

# Jets, E<sub>T</sub>miss, and boosted jet identification in high-pileup conditions with ATLAS

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on behalf of the ATLAS Collaboration

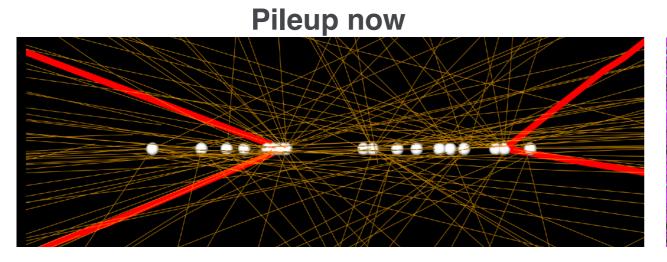
34th International Conference on High Energy Physics

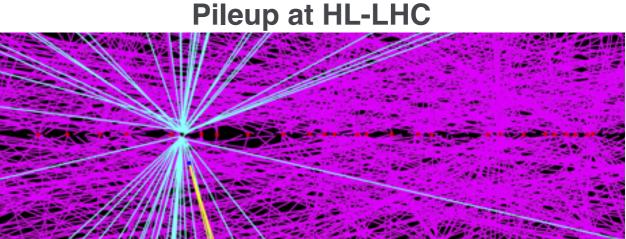
Seoul, South Korea 7 July 2018



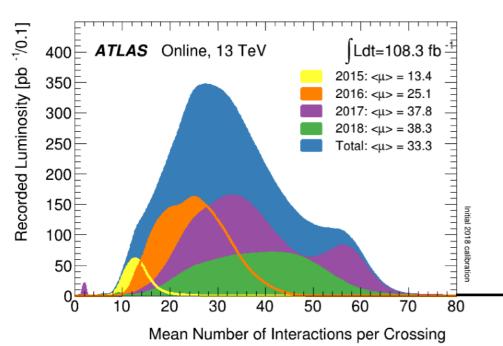
# The Problem with Pileup

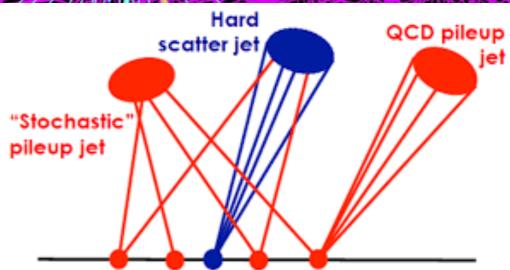
Pileup from additional collisions is a big problem, and will be even worse at the High Luminosity LHC





- Particles from pileup collisions can:
  - Add additional jets not from the hard-scatter
  - Overlap with hard scatter jets, altering their energy & structure

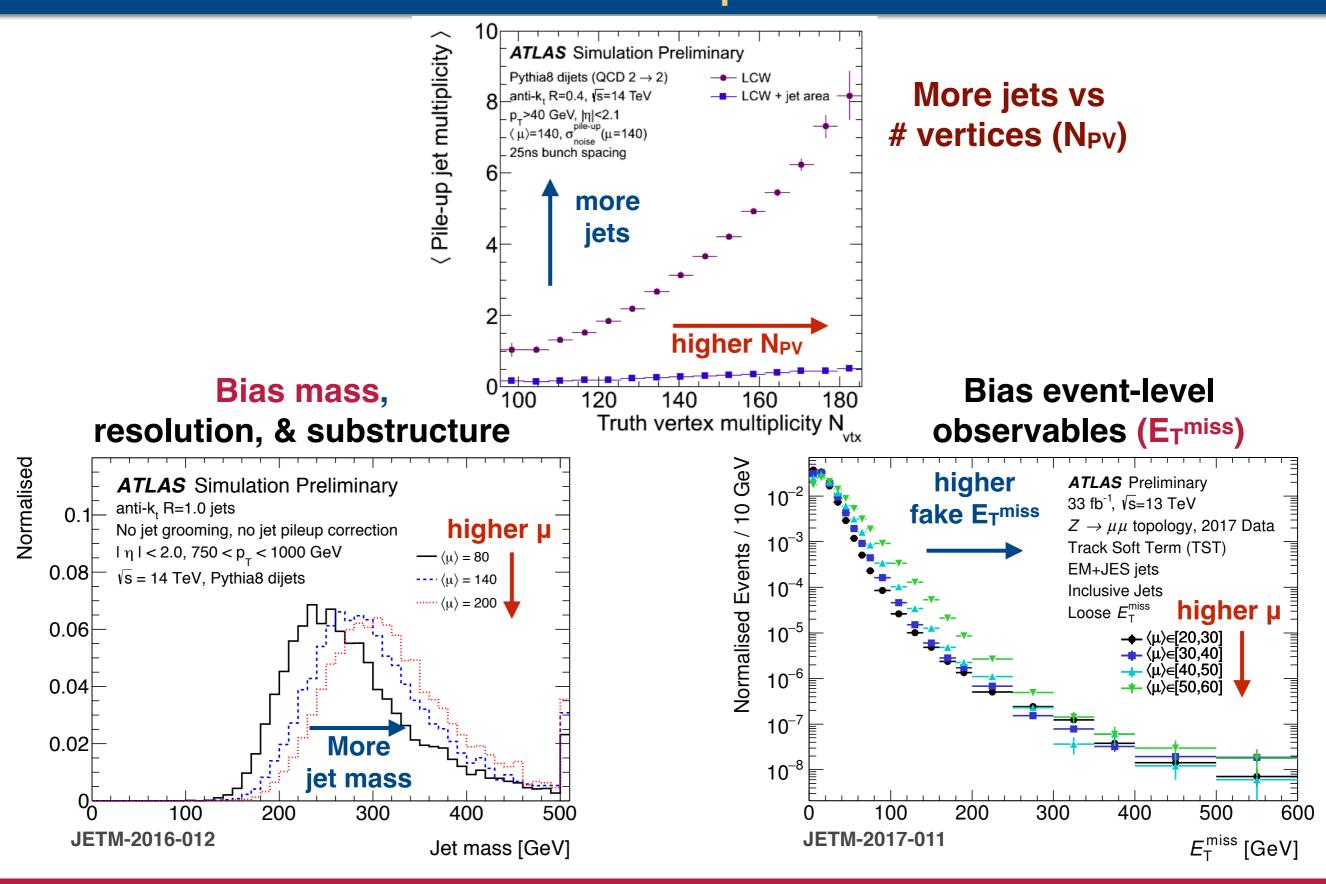




Every year the # of interactions per event (μ) increases, and will reach ~200 at the HL-LHC!

200

# The Effect of Pileup



# Jet Vertex Tagger

- Multivariate JVT connects jets to pileup vertices using tracking information
- Large reduction in pileup jets within tracker ( $|\eta| < 2.4$ )
- HL-LHC: improve & extend tracker to InI = 4.0

 Proposed High Granularity Timing Detector (HGTD) aims for 30 ps timing resolution to match jets to pileup vertices

See HGTD talk by

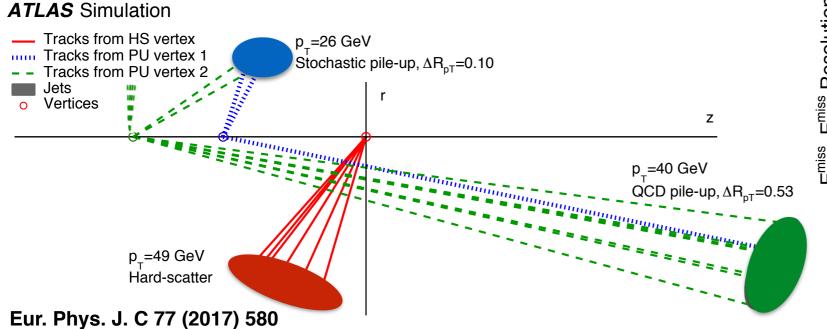
**Ariel Schwartzman** 

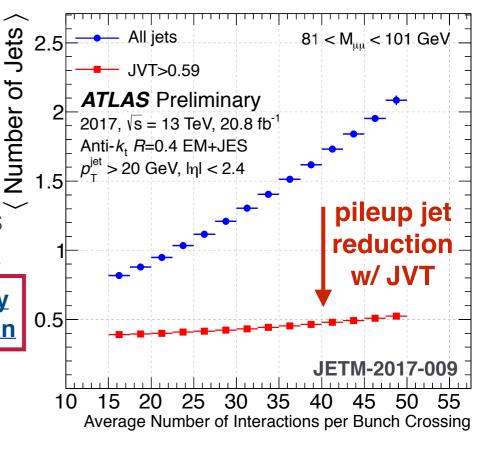
Beyond tracker use **Forward JVT**:

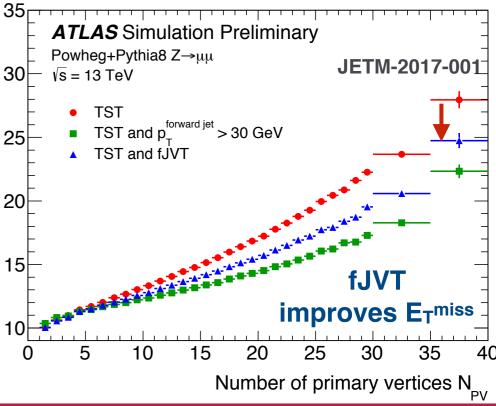
Remove forward QCD jets that balance a pileup vertex

Remove stochastic jets (from many vertices) using spatial

and timing correlations of clusters

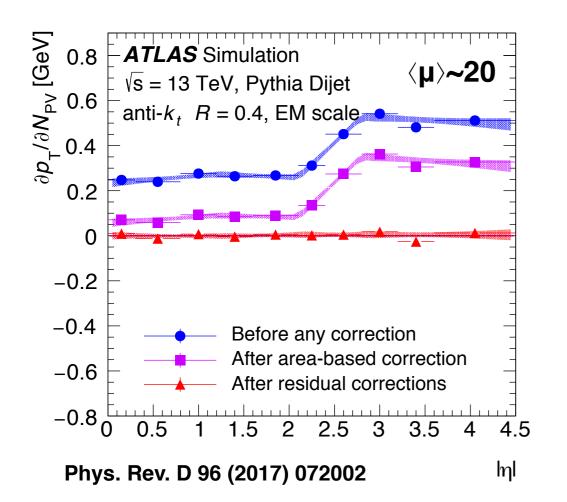


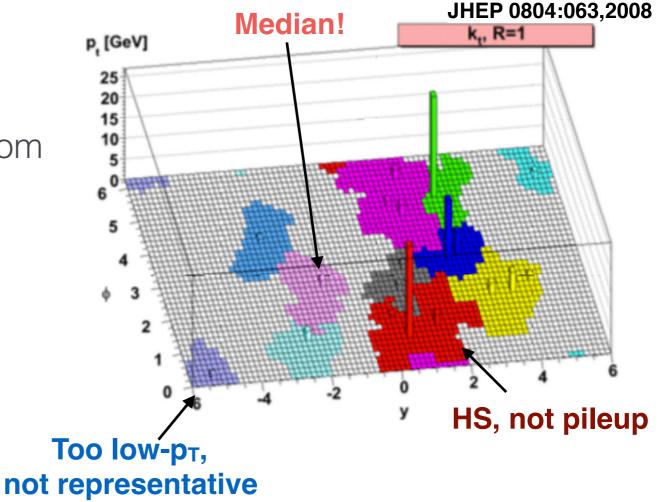




#### Area-based subtraction

- Hard-scatter jets can include overlapping pileup energy & pileup clusters
- Event-wide ambient p<sub>T</sub> density (p) taken from median p<sub>T</sub> of (pileup sensitive) k<sub>t</sub> jets
- Subtract p from each anti-k<sub>t</sub> jet according to its area



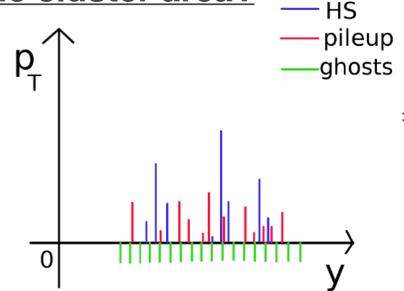


- Residual correction vs NPV and μ due to changing calorimeter geometry
- Works well currently, but difficult at HL-LHC

# Cluster-level Subtraction

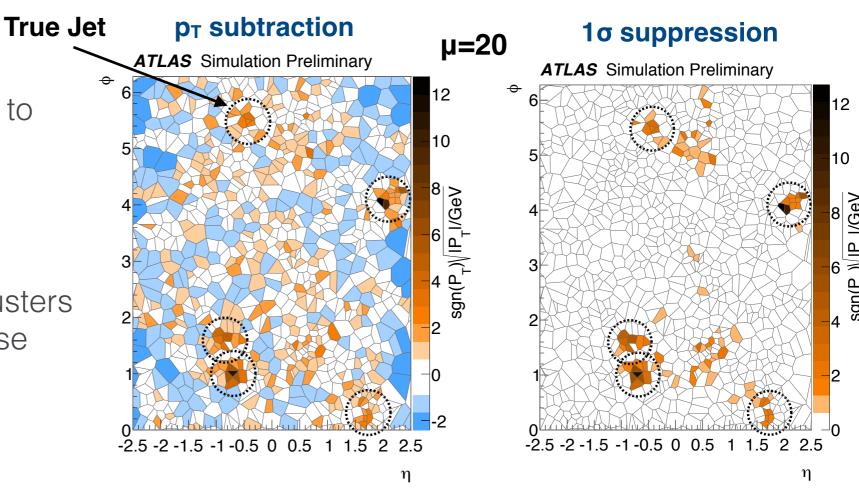
Translate area-based subtraction to clusters. How to define cluster area?

- Constituent Subtraction: Add fake "ghost particles" uniformly to event, and cluster alongside cells
  - Number of clustered ghosts ~ area
- Correct topoclusters according to N<sub>ghost</sub> & event ρ
   (i.e. give ghosts negative p<sub>T</sub>)



#### **Clusters & Voronoi Area**

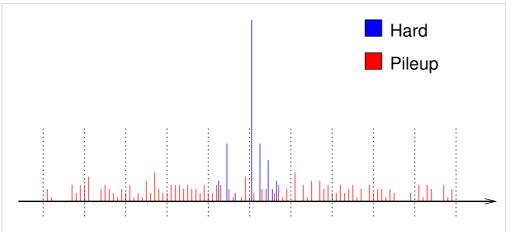
- Voronoi Area:  $\eta$ - $\phi$  area closest to each cluster
- Subtract ρ from each cluster according to Voronoi area
- 1σ suppression: remove all clusters with low significance above noise

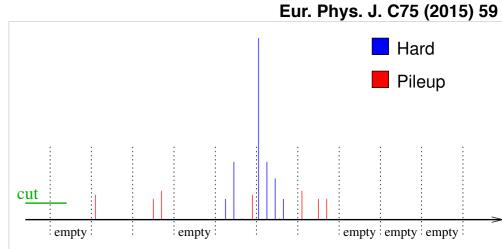


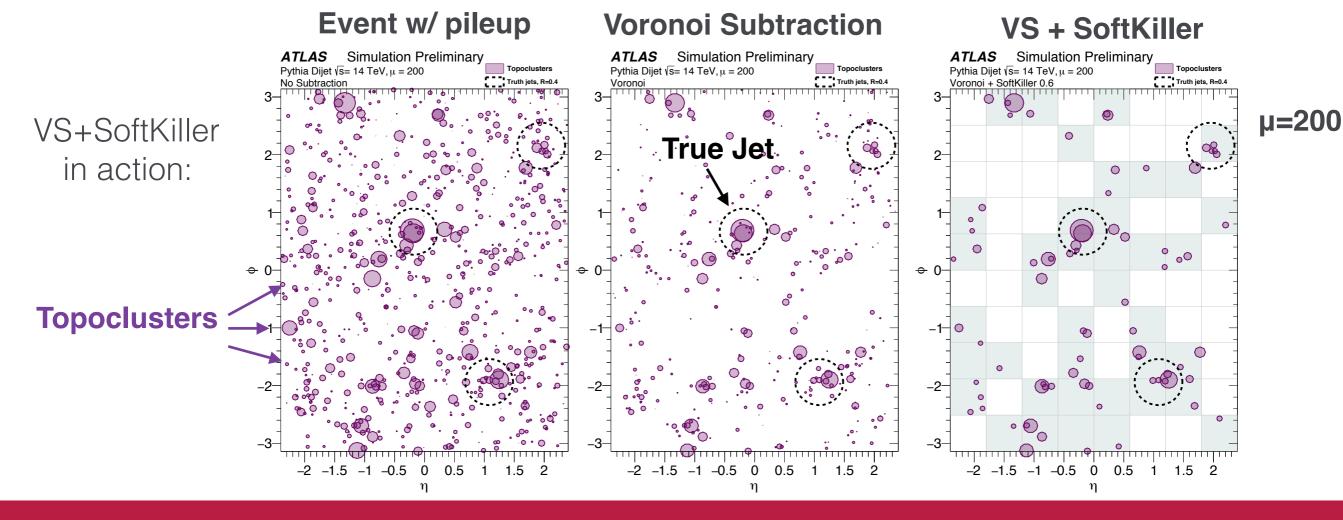
### SoftKiller

- SoftKiller targets individual pileup clusters surviving Constituent or Voronoi subtraction
- Reject all clusters below an event-specific p<sub>T</sub> cut

p<sub>T</sub> cut chosen
 so detector is half
 empty for the event

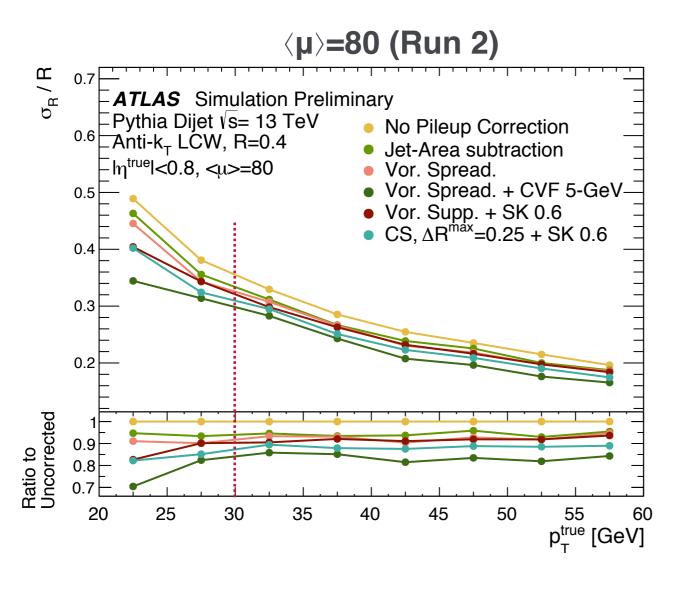


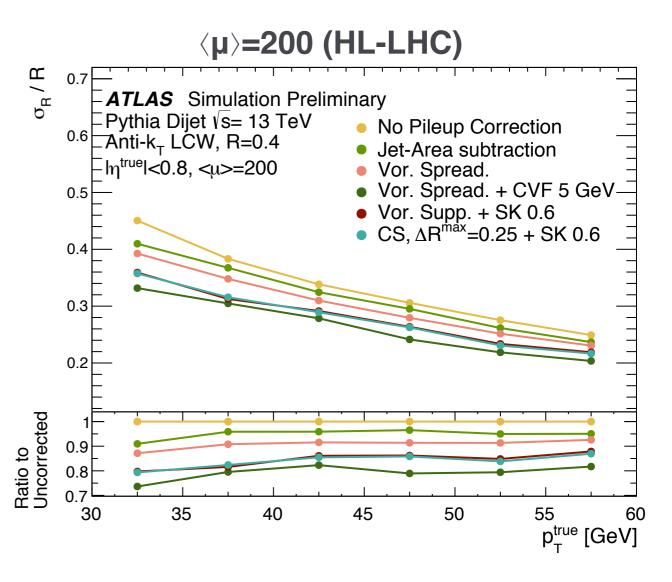




# Cluster-level Performance

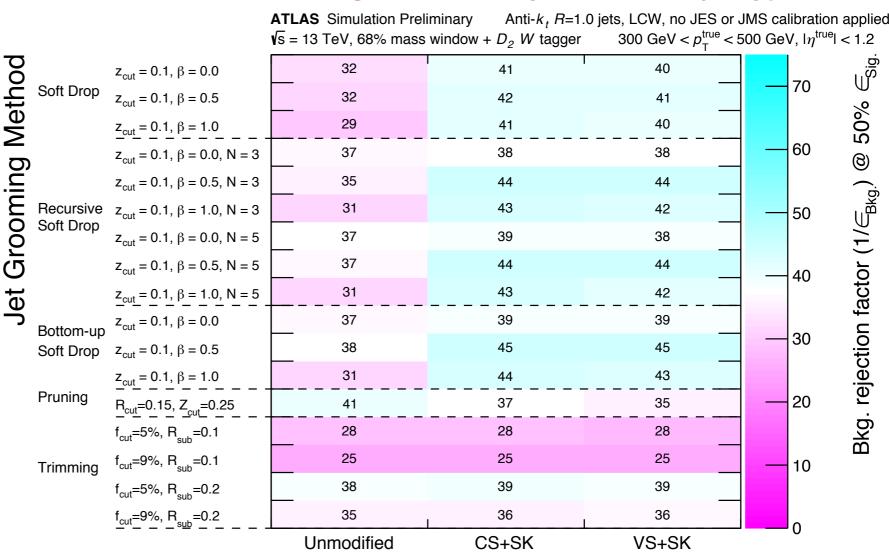
- Large reduction in jet energy resolution compared to jet-area subtraction in high pileup conditions
- Gains even at lower μ → ongoing studies for use Run 2 & 3 data





# Background rejection of W tagger at 50% signal efficiency for various jet types

- Correcting clusters also improves jet substructure
  - Essential for tagging boosted top, W, Z, & Higgs
- Scan over clusters types
   & grooming methods
   for best combination
  - Tagging efficiency, fake rejection, and mass stability w.r.t. pileup



Good performance from
 trimmed LCtopo & soft drop CS+SK / VS+SK jets

Modifications to LCW clusters

JETM-2018-003

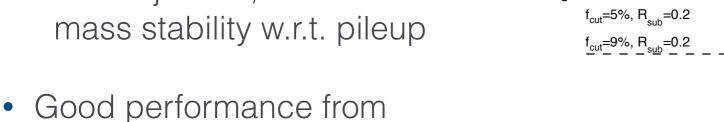
• Final algorithms will be calibrated with full in situ chain used for small-R jets

# Jet Tagging Performance

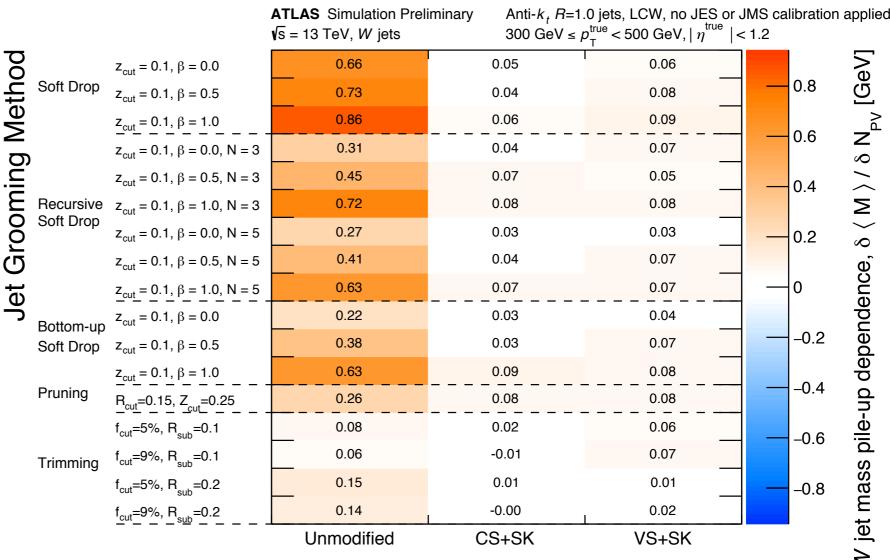
 $\langle \mu \rangle$ ~20

#### W mass stability vs N<sub>PV</sub> for various jet types

- Correcting clusters also improves jet substructure
  - Essential for tagging boosted top, W, Z, & Higgs
- Scan over clusters types
   & grooming methods
   for best combination
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trimmed LCtopo & soft drop CS+SK / VS+SK jets



Modifications to LCW clusters

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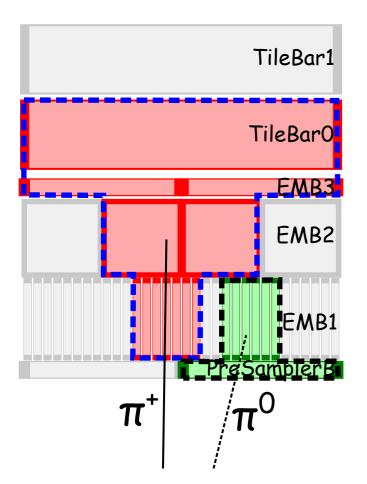
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# Particle flow jets

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

Match tracks to topoclusters, removing charged energy while keeping neutral component

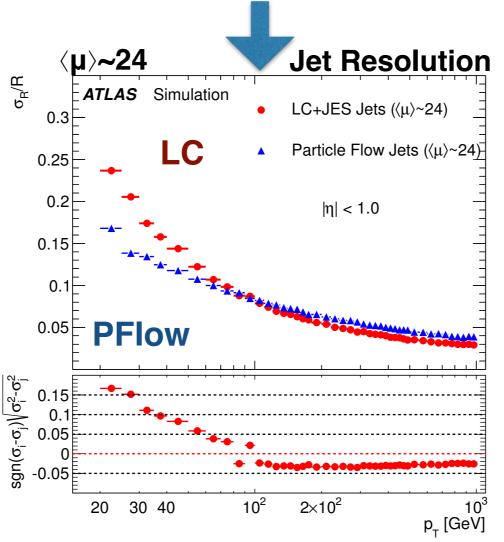


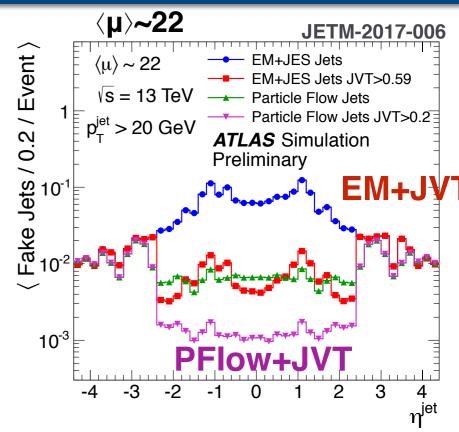


Topoclusters consistent with pileup tracks are rejected, reducing pileup

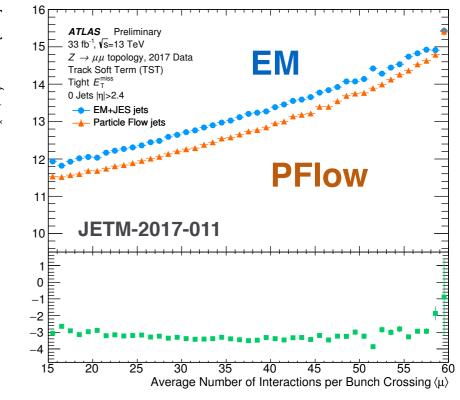
Improved energy resolution

at low p<sub>T</sub>, driven by accurate track measurements



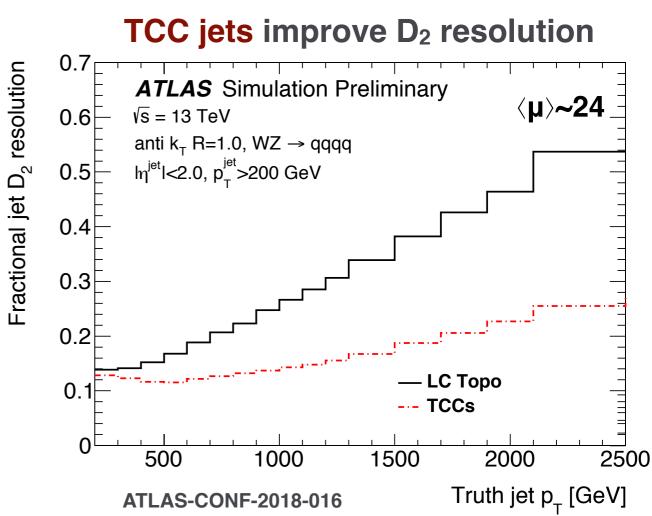






### Track-Calo Clusters (TCC)

- At high-p<sub>T</sub>, track p<sub>T</sub> resolution degrades, but extrapolated angular resolution improves
- TCC uses tracks to correct spatial resolution of coarser calorimeter clusters, not their energy
  - Retains benefits of pileup vertex rejection
  - Large improvement to substructure variables (like D<sub>2</sub>), benefiting taggers
  - Robust against pileup



#### Conclusion

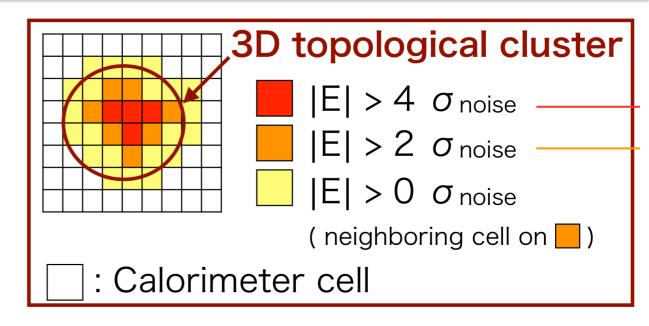
- High pileup environment now & at the HL-LHC offers challenges for jet calibration & tagging
- Various new techniques for mitigating pileup impact on jet measurements, E<sub>T</sub>miss, and identification of high-p<sub>T</sub> jets (boson & top tagging)
  - Great deal of experimentation significant effort by software team to ease implementation
  - Plan to converge in Run 3 on optimal combination of techniques
- Significant HL-LHC upgrades will improve track-based pileup tagging

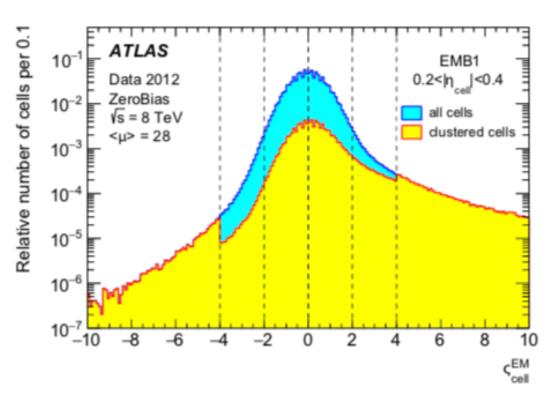


# Backup

#### Jet Reconstruction

- Inputs to jets are clusters (collections of neighboring calorimeter cells)
- Inherent noise suppression from 4-2-0 clustering algorithm:
  - Low energy pileup rejected
- Anti-k<sub>T</sub> jet-finding algorithm focuses on hardest energy deposits, w/ reduced shaping by pileup
- However:
  - Higher-pt pileup jets still get through
  - Selected clusters are still affected by pileup

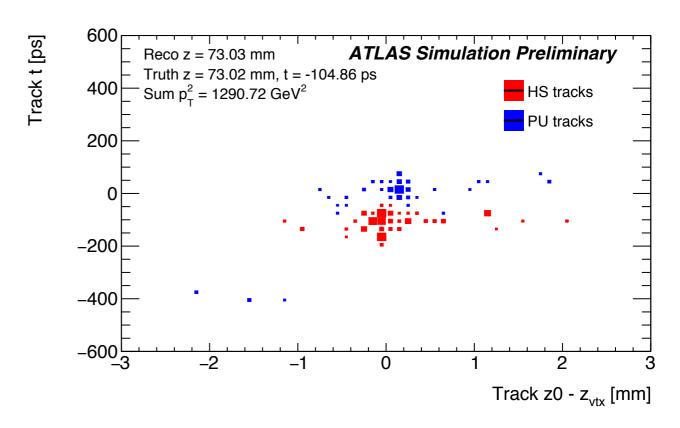


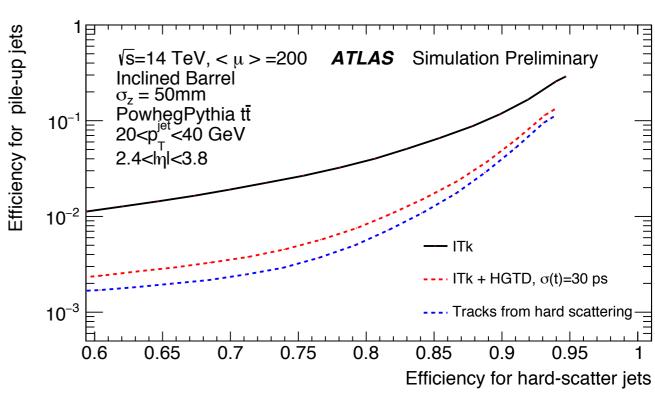


Most **low-significance cells** removed by clustering

# High granularity timing detector

- HL-LHC will see <mu>=200,
   with ~1.8 vertex per mm
  - Impossible to distinguish pileup vs hard-scatter tracks via geometry only
  - Within a bunch crossing, collisions occur with  $\sigma_t$  = 180 ps
- HGTD can resolve track time within 30 ps
- Large reduction in tracks from pileup vertices close to hard scatter





# Jet Vertex Tagger (JVT)

Eur. Phys. J. C (2016) 76:581

$$R_{pT} = \frac{\sum_{k} p_{T}^{trk_{k}}(PV_{0})}{p_{T}^{jet}}$$

- Multivariate using R<sub>pT</sub> and corrJVF
- R<sub>pT</sub> is ratio of jet's p<sub>T</sub> matched to hard scatter tracks
- corrJVF compare fraction of hard scatter tracks against pileup tracks
  - Corrected by # pileup tracks to remove N<sub>PV</sub> dependence

$$corrJVF = \frac{\sum_{k} p_{T}^{trk_{k}}(PV_{0})}{\sum_{l} p_{T}^{trk_{l}}(PV_{0}) + \frac{\sum_{n \geq 1} \sum_{l} p_{T}^{trk_{l}}(PV_{n})}{(k \cdot n_{trk}^{PU})}}$$

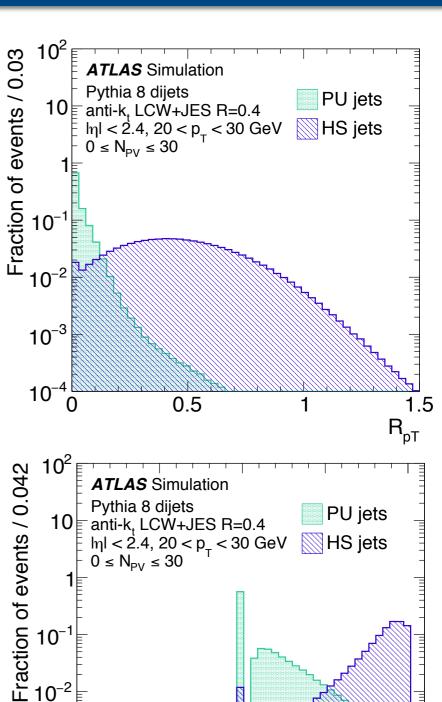
$$JVF[jet2, PV1] = 0$$

$$JVF[jet1, PV2] = 1$$

$$JVF[jet1, PV2] = 1$$

$$JVF[jet1, PV2] = f$$

$$Z$$



10<sup>-3</sup>

 $10^{-4}$ 

-0.5

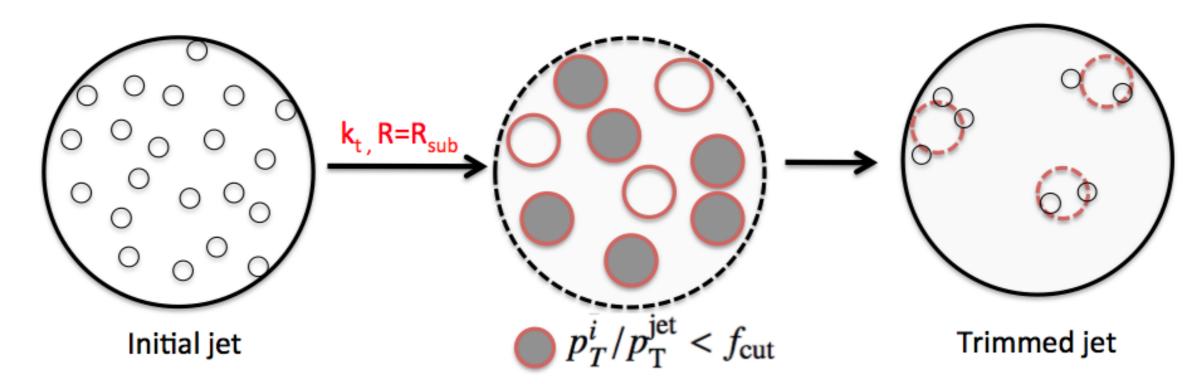
0.5

corrJVF

0

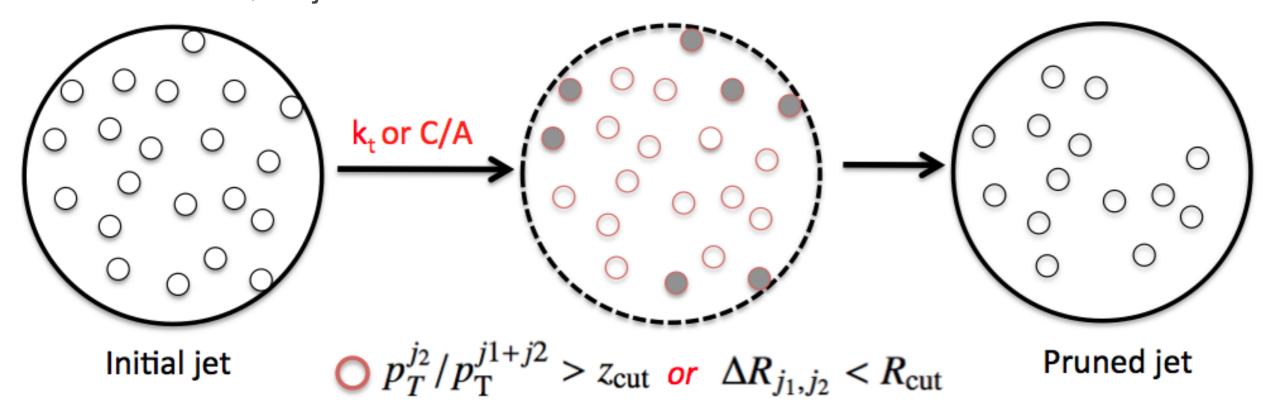
# Jet Grooming: Trimming

- ATLAS standard grooming procedure
- Target softer radiation from pileup, MPI, & ISR
- Recluster constituents into small-R sub-jets R<sub>sub</sub> ~ 0.2
- Remove sub-jets with fractional p<sub>T</sub> < f<sub>cut</sub> ~ 3%



# Jet Grooming: Pruning

- Remove soft low-p<sub>T</sub> clusters, but keep large-angle radiation
- Redo jet clustering (C/A or k<sub>t</sub>), and at each stage cluster if either:
  - Not soft: p<sub>T</sub> fraction of second constituent is > z<sub>cut</sub>
  - Close-by:  $\Delta R_{1,2} < R_{cut}$
- Otherwise, reject 2nd constituent



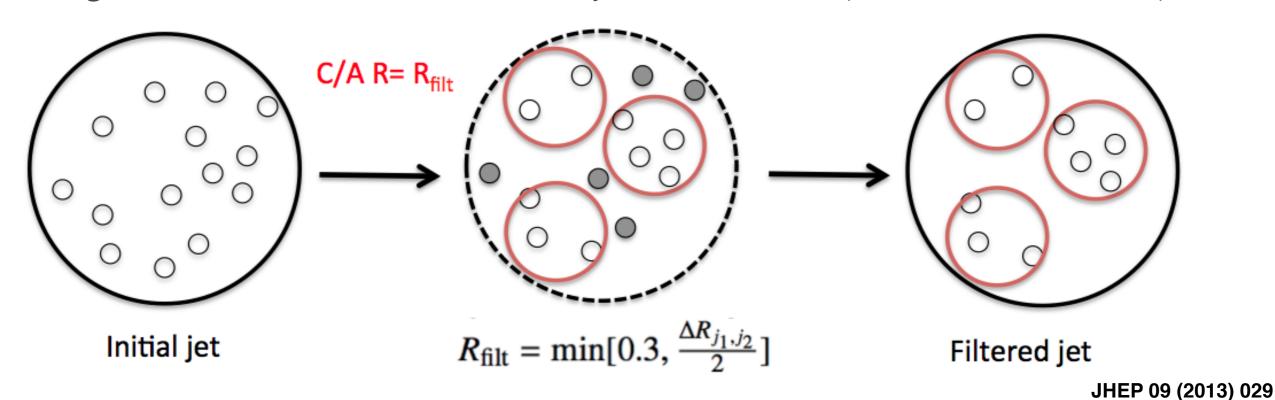
JHEP 09 (2013) 029

#### Jet Grooming: Modified Mass Drop + Filtering

- Iterative declustering of a C-A jet targeting soft and wide-angle radiation
  - Remove branches with p<sub>T</sub> imbalance, provided no large drop in mass
- Requirements on 2 subjets from last clustering stage:

(i - Mass Drop) : 
$$m(j_1) < \mu \times m(j_2)$$
  
(ii - Balanced Splitting) :  $\frac{min(p_{T,1}, p_{T,2})}{p_{T,1} + p_{T,2}} > z_{\text{cut}}$ 

- If either fails, remove softest jet j2, and continue procedure
- If both pass, end procedure and keep jet
- **Filtering**: Recluster constituents into 3 C-A jets of radius **R**<sub>filt</sub> (discard extra clusters)



# Jet Grooming: Soft drop

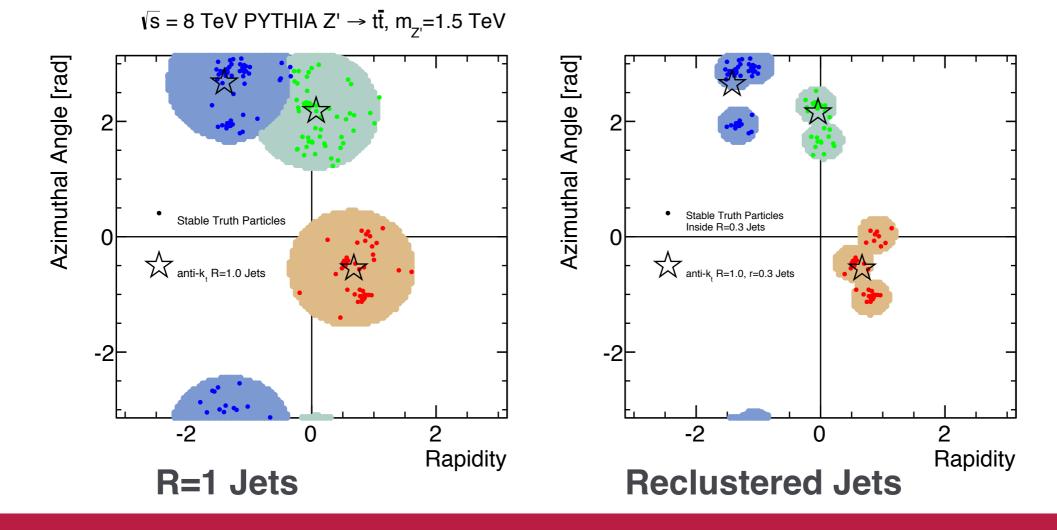
- Extends mMDT to reject wide-angled radiation
- Run backwards through clustering of C/A jet, removing constituent if:

$$\frac{min(p_{T,1}, p_{T,2})}{p_{T,1} + p_{T,2}} < z_{\text{cut}} \left(\frac{\Delta R_{12}}{R_0}\right)^{\beta}$$

- Larger β allows for more soft & wide-angled radiation in a jet
- Recursive soft drop: Continue the procedure the soft-drop requirements are passed N times
  - Continues through good constituents, grooming them as well
- Bottom-up soft drop: Apply soft drop criteria during jet reconstruction

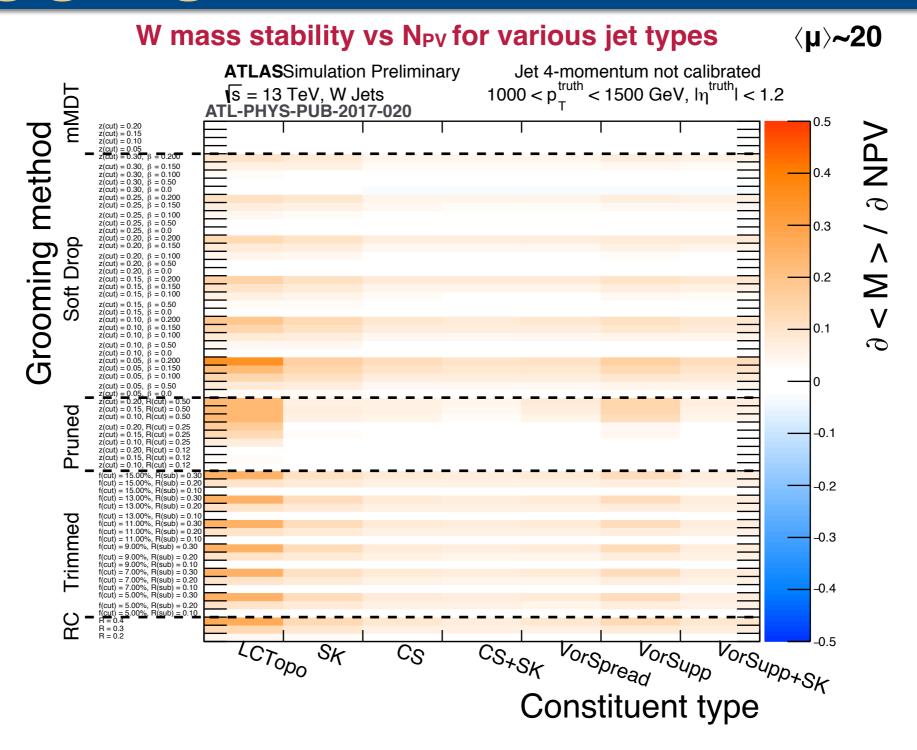
# Jet Reclustering

- Build large-R jets from fully-calibrated R=0.4 jets
  - Benefit from small-R pileup suppression
  - Propagate full suite of small-R uncertainties
  - No additional large-R calibration needed flexible choice in large-R radius
- Can use other grooming methods with R=0.4 jets



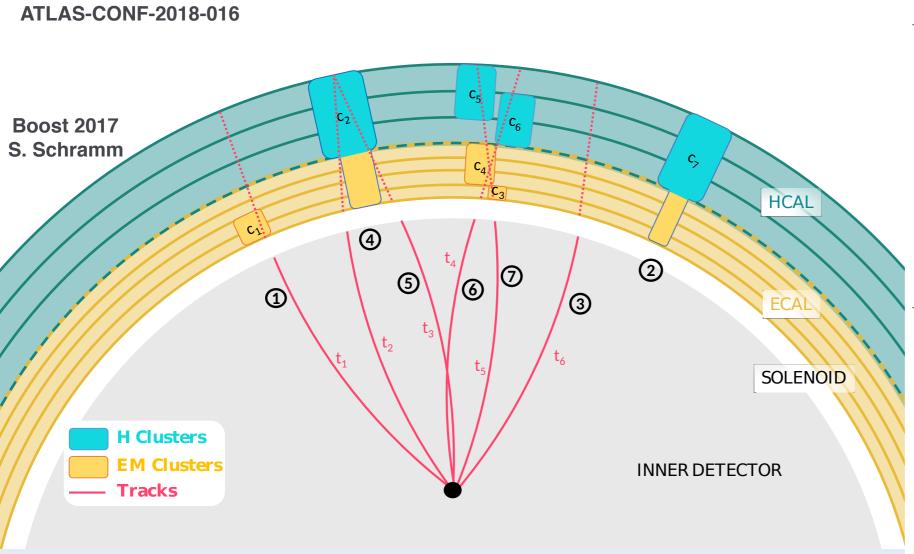
arXiv:1407.2922

# Jet Tagging Performance



- Scan over many clusters types & grooming methods for best combination
- Tagging efficiency, fake rejection, and mass stability w.r.t. pileup

#### Track-Calo Clusters Method



TCC reconstruction: use track spatial coordinates and cluster energy components

Unique track-cluster match:

$$TCC_{\widehat{1}} = (p_T^{c_1}, \eta^{t_1}, \phi^{t_1}, m^{c_1} = 0)$$

**Unmatched cluster:** 

$$TCC_{(2)} = (p_T^{c_7}, \eta^{c_7}, \phi^{c_7}, m^{c_7} = 0)$$

**Unmatched track:** 

$$TCC_{3} = (p_T^{t_6}, \eta^{t_6}, \phi^{t_6}, m^{t_6} = 0)$$

In case of track-cluster-multi-matches, create one TCC object per hard-scatter PV track, and share the energy based on  $p_{\tau}$  ratios:

$$TCC_{(4)} = (\alpha p_T^{c_2}, \eta^{t_2}, \phi^{t_2}, \alpha m^{c_2} = 0)$$

$$TCC_{\mathfrak{S}} = (\beta p_{T}^{c_2}, \eta^{t_3}, \phi^{t_3}, \beta m^{c_2} = 0)$$

$$\alpha = \frac{p_{\mathrm{T}}^{t_2}}{p_{\mathrm{T}} \left[ \mathbf{p}^{t_2} + \mathbf{p}^{t_3} \right]} \qquad \beta = \frac{p_{\mathrm{T}}^{t_3}}{p_{\mathrm{T}} \left[ \mathbf{p}^{t_2} + \mathbf{p}^{t_3} \right]}$$

