

# Jet substructure measurements at ATLAS and CMS

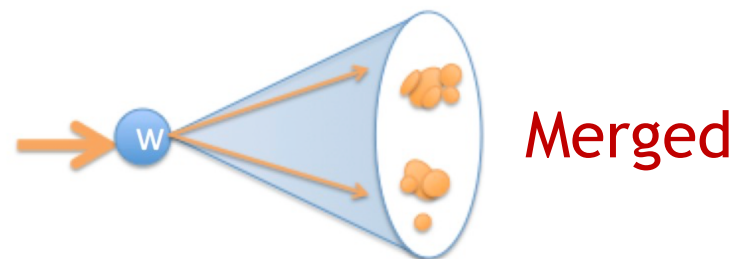
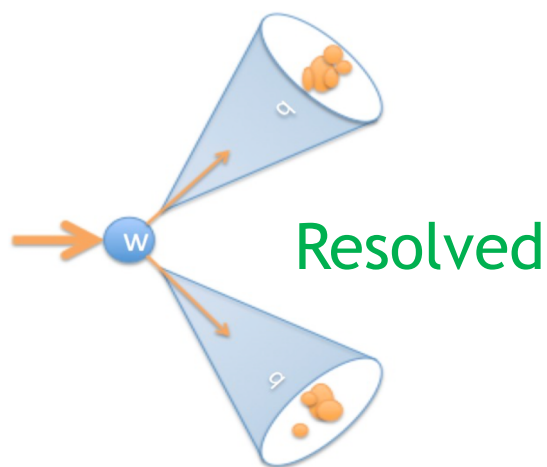
Aparajita Dattagupta (University of Oregon)

On behalf of ATLAS and CMS

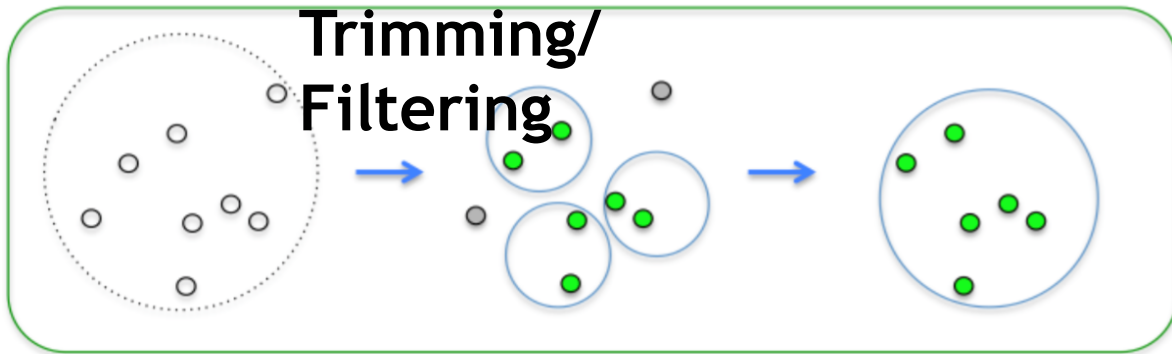
SM@LHC

2-5 May 2017

- With increased energies of the LHC collisions, advancement on the theory side and in experimental methods, we are able to treat a jet as more than a four-vector substitute for a parton and understand the internal structure of the jet.
- Jet substructure techniques can be used to improve sensitivity of measuring hadronic decays of boosted heavy particles like Higgs, W/Z and top. Requires understanding of QCD radiation inside the jet and structure of constituent particles.
- Large-R jets of usually  $R=1$  or  $0.8$  are used to reconstruct these boosted objects,
  - More prone to pileup effects due to a larger area.
  - Jet mass of these large-R jets important to measure well.
- Quark-gluon tagging: example of substructure techniques useful in signal-background discrimination.
- W/Z/H- and top tagging can be used to separate their hadronic final states from multi-jet background.



- Remove soft component targeting Pileup (PU) and Underlying event (UE)
- Better signal-background separation
- Improves resolution of signal jet mass peak



*Type 1 (Trimming)* : If  $p_T(\text{subset } i) / p_T(\text{jet}) < f_{\text{cut}}$  : discard subset.  
*Type 2* : If  $N_{\text{subjets}} \leq N_{\text{min}}$  : discard jet.  
 Resulting jet is sum of subjets.

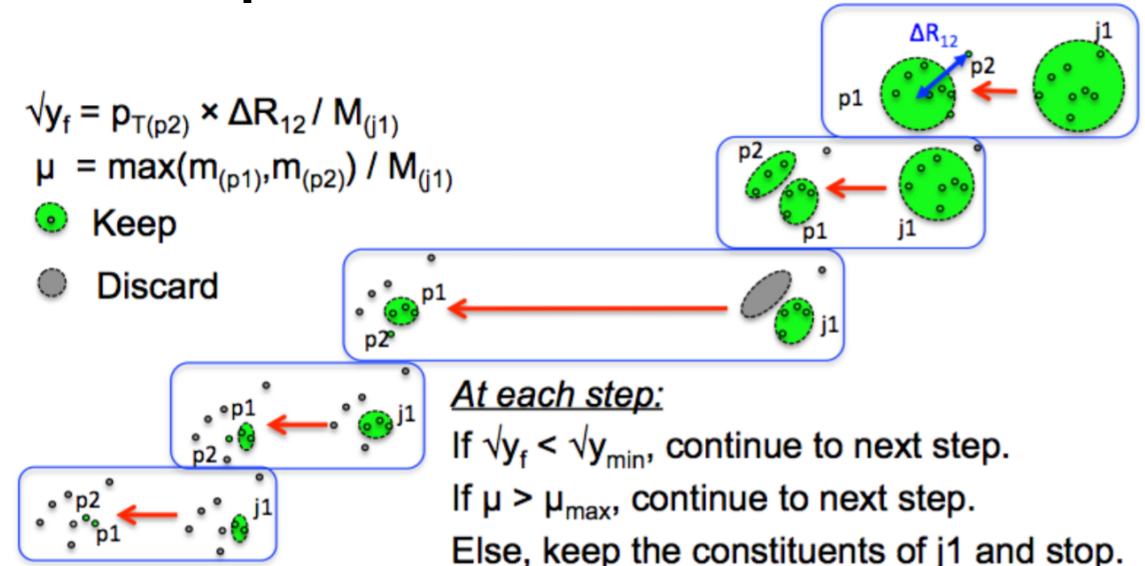
## Mass drop/momentum

$$\sqrt{y_f} = p_{T(p2)} \times \Delta R_{12} / M_{(j1)}$$

$$\mu = \max(m_{(p1)}, m_{(p2)}) / M_{(j1)}$$

● Keep

● Discard



## Pruning



$$z = p_T(i) / p_T(i+j)$$

$$p_T(i) < p_T(j)$$

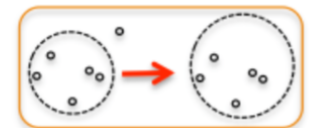
*At each step:*

If  $\Delta R_{ij} < d_{\text{cut}}$  **OR**  $z > z_{\text{cut}}$   
 continue to next step.

Otherwise, discard object i.

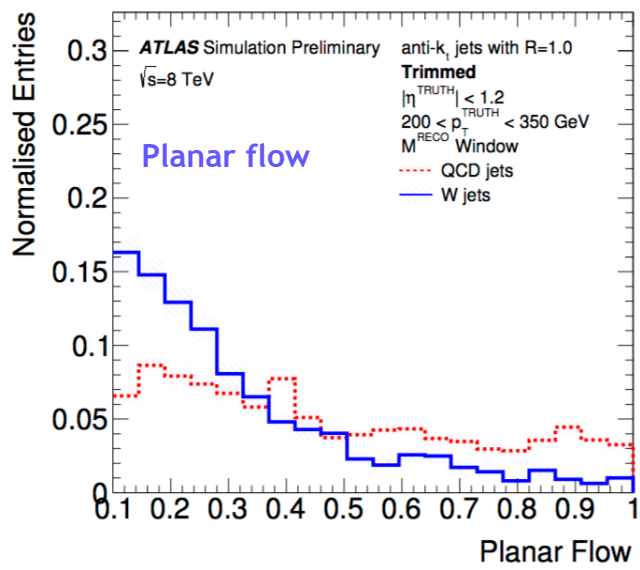
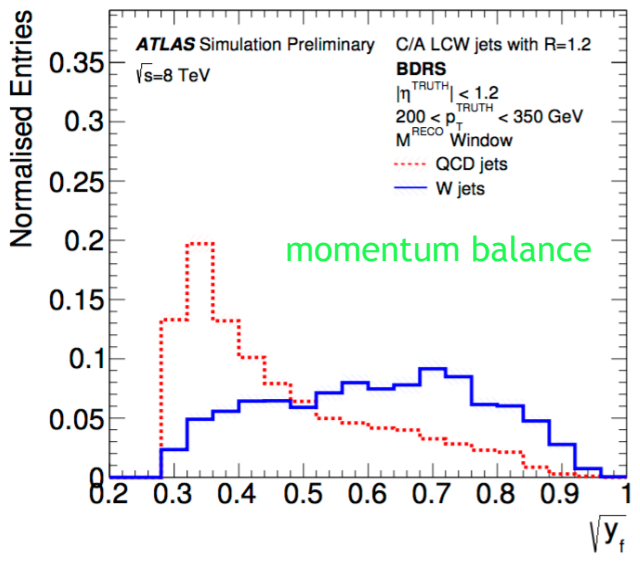
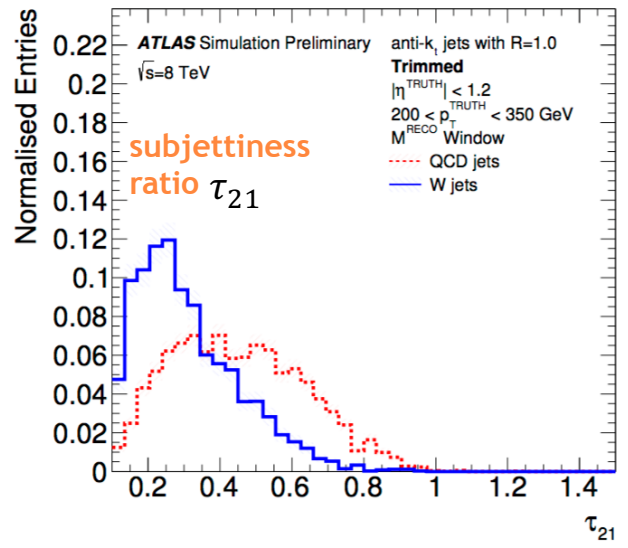
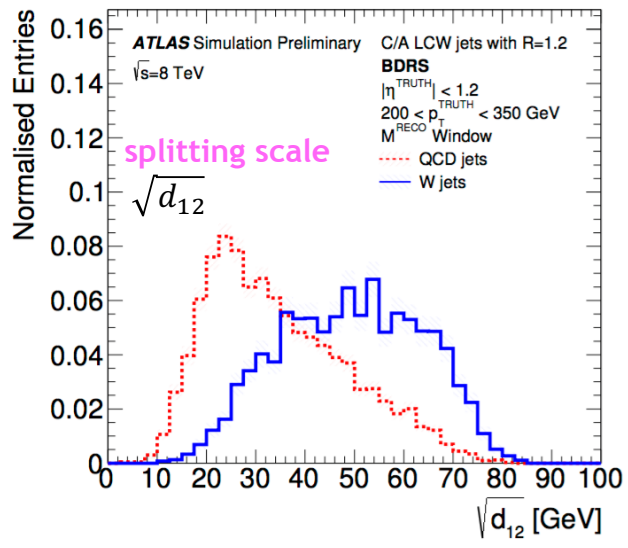
for each step in clustering

Re-cluster via C/A or kT





# Substructure variables for boosted object tagging



- **Splitting scale**: for a jet re-clustered with the kT algorithm-kT distance between two proto jets in the final clustering step
- **N-subjettness**: extent to which the substructure of a jet resembles N or fewer subjets.
- **Momentum balance**: ratio of splitting scale and jet mass of the final clustering step.
- **Mass-drop**: last step of recombination when two proto jets are combined into one. Fraction of mass carried by the most massive proto jet.
- **Jet width**: radial moment in  $\eta, \phi$  space weighted by  $p_T$ .
- **Planar flow**: how uniformly spread out the jet energy is perpendicular to it's axis.

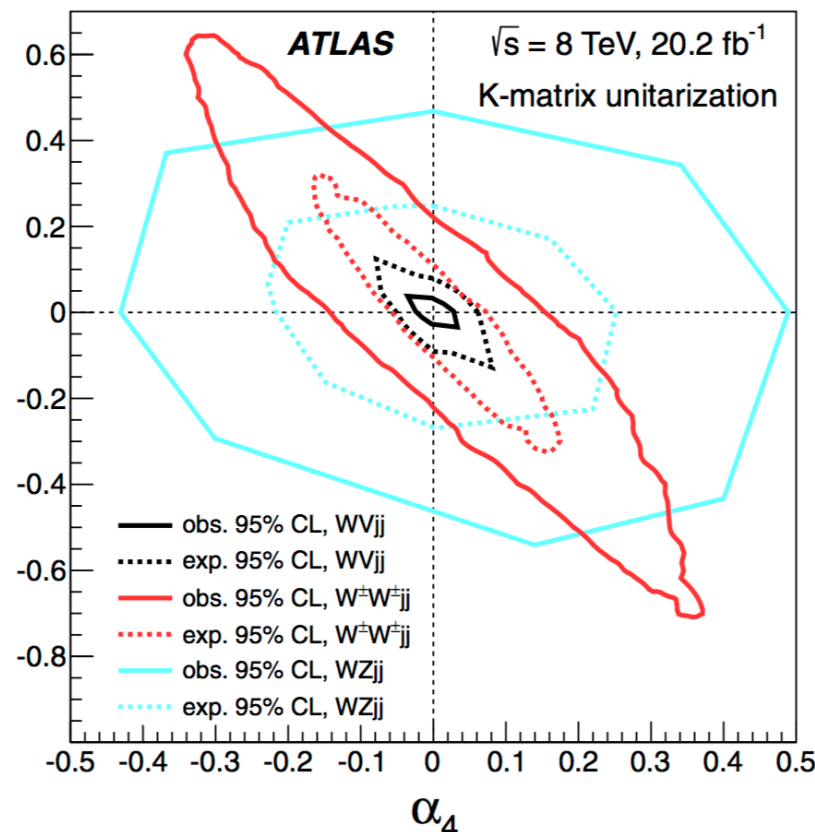
[ATL-PHYS-PUB-2014-004](https://arxiv.org/abs/1403.0004)



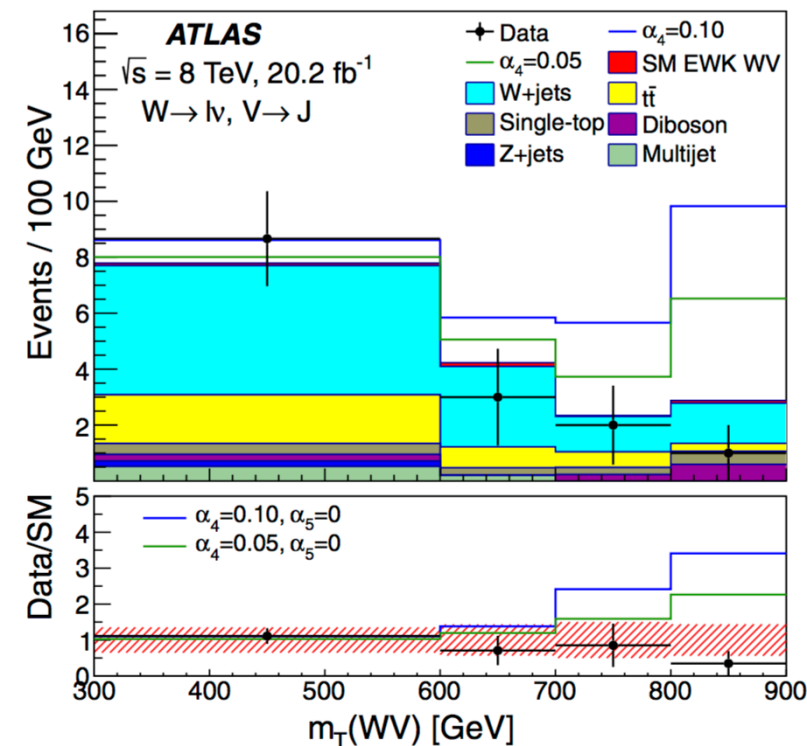
- Vector boson scattering (VBS)
  - key probe of EW symmetry breaking
  - Sensitive to anomalous quartic gauge couplings
- Previous searches for aQGCs in VBS have focussed on leptonic decays: smaller branching fraction
- Mass-drop filtered jets are used. For multiple large-R jets, the one with mass closest to the nominal W mass is used.

### Merged regime results

- aQGC limits 40% better than using resolved events only.
- merged category is powerful at  $\alpha_5$  highest- $M_T$  ( $WV$ ) bins.
- More stringent limits than previous constraints on these parameters in searches for VBS in the  $W^{+/-}W^{+/-}$  and  $WZ$  leptonic decay channels



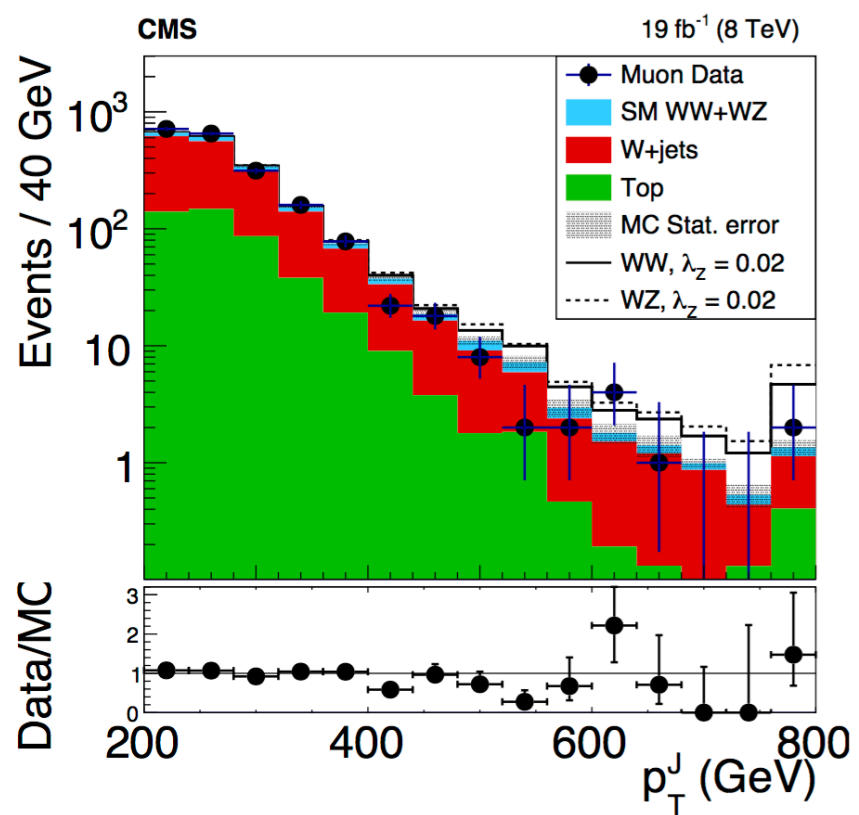
2D limits on aQGC parameters for current result (black) and previous results (red).



$m_T(WV)$  distribution used to extract aQGC limits: in merged regime



- Search for new physics as aTGC in WW and WZ diboson production at  $\sqrt{s} = 8$  TeV.
- Events are selected with one W boson decaying leptonically and a W or Z boson whose decay products are merged into a single reconstructed jet.
- Higher cross section than a leptonic final state but larger backgrounds from W+Jets process
- Pruned CA R=0.8 jets are used to reconstruct the boosted W boson while the Z boson decays to invisible products
- N-subjettiness observables  $\tau_{21} = \tau_2/\tau_1$  is used to tag the W/Z-jet.



V(had)  $p_T$  distribution shown: effects of aTGCs are shown by the solid and dotted lines

	$c_{WWW} / \Lambda^2$ ( $\text{TeV}^{-2}$ )	$c_B / \Lambda^2$ ( $\text{TeV}^{-2}$ )	$c_W / \Lambda^2$ ( $\text{TeV}^{-2}$ )
*	$[-2.7, 2.7]$	$[-14, 17]$	$[-2.0, 5.7]$
CMS W+W-(lep)	$[-5.7, 5.9]$	$[-29.2, 23.9]$	$[-11.4, 5.4]$
ATLAS W+W-(lep)	$[-4.61, 4.60]$	$[-20.9, 26.3]$	$[-5.87, 10.54]$
[43]	$[-4.6, 4.2]$	$[-260, 210]$	$[-4.2, 8.0]$
[44]	$[-3.9, 4.0]$	$[-320, 210]$	$[-4.3, 6.8]$

Summary of one-dimensional limits in the EFT formulation for this analysis (\*) compared to previous results.

- Jet mass of large-R jets useful for tagging Lorentz boosted W/Z and top quarks and rejecting multi jet background.
- Reduce resolution and systematics to improve jet mass.
- Calo-based jet mass definition :

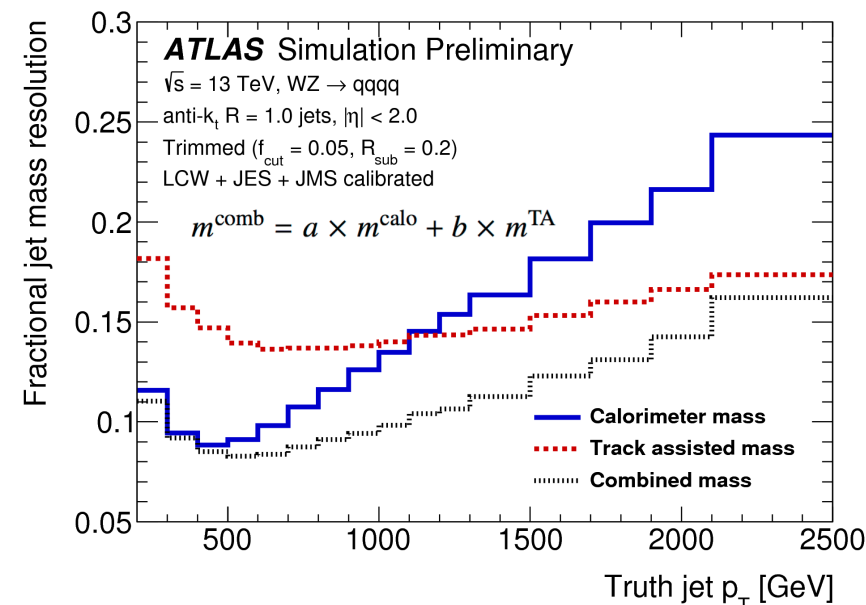
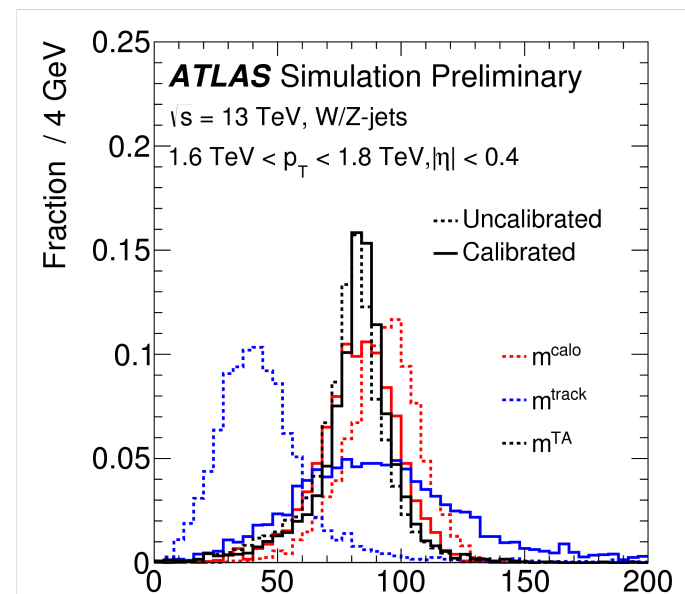
$$m^{\text{calo}} = \sqrt{\left(\sum_{i \in J} E_i\right)^2 - \left(\sum_{i \in J} \vec{p}_i\right)^2}$$

- Track assisted jet mass: complements  $m^{\text{calo}}$ . At high lorentz boost, spread of decay products of heavy particles are of the order of calorimeter granularity

$$m^{\text{TA}} = \frac{p_T^{\text{calo}}}{p_T^{\text{track}}} \times m^{\text{track}}$$

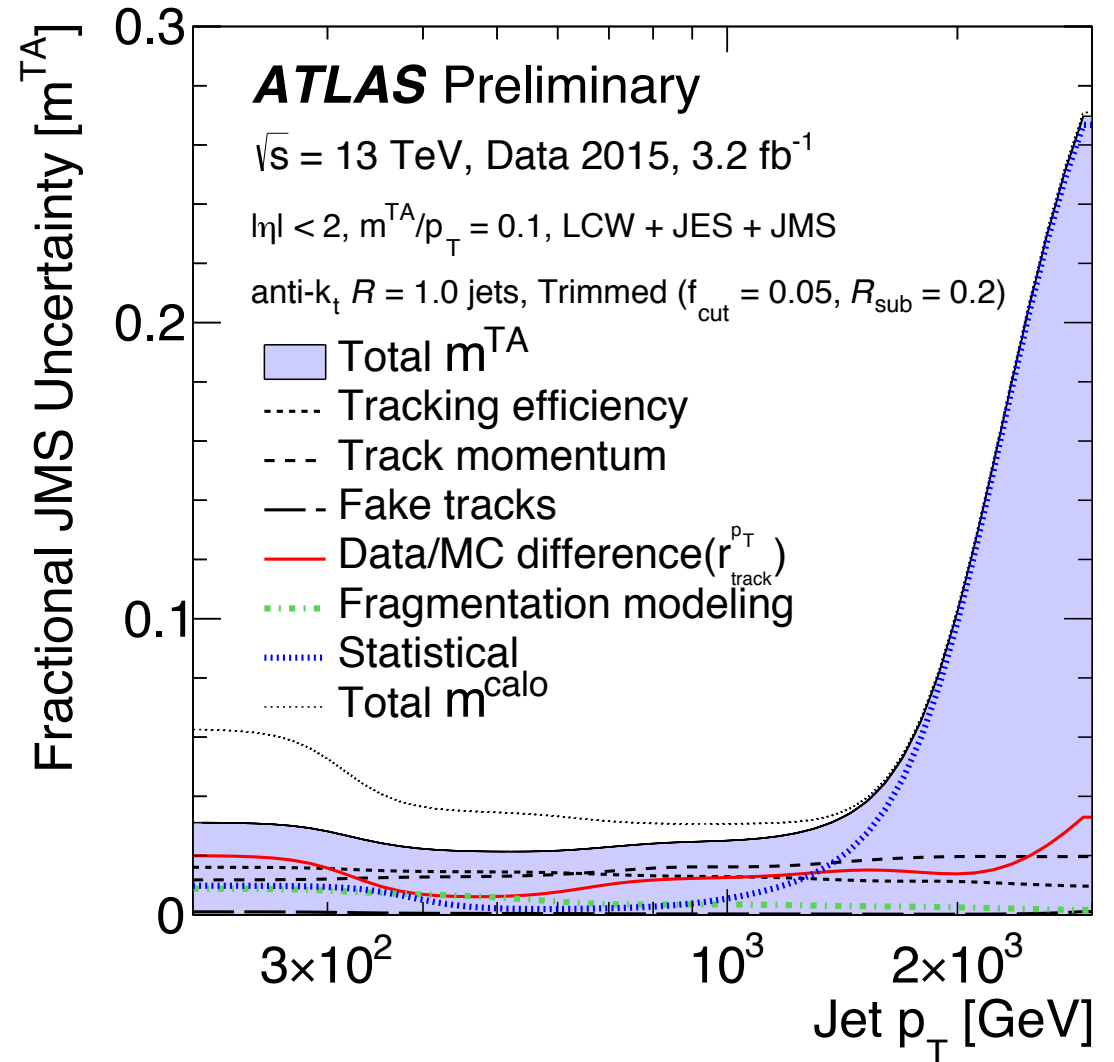
- Top jets:  $m^{\text{calo}}$  has better resolution across all  $p_T$  ranges
- W/Z jets:  $m^{\text{TA}}$  has better resolution at low  $p_T$  and worse resolution than  $m^{\text{calo}}$  at high  $p_T$ .
- Reconstructed jet mass is corrected to particle level using calibration factors derived from simulated QCD multi jet events.

- Combined mass  $m^{\text{comb}} = a \times m^{\text{calo}} + b \times m^{\text{TA}}$



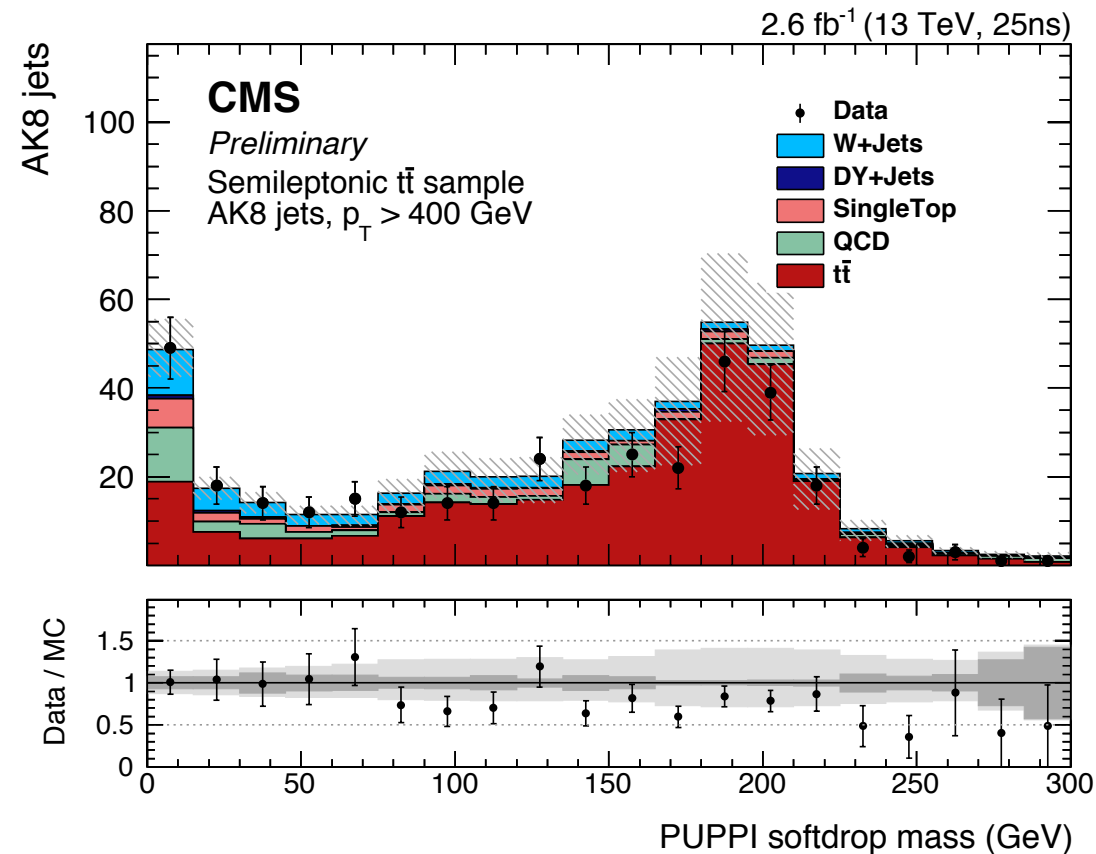
- Uncertainty is  $\sim 4\%$  for  $m^{calo}$  and  $2\%$  for  $m^{track}$  for  $300 \text{ GeV} < p_T < 1 \text{ TeV}$ .
- tracking uncertainties for  $m^{TA}$  through the  $r_{track}$  method are smaller than for  $m^{calo}$  since large extent of the uncertainties cancel in the ratio  $m^{track}/p_T^{track}$ 
  - At high  $p_T$ , uncertainties for  $m^{calo}$  and  $m^{track}$  are limited by the size of the dataset used to study the modeling of  $r_{track}$ .
- $m^{comb}$  uncertainties propagated through

$$m^{comb} = a \times m^{calo} + b \times m^{TA}$$



components of the track-assisted jet mass scale uncertainties.

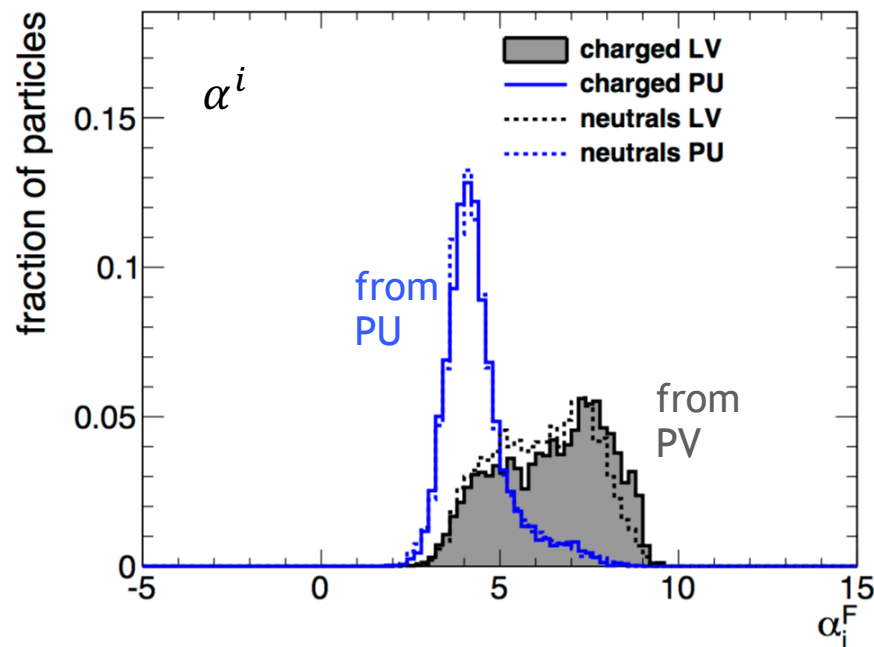




- PUPPI defines  $\alpha$  for each particle  $i$  using  $j$  particles around it

$$\alpha_i = \log \sum_{j \in \text{event}} \frac{P_T^j}{\Delta R_{ij}} \times \Theta(R_{\min} \leq \Delta R_{ij} \leq R_0),$$

- Transforms distribution of  $\alpha$  as a weight
- These per-particle weights are used to rescale the particles four-momenta to correct for pileup, superseding the need for jet-based pileup corrections.

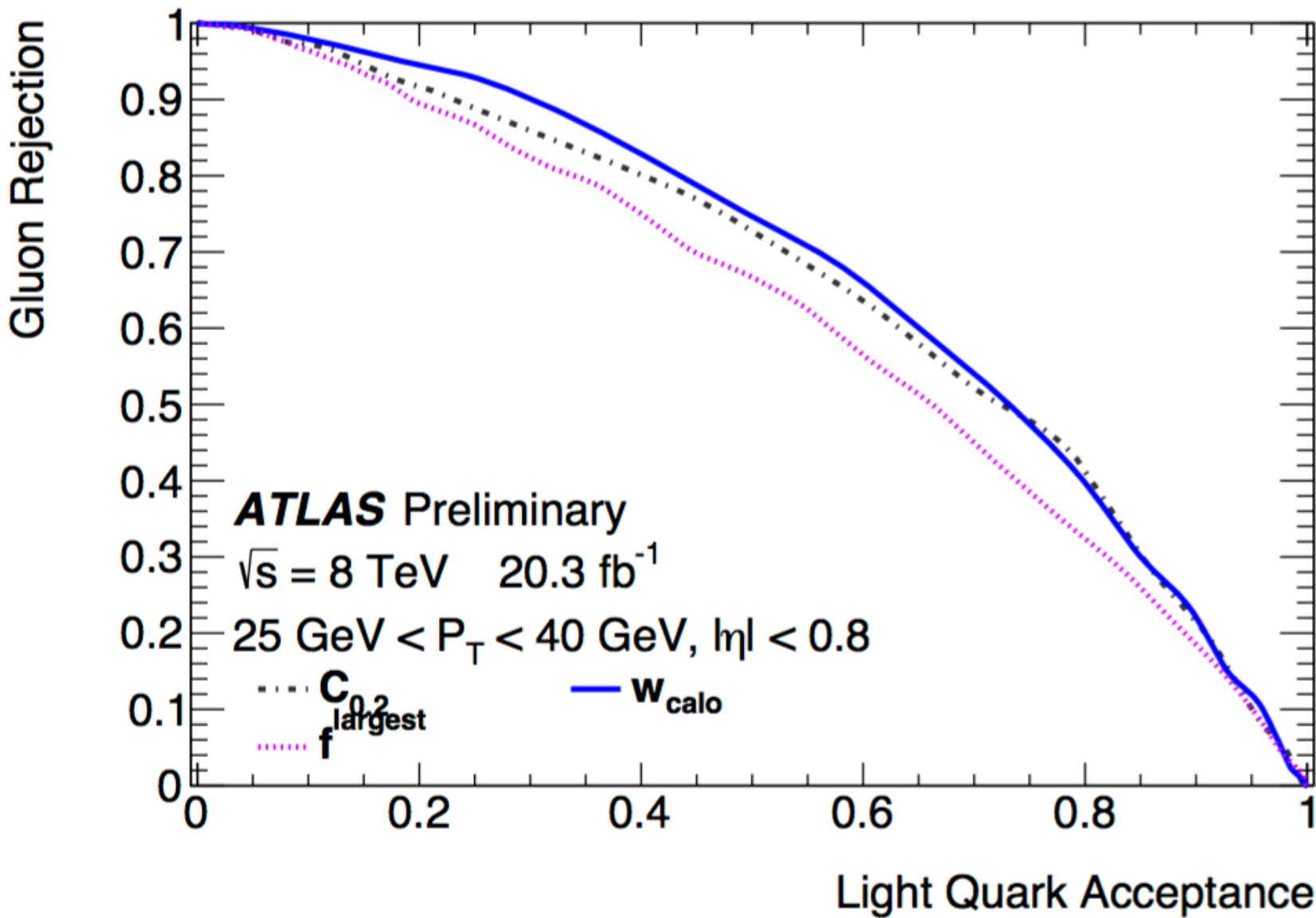


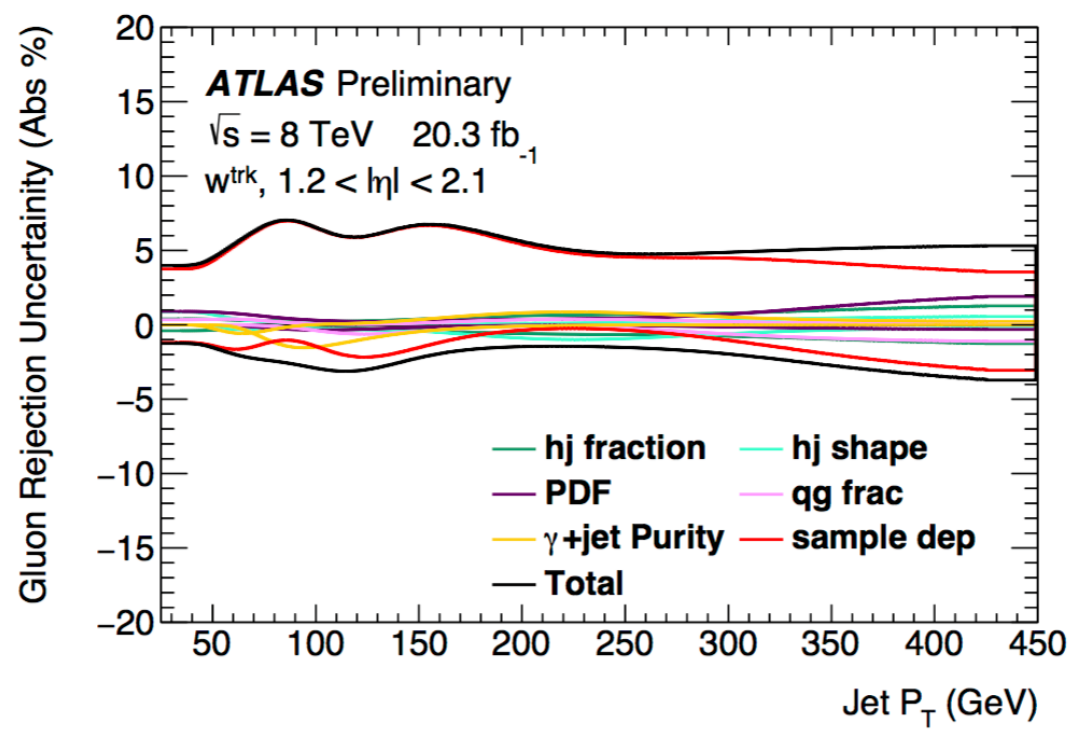
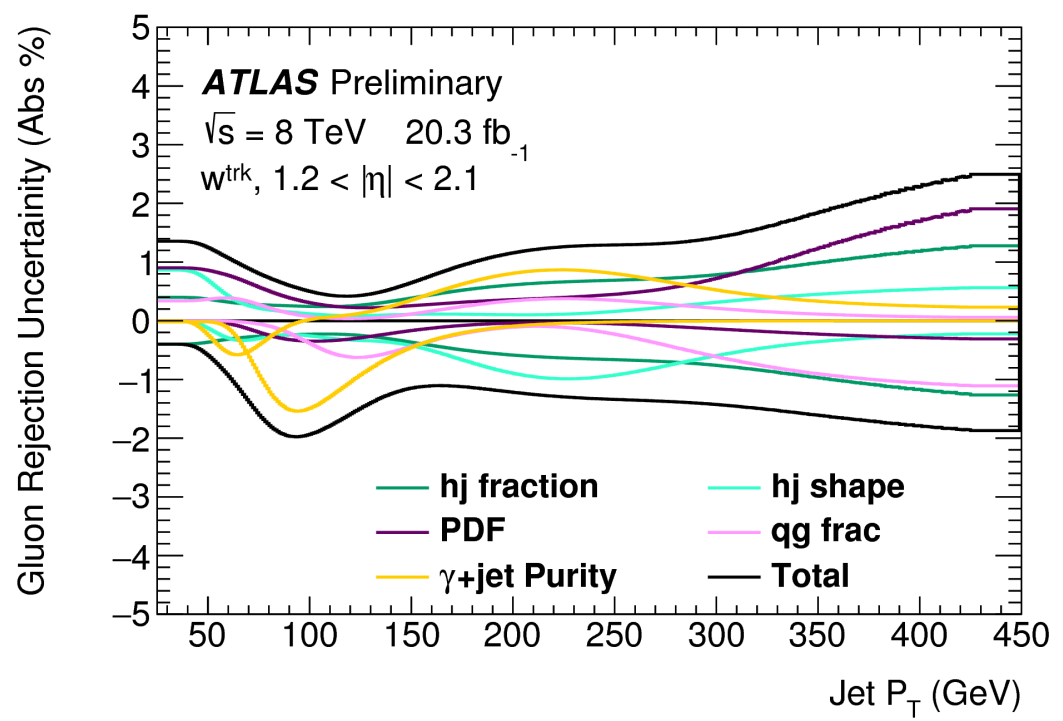
The distribution of  $\alpha^i$ , over many events, for particles  $i$  from the LV (gray filled) and particles from pileup (blue) in a dijet sample.

- PUPPI or pileup (PU) per particle identification, reduces PU effects on jet observables: uses local shape information, event pileup properties and tracking information.
  - before any jet clustering is performed.



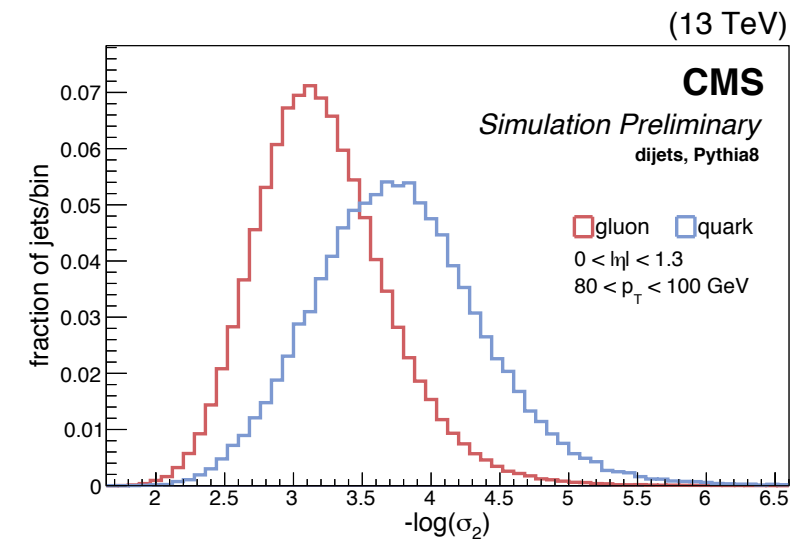
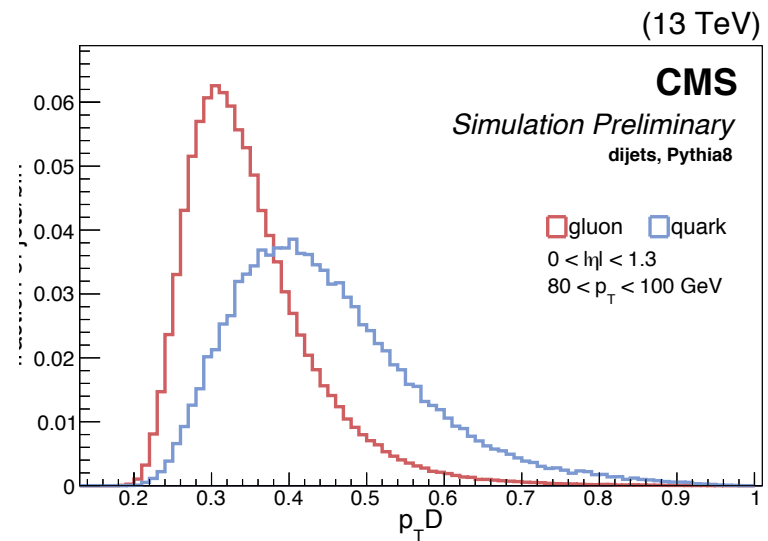
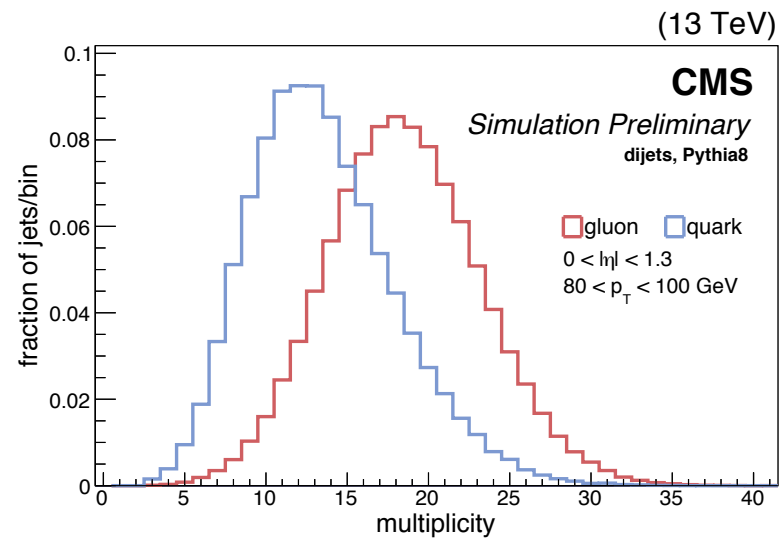
- Important handle in several physics analyses
  - Higgs VBF produced in association with mainly light-quark initiated jets. QCD multi jet background is mainly composed of gluon-initiated jets
- Discriminating variables: largest energy constituent energy fraction ( $f$ ), width of the jet ( $w$ ) and energy correlation function ( $C$ ).
- Three-sample extraction done using Dijet and gamma+jet or Dijet and Z+jet events depending on statistics in the  $p_T$  and  $\eta$  bin.





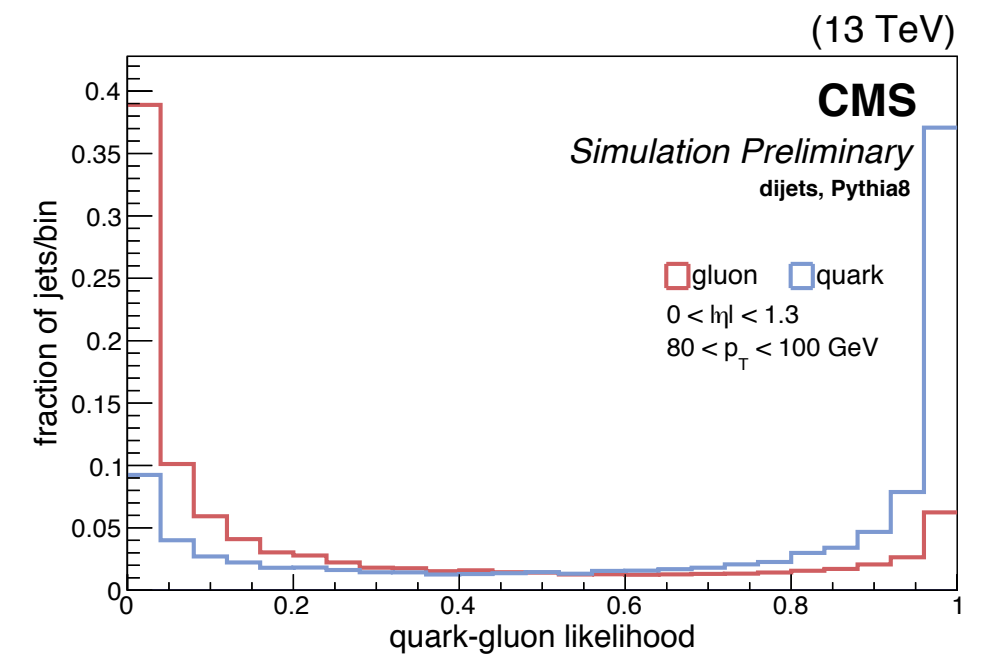
## Uncertainty sources

- Statistical uncertainty: ~1% for jets with  $|\eta| < 2.1$ , and 5% at larger  $\eta$ .
- Uncertainty on light-quark like, gluon-like jet fraction: Herwig++ and Pythia differences, fractions derived from PDFs, PDF reweighing is used for uncertainty estimation. Uncertainty on gluon rejection is ~2%, negligible for Gamma+jet sample.
- Uncertainty on c/b jet fractions: 20% on Dijet sample and 50% in Gamma+jet sample, uncertainty is ~2%
- c-quark and b-quark contributions: 1% uncertainty on rejection and acceptance
- Gamma+jet, Z+jet purity: vary photon identification criteria, 1% uncertainty at low  $p_T$ , Z+jet uncertainty is 0.2%
- Largest uncertainty comes from samples dependence (right plot).



- Quark-gluon discriminator is a likelihood built from the product of the probability density functions of three variables:
  - jet constituent multiplicity
  - jet fragmentation distribution, range between 0-1, higher value for quark jets.
  - jet minor angular opening (sigma2), useful for jets with lower  $p_T$  where gluon jets are wider than quark jets.

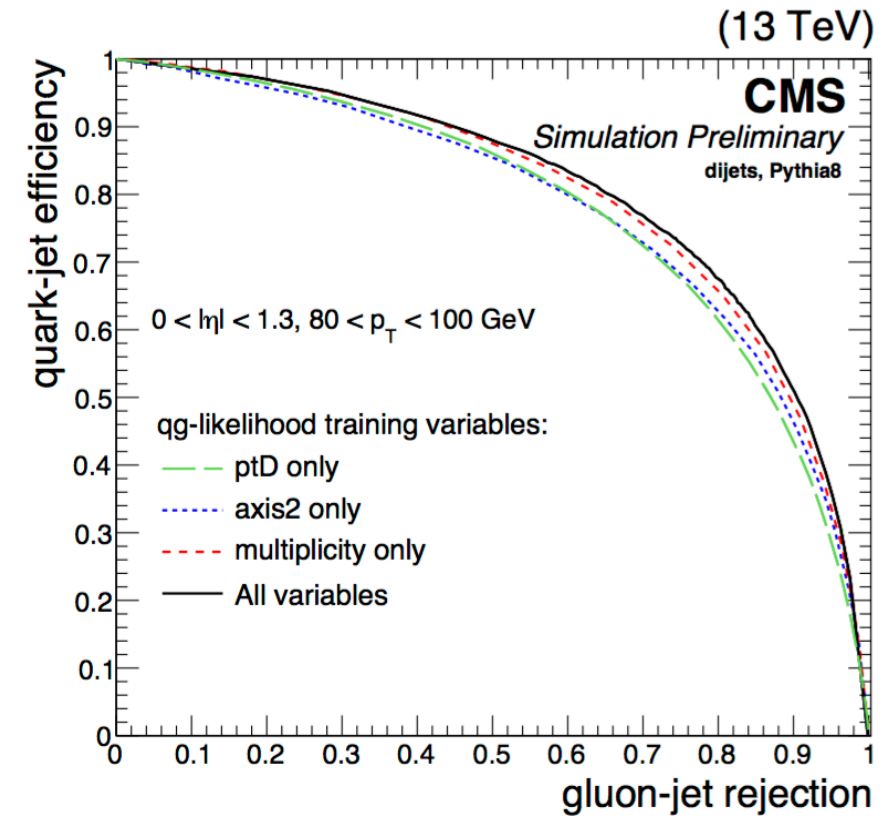
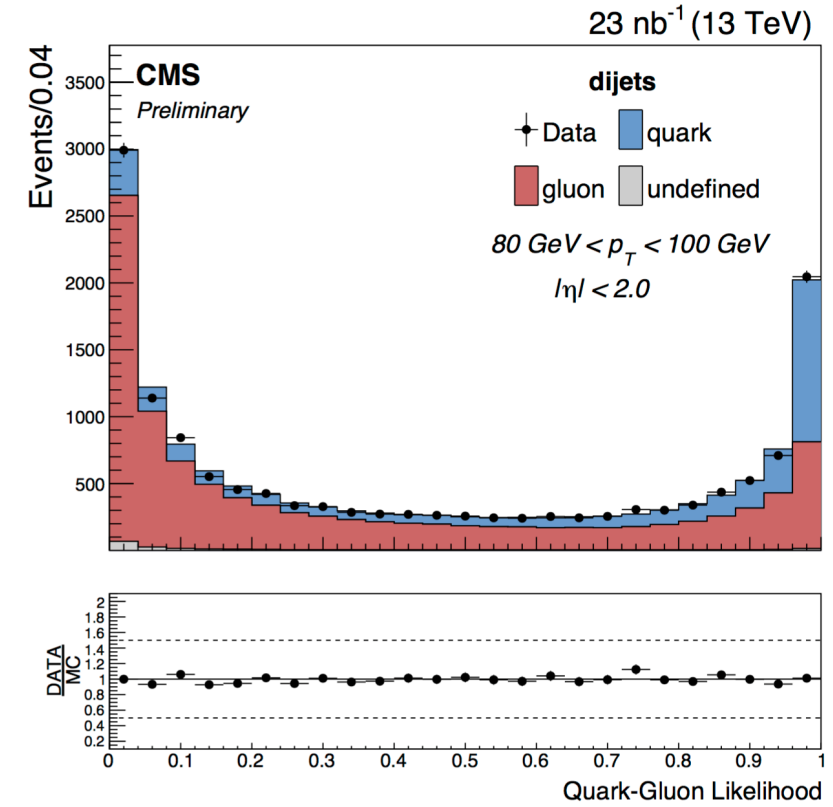
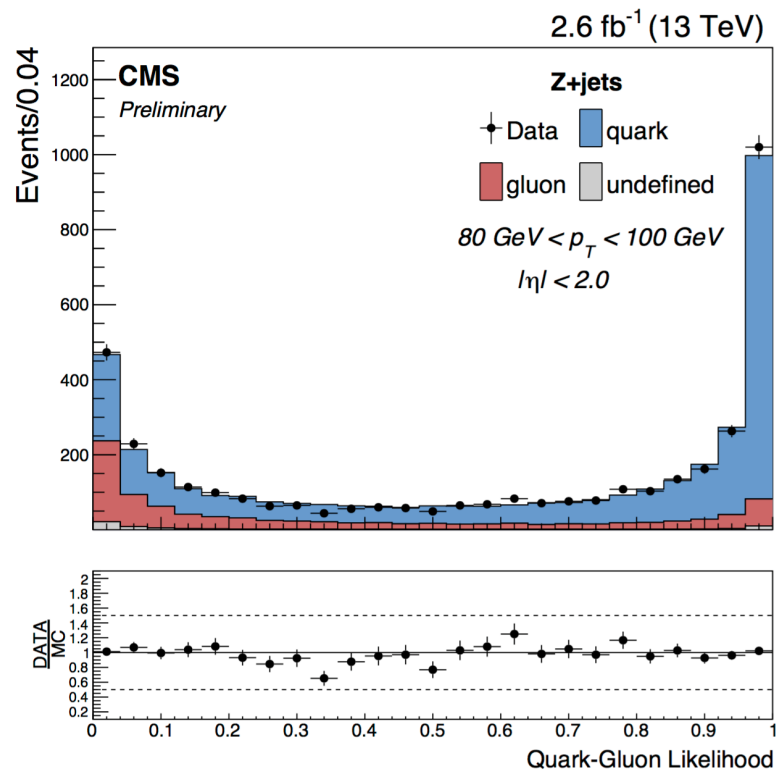
$$p_{TD} = \frac{\sqrt{\sum_i p_{T,i}^2}}{\sum_i p_{T,i}}$$





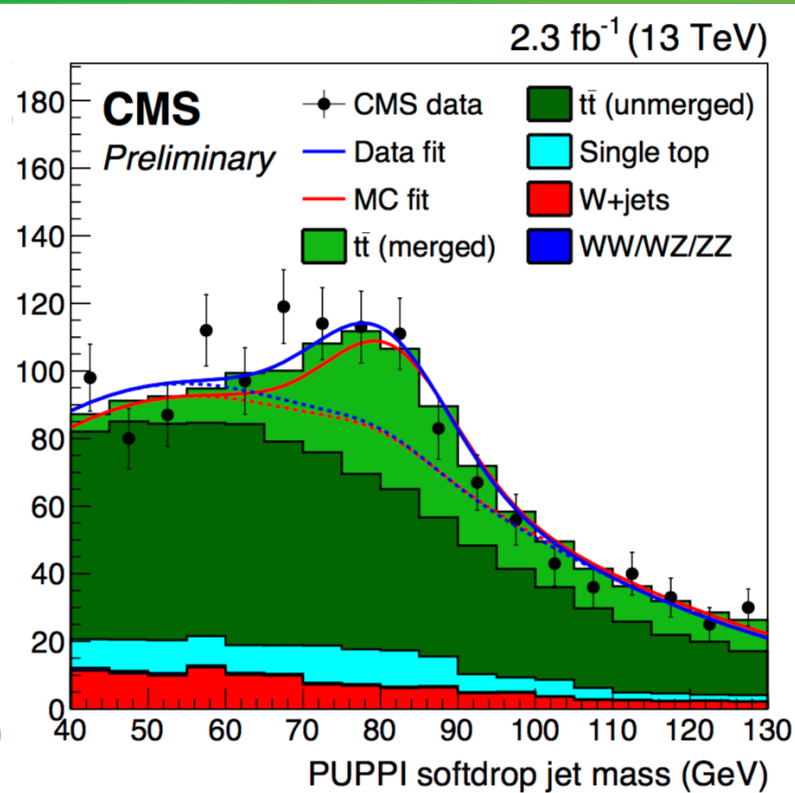
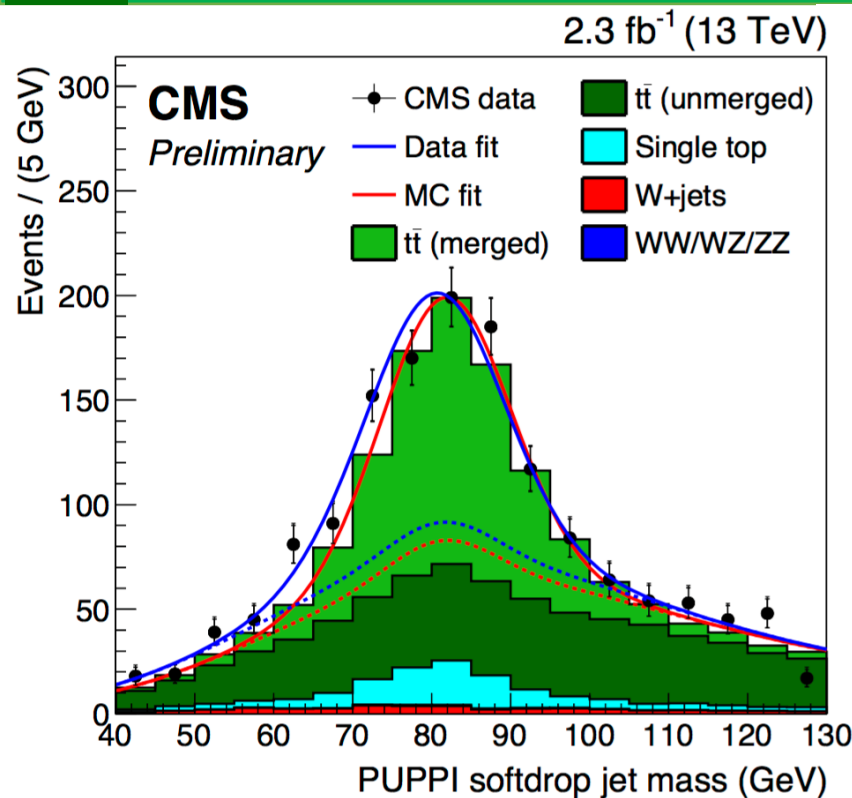
# Quark-gluon tagging CMS: validation in data

JME-16-003



Data/MC comparison for Quark-gluon likelihood in Z+jet events (left) and Dijet events (right) after the data-driven systematics reshaping procedure.

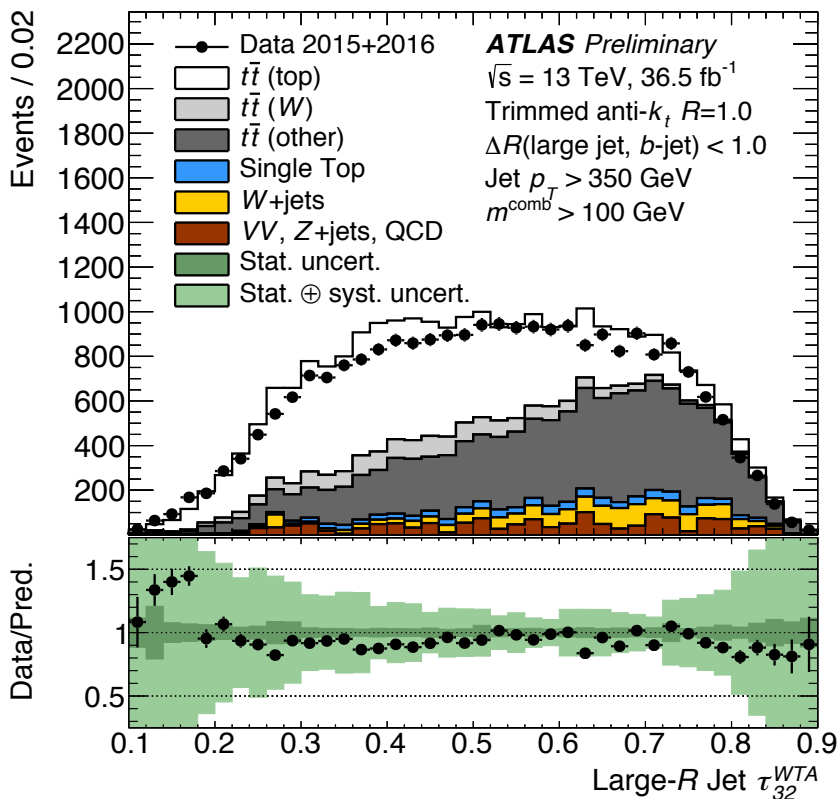
- After the reshaping procedure, difference in signal efficiencies predicted by Herwig and Pythia are at the percent-level, before the procedure the differences are sizable and more pronounced for gluon jets.
- Z+jet: higher fraction of quark jets
- Dijet: Higher fraction of gluon jets



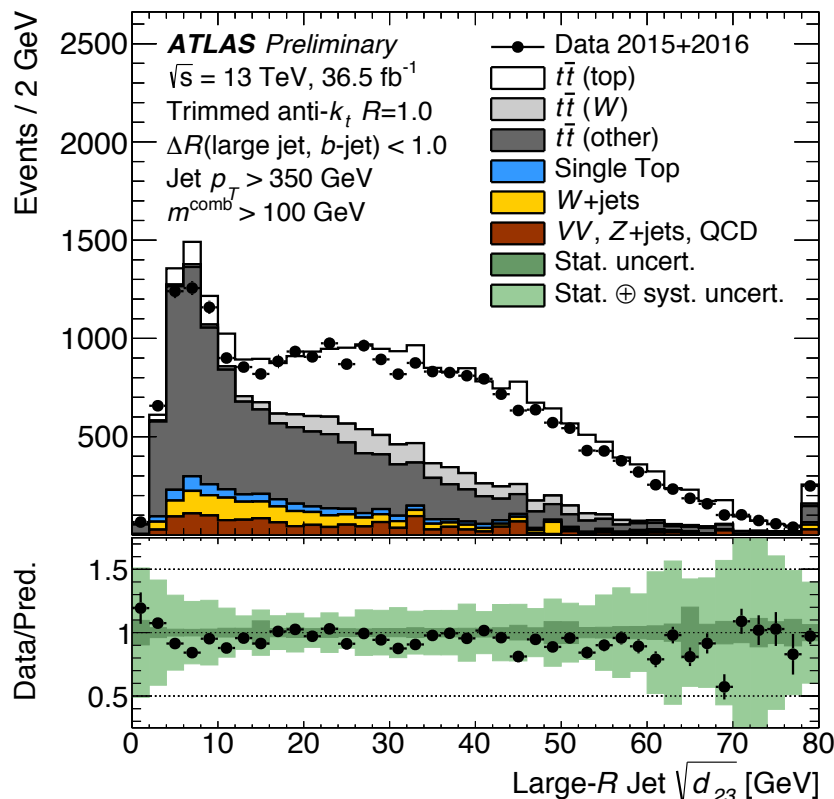
- Pruned jet mass events passing(left) and failing(right) PF+PUPPI  $\tau_{21} < 0.40$  selection.
- Data-to-simulation scale factors for the W-tagging procedure are extracted from a top enriched data sample and from simulation.
- Systematic uncertainties on the scale factor:  $t\bar{t}$  simulation, choice of the signal and background fit model.

Category	Definition	W scale factor
High-purity Pruning	$(\tau_2/\tau_1 < 0.45)$	$0.94 \pm 0.05$ (stat) $\pm 0.03$ (sys) $\pm 0.003$ (sys)
Low-purity Pruning	$(0.45 < \tau_2/\tau_1 < 0.75)$	$1.27 \pm 0.25$ (stat) $\pm 0.13$ (sys) $\pm 0.008$ (sys)
High-purity Pruning	$(\tau_2/\tau_1 < 0.6)$	$0.98 \pm 0.03$ (stat) $\pm 0.003$ (sys) $\pm 0.02$ (sys)
High-purity PUPPI softdrop	$(\tau_2/\tau_1 < 0.4)$	$0.97 \pm 0.06$ (stat) $\pm 0.04$ (sys) $\pm 0.06$ (sys)
Low-purity PUPPI softdrop	$(0.4 < \tau_2/\tau_1 < 0.75)$	$1.12 \pm 0.24$ (stat) $\pm 0.17$ (sys) $\pm 0.12$ (sys)

good agreement between data and MC tagging efficiency



Lepton+jets selection in  $t\bar{t}$  events



Cut on subjettiness ratio  $\tau_{32}$  and second splitting scale  $\sqrt{d_{23}}$

## Systematic uncertainties

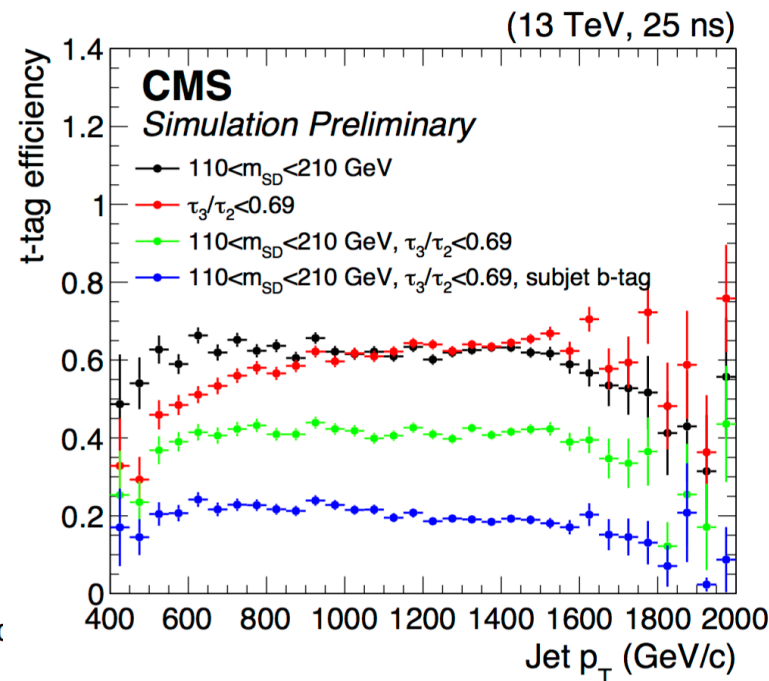
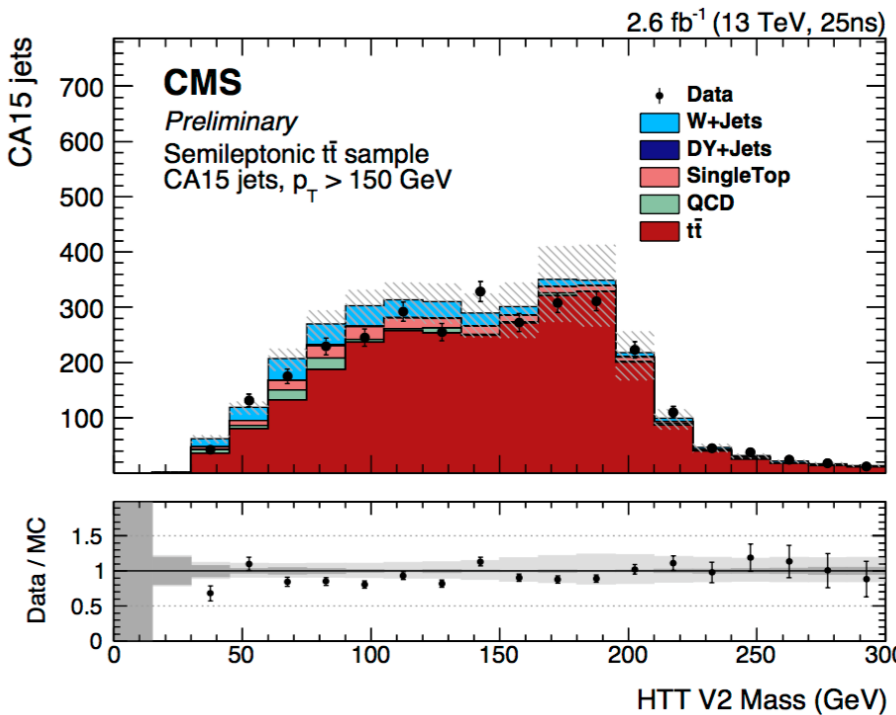
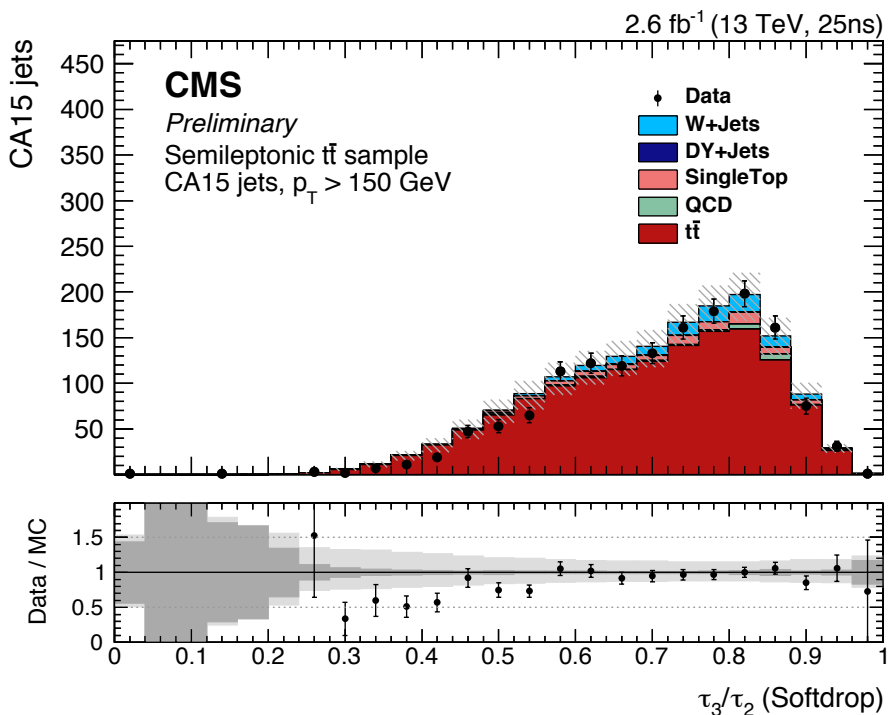
- scale and resolution uncertainties on large-R jet energy, mass and substructure observables
- $t\bar{t}$  modeling uncertainties on parton shower, hadronization model
- Initial-state and final-state radiation.
- Subdominant scale and resolution uncertainties on small-R jet energy and lepton kinematics

- Subjettiness ratio  $\tau_{32}$  and second splitting scale  $\sqrt{d_{23}}$  in the full 13 TeV dataset and MC simulation for  $t\bar{t}$  (left) and Dijet (right) events
- Trimming parameters used:  $f_{cut} = 5\%$ ,  $R_{subjet} = 0.2$
- $t\bar{t}$  sample: “W-matched” part, require the decay products of W boson to be within the large-R jet.
- “top-matched” part, require the qqb particles from top-decay to be within the large-R jet.
- Require R=0.4 b-tagged jet inside the large-R jet cone.



# top tagging inputs and efficiency: CMS

JME-16-003



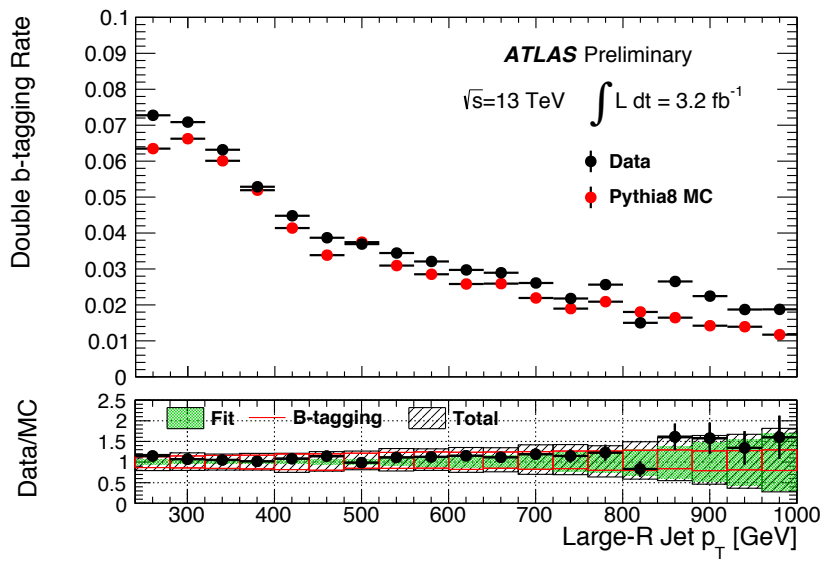
- top tagger: soft drop mass window cut, subjeettiness ratio  $\tau_{32}$  cut and subset b tagging.
- Distributions are made for AK8 jets after applying the PUPPI procedure.
- tagging techniques relying on PUPPI pileup suppression were found to maintain performance up to at least 40 simultaneous interactions.
- Plot on right shows the signal efficiency measured in simulation for the various tagging variable cuts.



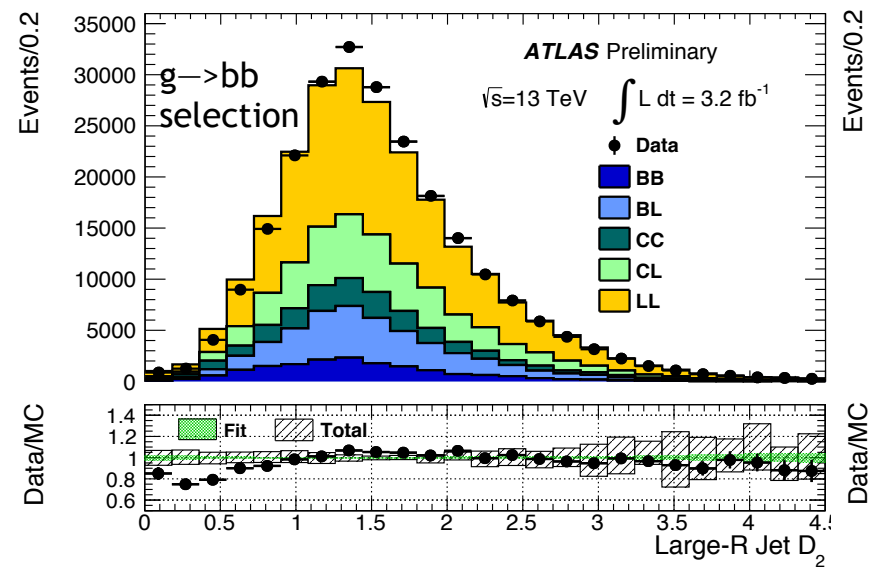


# Boosted Higgs (to $b\bar{b}$ ) boson tagging

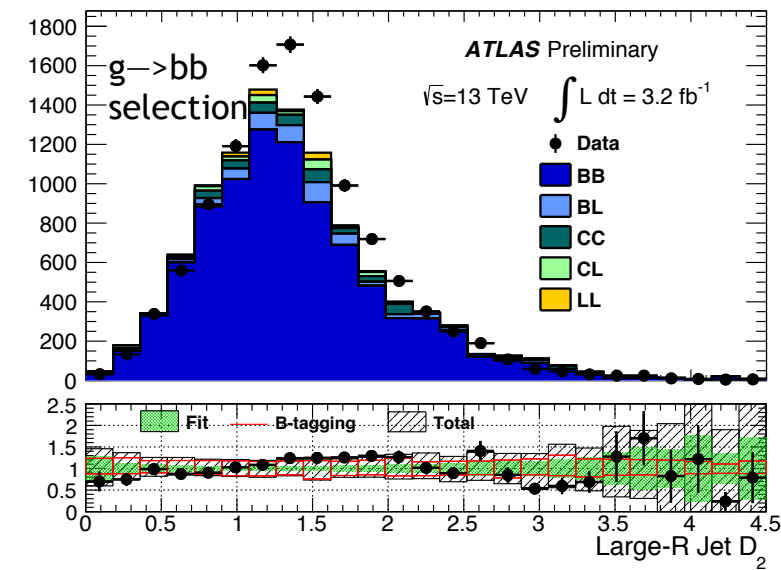
- Higgs bosons are reconstructed using anti- $k_t$  R=1 jets and tagged using requirements on
  - Track jet (R=0.2) b tagging: matched to anti- $k_t$  R=1 calorimeter jet.
  - Large-R jet (trimmed) mass window cut around the Higgs boson mass peak
  - Large-R substructure variable: trimmed jet energy correlation ratio  $D_2^{(\beta=1)}$ 
    - Ratio of 2 and 3 point energy correlation functions, based on the energies and pair-wise angular distances of particles within a jet.
    - Optimized to separate between one-prong and two-prong decays.



double b-tagging rate as a function of the large-R jet  $p_T$  for Data and MC.



Distributions of large-R jet  $D_2^{(\beta=1)}$  before (left) and after (right) b-tagging.



uncertainties from template fitting procedure, MC sample stats and b-tagging systematics.

- Tagging of hadronic decays of particles is becoming more important as we probe particles with higher transverse momentum.
- Use of jet-substructure and tagging is steadily increasing in SUSY, exotics and SM analyses.
  - Using grooming and subjettiness improves aTGC limits in VBS analyses by taking advantage of high branching fractions of hadronic decays of bosons.
- Combined mass for large-R jets takes advantage of better resolution of calo mass at low Pt and track-assisted mass at high pt.
- Quark-gluon taggers have been validated in Run 1 data in ATLAS and in Run 2 data in CMS and systematic uncertainties have been derived.
- W tagging and top tagging techniques have been validated in Run 2 data.
- Substructure and tagging of jets are important areas of ongoing study and development
  - Many methods are being actively studied for W, Z, H and top tagging.



# Backup

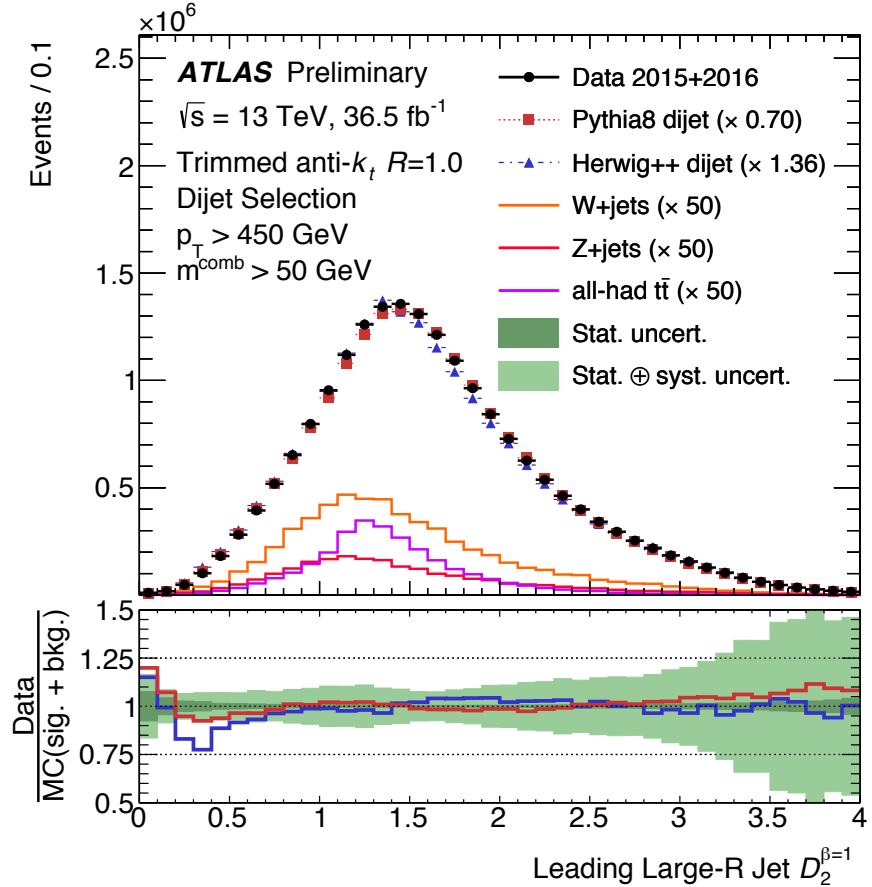
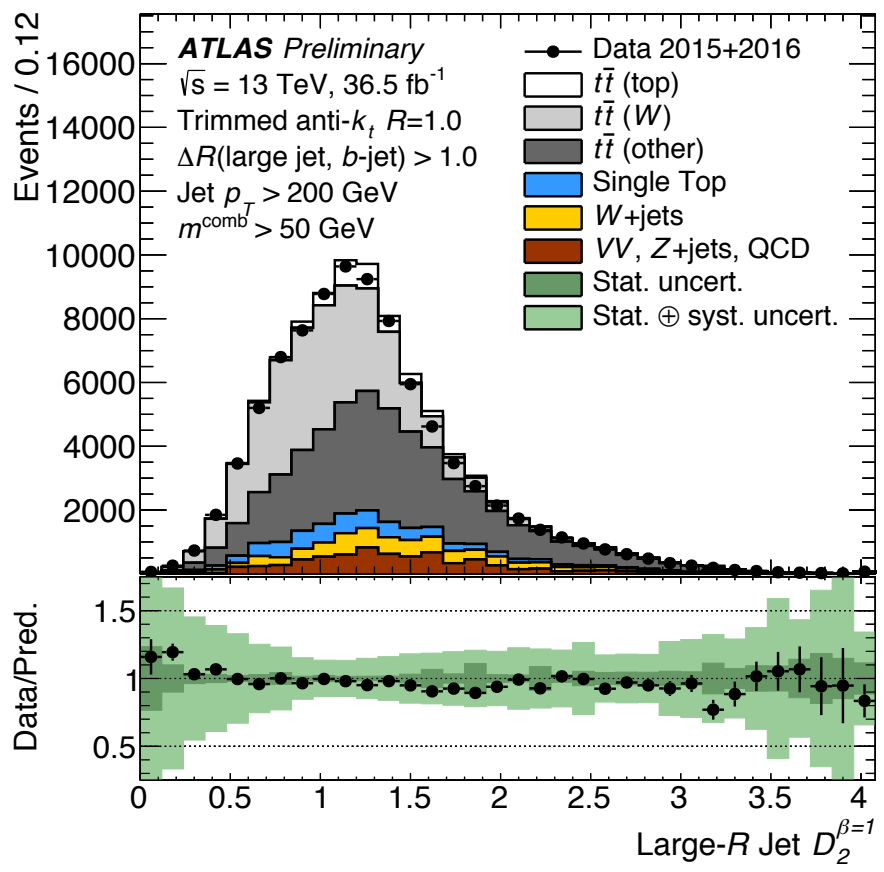




# W/Z tagging substructure inputs: ATLAS



Cut on energy correlation D2



- Energy correlation D2 in the full 13 TeV dataset and MC simulation for  $t\bar{t}$  (left) and Dijet (right) events.
- Anti- $k_t$   $R=1$  jets calibrated at LCW+JES scale, trimmed jet:  $f_{cut}=5\%$ ,  $R_{subjet}=0.2$ .
- $t\bar{t}$  sample is split into a “W -matched” part by requiring the decay products of W boson to be within the large-R jet.
- “top-matched” part requires the qqb particles from the top-decay to be within the large-R jet.
- In addition to enhance purity of jets matched to a W boson, the events is required to have a  $R=0.4$  b-tagged jet but outside the large-R jet cone.

- Discriminating variables include:
  - Number of tracks in a jet
  - Pt weighted width of the jet from tracks.
  - Et weighted width of the jets
  - Fraction of energy carried by the largest energy constituent
  - Two point energy correlation function
  - Jet Charge: gluons have no charge while quarks have fractional charge

$$n_{\text{trk}} = \sum_{\text{trk} \in \text{jet}}$$

$$w_{\text{trk}} = \frac{\sum_{\text{trk} \in \text{jet}} p_{T,\text{trk}} \Delta R_{\text{trk},\text{jet}}}{\sum_{\text{trk} \in \text{jet}} p_{T,\text{trk}}}$$

$$w_{\text{calo}} = \frac{\sum_{\text{const} \in \text{jet}} p_{T,\text{const}} \Delta R_{\text{const},\text{jet}}}{\sum_{\text{const} \in \text{jet}} p_{T,\text{const}}}$$

$$f^{\text{largest}} = \frac{E_{\text{largest const}}}{E_{\text{jet}}}$$

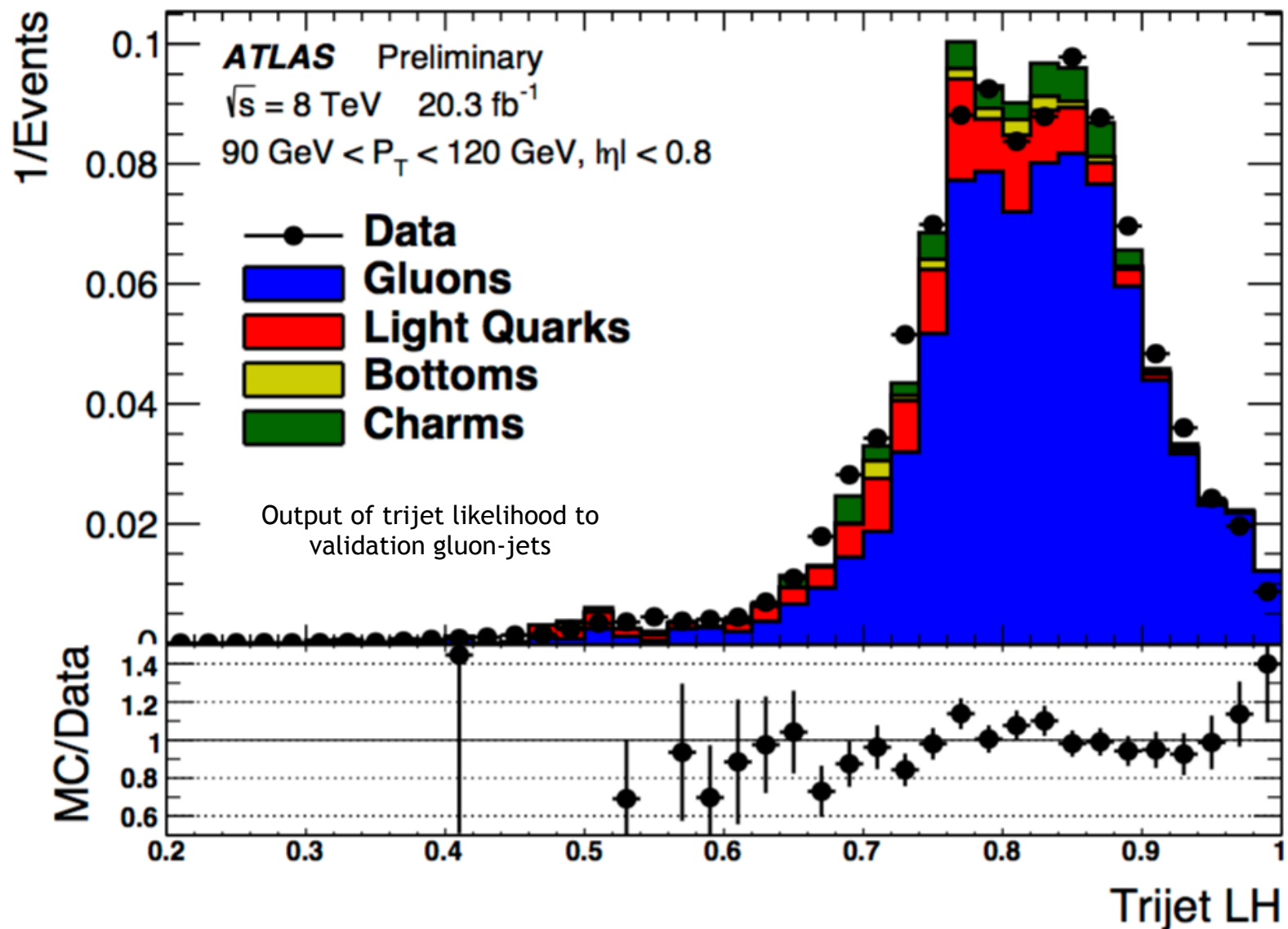
$$C_{\beta} = \frac{\sum_{i,j \in \text{jet}} E_{T,i} E_{T,j} (\Delta R_{i,j})^{\beta}}{\left(\sum_{i \in \text{jet}} E_{T,i}\right)^2}$$

$$Q^{\kappa} = \frac{1}{(p_T)^{\kappa}} \sum_{\text{trk } i \in \text{jet}} q_i \times (p_T^i)^{\kappa}$$

Variable(s)	$p_T, \eta$ bin					
	$25 < p_T < 40$ GeV		$40 < p_T < 90$ GeV		$180 < p_T < 210$ GeV	
	$ \eta  < 0.8$	$1.2 <  \eta  < 2.1$	$ \eta  < 0.8$	$1.2 <  \eta  < 2.1$	$ \eta  < 0.8$	$1.2 <  \eta  < 2.1$
$n_{\text{trk}}$	34%	38%	38%	35%	52%	43%
$w_{\text{trk}}$	50%	46%	51%	49%	49%	48%
$w_{\text{calo}}$	53%	52%	55%	53%	50%	45%
$f^{\text{largest}}$	44%	35%	48%	41%	52%	42%
$C_{0.2}$	52%	43%	55%	48%	54%	45%
$Q^{1.0}$	35%	27%	36%	31%	29%	29%
$n_{\text{trk}}$ vs $w_{\text{trk}}$	-	-	52%*	51%*	55%	53%
$Q^{1.0}$ vs $w_{\text{trk}}$	-	-	51%*	50%*	52%	52%

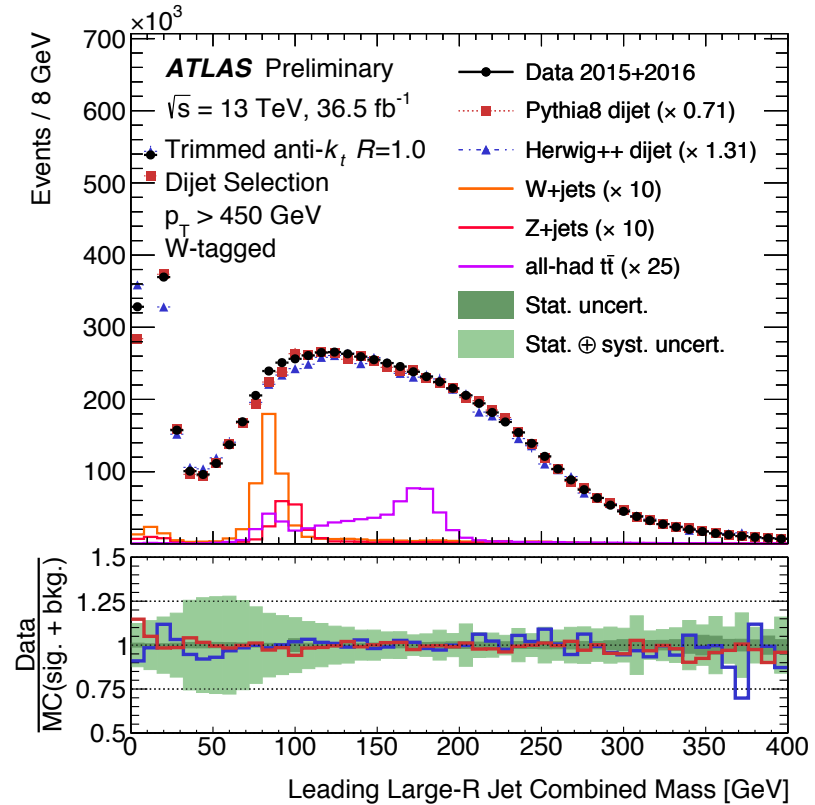
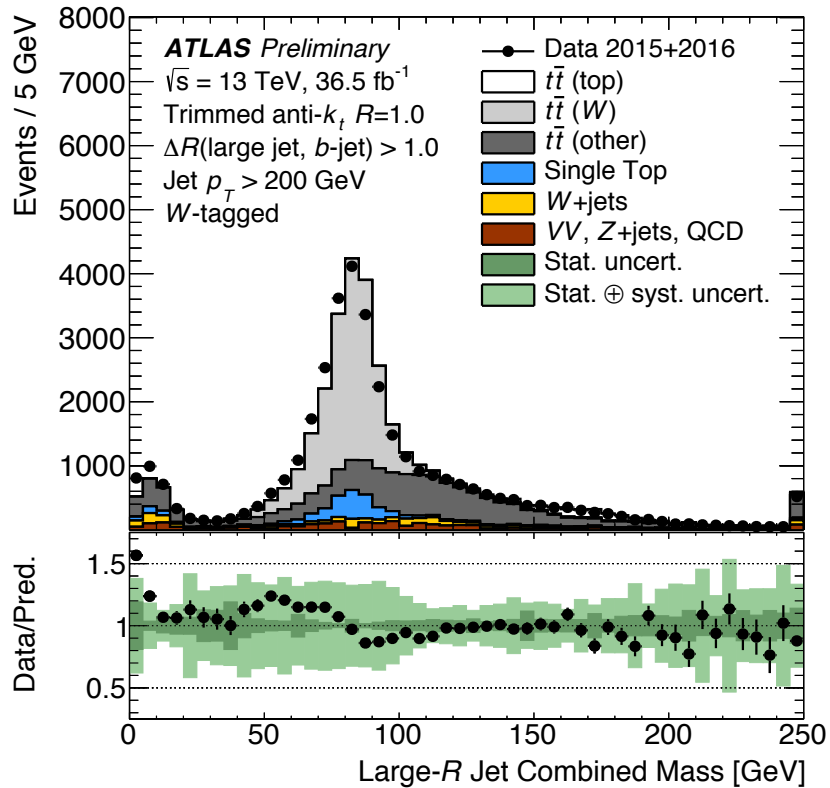


# Quark-gluon tagging ATLAS





# W/Z tagging substructure inputs: ATLAS



## Systematic uncertainties

- scale and resolution uncertainties on large-R jet energy, mass and substructure observables
- $t\bar{t}$  modeling uncertainties on parton shower, hadronization model
- Initial-state and final-state radiation.
- Subdominant scale and resolution uncertainties on small-R jet energy and lepton kinematics



# top tagging substructure inputs: ATLAS

