

New Techniques for Jet Reconstruction and Calibration at ATLAS

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and TRIUMF*

- on behalf of the -

ATLAS Collaboration

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[See ATLAS Collaboration, arXiv:2303.17312 \[hep-ex\]](https://arxiv.org/abs/2303.17312)

Accepted by EPJC

(unless otherwise noted, figures are from this note)

TRIUMF



SFU

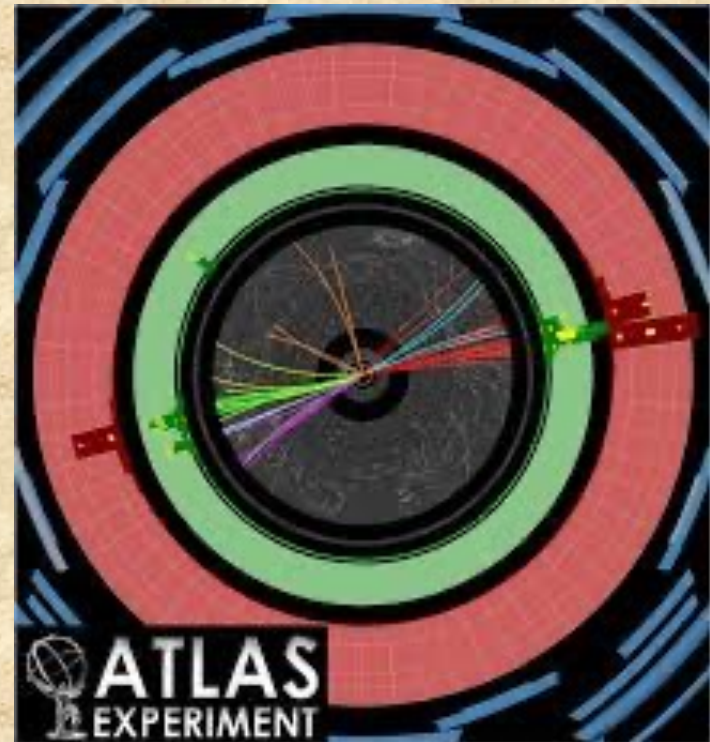
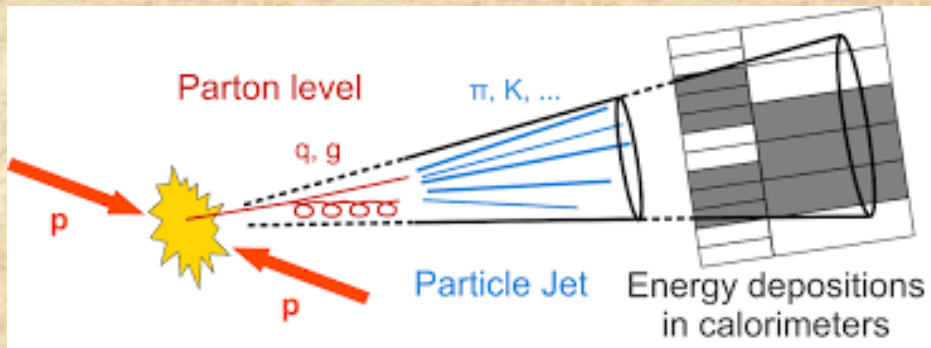
SIMON FRASER UNIVERSITY
THINKING OF THE WORLD

M. Vetterli – ICNFP2023 – July 2023 - #1



Introduction

- Jets are ubiquitous in high-energy pp collisions. Critical to understand them for all physics analyses.
- Collimated streams of particles (mostly hadrons) created by quarks and gluons emerging from the collisions.



ATLAS
dijet event

Introduction

- *Jets are ubiquitous in high-energy pp collisions. Critical to understand them for all physics analyses.*
- *Collimated streams of particles (mostly hadrons) created by quarks and gluons emerging from the collisions.*
- *Reconstruction and calibration are particularly difficult in the presence of **large pileup** (multiple interactions superimposed on the hard scattering of interest).*
- *Large-R jets capture the products of boosted particle decays (e.g. W, Z, top); determination of jet mass and substructure now important, in addition to energy.*
- *ATLAS has done numerous studies with Run-2 data to fine tune the reco and calibration of jets to improve physics results.
=> some of this here in this talk*

Inputs to Jet Reconstruction

- *Calorimeter Clusters: Energy deposited in the calorimeter*
- *Particle Flow Objects (PFlow): Tracks are measured better in the Inner Detector at lower energies (< 100 GeV). Replace calo clusters with tracks & subtract predicted energy deposits from the clusters. Keep neutral PFOs unchanged => ATLAS Standard*

Inputs to Jet Reconstruction

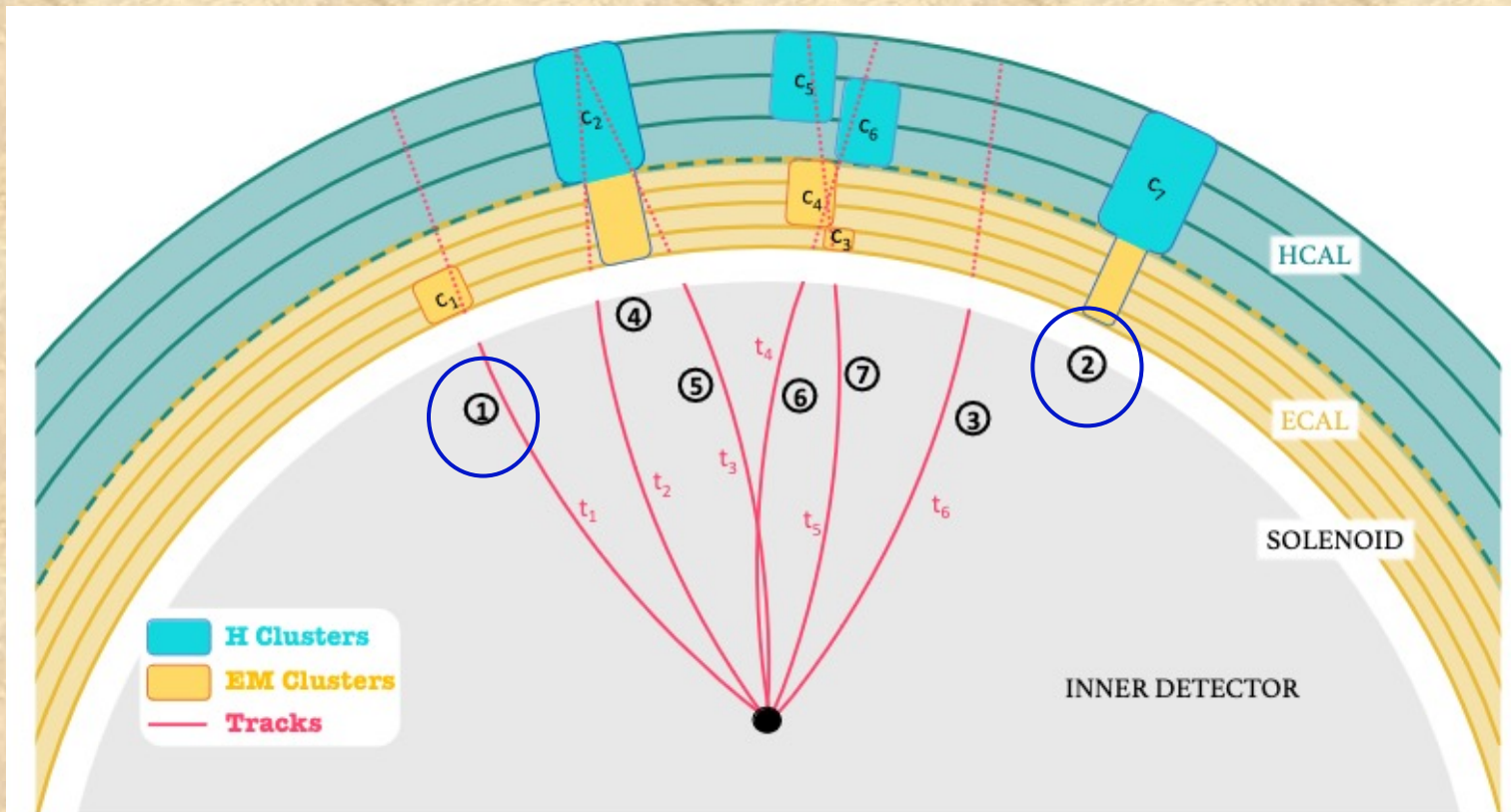


Figure 3: A schematic demonstrating the creation of seven TCC objects representing ① a simple track-cluster match, ② a topo-cluster without a matching track, ③ a track without a matching cluster, ④ and ⑤ are each tracks matching a single cluster but sharing that cluster's energy, and ⑥ and ⑦ showing a much more complex scenario with multiple track-cluster matches. Details on the exact reconstruction procedure and the seven TCC 4-vectors are provided in the text.

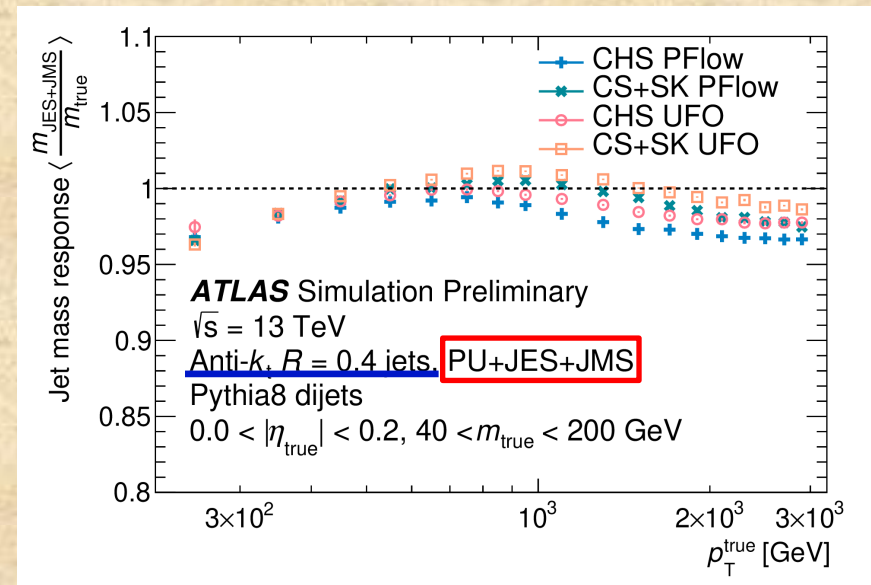
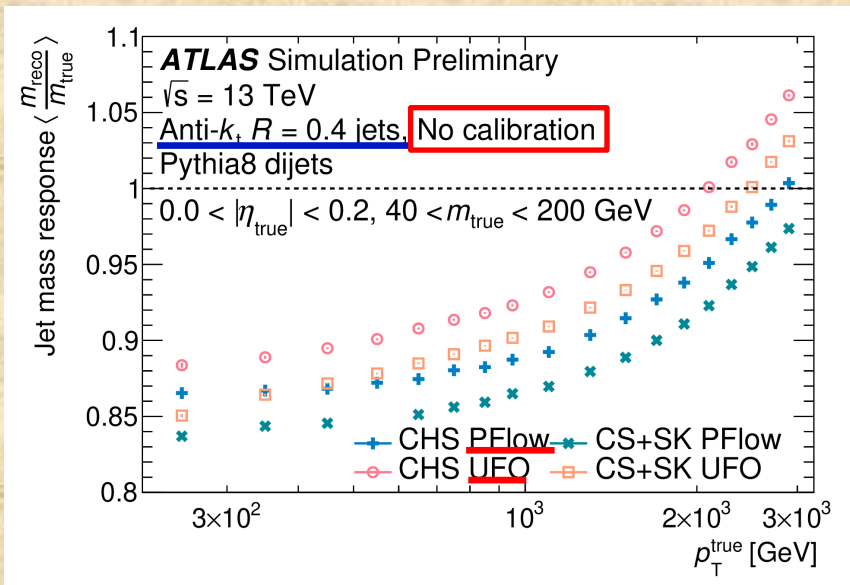
ATL-PHYS-PUB-2017-15

Inputs to Jet Reconstruction

- **Track Calo Clusters:** Produce new 4-vectors that use the *energy from the calorimeter & angles from matched tracks*: (p_T, η, ϕ) . Clusters shared by more than one track are split. Also have neutral TCCs. *Much better jet mass and substructure measurement.*
- **Unified Flow Objects (UFO):** Start with standard PFlow; remove pileup vertices. Then apply a modified TCC cluster splitting at high energy (don't consider tracks used for Pflow and ignore pileup vertices). *Especially improve the jet mass and substructure variables.*
=> new ATLAS standard

Inputs to Jet Reconstruction

- *Jet reco using various constituent objects; PFOs vs UFOs*
- *Improved jet-mass response; even better with large-R jets.*

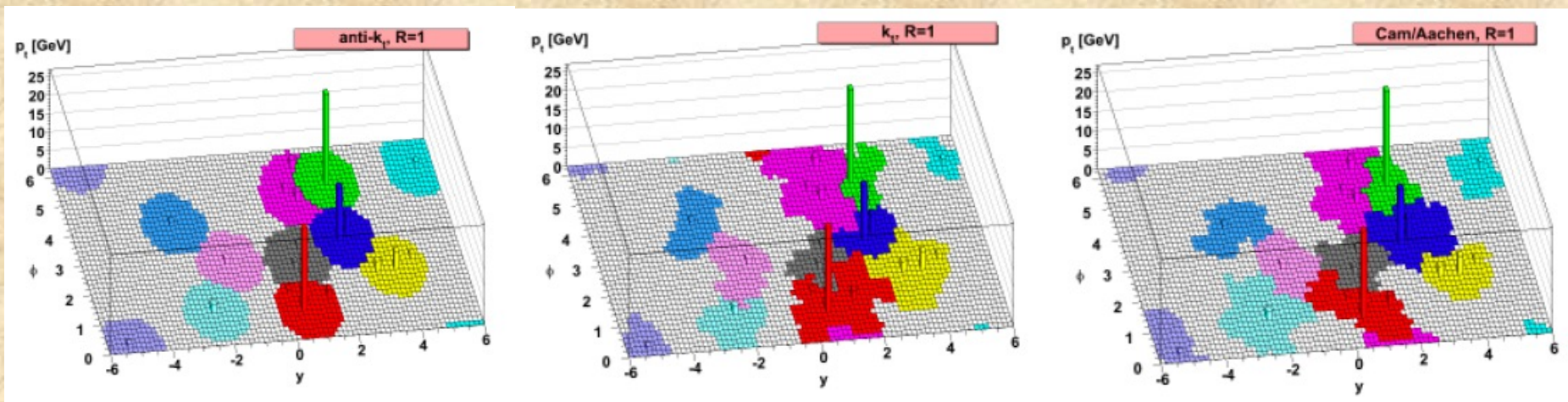


ATL-PHYS-PUB-2022-038

CHS, SK, CS are constituent-level pileup mitigation techniques; effectively remove low-energy particles before jet reco (see backup slides)

Jet Reconstruction Algorithm

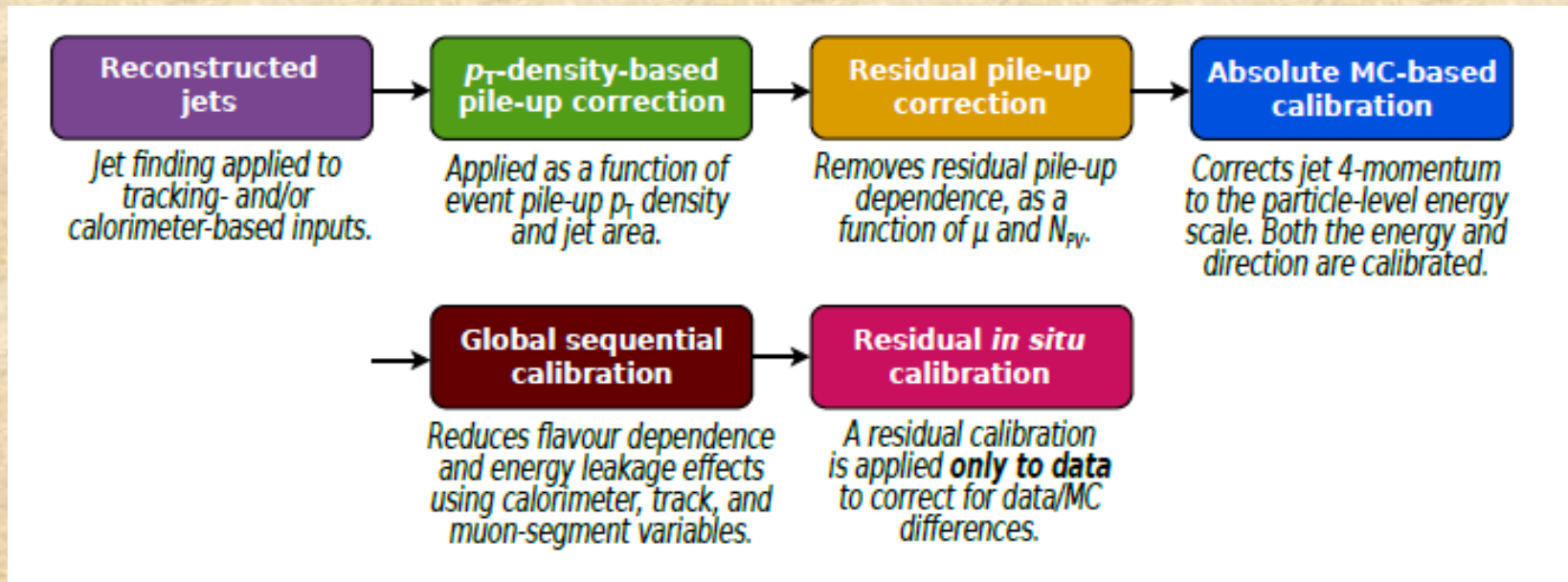
- *ATLAS uses the **anti- k_T** recombination scheme with a radius of **$R=0.4$** and **$R=1.0$** , the latter for boosted decaying objects. **R is the radius in the (y, ϕ) plane.***
- *Also use the k_T and Cambridge-Aachen algorithms for large- R jet grooming (e.g. trimming, pruning, and soft-drop)*



M. Cacciari & G. Salam; JHEP04 (2008) 063

The Calibration Chain

- A TLAS uses a Monte-Carlo based calibration scheme that is adjusted using *in-situ* measurements



Pileup Mitigation

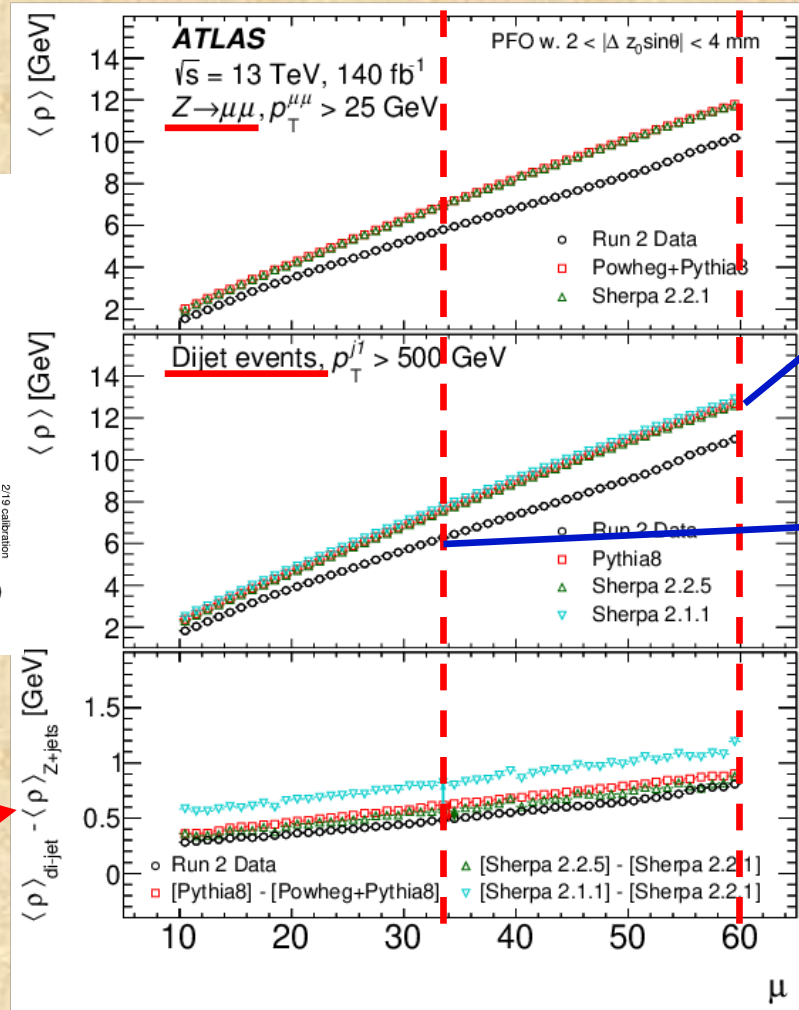
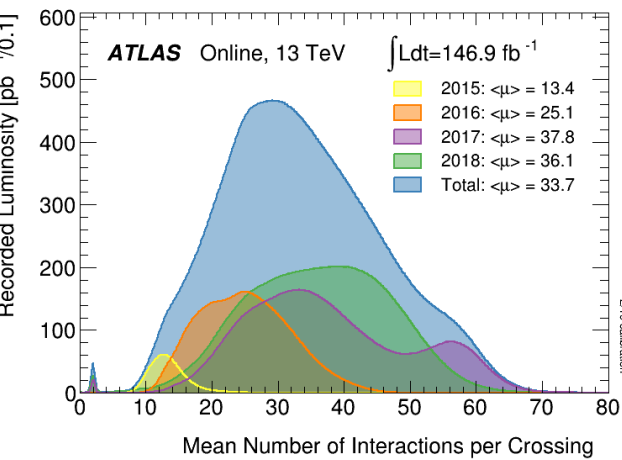
- *Default: use an area-based subtraction of pileup activity in a jet*

$$p_{\text{T}}^{\text{area}} = p_{\text{T}} - \rho \times A$$

- *A: jet area determined using ghost tracks.*
 - *ρ : estimated pileup energy density (median of all jets reconstructed with the k_{T} algorithm with $R=0.4$).
Pileup is assumed to be uniform in the detector*
- New: "pile-up sideband" algorithm
(ignore hard scatter vertex)*

Pileup Mitigation

μ is the average # of interactions (N_{PV}) per beam crossing



$R = 0.4 \Rightarrow 5.5 \text{ GeV}$
 $R = 1.0 \Rightarrow 35 \text{ GeV}$

$R = 0.4 \Rightarrow 3 \text{ GeV}$
 $R = 1.0 \Rightarrow 19 \text{ GeV}$

Pileup Mitigation

- Residual pileup correction: plot the pileup corrected energy as a function of N_{PV} and μ \Rightarrow not flat!

- 1D correction: $p_T^{1D \text{ residual}} = p_T^{\text{area}} - (\partial p_T / \partial N_{PV}) \times (N_{PV} - 1) - (\partial p_T / \partial \mu) \times \mu$

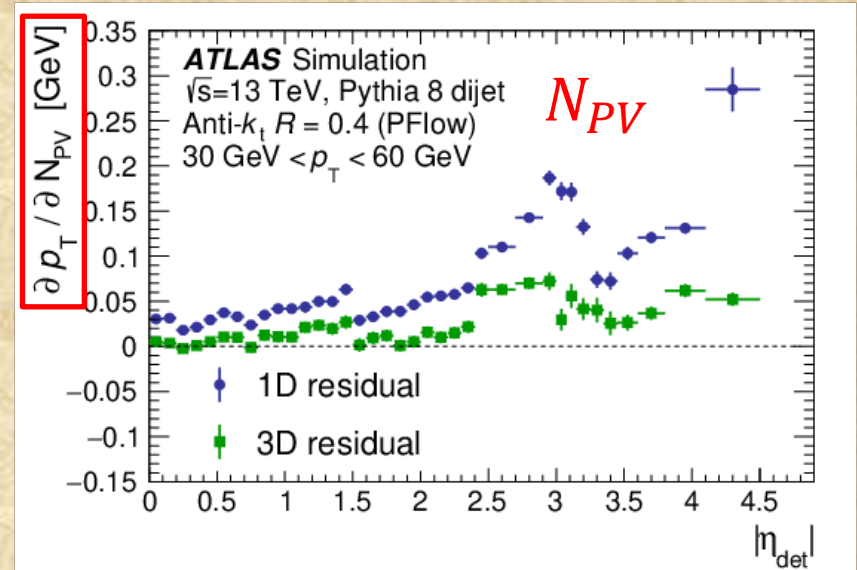
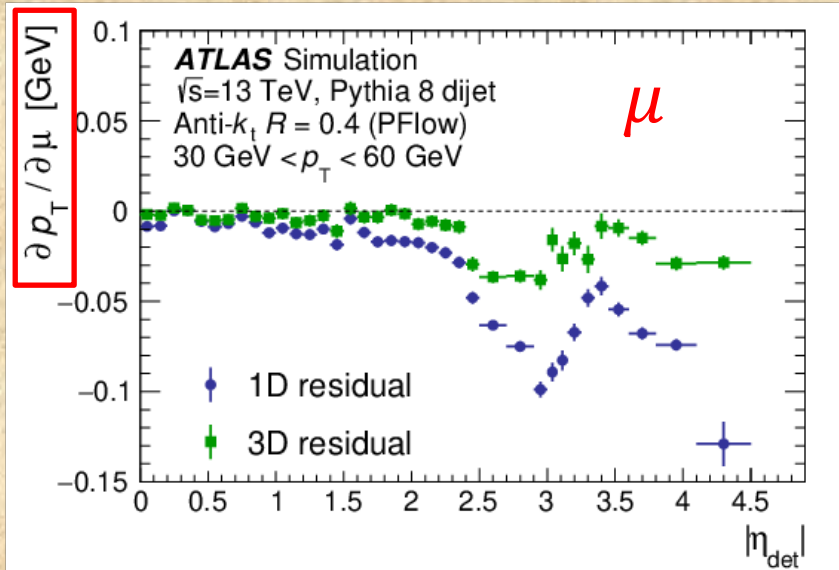
Does not account for the correlation between N_{PV} and μ

- 3D correction: $p_T^{3D \text{ residual}} = p_T^{\text{area}} - \Delta p_T^{\text{area-truth}}(N_{PV}, \mu, p_T^{\text{area}})$

- Corrects for N_{PV} and μ at the same time **AND**
- Corrects back to the particle/truth level
 \Rightarrow i.e. includes pileup **AND** detector effects (shifts the JES)

Pileup Mitigation

Comparison of 1D and 3D residual pileup corrections



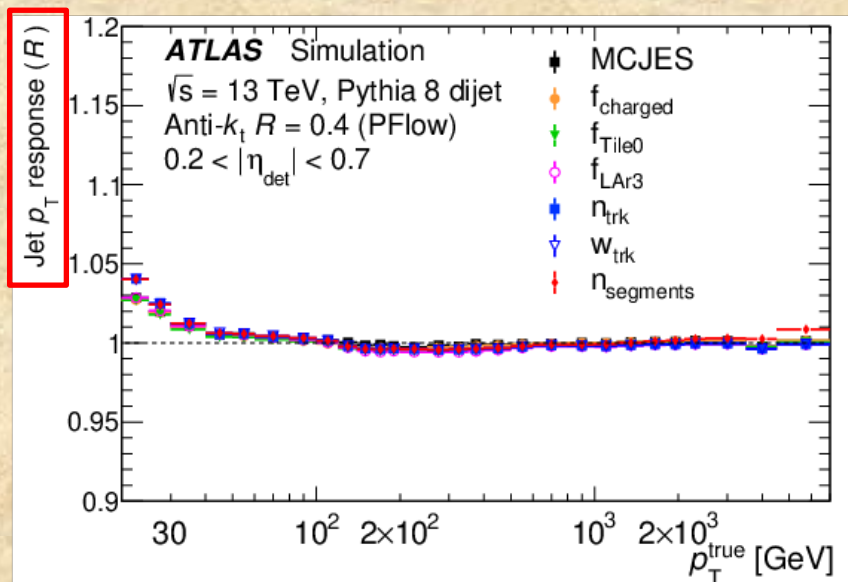
=> move to the 3D correction

Global Property Calibration

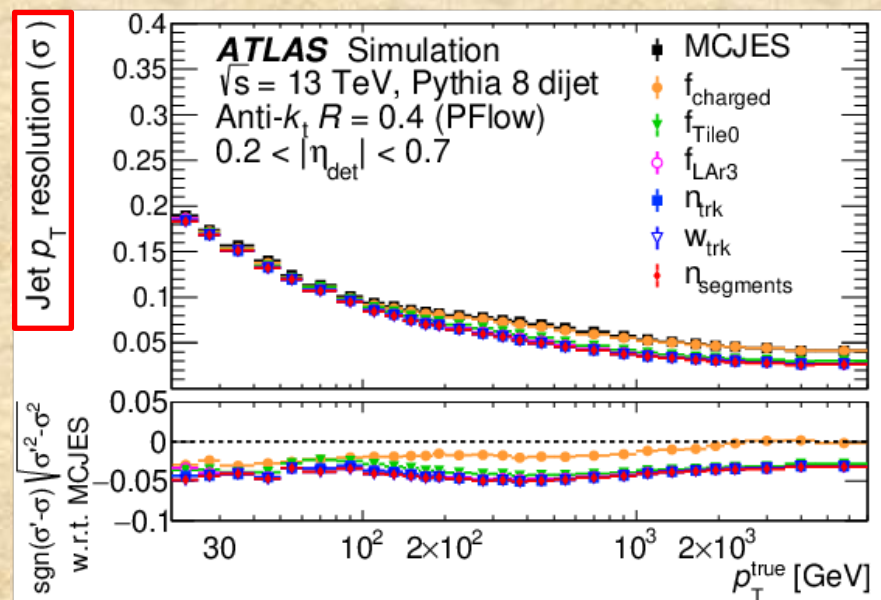
- *Jet resolution can be improved by examining jet properties.*
- *Correct for shower fluctuations (parton & calo showers)*
- *Correct for differences between quark- and gluon-induced jets*
 - *quark jets have fewer, higher energy constituents*
 - *gluon jets have more, lower energy constituents because there is more QCD radiation*
- *Parameters used sequentially: **Global Sequential Correction (GSC)***
 - *number & total p_T of tracks*
 - *depth and width of the calorimeter shower*
 - *punch through to the muon spectrometer*

Global Property Calibration

- The *GSC* should not change the *Jet Energy Scale (JES)*, but should improve the *Jet Resolution (JER)*.



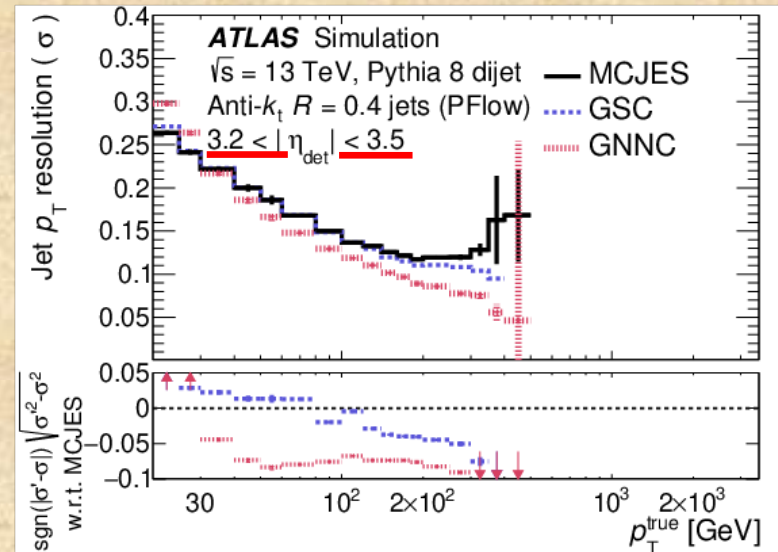
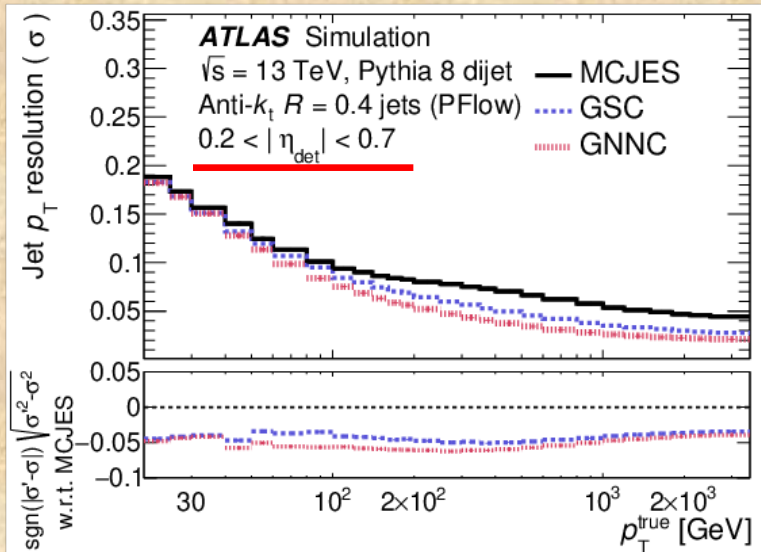
JES unchanged by any of the steps



JER improved above 100 GeV

Global Property Calibration

- The *GSC* does not take correlations between jet properties into account, so it is limited in how many variables it can use.
- *New: A Deep Neural Network (GNNC)* is used to improve the situation, especially at high p_T and large η .

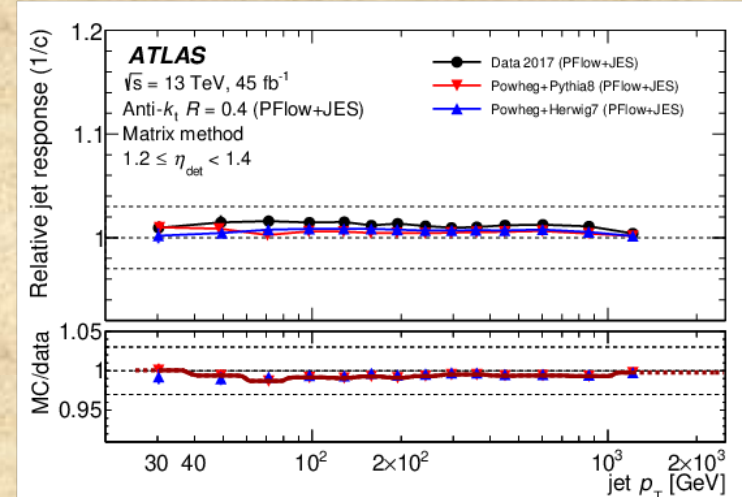
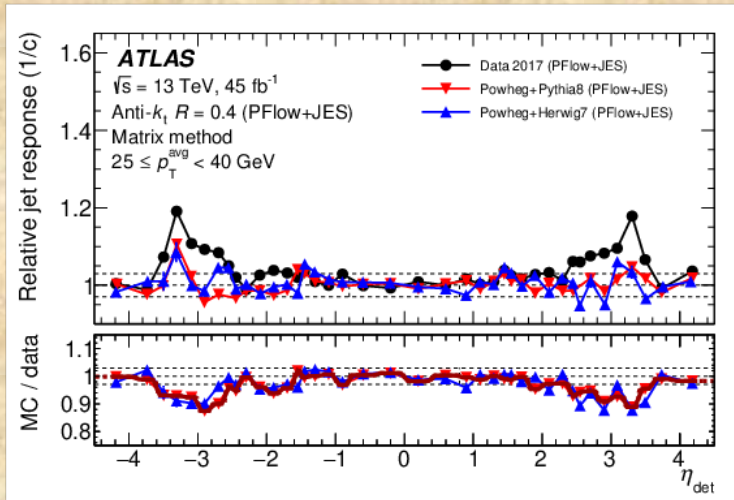


In-situ η inter-calibration

- Use dijet events to transfer the calibration from the central detector to the forward region.

$$\mathcal{A} = \frac{p_T^{\text{left}} - p_T^{\text{right}}}{p_T^{\text{avg}}}$$

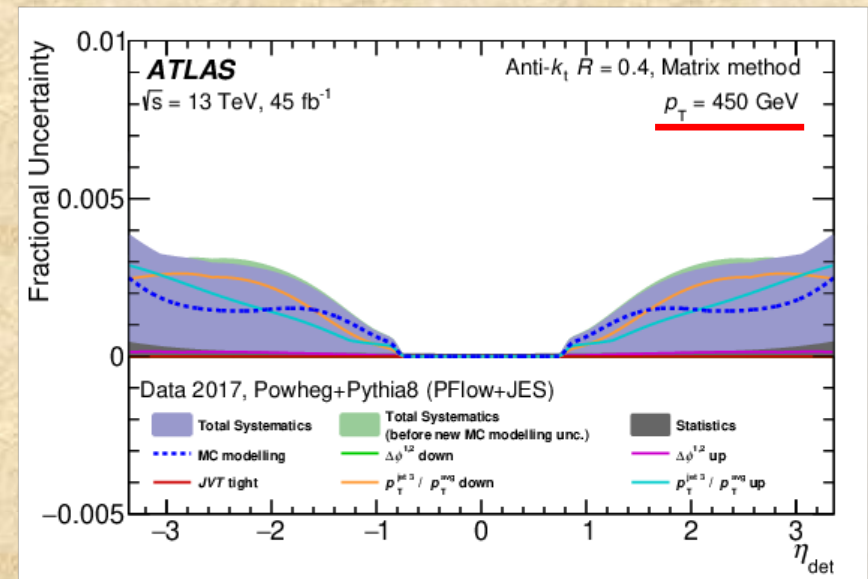
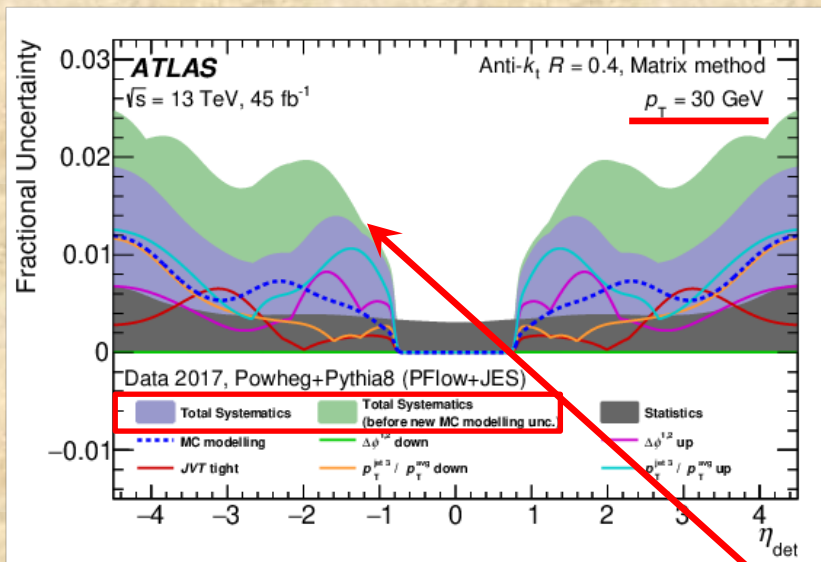
$$\mathcal{R} = \frac{c^{\text{right}}}{c^{\text{left}}} = \frac{2 + \langle \mathcal{A} \rangle}{2 - \langle \mathcal{A} \rangle} \approx \frac{\langle p_T^{\text{left}} \rangle}{\langle p_T^{\text{right}} \rangle}$$



- *New: Studies done at particle and reco level to disentangle physics and detector effects.*

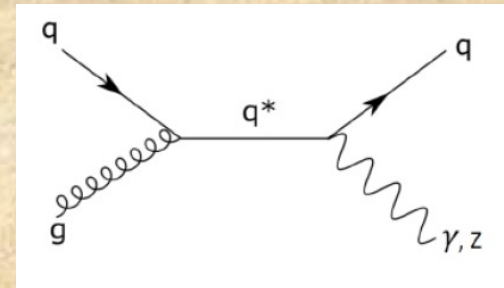
In-situ η inter-calibration

Uncertainties on transferring the jet calibration from the central region to the forward region



Improved MC modelling uncertainties, especially at low p_T

In-situ JES – V+jet



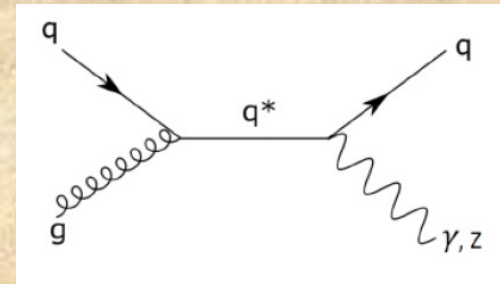
Z/gamma+jet events
Z or gamma well measured

- Use the Missing E_T Projection Fraction (MPF) technique because it is less sensitive to pileup and has smaller uncertainties

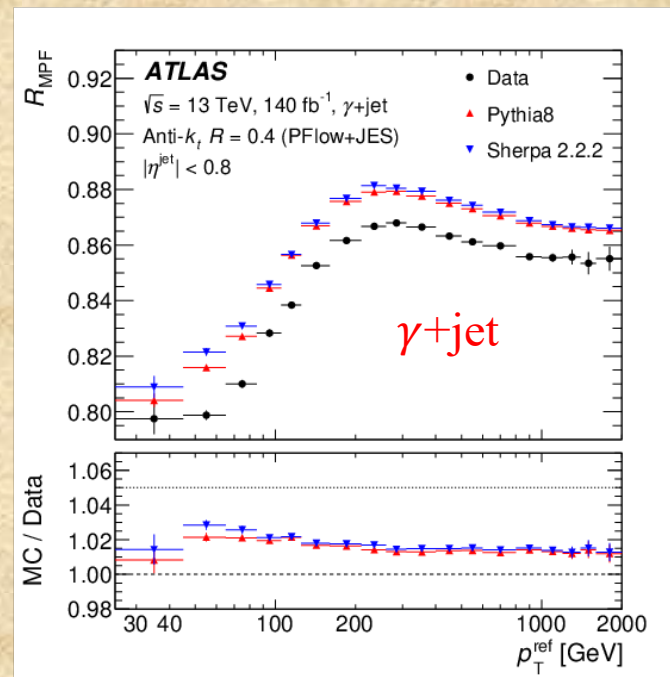
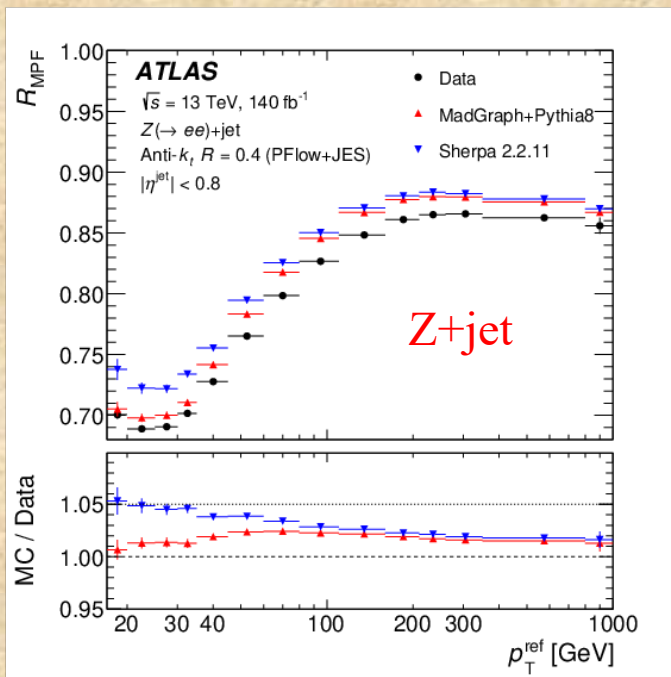
$$\vec{p}_T^{ref} + \vec{p}_T^{parton} = 0$$

- R_{MPF} is a measure of E_{meas}/E_{true}

In-situ JES – V+jet



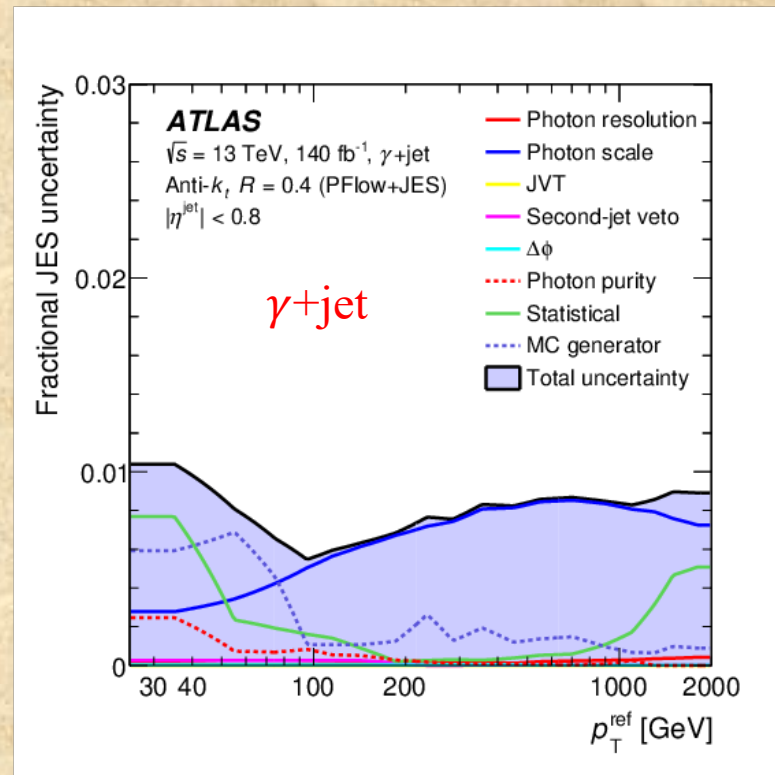
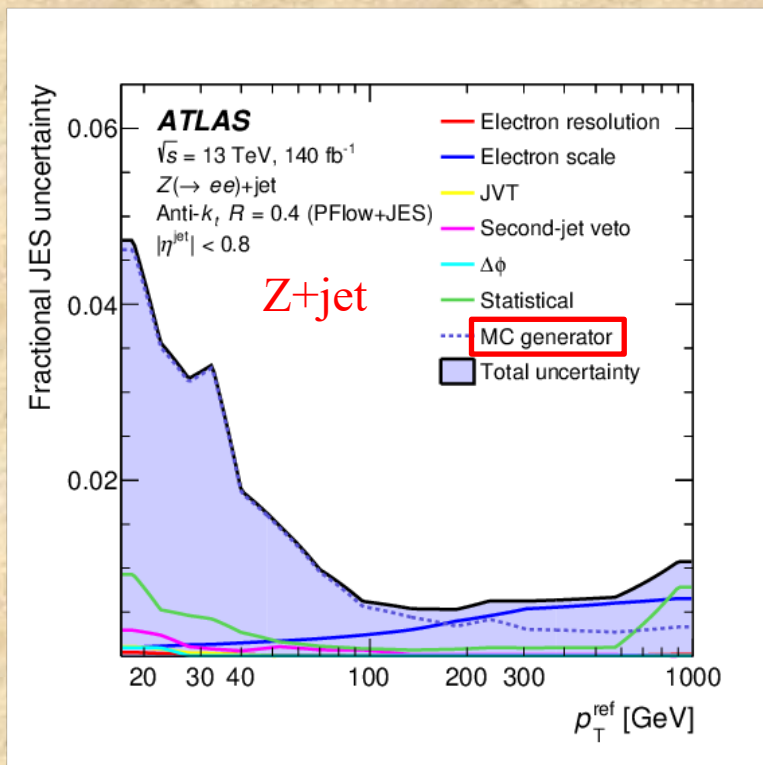
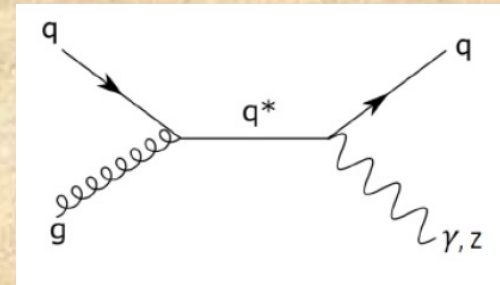
*Cuts select events with two final-state objects
(limit energy of a 2nd jet, back-to-back in ϕ)*



*Correct the data for the difference with the MC;
and use MC-based calibration*

In-situ JES – V+jet

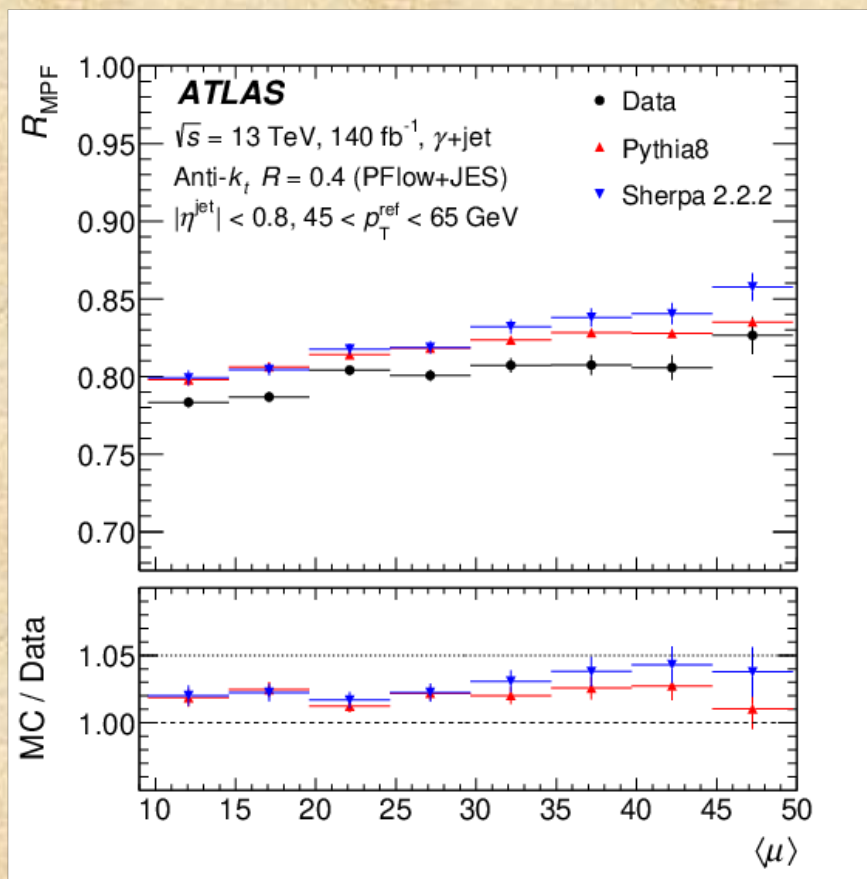
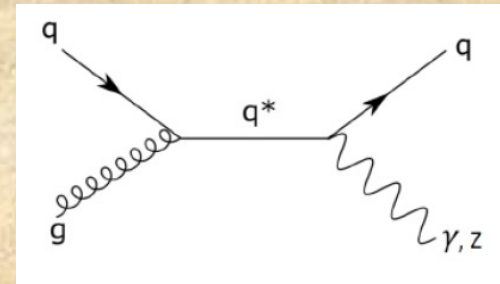
Extensive studies of systematic uncertainties



Less than 1% systematic uncertainty over most of the p_T range

In-situ JES – V+jet

*The MPF response is mostly insensitive to pileup.
(no pileup correction done in this plot)*



Although there is a small slope at $\mu > 20-25$

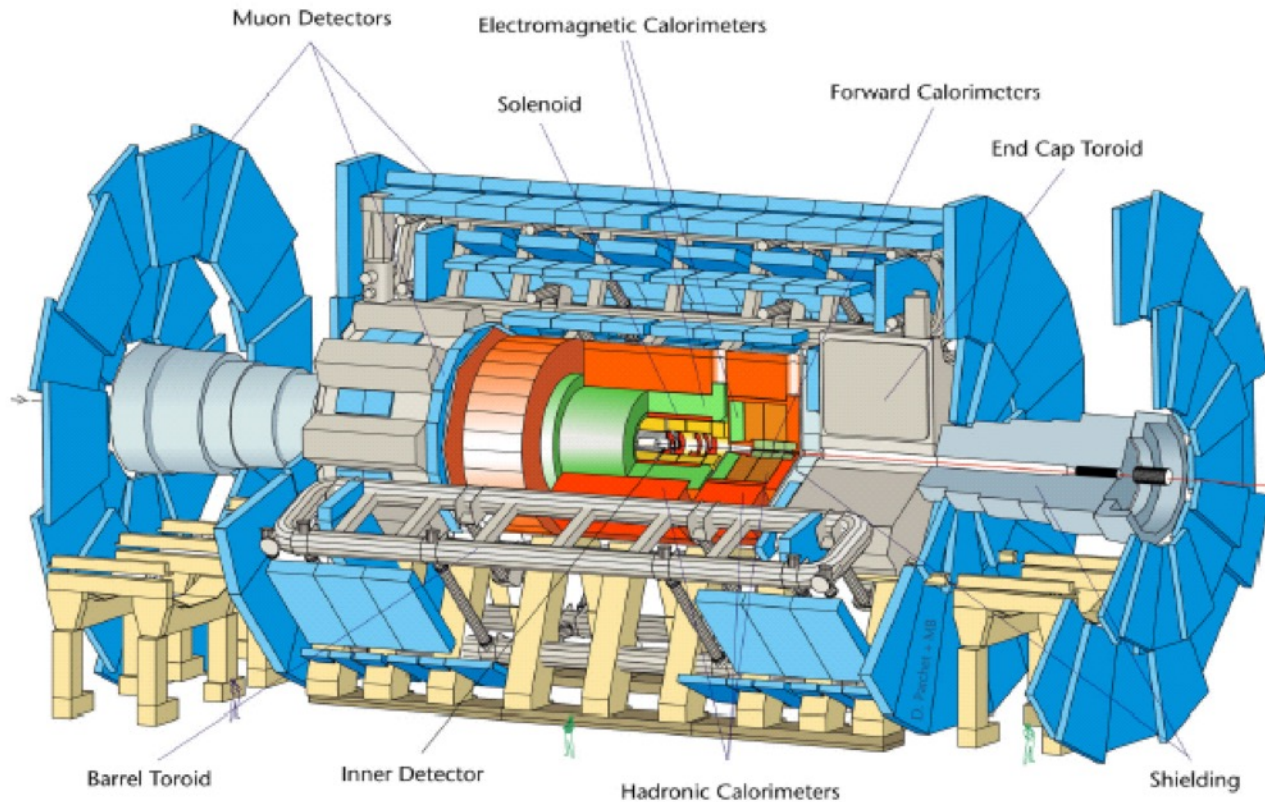
Conclusion

ATLAS has recently done a large number of studies using a variety of jet reconstruction algorithms, pileup suppression techniques, as well as new DNN tools, which have improved the JES and especially the JER.

- UFOs instead of PFOs (helps most for large-R jets)*
- Improved determination of pileup energy density (sideband method)*
- CS+SK, pre jet-reco pileup suppression*
- 3D residual pileup correction (correlations between N_{PV} and μ)*
- Use of a DNN for the Global Sequential Correction (GNNC)*
- Reduced MC uncertainties on η -intercalibration*
- Flavour Uncertainties (did not cover these)*
- in-situ b-quark Jet Energy Scale (did not cover this)*
- Some of these techniques may prove even more useful when the number of interactions per beam crossing increases further later in Run-3 and at the HL-LHC.*

Backup

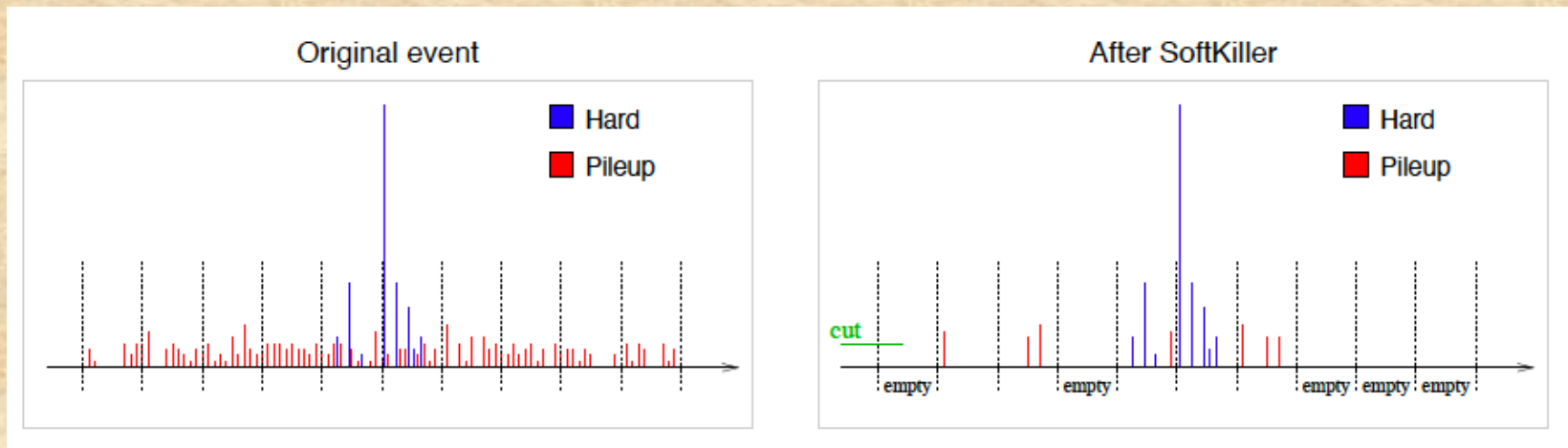
ATLAS Detector



<i>Diameter</i>	25 m
<i>Barrel toroid length</i>	26 m
<i>Endcap end-wall chamber span</i>	46 m
<i>Overall weight</i>	7000 Tons

Pileup Mitigation

- *Pileup can also affect the jet reconstruction itself
=> use a mechanism to reduce pileup *before* jet reco*
- *Soft Killer: Ignore particles below a dynamic p_T threshold
Threshold determined such that ρ is zero*



Cacciari, Salam, Soyez; arXiv:1407.04.08

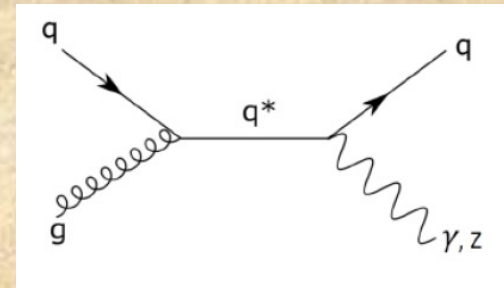
Pileup Mitigation (pre-reco)

- *Pileup can also affect the jet reconstruction itself
=> use a mechanism to reduce pileup *before* jet reco*
- ***Soft Killer (SK):** Ignore particles below a dynamic p_T threshold
Threshold determined such that ρ is zero*
- ***Constituent Subtraction: (CS)** Flood the detector with "ghost" particles that have very low p_T . Match the ghosts to real particles and subtract their p_T . Ghosts approximate pileup.
=> modifies constituents by removing pileup contribution*
- ***Charged-Hadron Subtraction (CHS):** Remove tracks that do not come from the primary hard-scattering vertex*

Global Property Calibration

- *Jet resolution can be improved by examining jet properties.*
- *Correct for shower fluctuations (parton & calo showers)*
- *Correct for differences between quark- and gluon-induced jets*
 - *quark jets have fewer, higher energy constituents*
 - *gluon jets have more, lower energy constituents because there is more QCD radiation*
- *Parameters used in the **Global Sequential Correction (GSC)**:*
 - *f_{charged} : fraction of jet p_T carried by charged tracks*
 - *f_{Tile0} : fraction of energy in the first Tile layer*
 - *f_{LAr3} : fraction of energy in the third EM layer*
 - *N_{track} : # of tracks with $p_T > 500 \text{ GeV}$*
 - *w_{track} : track width*
 - *N_{segments} : # of muon track segments; punch through*

In-situ JES – V+jet



Z/gamma+jet events
Z or gamma well measured

- Use the Missing E_T Projection Fraction (MPF) technique because it is less sensitive to pileup and has smaller uncertainties

$$\vec{p}_T^{ref} + \vec{p}_T^{parton} = 0$$

- The reference is well calibrated ($R=1$), but the hadron response is < 1
Results in missing energy in the direction of the recoil

$$\vec{p}_T^{ref} + R_{MPF} \cdot \vec{p}_T^{recoil} = -\vec{E}_T^{miss}$$

$$R_{MPF} = 1 + \frac{\vec{E}_T^{miss} \cdot \hat{p}_T^{ref}}{\vec{p}_T^{ref}}$$

B-Jet Calibration

- *The top-quark mass is limited by the b-jet JES*
- *b-jets are reconstructed using PFlow objects*
- *Tagged using a multivariate algorithm (DL1r) that relies on impact parameters of tracks and displaced vertices*
- *The Direct Balance method in γ +jet events is used instead of the MPF because we need tagged b-jets*
- *Several working points are studied with different fractions of b and c jets*

B-Jet Calibration

