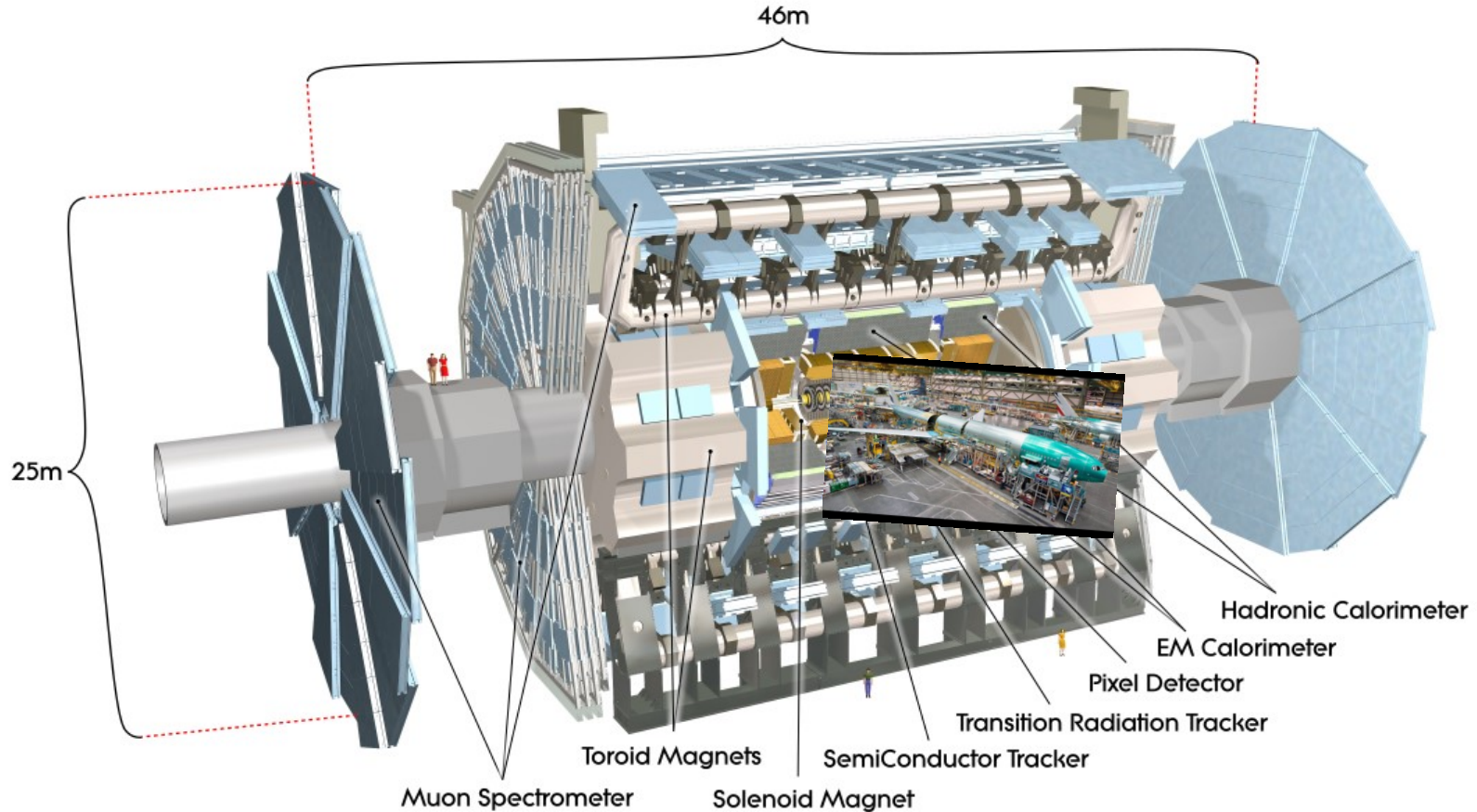


Inputs and Procedures of Jet Reconstruction in ATLAS

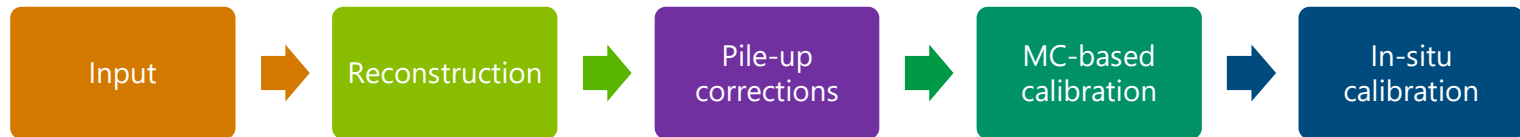


Chaowaroj (Max) Wanotayaroj
on behalf of the ATLAS Collaboration

Intro

- Jets are important for almost all ATLAS analyses
- Most use anti- k_T jets with $R=0.4$ (small- R) or $R=1.0$ (large- R)
 - Some use both
 - Also looking at other sizes in some cases
- How we build and calibrate jets has wide-reaching impact
 - What is(are) the best choice(s)?
- Jet energy scale uncertainty and jet energy resolution dominate many searches and measurements
 - Work to reduce these uncertainties as much as possible

Jet Reco and Calibration Chain



1. Inputs

2. Jet reconstruction

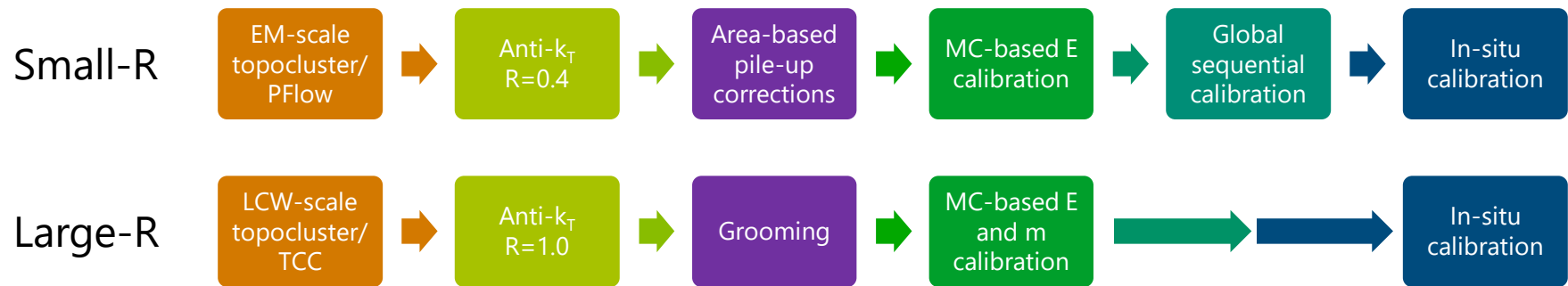
3. Pile-up corrections

4. MC-based calibration

- Match truth to reco jets, then calculate reco/truth “response”
- Correct the jet 4-momentum to truth level

5. In-situ calibration for data

Jet Reco and Calibration Chain



1. Inputs

2. Jet reconstruction

3. Pile-up corrections

4. MC-based calibration

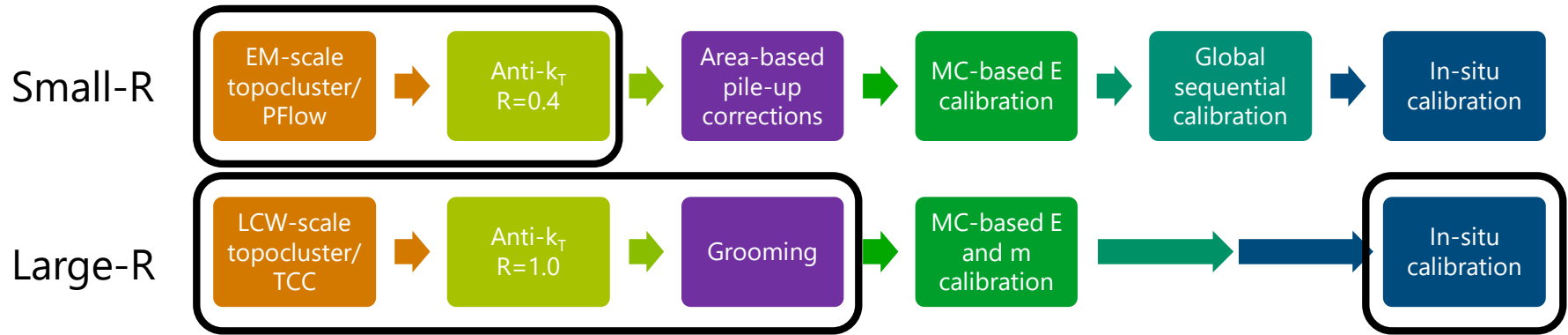
- Match truth to reco jets, then calculate reco/truth “response”
- Correct the jet 4-momentum to particle level

4.1 (small-R) Global sequential calibration

- Reduce flavor dependence and correct various detector effects

5. In-situ calibration for data

Introduction Outline



1. Small-R, update on jet energy scale/resolution (JES/JER)
2. Large-R, in-situ calibration with 80 fb^{-1}
3. Large-R, alternative inputs and grooming strategies

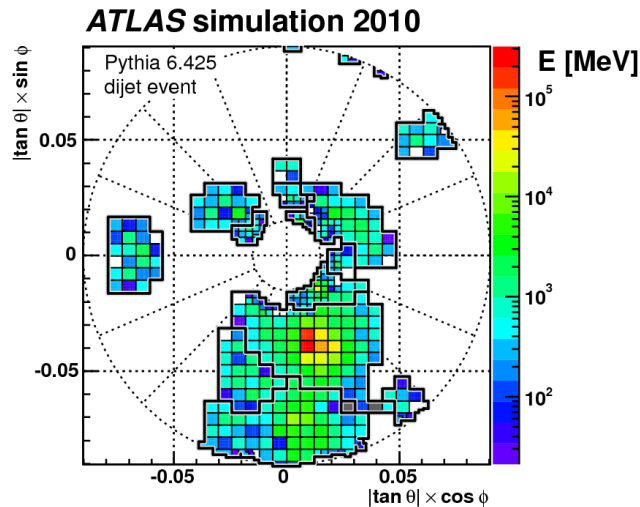
Small-R JES/JER

Taking advantage of particle flow jets

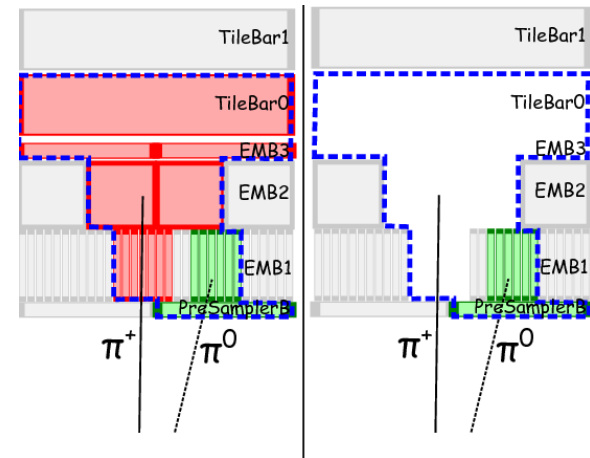
Jet Inputs

[PERF-2014-07](#), [PERF-2015-09](#)

- Topocluster: calorimeters only
 - 4σ -above-noise seed cells, iteratively add all 2σ neighbors and cells surrounding them
 - These are called EM-scale topoclusters
 - Topocluster are corrected to point at the primary vertex (origin correction)

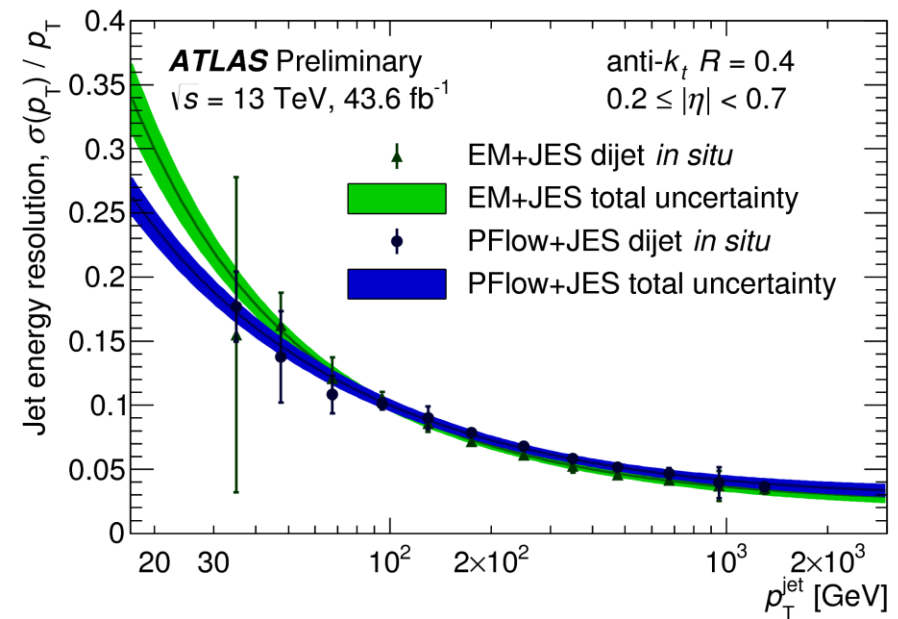
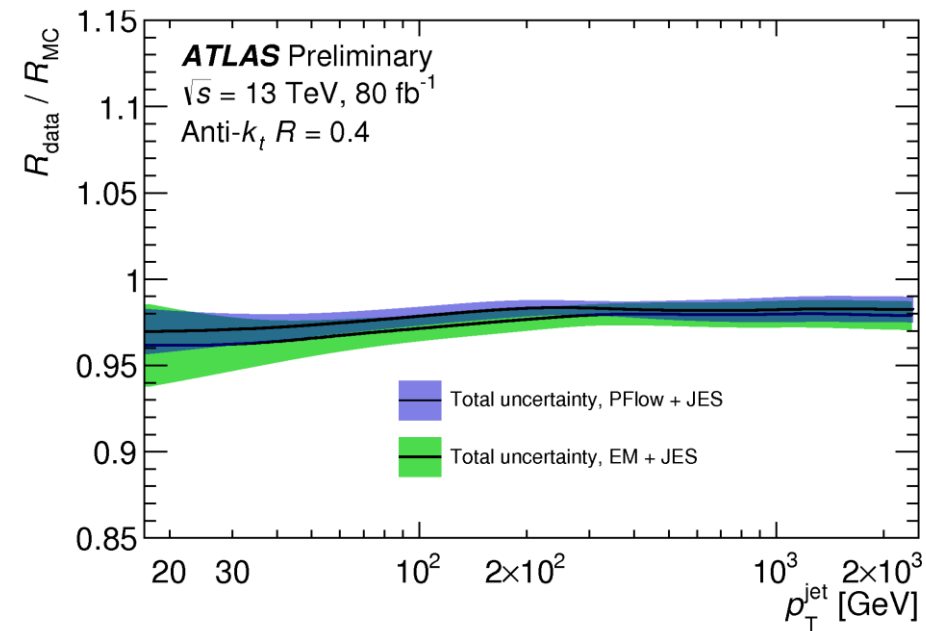


- Particle flow (PFlow): Subtract matched tracks' momentum from topoclusters
 - Remaining clusters and tracks form PFlow objects
 - Only PFlow objects matched to primary vertex tracks are used for jet building
 - Great performance for low p_T



PFlow/EM-scale Jets Resolution

JETM-2018-005



- ATLAS jet usage is moving toward PFlow
- It is now the primary option in ATLAS
 - Better response
 - Better resolution at low p_T , and comparable to EM-scale at high p_T
- EM-scale topocluster jets still used by some analyses

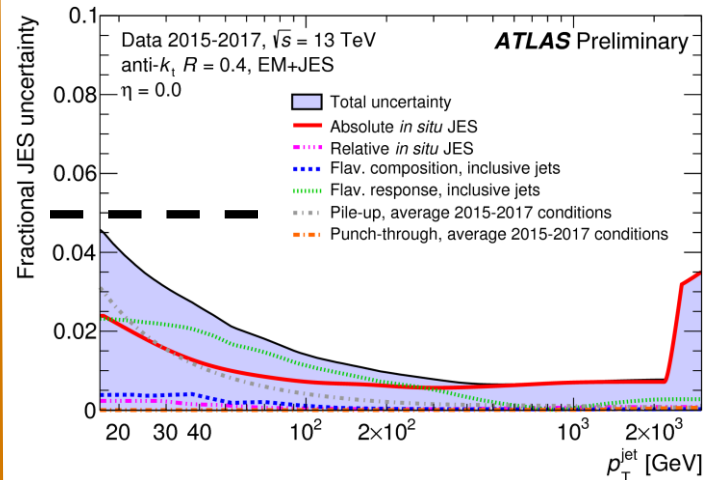
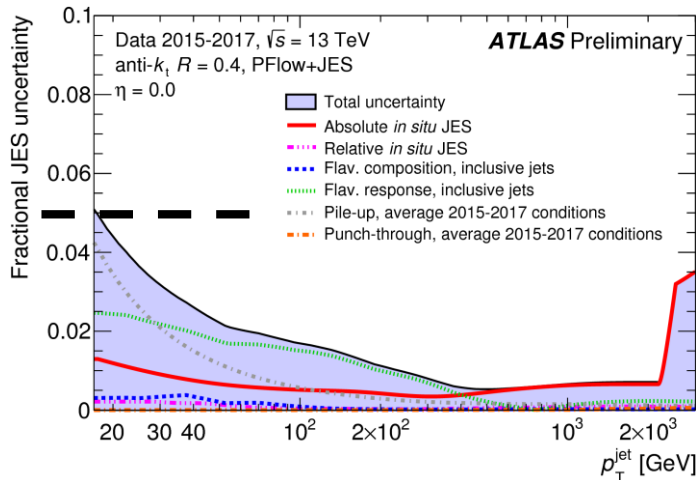
JES/JER Uncertainty

JETM-2018-005, JETM-2018-006

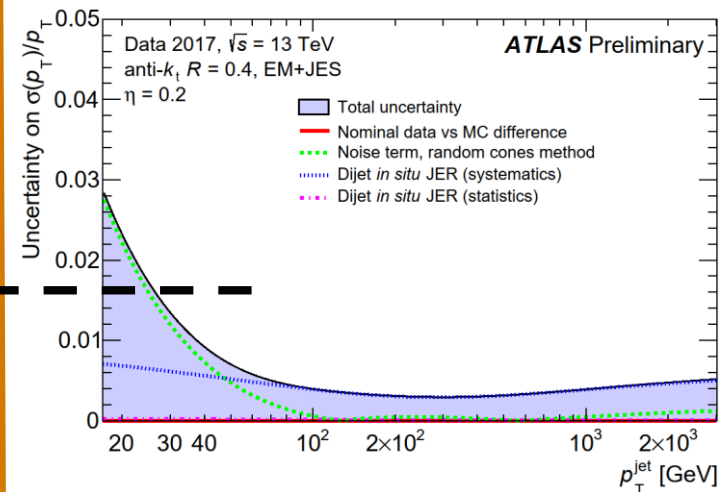
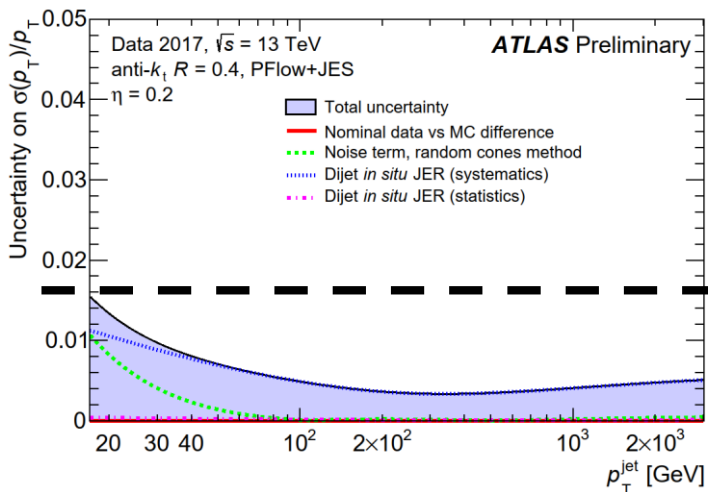
Particle flow

EM-scale Topocluster

JES uncertainty



JER uncertainty



- PFlow jets have comparable JES uncertainty, and much better JER uncertainty at low p_T compared to topocluster jets

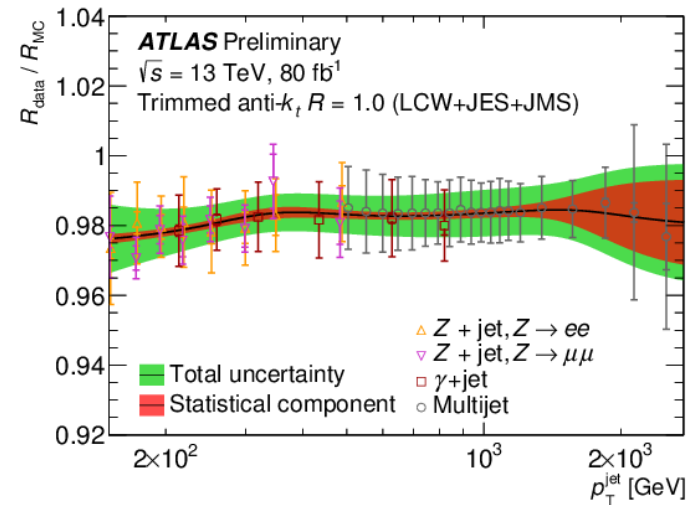
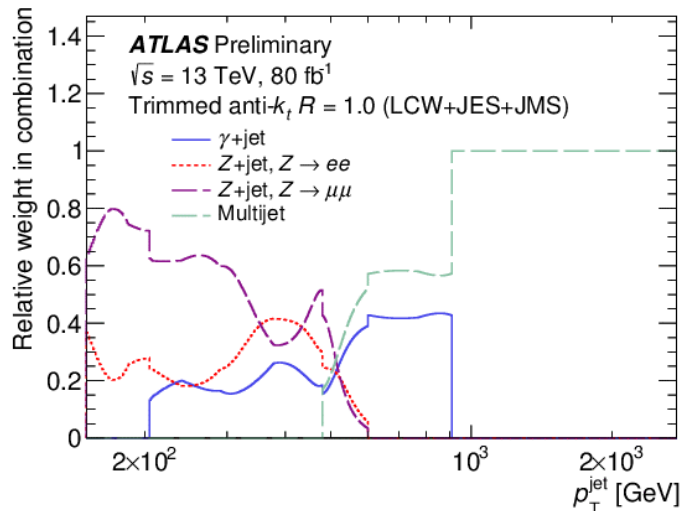
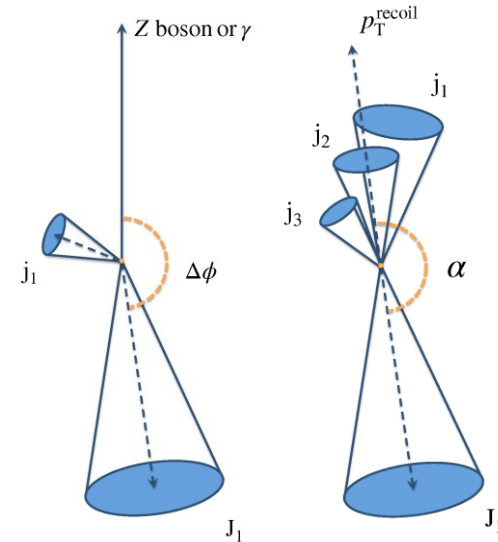
Large-R, In-situ Calibration

Updated with 80 fb^{-1}

In-situ Calibration—JES

JETM-2019-05, *Eur. Phys. J. C* 79 (2019) 135

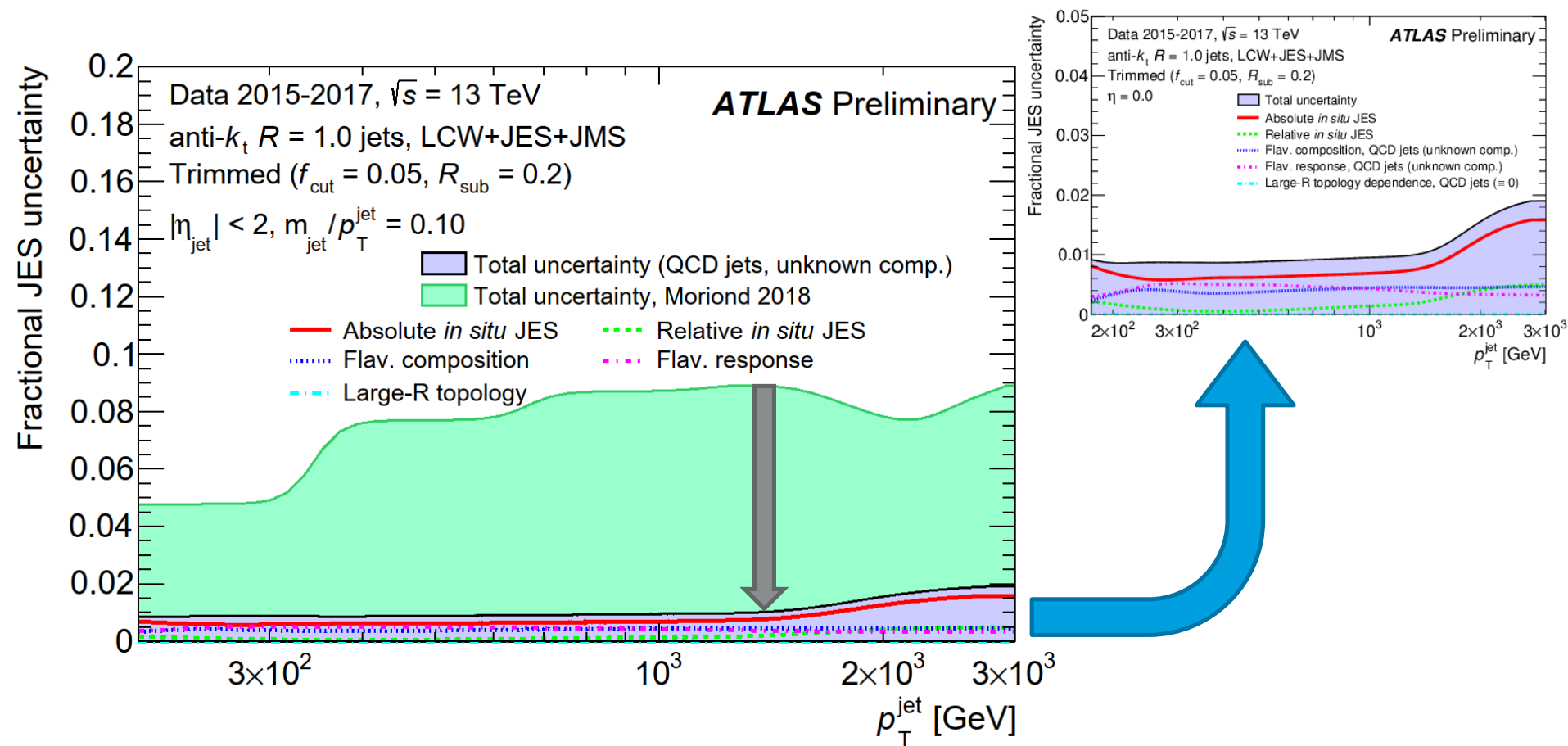
- Derived from a jet recoiling against a well-measured object:
 - Z boson or γ as reference objects
 - Several lower- p_T small-R jets for high- p_T jets
- Combining three techniques to cover the full p_T range
 - Z+jet method runs out of statistics ~ 450 GeV
 - γ +jet is used until ~ 1 TeV
 - Use multijet method above that threshold
- Combine methods in overlapping regions
 - Overall uncertainty can be reduced as overlapping regions agree and each method's uncertainties are mostly independent



JES Uncertainty

JETM-2019-05, Eur. Phys. J. C 79 (2019) 135

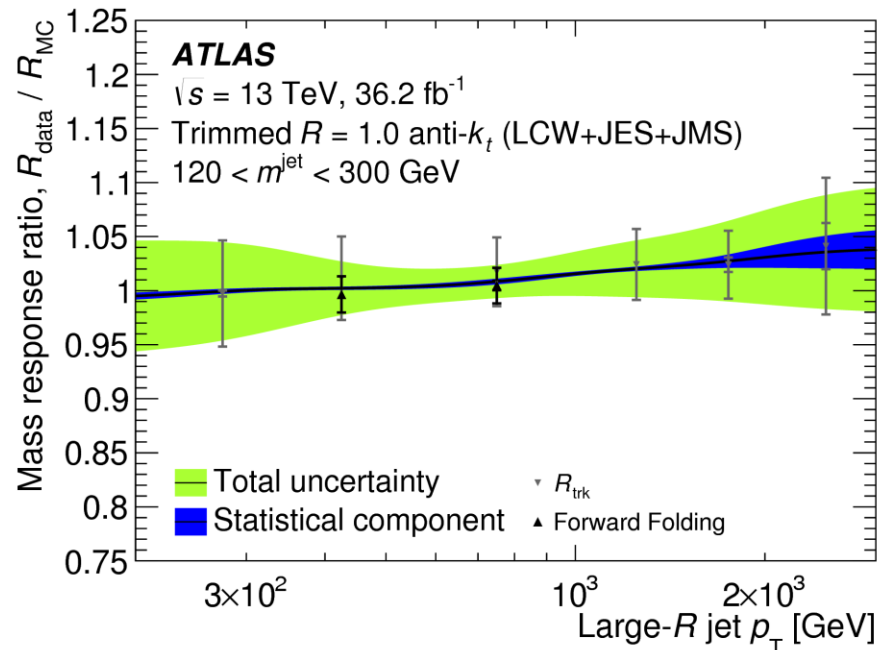
- Large reduction compared to without in-situ calibration
 - Total uncertainty depends on the assumption of the topology (W, Z, or top) and flavor (quark or gluon initiated) composition of the jets



In-situ Calibration—JMS/JMR

[Eur. Phys. J. C 79 \(2019\) 135](#)

- For large-R jets, we also need in-situ calibration for the mass
- Two methods for in-situ mass calibration:
 1. Forward-folding: Use high purity top sample, shift and stretch jet mass resolution function so that the simulation matches the data
 2. $R_{track}^m = \frac{m_{track}}{m_{calo}}$: Tracker provides an independent (charged only) measurement of a jet, so any deviation of the double ratio, $\frac{R_{MC}}{R_{Data}}$, from 1 provides an estimate of the scale uncertainty
- Forward-folding has smaller uncertainty, but R_{track} covers a much broader p_T and mass range



Large-R, Alternative Inputs and Jet Grooming

Inputs, constituent-level pile-up
 suppressions, and grooming scan

Large-R Jet Inputs

- Topocluster: calorimeters only
 - 4σ -above-noise seed cells, add all 2σ neighbors and cells surrounding them
 - Calibrate to account for EM and HAD differences, dead material and out-of-cluster deposits to get Local Cell Weighting (LCW) topoclusters
 - Topocluster are corrected to point at the primary vertex (origin correction)
- Particle flow (PFlow): Subtract matched tracks' momentum from topoclusters
 - Remaining clusters and hard-scatter tracks form PFlow objects
 - Remove PFlow object matched to non-primary vertex tracks
 - Great performance for low p_T
- Track-CaloCluster (TCC): Use energy from topoclusters and angle from tracks
 - For multiple-to-multiple matching, energy is shared among tracks to create multiple TCC objects
 - Remove TCC objects with non-primary vertex tracks
 - Great performance for high p_T

Pile-up Correction

- From inputs:
 - Topocluster: noise suppression
 - PFlow/TCC: charged objects not associated with primary vertex are rejected

- Constituents-level (topocluster) correction:

- Voronoi Subtraction (VS): correct constituent's energy by $\rho \cdot A_{\text{Voronoi}}$
 - ρ : transverse momentum density
- Constituent Subtraction (CS): Add ghosts with $p_T^g = \rho \cdot A_g$ then:

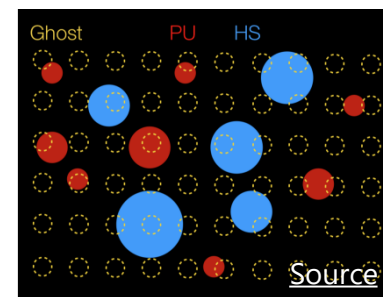
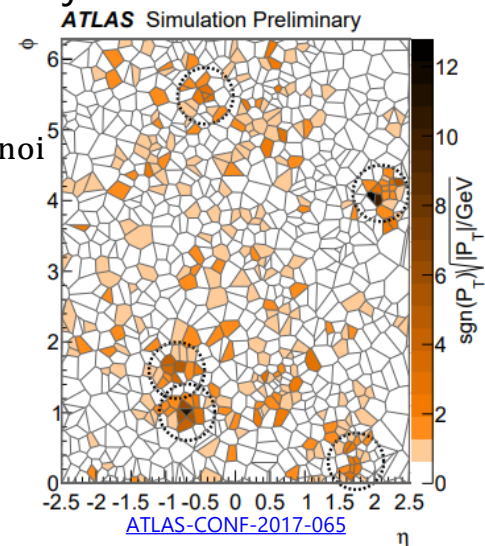
$$\begin{aligned} \text{If } p_{T,i} \geq p_{T,k}^g: \quad & p_{T,i} \longrightarrow p_{T,i} - p_{T,k}^g, \\ & p_{T,k}^g \longrightarrow 0 \text{ GeV}; \\ \text{otherwise:} \quad & p_{T,k}^g \longrightarrow p_{T,k}^g - p_{T,i}, \\ & p_{T,i} \longrightarrow 0 \text{ GeV}, \end{aligned}$$

- SoftKiller (SK): p_T cut so half of $\eta - \phi$ grid spaces are empty
- PUPPI: p_T cut based on information from nearby constituents

- Jet-level: Grooming

Grooming Algorithm	Name	Parameters Tested
Soft Drop	SD	$(z_{\text{cut}}, \beta) \in [0.1] \times [0, 0.5, 1]$
Bottom-up Soft Drop	BUSD	$(z_{\text{cut}}, \beta) \in [0.05, 0.1] \times [0, 0.5, 1]$
Recursive Soft Drop	RSD	$(z_{\text{cut}}, \beta, N) \in [0.05, 0.1] \times [0, 0.5, 1] \times [2, 3, 5, \infty]$
Pruning	Pruned	$(z_{\text{cut}}, R_{\text{cut}}) \in [0.15] \times [0.25]$
Trimming	Trimmed	$(f_{\text{cut}}, R_{\text{sub}}) \in [5, 9]\% \times [0.1, 0.2]$

New!



Based on previous study
([ATL-PHYS-PUB-2017-020](#))

Large-R Jet Performance Study

[ATL-PHYS-PUB-2019-027](#)

- Three inputs (Topocluster, PFlow, TCC)
- Many pile-up suppression techniques
 - Some of them can also be combined
 - Based on previous study ([ATL-PHYS-PUB-2017-020](#)), we choose:
 - Constituent Subtraction + SoftKiller (CS+SK)
 - Voronoi Subtraction + SoftKiller (VS+SK)
 - PUPPI for PFlow only

Two methods:

1. Compare the impact of different pile-up mitigation techniques on individual clusters with and without pile-up included in simulation (“DigiTruth”)
2. Scan over choices of input, constituent-level pile-up suppression, and grooming, and compare them with ATLAS’ standard trimmed jet
 - Compare the performance. Specifically:
 - Pile-up stability
 - Topology dependence
 - Tagging performance

Alternative Inputs and Jet Grooming

DigiTruth Study

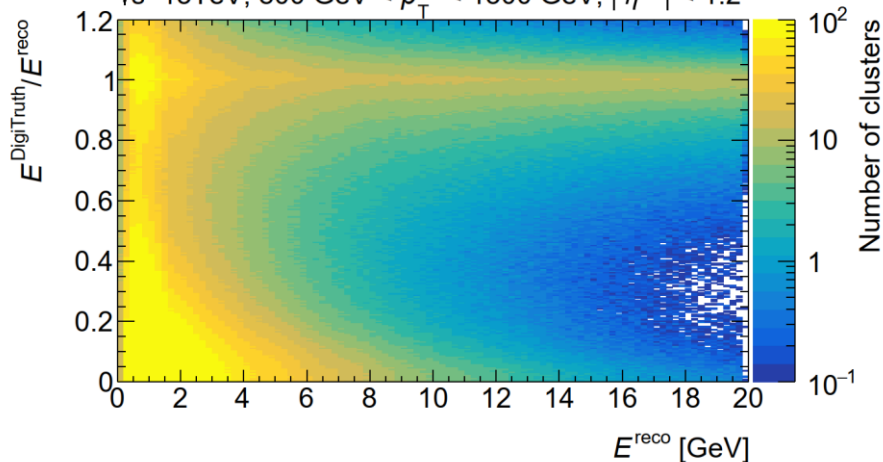
ATL-PHYS-PUB-2019-027

ATLAS Simulation Preliminary

Anti- k_t , $R=1.0$ jets, no JES or JMS calibration

EM Topo ungroomed

$\sqrt{s}=13\text{TeV}$, $800 \text{ GeV} < p_T^{\text{jet}} < 1300 \text{ GeV}$, $|\eta^{\text{jet}}| < 1.2$



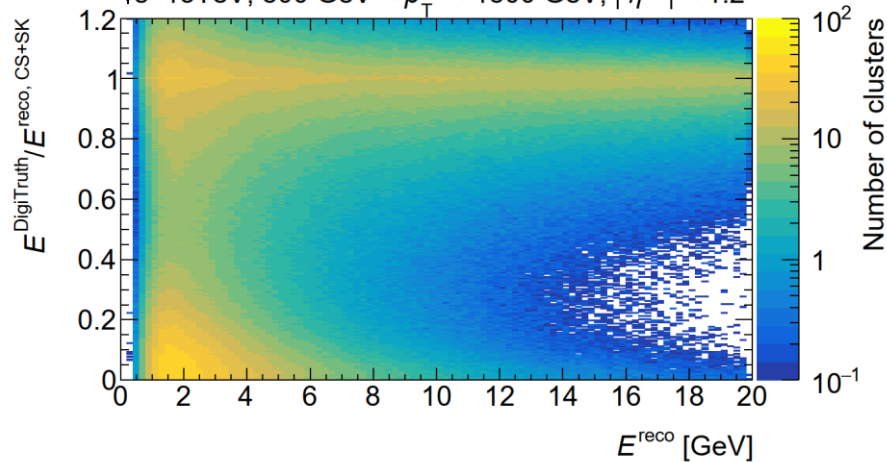
Ungroomed

ATLAS Simulation Preliminary

Anti- k_t , $R=1.0$ jets, no JES or JMS calibration

CS+SK EM Topo ungroomed

$\sqrt{s}=13\text{TeV}$, $800 \text{ GeV} < p_T^{\text{jet}} < 1300 \text{ GeV}$, $|\eta^{\text{jet}}| < 1.2$

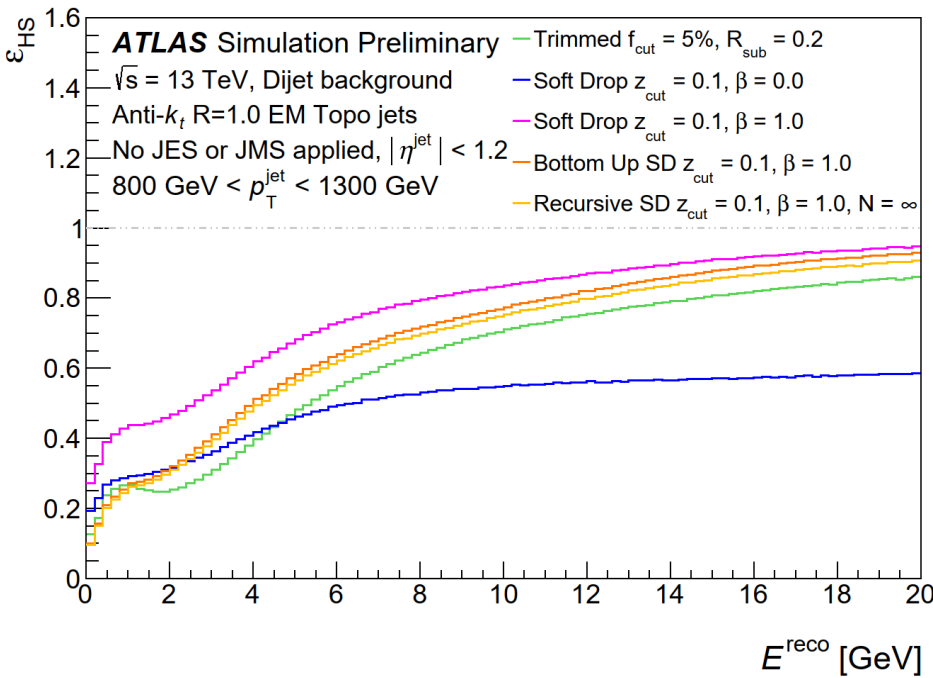


Ungroomed with CS+SK

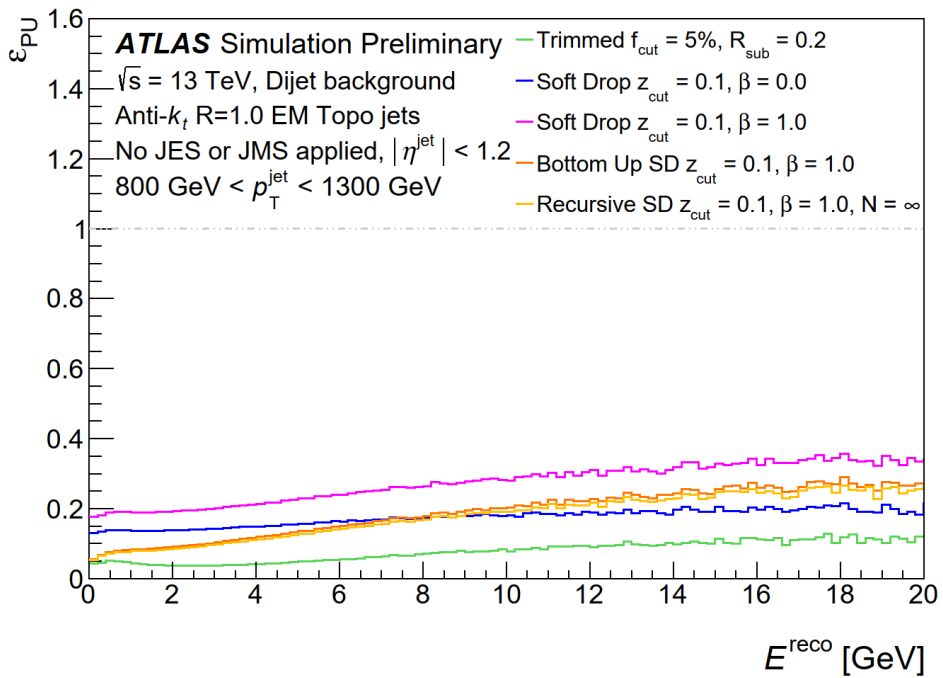
- Showing $E^{\text{DigiTruth}}$ (no pile-up) over E^{reco} (with pile-up)
 - $E^{\text{DigiTruth}}$ does include underlying event \rightarrow 1 is not necessary the ideal value
- Majority of clusters tend to be dominated by hard-scatter (HS) or pile-up (PU)
 - So we will call $\frac{E^{\text{DigiTruth}}}{E^{\text{reco}}} > 0.5$ a HS cluster and < 0.5 a PU cluster
- CS+SK is removing pile-up; HS clusters are more pronounced

DigiTruth Study

ATL-PHYS-PUB-2019-027



Hard-scatter cluster efficiency (1 is better)

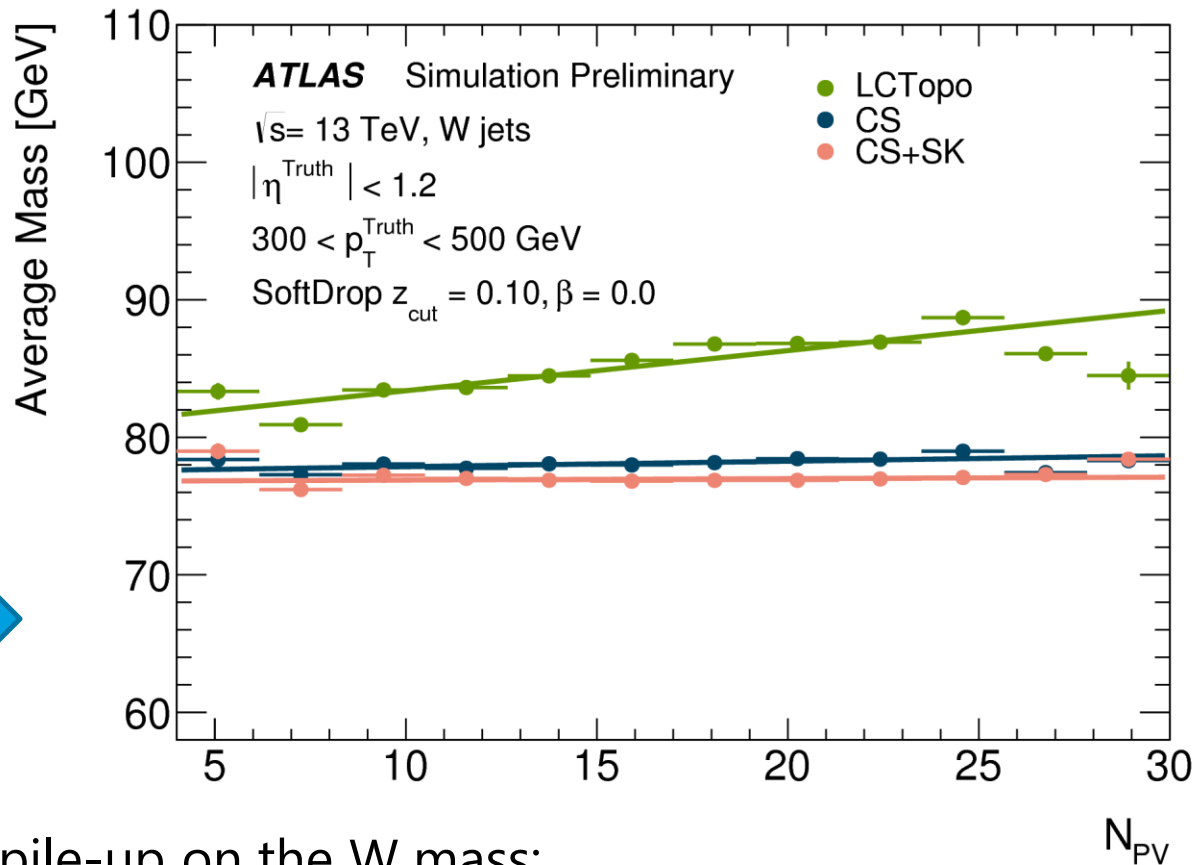
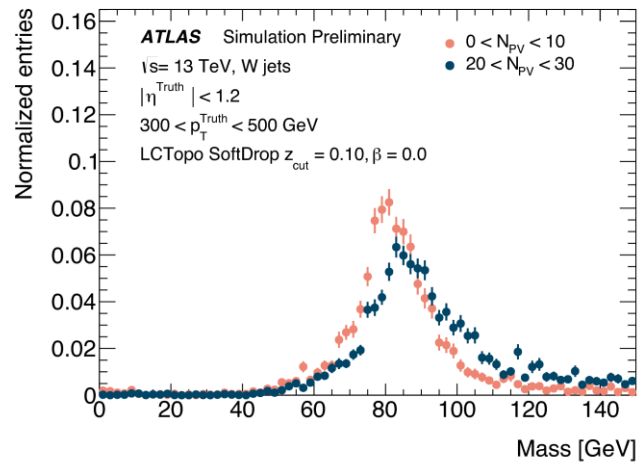


Pile-up cluster efficiency (0 is better)

- All algorithms remove more pile-up than hard-scatter clusters
- Standard ATLAS **trimming** is doing well

Pile-up Stability—Mass

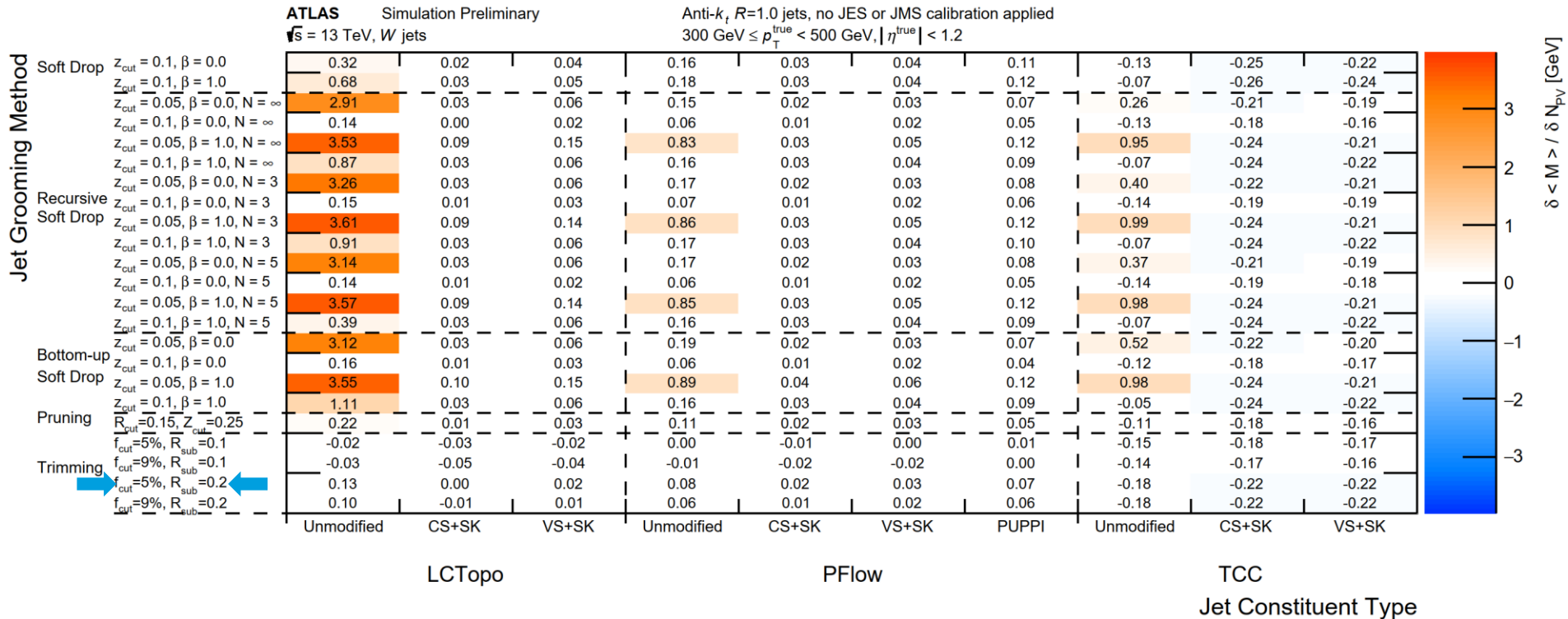
ATL-PHYS-PUB-2017-020



- Quantifying the effect of pile-up on the W mass:
 - Take the mass distribution of W-jet sample in a N_{PV} bin
 - Fit a Gaussian on the W mass peak
 - Plot either the central value or the width as a function of N_{PV}
 - Fit a line and measure the slope

W Mass Peak Values Slope

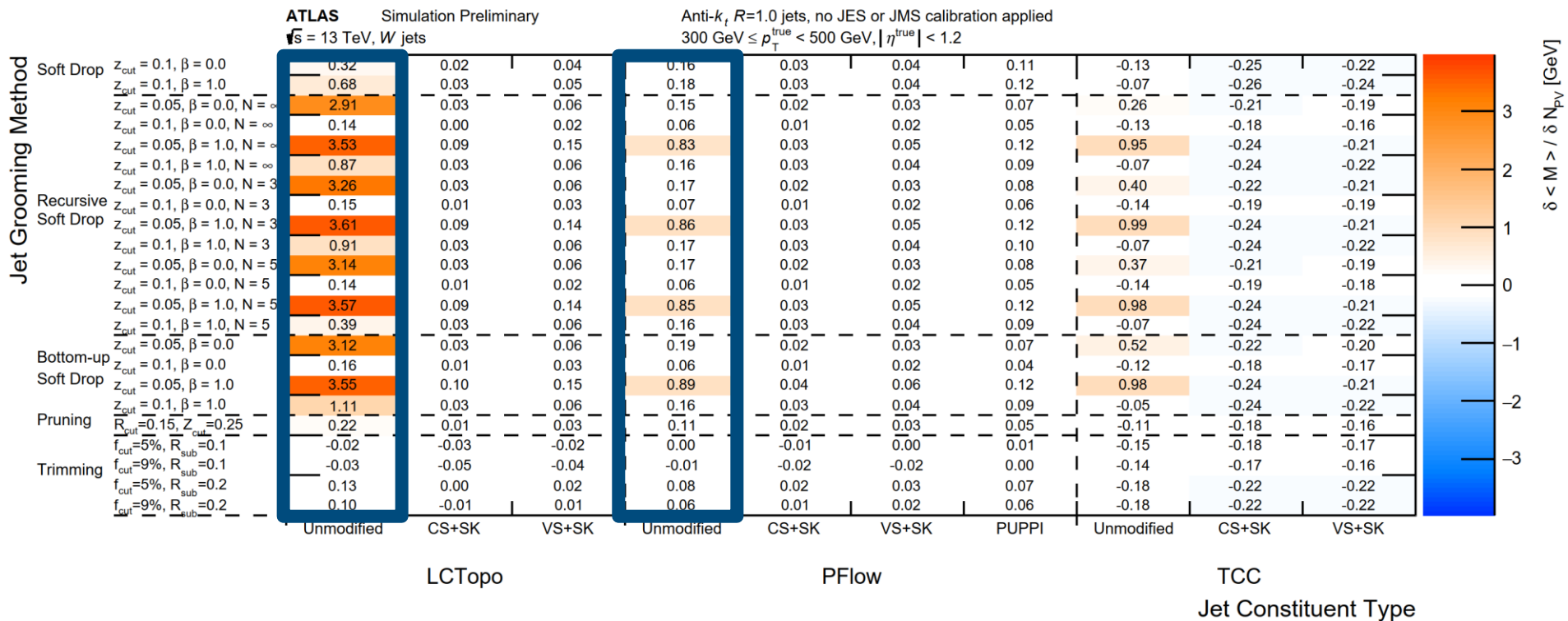
ATL-PHYS-PUB-2019-027



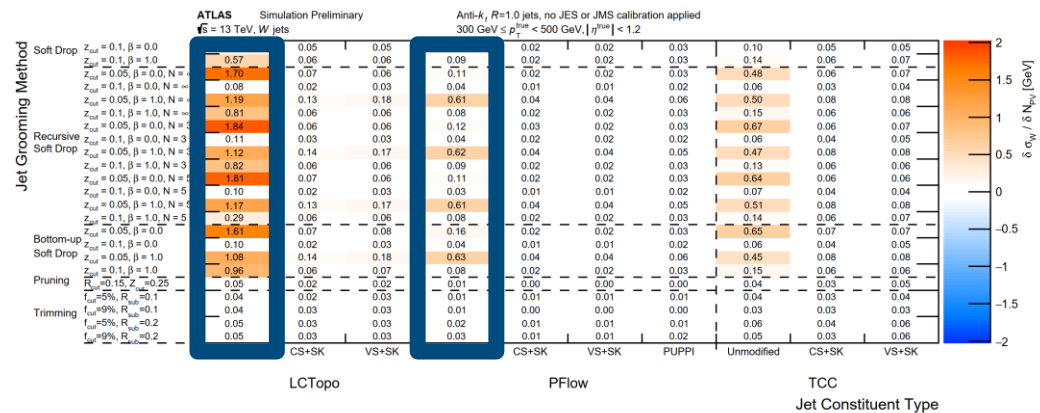
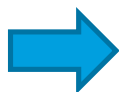
- Row: grooming algorithm (e.g. [standard ATLAS trimming](#))
- Column: jet constituent type
- Number: Slope (also color coded)
- Prefer zero (pile-up stable)

W Mass Peak Values Slope

ATL-PHYS-PUB-2019-027

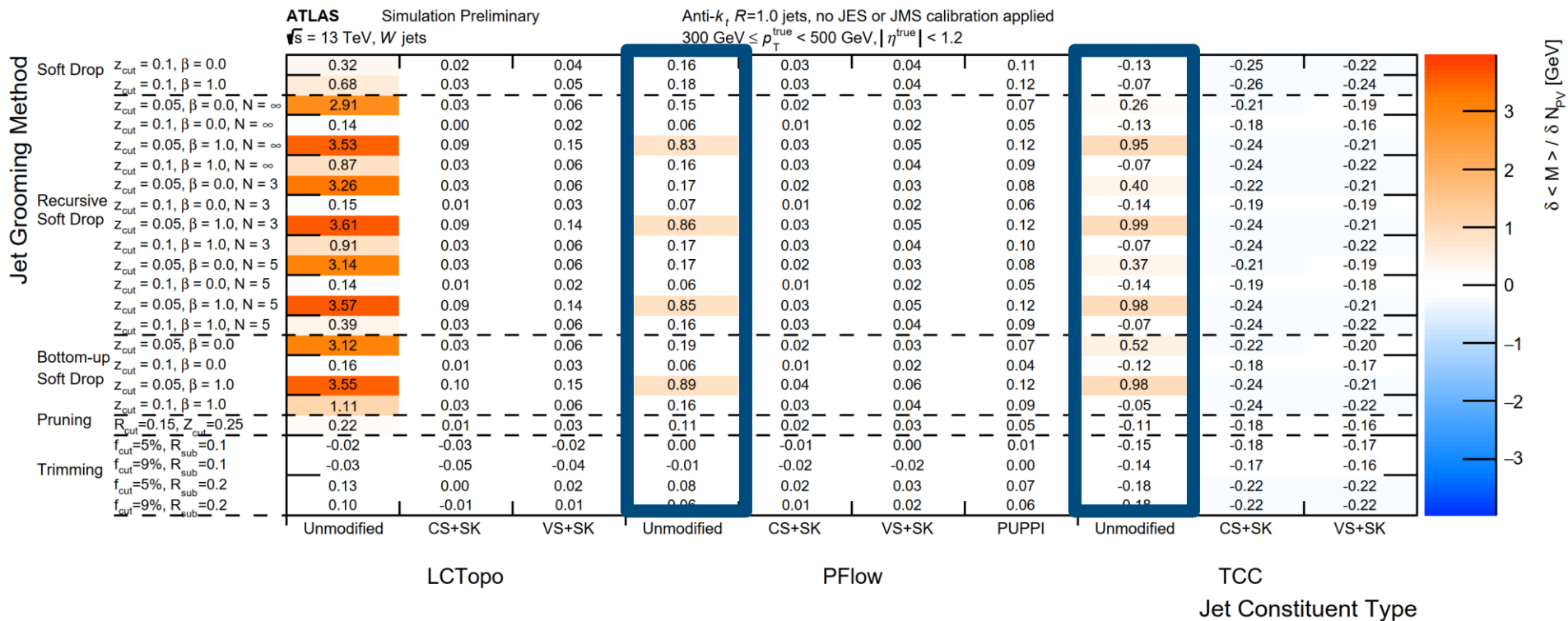


- PFlow is more stable than topocluster, even unmodified
- Also reduce the width



W Mass Peak Values Slope

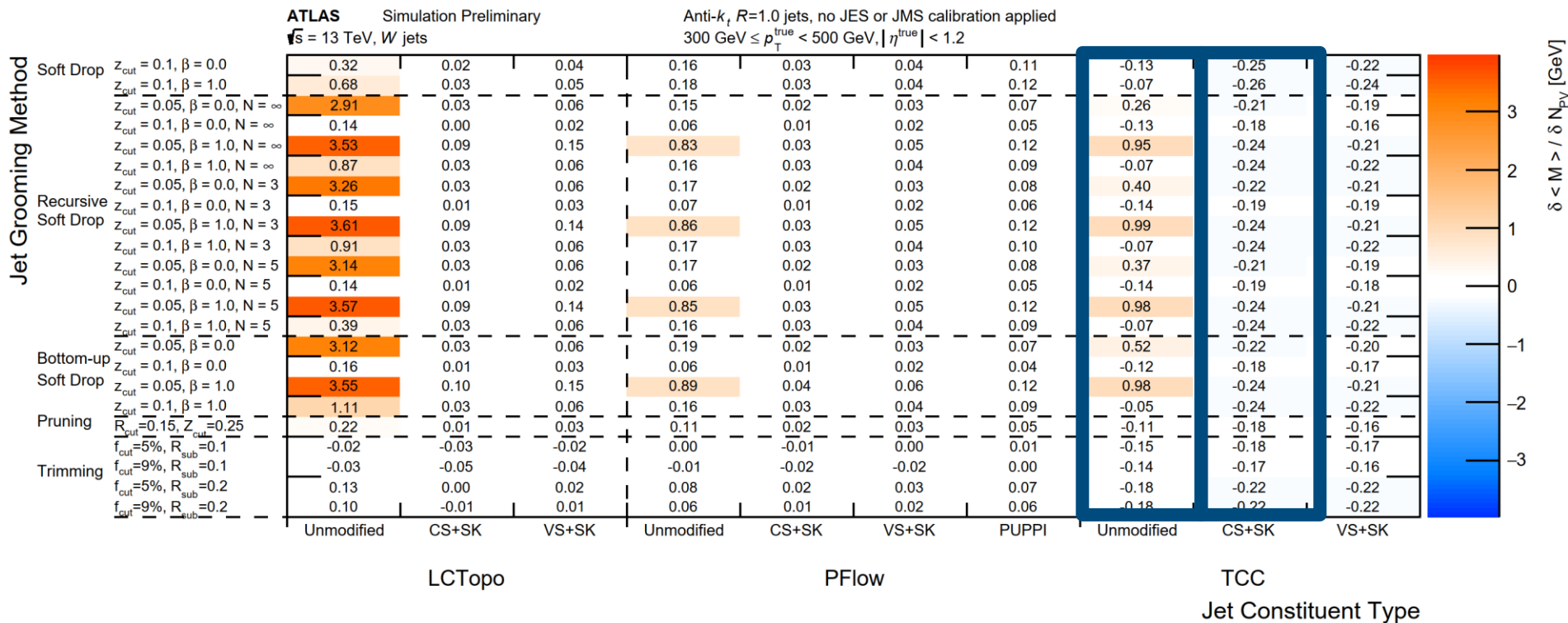
ATL-PHYS-PUB-2019-027



- Peak values increase with pile-up in PFlow
- The opposite is true for TCC
 - TCC over-subtract the pile-up
 - TCC use all tracks for cluster splitting, so more clusters are removed by matching with pile-up tracks

W Mass Peak Values Slope

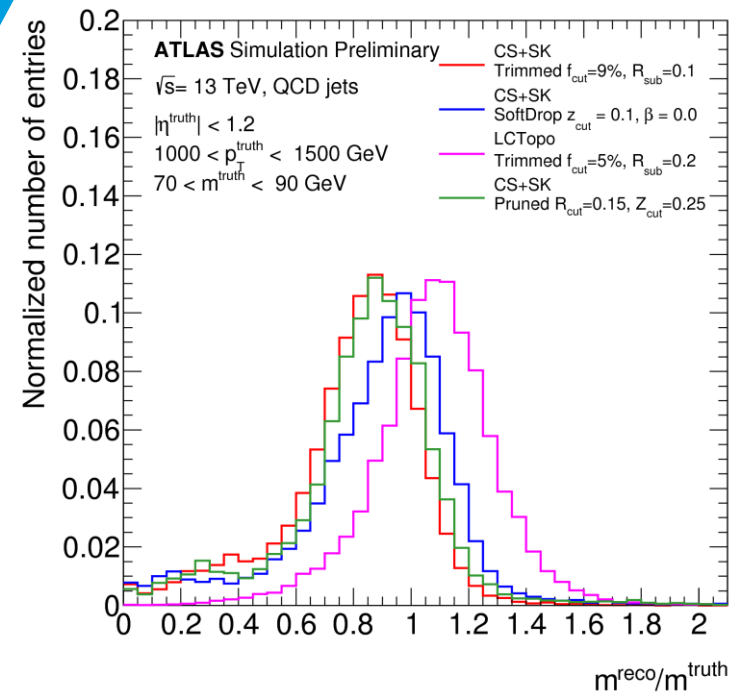
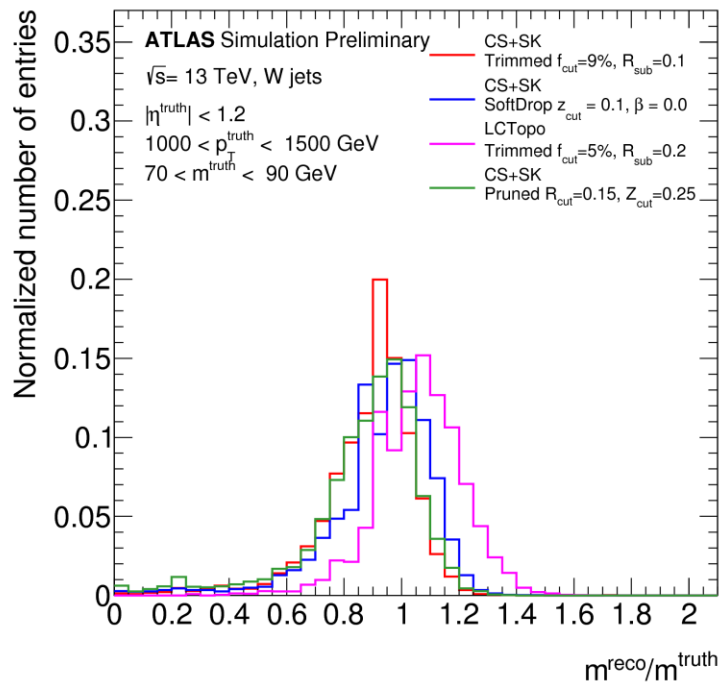
ATL-PHYS-PUB-2019-027



- Since TCC is already over-subtracting, adding constituent pile-up suppressions make it worse

Topology Dependence

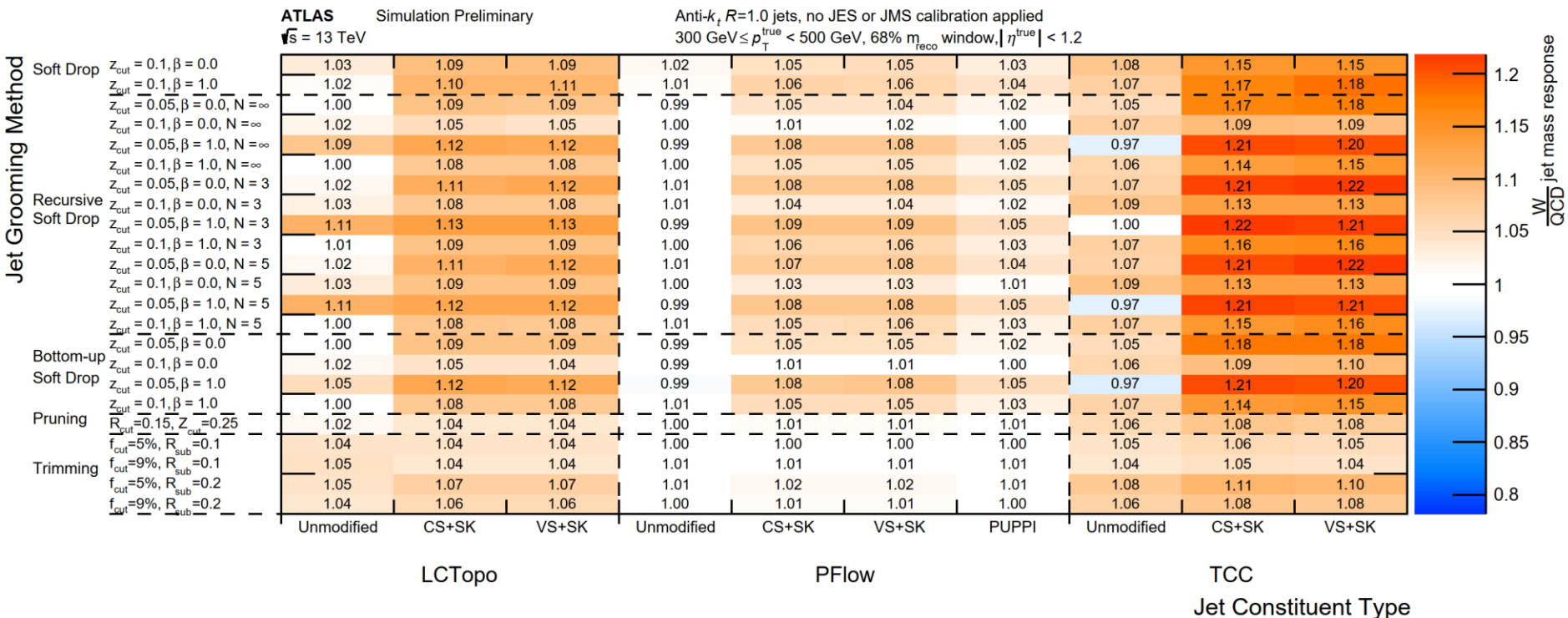
ATL-PHYS-PUB-2017-020



- Quantifying the mass scale calibration's dependence on jet topology
- Take the ratio of the average mass response ($\frac{m^{\text{reco}}}{m^{\text{truth}}}$) of W-jets over QCD jets

Topology Dependence

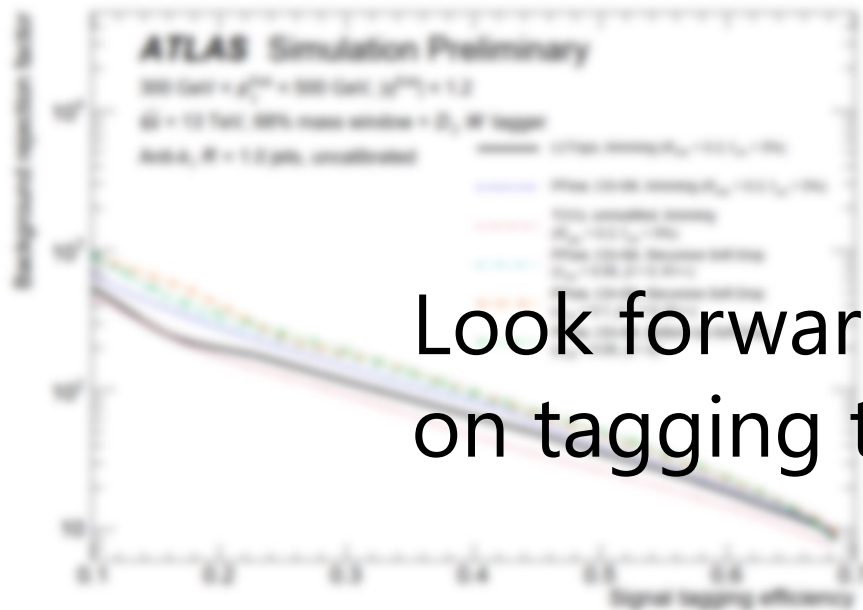
ATL-PHYS-PUB-2019-027



- Prefer one (no topology dependence)
- Constituent pile-up suppression make it worse, but there are good options available, especially for PFlow

Tagging Performance

- Perform a simple two-variable tagger:
 - 68% signal mass window cut
 - One-side cut on D_2 (W) or τ_{32} (top)
- Compare background rejection (1/background efficiency) vs. signal efficiency



Look forward to Steven's talk on tagging this afternoon!

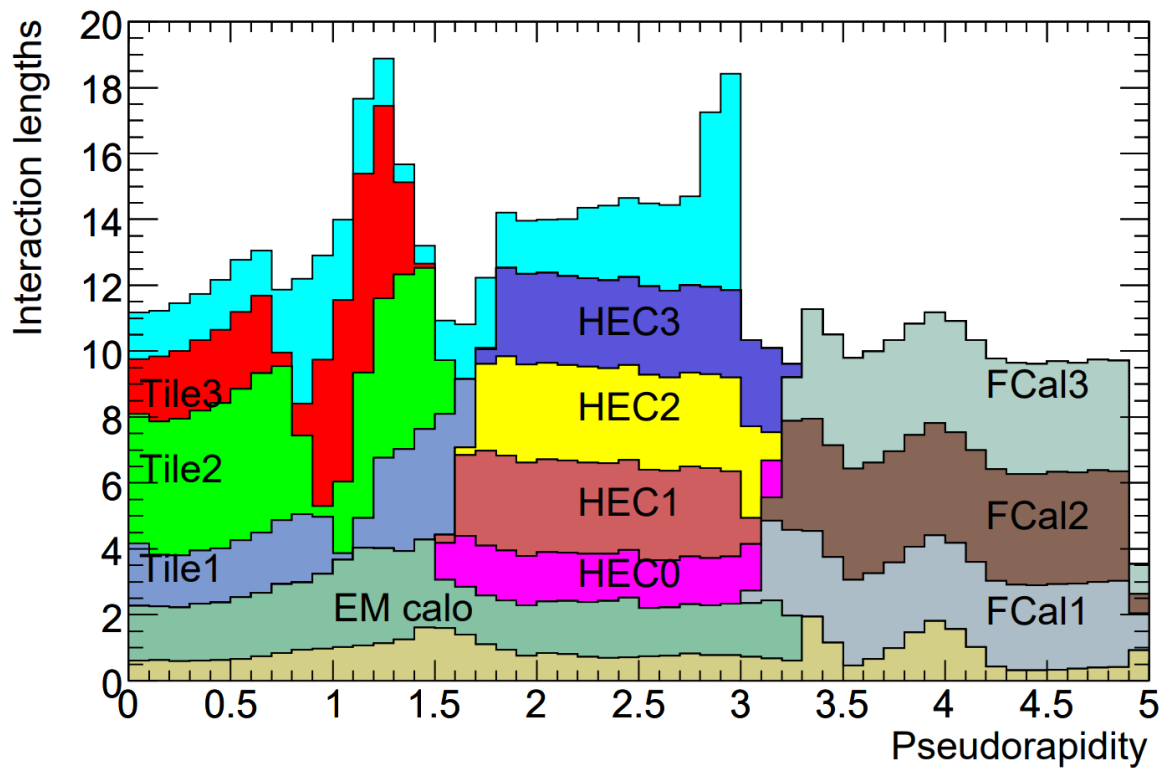


Summary

- ATLAS is moving towards particle flow for small-R jets
 - Better pile-up suppression, better resolution
- In-situ JES calibration for large-R jets is done with 80 fb^{-1} of data
 - Reduce the JES uncertainty significantly (from 8% to 1% !)
- Study the impact on the large-R jet performance with various choices of inputs, constituent pile-up suppression, and grooming algorithms
 - PFlow jets outperform LCW topocluster jets across the board
 - TCC can be better than PFlow for high- p_T jets, but poor performance at low- p_T
 - Both PFlow and topocluster benefit from pile-up suppression at constituent level
 - Among the choices in this study, CS+SK did best
 - Standard ATLAS trimming does well, but some SoftDrop configurations show possible improvement

Backup

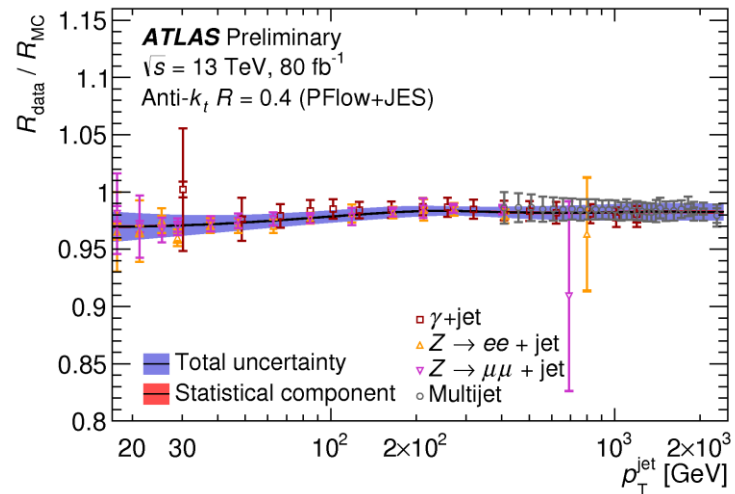
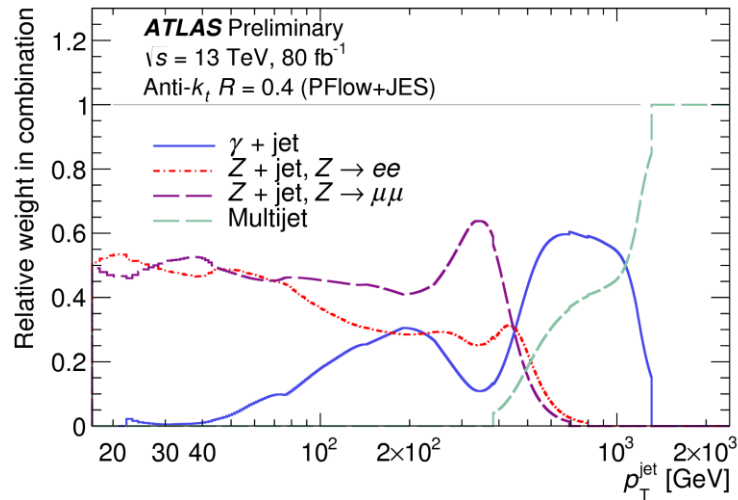
Introduction ATLAS Detector



- Inner tracker
 - Inside solenoid magnet
- EM+Hadronic calorimeters
- Muon spectrometer
 - With toroid magnet

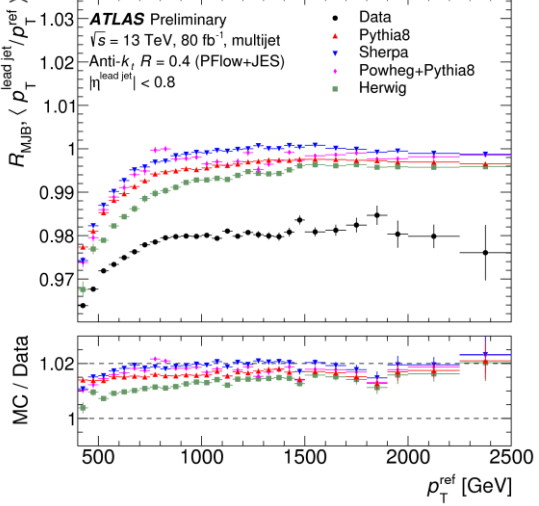
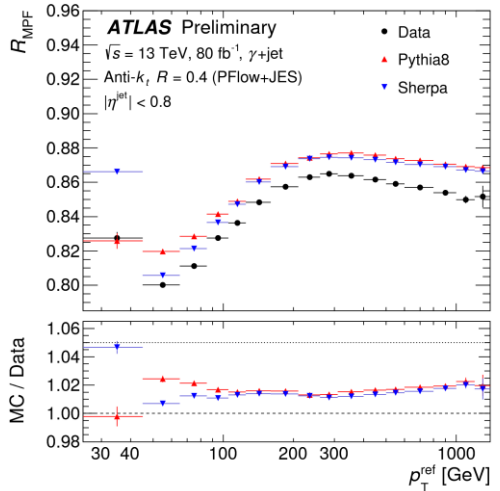
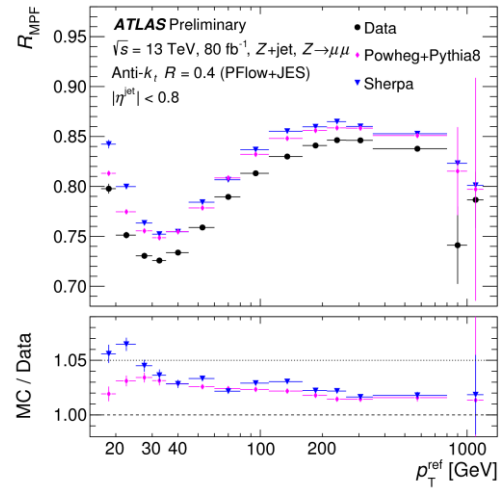
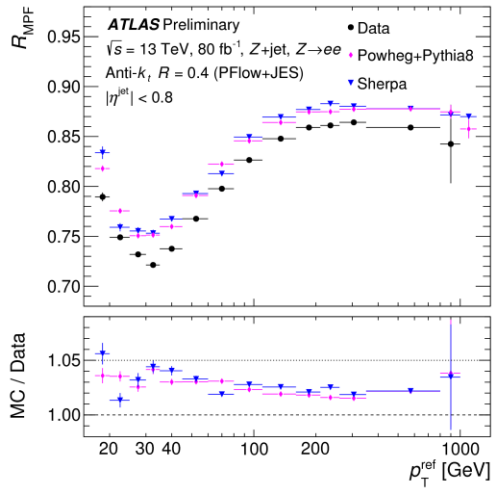
In-situ Calibration — Small-R

JETM-2018-006



In-situ Calibration

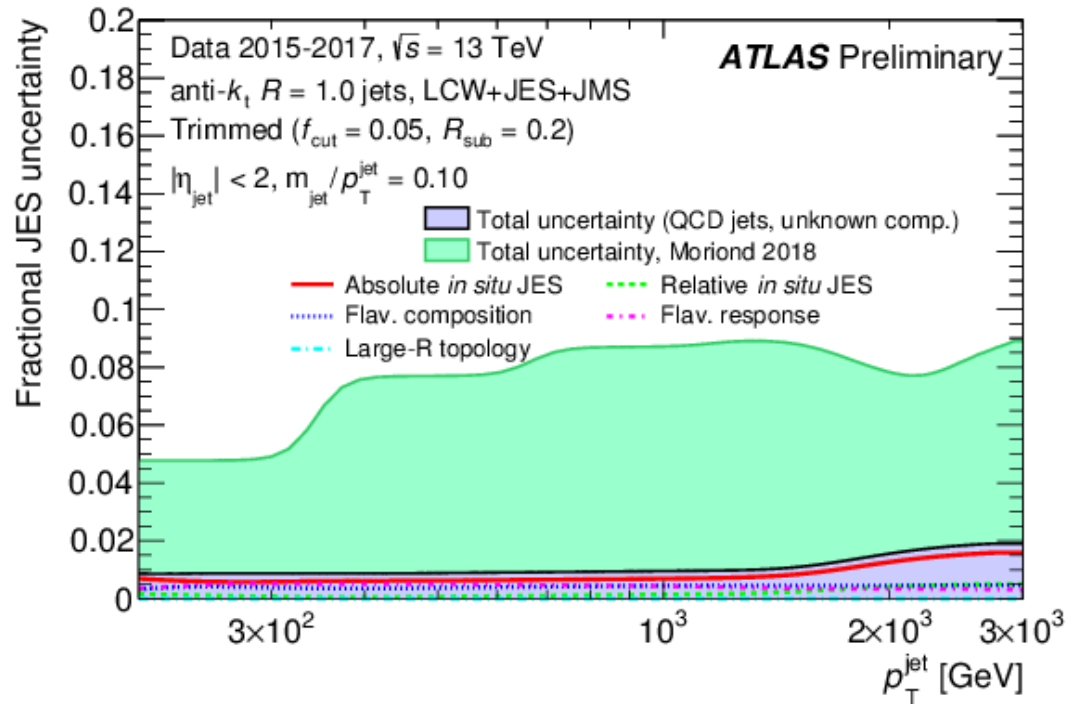
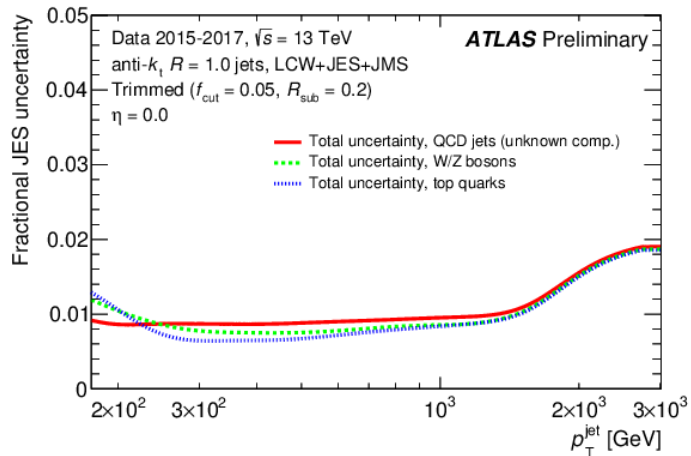
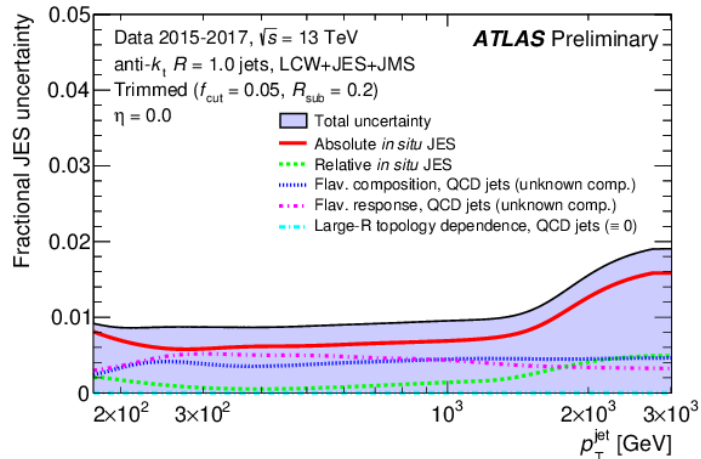
<https://atlas.web.cern.ch/Atlas/GROUPS/PHYSICS/PLOTS/JETM-2019-02/>



- PFlow jet p_T response derived from $Z \rightarrow ee$, $Z \rightarrow \mu\mu$, γ , and multijet using MPF technique

JES Uncertainty

JETM-2019-05, Eur. Phys. J. C 79 (2019) 135

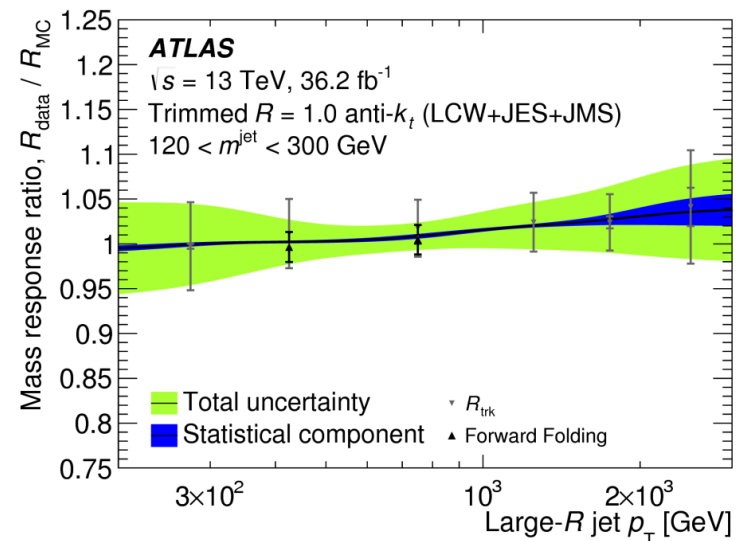
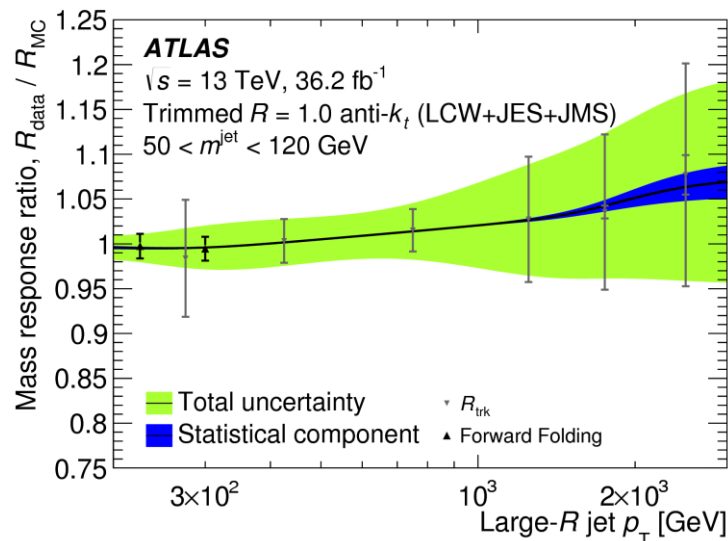


- Total uncertainty depends on the assumption of the topology (W, Z, or top) and flavor (quark or gluon initiated) composition of the jets
- Large reduction compared to without in-situ calibration

In-situ Calibration—JMS/JMR

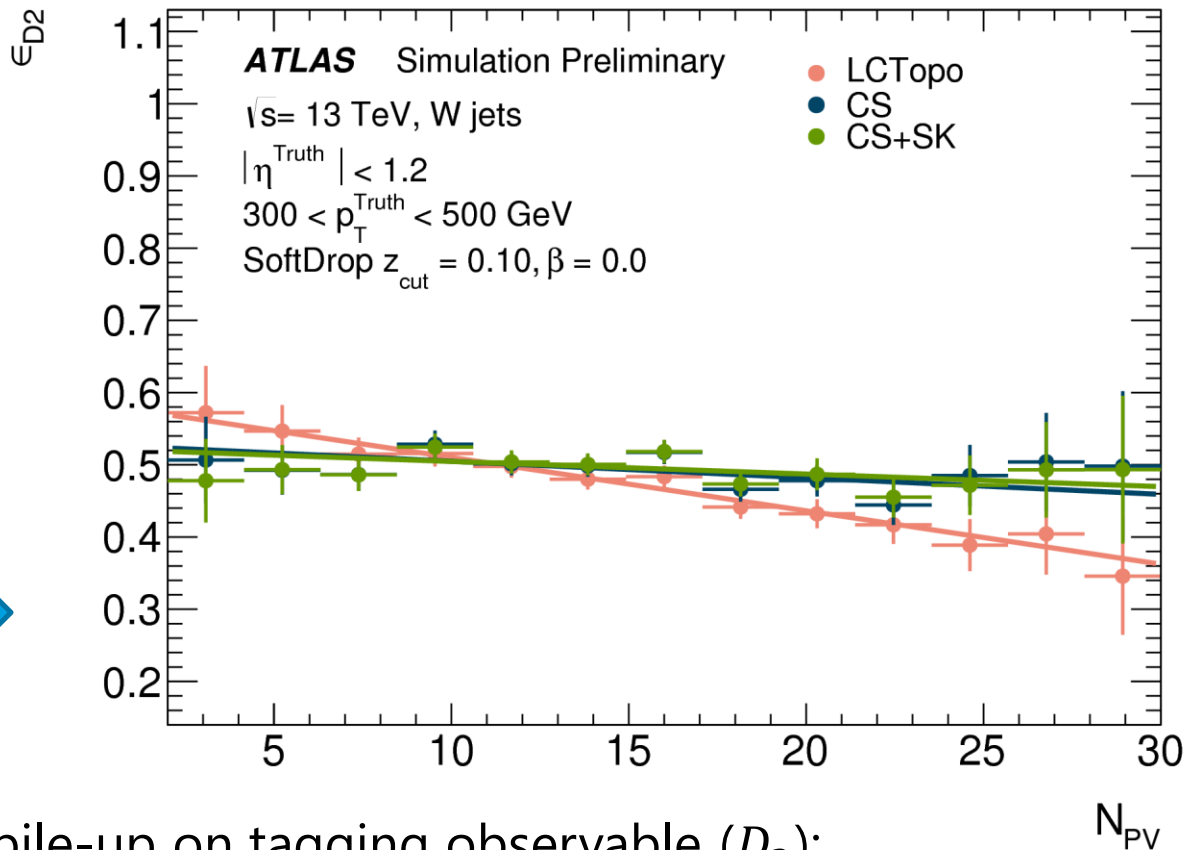
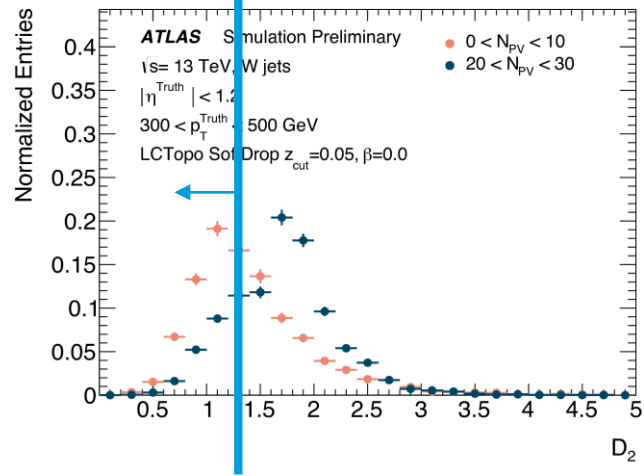
[Eur. Phys. J. C 79 \(2019\) 135](#)

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- Forward-folding has smaller uncertainty, but R_{track} covers a much boarder p_T and mass range



Pile-up Stability— D_2

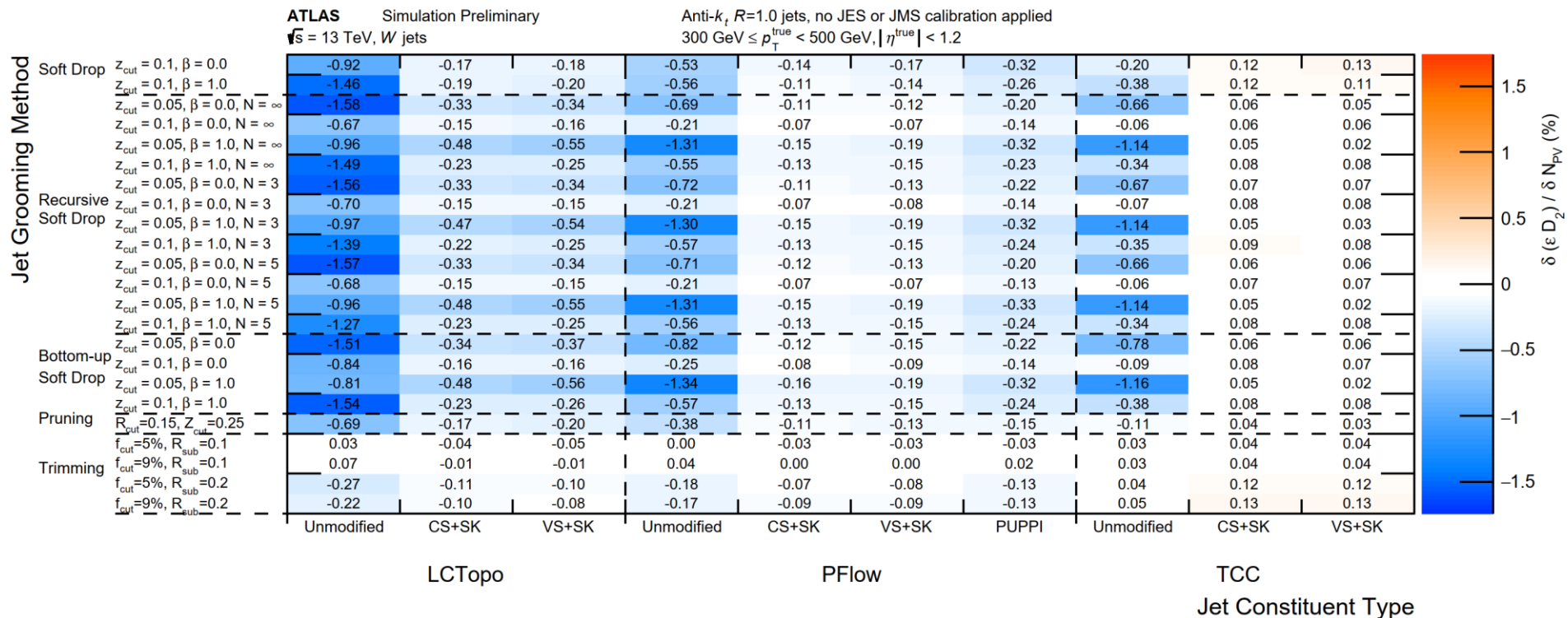
ATL-PHYS-PUB-2017-020



• Quantifying the effect of pile-up on tagging observable (D_2):

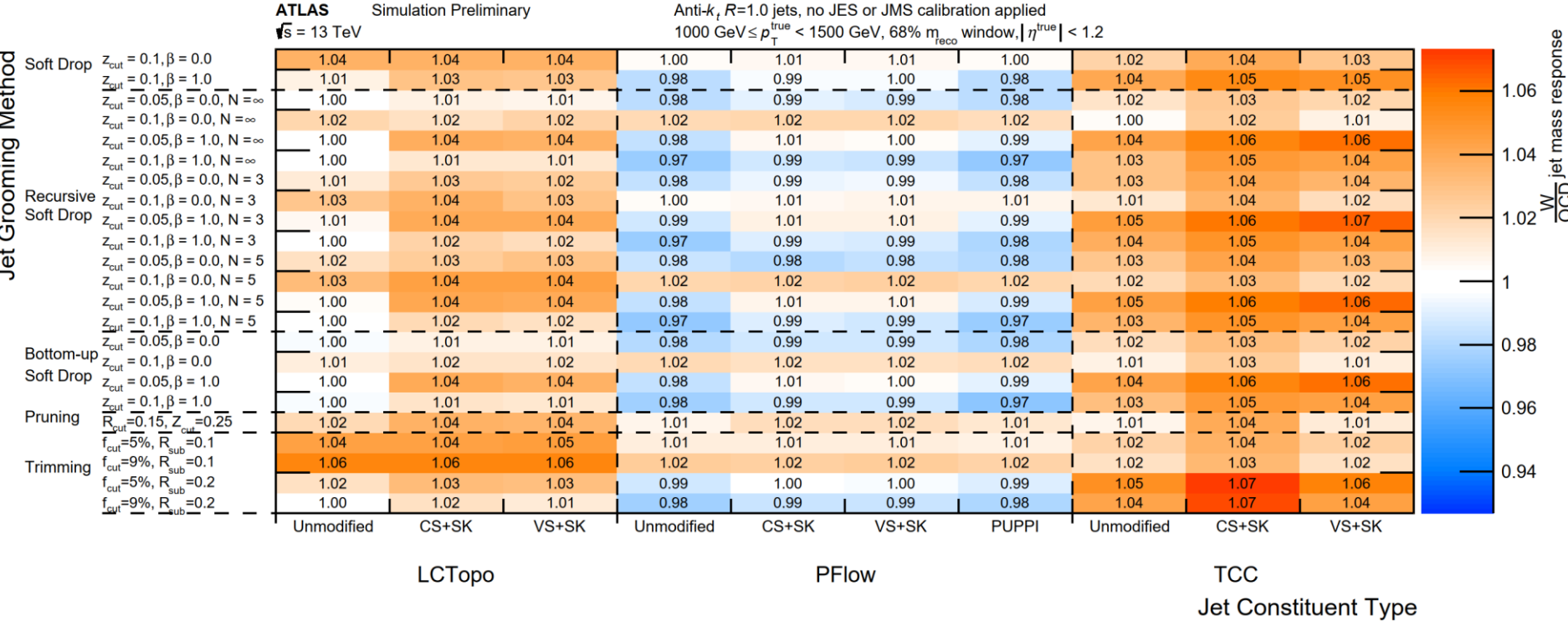
1. Take the D_2 distribution of W-jet sample in the low pile-up ($N_{PV} < 15$) bin
2. Find a cut with 50% efficiency
3. Apply the cut in bins of N_{PV} and plot the efficiencies
4. Fit a line and measure the slope

D_2 Cut Efficiency Slope



- Shown only W -jet with D_2 , but result are consistent with top and τ_{32}
- Prefer zero (pile-up stable)
- Generally, efficiency decreases with pile-up, except TCC

Pile-up Stability—Jet Topology



- Prefer one
- Constituent pile-up suppression make it worse, but there are good option available, especially for PFlow