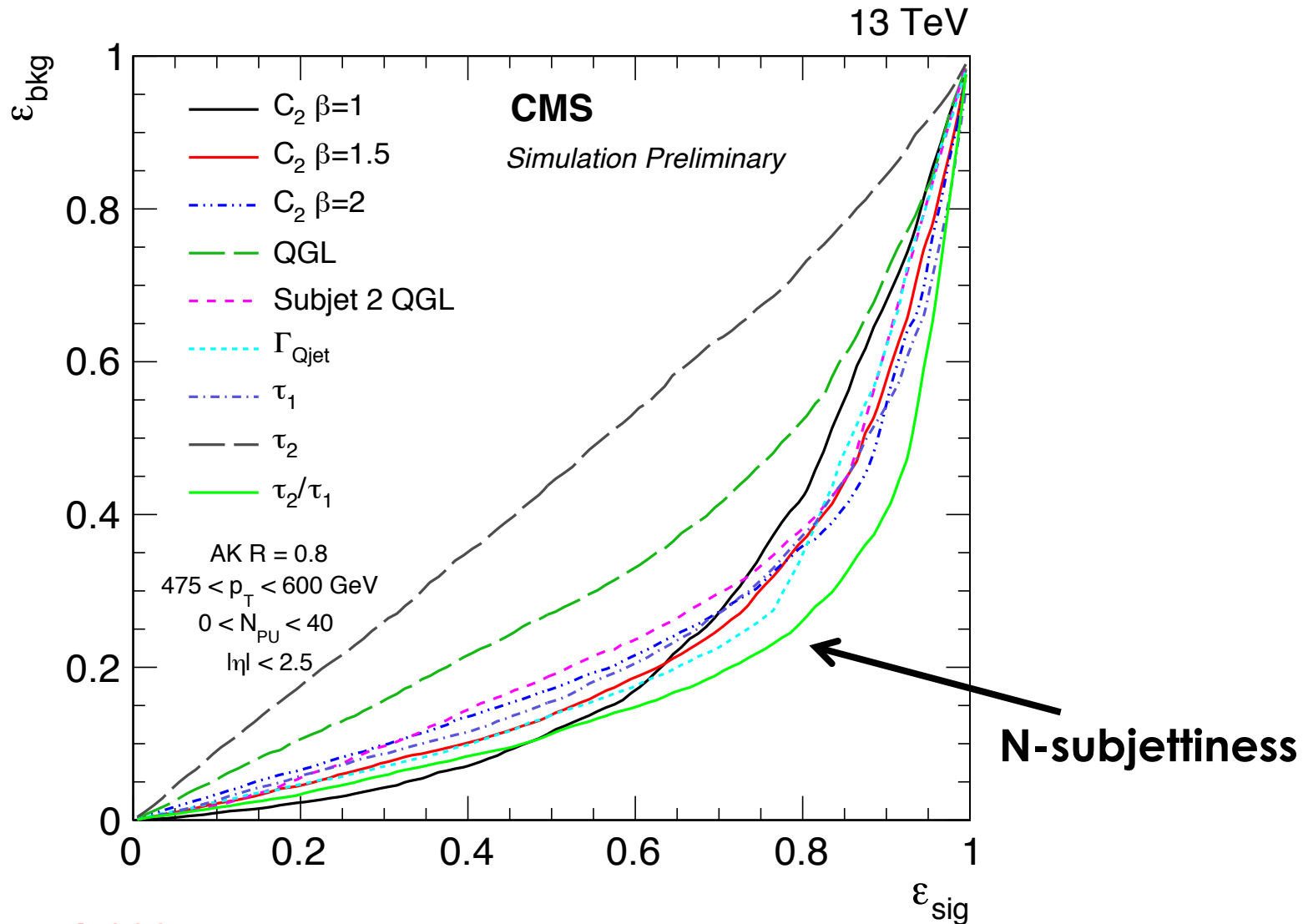
$65 \text{ GeV} < m_j < 95 \text{ GeV}$

- **n-subjettiness:**
  - Measures the n-prong structure of jets



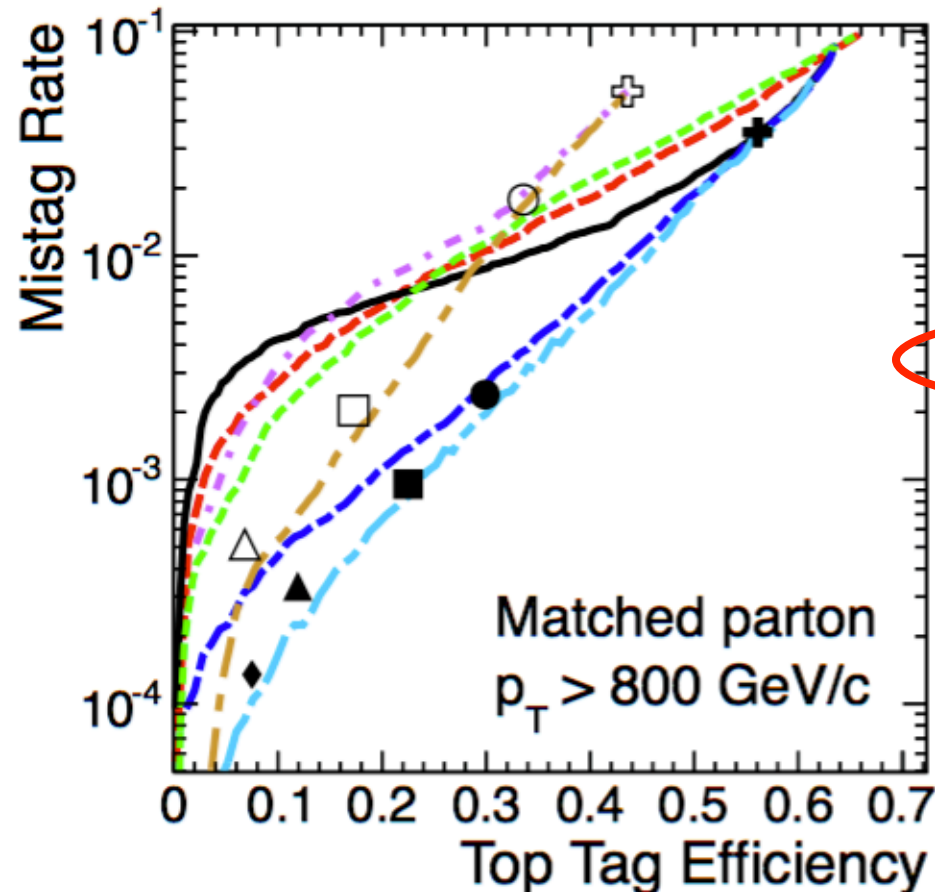
$$\tau_N = \frac{1}{d_0} \sum p_{T,k} \min\{\Delta R_{k,axis-1}, \dots, \Delta R_{k,axis-n}\}$$

# W jet tagging



# Top tagging (Run 1)

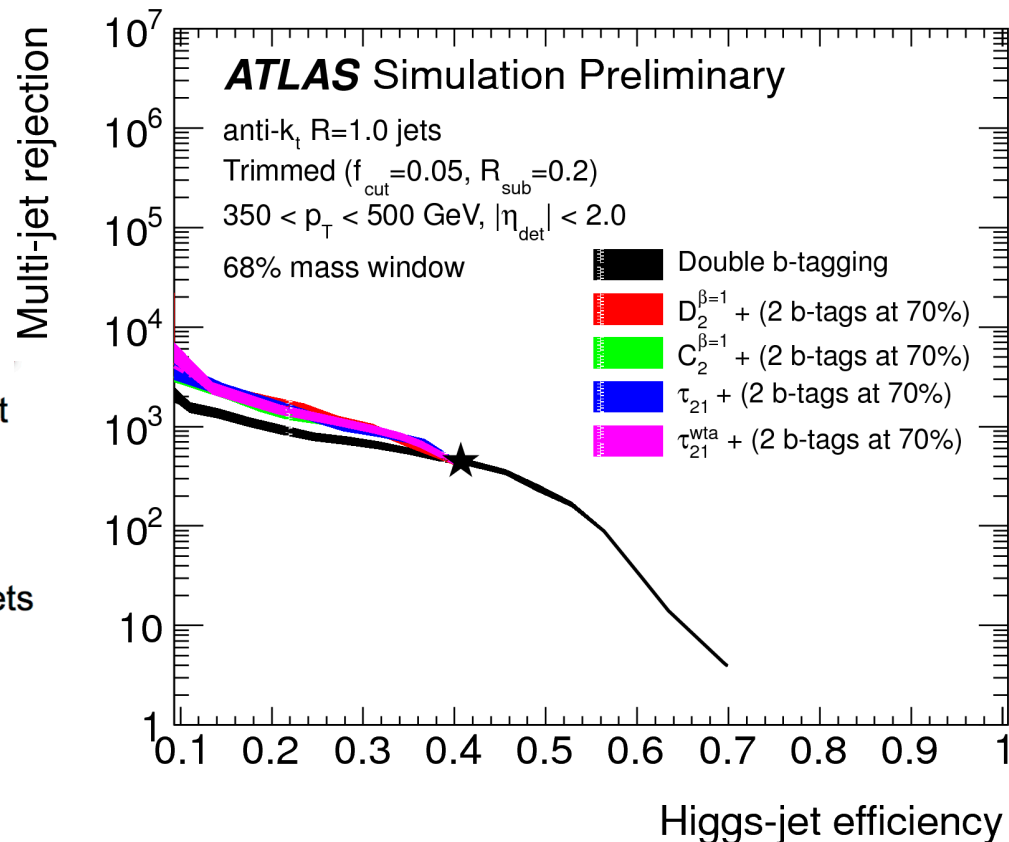
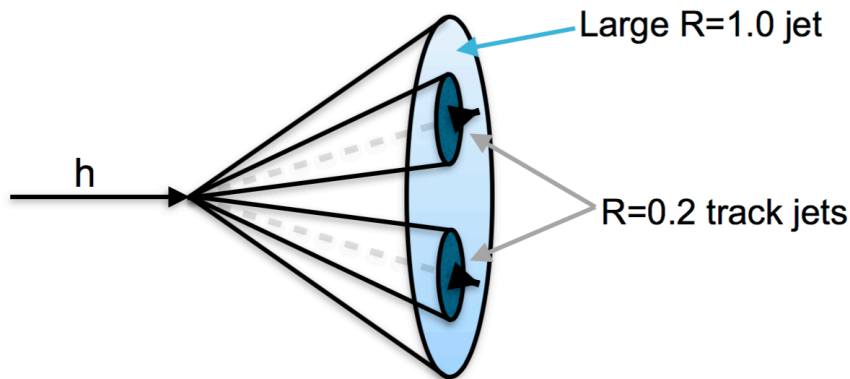
C/A R=0.8 jets



- CMS Top Tagger
  - - - subjet b-tag
  - · - N-subjettiness ratio  $\tau_3/\tau_2$
  - · - CMS + subjet b-tag
  - · - CMS +  $\tau_3/\tau_2$  + subjet b-tag
  - · - HEP Top Tagger
  - · - HEP +  $\tau_3/\tau_2$  + subjet b-tag
- |   |               |   |               |
|---|---------------|---|---------------|
| + | CMS WP0       | + | HEP WP0       |
| ● | CMS Comb. WP1 | ○ | HEP Comb. WP1 |
| ■ | CMS Comb. WP2 | □ | HEP Comb. WP2 |
| ▲ | CMS Comb. WP3 | △ | HEP Comb. WP3 |
| ◆ | CMS Comb. WP4 |   |               |

# Higgs tagging

- Use small-R ( $R=0.2$ ) track-jets to resolve b-hadrons at small angular distances
- Associate b-tagged track-jets to un-groomed large-R jets
- Double b-tagging provides most of the discrimination power

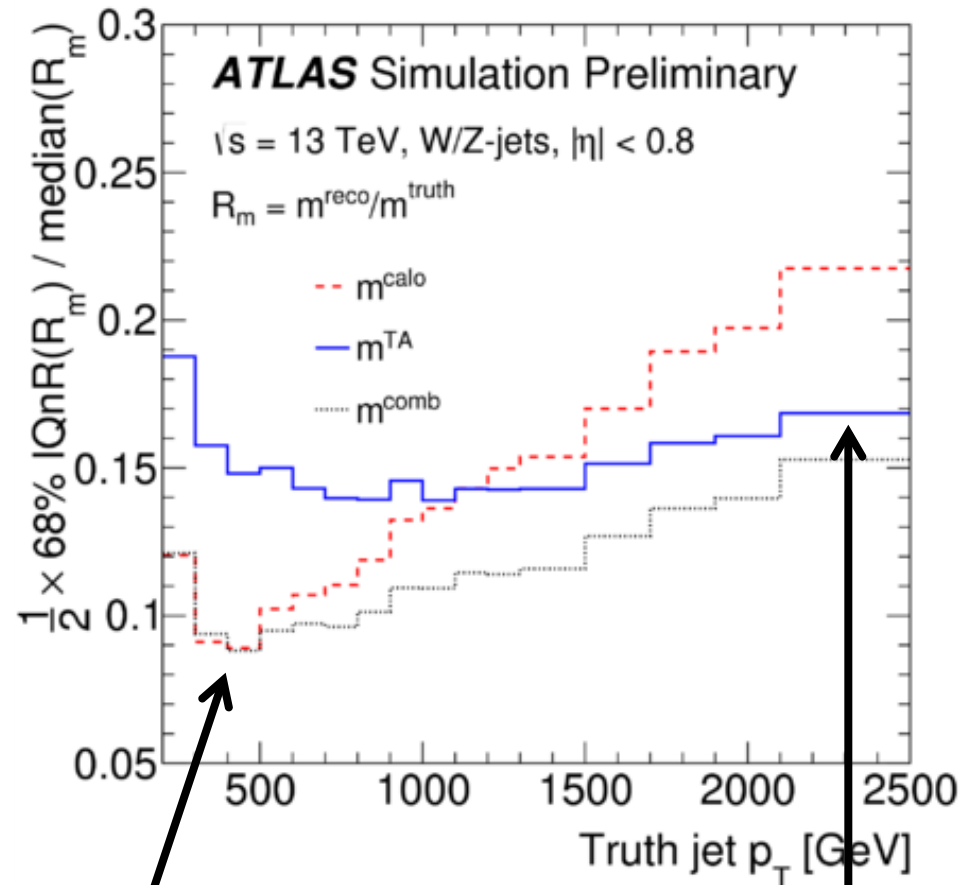


# Very high $p_T$ jets

- At very high boost, the decay products of EW objects can merge into single cells
- **Track-assisted mass:**

$$m = m^{track} \times \left[ \frac{p_T^{calo}}{p_T^{track}} \right]$$

Measure substructure with tracks  $\nearrow$   $m^{track}$   
 Measure  $p_T$  with calorimeter  $\nearrow$   $\left[ \frac{p_T^{calo}}{p_T^{track}} \right]$



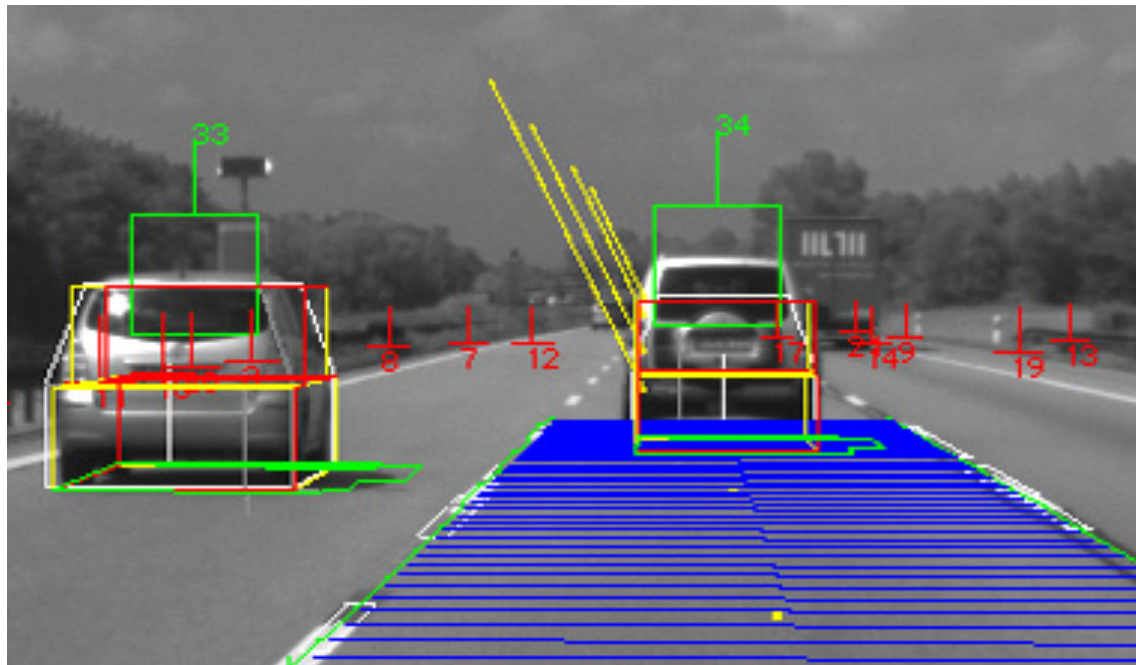
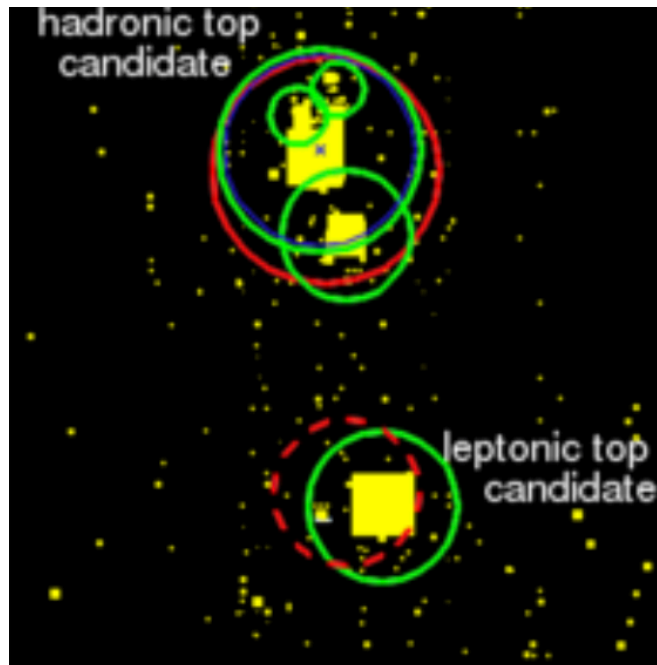
**Low  $p_T$ :  
Calorimeter better**

**High  $p_T$ :  
TA-mass better**



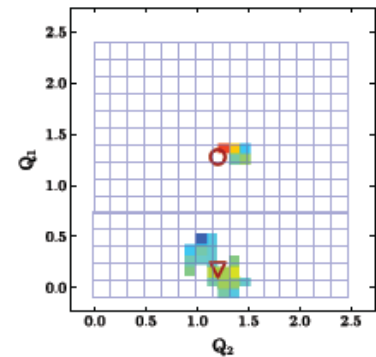
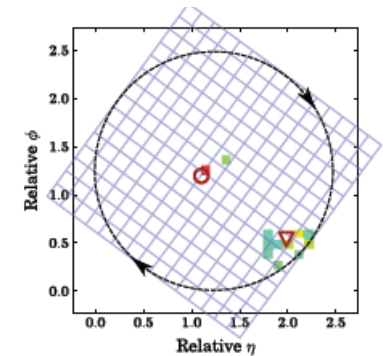
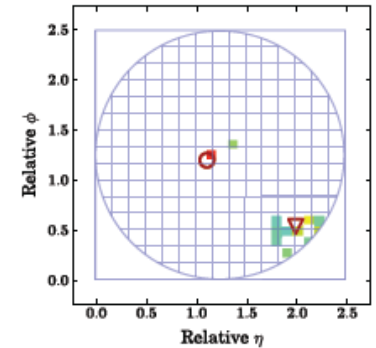
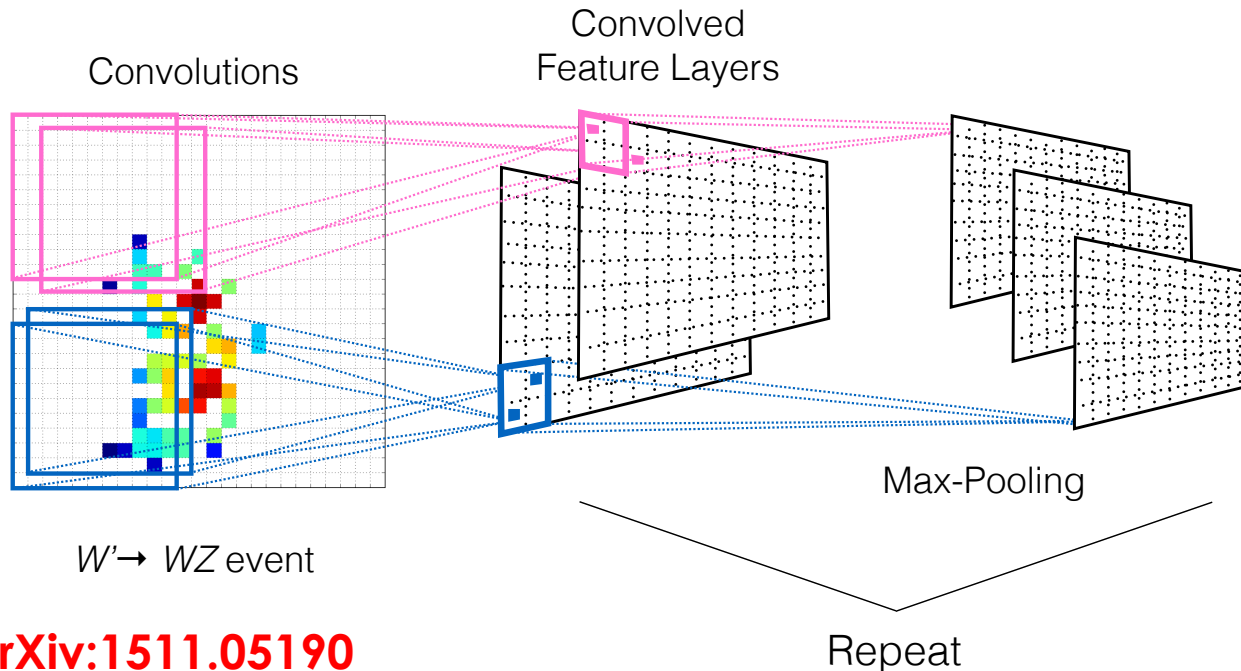
# Jets and machine learning

- **Jet tagging as a computer vision problem**
- Utilize state-of-the-art image processing/classification to analyze jets in new ways



# Deep learning W tagging

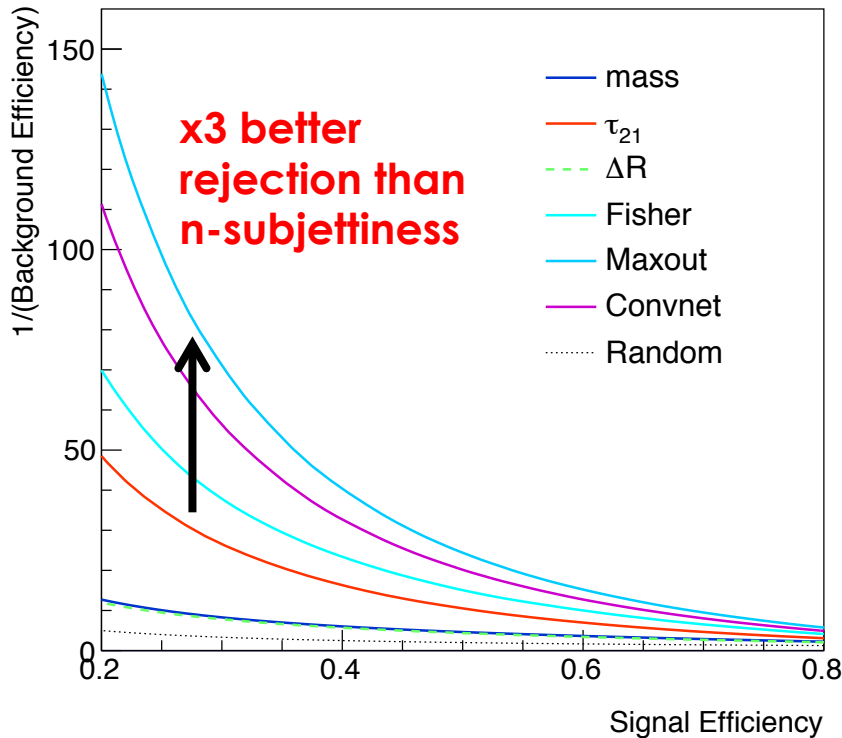
- **New data representation: the jet-image**
  - Calorimeter towers  $\rightarrow$  **pixels in a camera**
- Use all available calorimeter information
- Enable the use of cutting-edge computer vision image classification algorithms (deep neural networks)



# Deep learning W tagging

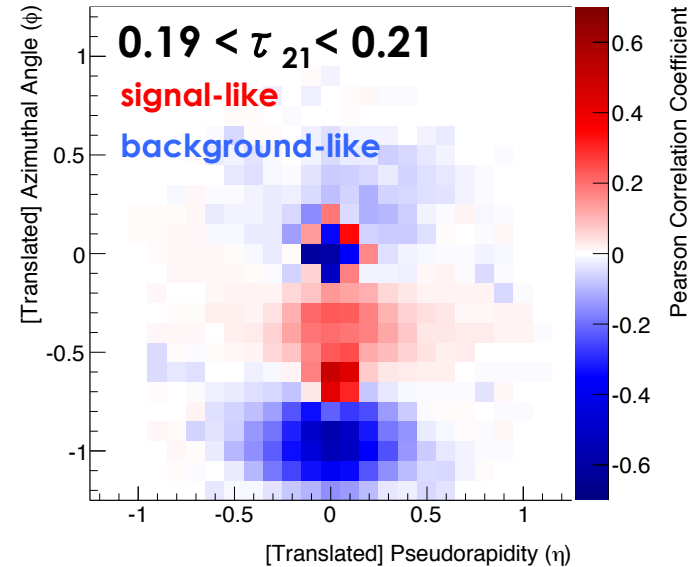
Pythia 8,  $\sqrt{s} = 13$  TeV

$250 < p_T/\text{GeV} < 300$  GeV,  $65 < \text{mass}/\text{GeV} < 95$



Pythia 8,  $W' \rightarrow WZ$ ,  $\sqrt{s} = 13$  TeV

$240 < p_T/\text{GeV} < 260$  GeV,  $0.19 < \tau_{21} < 0.21$ ,  $79 < \text{mass}/\text{GeV} < 81$

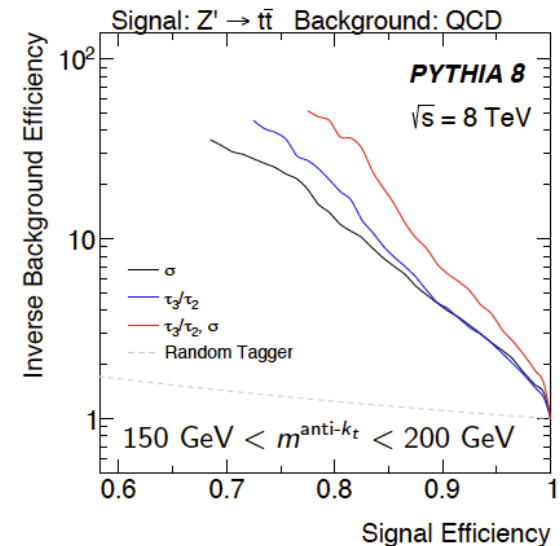
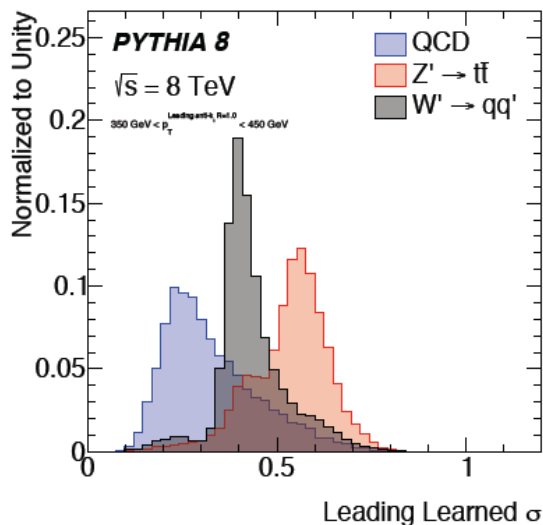
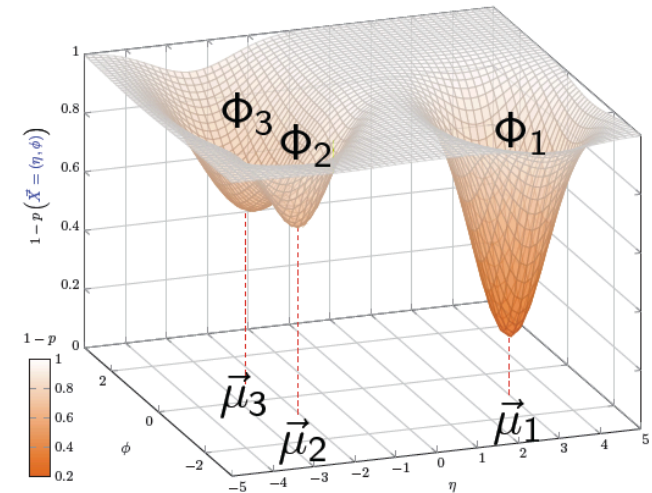


**Deep correlation jet-image:** Pearson Correlation coefficient of pixels intensity with the network output:  
[how discriminating information is contained within the network](#)

- Large performance gains beyond jet substructure observables
- **Visualization of the discriminant adds a new capability** to understand the physics within jets

# Fuzzy jets

- View jet clustering as an unsupervised learning task
- For state-of-the-art clustering, every clustered object belongs to exactly one jet
- **Fuzzy jets: incorporate probabilistic membership, in order to learn new features of the jet structure**
- **Modified Gaussian Mixture Model (IRC safe)**
- Algorithm learns the jet shape
- **Improved top tagging performance**

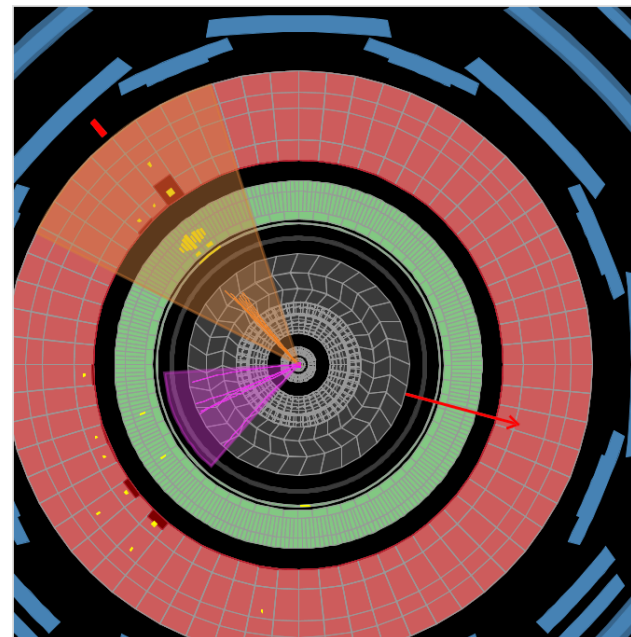


# Missing ET

- One of the most important observables in searches for new physics (SUSY, dark matter) and precision measurements (H, W, top)
- **Transverse momentum imbalance of the event**
  - Relies on the reconstruction (and calibration) of all high  $p_T$  objects in the event, as well as the “un-clustered energy”
  - Pile-up is a major challenge

$$E_{x(y)}^{miss} = E_{x(y)}^{HARD} + E_{x(y)}^{SOFT}$$

**Jets, e,  $\mu$ ,  $\tau$**       **“unclustered”  $E_T$**

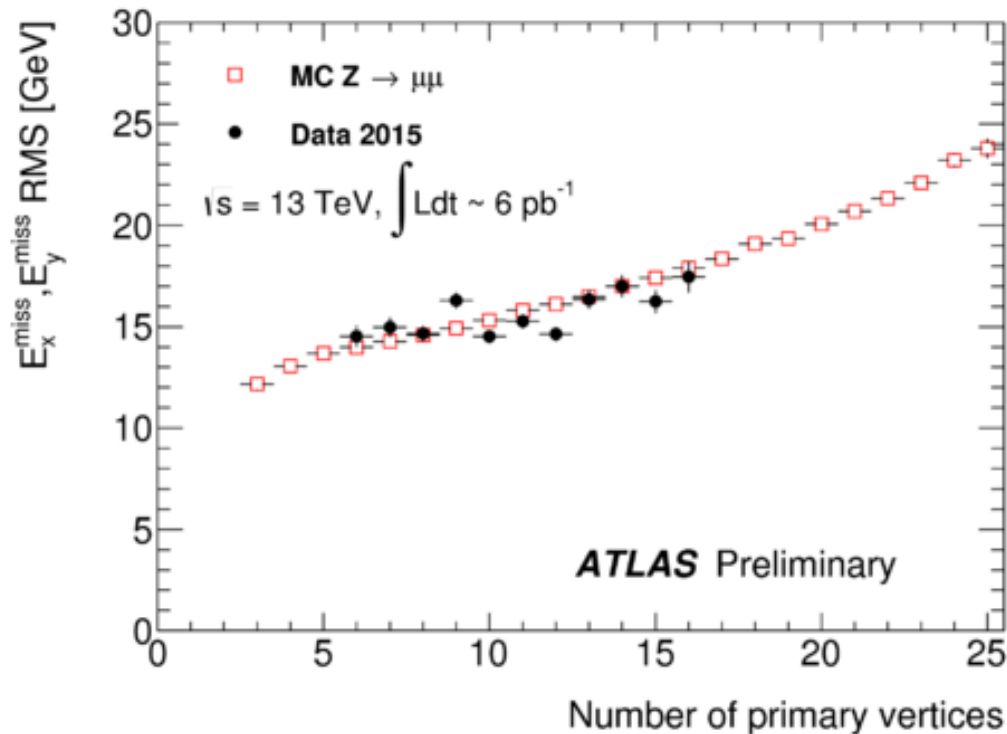


**Track Soft Term (ATLAS)**  
PV-tracks outside hard objects

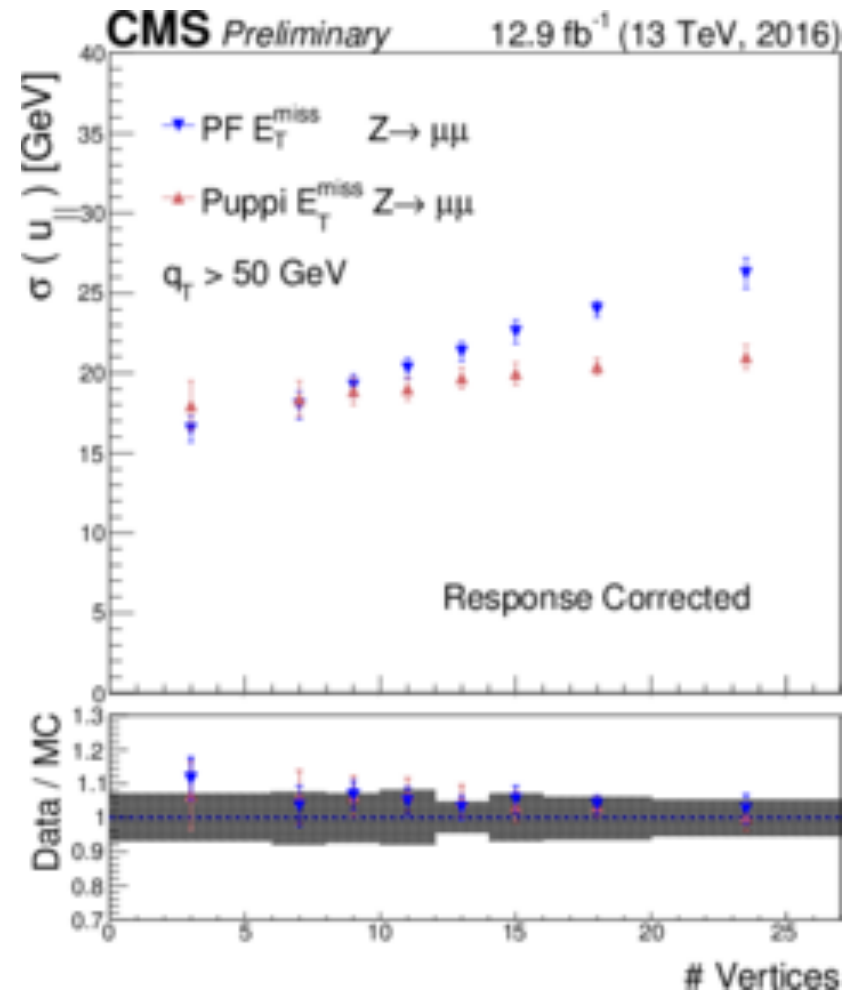
**PUPPI (CMS)**  
Scale the 4-momentum of pflow objects based on a local pile-up probability

# Missing ET Performance

- Measured in  $Z+jet$  events



ATLAS-PHYS-PUB-2015-027



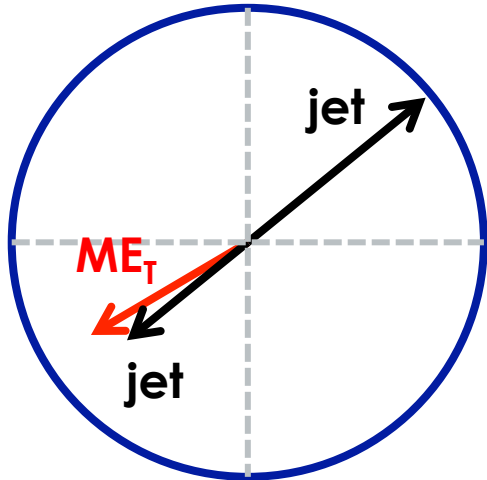
CMS-PAS-JME-16-004

# Missing ET Significance

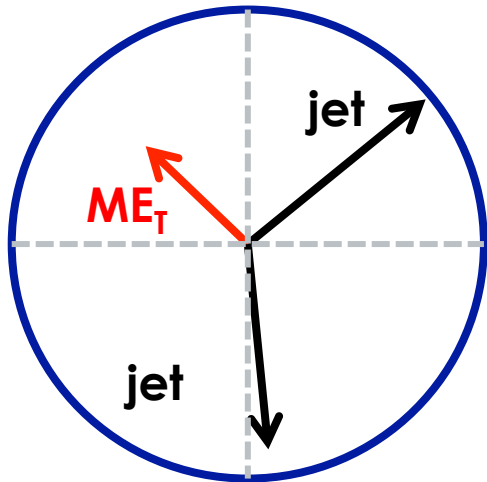
CMS-PAS-JME-16-004

- Estimate the probability distribution for  $ME_T$  due to resolution fluctuations *event-by-event*

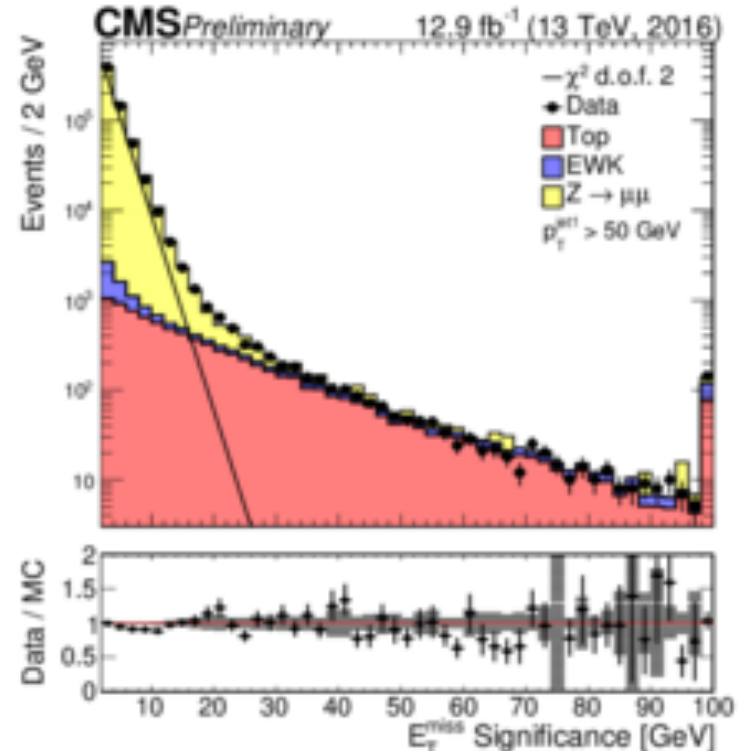
$$S = 2 \ln \left( \frac{L(\varepsilon = ME_T)}{L(\varepsilon = 0)} \right)$$



Low  $ME_T$  significance



High  $ME_T$  significance



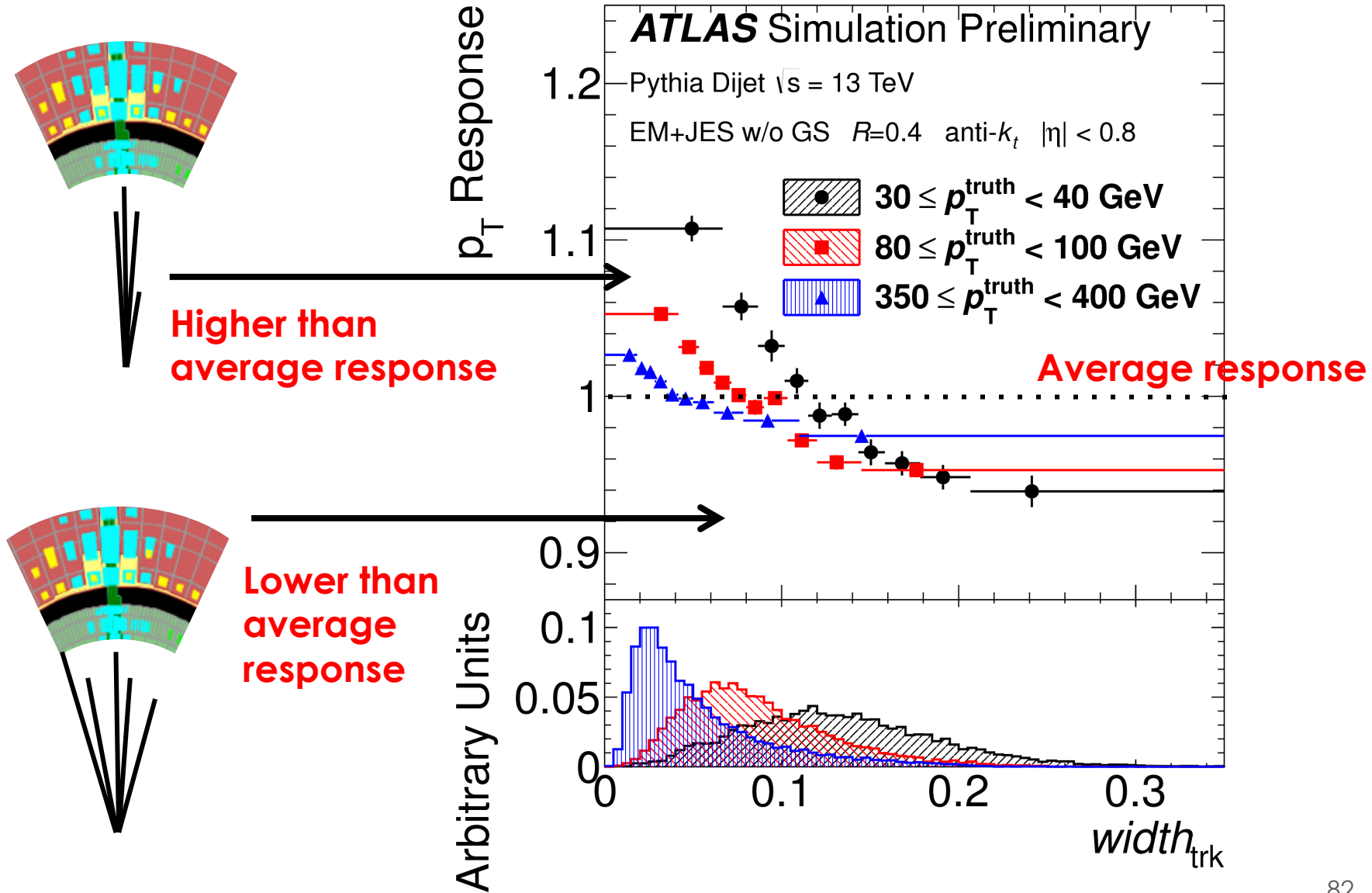
# Summary

- **Jets and missing ET are key signatures for the analysis of LHC data**
  - Quark, gluons, heavy electroweak particles
  - Quantum properties
- **ATLAS and CMS developed sophisticated techniques for the reconstruction and calibration of jets combining calorimeter and tracking information**
  - Different approaches motivated by the different detector strengths and capabilities
- **Many different jet algorithms and jet substructure techniques have enabled a rich toolkit for the analysis and interpretation of events at the energy frontier**

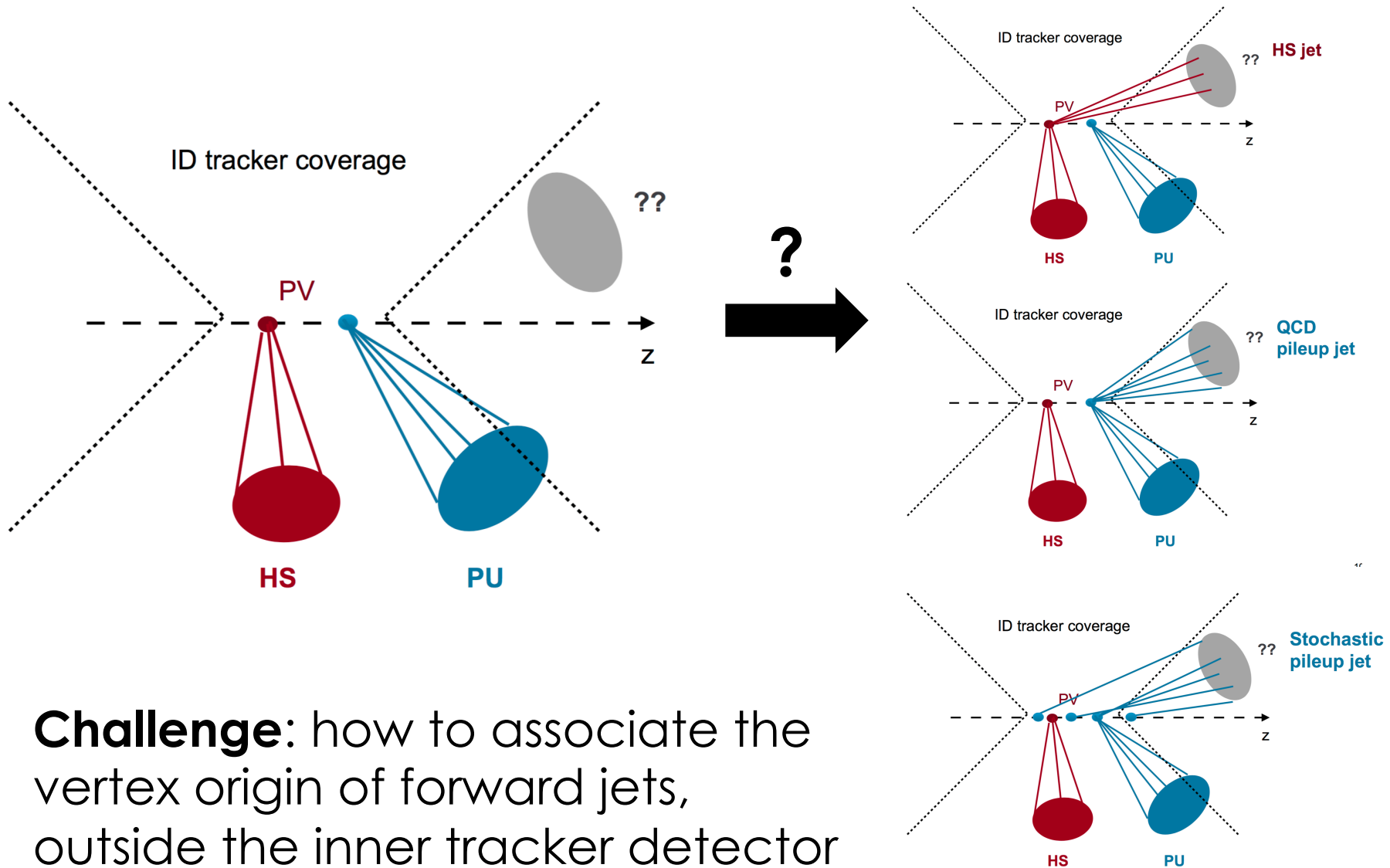


# Backup

# Reducing fluctuations (III)



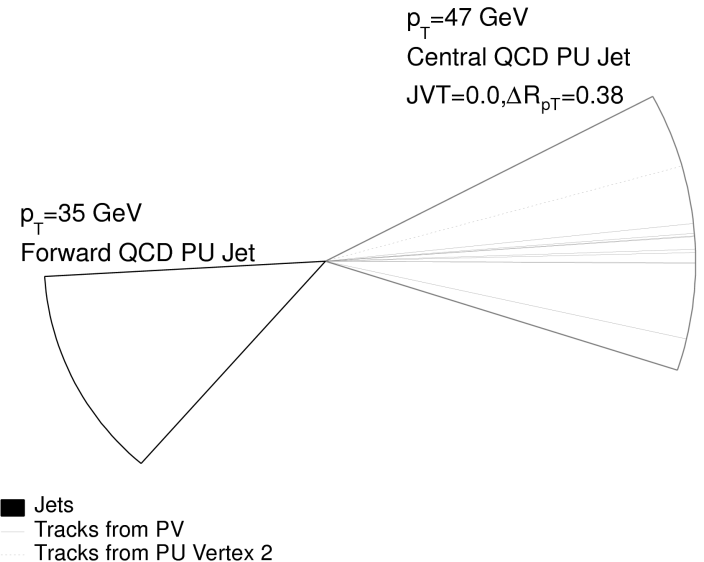
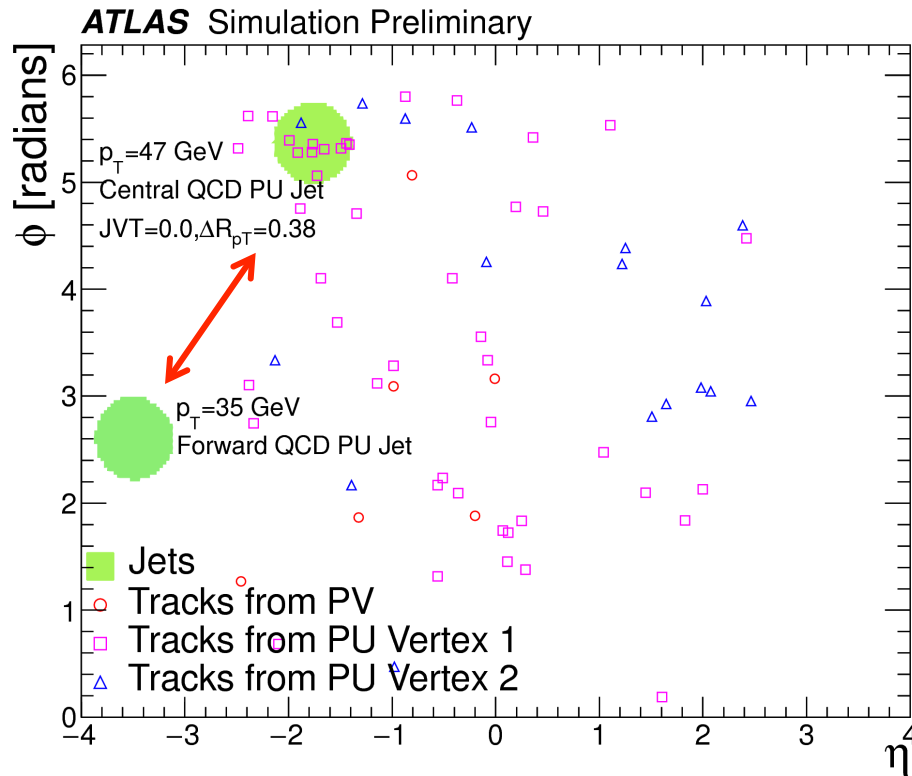
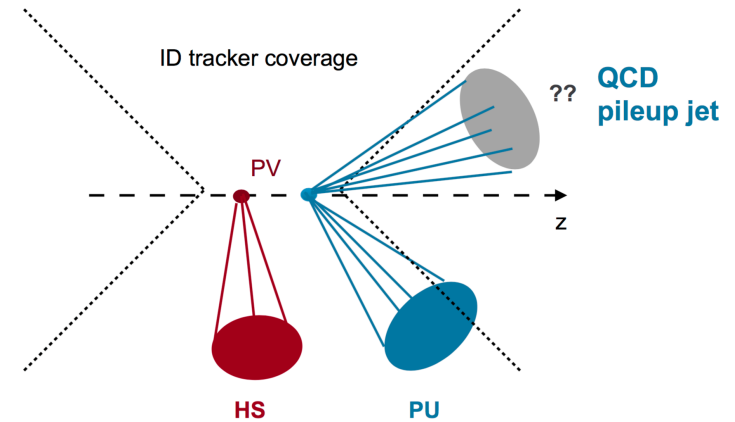
# Forward pile-up jets



- **Challenge:** how to associate the vertex origin of forward jets, outside the inner tracker detector

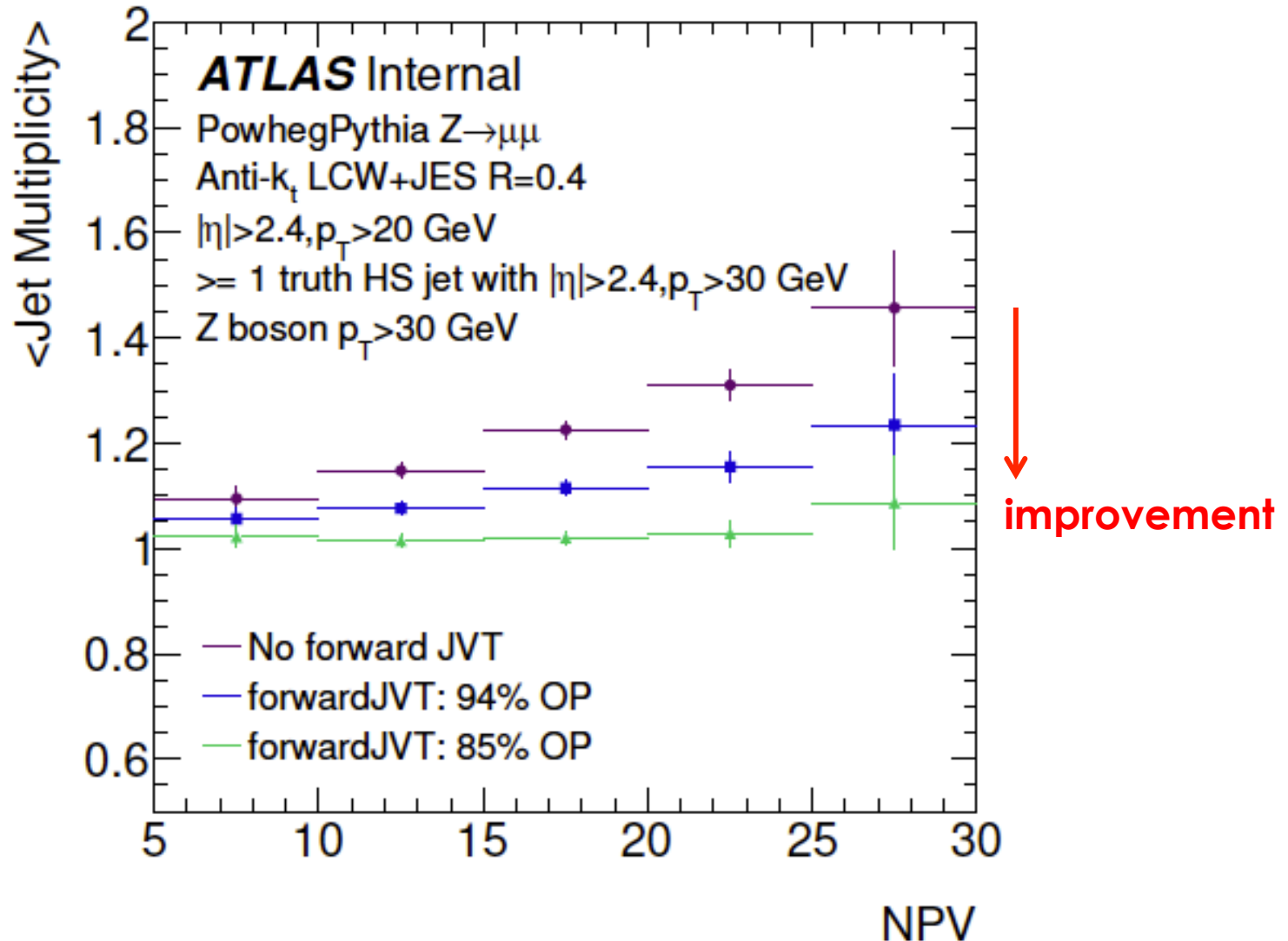
# Forward pile-up jet tagging

- Use tracks in the central region to indirectly tag forward pileup jets: Exploit angular correlations of QCD jets produced in pile-up interactions



**Back-to-back QCD pile-up in the central region**

# Forward pile-up jet tagging



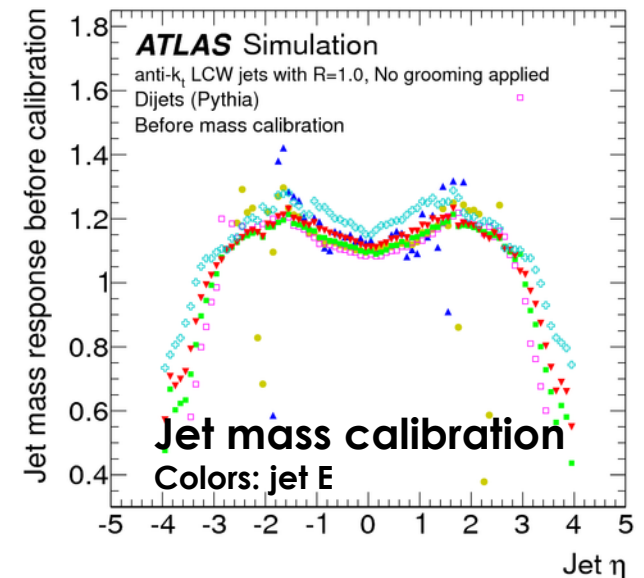
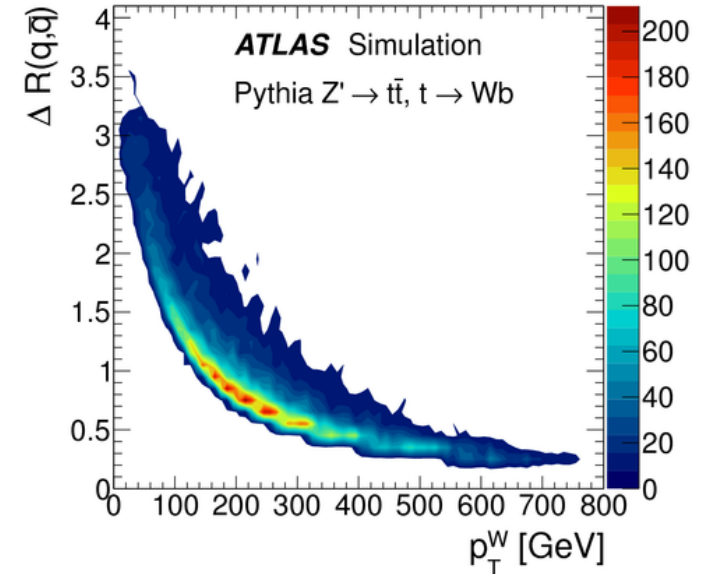
# Expanding the use of jets

## Many motivations to use jets with different R parameters

- Angular size of jets produced by a massive particle scales as  $2m/p_T$
- Pileup contamination scales as  $R^2$

## Major experimental limitation:

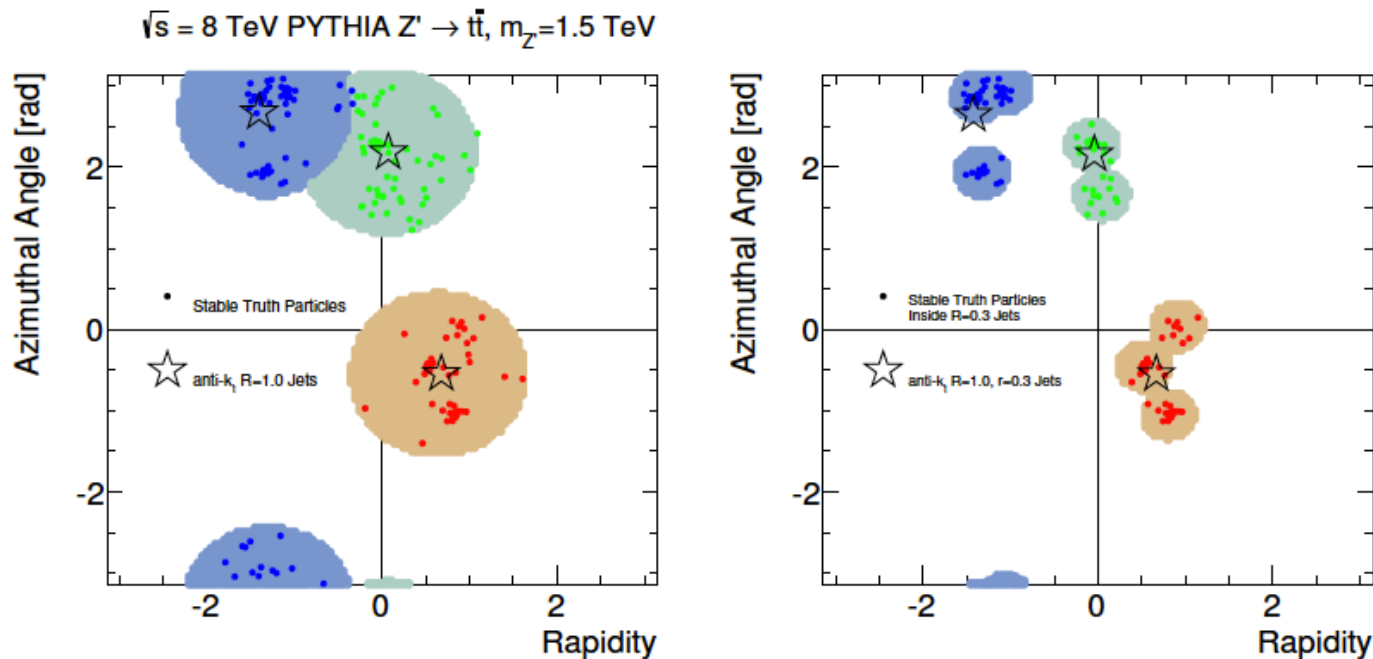
- jet calibrations and uncertainties need to be derived for every jet collection



# Jet re-clustering

JHEP 02 (2015) 075

- **Build jets from jets**
- Introduce a new angular scale  $r < R$  at which jets are calibrated
- Cluster radius  $r$  jets into radius  $R$  jets
  - Large- $R$  jet calibrations (and uncertainties!) propagate from  $r$  to  $R$

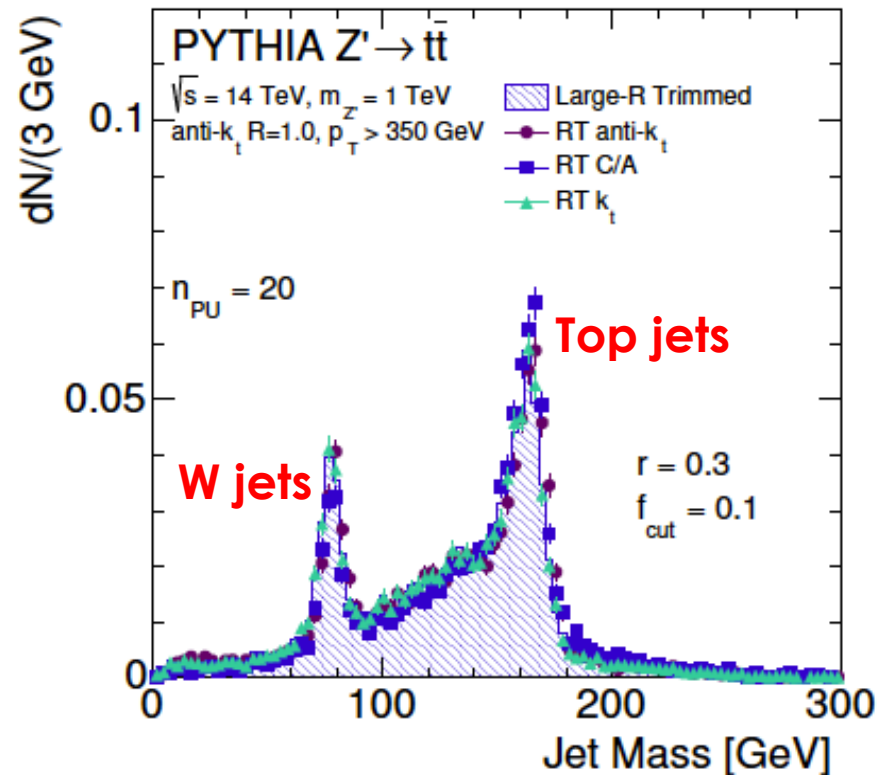
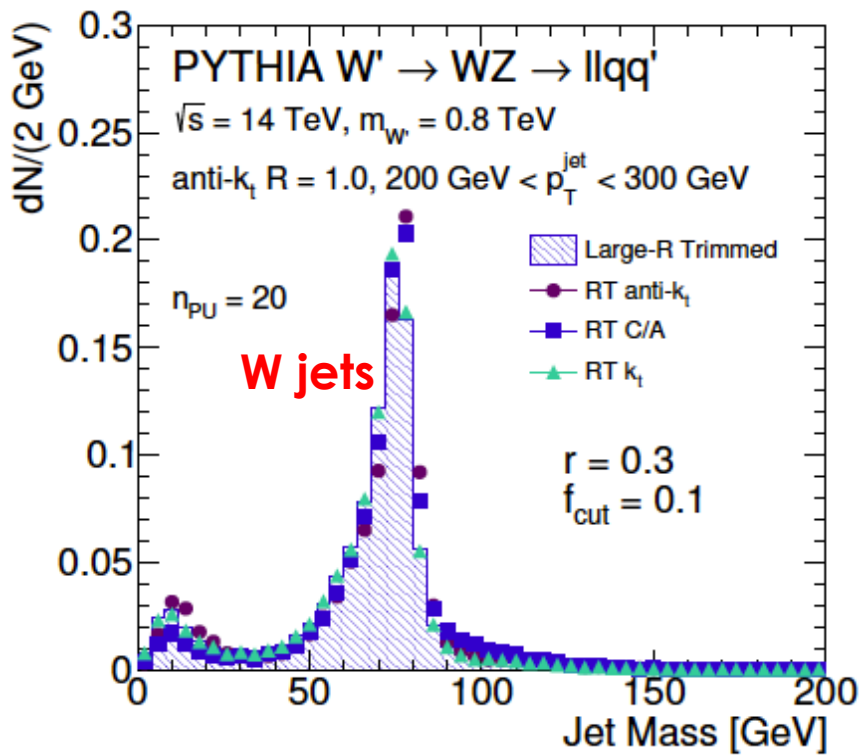


- **Allows for unprecedented flexibility to optimize the  $R$  jet parameter in the context of specific physics analyses**
  - Improve the discovery potential to new physics

# Reclustered grooming

- Discard small radius  $r$  jets  $i$  re-clustered into large- $R$  jet  $J$  if:

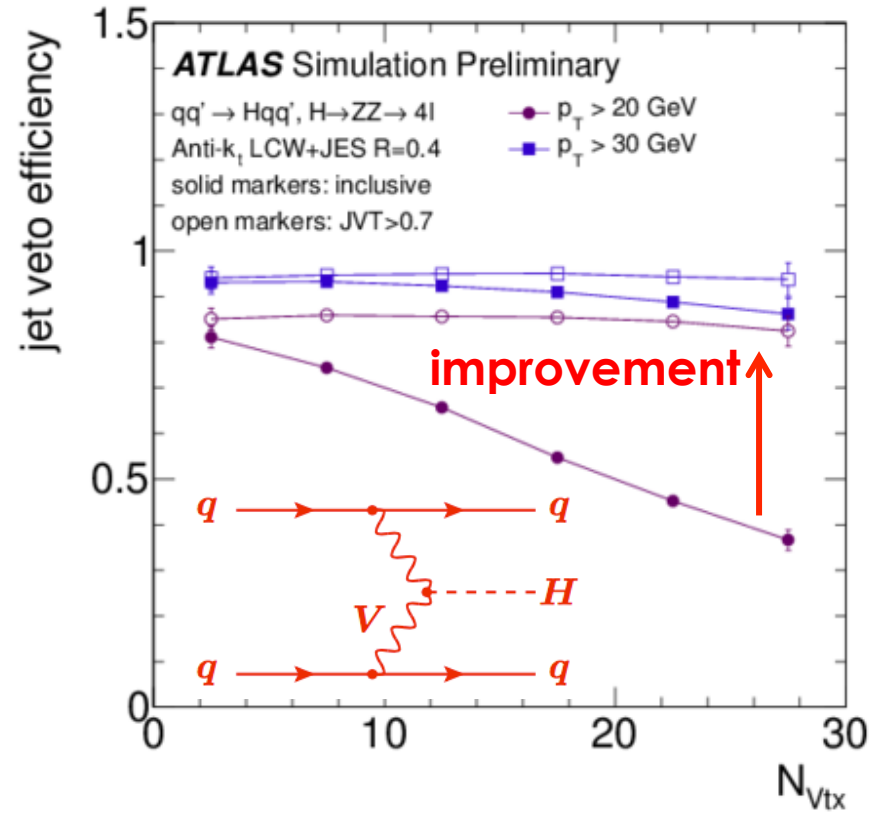
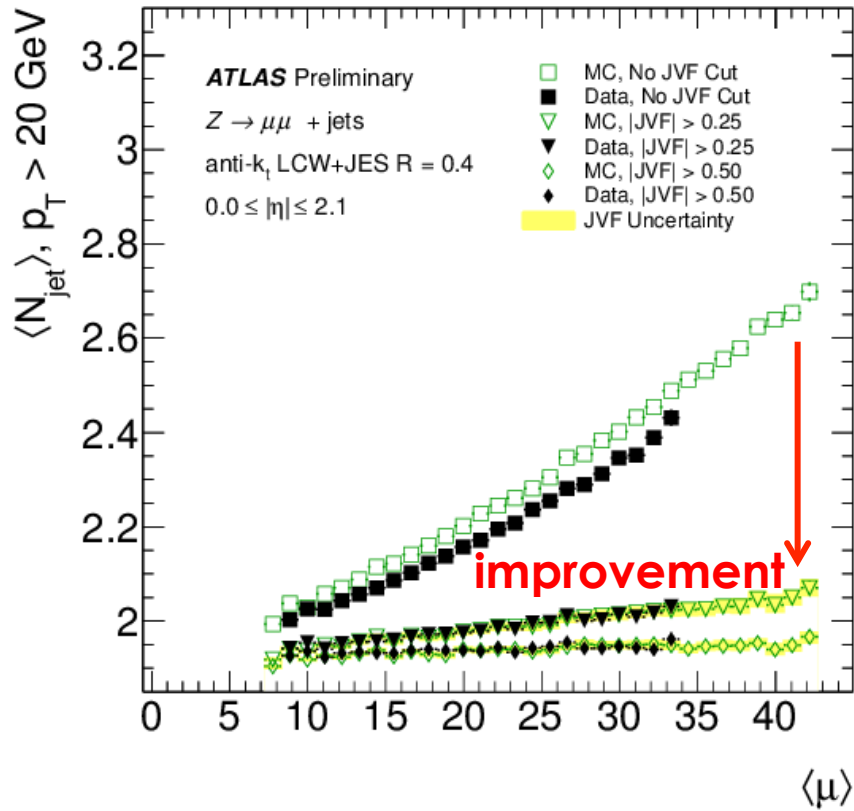
$$p_{T,i} < f_{cut} \cdot p_T^J$$



- Enables a natural transition between large- $R$  and small- $R$  jets



# JVF pileup jet suppression



- JVF restores the  $N_{\text{jet}}$  distribution as a function of pileup
- Improves the data/MC agreement
- JVF makes the jet veto efficiency stable with pileup without the need to raise the jet  $p_T$  threshold

# Jet calibration overview

- **Two main goals:**

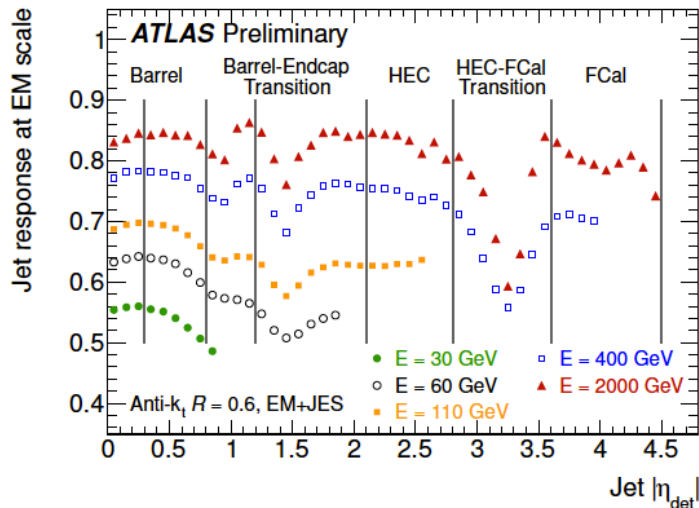
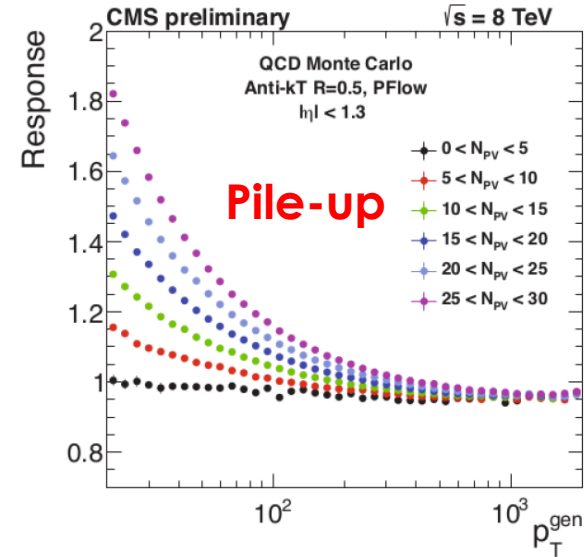
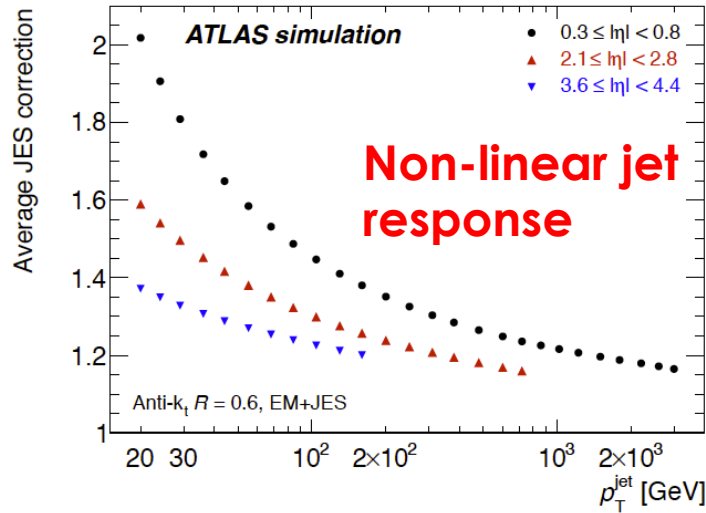
- 1. Reduce fluctuations (improve resolution)**

- Event-by-event pileup subtraction
- Jet-by-jet corrections

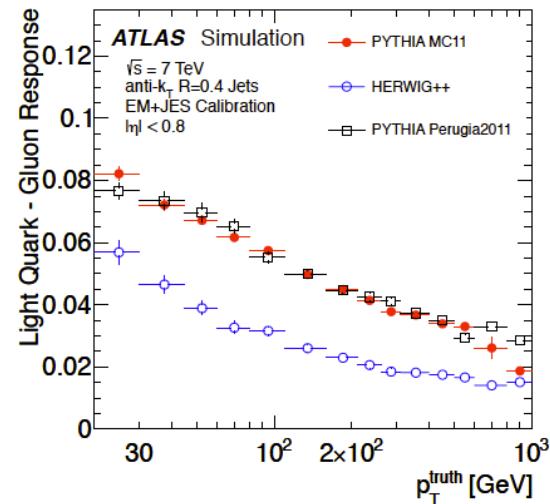
- 2. Reduce data/MC differences (improve uncertainty)**

- Jet energy calibration determined from data (in-situ)
- Jet-by-jet techniques to reduce effects not well modeled
  - Pile-up jets: Jet Vertex Fraction
  - Flavor dependence of the response: Global Sequential Calibration

# Experimental challenges



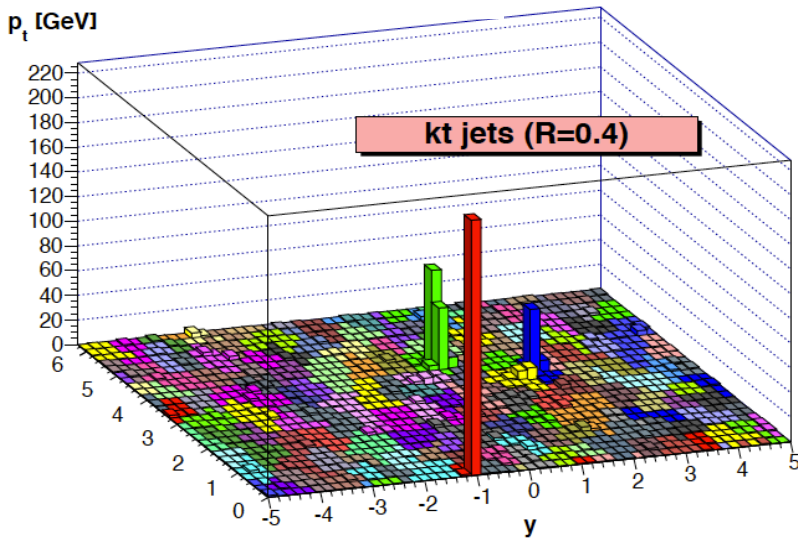
**Eta-dependent response**



**Flavor dependence**

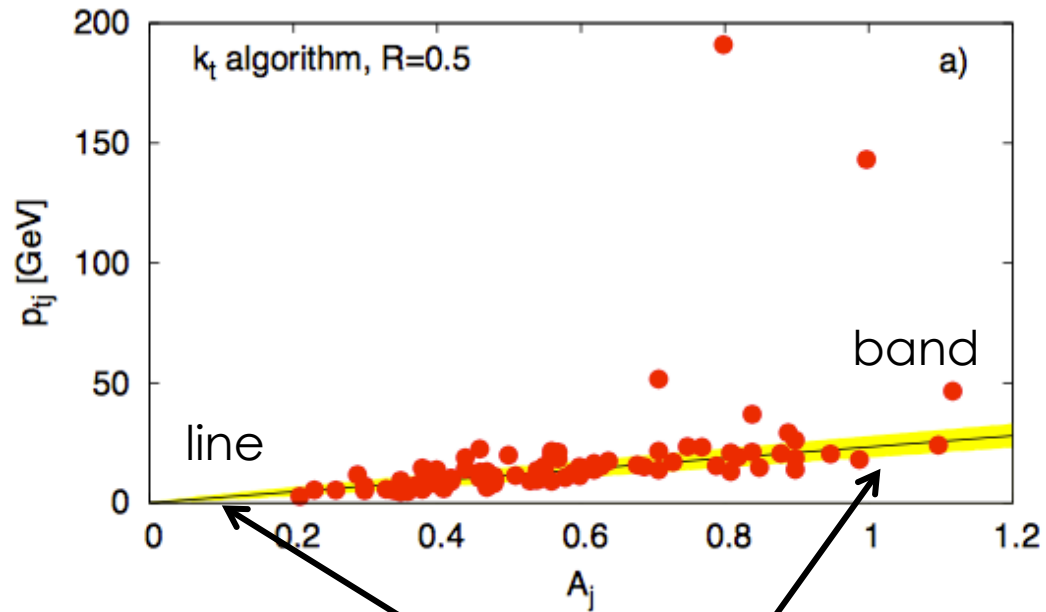
# Pileup subtraction

arXiv:0707.1378 [hep-ph]



Determine the median  $p_T$  density ( $\rho$ ) per unit of area of each event, and the jet area ( $A$ )

$$p_T^{jet,corr} = p_T^{jet} - \rho \times A_T^{jet}$$

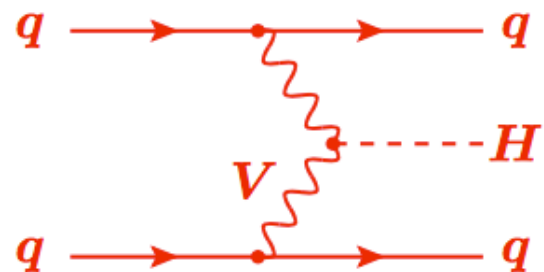
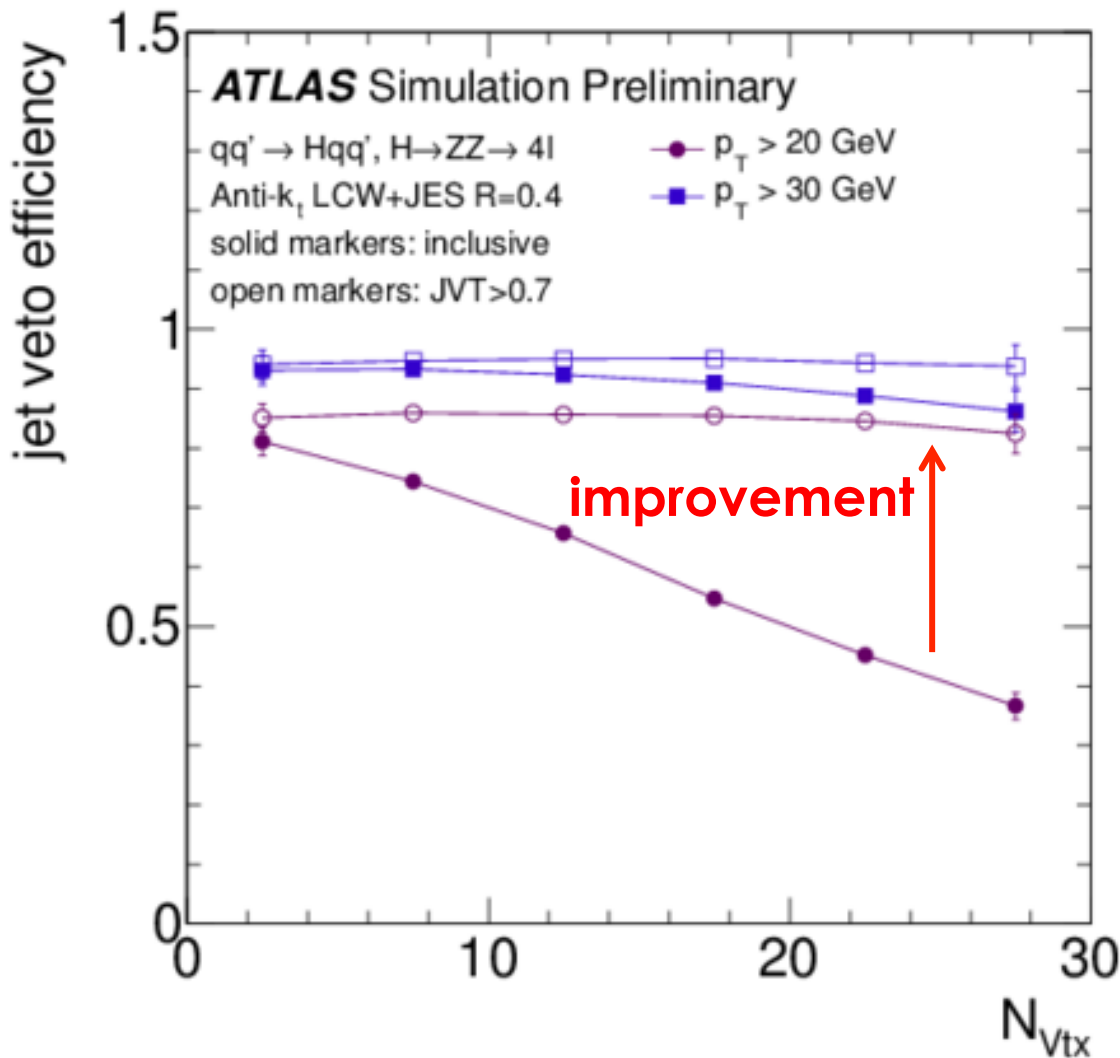


$$\Delta p_T = \rho A \pm \sigma_\rho \sqrt{A}$$

Geometrical  
contamination

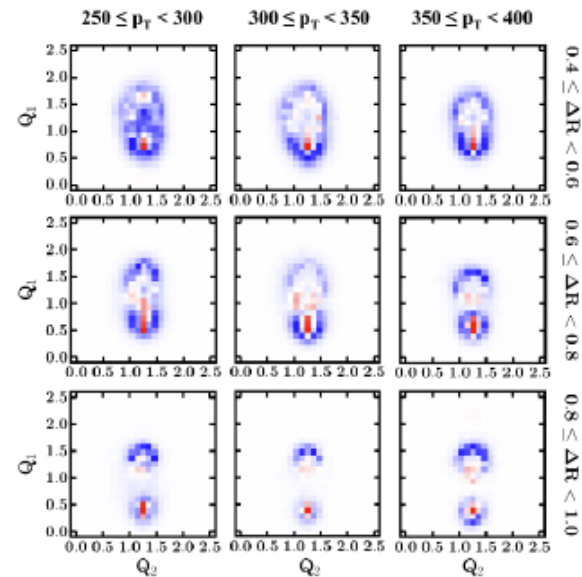
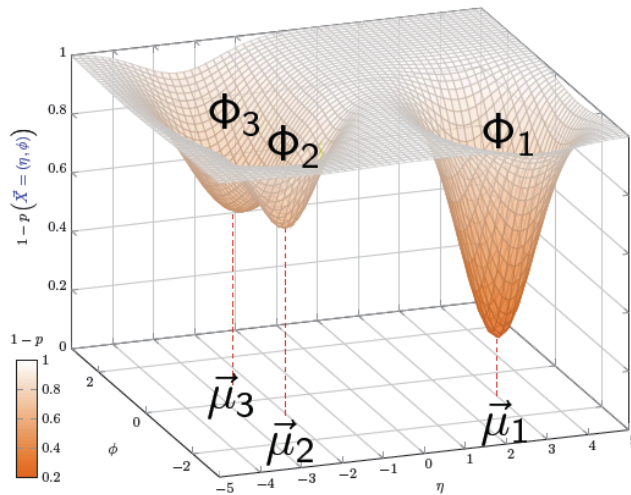
Fluctuations in  
the noise from  
point to point  
in the event

# VBF Higgs $\rightarrow ZZ \rightarrow llll$



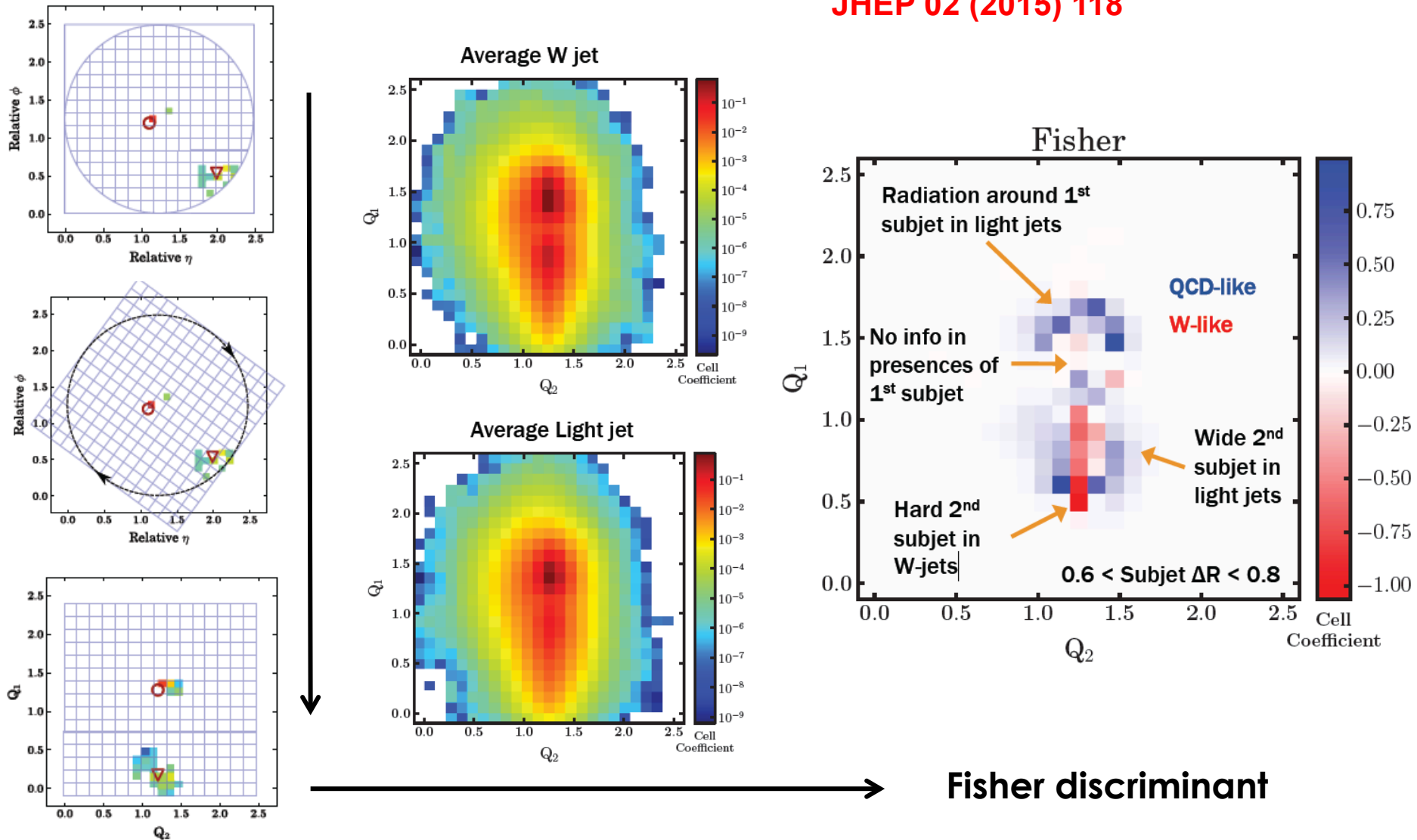
- JVF makes the jet veto efficiency stable with pileup without the need to raise the jet  $p_T$  threshold

# Pattern recognition and machine learning in jet physics

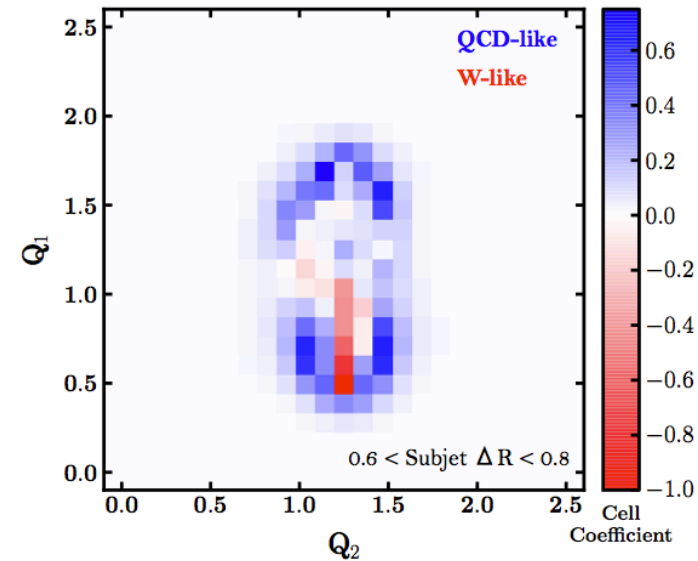
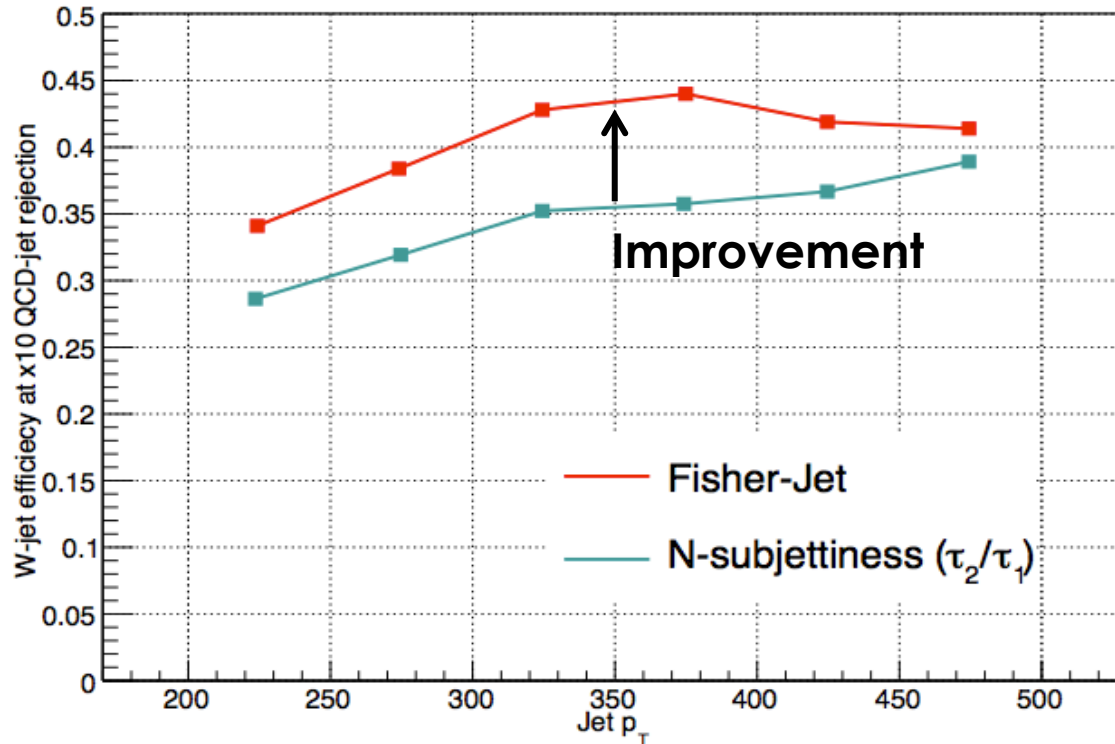


# Computer vision: jet images

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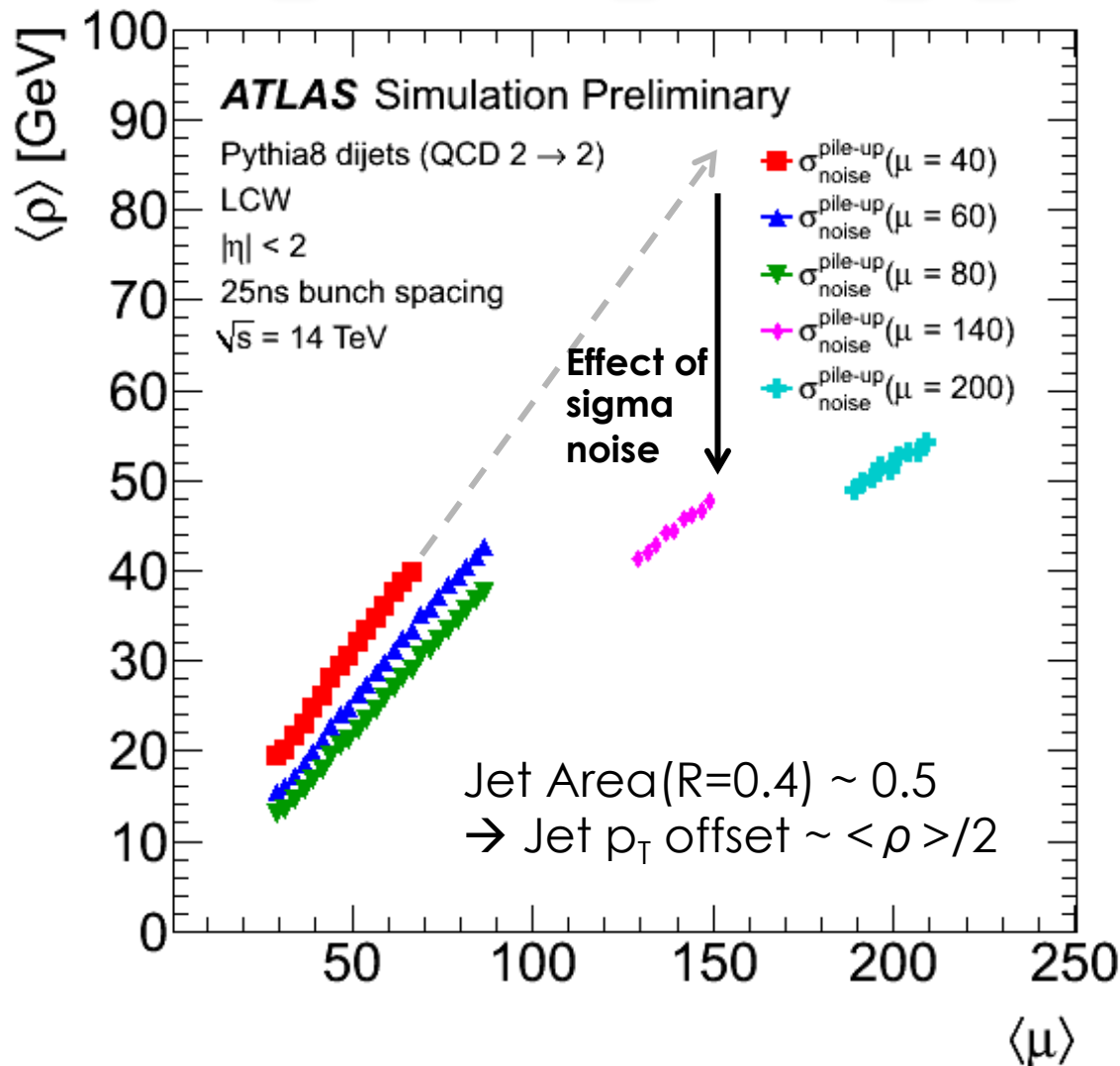
# Jet-image W tagging



- Connection between jets and images enabled the use of computer vision algorithms to jet tagging for the first time
- **Improved performance with respect to state-of-the art methods**
- **Visualization of the discriminant adds a new capability to understand the physics within jets and design more powerful jet tagging methods**



# Topoclustering pileup suppression



- Linear behavior of rho up to high mu for fixed sigma noise values
- Higher pileup sigma noise values lead to partial suppression of pileup
- **Optimization of topoclustering sigma noise is key to reconstruct jets at high luminosity**

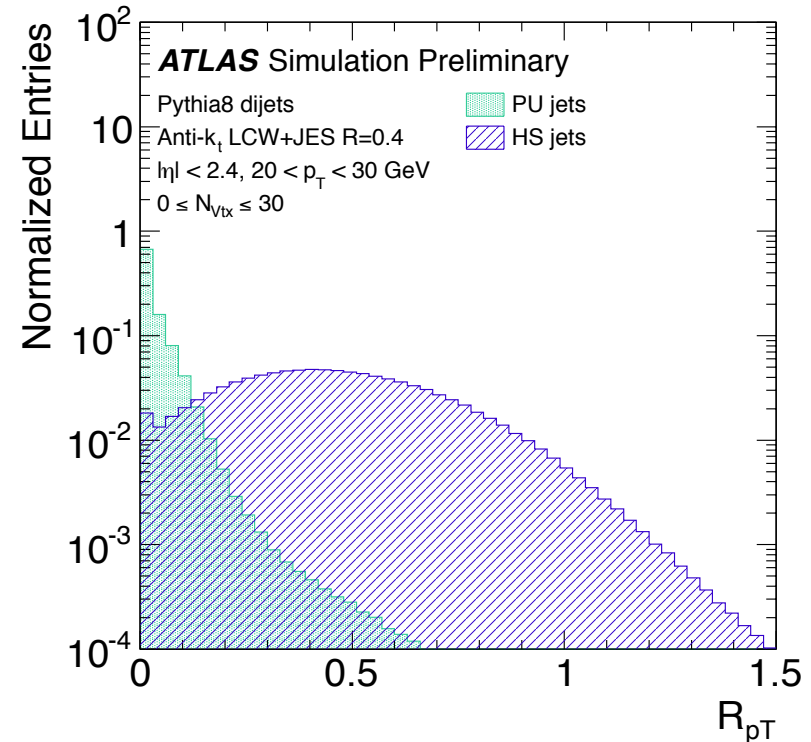
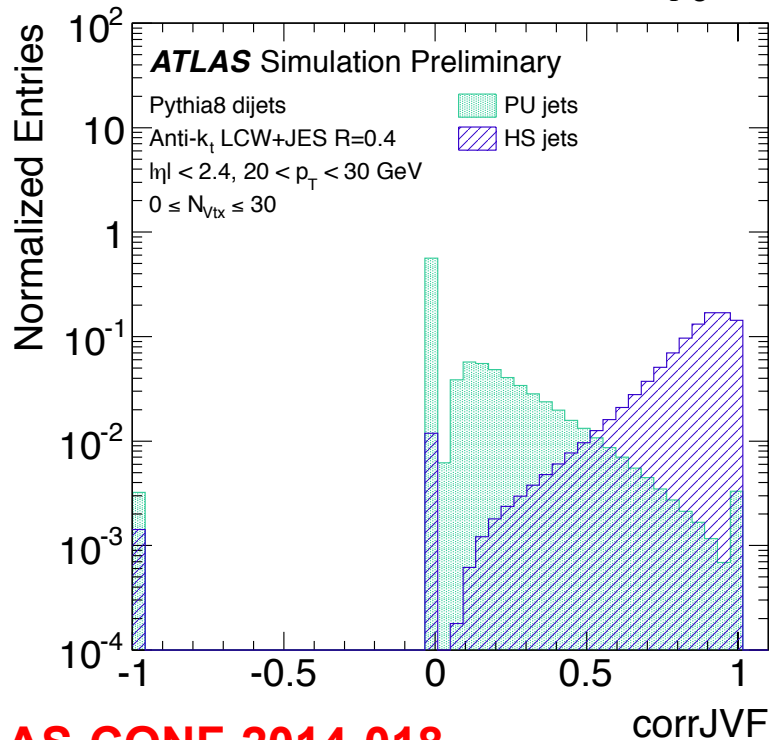
# New jet-vertex tagging variables

- Correct JVF for its pileup dependence:

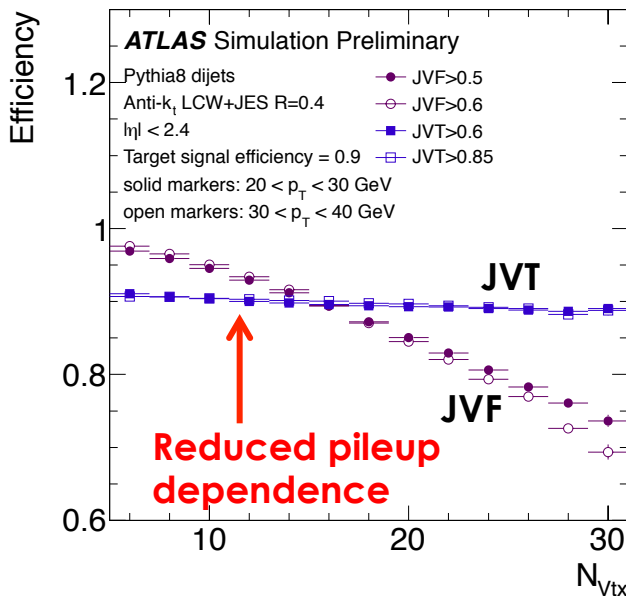
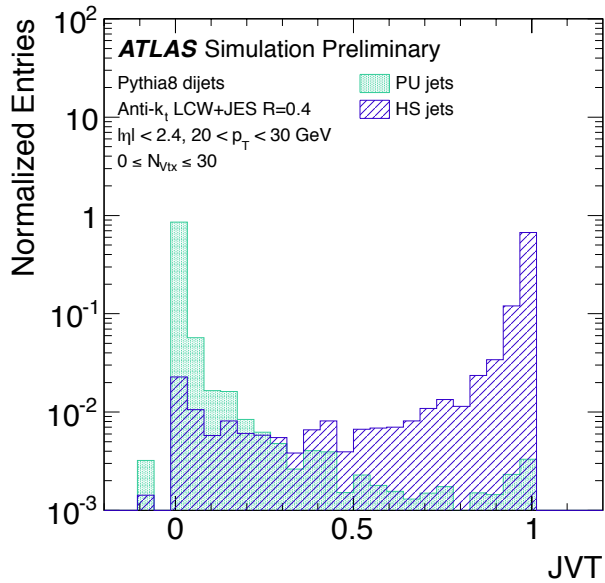
$$CorrJVF = \frac{\Sigma p_T^{trk}(PV_0)}{\Sigma p_T^{trk}(PV_0) + \frac{\Sigma p_T^{trk}(PU_n)}{k n_{PU}^{trk}}}$$

- Use pileup-corrected observables:

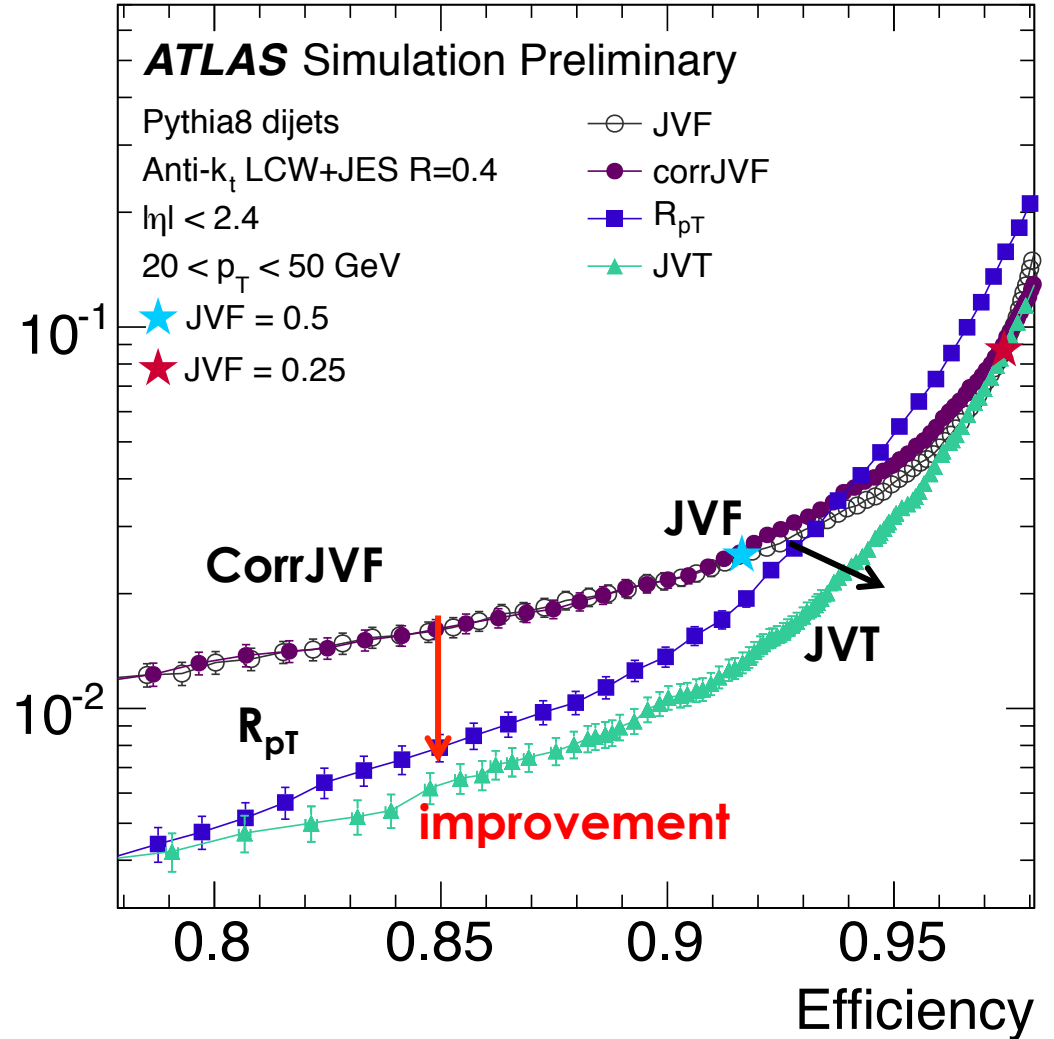
$$R_{pT} = \frac{\Sigma p_T^{trk}(PV_0)}{p_T^{jet}}$$



# Jet Vertex Tagger (JVT)



Fake Rate



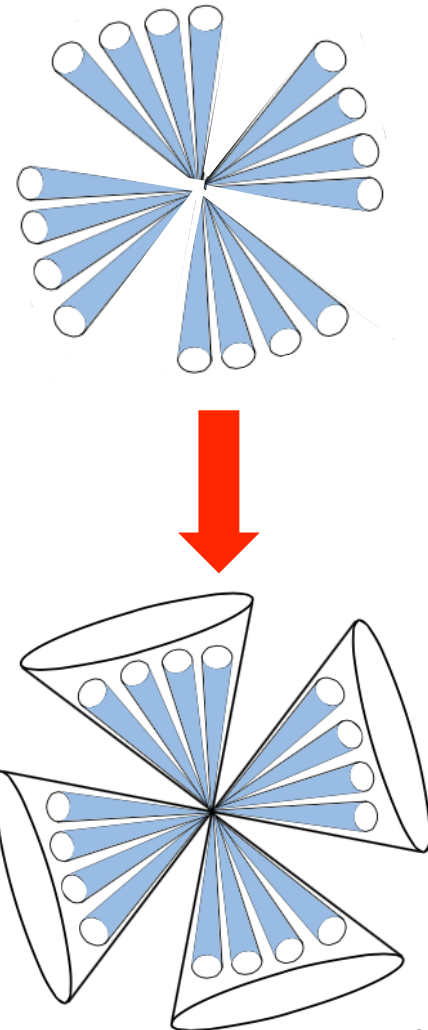
**New ATLAS pileup suppression algorithm for Run 2**

# High multiplicity searches using jet mass

- Search for events with four large-R jets and use the total-jet-mass event-level observable to separate signal from background:

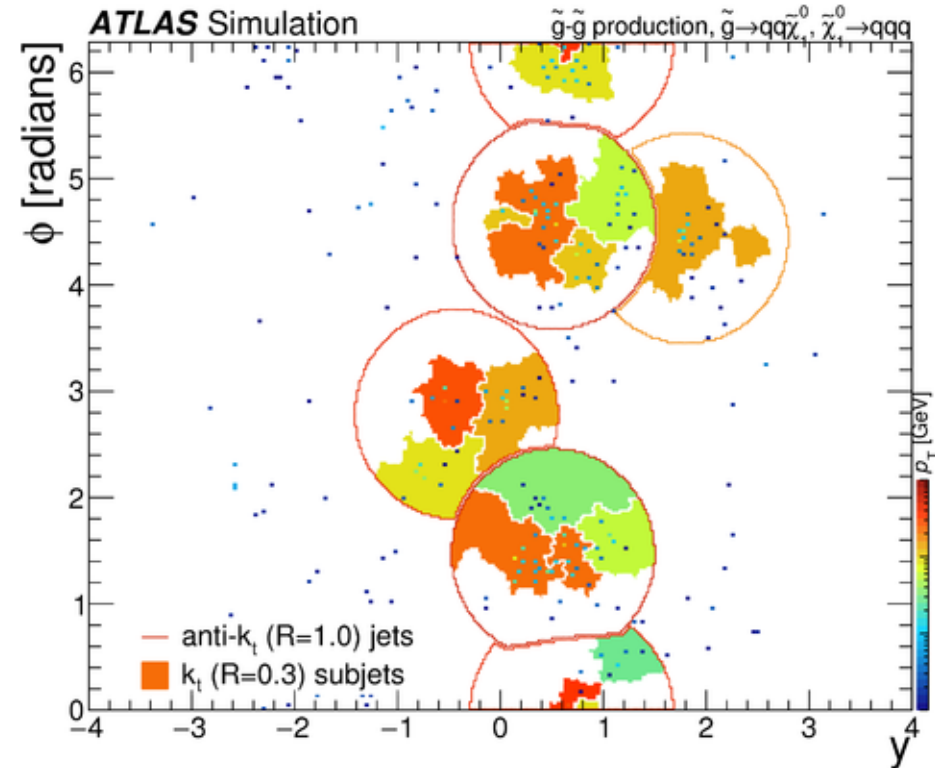
$$M_J^\Sigma = \sum_{\substack{p_T > 100 \text{ GeV} \\ |\eta| < 2.5}}^4 m^{\text{jet}}$$

- **Large-R jets in high multiplicity events have a multi-prong structure from the accidental merging of partons resulting in large jet masses**
  - Jet masses do not correspond to a parent's particle's mass
- Two assumptions:
  - **Jet rich environment**
  - **Large-R Jet masses uncorrelated**



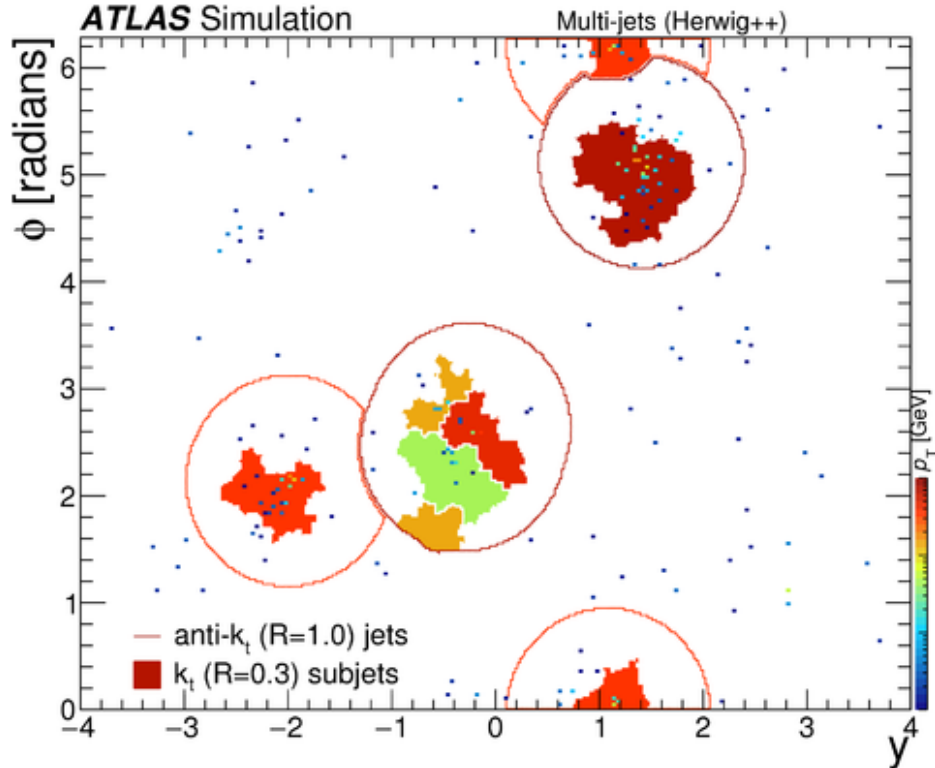
**A. Hook, E. Izaguirre, J. Wacker, et. al. (arXiv:1202.0558)**

# Total-jet-mass



**Signal event (gluino mass = 1 TeV)**

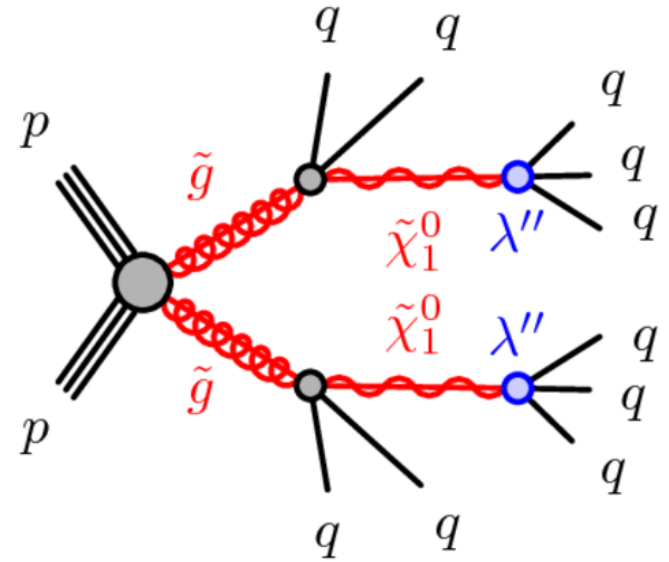
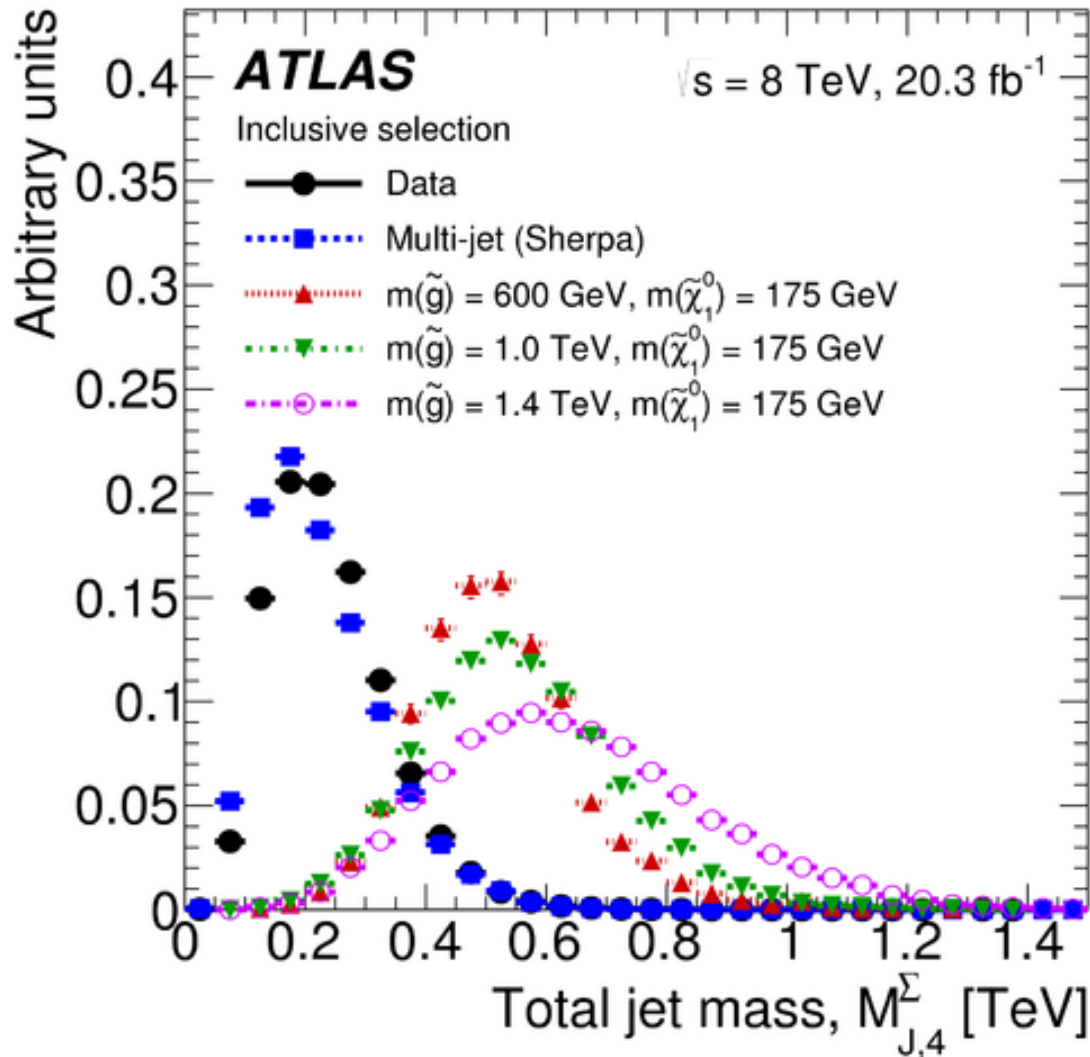
$$M_J^\Sigma = 705 \text{ GeV}$$



**Background event**

$$M_J^\Sigma = 260 \text{ GeV}$$

# Total-jet-mass



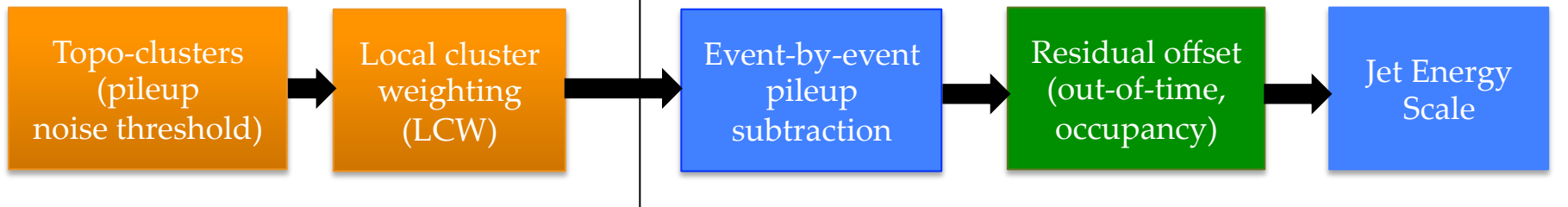
**Total jet mass sensitive to gluino mass and mass splitting:**

$$m_{\tilde{g}} - m_{\tilde{\chi}_1^0}$$

# Jet calibration

Jet energy scale

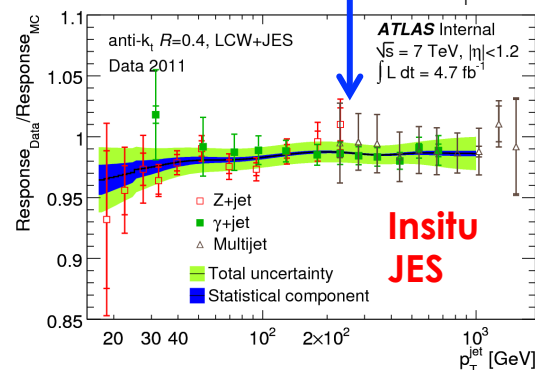
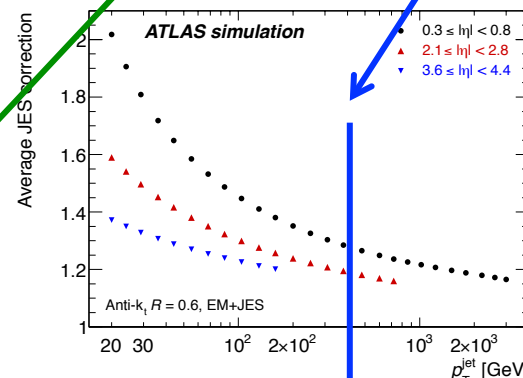
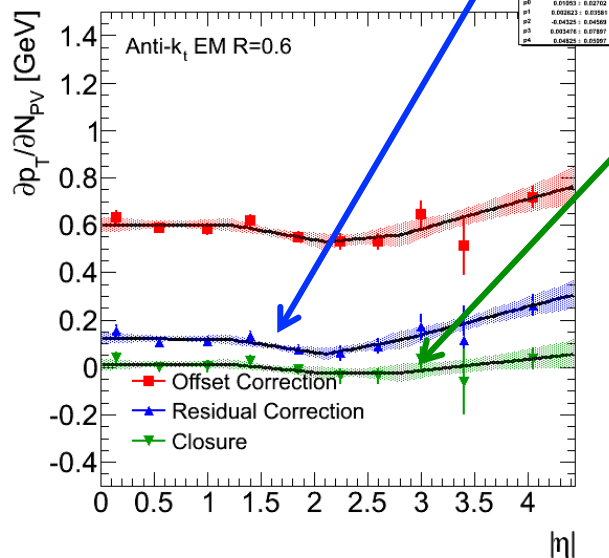
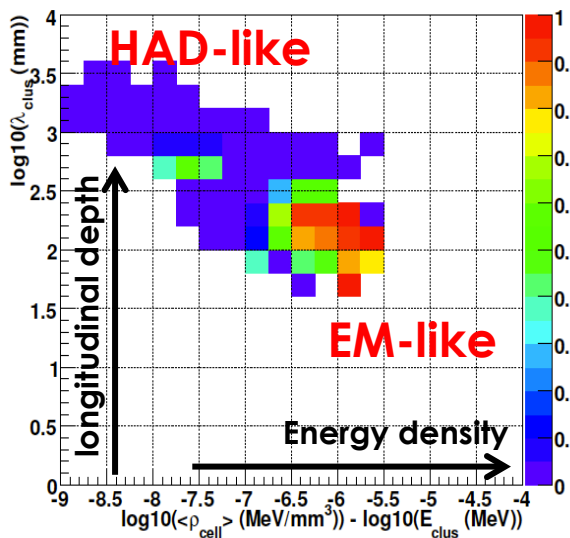
inputs



Pileup noise:  
 $\sigma(\mu)$

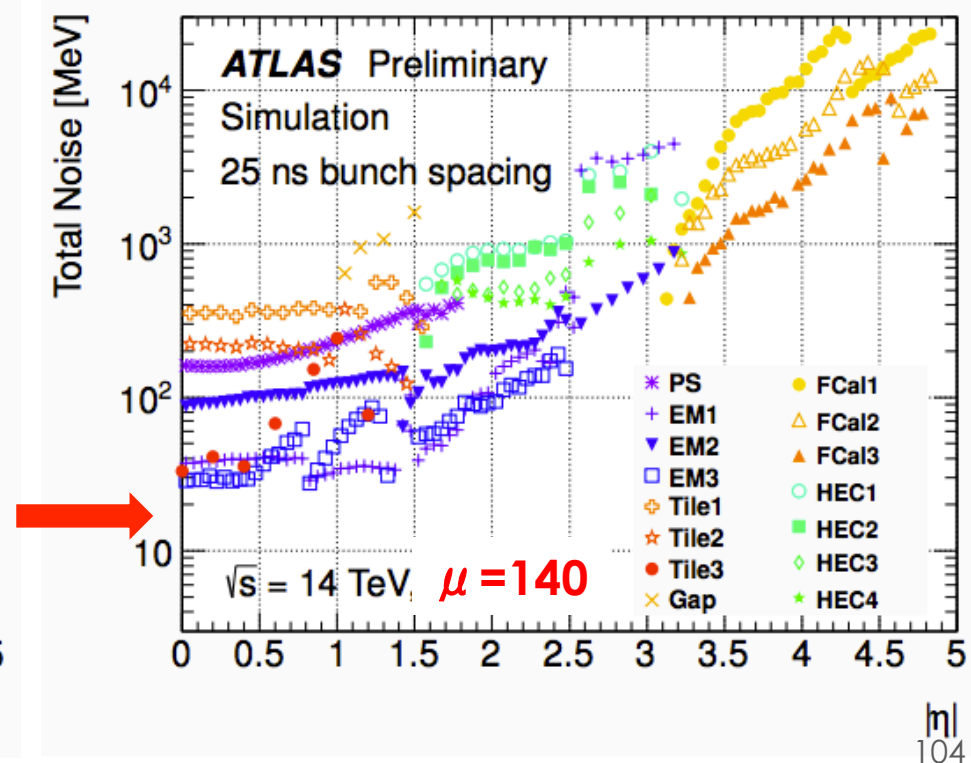
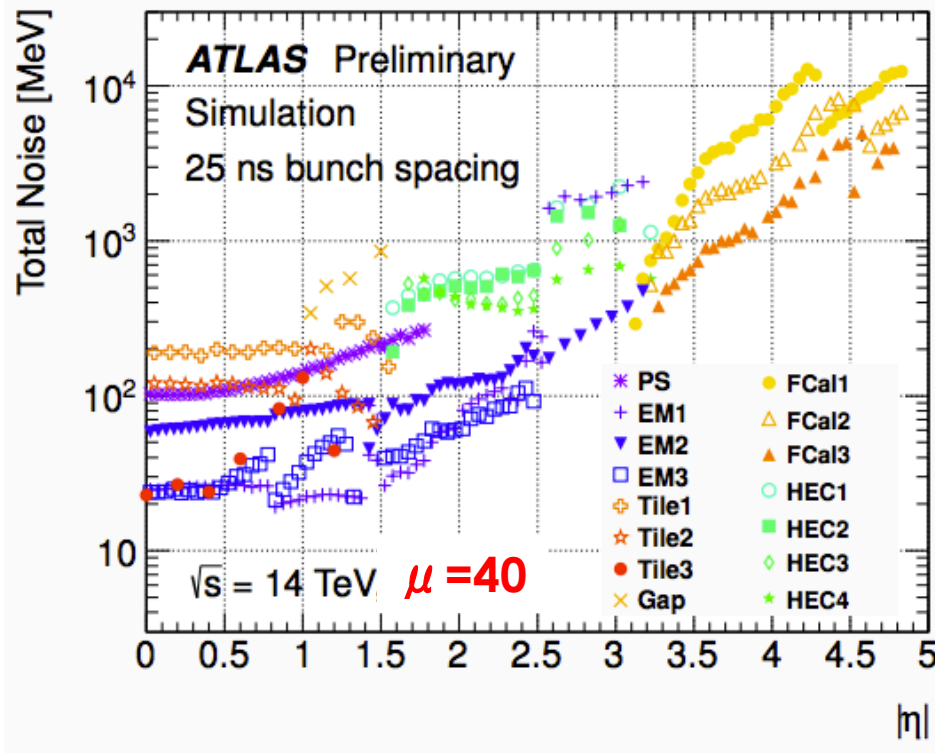
EM/HAD  
classification

$$p_T^{calib} = \left( p_T - \rho A - \alpha(N_{PV} - 1) - \beta \langle \mu \rangle \right) \times JES$$



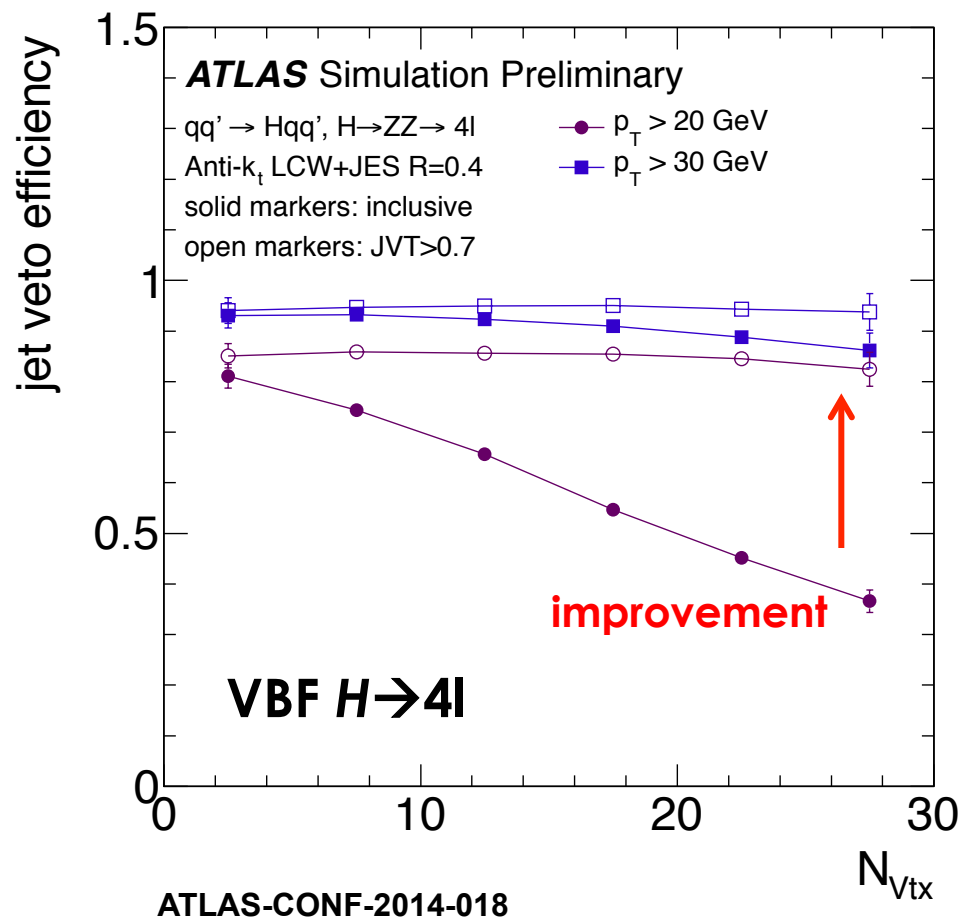
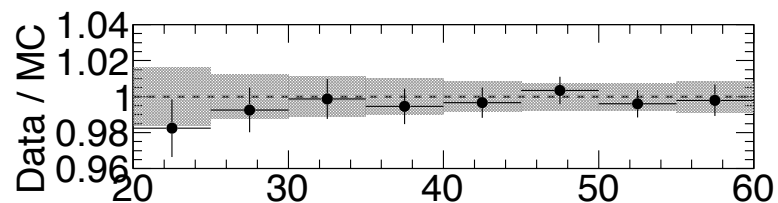
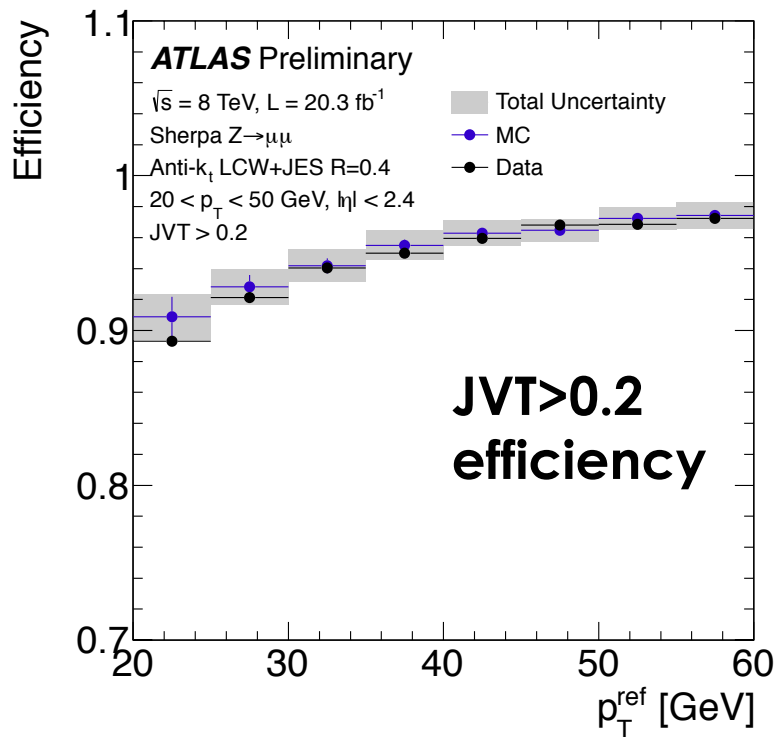
# Topo-clustering at high luminosity

- Adjust  $\sigma$  pileup noise for each  $\mu$  configuration
- Optimization of local calibration for EM/HAD cluster classification for each pileup noise value
  - Derived from single pion simulation with  $\mu = 0$  and  $\sigma (\mu > 0)$

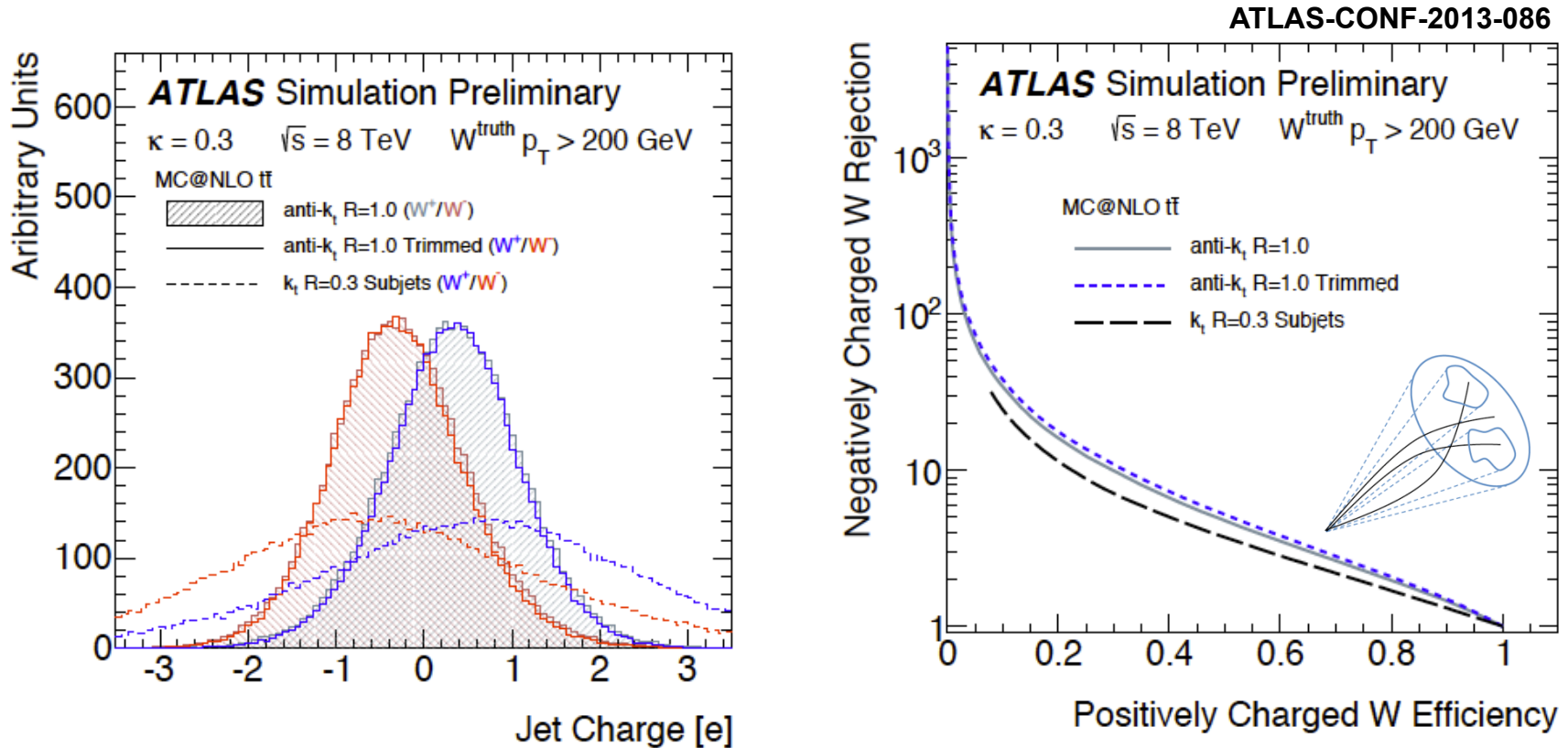




# Jet Vertex Tagging performance



# Jet charge in boosted W jets



- **Different ways to define jet charge in a boosted W jet**
  - Using the sum of leading subjet charges leads to worse separation
- **Optimal definition makes use of all associated tracks**
  - Grooming has not impact

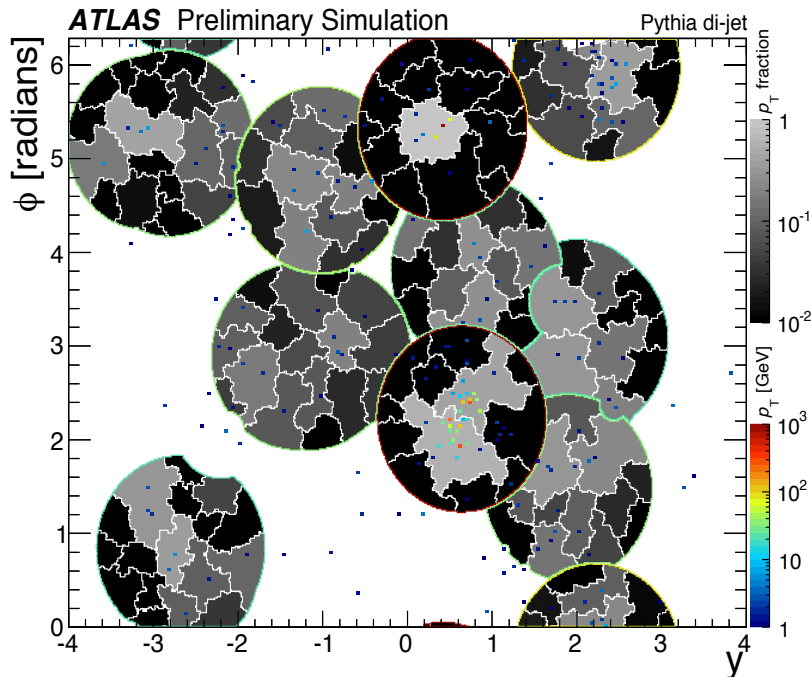
# Jet trimming

- Jet contamination from pileup, underlying event, and initial state radiation is softer than hard-scatter partons and final state radiation:

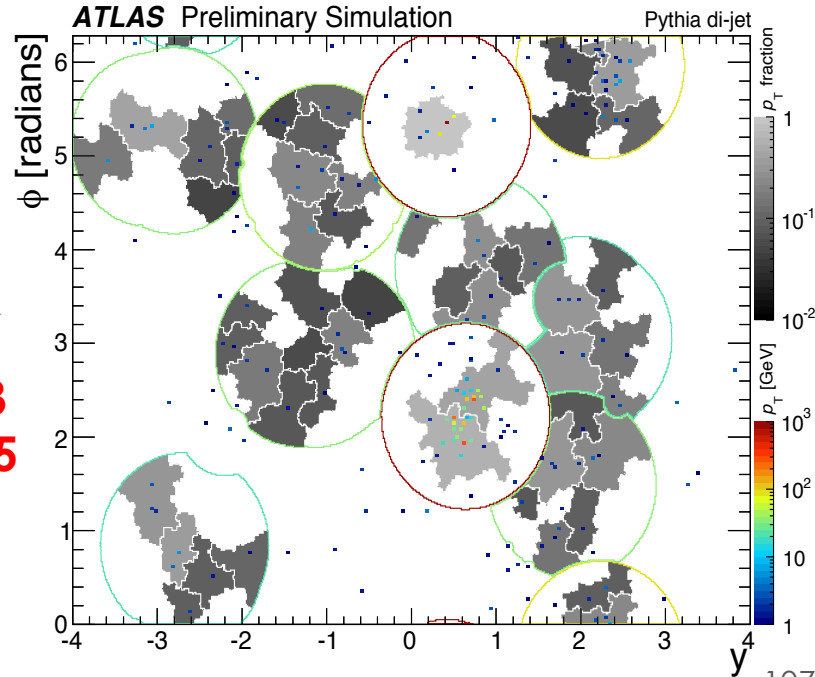
1. Recluster jet constituents into  $k_{\perp}$  subjects with small  $R$
2. Discard subjects with:

- Remove soft components of the jet
- Reduce the area of the jet

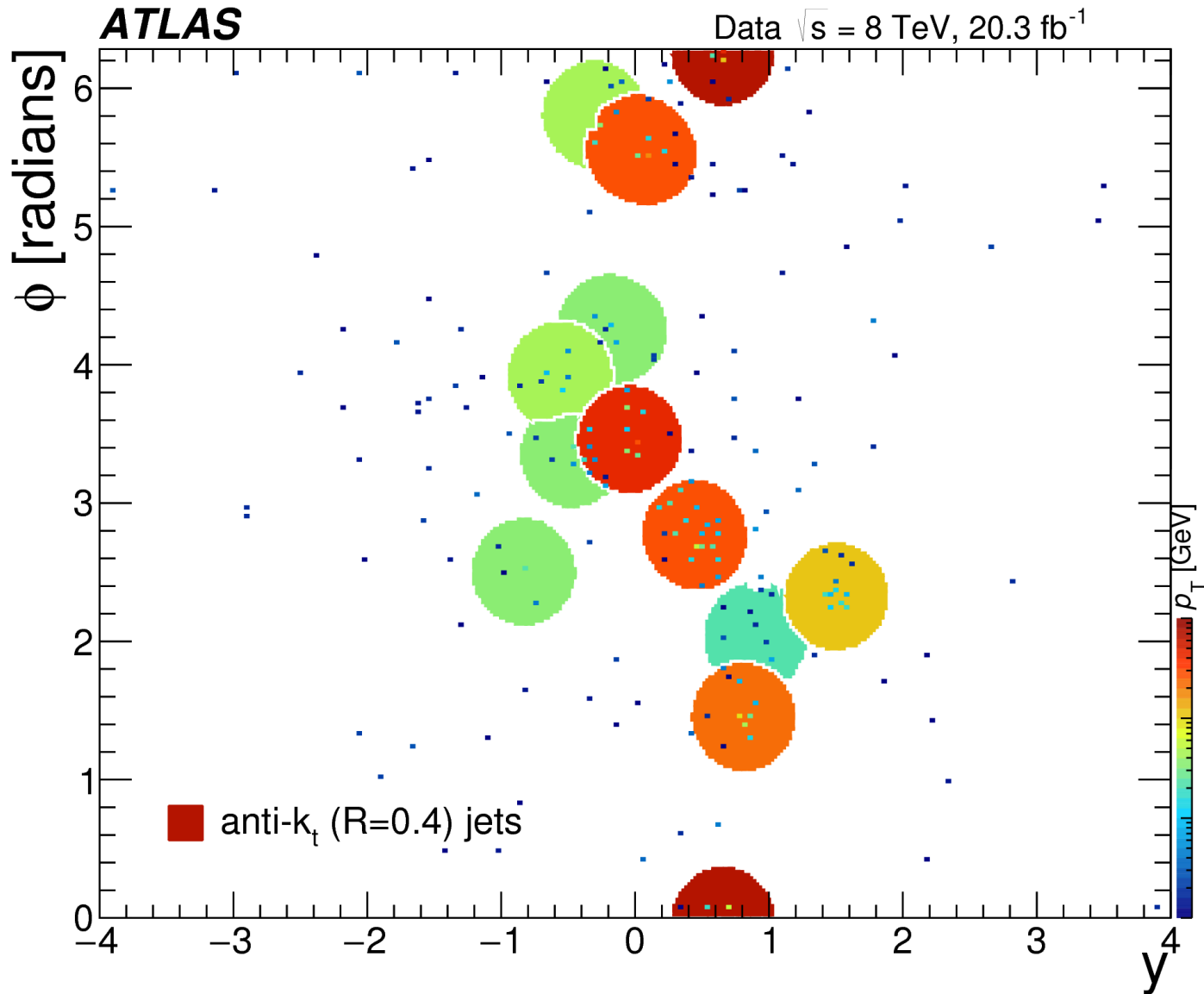
$$p_T < f_{cut} \cdot p_T^{jet}$$



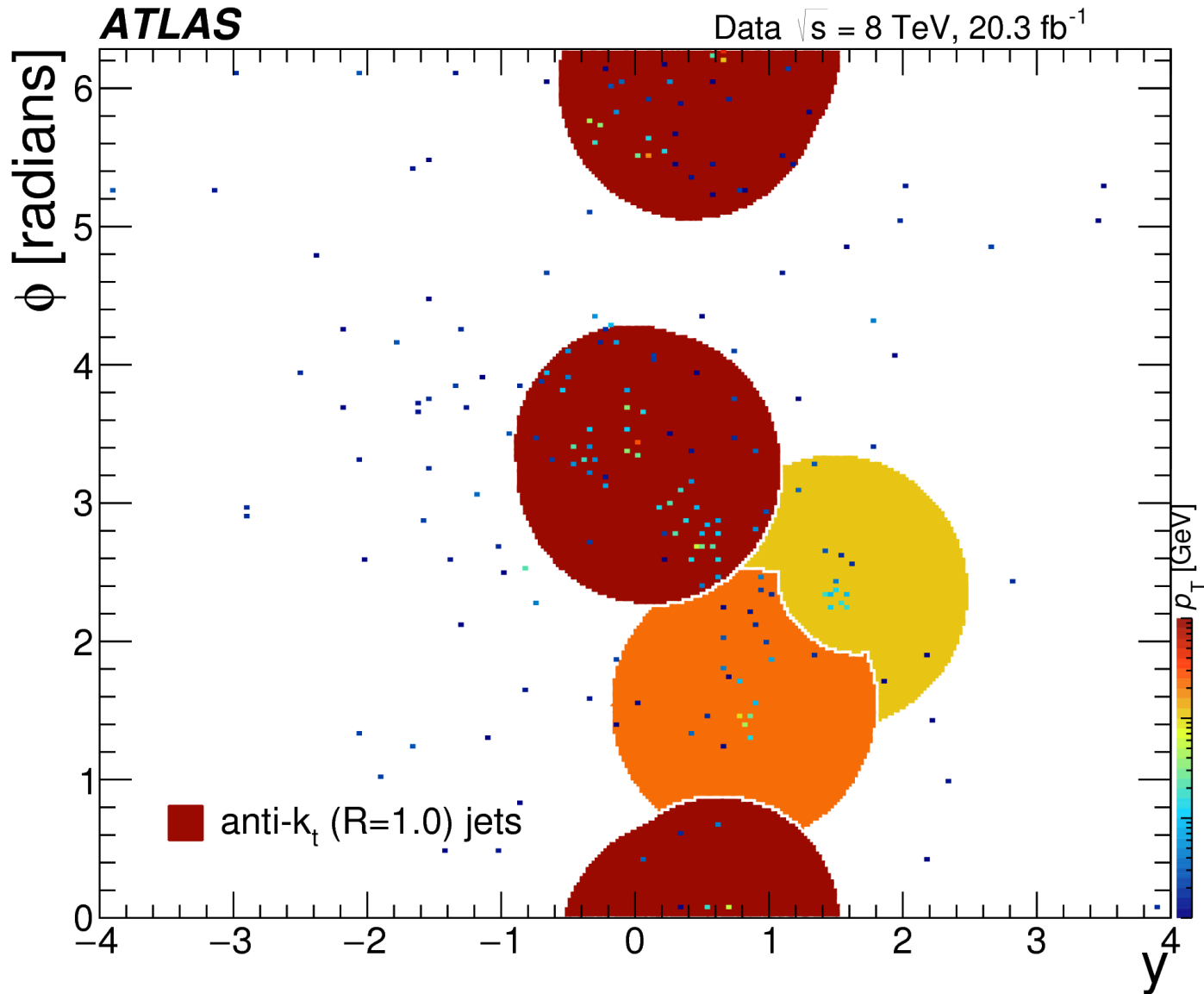
$k_{\perp} R = 0.3$   
 $f_{cut} = 0.05$



# Multijet event (R=0.4)



# Multijet event (R=1.0)



# Multijet event (Trimming)

