# Jet and $E_T^{miss}$ Reconstruction with the ATLAS Experiment at LHC

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## Roadmap for this Talk

#### Jet reconstruction in ATLAS

Basic signals and reconstruction sequences

## Small-*R* & large-*R* jets calibration

MC-based calibration

In situ calibration methods for jets in data

## $E_{\rm T}^{\rm miss}$ reconstruction

Signal ambiguity resolution

Selected performance

#### **Conclusions and outlook**



## Small-R Jet Reconstruction in ATLAS

#### Anti- $k_t$ jets with R = 0.4

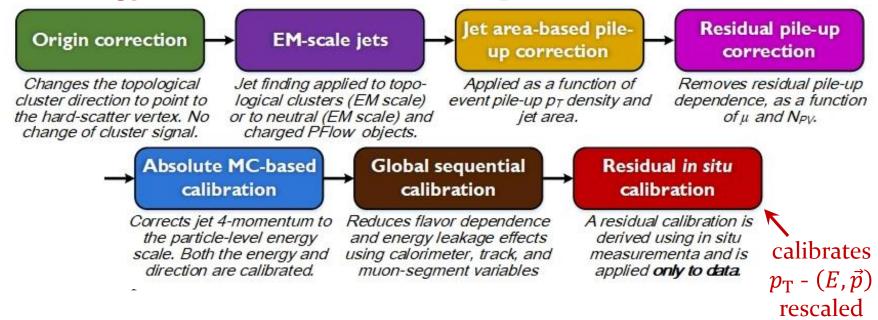
Two choices for input signals

Calorimeter only: clusters of topologically connected cells (topo-cluster) with signals on a basic electromagnetic (EM) scale – **EMTopo jets** 

Calorimeter and Tracking: particle flow signals (PFlow) combining reconstructed tracks with EM-scale topo-clusters – **EMPFlow jets** 

Clustering uses four-momentum recombination

#### Jet energy scale (JES) calibration sequence





## Large-R Jet Reconstruction in ATLAS

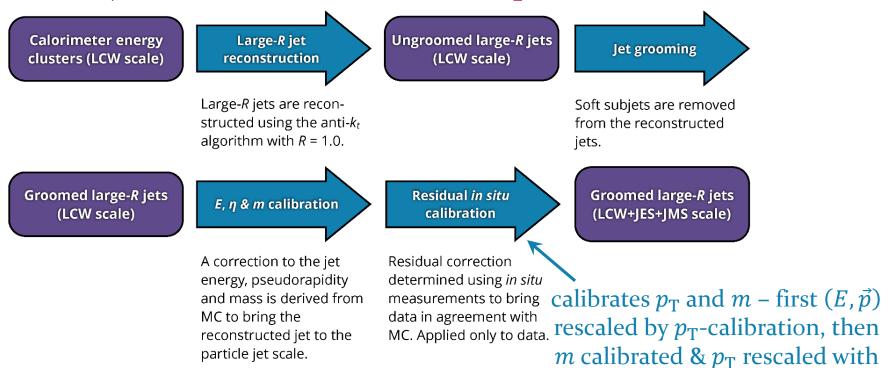
#### Anti- $k_t$ jets with R = 1.0

#### Input signals

Calorimeter only: clusters of topologically connected cells (topo-cluster) with signals on a locally calibrated hadronic (LCW) scale – **LCTopo jets** 

Clustering uses four-momentum recombination

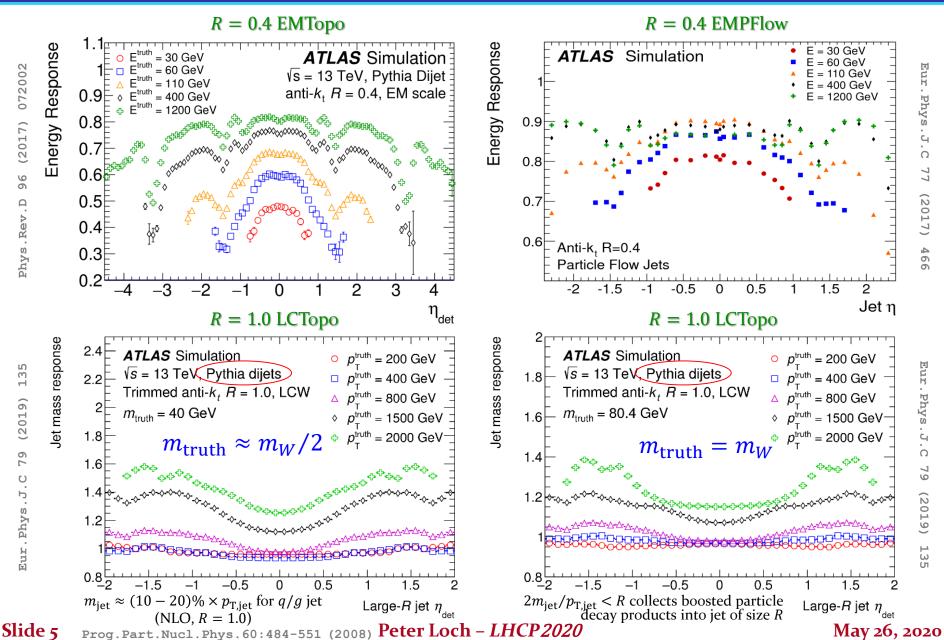
#### JES and jet mass (JMS) calibration sequence



E unchanged



## **Response Before MC-based Calibration**





## In situ Jet Calibration (Data Only)

#### **In-situ calibration**

(1) Relative  $\eta$ intercallibration

Dijets with central jet balancing probed (forward) jet – removes η-dependent data/MC response variations

(2) Full response calibration Combining various final

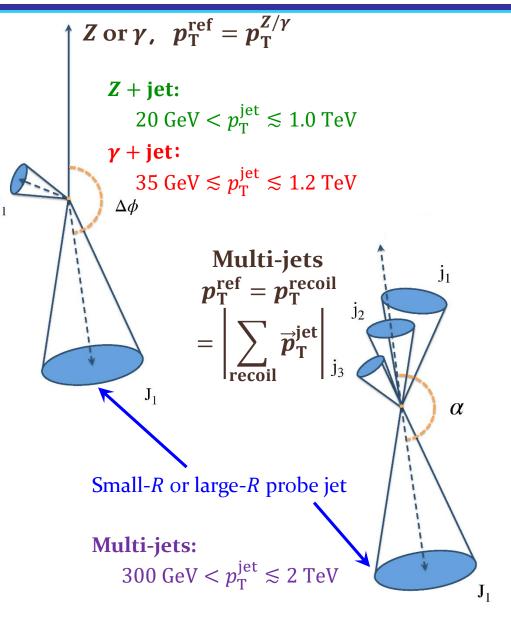
states for full phase space coverage – scales central response of data to MC

#### **Final state selection**

Same topologies data & MC

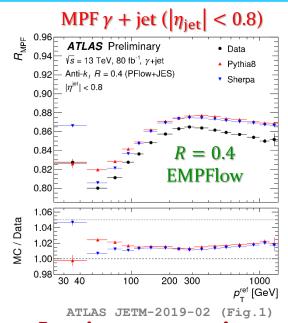
Back-to-back reference and probe

Suppression of events with additional jet(s) above threshold

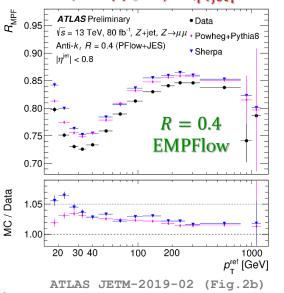




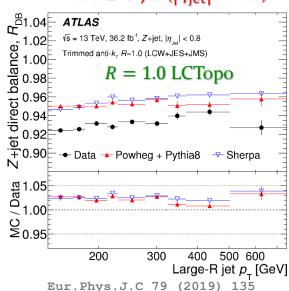
## In situ Jet Energy Scale



## MPF $(Z \rightarrow \mu\mu)$ + jet $(|\eta_{\rm jet}| < 0.8)$



#### $DB Z + \text{jet} (|\eta_{\text{jet}}| < 0.8)$



#### In situ corrections relative to MC

Derived from DB or MPF

Depends on phase space coverage and precision

$$r_{in \, situ} = p_{\rm T}^{\rm jet}/p_{\rm T}^{\rm ref} \, (p_{\rm T}^{\rm ref})$$
 – direct balance (DB)

$$R_{\text{MPF}} = 1 + (\vec{p}_T^{\text{ref}} \cdot \vec{E}_T^{\text{miss}}) / |\vec{p}_T^{\text{ref}}|^2 -$$
missing projection fraction (MPF)

#### Calibration functions

(Powheg+)Pythia8/data ratio reflects nominal calibration function for data – near flat (~2%) correction for  $p_{\rm T}^{\rm jet}$  > 40 GeV both for small- and large-R jets

Differences to other MC generators and variations of topology selections contribute to systematic uncertainties



## **Extracting Jet Calibration for Full Phase Space**

#### **Combination of results**

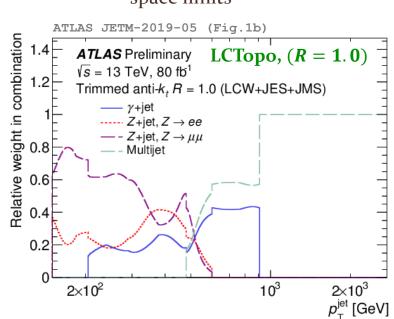
Various final states and methodologies

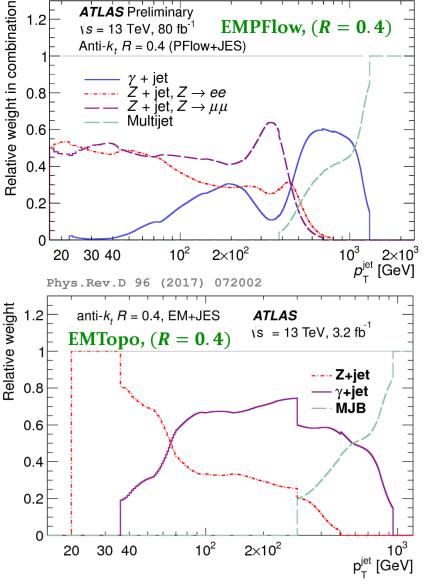
Most precise configuration gets highest weight

#### Contribution weights

Some dependency on jet definition, collected luminosity (statistical precision), algorithm choice (MPF,DB) and detector signal choice

Statistical limitations towards phase space limits





ATLAS JETM-2019-02 (Fig.4)

**ATLAS** Preliminary



## **Extracting Jet Calibration for Full Phase Space**

#### **Combination of results**

Various final states and methodologies

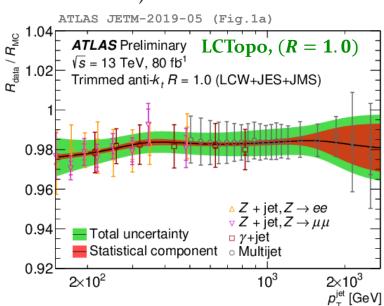
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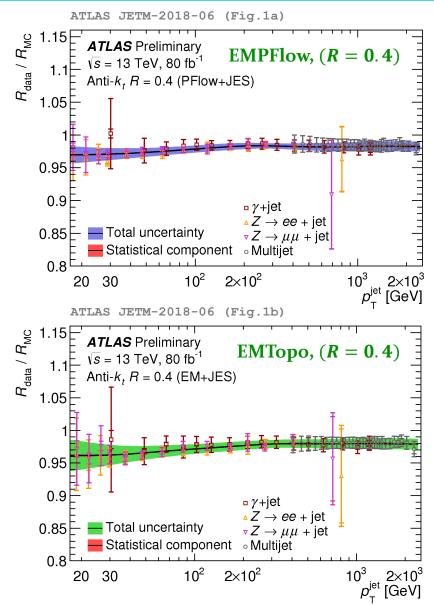
#### Calibration functions

From response curves from weighted combination

Gaussian Kernel smoothing

Calibration and uncertainties very comparable between small-*R* and large-*R* jets





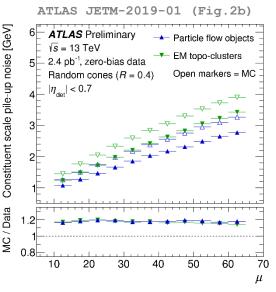


## **Relative Jet Energy Resolution**

#### Measured with $p_{\rm T}$ asymmetry in di-jet balance

PFlow shows expected improvements at low  $p_{\rm T}$ Significantly reduced fluctuations from pile-up Significantly reduced uncertainties at low  $p_{\rm T}$ 

Jet energy resolution,  $\sigma(\rho_{\perp}) / \rho_{\perp}$  0.3 0.3 0.2 0.1 0.1 0.1 anti- $k_{+}R = 0.4$ , EM+JES anti-k, R = 0.4, PFlow+JES ATLAS Preliminary **ATLAS** Preliminary  $\sqrt{s} = 13 \text{ TeV}$ . 43.6 fb<sup>-1</sup>  $\sqrt{s} = 13 \text{ TeV}$ . 43.6 fb<sup>-1</sup>  $0.2 \le |\eta| < 0.7$  $0.2 \le |\eta| < 0.7$ Dijet in situ Dijet in situ Total uncertainty Total uncertainty 0.25 ····· MC prediction ..... MC prediction 0.2 EMTopo, (R = 0.4)EMPFlow, (R = 0.4)0.05 2×10<sup>3</sup>  $10^{2}$  $10^{3}$  $2 \times 10^{3}$  $2 \times 10^{2}$  $2 \times 10^{2}$ 20 30 20 30  $p_{\tau}^{\text{jet}}$  [GeV]  $p_{_{\rm T}}^{\rm jet}$  [GeV] ATLAS JETM-2018-05 (Fig. 4) ATLAS JETM-2018-05 (Fig.5) Uncertainty on  $\sigma(p_{\rm T})/p_{\rm T}$ Data 2017,  $\sqrt{s} = 13 \text{ TeV}$ ATLAS Preliminary Data 2017,  $\sqrt{s} = 13 \text{ TeV}$ ATLAS Preliminary anti-k, R = 0.4, EM+JES anti-k, R = 0.4, PFlow+JES  $\eta = 0.2$ Iominal data vs MC difference Nominal data vs MC difference Noise term, random cones method Noise term, random cones method Dijet in situ JER (systematics) Dijet in situ JER (systematics) Dijet in situ JER (statistics) Dijet in situ JER (statistics) EMTopo, (R = 0.4)EMPFlow, (R = 0.4)0.01  $10^{3}$ 20 30 40  $10^{2}$  $2 \times 10^{2}$  $2 \times 10^{3}$ 2×10<sup>2</sup>  $2 \times 10^{3}$ 20 30 40  $p_{\tau}^{\text{jet}}$  [GeV]  $p_{_{\mathbf{T}}}^{\mathrm{jet}}$  [GeV] Peter Loch - LHCP2020



Imperfect pile-up modeling – larger fluctuations in MC simulation than in data



## $E_{\mathrm{T}}^{\mathrm{miss}}$ Reconstruction in ATLAS

### **Object-based approach**

Fully reconstructed and calibrated particles and jets

Require signal ambiguity resolution to avoid double counting

Soft signals

Signals below reconstruction threshold(s) still contribute to the event  $p_T$  flow

– can be important for  $E_{\rm T}^{\rm miss}$  resolution, bias and significance

#### Signal ambiguity resolution

Priority ranking of object contributing to  $E_{\rm T}^{\rm miss}$ 

Higher priority to object with higher reconstruction quality

Analysis goals determine the ranking and particular object selections

#### Reasons for rejection of lower priority objects for $E_{\rm T}^{\rm miss}$ reconstruction

A – use of same detector signal

B – association with detector signals used for reconstruction of accepted objects

C – other significant phase space overlap with accepted object

#### Soft signal collection

Signals not associated or used by accepted objects

Basic signals or signal remnants from rejected objects – e.g., accepted electron removes only part of jet

Topo-clusters in Run 1 – now primary vertex tracks due to higher stability to increased pile-up

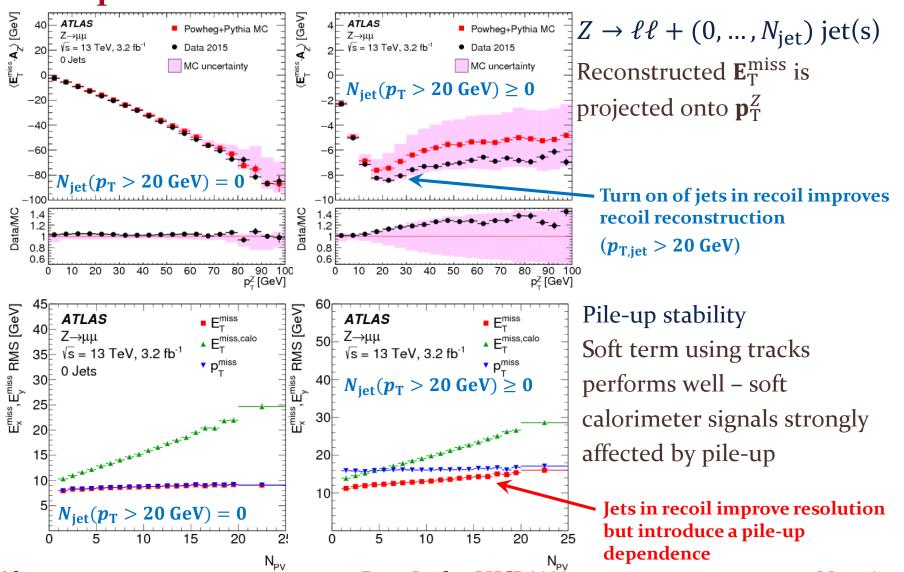


## E<sup>miss</sup> Response

Eur.Phys.J.C 78 (2018) 903 (all figures)

May 26, 2020

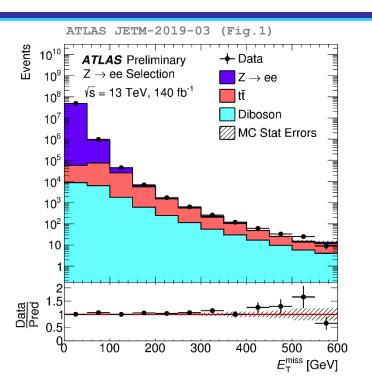
#### **Response & resolution**

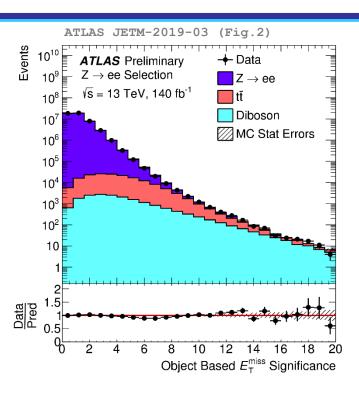


Peter Loch – *LHCP2020* 



## $E_{\rm T}^{\rm miss}$ in Data & Simulations in LHC Run 2





#### Good agreement observed

 $E_{\rm T}^{\rm miss}$  spectrum

Important for e.g. phase space selections

 $E_{\rm T}^{\rm miss}$  significance (ATLAS-CONF-2018-038)

Relates observed  $E_{\rm T}^{\rm miss}$  to accumulated signal fluctuations in underlying objects – including correlations

Important tool for e.g. searches for non-interacting or weakly interacting particles



#### **Conclusions & Outlook**

#### Jets in ATLAS in LHC Run 2

#### Following principal approaches developed in Run 1

MC-based calibrations followed by *in situ* data-only calibrations

#### Similar small and large *R* jet performance

Uncertainties at O(1%) comparable to Run 1

Well controlled and precise measurement of overall jet kinematics

Effects from increased pile-up in Run 2 appropriately mitigated using well-established tools

#### PFlow jets

Improved pile-up suppression for  $p_{\rm T} \lesssim 100~{\rm GeV}$  – similar or higher precision

New standard and basis of the final precision recommendations for physics analysis

#### Further improvements

Several projects looking at one-step calibration approaches and the application of machine learning in jet calibration

Improved pile-up mitigation techniques considering correlations between the out-of-time signal remnants and the in-time pile-up signals



#### **Conclusions & Outlook**

## $E_{\rm T}^{\rm miss}$ reconstruction

Object-based approach carried from Run 1 to higher luminosity

Works very well even at highest luminosities (so far)

Extension to PFlow – mainly affects jets

Investigation of Machine Learning in reconstruction

Improved fJVT measure removes pile-up jets outside of tracking acceptance more efficiently



## Selected Resources & Latest Developments

#### Recent and relevant publications

ATLAS Coll., *Jet energy scale and resolution in Run* 1, **arXiv:1910.04482** (to appear in Eur.Phys.J.C)

ATLAS Coll., Large-R jet in-situ calibration, Eur.Phys.J.C 79 (2019) 135

ATLAS Coll., *Performance of missing transverse momentum reconstruction in 2015 data*, <u>Eur.Phys.J.C 78 (2018) 903</u>

ATLAS Coll., Jet reconstruction and performance using particle flow with the ATLAS detector, <u>Eur.Phys.J.C 77 (2017) 466</u>

ATLAS Coll., *ATLAS jet energy scale in early Run* 2, <u>Phys.Rev.D</u> 96 (2017) 072002

#### **Conference & public notes**

ATLAS Coll., Simultaneous jet energy scale and jet mass scale calibration using generalized numerical inversion, <u>ATLAS-PHYS-PUB-2020-001</u>

ATLAS Coll., *Pile-up-suppressing missing transverse momentum using image de-noising*, <u>ATLAS-PHYS-PUB-2019-28</u>

ATLAS Coll., *Object-based missing transverse momentum significance in the ATLAS detector*, <u>ATLAS-CONF-2018-038</u>

ATLAS Coll., Missing transverse momentum performance in 13 TeV data, <u>ATLAS-CONF-2018-23</u>

## **Additional Material**



## Small-R Jet Reconstruction in ATLAS

#### Anti- $k_t$ jets with R = 0.4

#### Two choices for input signals

Calorimeter only: clusters of topologically connected cells (topo-cluster) with signals on a basic electromagnetic (EM) scale – **EMTopo jets**Calorimeter and Tracking: particle flow signals (PFlow) combining reconstructed tracks with EM-scale topo-clusters – **EMPFlow jets** 

Clustering uses four-momentum recombination

#### Jet energy scale (JES) calibration sequence

#### MC-based

**Pile-up suppression:** removes diffuse emissions from pile-up into jet (jet-area-based – pile-up represented as median  $p_T$  density of given event

**Energy calibration** and **direction correction:** scales the reconstructed jet energy to the truth expectation and corrects small directional deflections

**Global sequential calibration:** reduces jet-by-jet response variations introduced by jet flavor, fragmentation and longitudinal energy leakage

#### *In situ* calibration: data only – relative to MC

 $\eta$ -intercalibration using  $p_T$  balance in dijet events: corrects data-MC response ratio variations in calorimeter regions, relative to central region

 $p_T$  balance in  $\gamma/Z$  + jet(s) & multi-jet final states: calibrates data to jet response in MC simulations – removes residual data-MC differences



## Large-R Jet Reconstruction in ATLAS

#### Anti- $k_t$ jets with R = 1.0

#### Input signals

Calorimeter only: clusters of topologically connected cells (topo-cluster) with signals on a locally calibrated hadronic (LCW) scale – **LCTopo jets**Clustering uses four-momentum recombination

#### JES and jet mass (JMS) calibration sequence

#### Pile-up suppression by jet grooming

Removing soft subjets by trimming  $(p_T^{\text{subjet}}/p_T^{\text{jet}} > f_{\text{cut}} = 5\%, R_{\text{subjet}} = 0.2)$ 

#### MC-based

**Energy** and **mass calibration** and **direction correction**: scales the reconstructed jet energy and mass to the truth expectations; corrects small directional deflections (truth particle jet is trimmed as well)

#### *In situ* calibration: data only – relative to MC

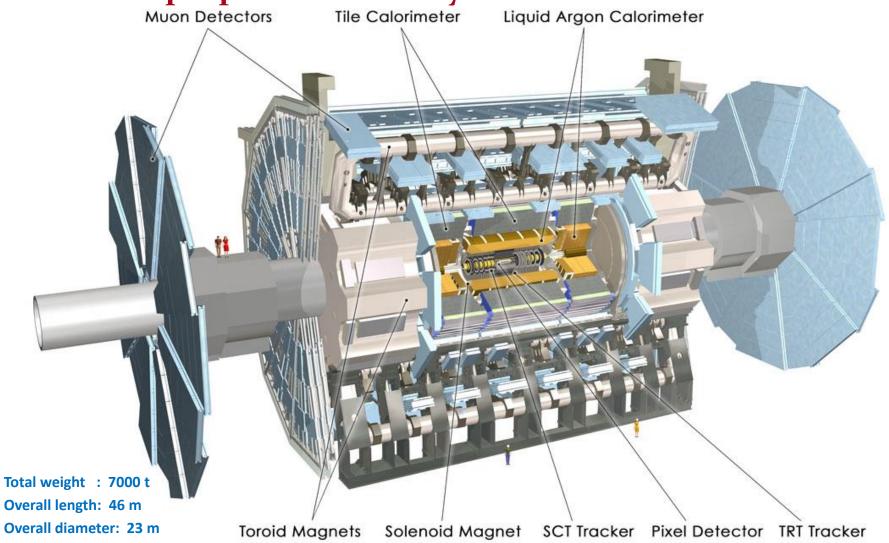
*In situ* JES similar to small-R jets approach: using  $p_T$  balance with well-calibrated reference(s)

*In situ* JMS: applied after *in situ* JES – corrects  $m_{\rm jet}^{\rm data}$  with scale factors determined by forward-folding  $m_{W\to jj}^{\rm MC}$  and  $m_{t\to jjj}^{\rm MC}$  distributions from MC to data in  $t\bar{t}\to (Wb)(Wb)\to (qqb)(\ell\ell b)$  final states



#### ATLAS at the LHC

### A multi-purpose detector system



Magnetic field: 2T solenoid + (varying) toroid field



## **Detectors for Hadronic Final State Reconstruction**

#### **Calorimeters**

Provides principal signals for  $e^{\pm}/\tau^{\pm}$  and jet kinematics – and other measurements Full coverage within  $|\eta| < 4.9$  with depth  $\gtrsim 10 \, \lambda_{\rm int}$ 

Highly segmented for energy flow measurements (~188,000 cells)

High granularity in  $\Delta \eta \times \Delta \varphi = 0.025 \times \pi/128$  (central EM) Up to seven depth layers (*samplings*)

#### Inner detector

Provides charged particle tracks and vertices

Coverage  $|\eta|$  < 2.5

Jet energy calibration refinement

Provides vertex for jet origin correction/jet vertex association/jet vertex tagging (JVT) Flavor/fragmentation sensitive response measures – mitigation of jet flavor response dependencies

Particle flow

Replace charged response in calorimeter with kinematics from well-measured tracks

Missing transverse momentum soft contributions

Tracks not used or associated with (hard) reconstructed particles and jets

#### **Muon spectrometer**

Reconstructed muons

Contribution to missing transverse momentum reconstruction

Track segments

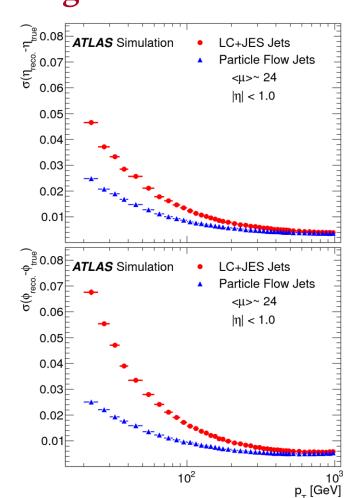
Proxy for energy leakage behind a jet



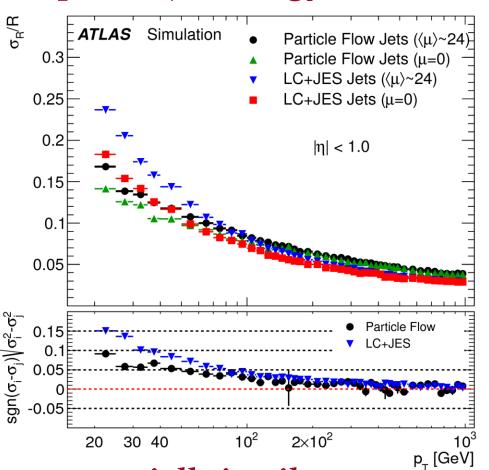
## Why Particle Flow Jets?

Eur.Phys.J.C 77 (2017) 466 (all figures)

## **Angular resolution improvements**



#### Improved jet energy resolution



Better lower  $p_T$  performance especially in pile-up



## In situ JES Calibration Overview

Method	Validity range	Reference jet calibration	Probe jet calibration	Applied to jets with
$\eta$ -intercalibration	full accessible $p_{ m T}^{ m jet}$ range	MC calibrations	MC calibrations	MC calibrations
Z + jet (MPF)	$20~{\rm GeV} < p_{\rm T}^{\rm jet} \lesssim 1.0~{\rm TeV}$	n/a	No probe – full final state response	MC calibrations + $\eta$ -intercalibration
Z + jet (DB)			MC calibrations + $\eta$ -intercalibration	MC calibrations + $\eta$ -intercalibration
γ + jet (MPF)	$35~{ m GeV} \lesssim p_{ m T}^{ m jet} \lesssim 1.2~{ m TeV}$	n/a	No probe – full final state response	MC calibrations + $\eta$ -intercalibration
γ + jet (DB)			MC calibrations + $\eta$ -intercalibration	MC calibrations + $\eta$ -intercalibration
Multi-jet (MJB)	$300~{ m GeV} \lesssim p_{ m T}^{ m jet} \lesssim 2~{ m TeV}$	full calibration	MC calibrations + $\eta$ -intercalibration	MC calibrations + $\eta$ -intercalibration



## **Extracting Jet Calibration for Full Phase Space**

#### Systematic uncertainties

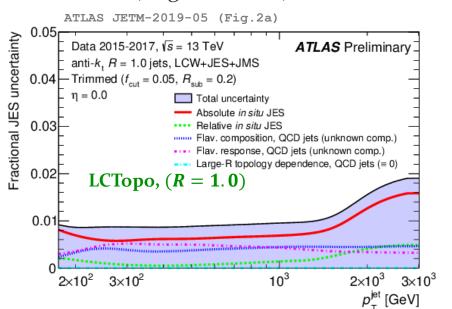
Dominant sources

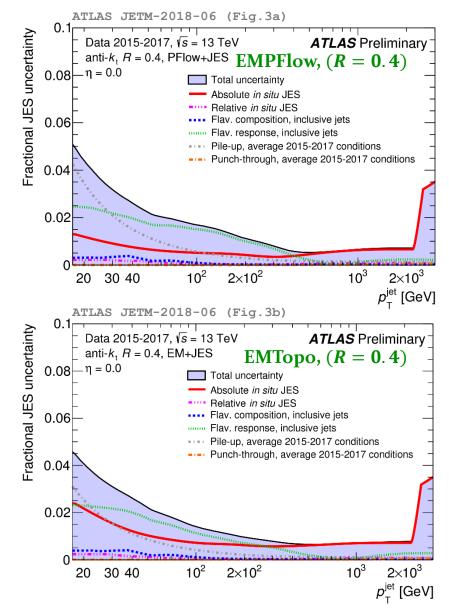
Absolute in-situ data-to-MC calibration

Flavor response variations and pile-up corrections for low  $p_T R = 0.4$  jets

High precision for R = 1.0 jet response

Less sensitivity to flavor response (fragmentation)







## $E_{\rm T}^{\rm miss}$ Reconstruction in ATLAS

#### **Principal observables**

$$\begin{split} E_{x(y)}^{\text{miss}} &= -\sum_{i \in \{\text{hard objects}\}} p_{x(y),i} - \sum_{j \in \{\text{soft signals}\}} p_{x(y),j} \\ \mathbf{E}_{T}^{\text{miss}} &= (E_{x}^{\text{miss}}, E_{y}^{\text{miss}}) \\ E_{T}^{\text{miss}} &= |\mathbf{E}_{T}^{\text{miss}}| = \sqrt{(E_{x}^{\text{miss}})^{2} + (E_{y}^{\text{miss}})^{2}} \quad (E_{T}^{\text{miss}} \text{ observation bias!}) \\ \phi^{\text{miss}} &= \tan^{-1}(E_{y}^{\text{miss}}/E_{x}^{\text{miss}}) \end{split}$$

#### Signal contributions

$$\mathbf{E}_{T}^{miss} = -\sum_{\substack{\text{selected}\\ \text{electrons}}} \mathbf{p}_{T}^{e} - \sum_{\substack{\text{accepted}\\ \text{photons}}} \mathbf{p}_{T}^{\gamma} - \sum_{\substack{\text{accepted}\\ \tau\text{-leptons}}} \mathbf{p}_{T}^{\tau_{had}} - \sum_{\substack{\text{selected}\\ \text{muons}}} \mathbf{p}_{T}^{\mu} - \sum_{\substack{\text{accepted}\\ \text{pets}}} \mathbf{p}_{T}^{\text{jet}} - \sum_{\substack{\text{unused}\\ \text{tracks}}} \mathbf{p}_{T}^{\text{track}}$$