



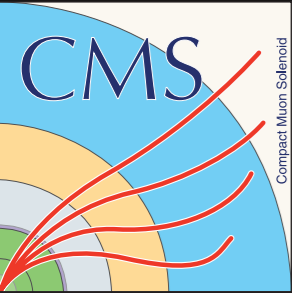
# HADRONIC OBSERVABLES & ELEMENTS

***JET RECONSTRUCTION  
& CALIBRATION***

***MET RECONSTRUCTION  
& PERFORMANCE***

***JET SUBSTRUCTURE  
& TAGGING***

- Strongly associated with calorimetry, but tracking is progressively more important — will demonstrate.
- *Brief* overview starting from basic elements



# JET RECONSTRUCTION

[CMS PAS-PFT-09-001]

Particle Flow candidates

INPUTS

Topo-clusters  
PF tracks  
PF clusters

CONSTITUENT CORRECTIONS

Charged Hadron Subtraction (CHS)  
PileUp Per Particle ID (PUPPI)

Origin-correction  
Charged Hadron Subtraction (CHS)

[CERN-CMS-DP-2015-034]

**ALGORITHMS**  
General purpose:  
Anti- $k_T$ ,  $R=0.4$   
  
W/Z/H/t-tagging:  
CMS: anti- $k_T$ ,  $R=0.8$   
ATLAS: anti- $k_T$ ,  $R=1.0$   
  
Low-pT top-tagging:  
Cam/Aachen,  $R=1.5$   
  
Variable radius

Jet pruning  
 $z_{cut}=0.1$   
  
Soft-drop  
 $z_{cut}=0.1, \beta=0$   
(mod. mass-drop)

(SUB)JET CORRECTIONS

Jet trimming  
 $R_{sub}=0.2, f_{cut}=0.05$   
  
(forward) Jet Vertex Tagger

[arXiv:1603.02934]

[arXiv:1703.10485]

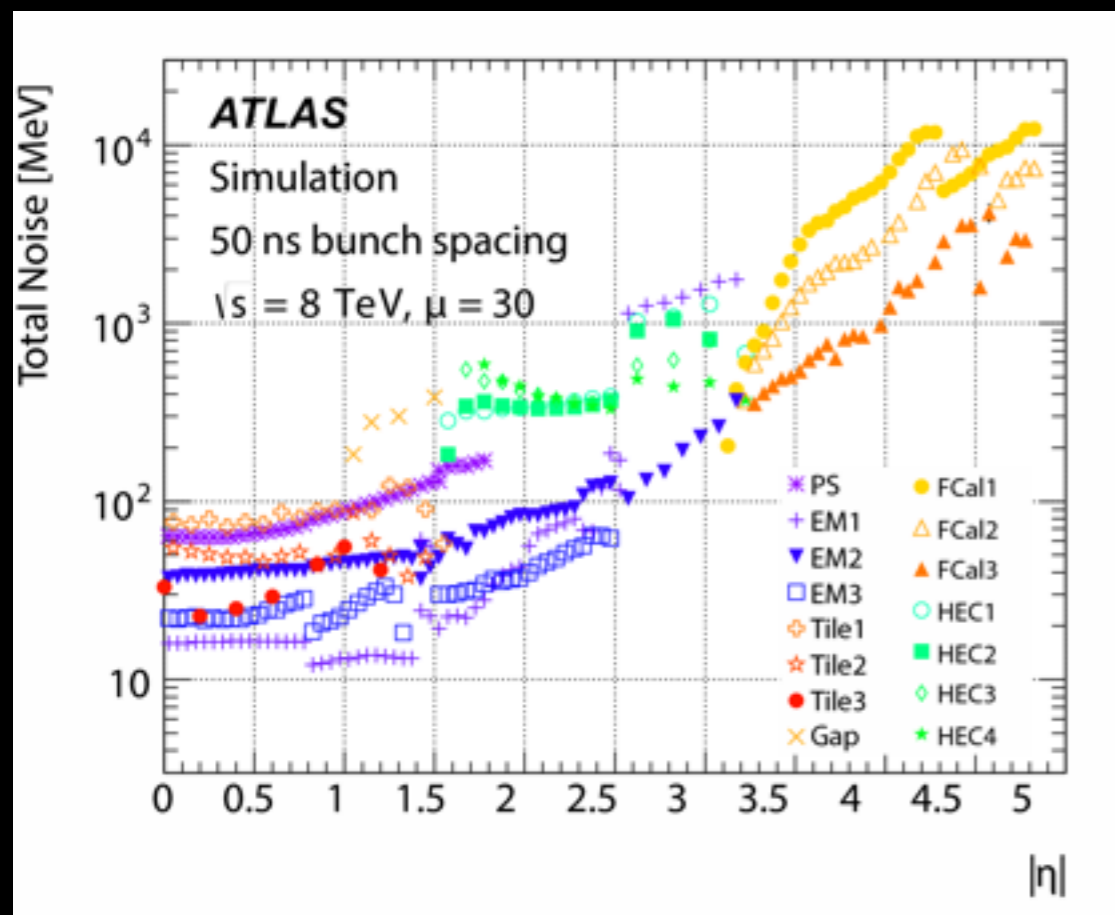
[arXiv:1510.03823]

[JETM-2016-006]

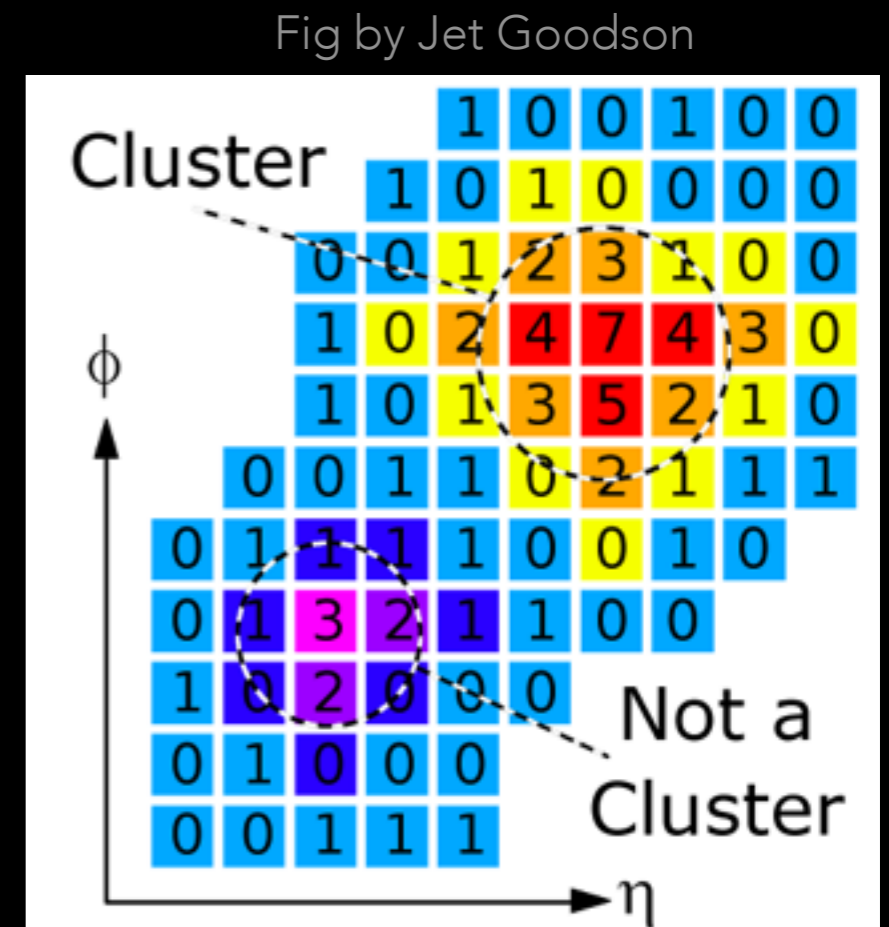




ATLAS hadronic reconstruction begins with 3D topological clusters constructed from calorimeter cells.



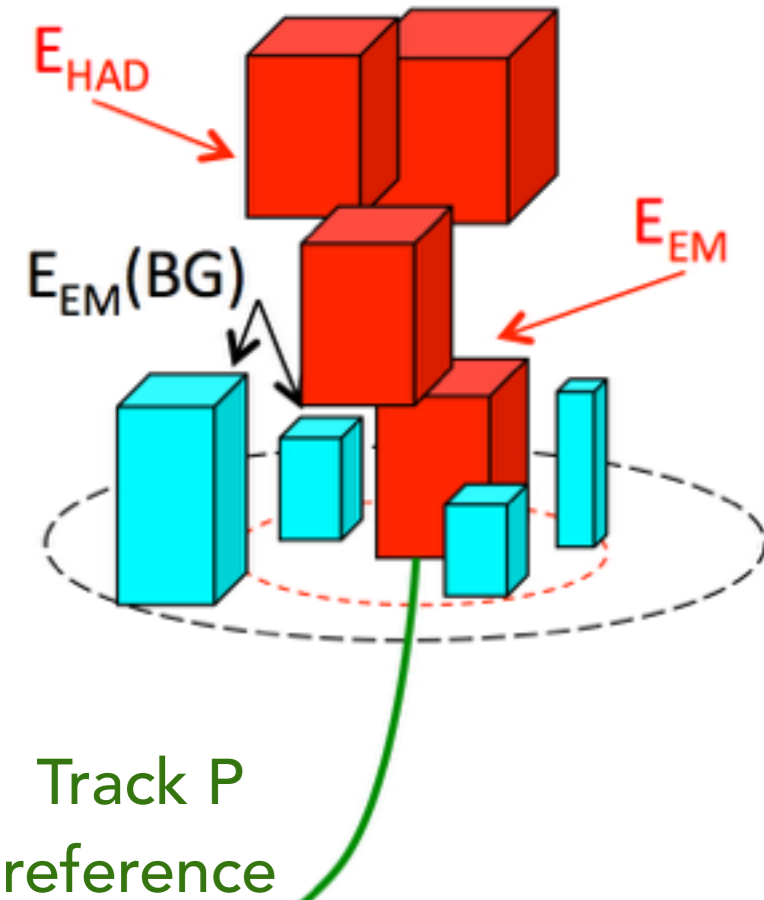
Cluster seeding & expansion in 3D  
(4/2/0  $|\sigma_{\text{noise}}|$ )



Noise-suppressed and calibrated for pileup-stability and good single-hadron response.



# SINGLE-HADRON RESPONSE & JET COMPOSITION MEASUREMENTS



Isolated charged hadron response measured in data

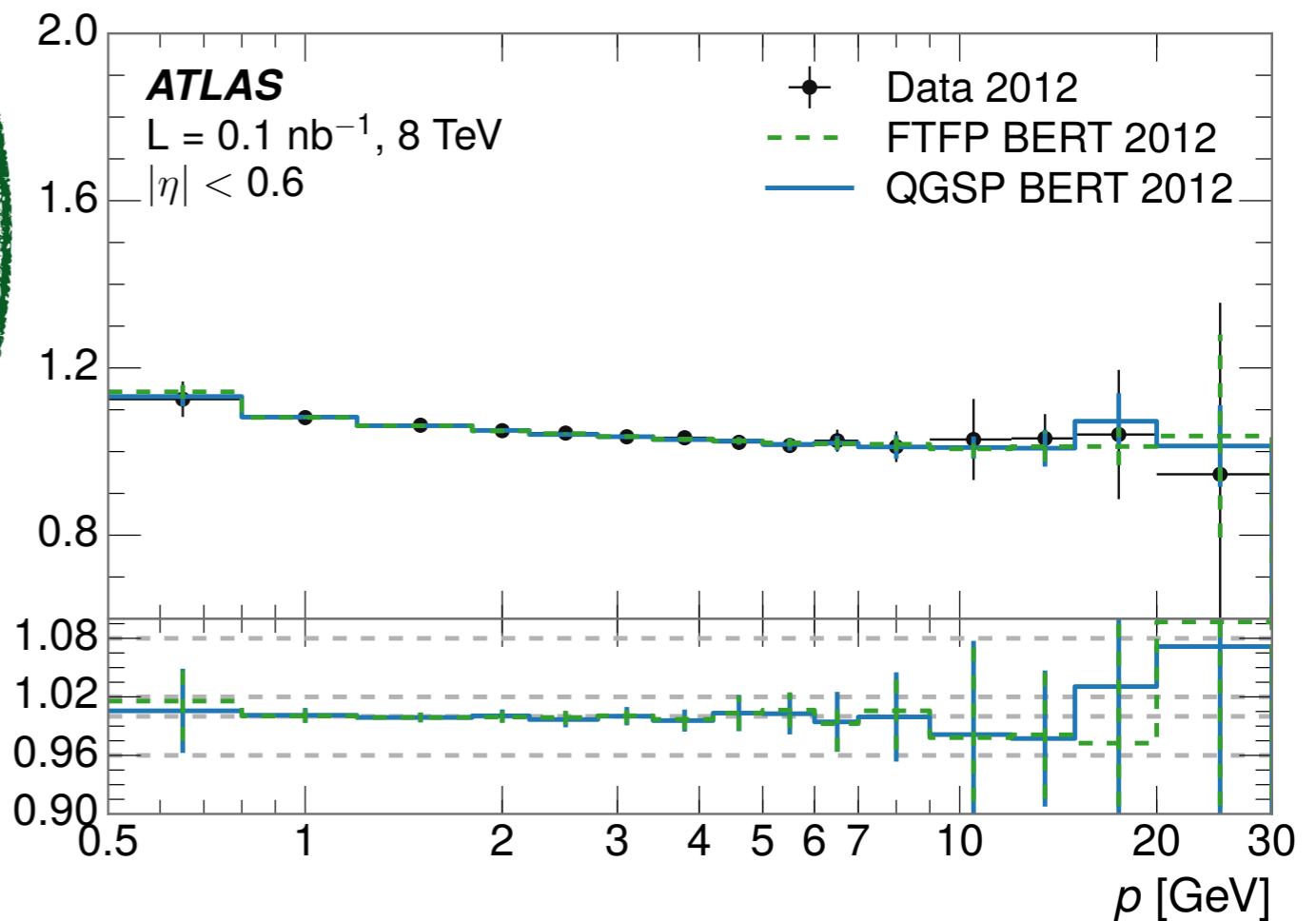
Full calorimeter R / topo-cluster R

Topoclusters effectively capture shower energy for isolated single particles

AND MANY MORE INTERESTING MEASUREMENTS

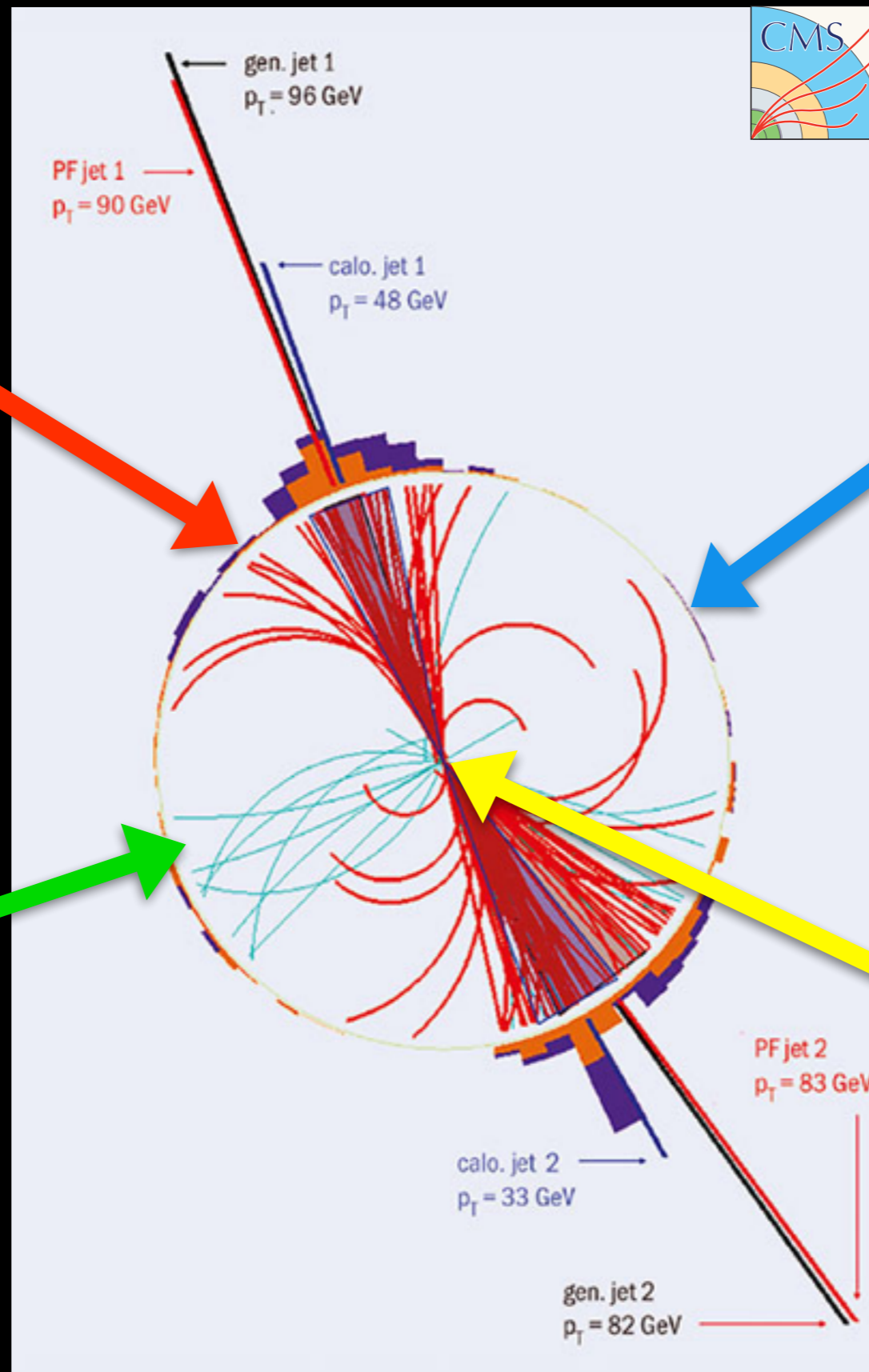
$$\langle E/p \rangle_{\text{cell}} / \langle E/p \rangle_{\text{cluster}}$$

MC/Data



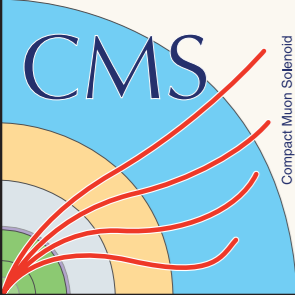
Tracks capture  
jet structure in  
fine detail

Better particle  
momentum  
resolution



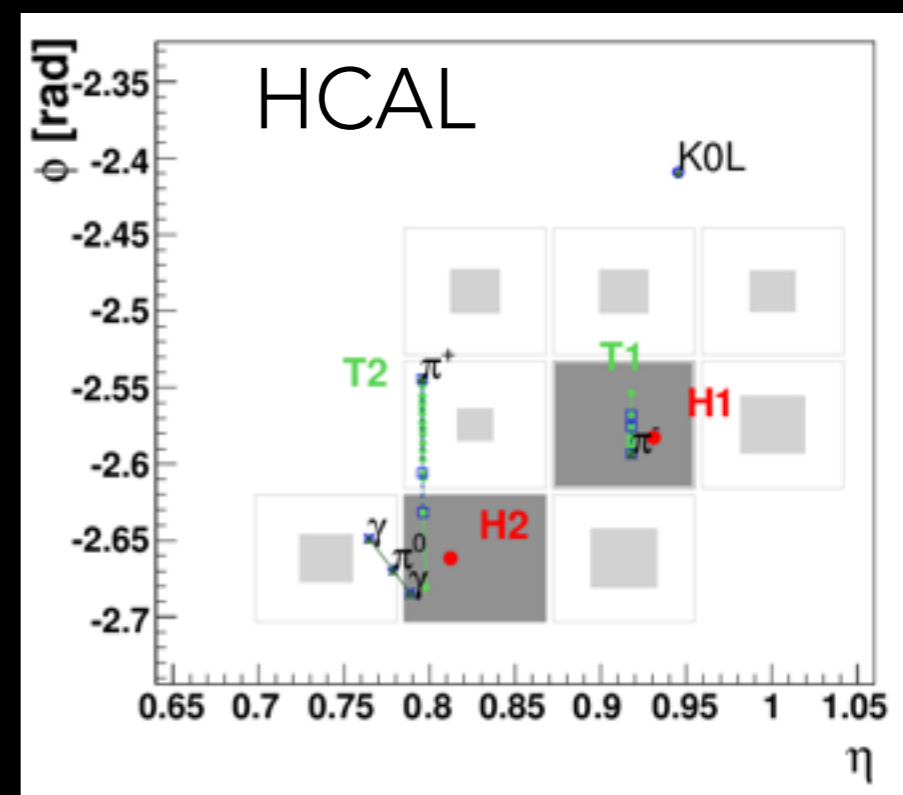
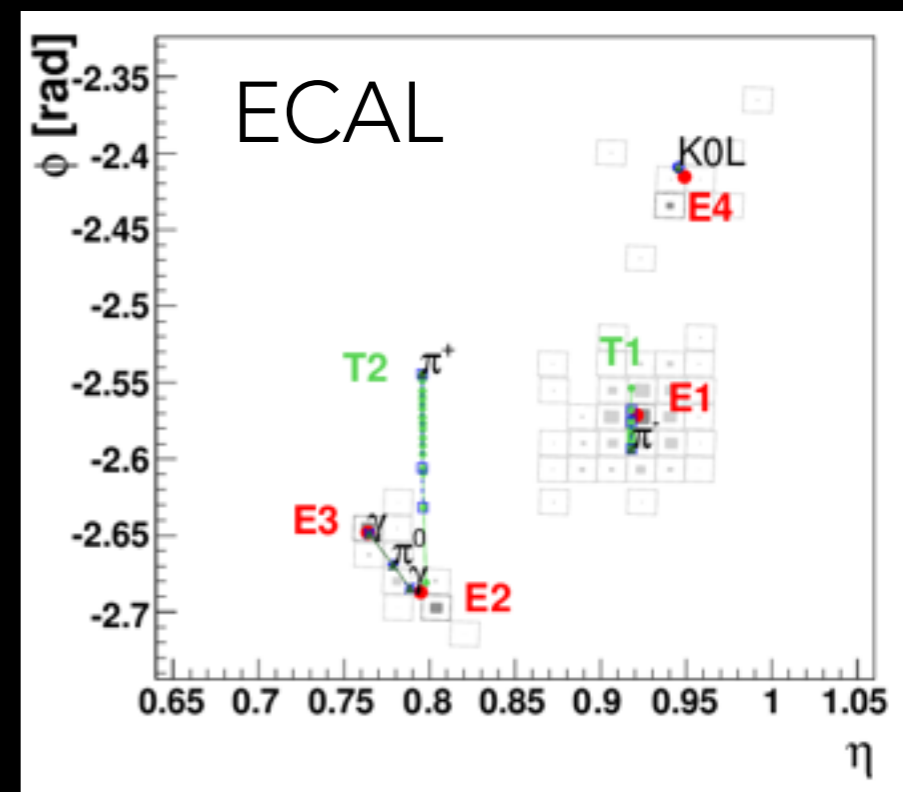
Correct for  
bending in  
magnetic field

Identify origin  
vertices



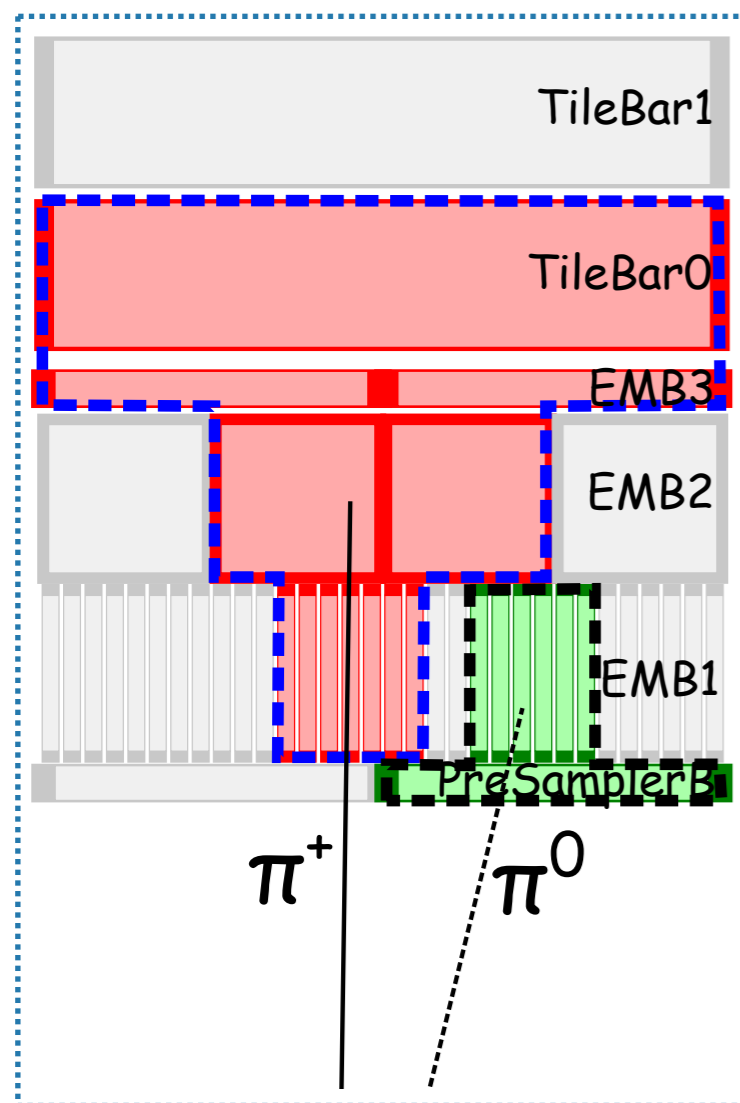
# PARTICLE FLOW RECONSTRUCTION

- Foundation of CMS hadronic reconstruction
- Integrated with **global event reco**
  1. Muons & electron constituents removed
  2. Extrapolated tracks matched to clusters to form charged hadrons
  3. Photon & neutral hadrons created from excess ECAL/HCAL energy
  4. *Dedicated calibrations applied to each particle type*

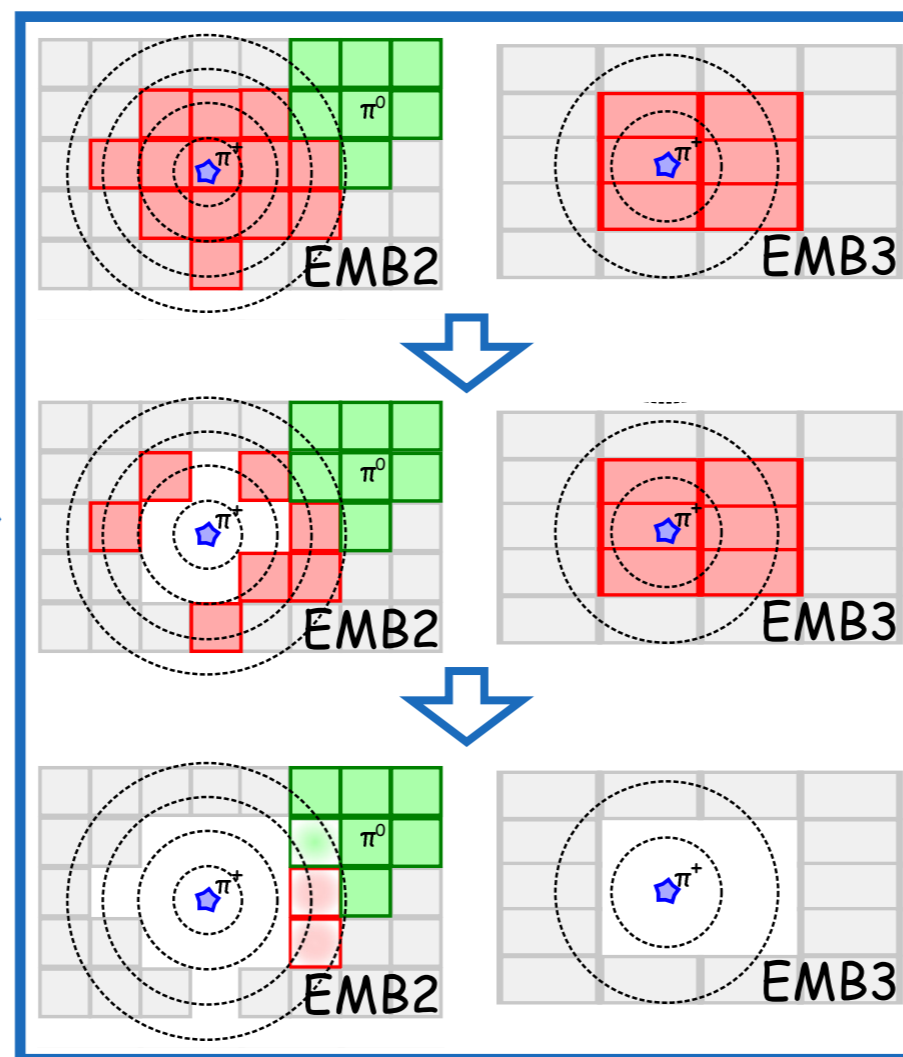




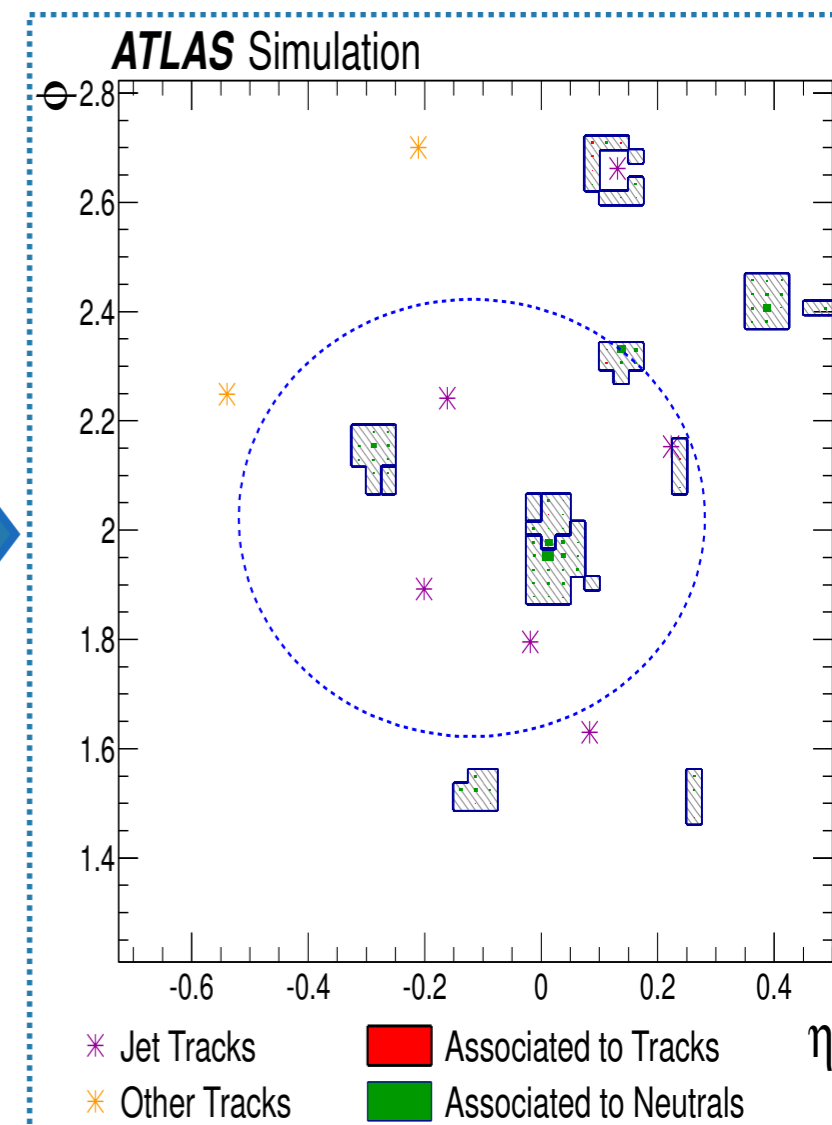
Different approach for longitudinally/laterally segmented calorimeter  
Subtract calorimeter energy with parameterised shower shape.



Track-cluster matching  
1:1 or 1:many



Cell-level subtraction  
by ring & layer

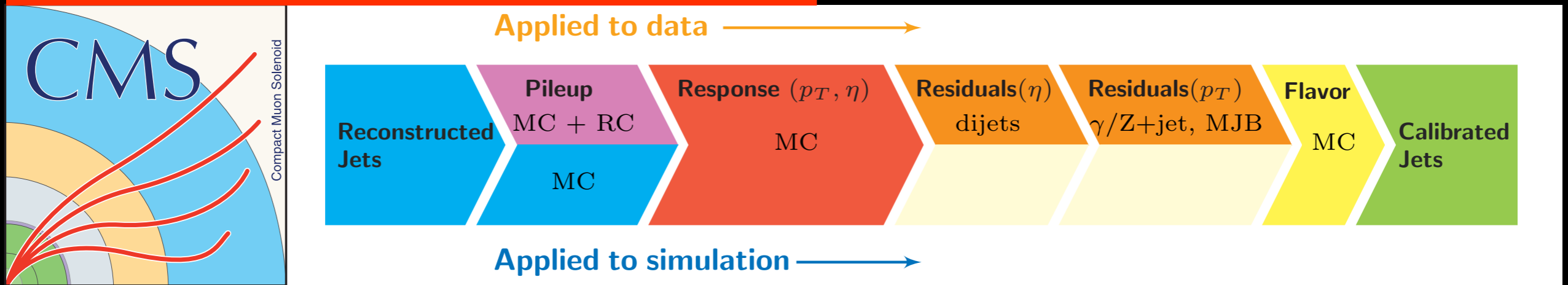


No-pileup illustration  
(charged energy selectively removed)

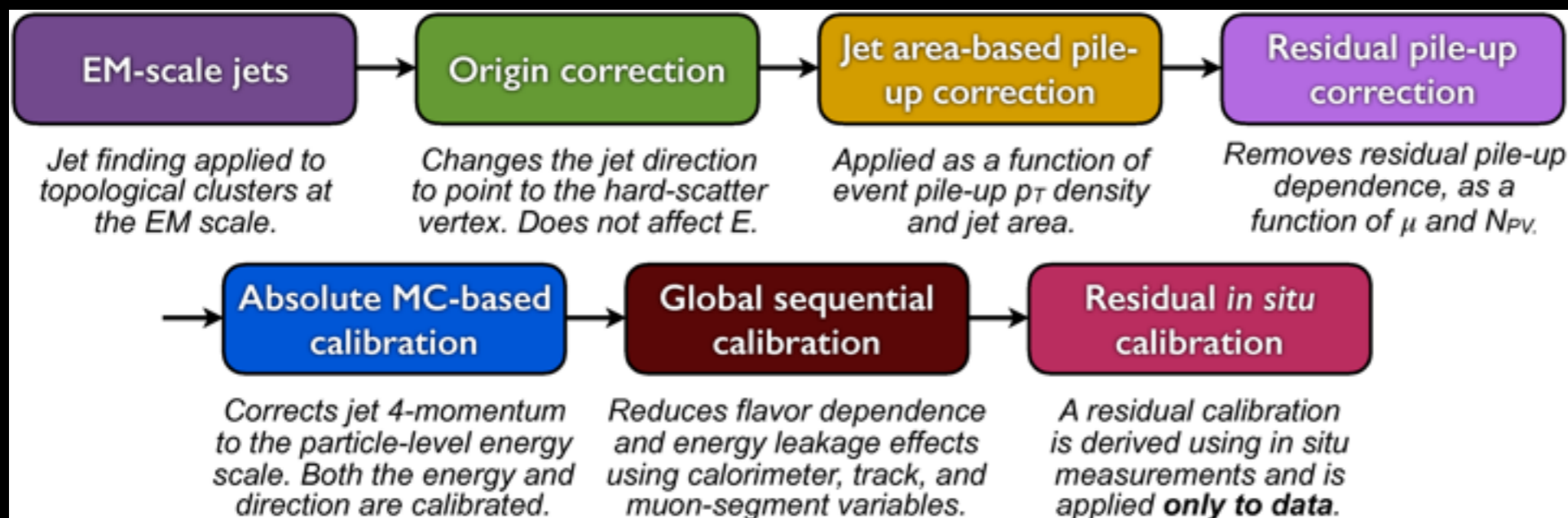
Difficult in high- $p_T$  jets! Most gains at low  $p_T$ .

# JET CALIBRATION

[JINST 12 (2017) P02014], [CMS DP -2016/020]

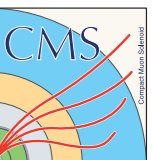
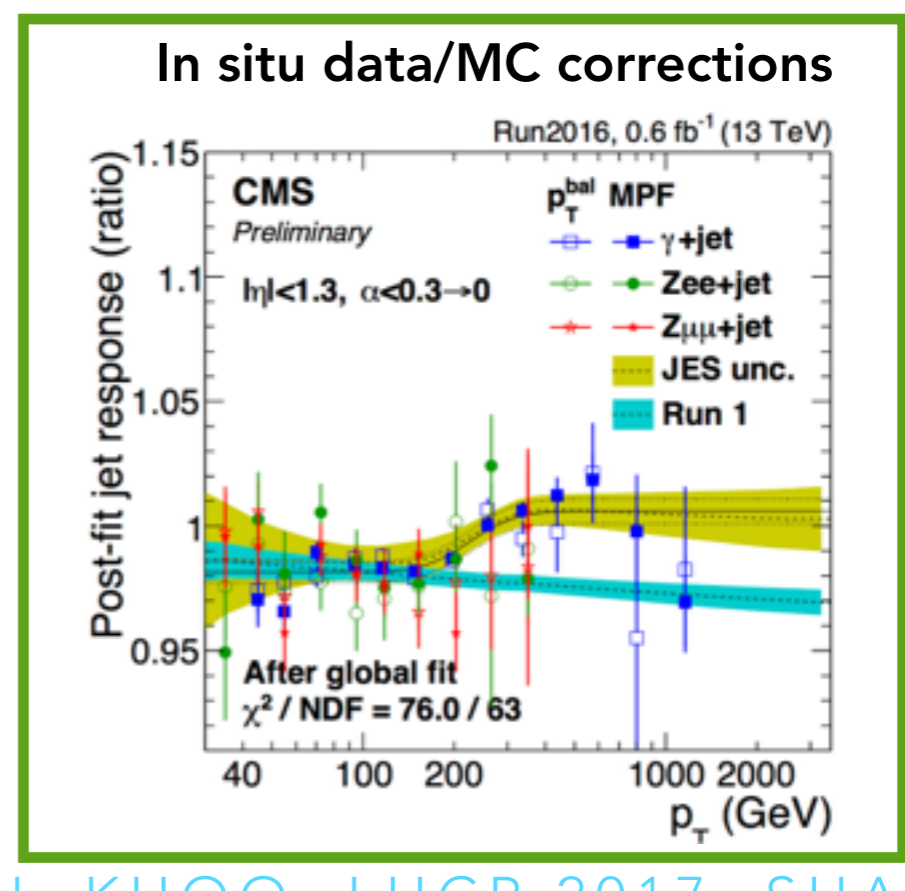
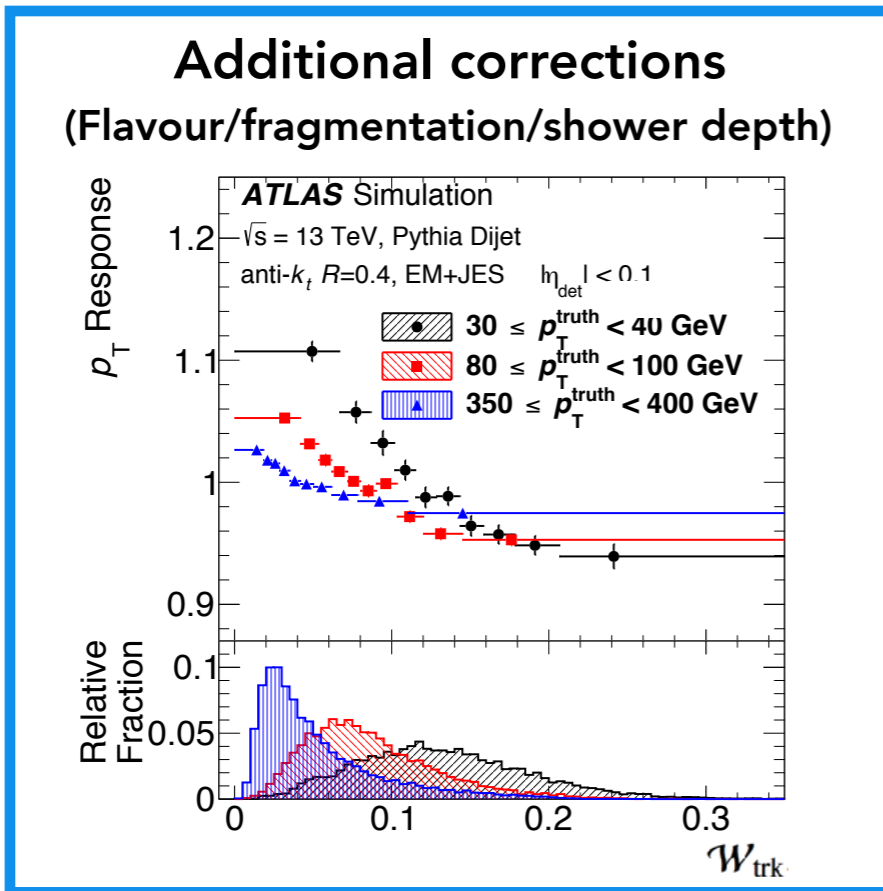
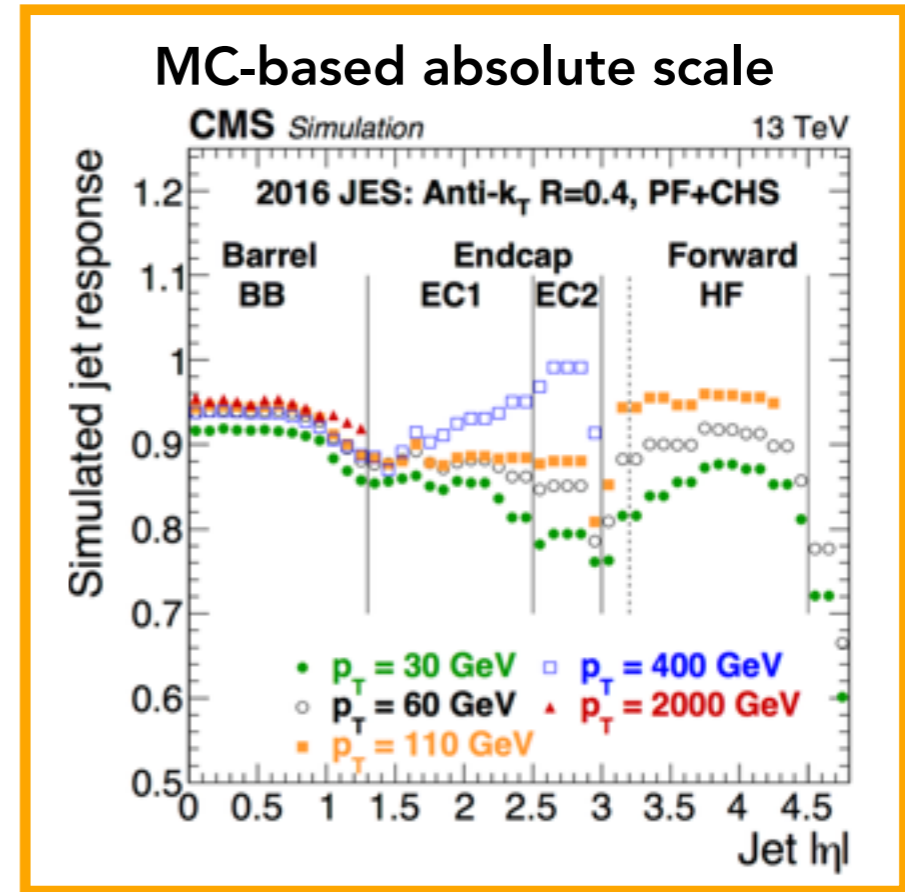
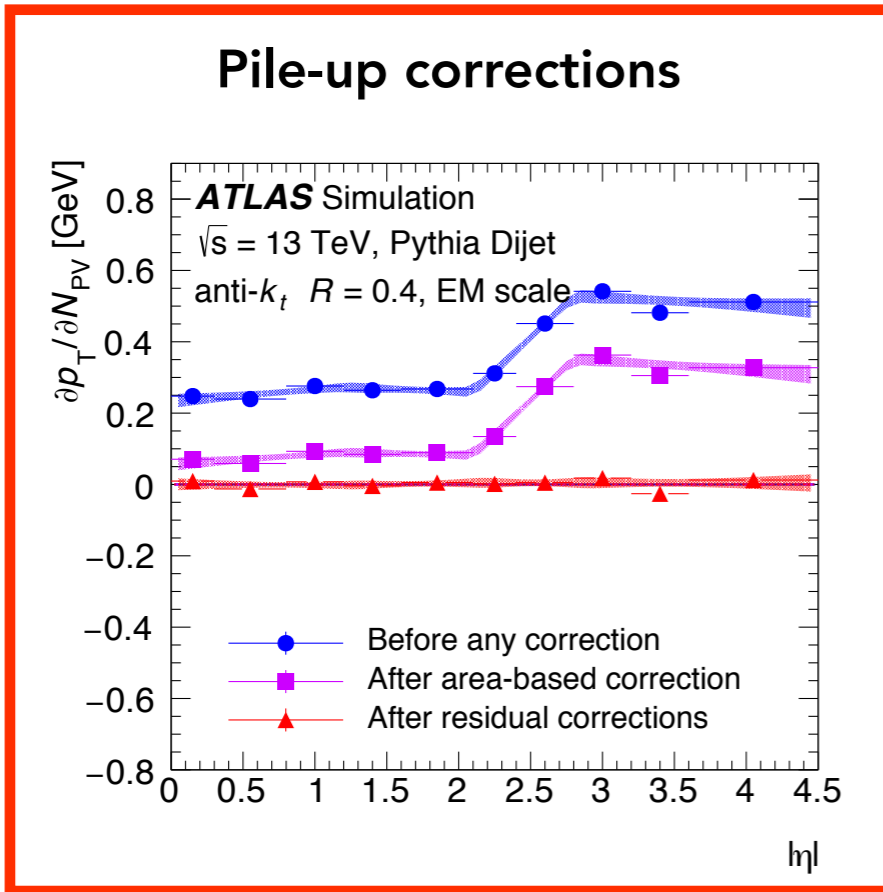


Four-vector restored to **particle-scale reference four-momentum** using similar sequential corrections.



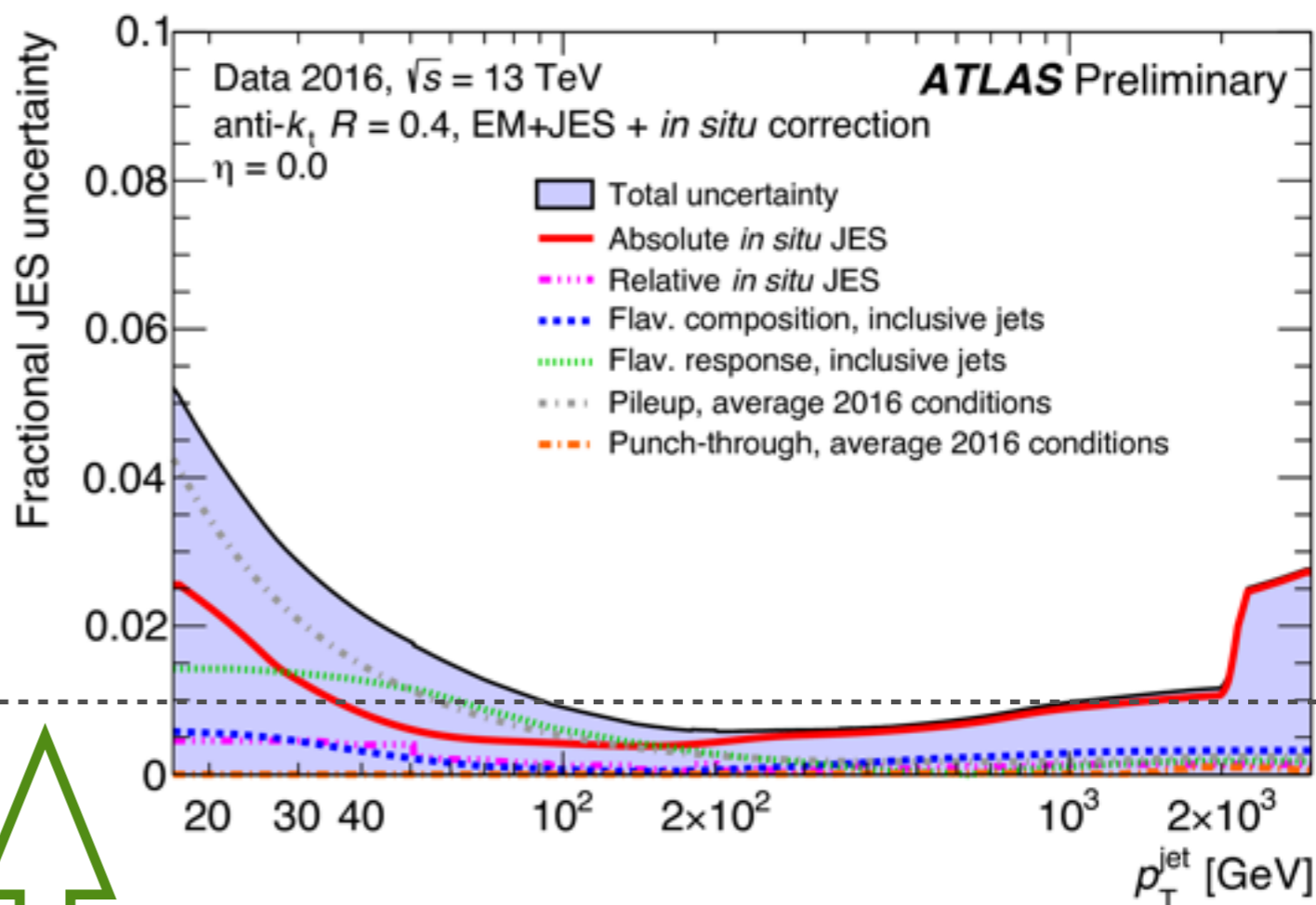
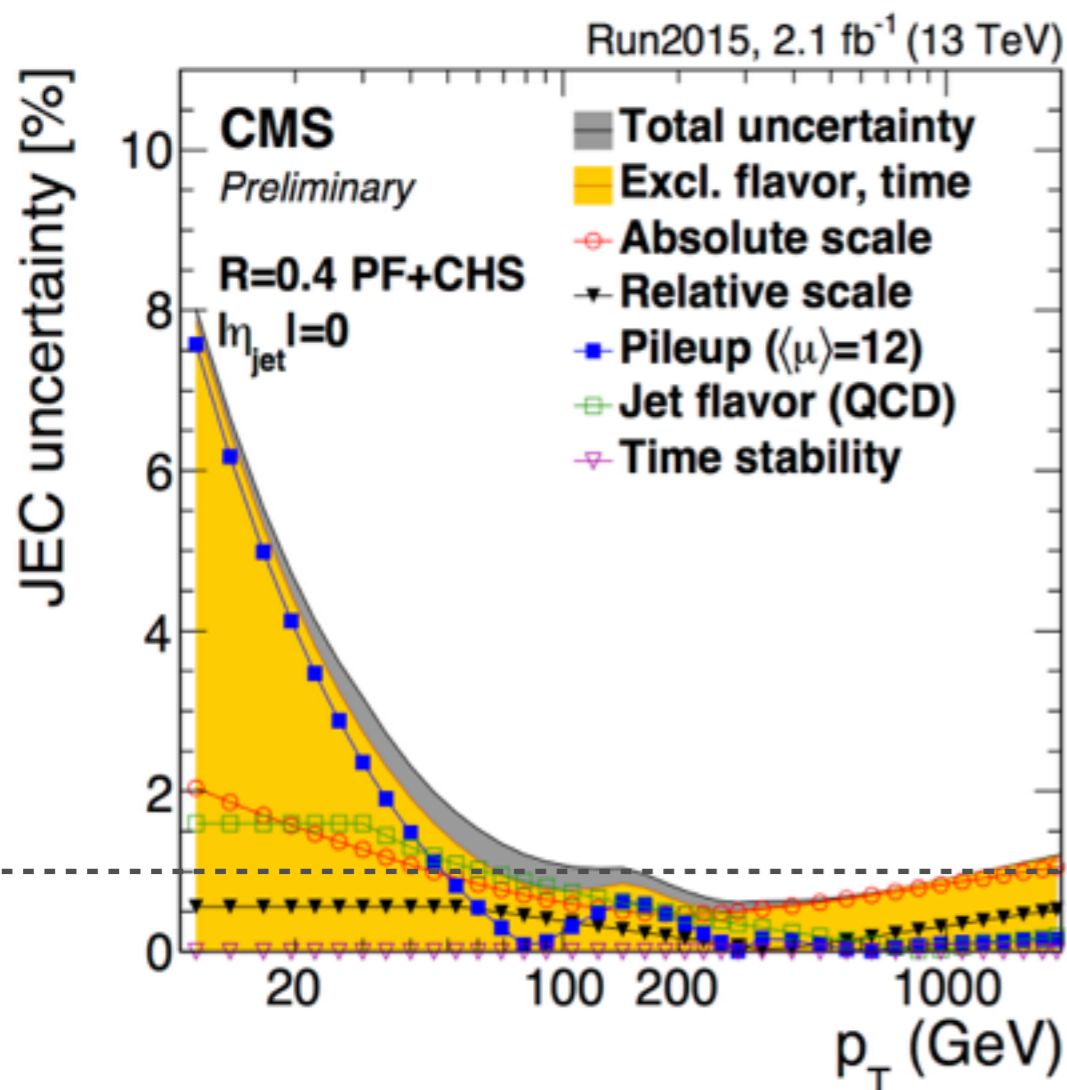
[arXiv: 1703.09665]

# JET CALIBRATION STEPS ILLUSTRATED





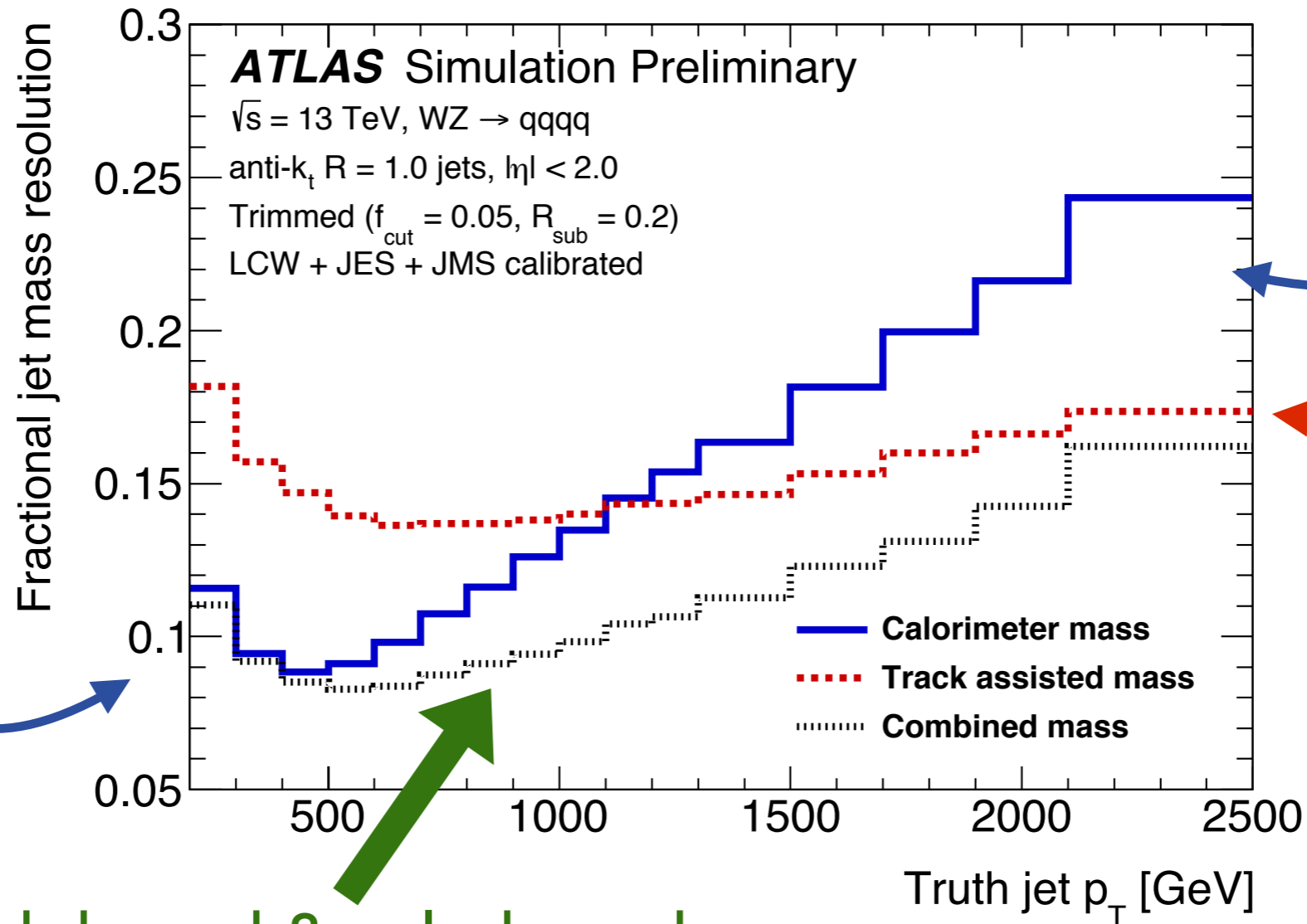
# JET UNCERTAINTIES



**Sub-percent precision reached for O(100 GeV)**

Calo resolves mass well at low  $p_T$

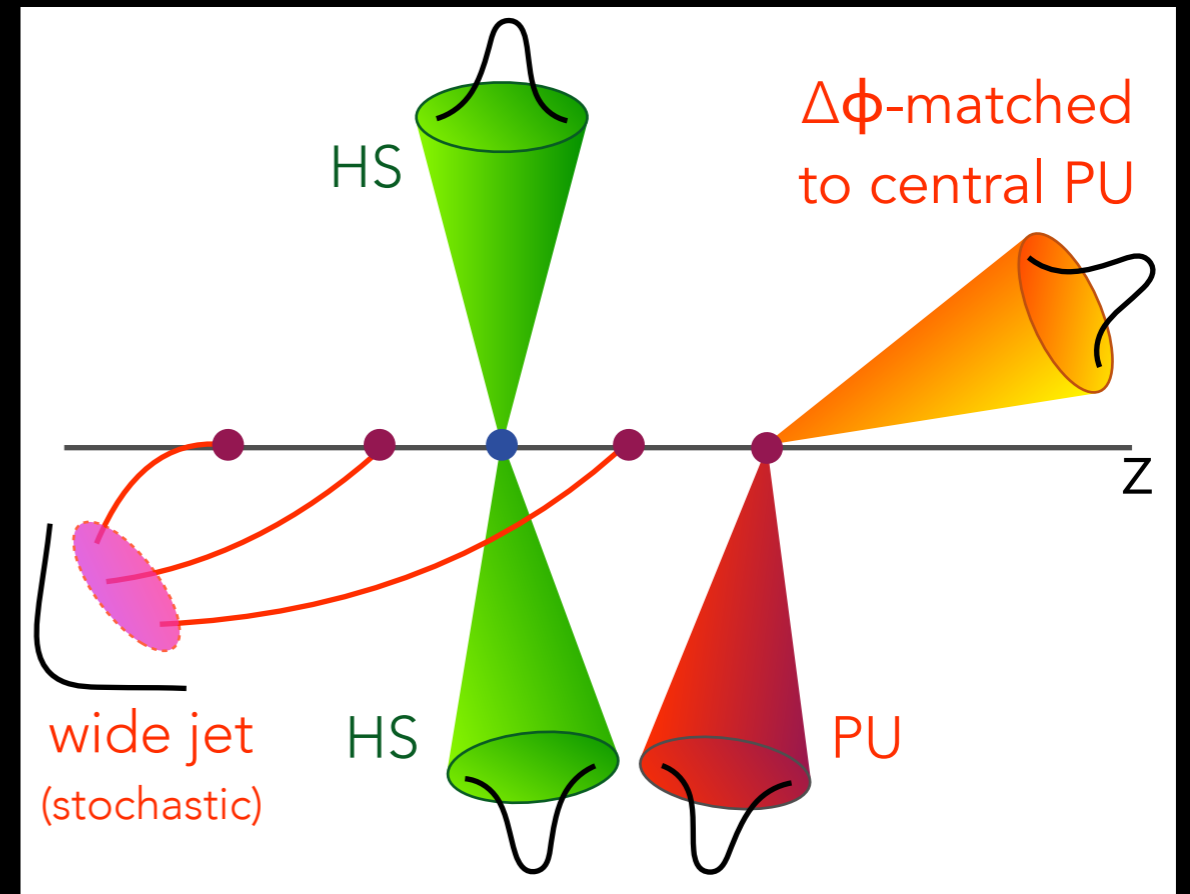
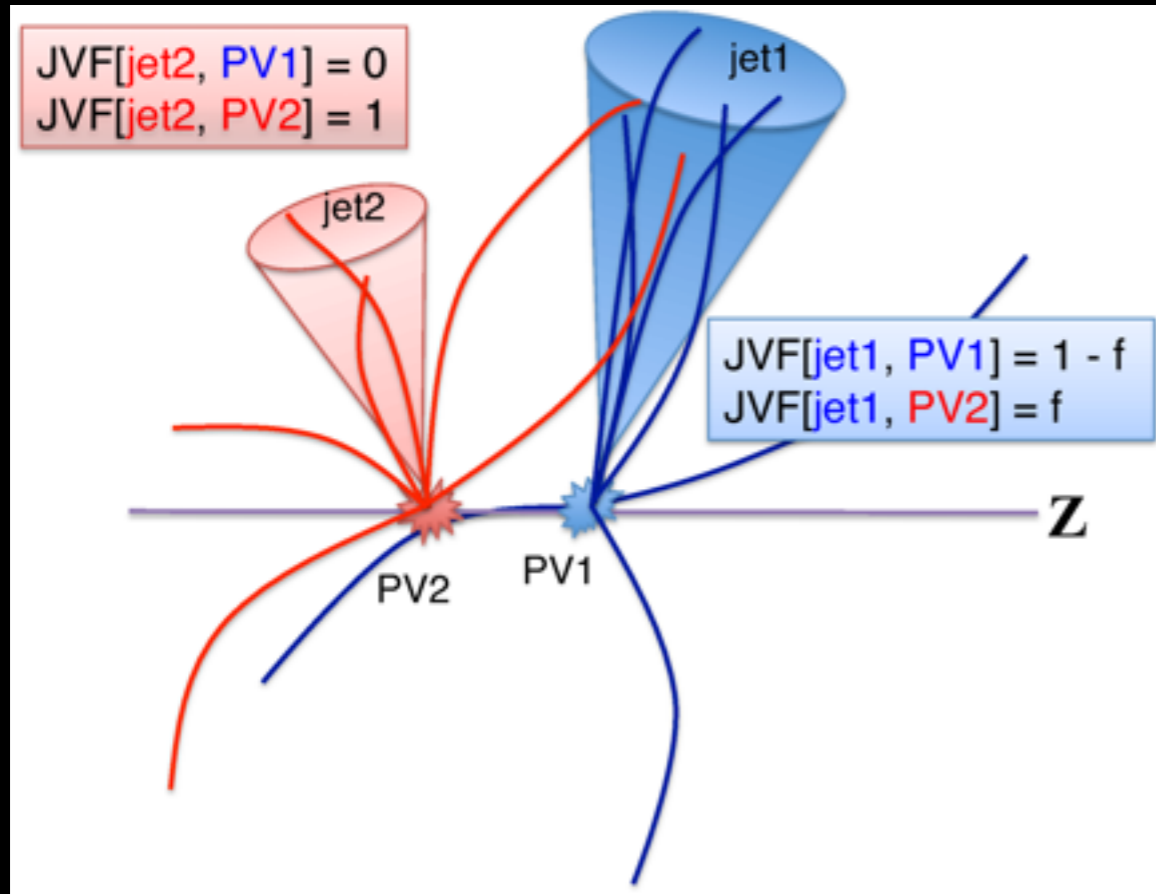
Merged clusters at high  $p_T$  obscure substructure



Combine track-based & calo-based with resolution-weighted average for best performance across  $p_T$  spectrum

Recover with track-jet mass, scaled by  $p_{T_{\text{trk}}} / p_{T_{\text{calo}}}$

# JET-LEVEL PILEUP SUPPRESSION

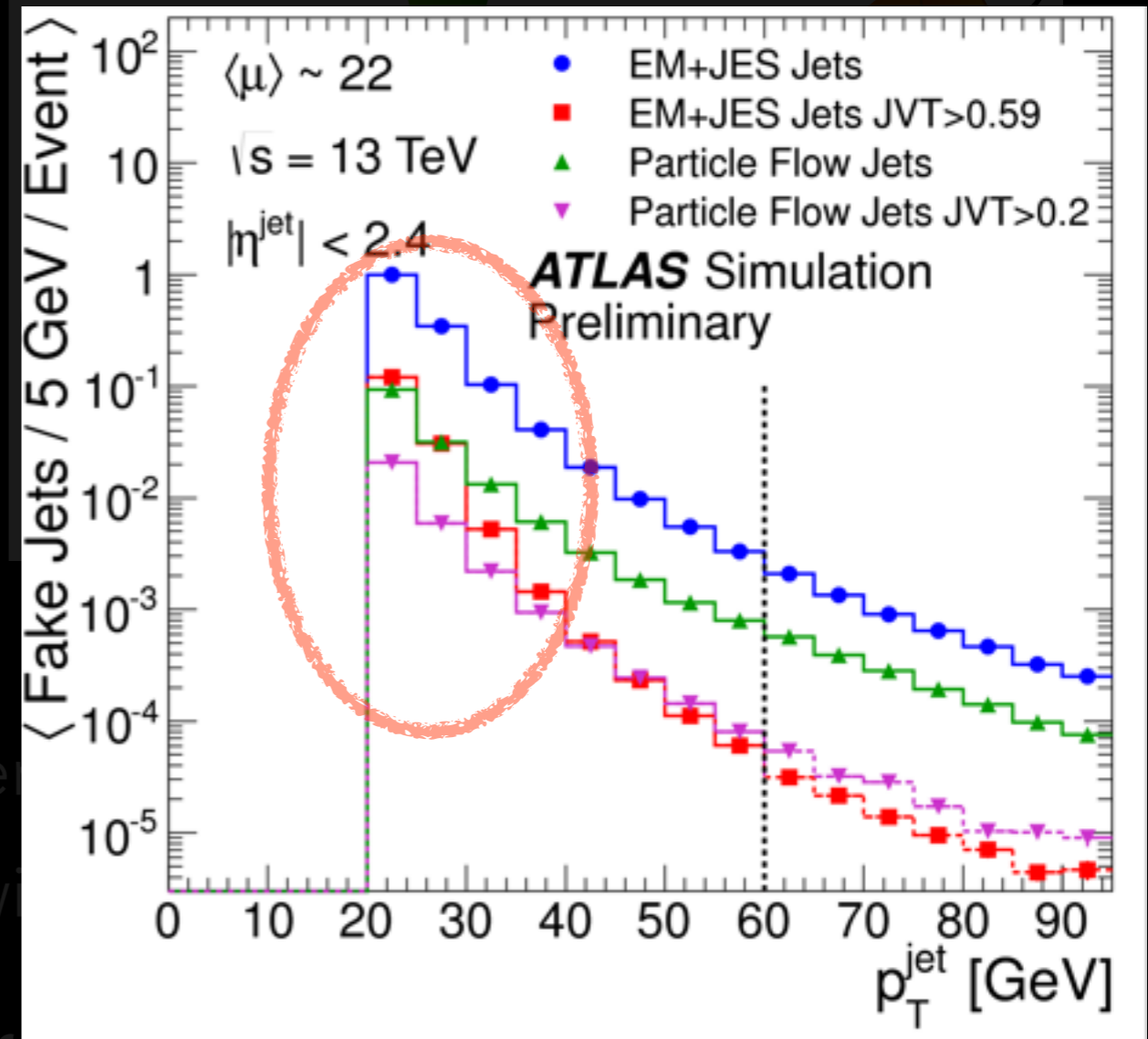
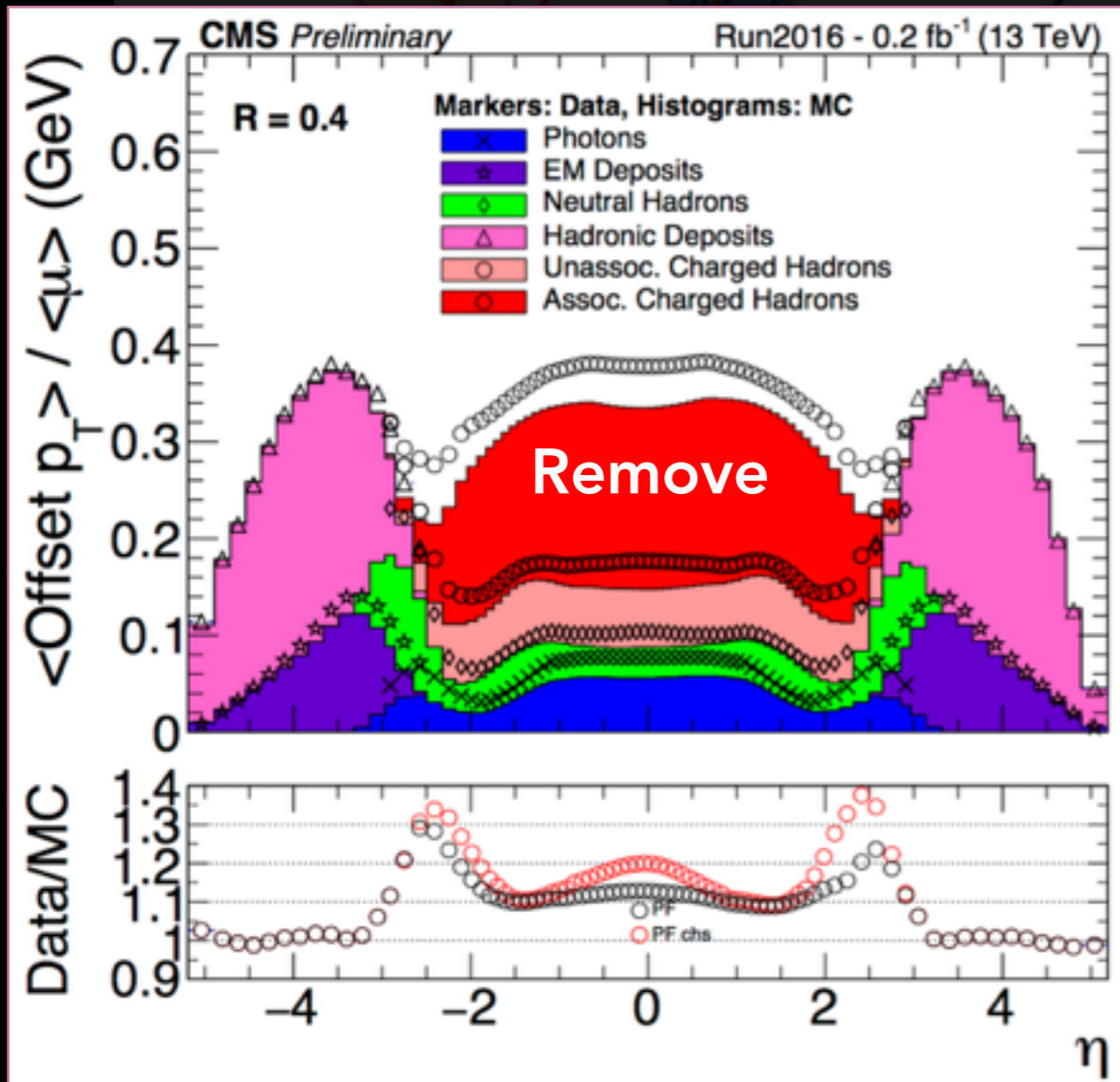


- Track associations — Identify vertex origin
- Jet width & angular variables:
  - wider spread in PU jet constituents
- Central-forward matching tags PU outside tracker



# JET-LEVEL PILEUP SUPPRESSION

Low  $p_T$  **PFlow** rejection equal to **Calo+JVT**, **PF+JVT** equal/better at  $p_T > 40$  with higher hard-scatter efficiency



PFlow+CHS reduce pileup at source.

Jet-level cuts still needed, achieve better suppression.

# MISSING TRANSVERSE MOMENTUM

[EPJC77 (2017) 241]

[CMS PAS-JME-16-004]



Topo-clusters + tracks  
PF tracks + clusters

PF candidates  
PF + PUPPI

BASIC INPUTS

Custom analysis selection  
Electrons/photons  
Muons    Tau jets

PARTICLE CORRECTIONS

EM/PF+JES jets  
JVT, fJVT

JET CORRECTIONS

Track-based Soft Term

RESIDUAL CORRECTIONS

In progress!

SIGNIFICANCE

CMS global event reco classifies all particles

Jet Energy Corrections

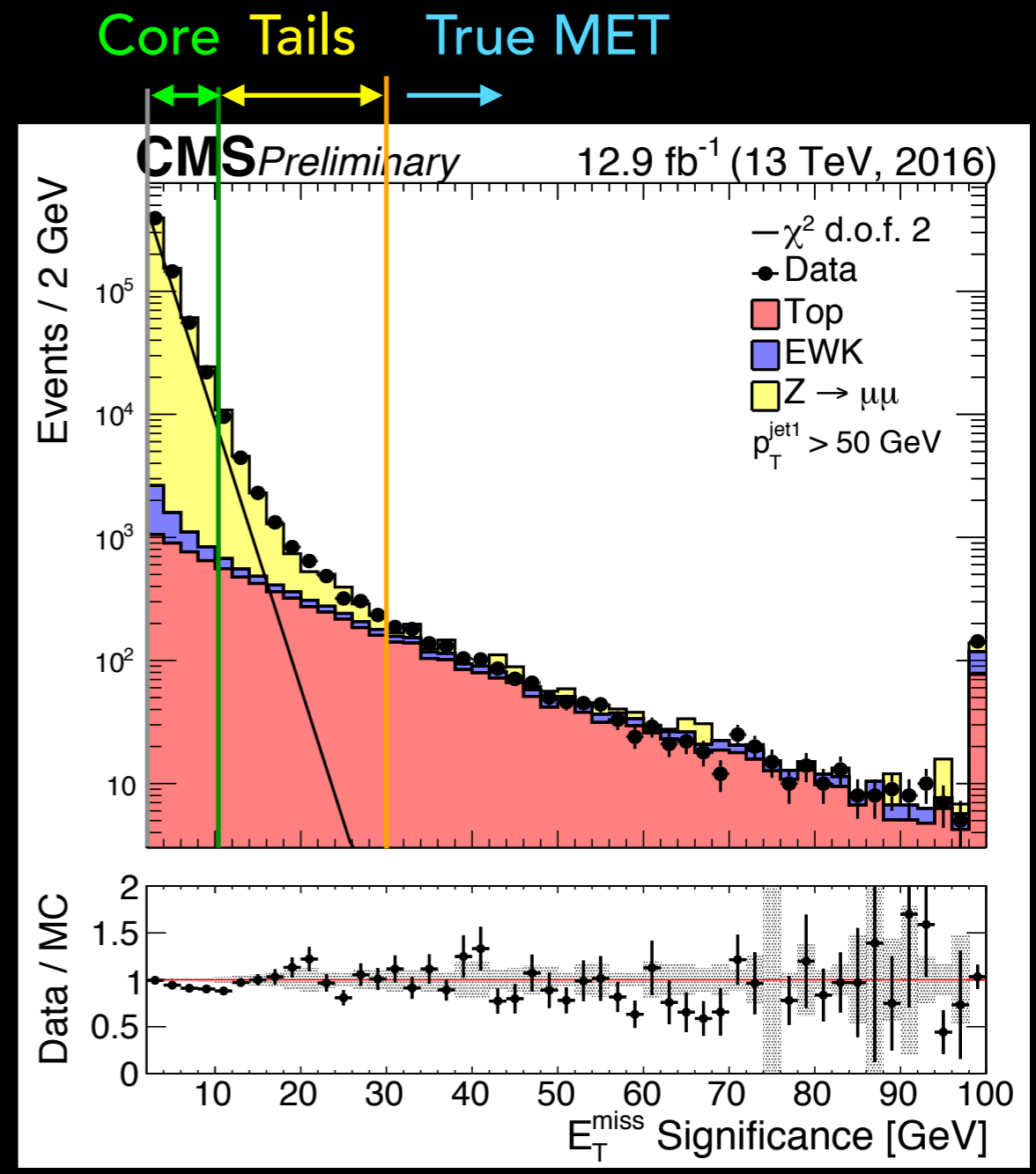
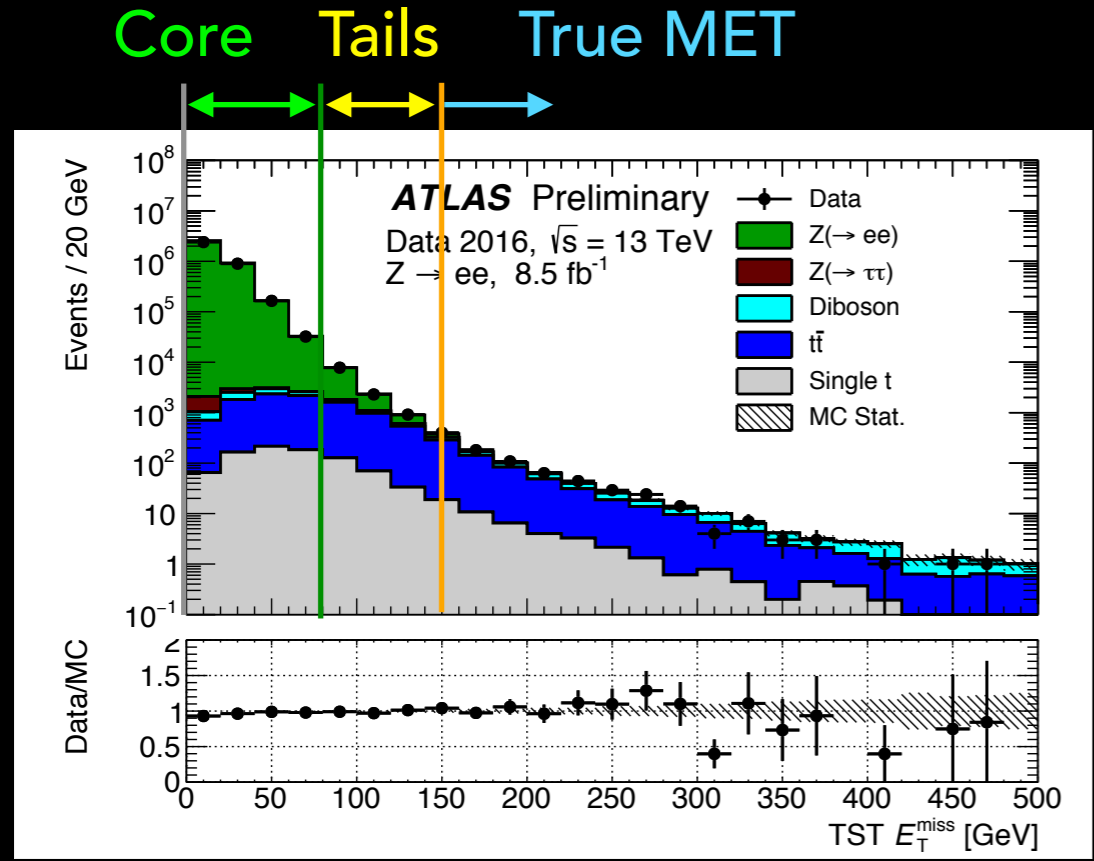
MVA Calibration (some analyses)

Log-likelihood ratio

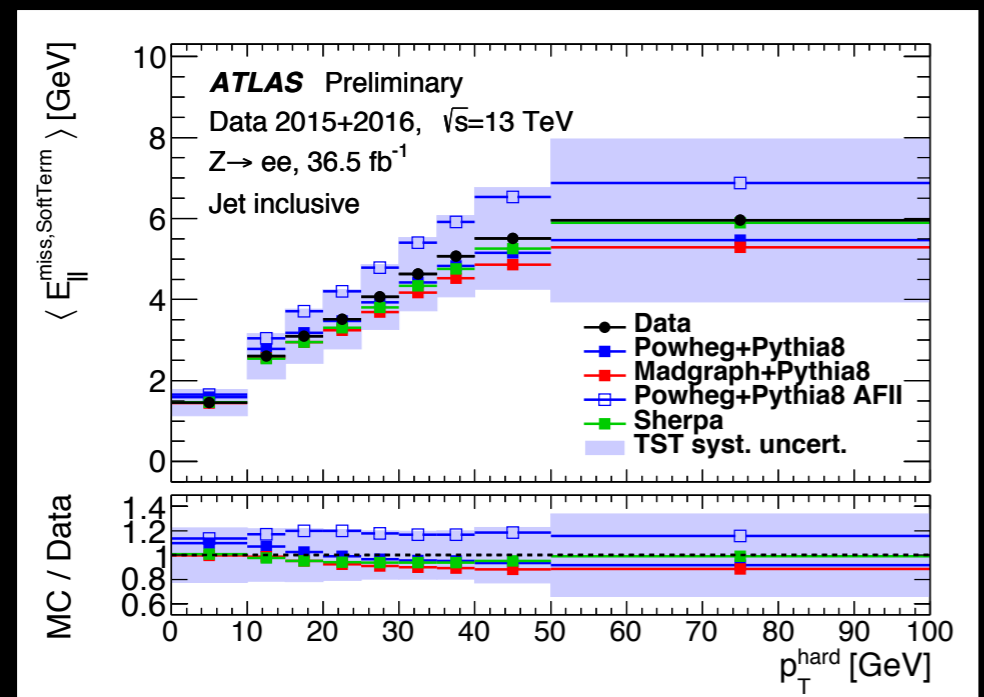
# MISSING TRANSVERSE MOMENTUM

[JETM-2016-008, JETM-2017-001]

[CMS PAS-JME-16-004]



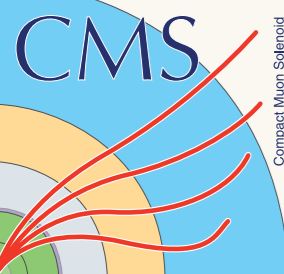
Syst  $\sigma$  from envelope of data/MC differences



Significance calculation effectively separates real & fake MET

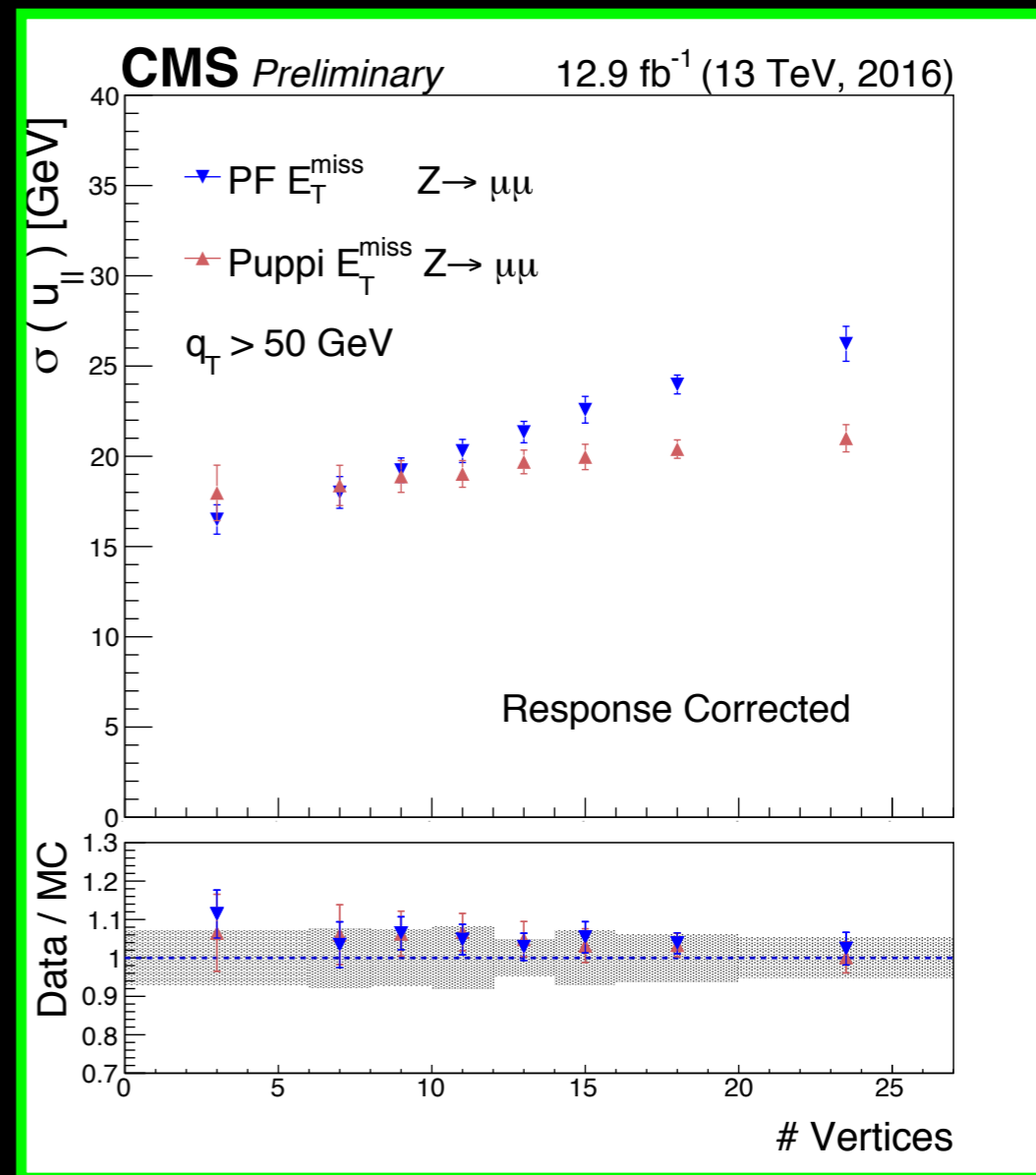
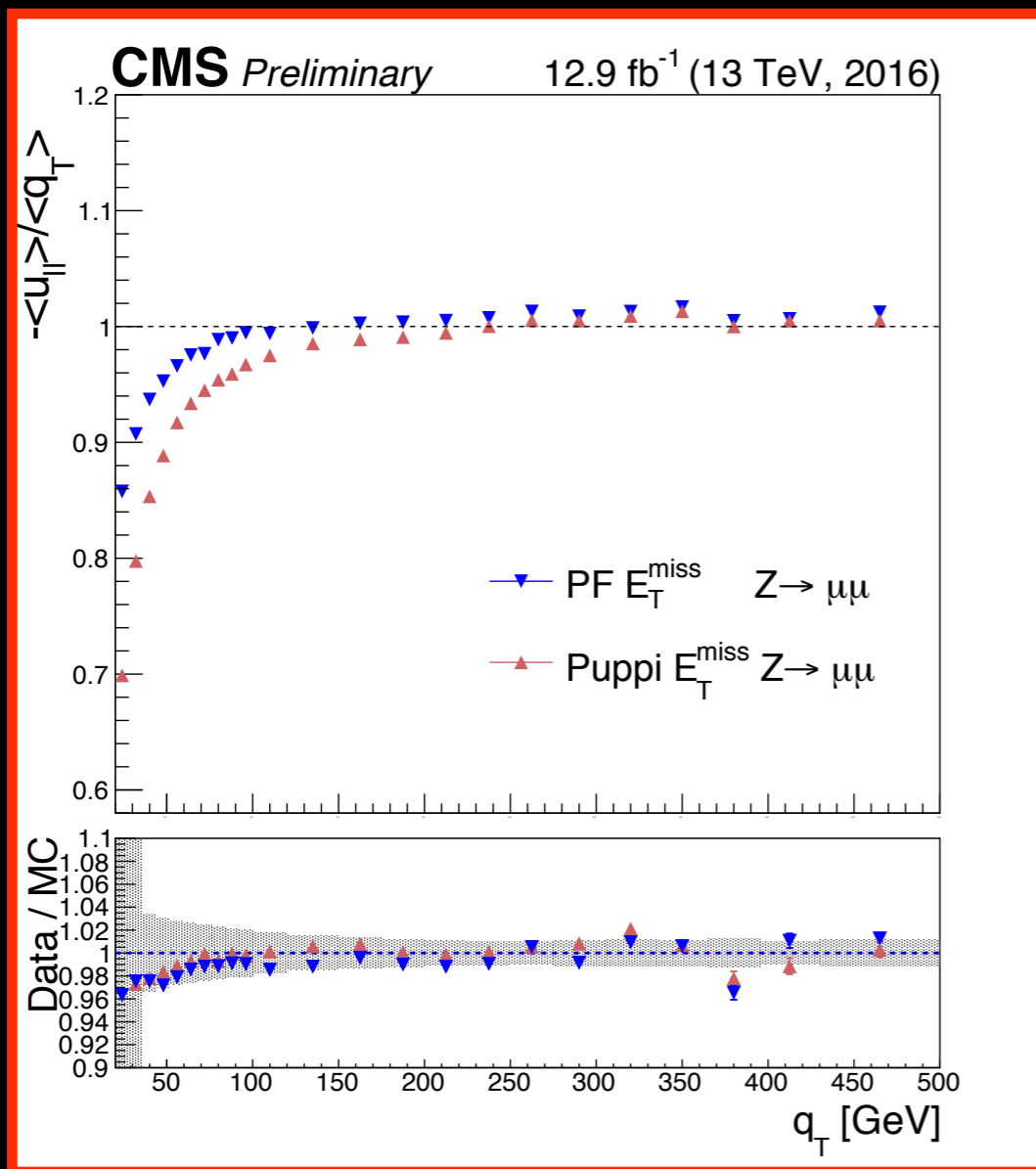
Sherpa 2.2.1 soft modelling improvements crucial





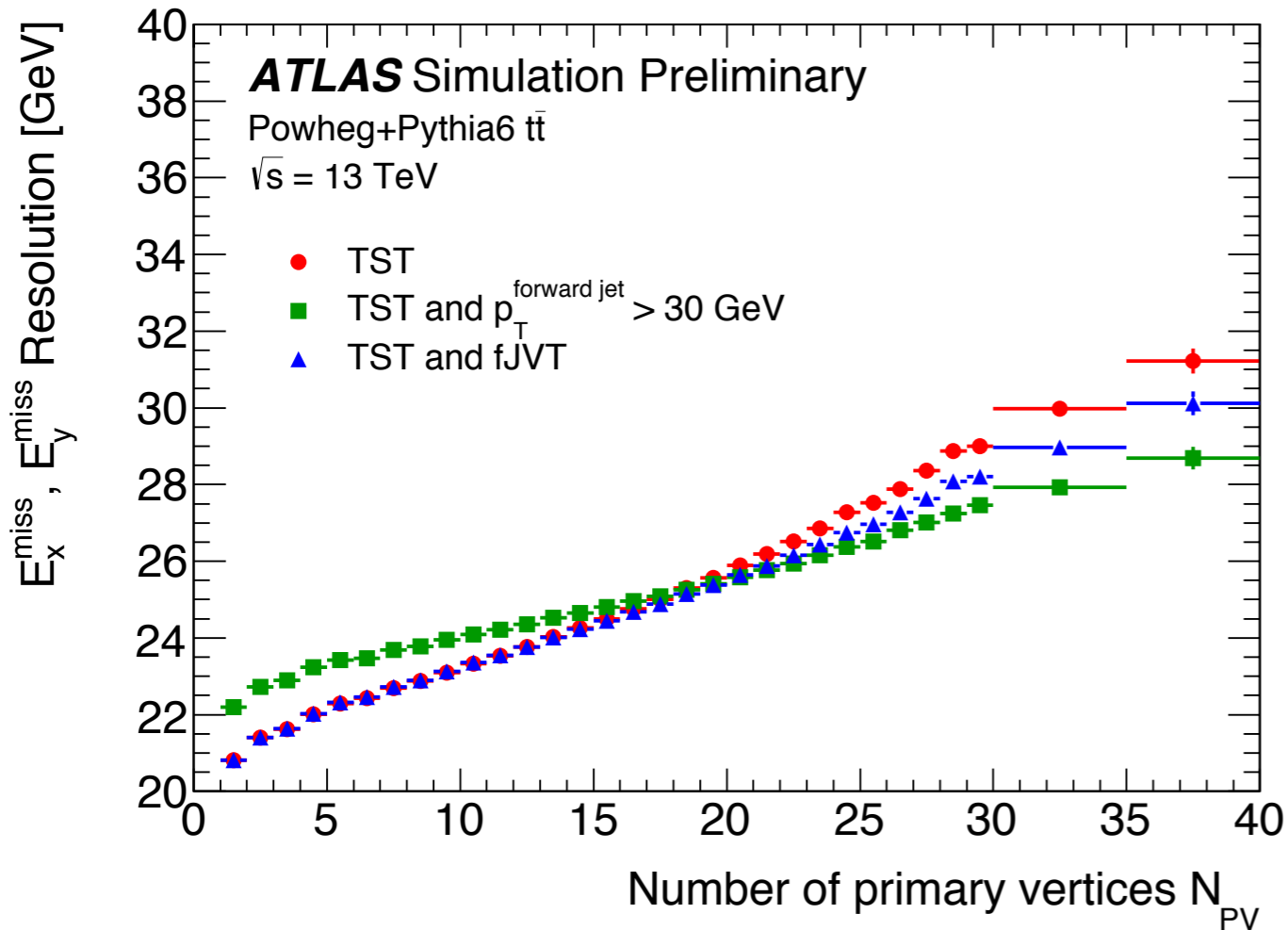
# MISSING TRANSVERSE MOMENTUM

PUPPI filtering **improves resolution with pile-up** at cost of **underestimating hadronic recoil.**

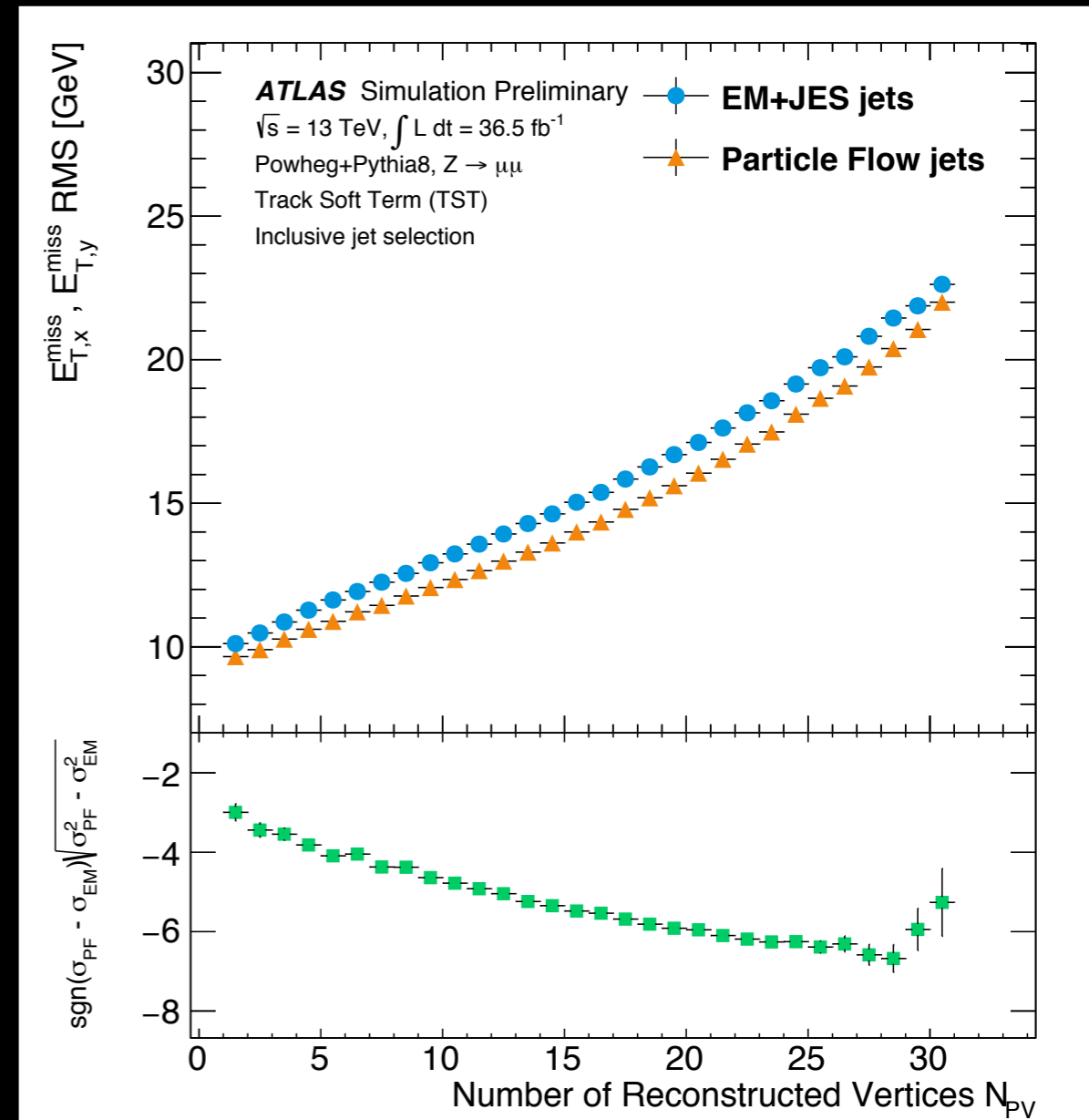


Difficult trade-off between optimising for scale and optimising for resolution.  
Needs to be driven by physics goals.

## Forward pileup suppression has large impact



Indiscriminate cuts cause scale defects,  
need dedicated pileup taggers.



Improvements seen with PFlow

# JET & BOOSTED-OBJECT TAGGING

CMS: [PAS-BTV-15-002](#),  
ATLAS: [PUB-FTAG-2016-002](#) (in prep)

## Identify colour charge of primary parton

Track multiplicity

QUARK-  
GLUON

Constituent multiplicity  
Jet angular opening  
Jet fragmentation distribution

## Distinguish N-body heavy object decay from QCD radiation

W/Z  
BOSON

H BOSON

Double-b-tagging

N-subjettiness  
Energy correlation functions  
Splitting scales  
HepTopTagger  
Jet Mass

TOP  
QUARK



CMS PAS JME-16-003



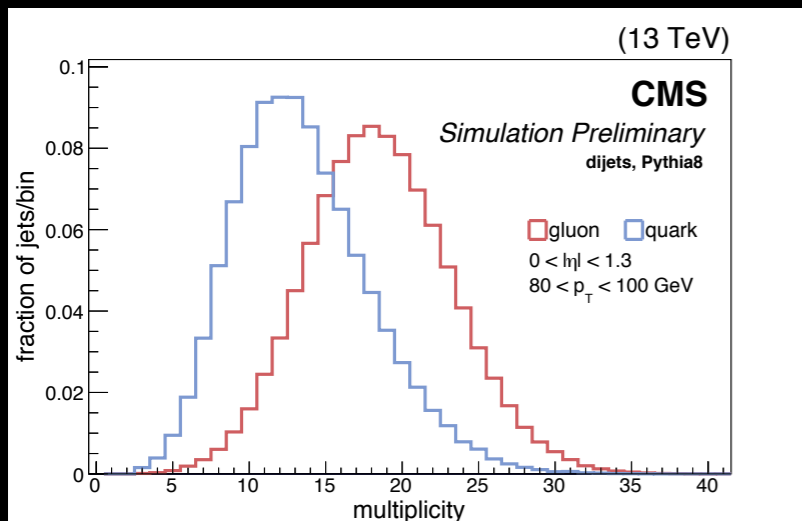
[JETM-2017-004](#), [JETM-2017-005](#)  
PUB in preparation



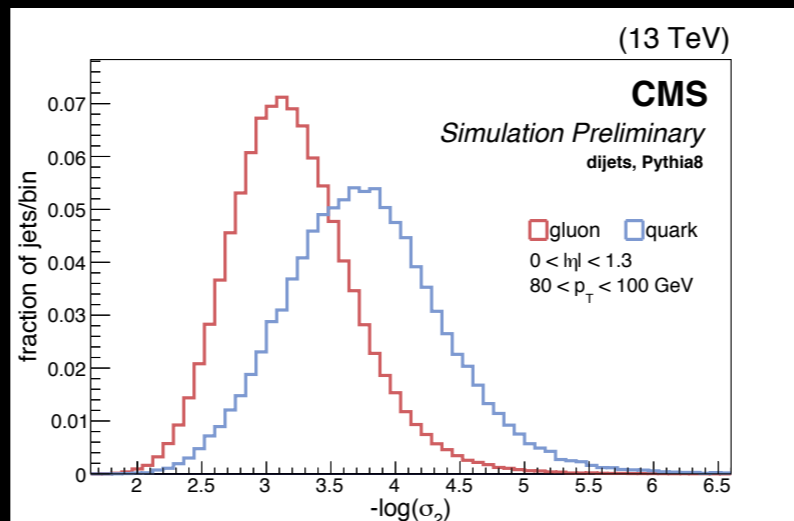
# QUARK-GLUON TAGGING



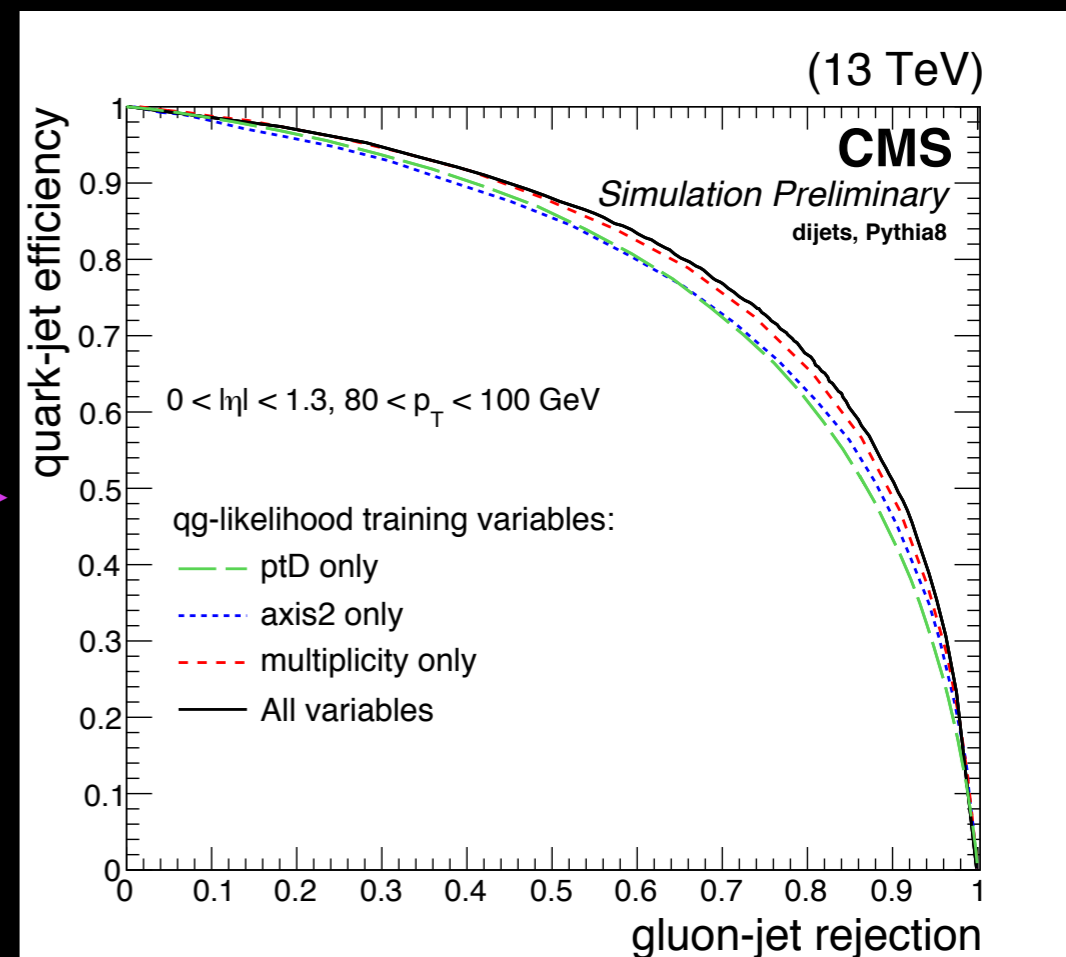
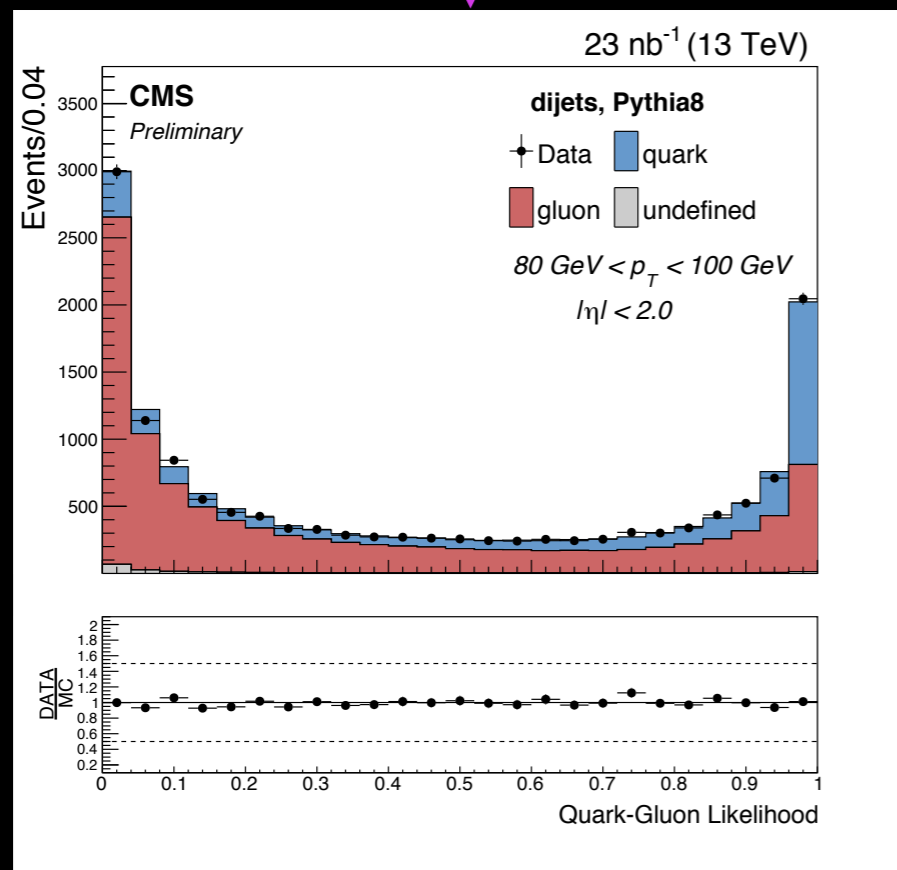
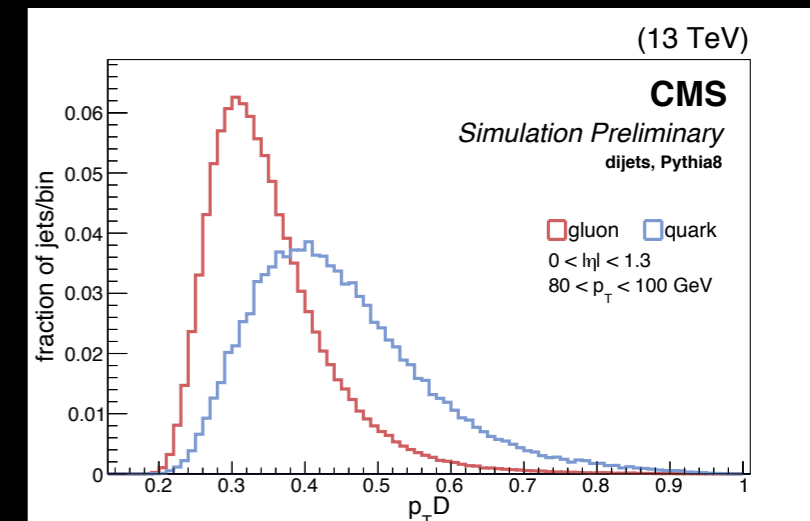
## Constituent multiplicity



## Jet opening angle

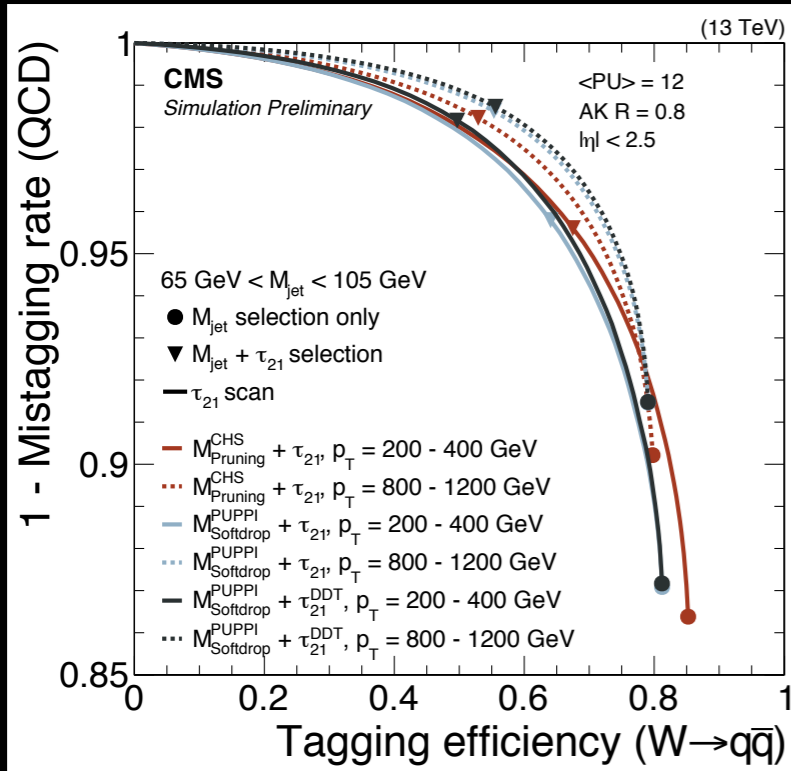


## Fragmentation distribution



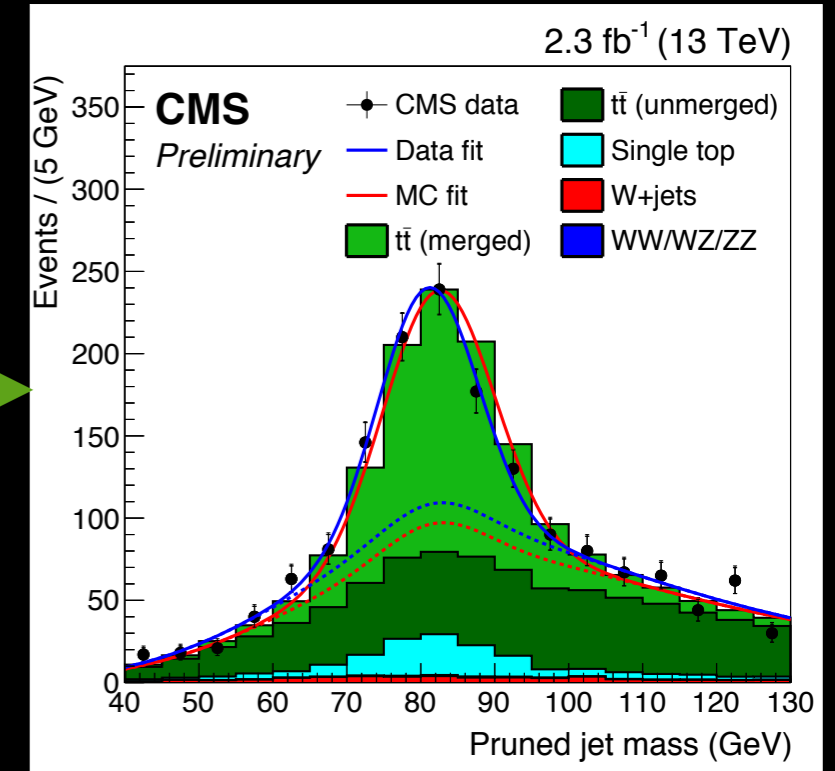
Likelihood capitalises on broader, higher-multiplicity gluon-jet radiation pattern



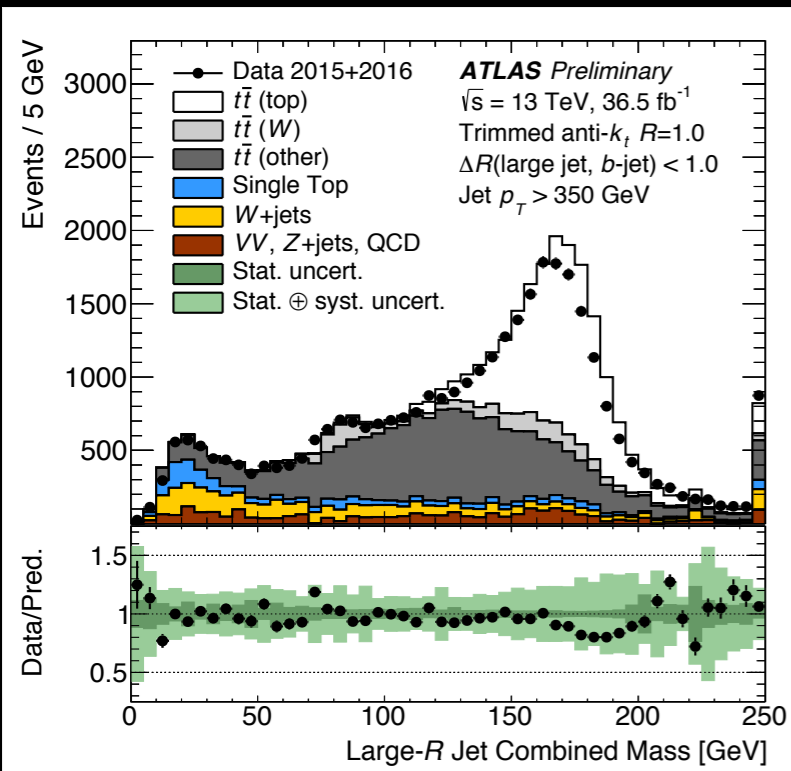


Various strategies studied for PU suppression & substructure refinement.

DDT "Decorrelated Taggers" [arXiv: 1603.00027] reduce pT-dependence of substructure selection.

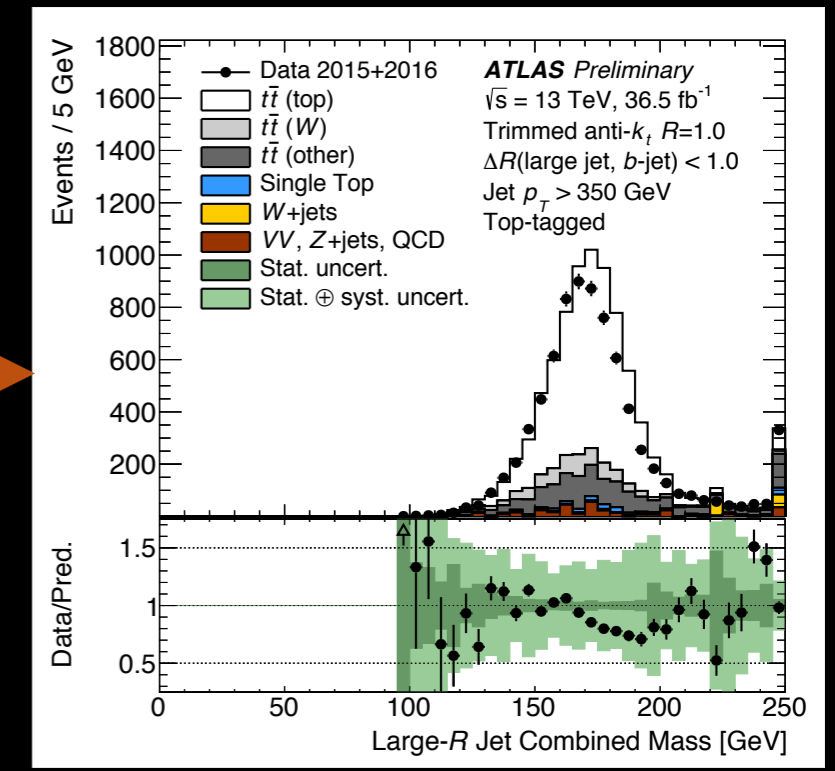


TOP QUARK TAGGING



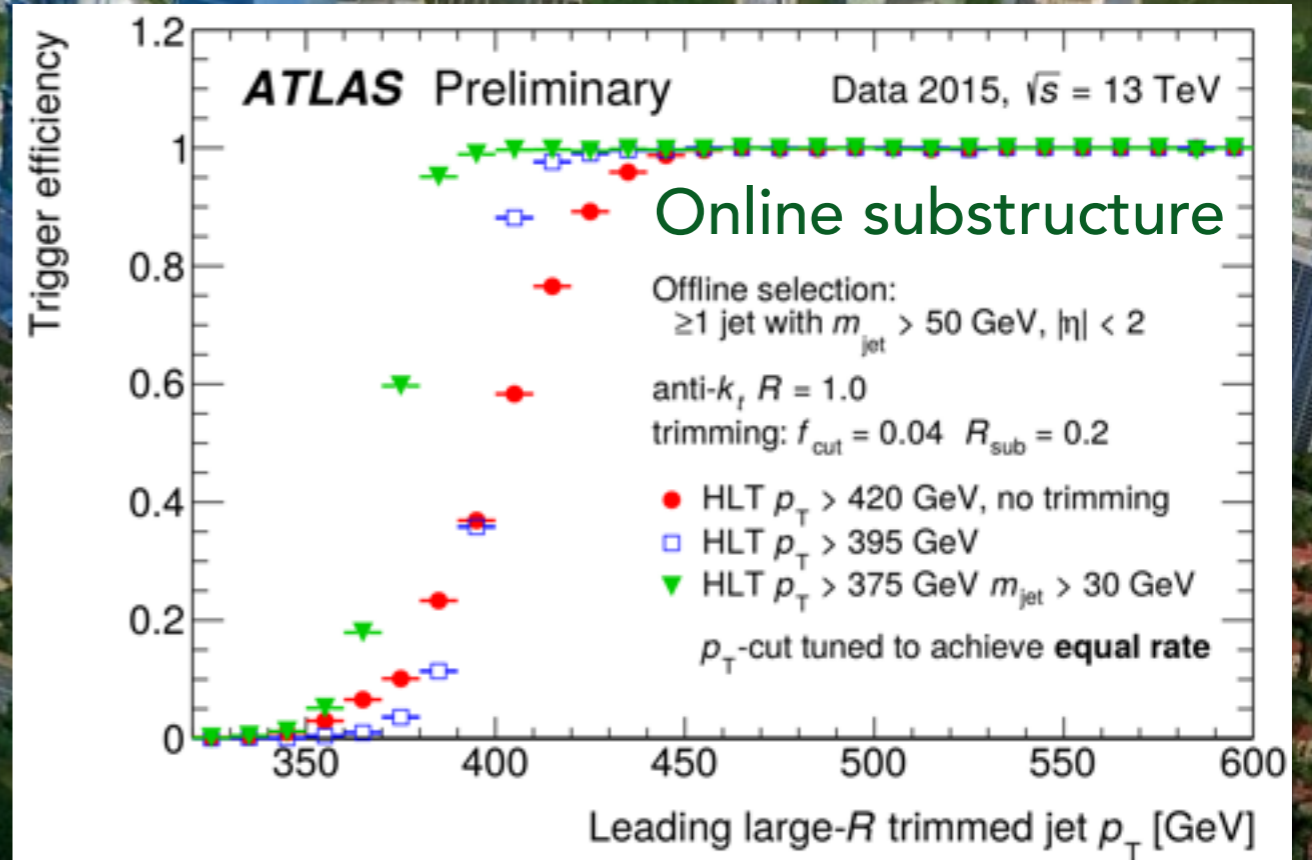
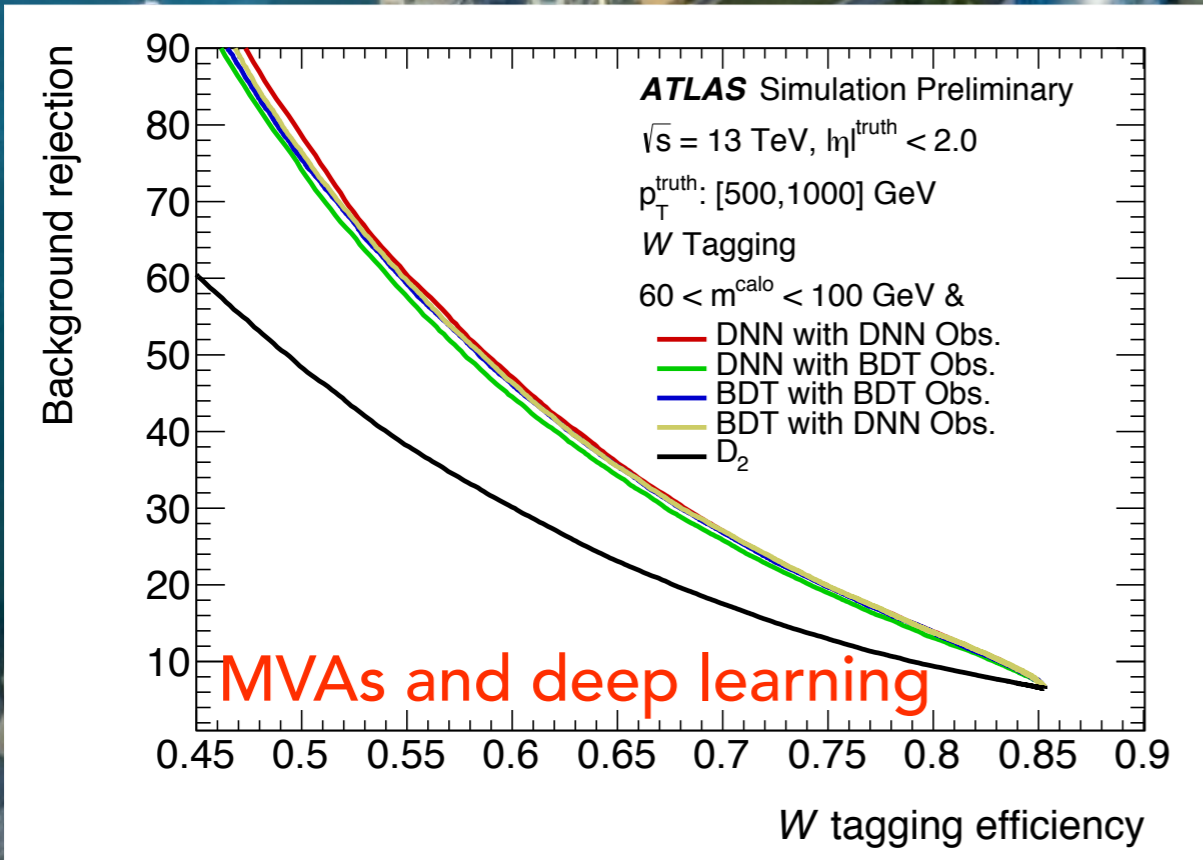
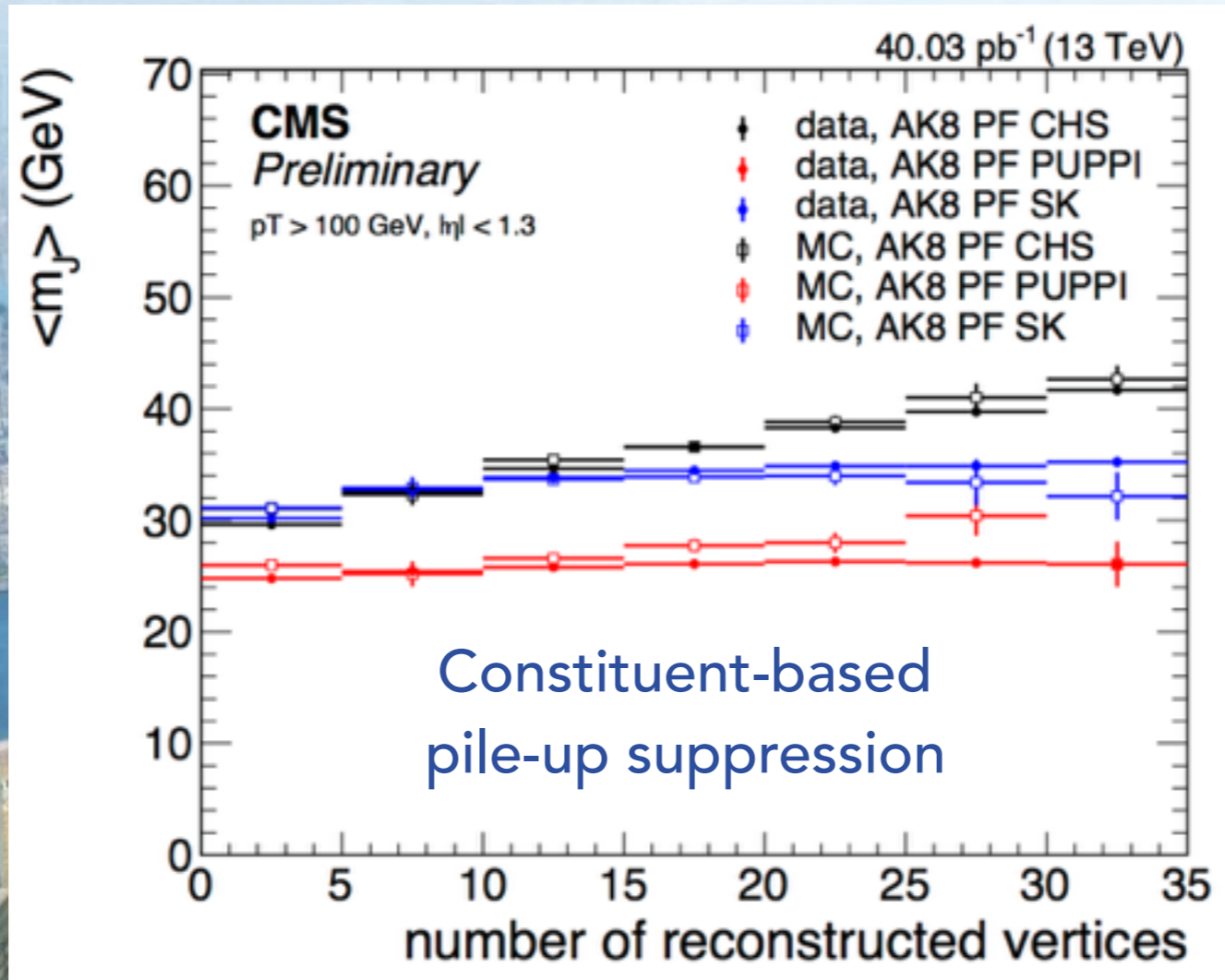
New tagger optimisation strategy: focus on fully-contained top jets.

Flat-pT training ensures good performance in wide kinematic range.



# A TASTE OF THINGS TO COME

- Run 3 & HL-LHC
  - Software challenges: high-throughput & trigger reconstruction
  - Physics challenges: pileup, pileup, pileup!
- ATLAS:
  - PFlow in analysis: multijet SUSY, ZH, ttH...?
  - Jet substructure & advanced calibration in triggers
- CMS:
  - Advanced trigger-level pile-up suppression
  - Deep-learning jet applications





**THE JETS ARE OUT THERE!**



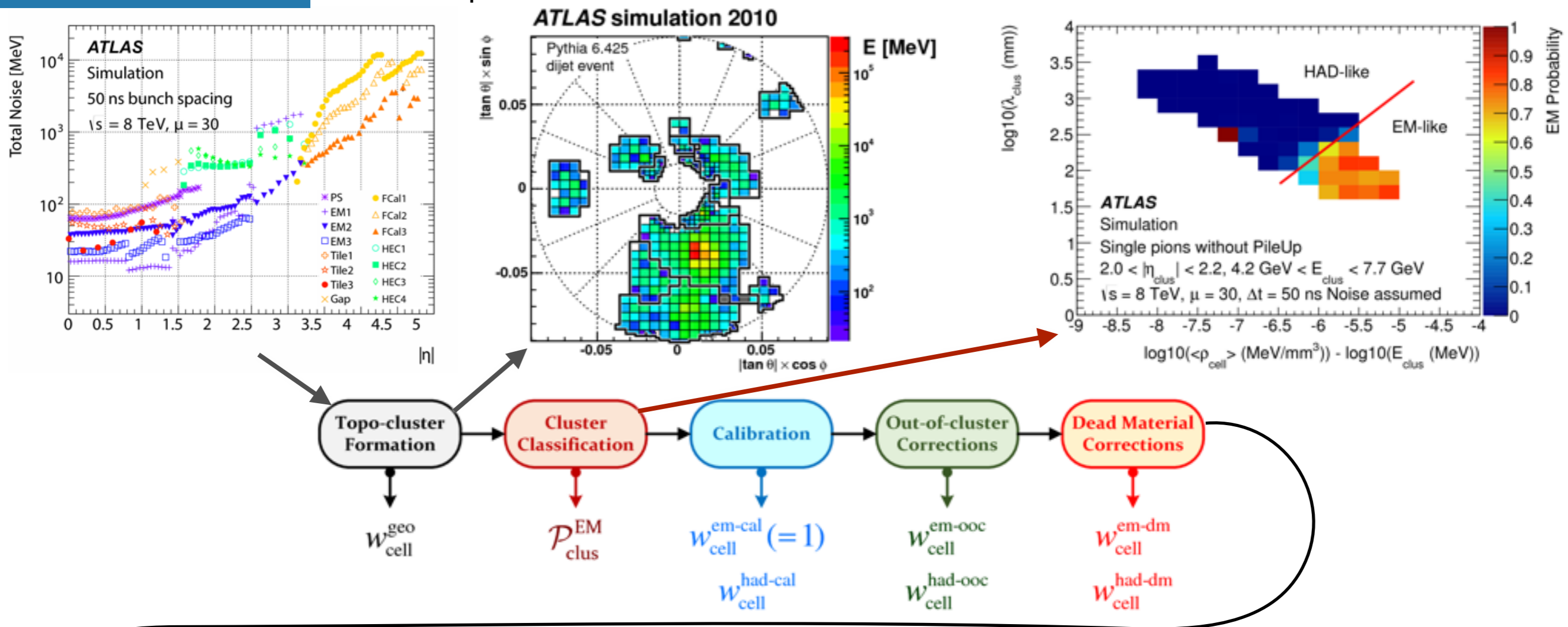


# BACKUPS

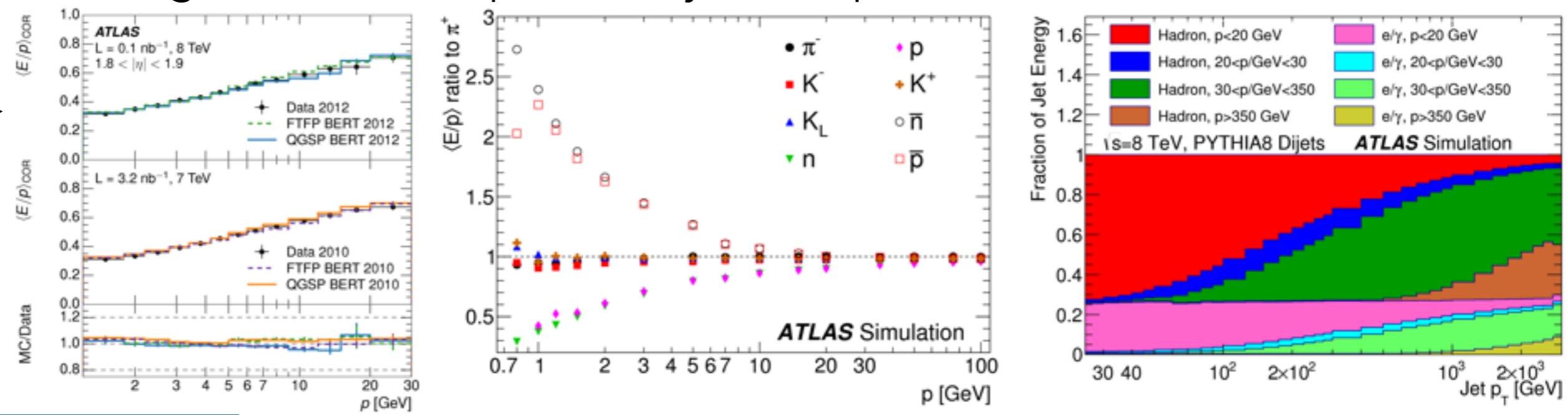


Penggunaan **Jet Backup**  
untuk Restore Konten  
Website

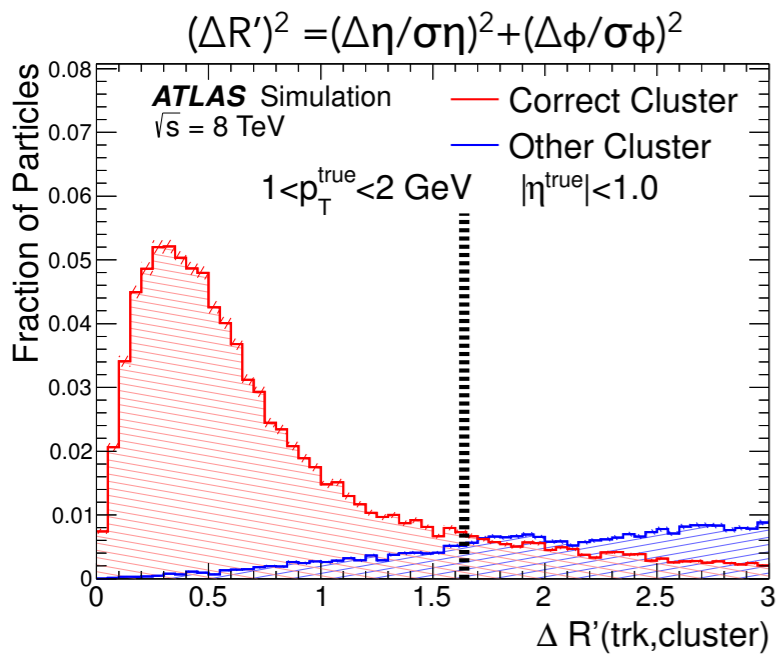
JET INPUTS



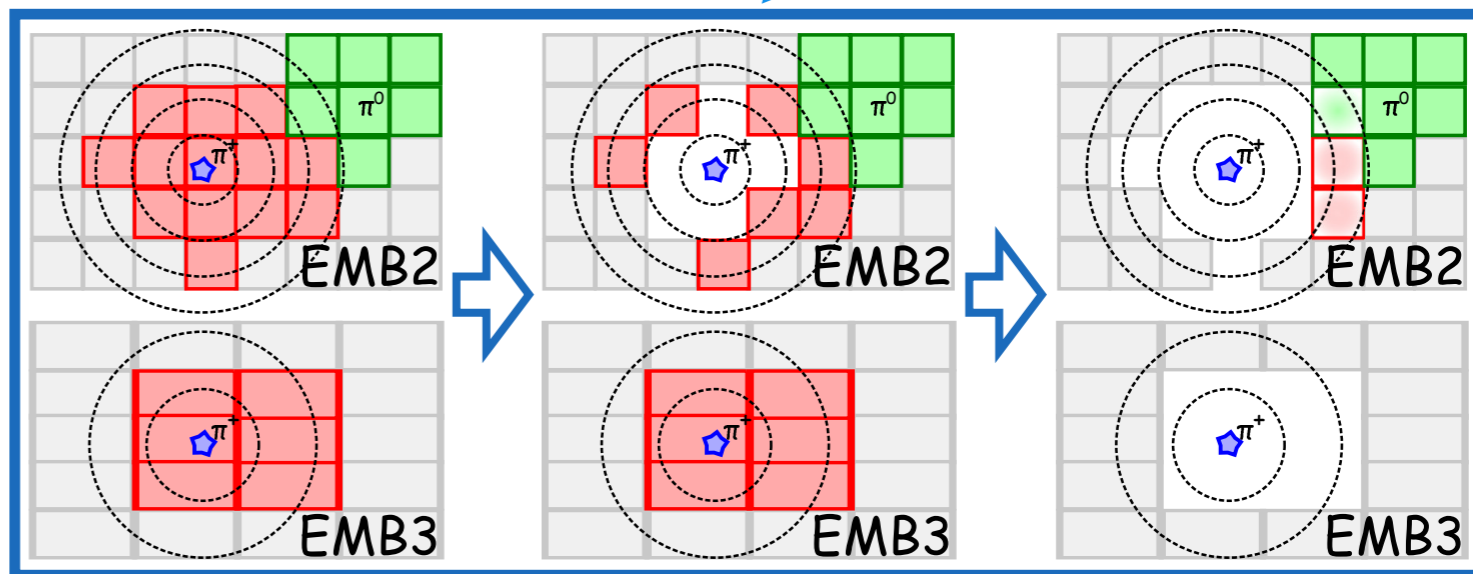
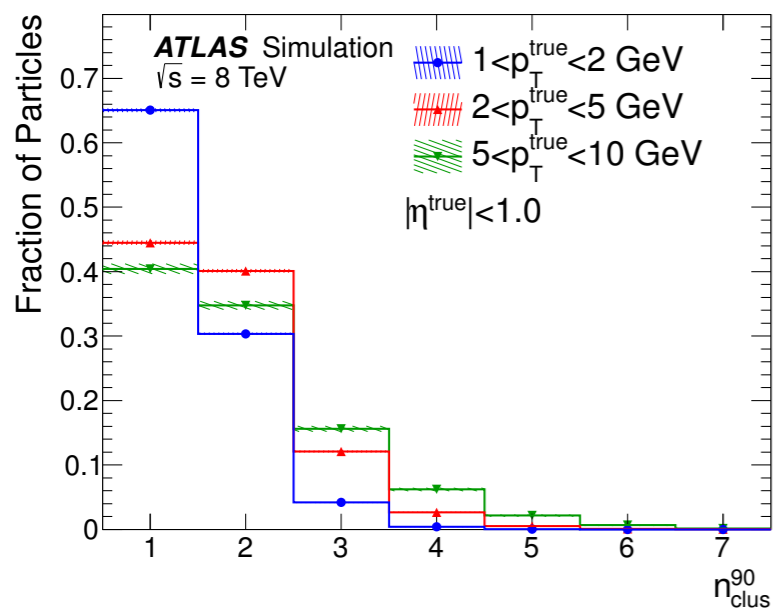
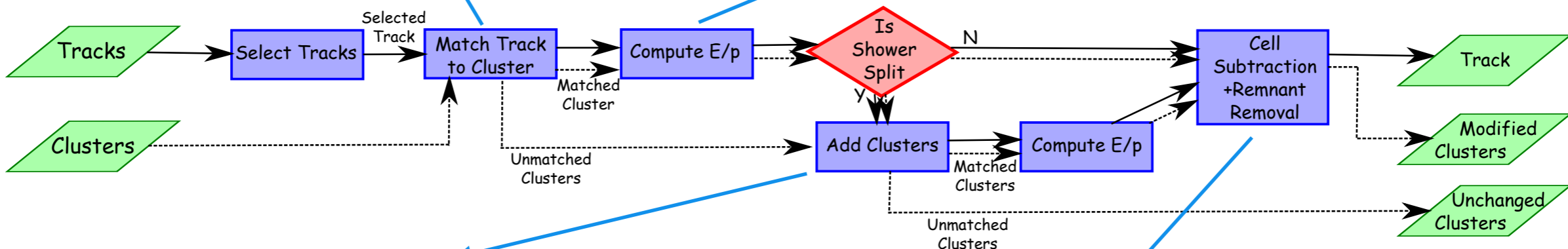
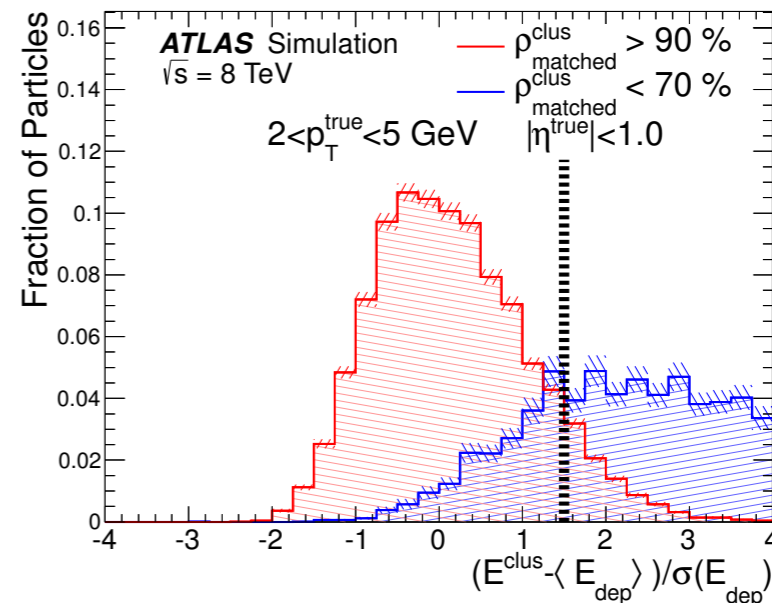
## Single-hadron response & jet composition measurements



# PARTICLE FLOW @ ATLAS

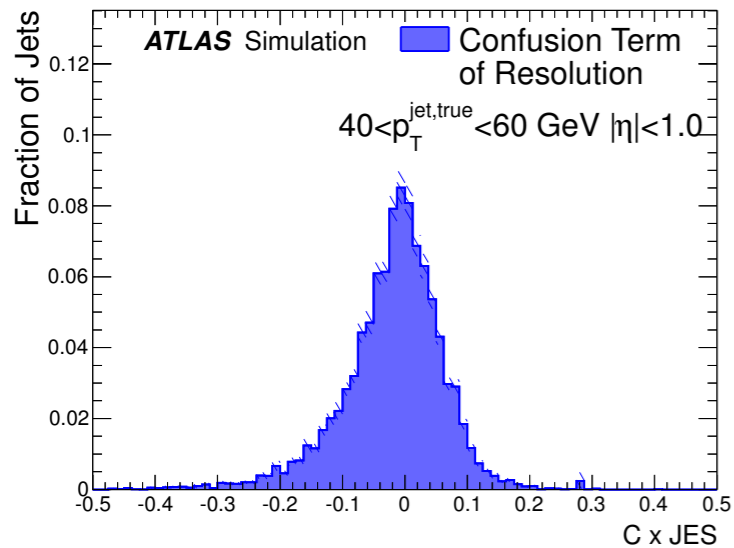
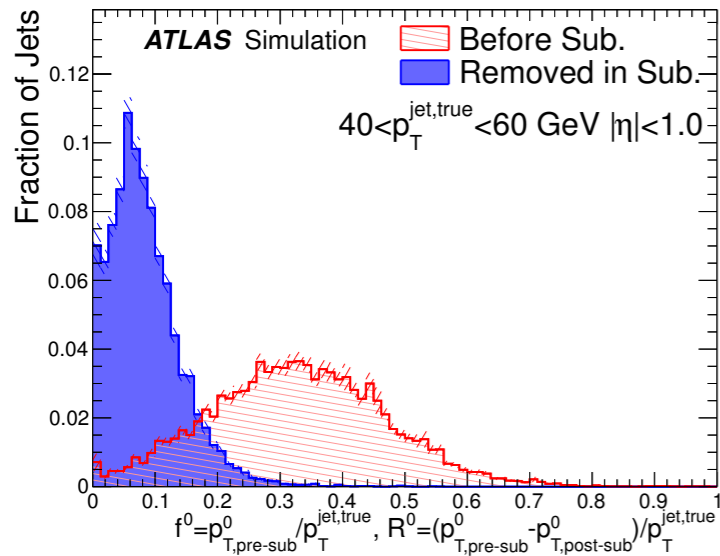
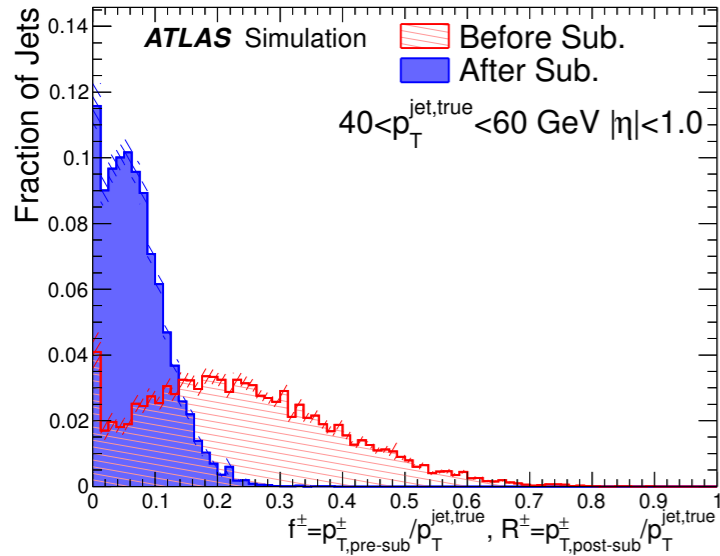


Optimised during LS1 to accurately subtract calorimeter energy, prevent double-counting wrt tracker momentum measurement.



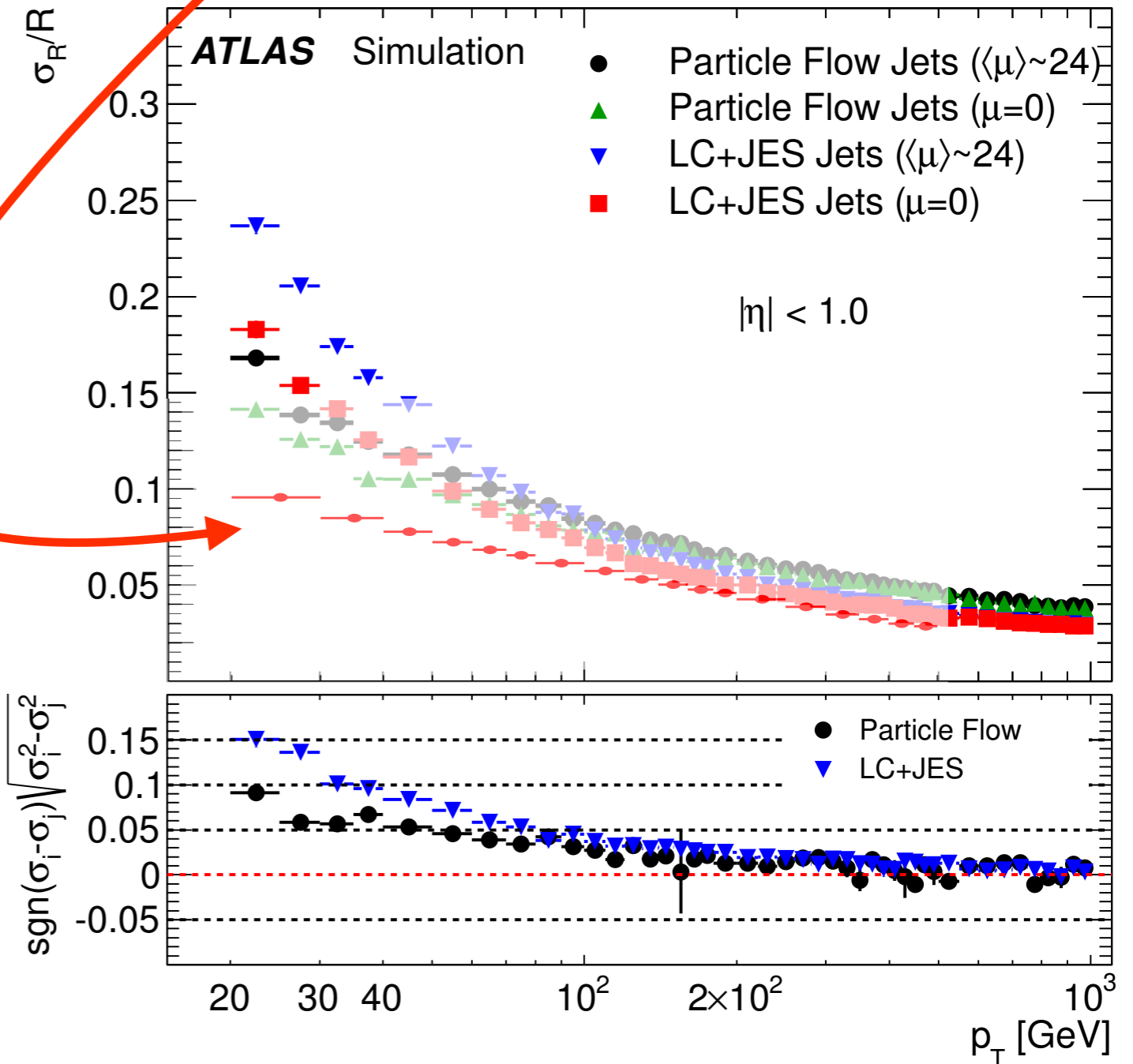


# PARTICLE FLOW @ ATLAS

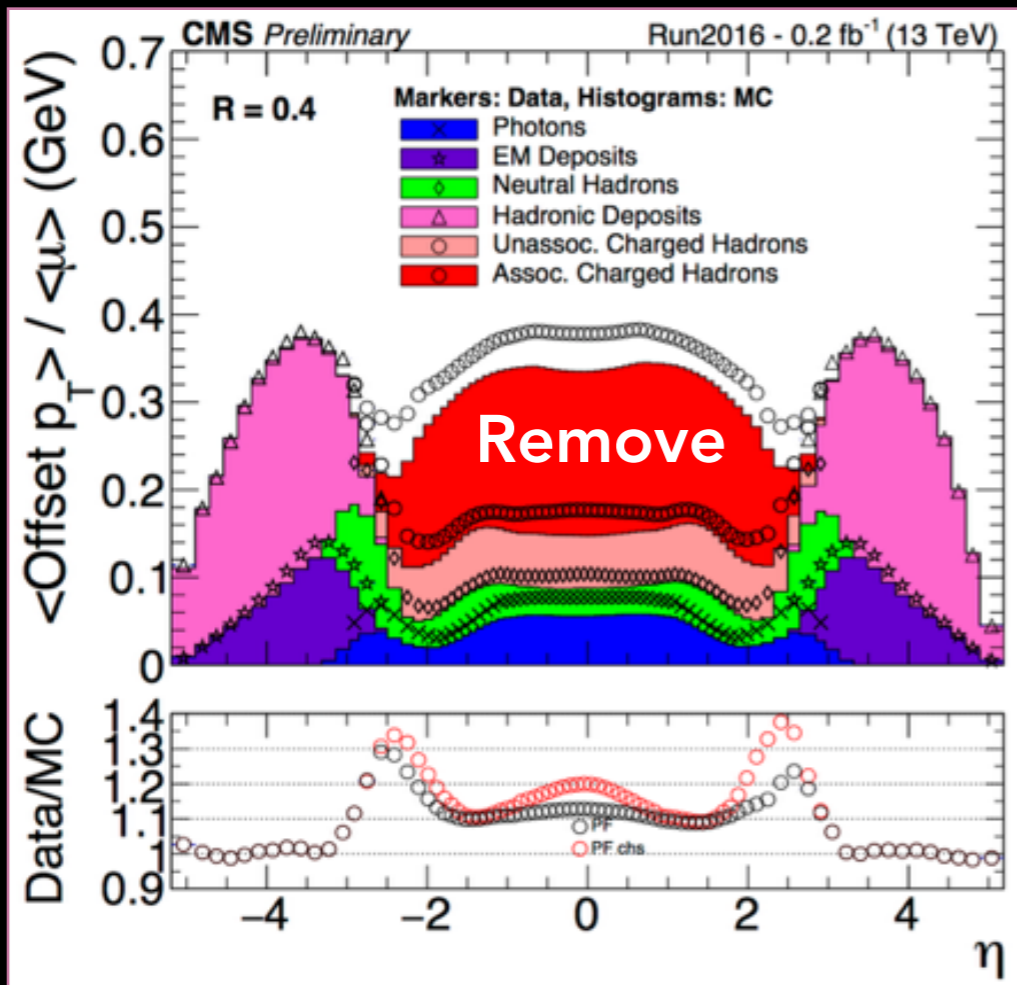


With truth info, checked impact of subtraction mistakes on resolution.

**Confusion  $C = f^\pm + f^0$**



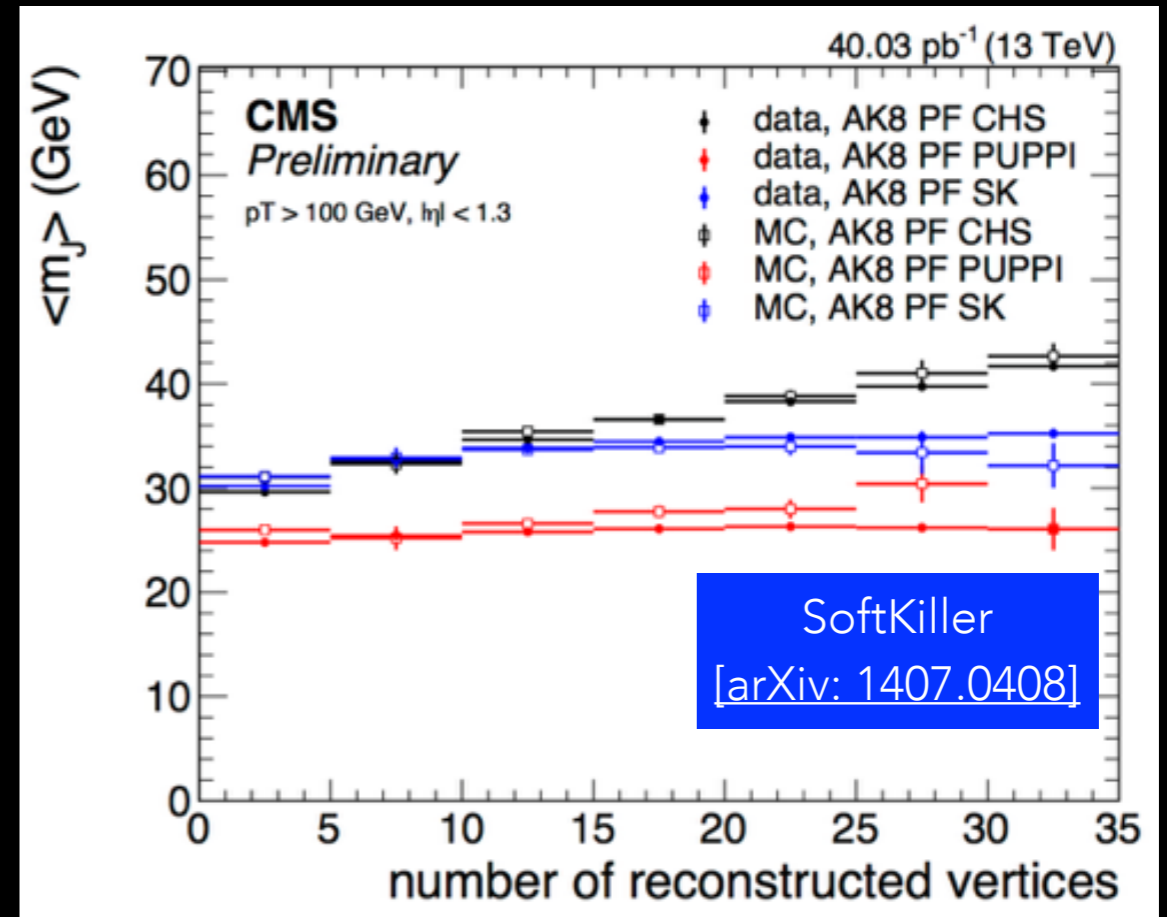
# CONSTITUENT PILEUP SUPPRESSION



## Charged Hadron Subtraction

(used with PFlow):

- Associate tracks to origin vertices
- PF charged hadrons from pileup vertices discarded before jet-finding.



## PileUp-Per-Particle-Identification

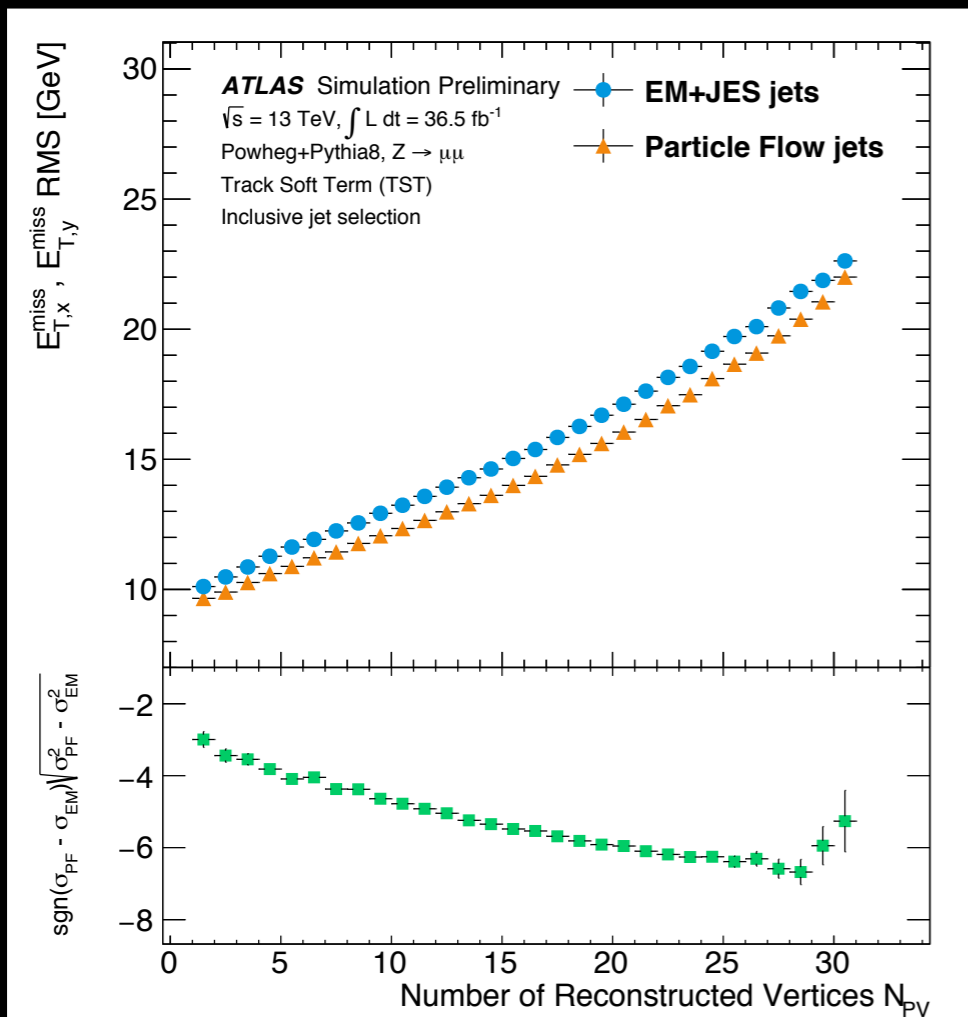
[arxiv: 1407.6013]:

- Weight particles by pileup probability
  - Central region: prefer high local  $p_T$  density of PV charged particles
  - Forward region: prefer high local  $p_T$  density of particles

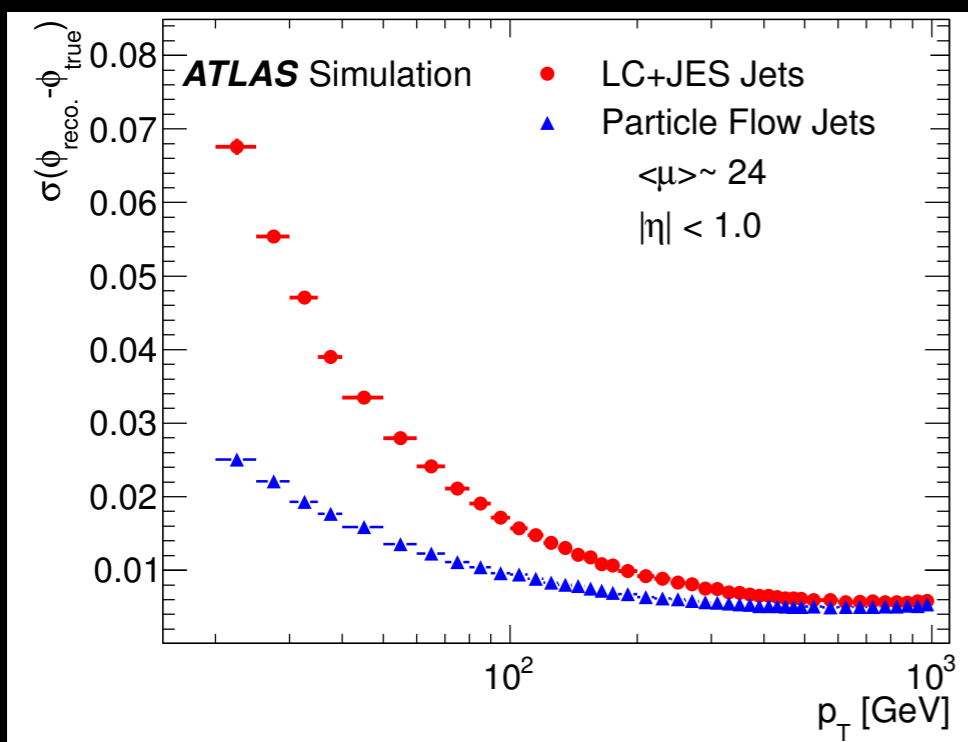
# WHY PFLOW? (THE EMPIRICAL ANSWER)

[arXiv: 1703.10485], [JETM-2017-006], [PLACEHOLDER]

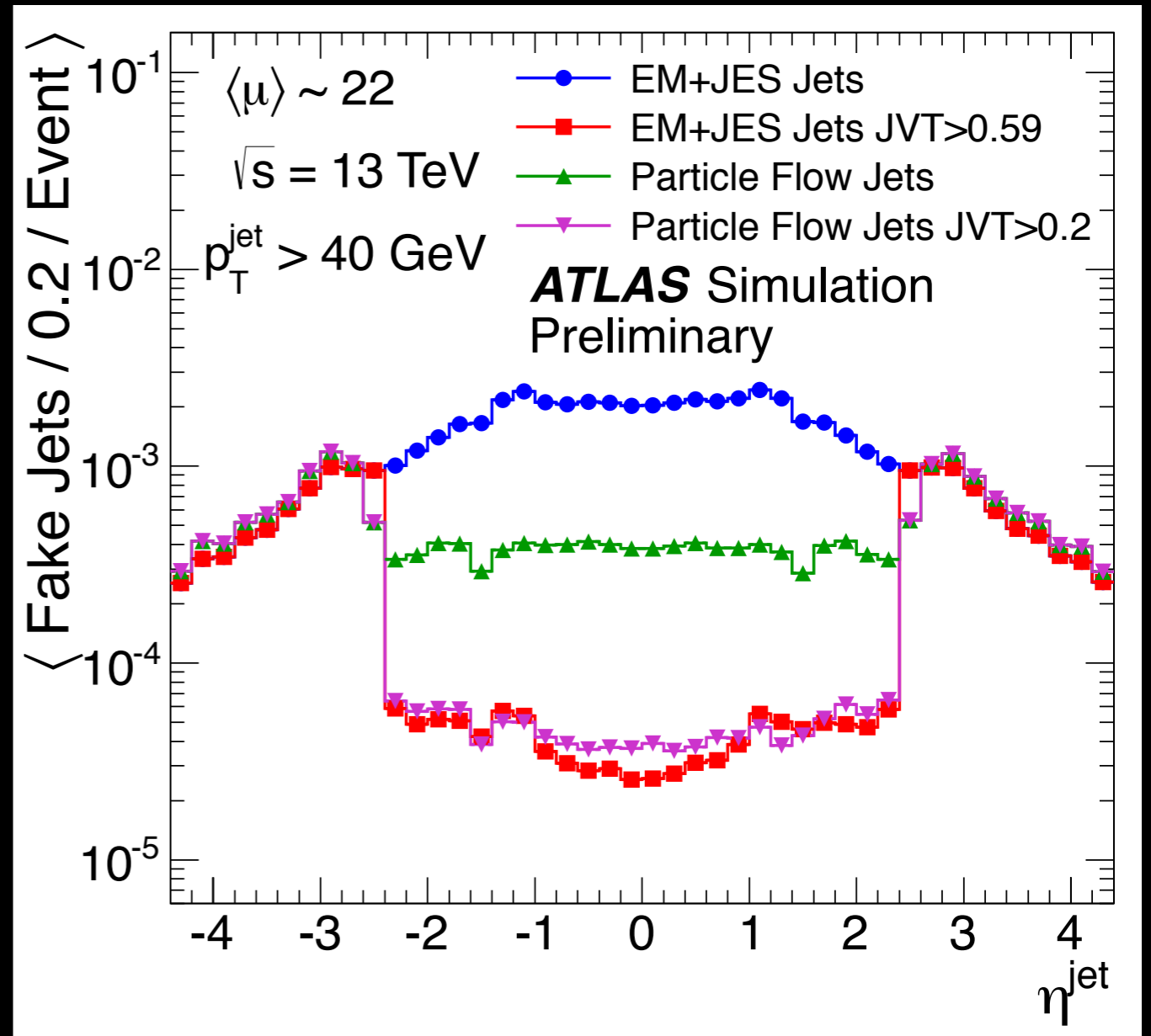
MET resolution



Angular resolution



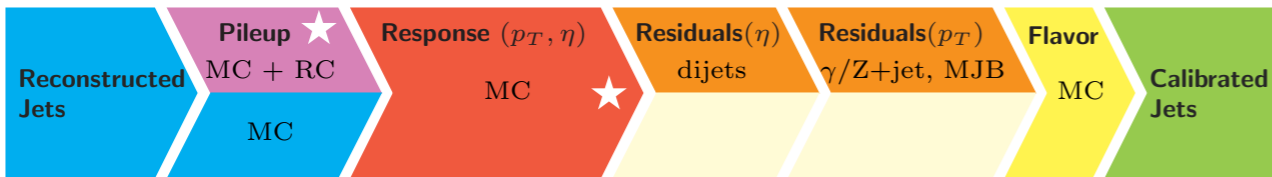
Pileup reduction



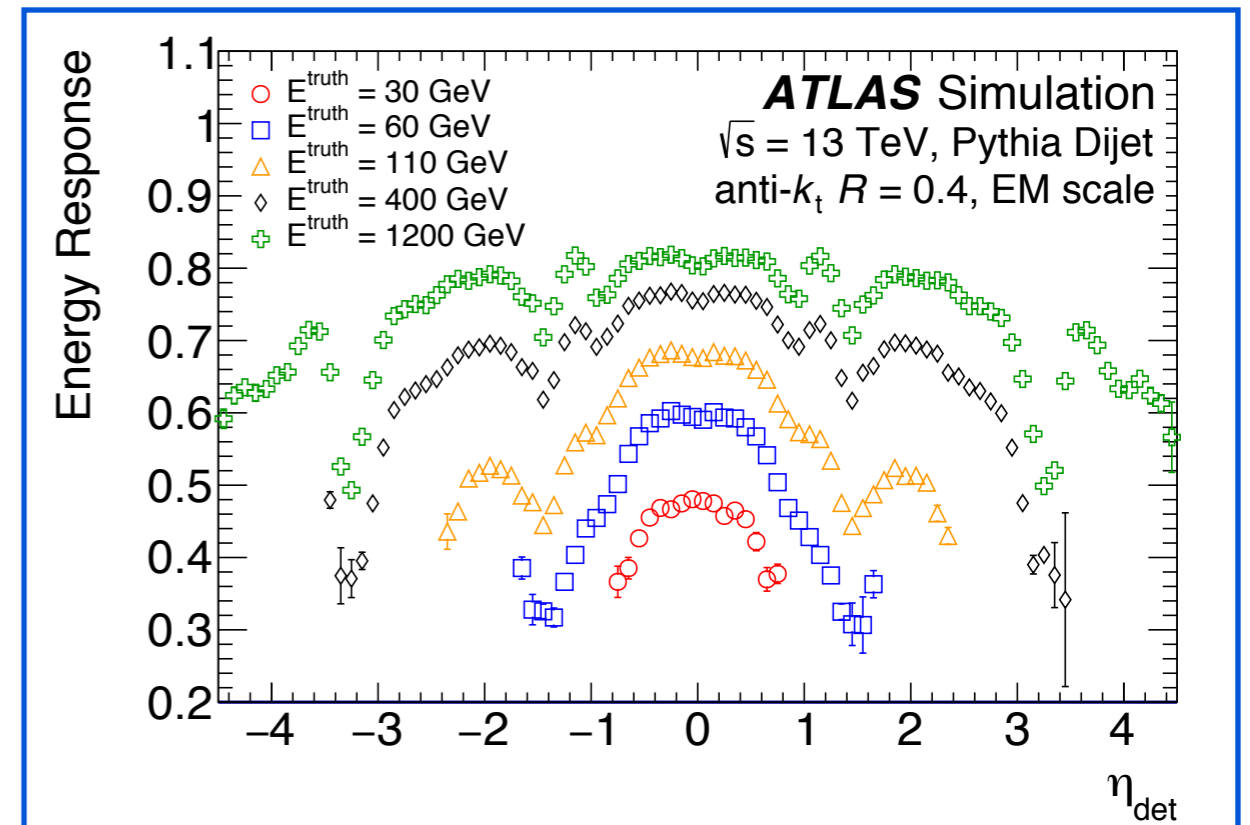
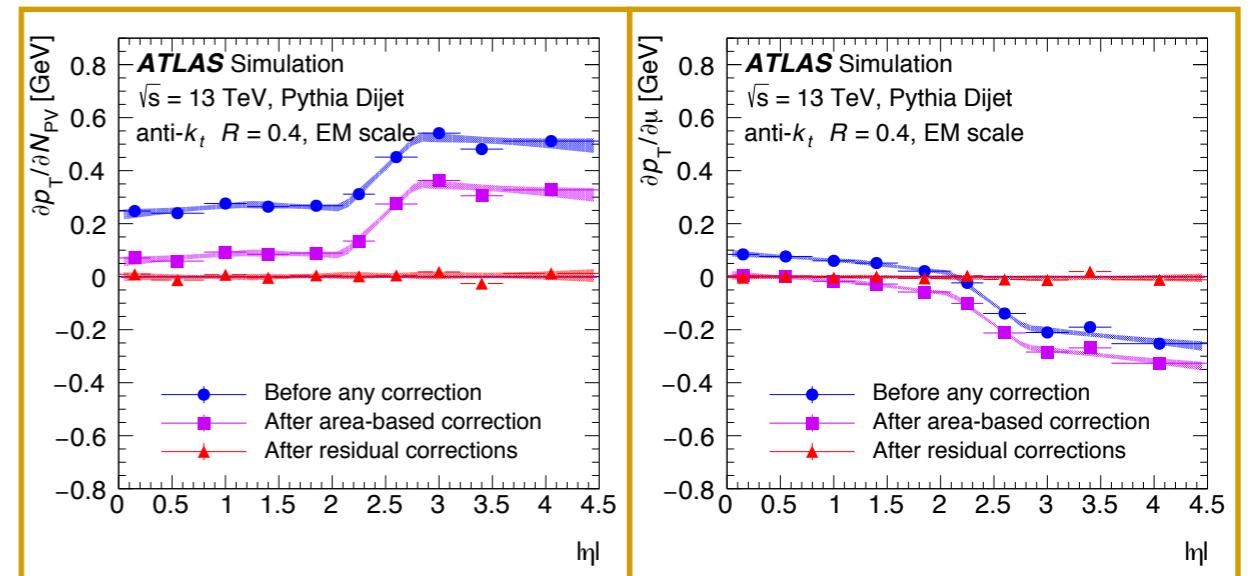
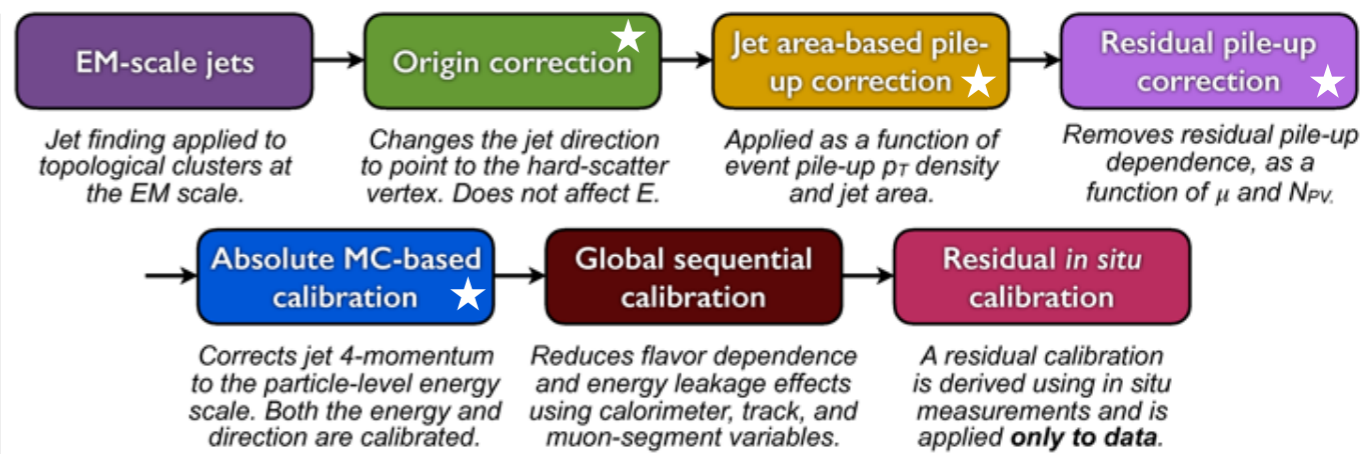
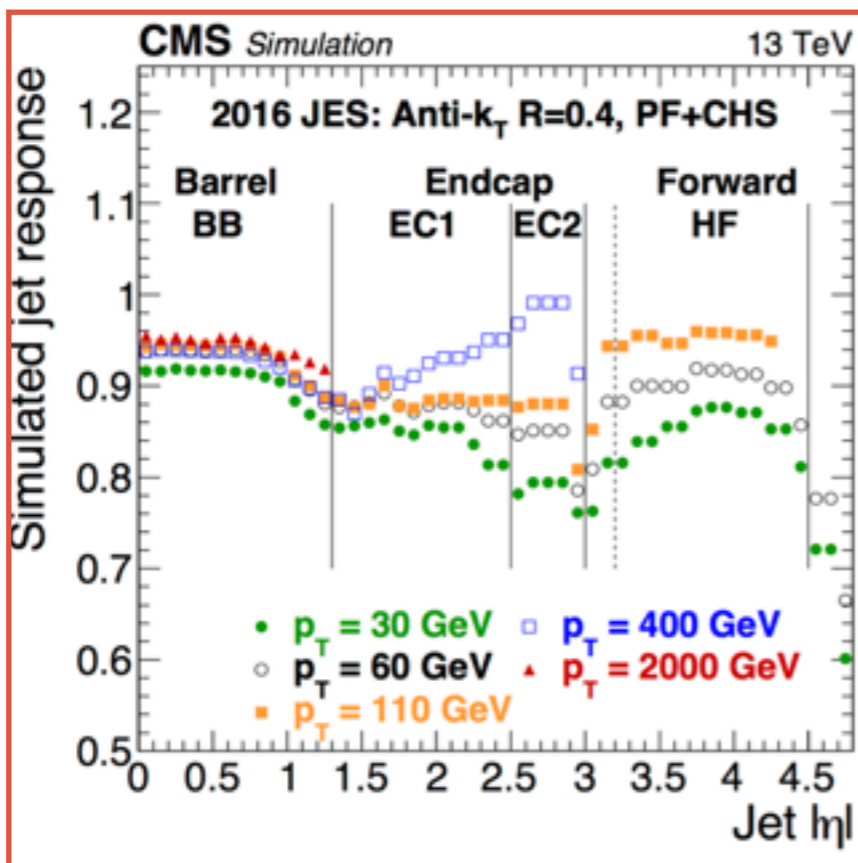
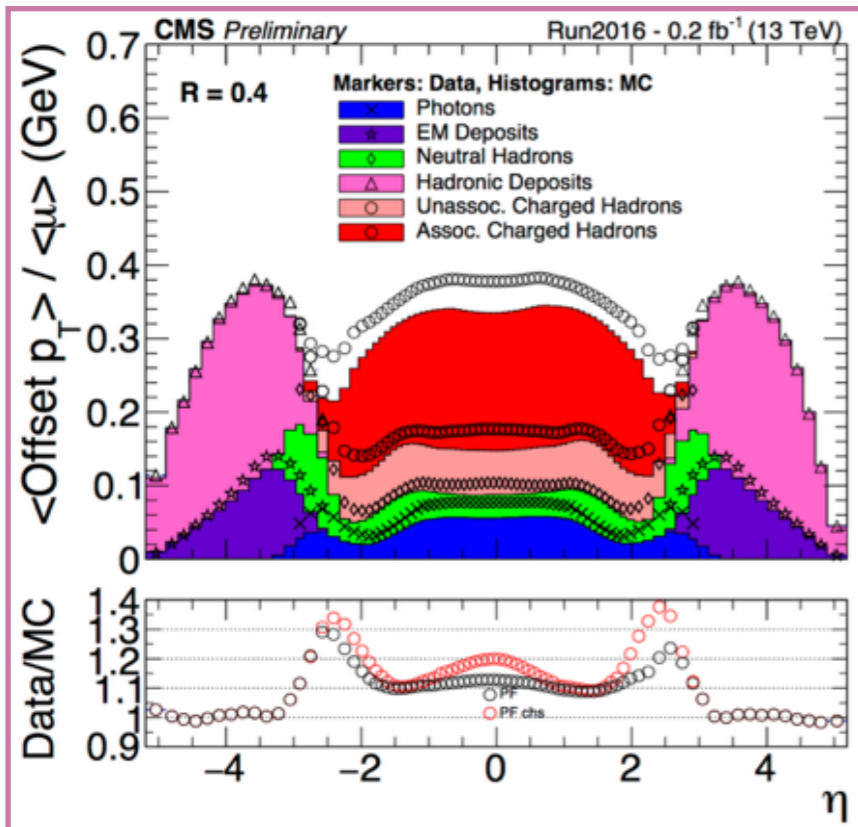
# JET CALIBRATION

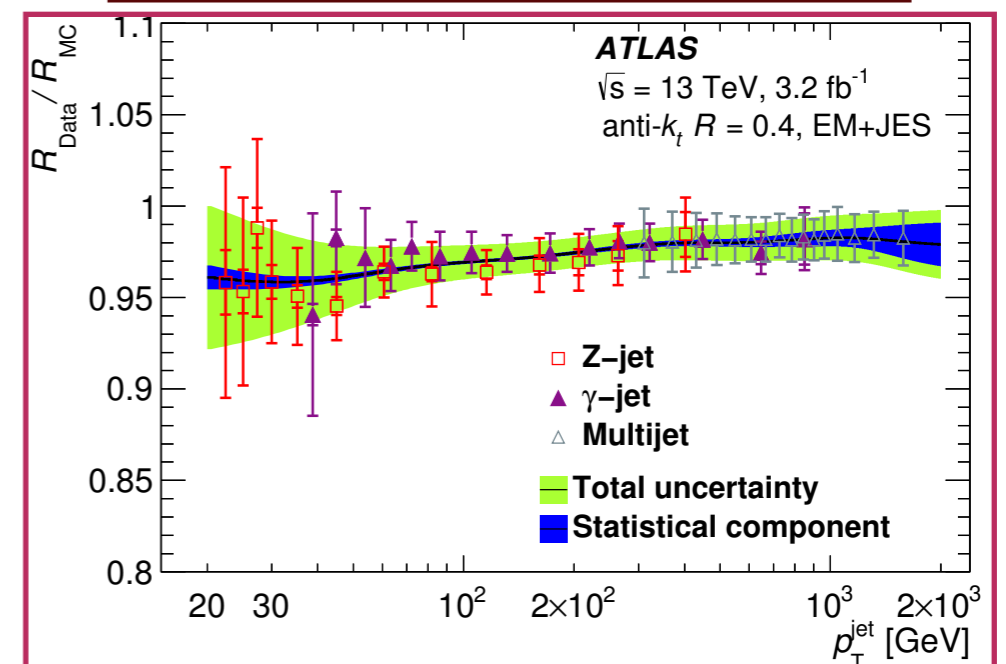
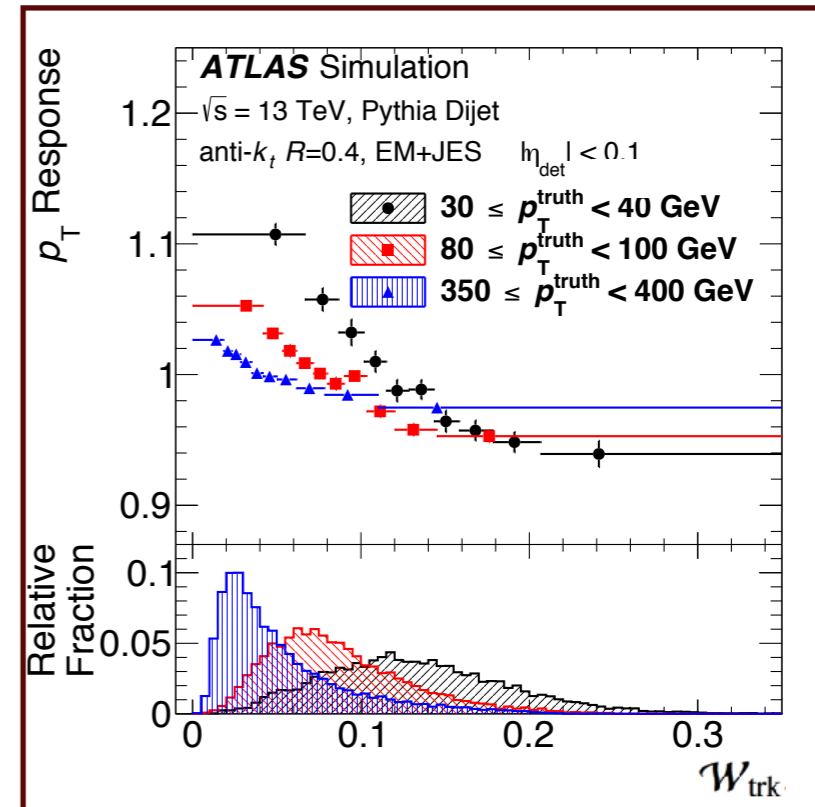
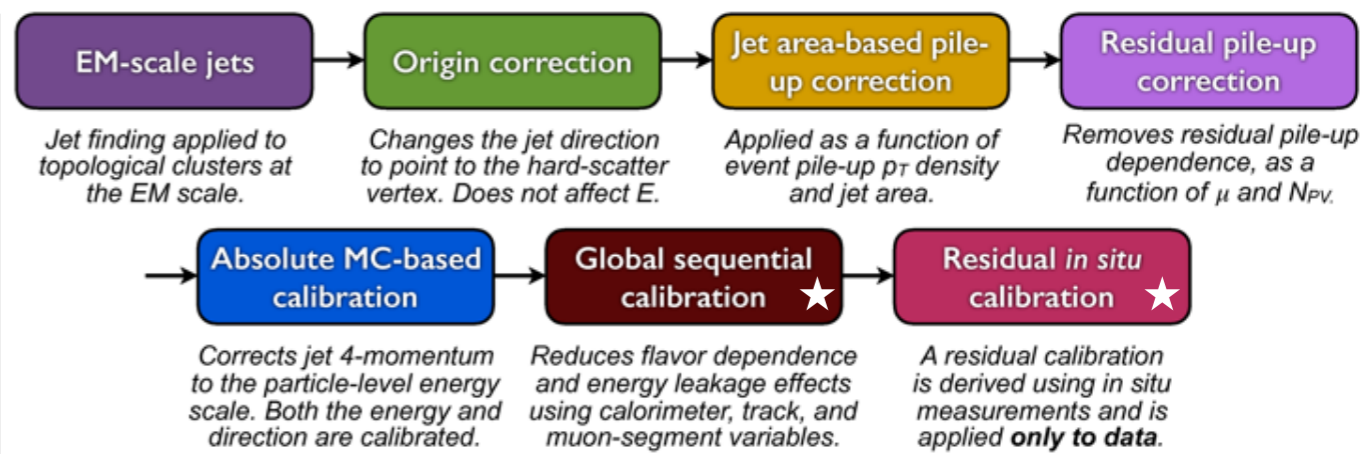
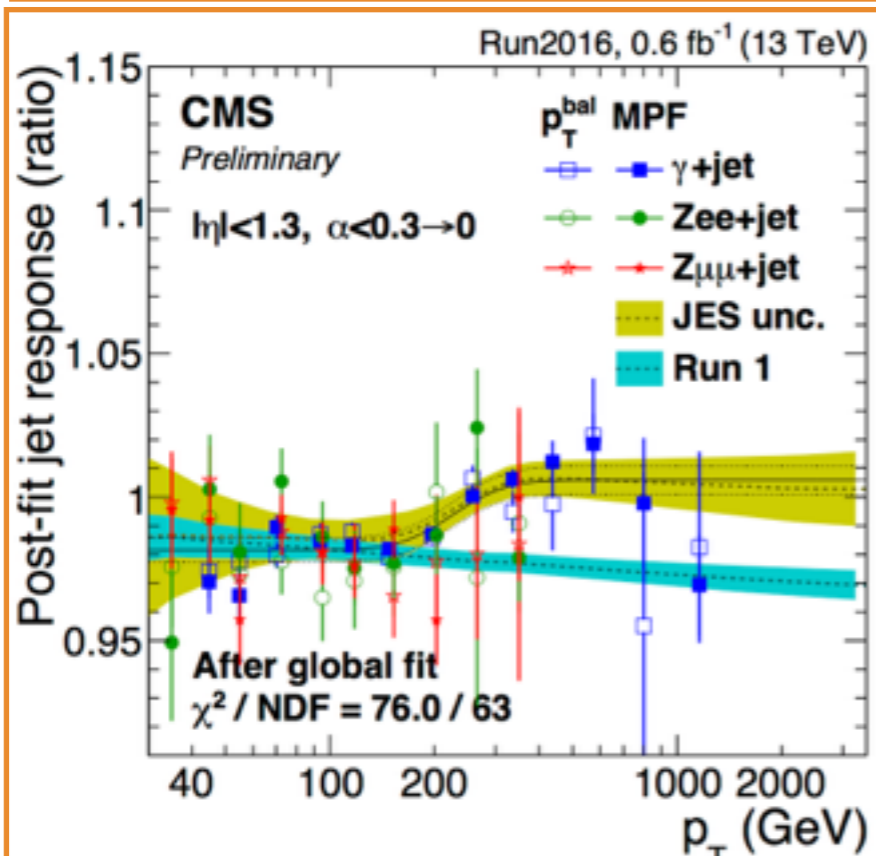
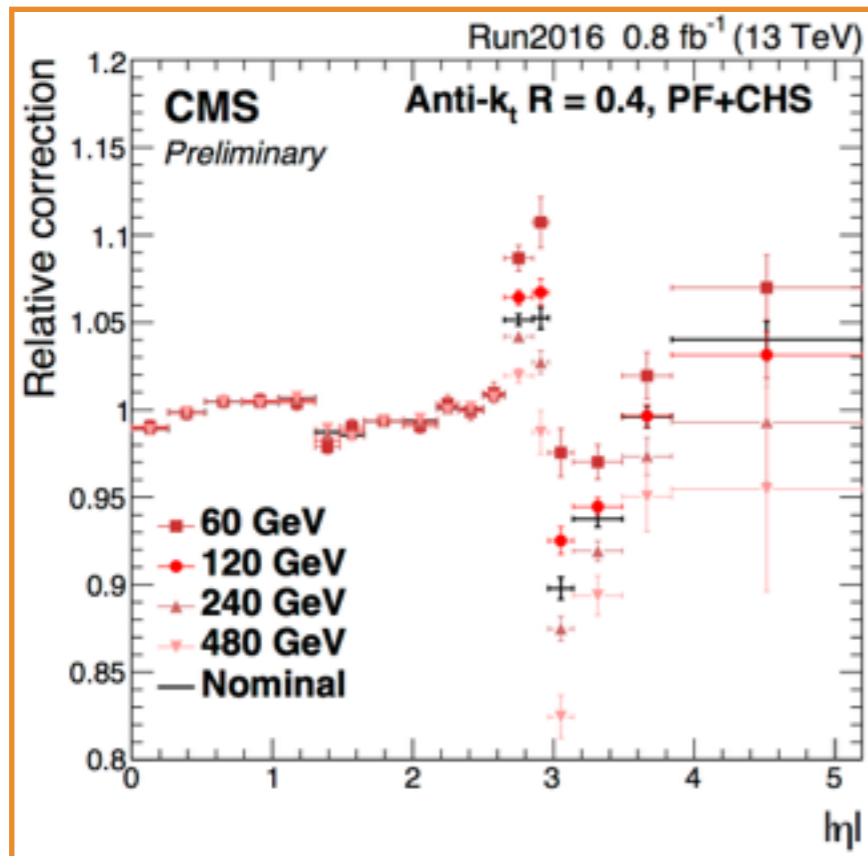
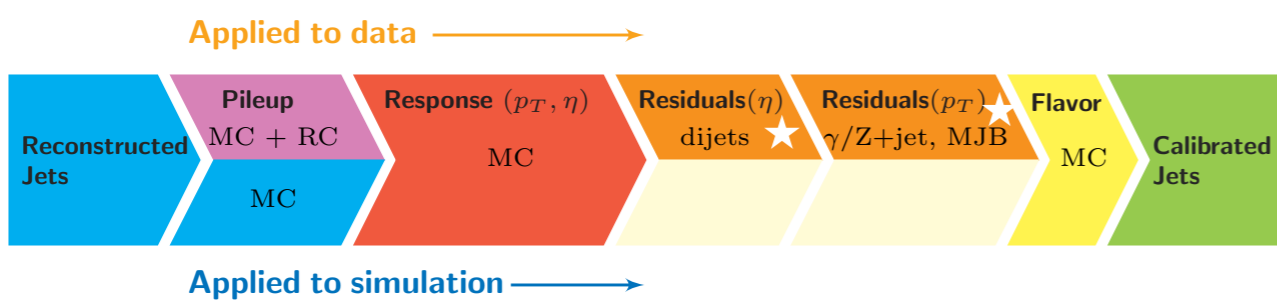


Applied to data →

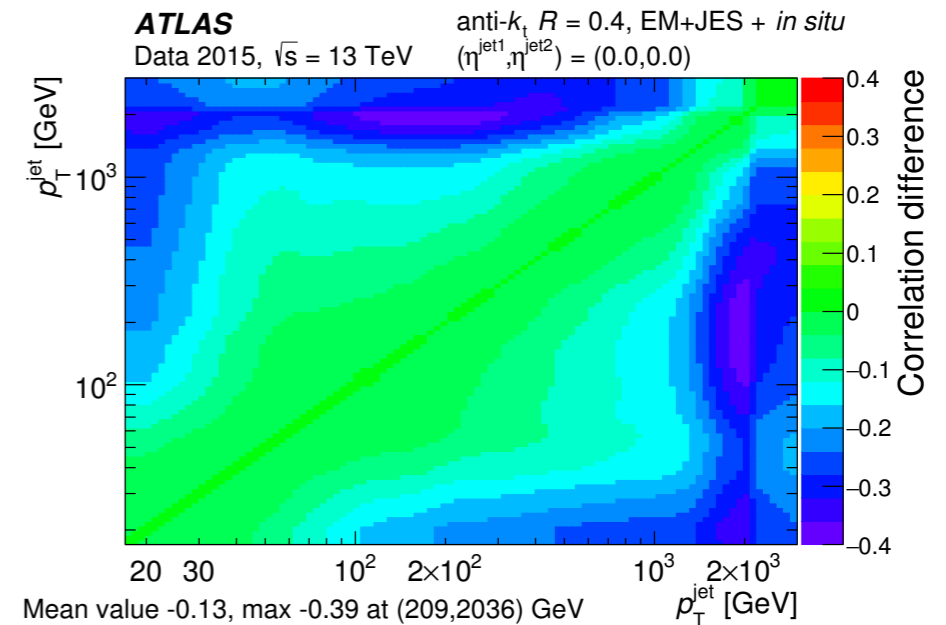
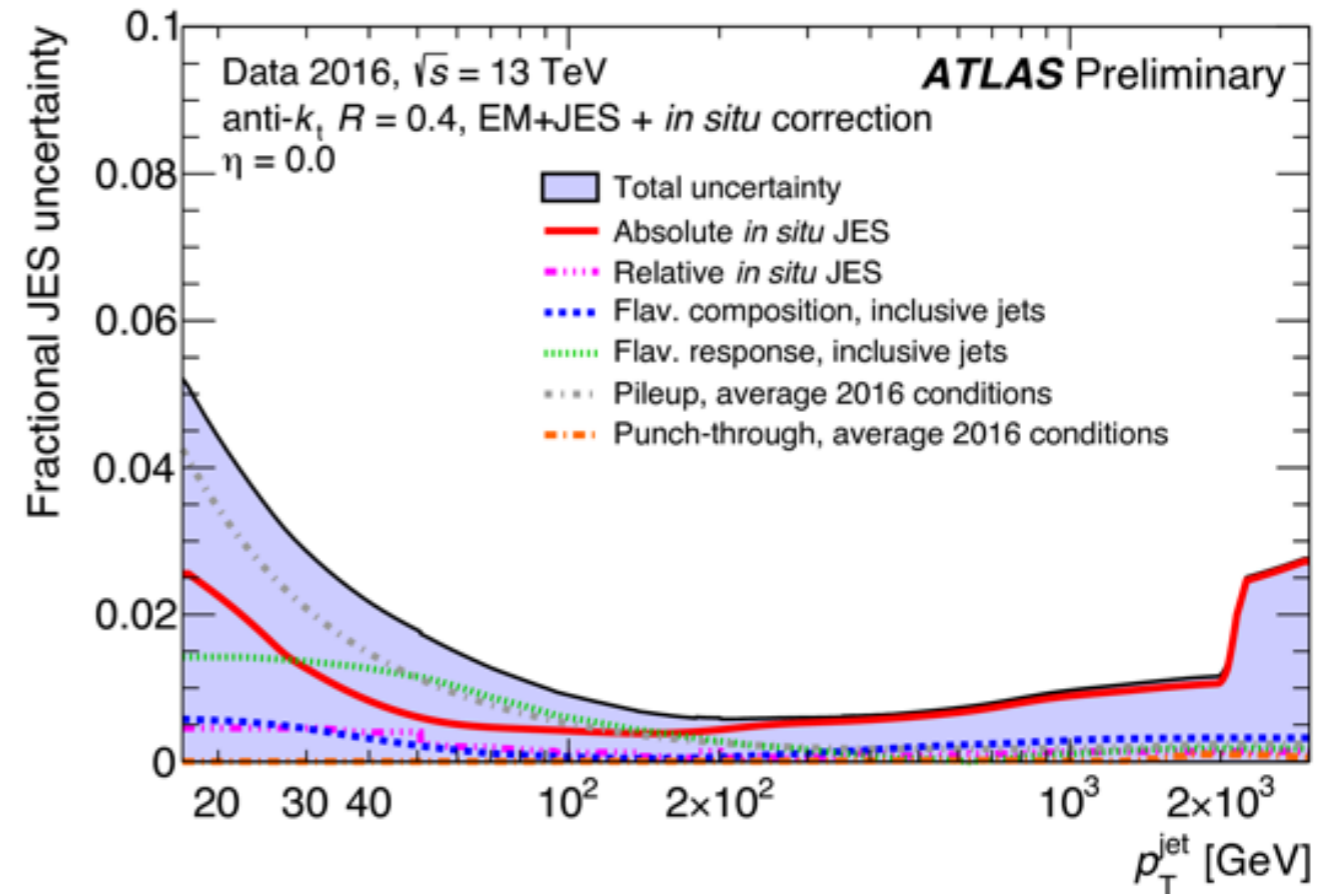
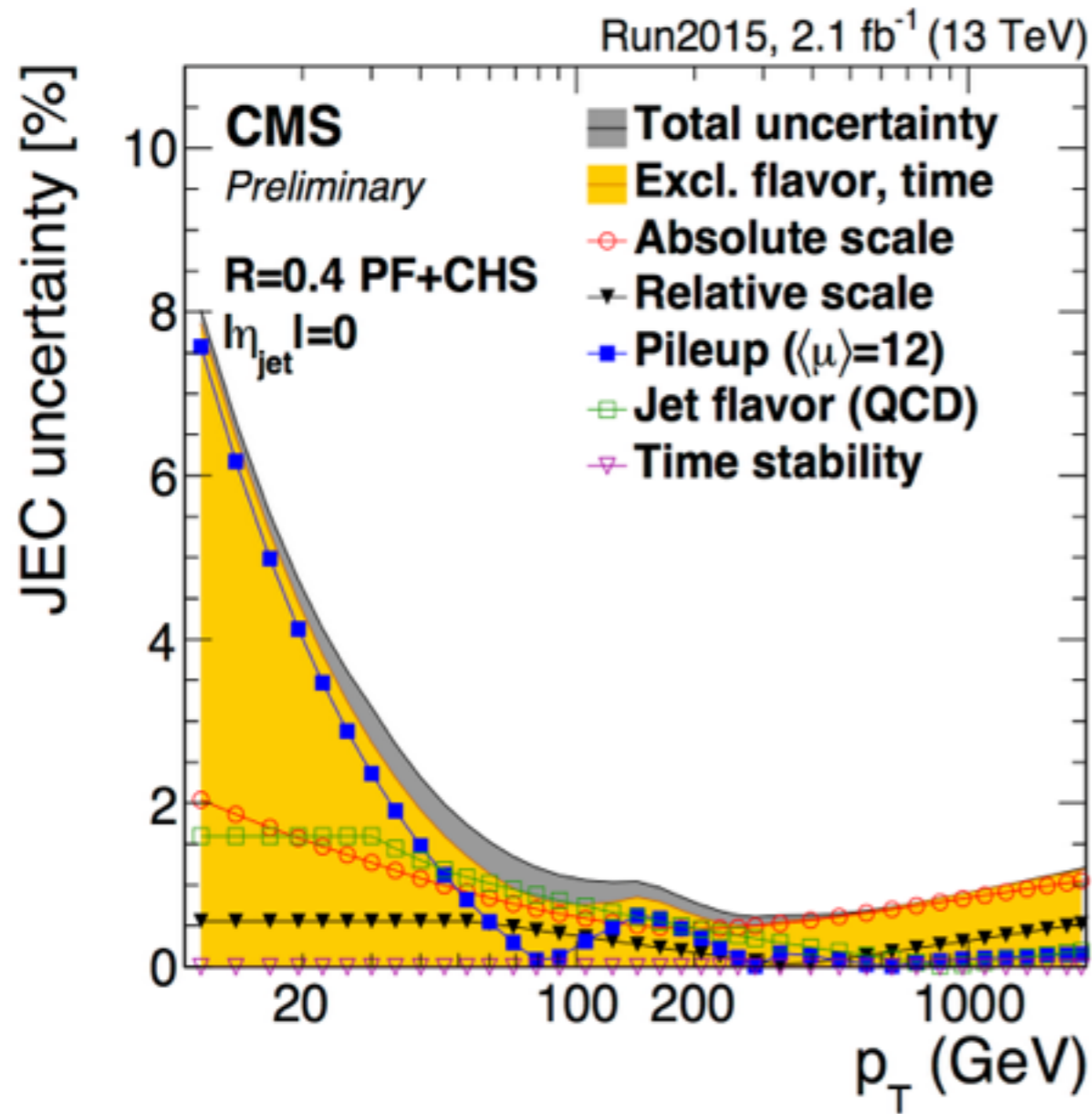


Applied to simulation →



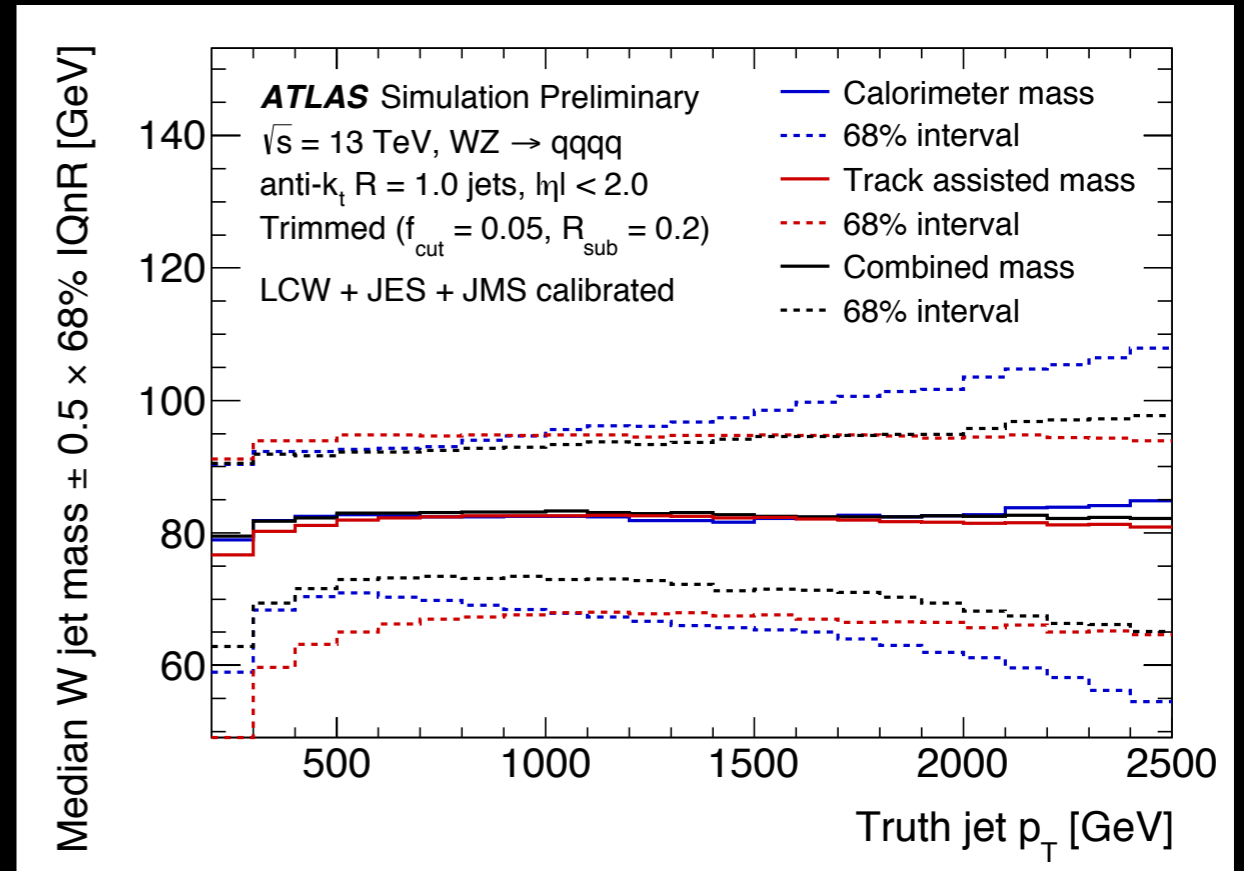
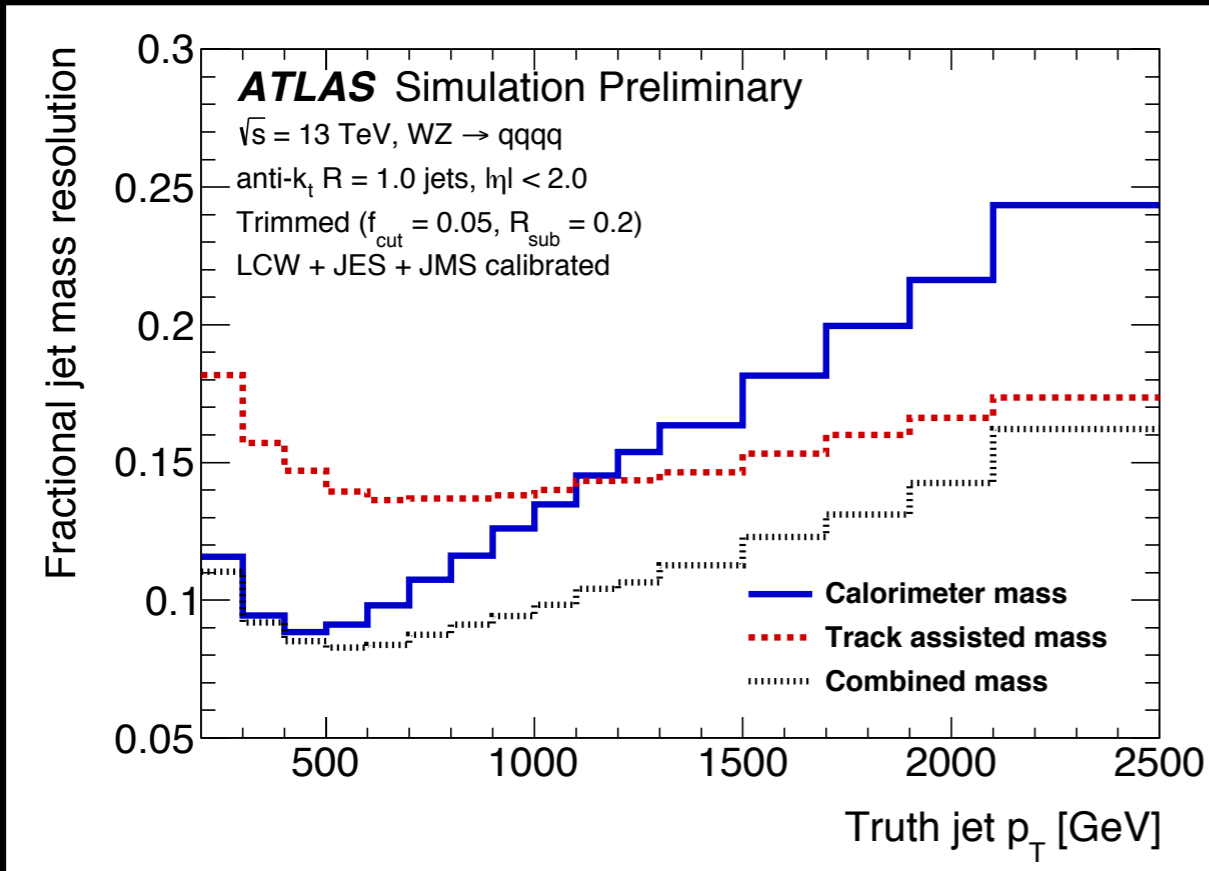


# JET UNCERTAINTIES



Uncertainty correlation losses from nuisance parameter reduction for simple analyses

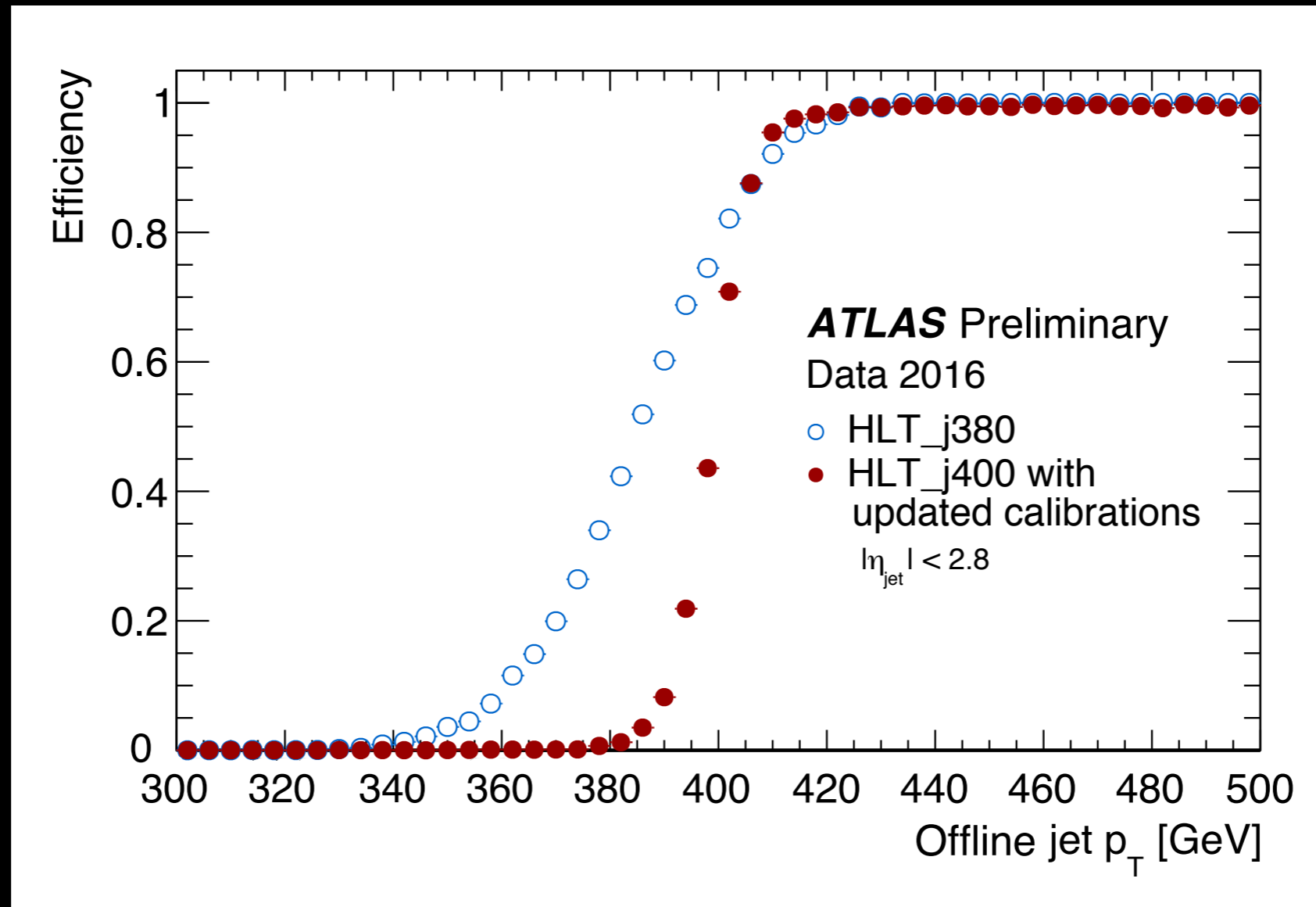




- Detector response shapes jet mass as well as energy.
- At high  $p_T$ , cluster merging obscures substructure, but can still be resolved with tracks but response suffers from lack of neutral information.
- Correct track-jet mass as  $m_{\text{trk}} * p_{T_{\text{trk}}} / p_{T_{\text{calo}}}$  [ATLAS-CONF-2016-035], combine with calo mass using resolution-weighted average.



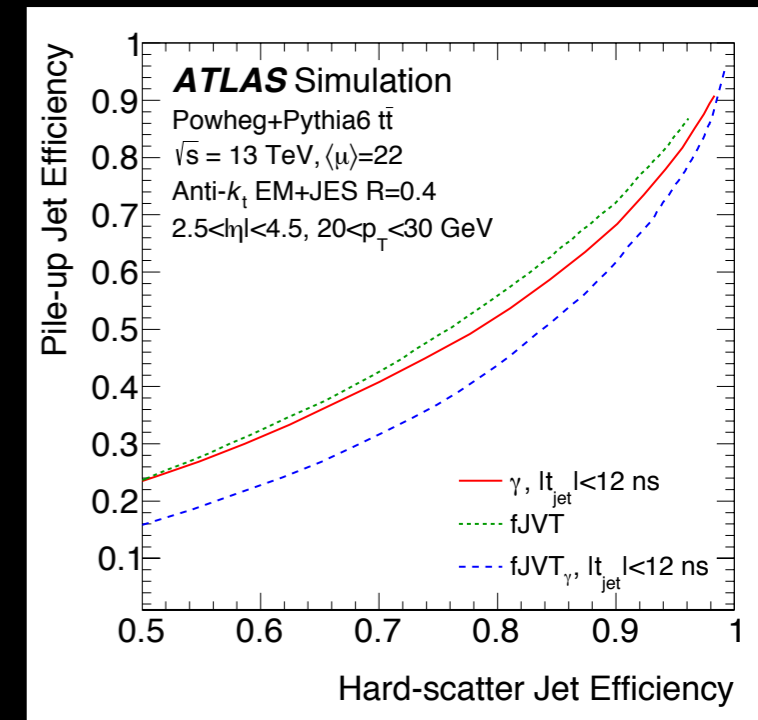
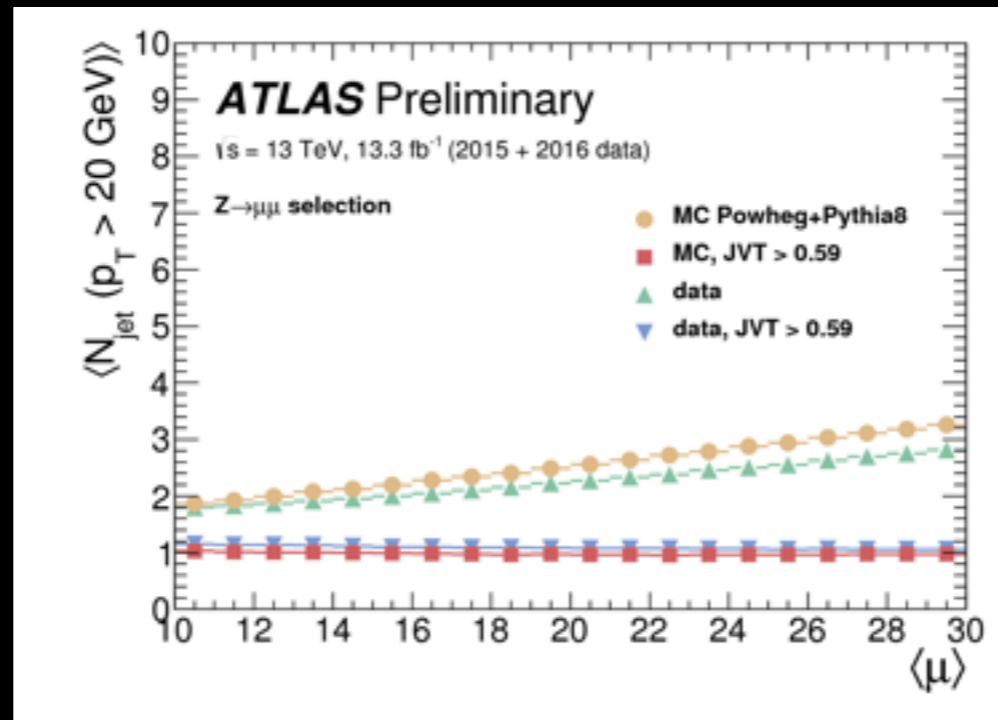
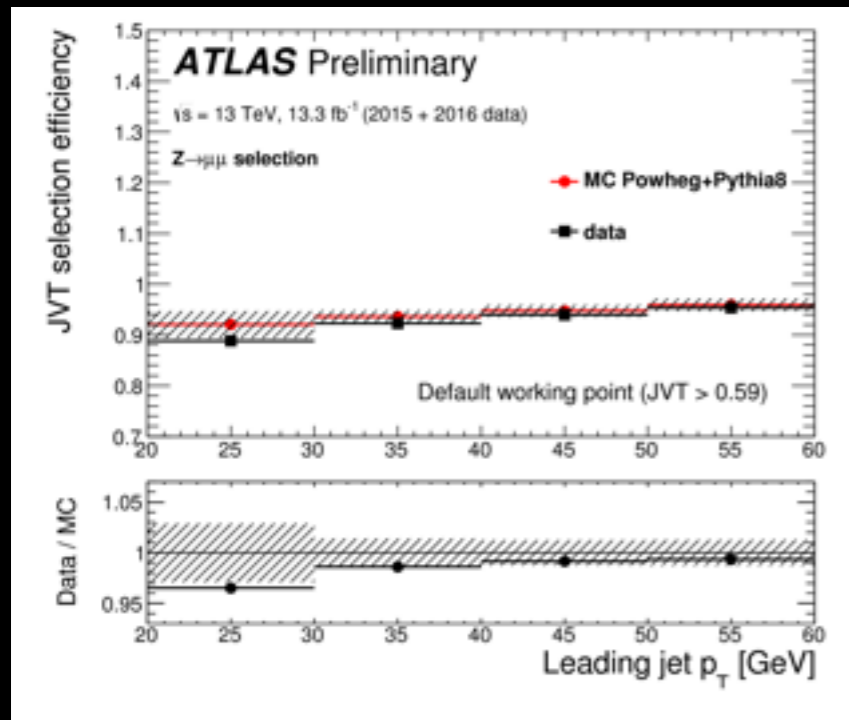
# TRIGGER JET CALIBRATION



- Track-based Global Sequential Calibration vastly improves resolution, sharpening turn-on.

PILEUP SUPPRESSION

# JET-LEVEL PILEUP SUPPRESSION

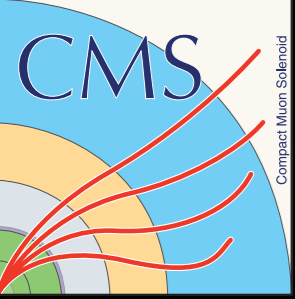


## Jet Vertex Tagger [[arXiv: 1510.03823](https://arxiv.org/abs/1510.03823)]: forward JVT [[arXiv:1705.02211](https://arxiv.org/abs/1705.02211)]:

- Identify jets with large fraction of track  $p_T$  from pileup vertices
- Additional discrimination from track-calorimeter  $p_T$  correlation

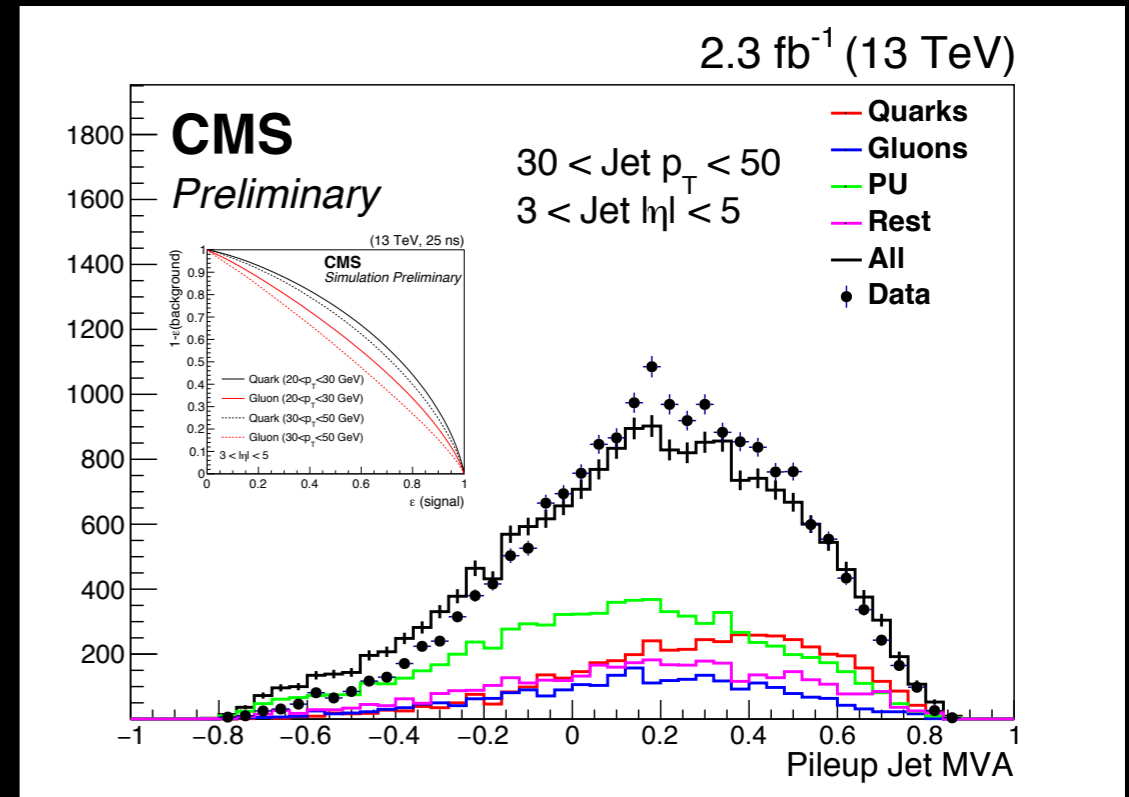
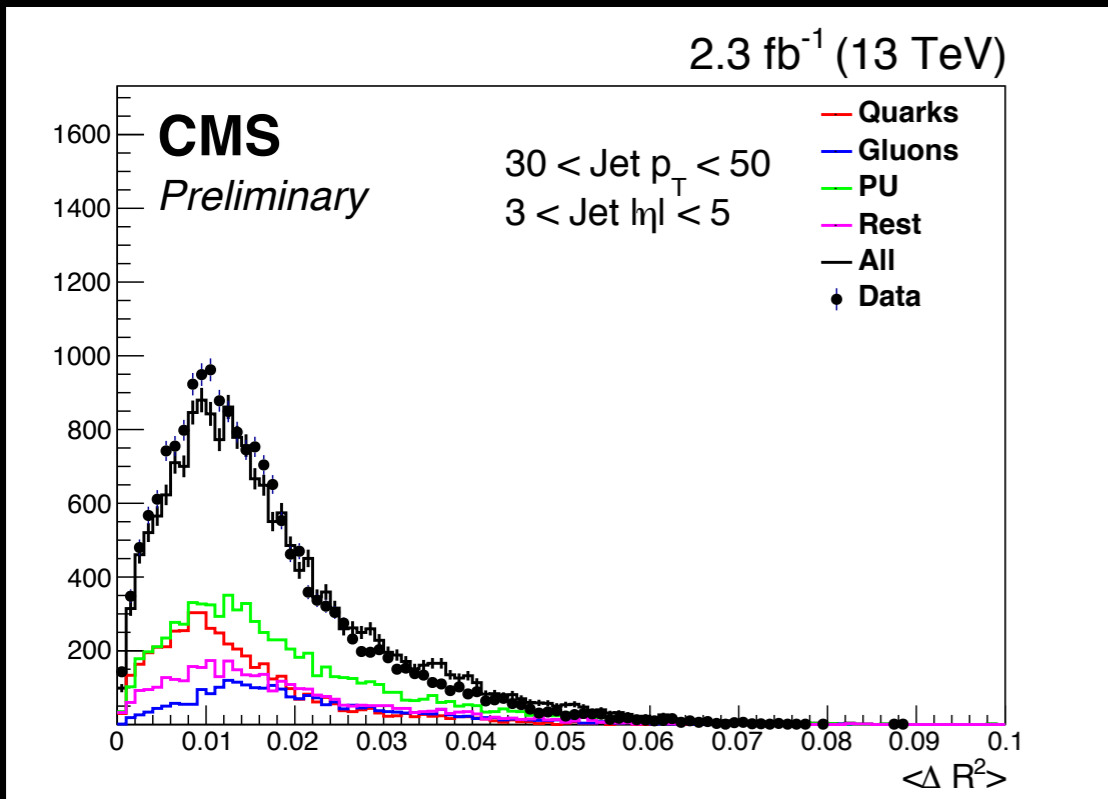
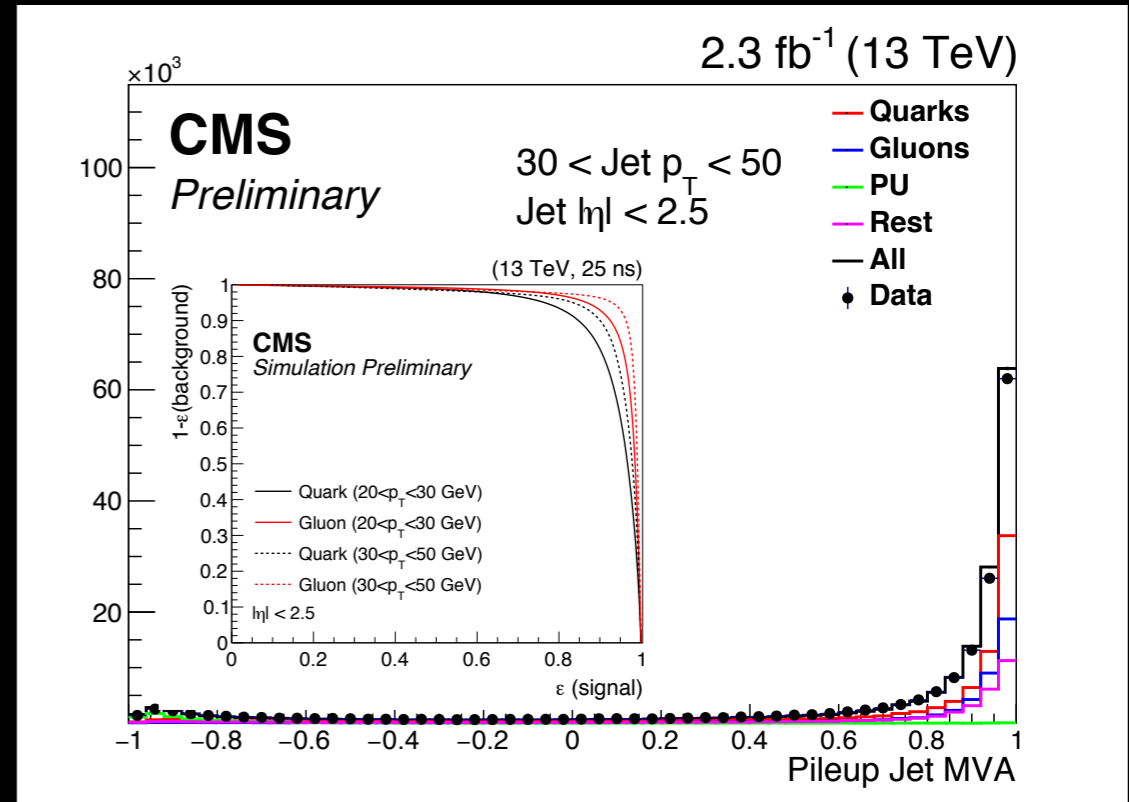
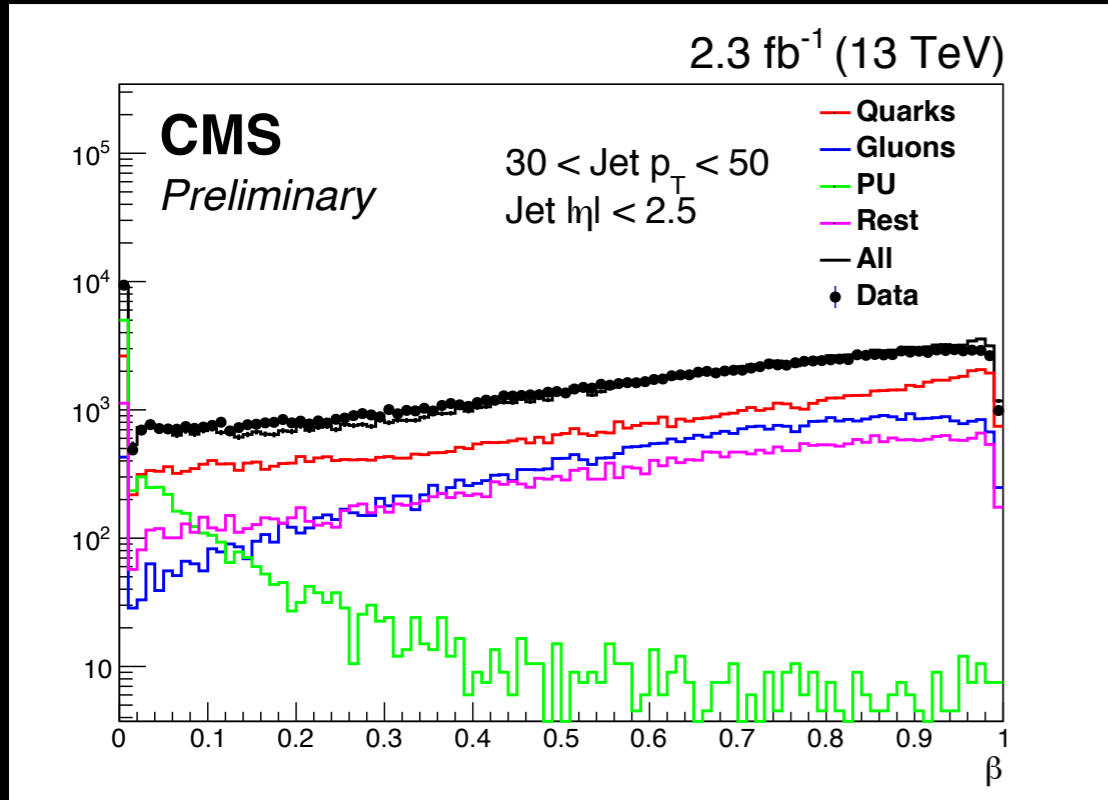
- Jet shape (width) discriminates stochastic & QCD-like jets
- Central pileup jets used to tag forward dijet partners





# JET-LEVEL PILEUP SUPPRESSION

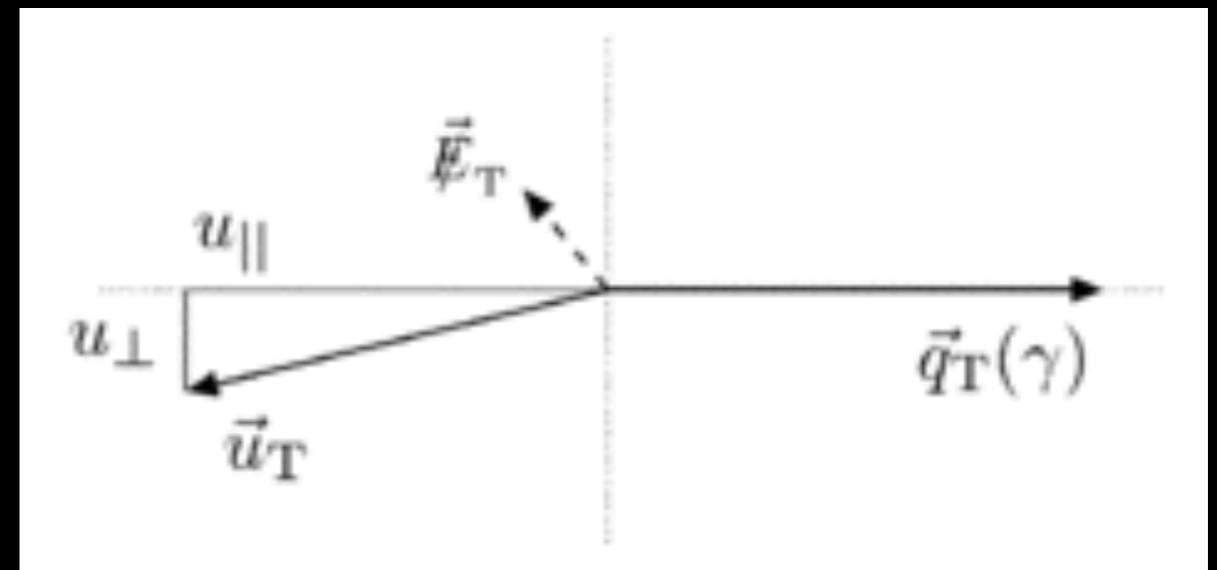
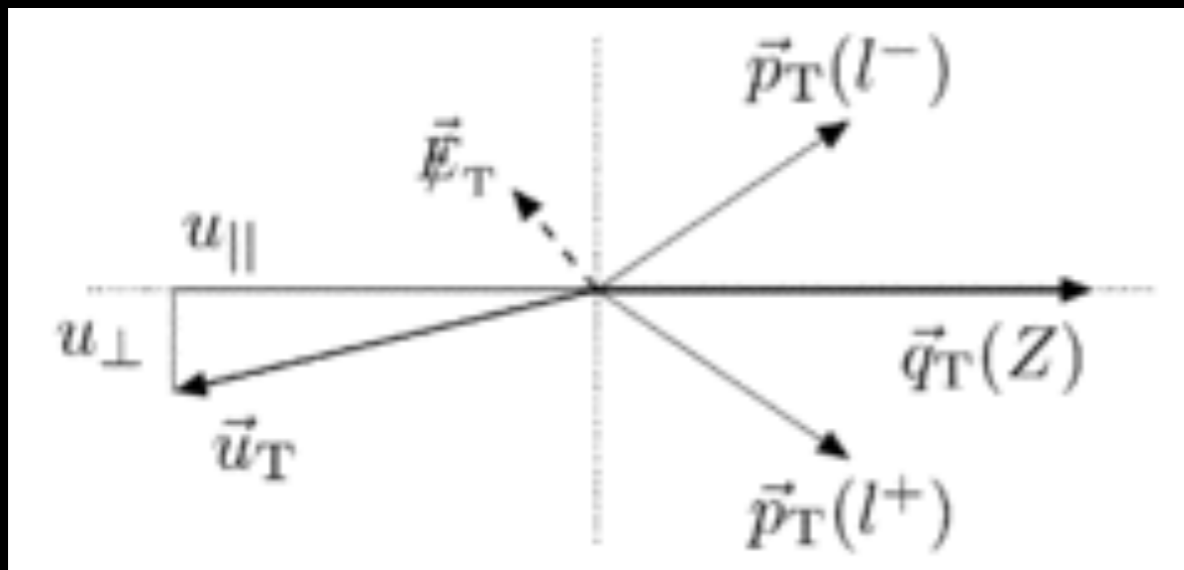
Tracking available in central region



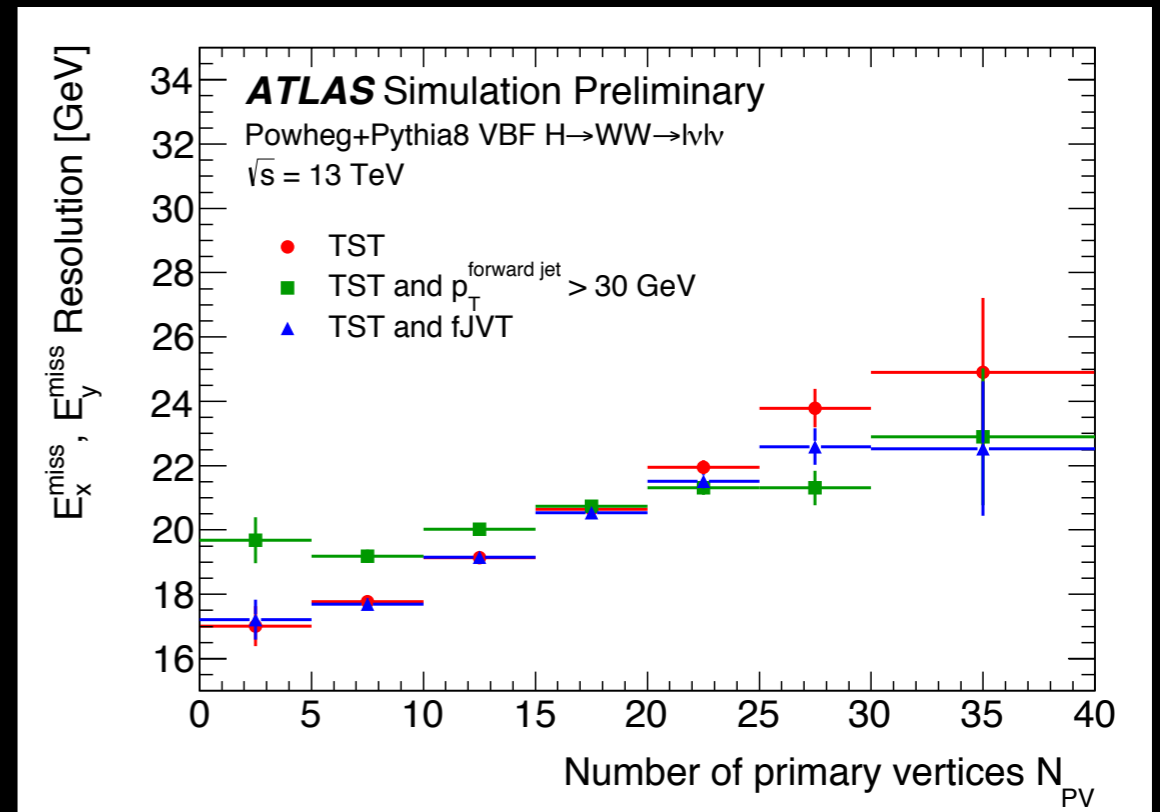
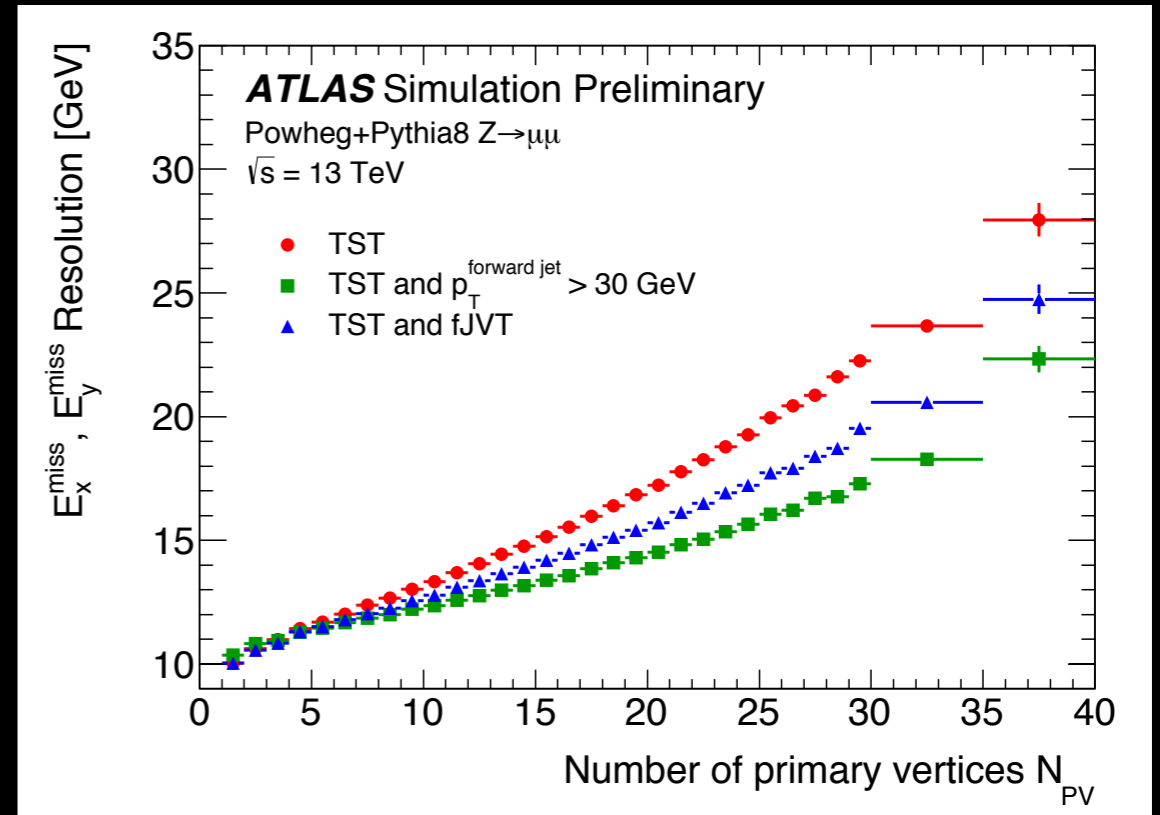
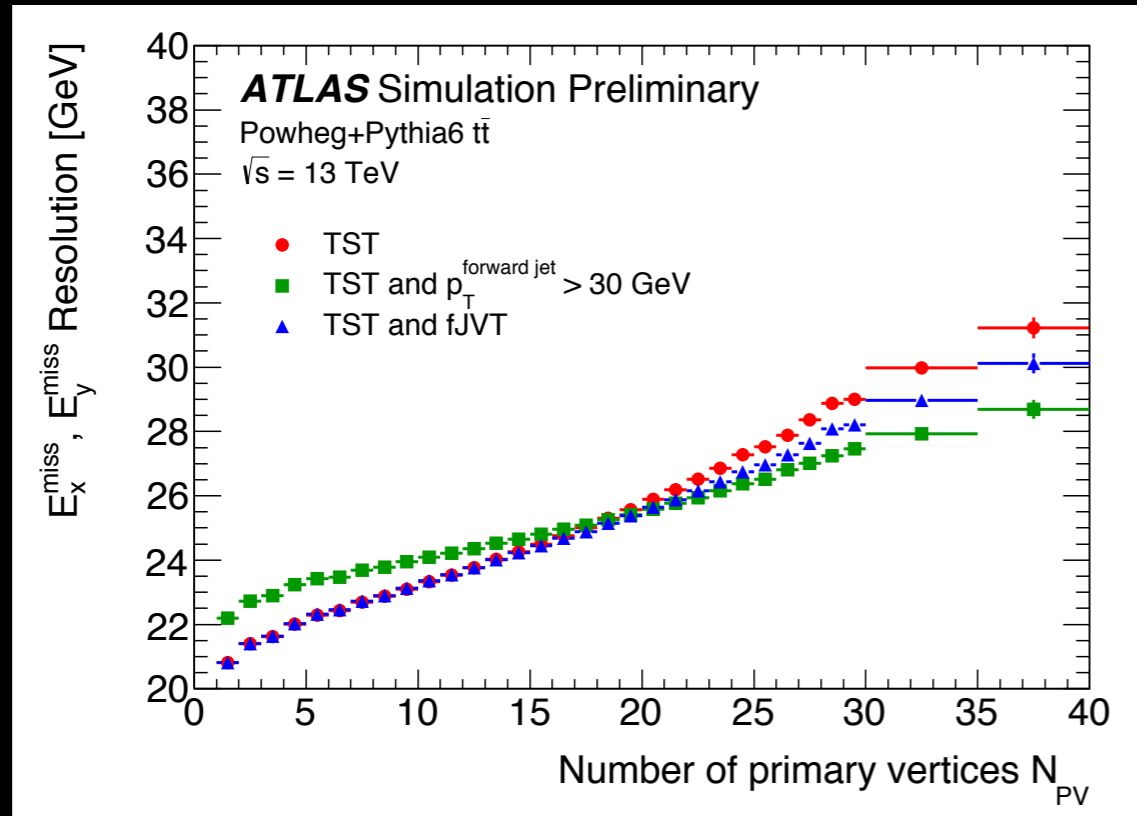
Forward tagging uses width

MISSING TRANSVERSE  
MOMENTUM

# PERFORMANCE ASSESSMENT

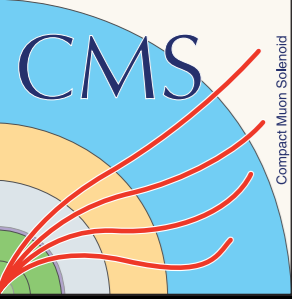


- Use projections parallel and perpendicular to the reference object ( $Z$  or photon) to isolate scale defect & resolution effects

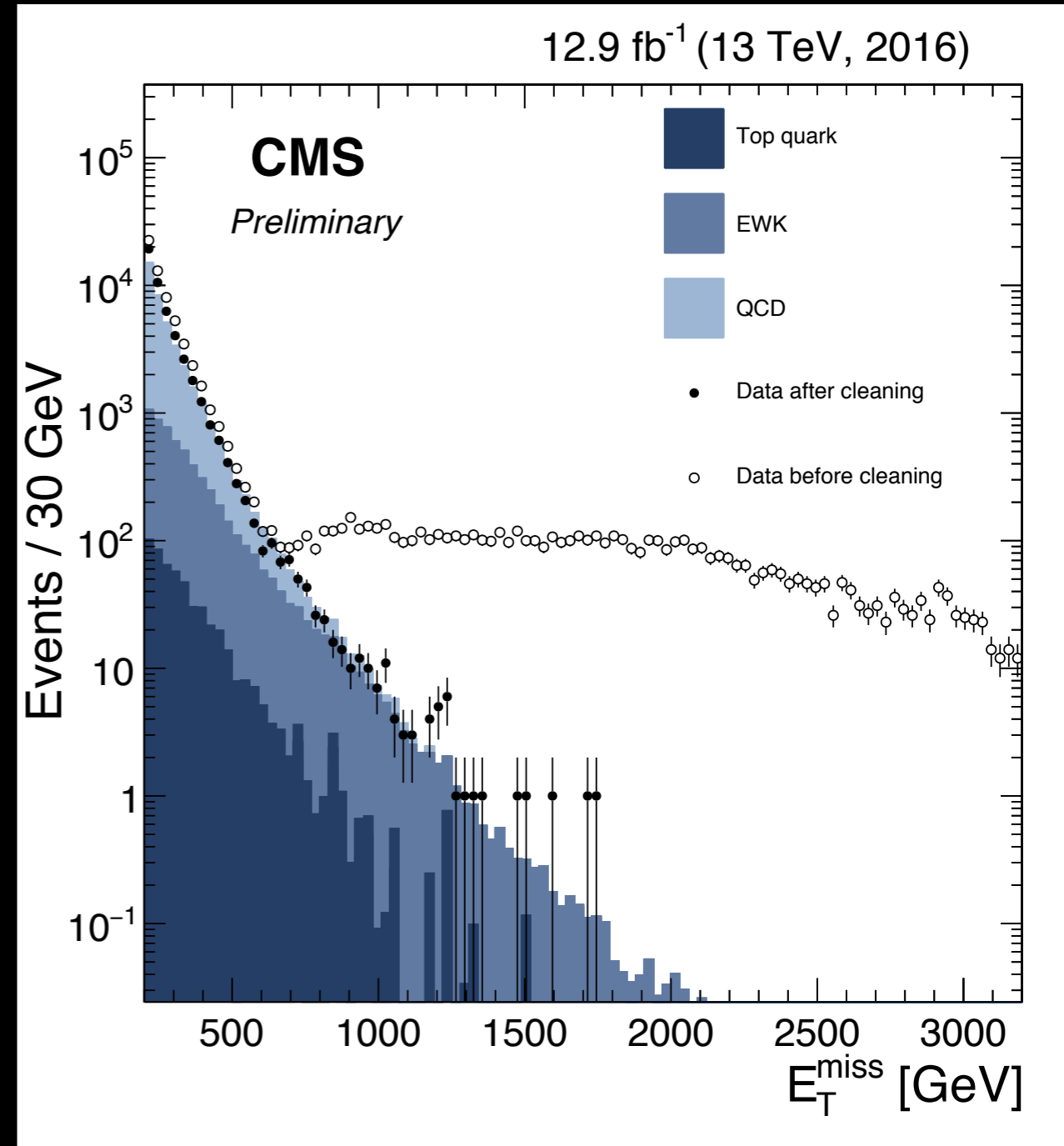
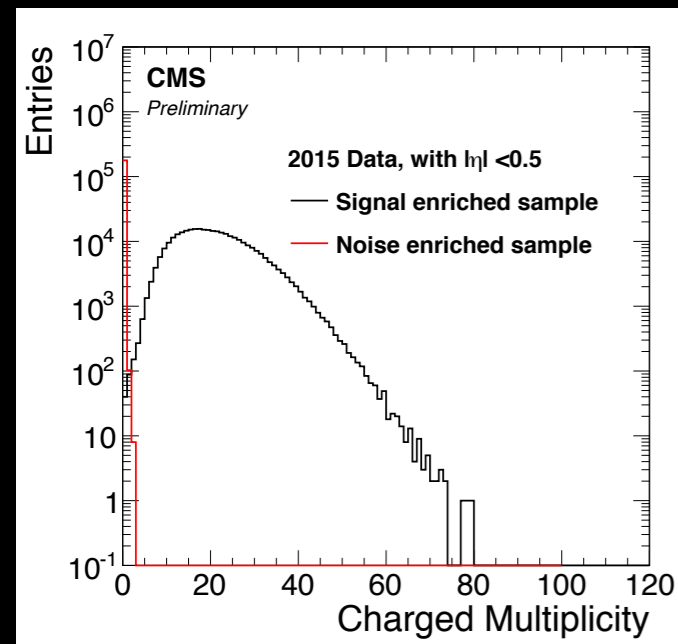
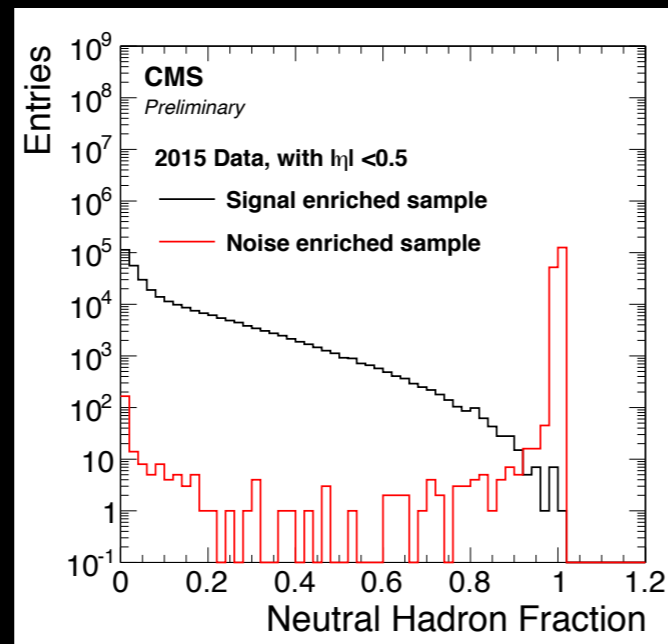
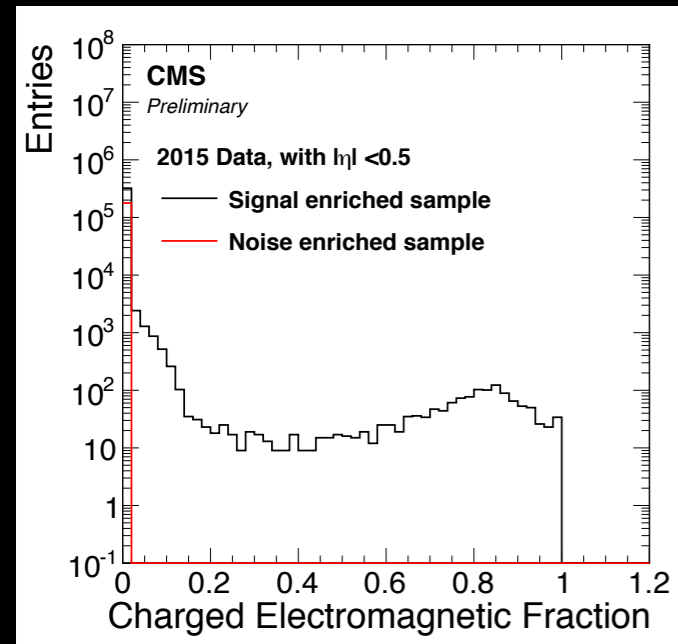


- Simply raising  $p_T$  threshold is effective in  $Z$ +jets, due to low intrinsic forward activity.
- VBF &  $t\bar{t}$ , with more jets, require dedicated fJVT cut.





# EVENT CLEANING



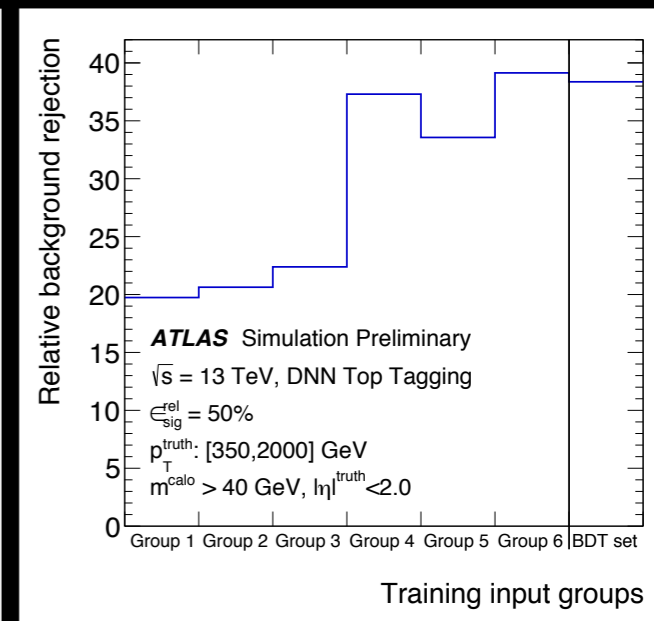
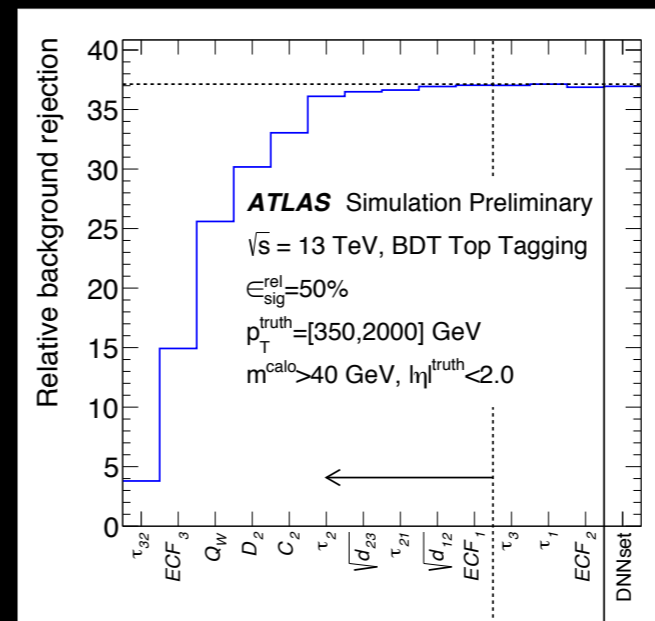
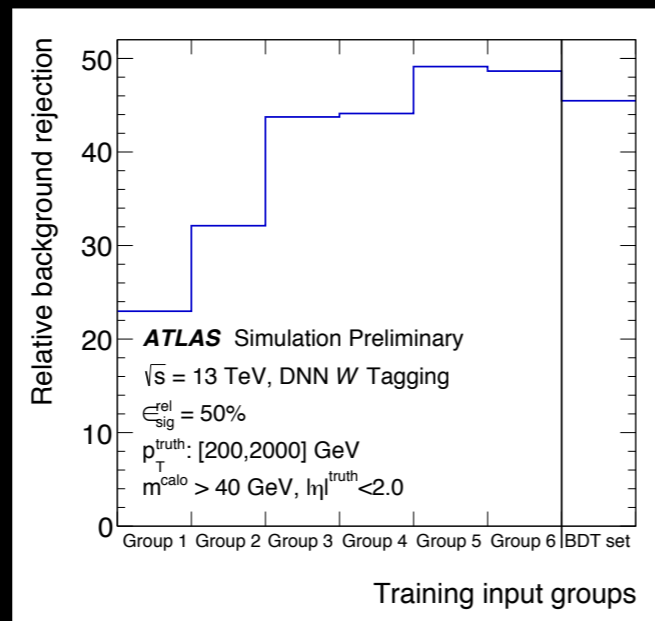
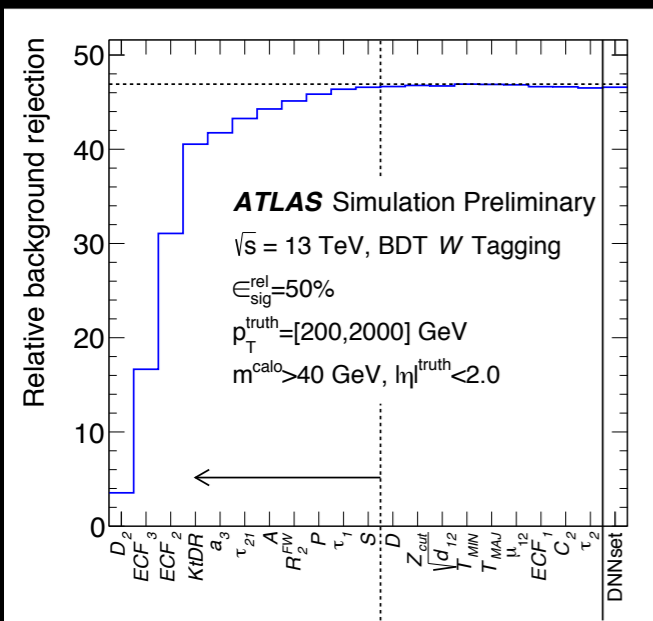
Impossible to do MET without removing detector defects!

JET TAGGING

MACHINE LEARNING

W BOSON TAGGING

TOP QUARK TAGGING

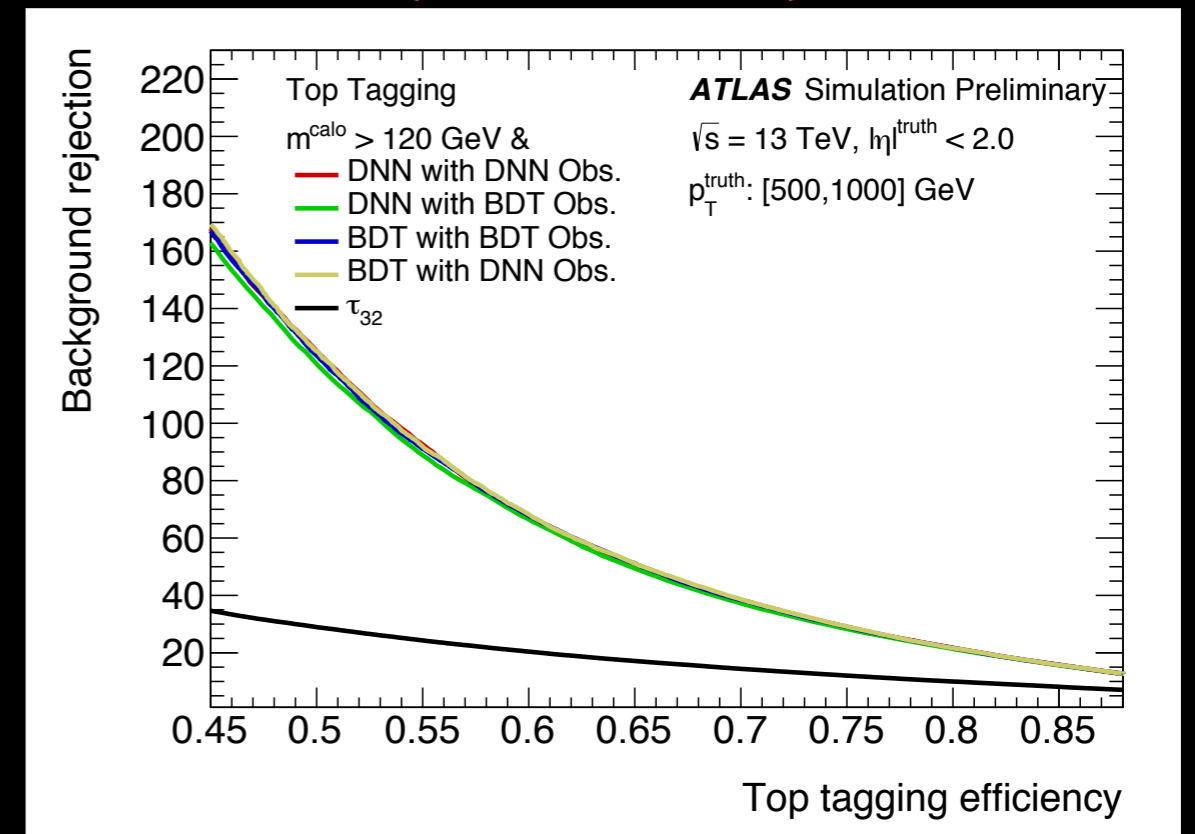
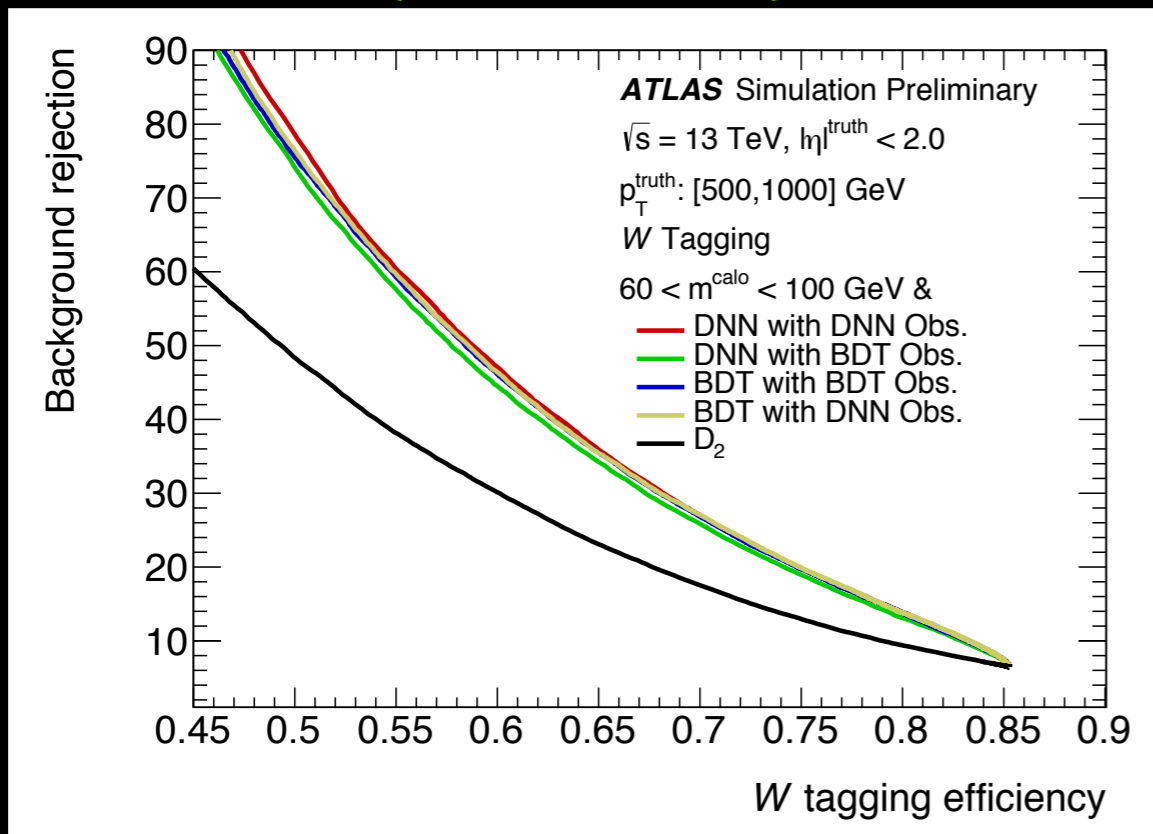


BDT

DNN

BDT

DNN



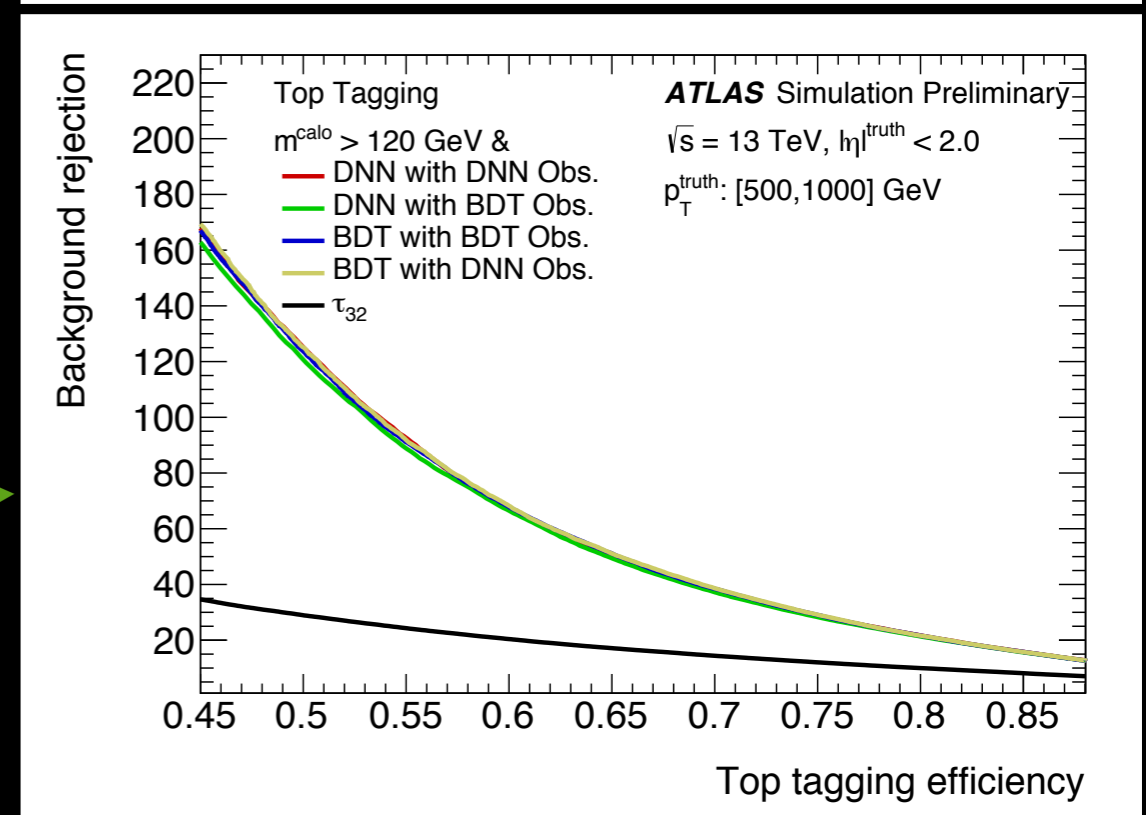
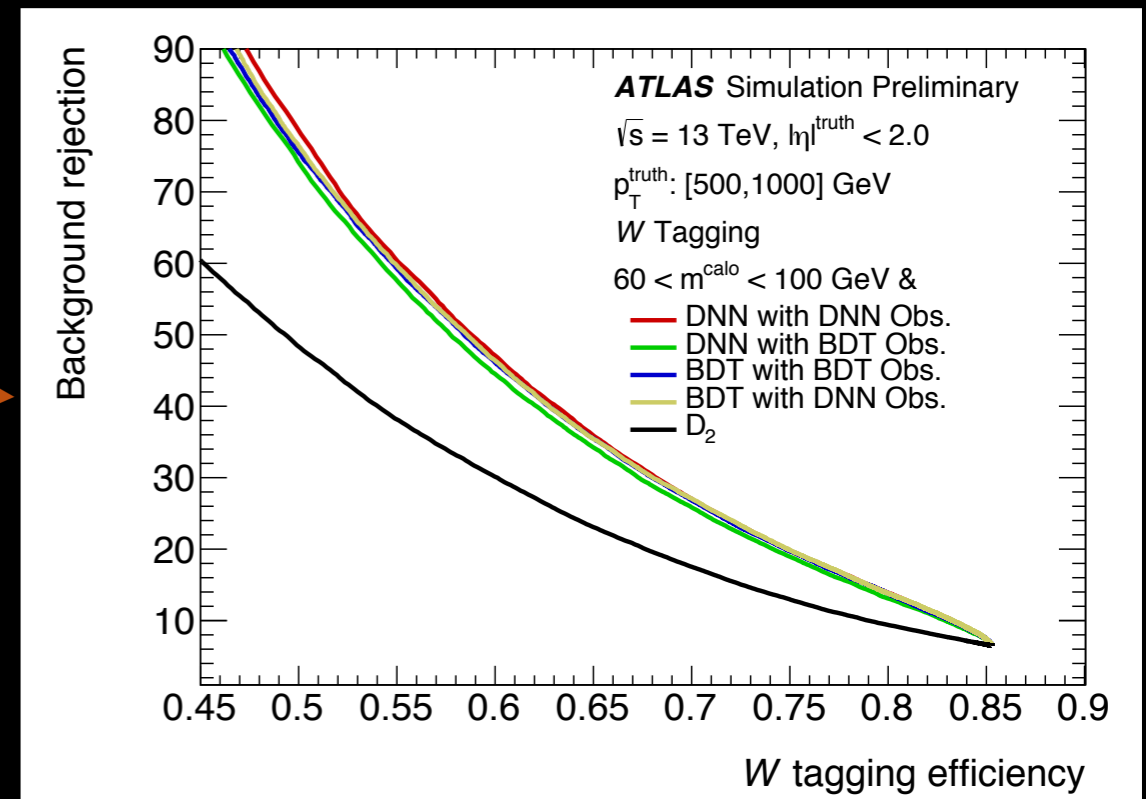
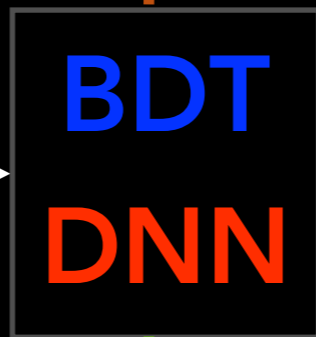
MACHINE LEARNING

W BOSON TAGGING

TOP QUARK TAGGING

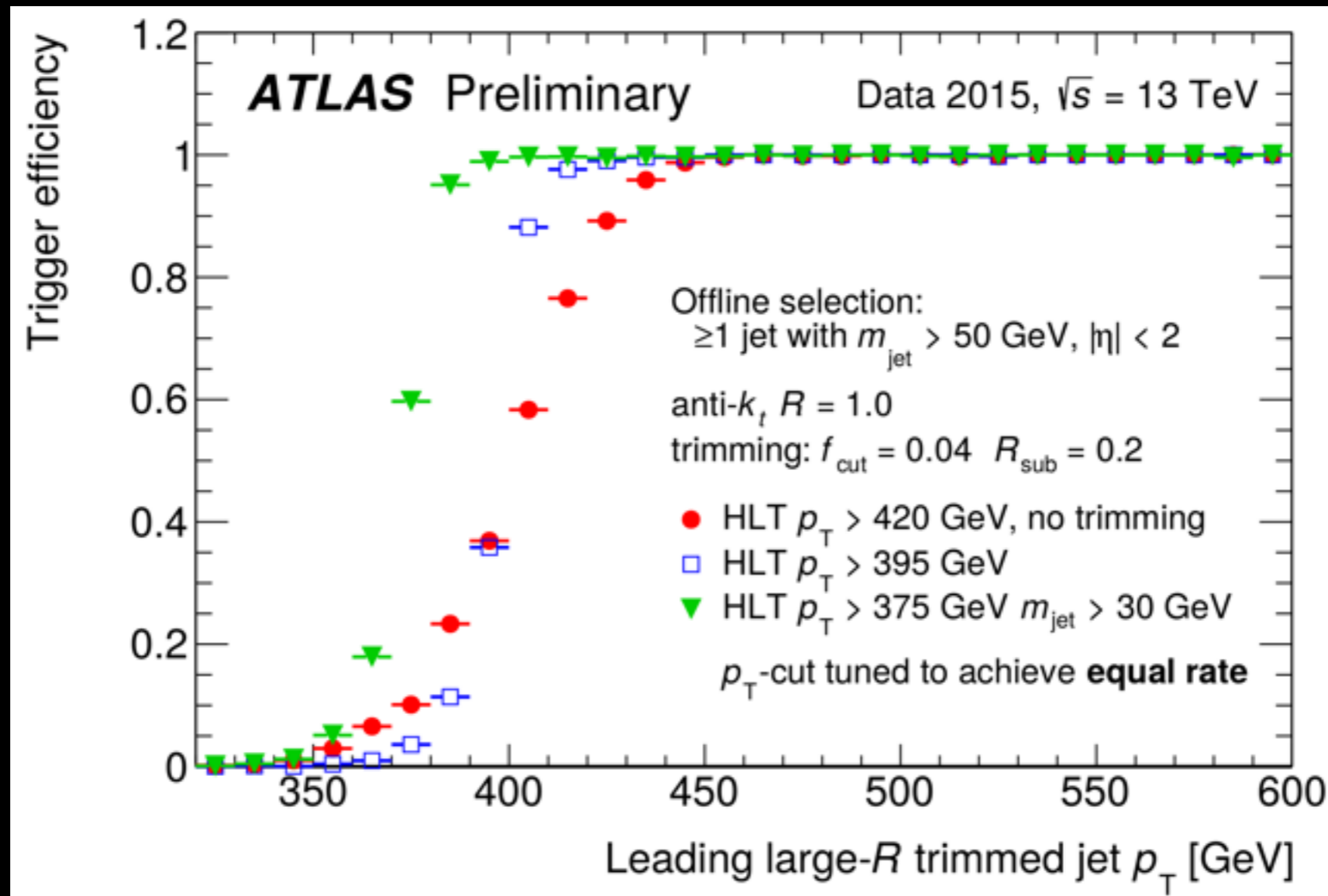
Optimised minimal input ensemble performing well for each ML alg.  
 Calo substructure only.  
 Implicit pt/mass dependence.

Observable	W-Boson Tagging		Top-Quark Tagging	
	BDT	DNN	BDT	DNN
$ECF_1$		○	○	○
$ECF_2$	○	○		○
$ECF_3$	○	○	○	○
$C_2$		○	○	○
$D_2$	○	○	○	○
$\tau_1$	○	○		○
$\tau_2$		○	○	○
$\tau_3$				○
$\tau_{21}$	○	○	○	○
$\tau_{32}$			○	○
$R_2^{FW}$	○	○		
$S$	○	○		
$\mathcal{P}$	○	○		
$\mathcal{D}$		○		
$a_3$	○	○		
$A$	○	○		
$T_{MIN}$				
$T_{MAJ}$				
$Z_{CUT}$		○		
$\mu_{12}$		○		
$\sqrt{d_{12}}$		○	○	○
$\sqrt{d_{23}}$		○	○	○
$KtDR$	○	○		
$Q_w$			○	○

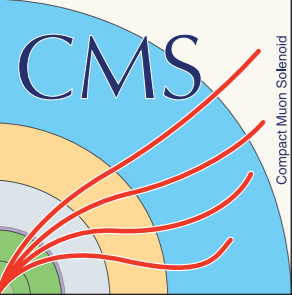




# JET SUBSTRUCTURE TRIGGERS

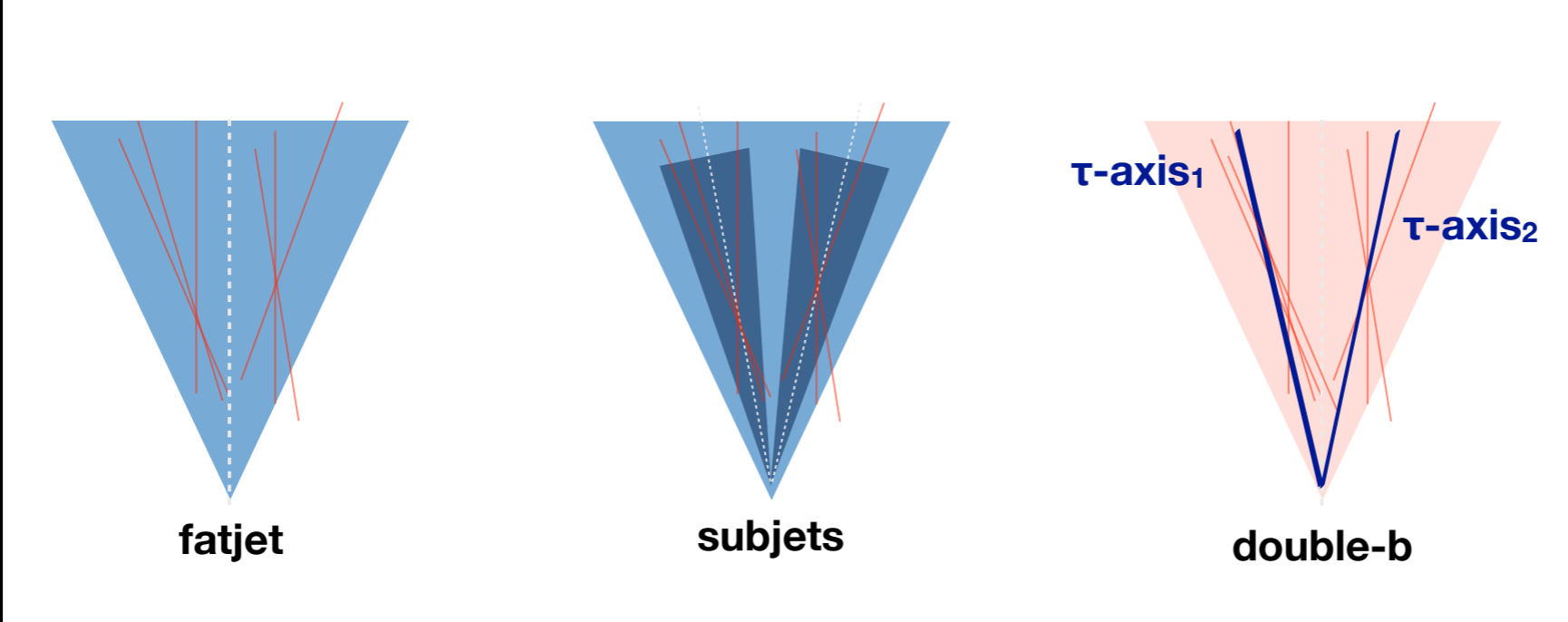


- Selection on jet mass with trimming cuts background, allowing drastic lowering of threshold.



# H BOSON TAGGING

# DOUBLE B-TAGGING



N-subjettiness axes used as proxy for jet axes for b-tagging.

