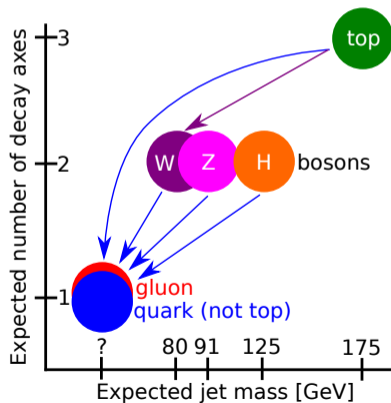
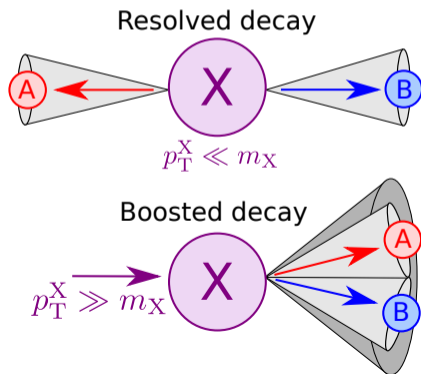


Tagging of hadronically decaying massive particles in ATLAS

**Steven Schramm (Uni. Geneva)
For the ATLAS Collaboration**

**BOOST (Boston)
July 22, 2019**

- There are many types of massive particles that can decay hadronically
 - This talk: the identification of boosted hadronic W , Z , and top decays
 - See Wednesday's talk by [R. Jacobs](#) for $X \rightarrow bb$ (including $H \rightarrow bb$) and b/c-jet tagging



Designing W/Z/top taggers

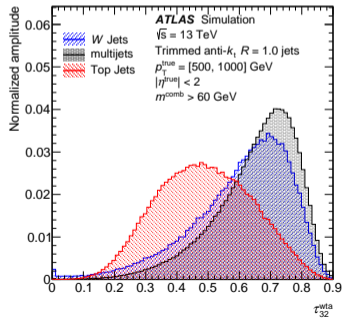
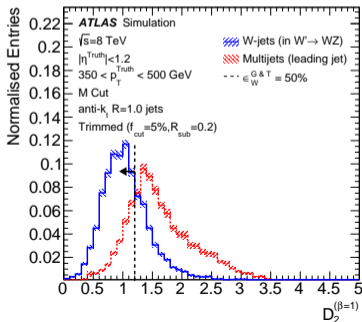
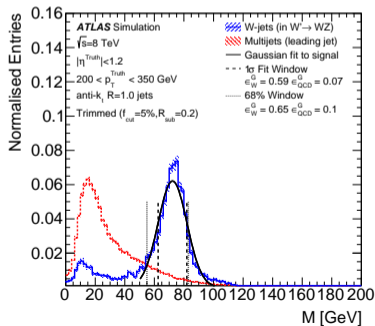
Left: PERF-2015-03

Middle: PERF-2015-03

Right: JETM-2018-03



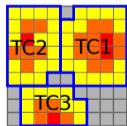
- To first order, designing a tagger is as straightforward as the previous slide
 - Cut on the jet mass and other substructure variable(s) correlated to the number of decay axes
 - Common variables: $D_2^{(\beta=1)}$ for two-body decays (W/Z), τ_{32}^{WTA} for three-body decays (top)
- Such a simple two-variable cut-based tagger provides a powerful starting reference



Large-R jet reconstruction and tagging

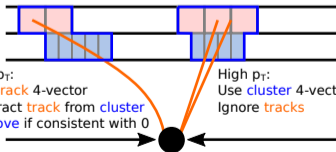
- Primarily use trimmed ($R_{\text{sub}} = 0.2$, $f_{\text{cut}} = 5\%$) anti- k_t $R = 1.0$ jets with **LC cluster inputs**
 - As seen in **C. Wanotayaroj's** talk from this morning, this is evolving
- This talk will focus on this dominantly used jet type, with some exceptions
 - First **PFO** results available (this talk), while **TCCs** are already used in high p_T searches
- The way in which you build the large-R jet **does matter** for the tagger performance

Topo-clusters (EM or LC)
[Most ATLAS results]



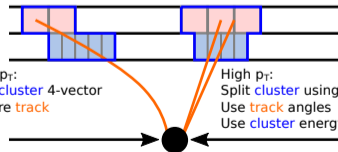
- seed cells $|E| > 4\sigma$
- growth cells $|E| > 2\sigma$
- boundary cells
- final topoclusters $\eta \times \phi = \text{dynamic}$

Particle Flow Objects (PFOs)
[First studies in this talk]



- Low p_T : Use **track** 4-vector
Subtract **track** from **cluster**
Remove if consistent with 0
- High p_T : Use **cluster** 4-vector
Ignore **tracks**

Track-CaloClusters (TCCs)
[Used for highest p_T results]



- Low p_T : Use **cluster** 4-vector
Ignore **track**
- High p_T : Split **cluster** using **tracks**
Use **track** angles
Use **cluster** energy

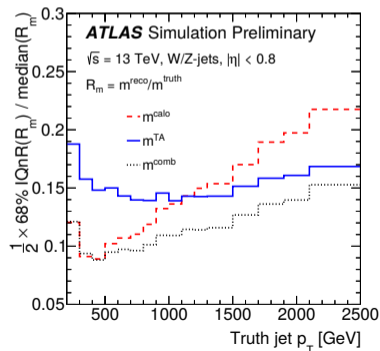
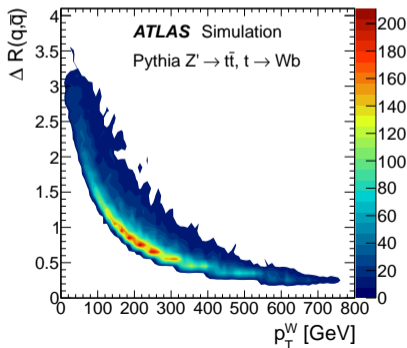
Why jet inputs matter for tagging

Left: PERF-2012-02

Right: CONF-2016-035

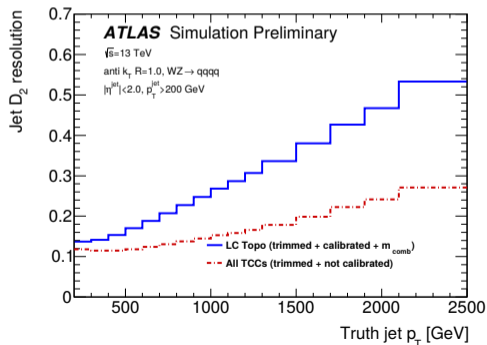
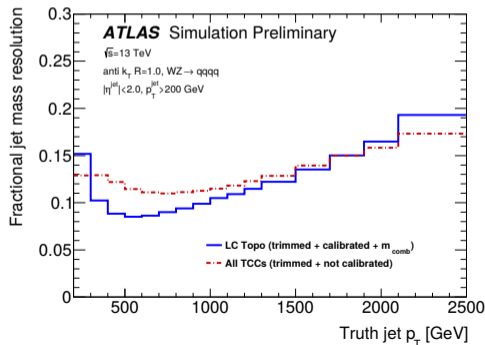


- As the boost of the system increases, so does the collimation of the decay products
 - $\Delta R \approx 2m/p_T \implies$ for a W boson with $p_T = 1.6$ TeV, $\Delta R \approx 0.1$
 - ATLAS calorimeter barrel cell sizes in $\eta \times \phi$: 0.025×0.025 (EM), 0.1×0.1 (hadronic)
- The calorimeter loses its angular resolving power, but the tracker can help
 - $m^{\text{TA}} = m^{\text{track}} \cdot p_T^{\text{calo}} / p_T^{\text{track}}$, and $m^{\text{comb}} = A \cdot m^{\text{calo}} + B \cdot m^{\text{TA}}$



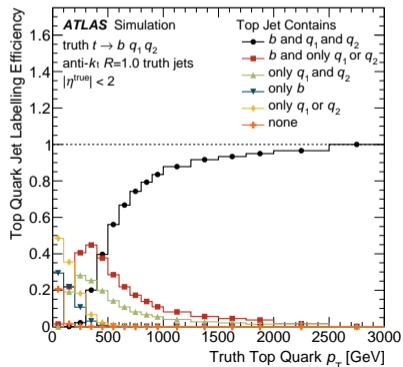
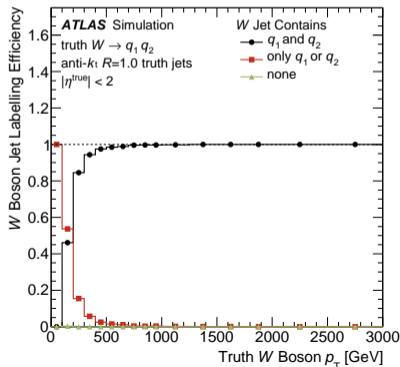
Focusing on the high p_T regime

- As mentioned earlier, **TCCs** split and assign cluster energy to matching track(s)
 - Degrades low p_T mass performance vs m_{comb} , but significantly improves D_2 at high p_T
 - Recall that our simple reference W/Z tagger cuts on mass and D_2
- Jets built from **TCCs** support powerful taggers at high p_T ; **LC** jets are better at low p_T



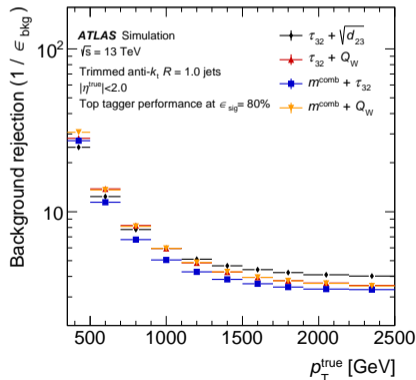
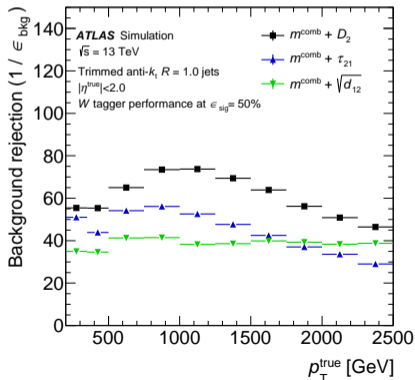
Defining the tagger target

- Taggers are typically defined with respect to a truth definition of the object of interest
 - W/Z jet: jet is matched to a truth W/Z boson and both quark decay products (q_1 & q_2)
 - Top jet: jet is matched to a truth top quark and all three quark decay products (b & q_1 & q_2)
- We typically optimize with respect to these “contained” truth labels, vs QCD background



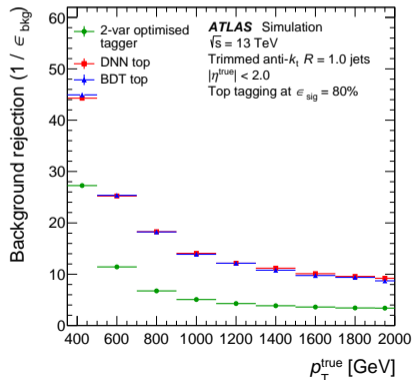
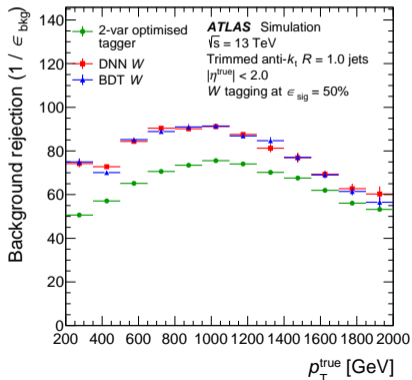
Revisiting simple two-variable taggers

- As mentioned earlier, two-variable taggers are already quite powerful
 - W-tagging: $mass + D_2$ has $\sim 60\times$ background rejection for 50% signal efficiency
 - Top-tagging: $mass + \tau_{32}$ (among others) has $\sim 5\times$ background rejection for 80% signal eff.
- However, we can definitely improve upon these simple taggers

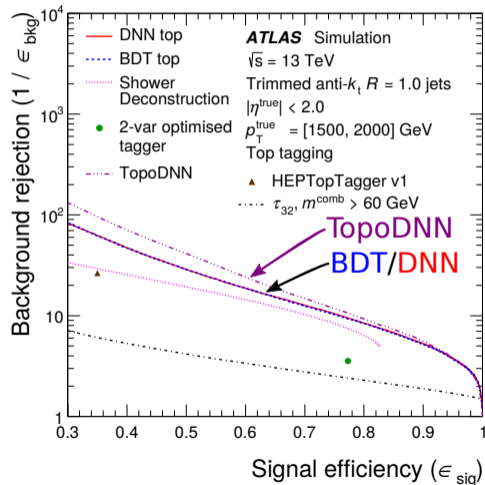


Moving towards machine learning

- Trained **BDTs** and **DNNs** for W/top-tagging with $\mathcal{O}(10)$ jet substructure variables
 - Small gain for W-tagging: $60\times \rightarrow 80\times$ QCD rejection for 50% signal eff ($\sim 30\%$ gain)
 - Large gain for top-tagging: $5\times \rightarrow 12\times$ QCD rejection for 80% signal eff ($\sim 240\%$ gain)
- Performance limited by amount of unique info: substructure variables are highly correlated



- Studied DNN with topocluster inputs, not substructure variables (TopoDNN)
 - Trained specifically for high p_T
 - Better than BDT, DNN in this regime
- Still, could be improved
 - Tagging power depends on jet inputs
 - Use of more precise inputs to DNN should provide further gains
 - Note: no b -tagging used so far

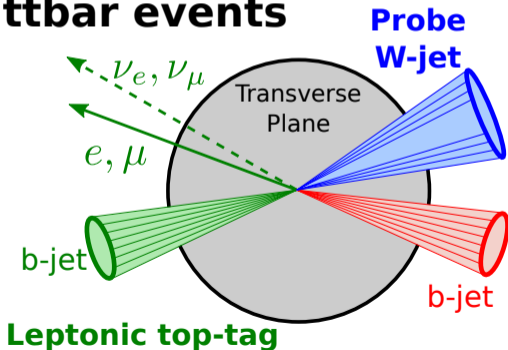


Deriving tagging efficiency signal scale factors

- Semi-leptonic $t\bar{t}$ events are very pure in hadronic W and top jets
 - We can use these events to derive the tagging efficiency in data and compare to simulation

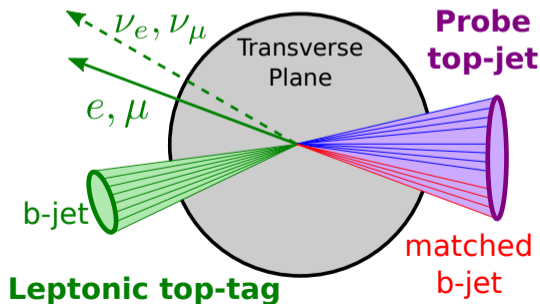
$$200 \text{ GeV} < p_T^W \lesssim 500 \text{ GeV}$$

$t\bar{t}$ events



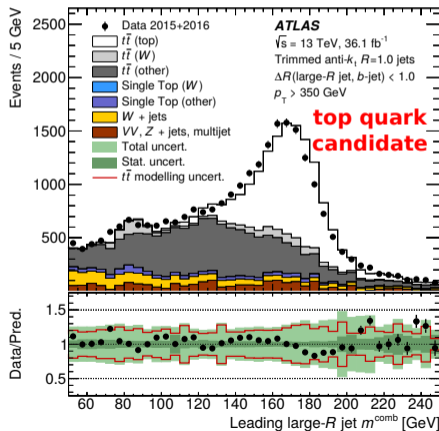
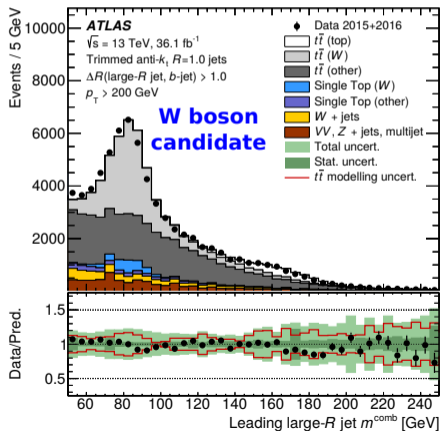
$$350 \text{ GeV} < p_T^{\text{top}} \lesssim 1000 \text{ GeV}$$

$t\bar{t}$ events



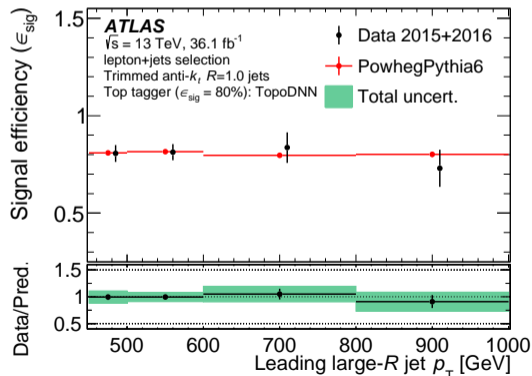
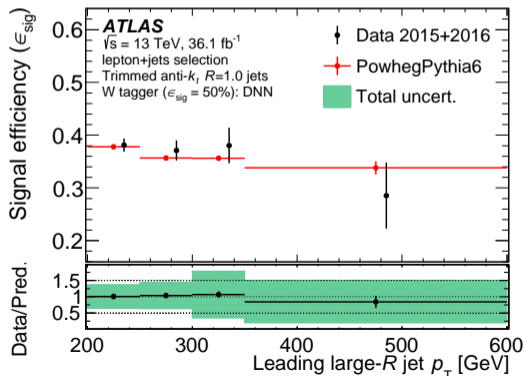
Scale factor extraction regions

- The selected **W**- and **top**-candidate pre-tag mass distributions show high signal purity
 - Fit three templates: $t\bar{t}$ signal process, $t\bar{t}$ background processes, and non- $t\bar{t}$ backgrounds

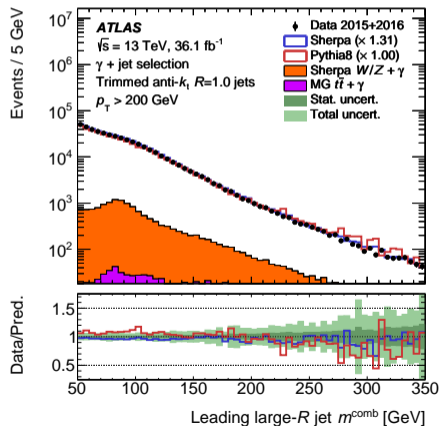
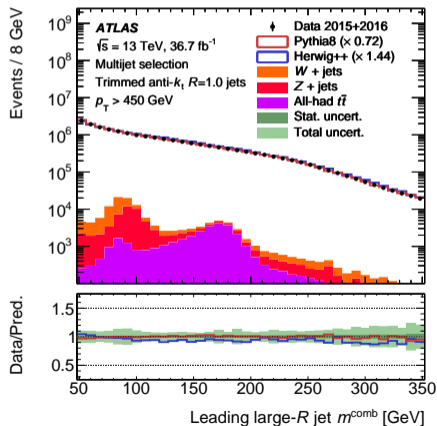


Resulting signal scale factors (p_T sliced)

- Data and simulation agree within data statistical uncertainties, even for complex taggers
 - Shown for the W-tagging DNN and the top-tagging topocluster-based DNN
 - Agreement also stable against large range of pileup (not shown here)

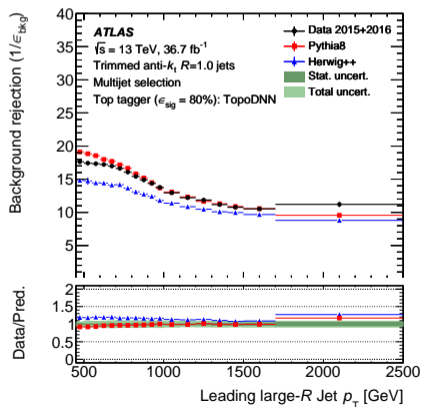
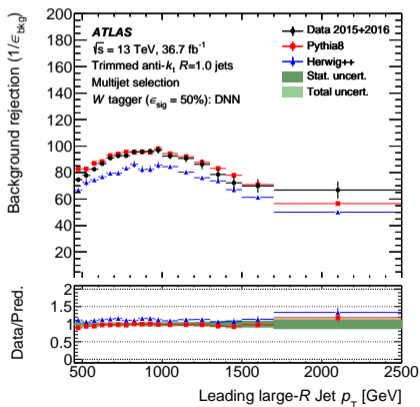


- Study performance of taggers in background samples: QCD multijets and γ +jets
 - Comparing allows for studying modelling differences between tagging gluons and light quarks



Resulting background scale factors

- As before, these are for the W-tagging DNN and the top-tagging topocluster-based DNN
 - Multijet (below): W- and top-tagging both agree with Pythia8, disagree with Herwig++
 - γ +jet (backup): W-tagging agrees with Sherpa not Pythia8, top-tagging agrees with both



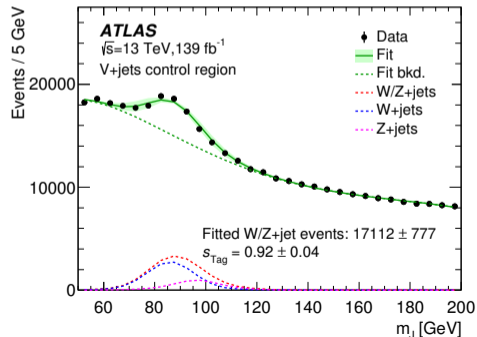
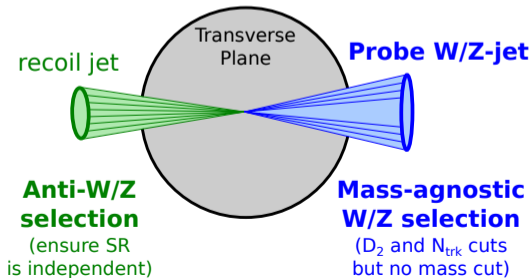
A different way to extract W/Z signal efficiency

Plot: HDBS-2018-31

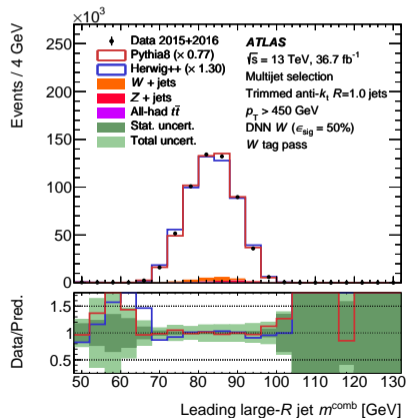
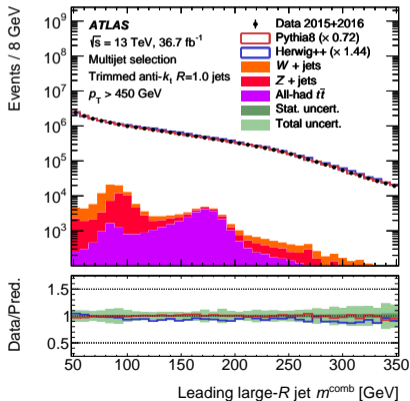


- Fully-hadronic di-boson resonance search uses V+jets events to evaluate tagger efficiency
 - Shown below for TCC jets and a 3-variable tagger; more details in Thursday's talk by [E. Must](#)
 - Similar approach using $Z(\rightarrow bb)+\gamma$ events in Wednesday's talk by [R. Jacobs](#)
- Extends measurement to higher p_T , but much harder as background dominates signal
 - Need to be careful: breaks down if signal and background peak at the same mass

V+jet(s) events, $p_T > 600$ GeV



- ML taggers, whether BDT or DNN, quickly learn that the jet mass is very important
 - Very strongly shape the background mass distribution to look like signal
 - Becomes \sim impossible to extract signal efficiency in V+jets events with such ML taggers



- This can be addressed using mass decorrelation strategies, such as **Adversarial NNs**
 - Significantly reduces the correlation and thus mass-sculpting

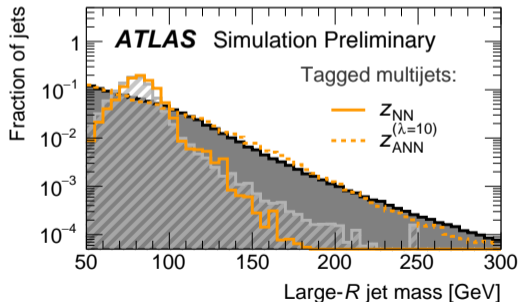
ATLAS Simulation Preliminary

$\sqrt{s} = 13$ TeV, W jet tagging

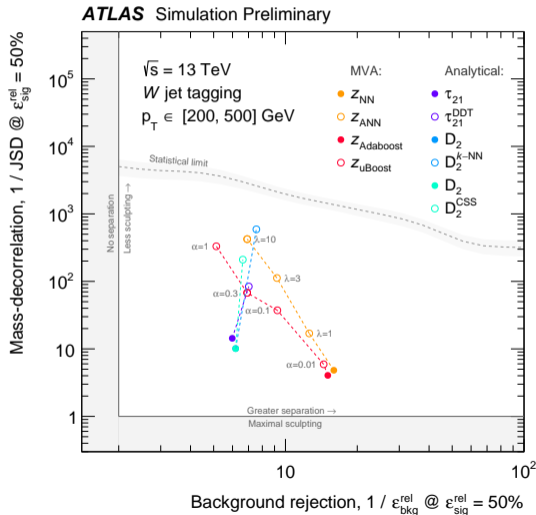
Cuts at $\epsilon_{\text{sig}}^{\text{rel}} = 50\%$

Inclusive selection:

■ Multijets ▨ W jets



- **Adversarial NNs** parametrizes trade-off between tagging power (x-axis) and mass decorrelation (y-axis)
- Supports scale factor extraction in background-dominated regions
 - Final tagger can be mass+ANN selection, but will still lose some tagging performance



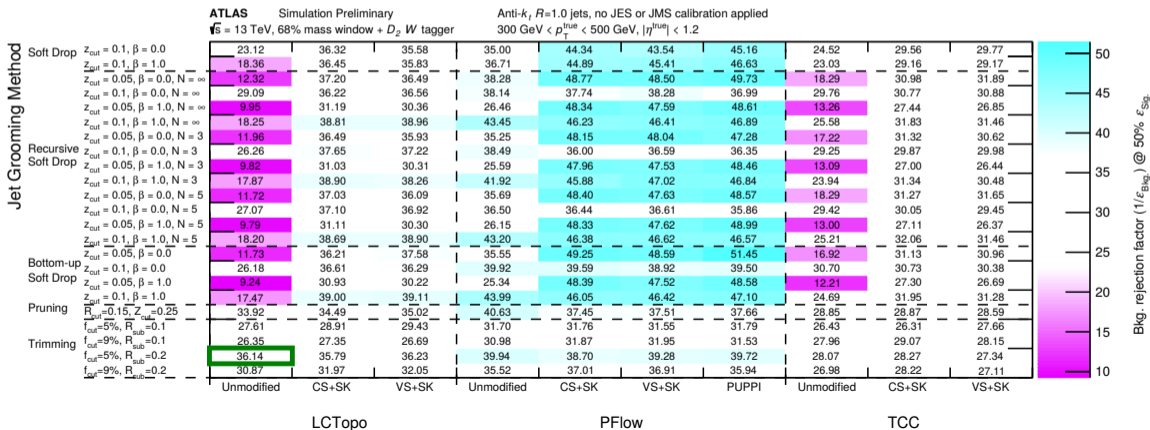
Looking forward: revisiting the jet definition

New @ BOOST2019

Plot: PUB-2019-027



- Huge effort underway to revisit the jet definition; tagging is an important consideration
 - Below is the W -tagging background rejection for 50% signal efficiency, using mass+ D_2
 - The current ATLAS jet definition is highlighted as a green box - clear potential gains!



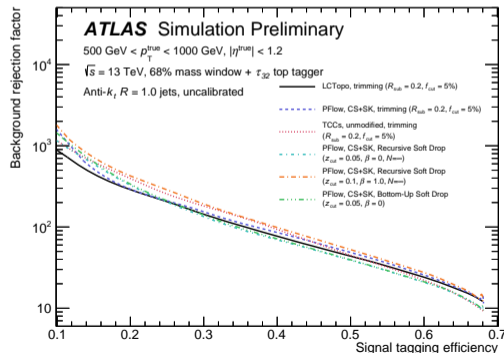
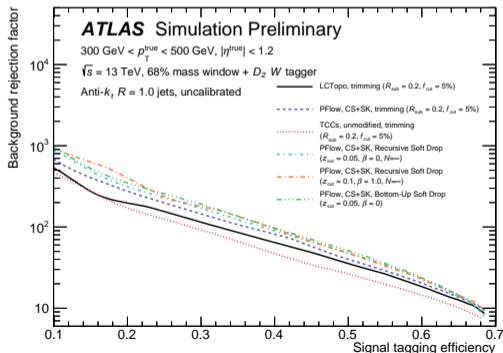
Alternative jet definition tagging performance

New @ BOOST2019

Both: PUB-2019-027



- Tagging performance is not the only important metric for picking a jet definition
 - A few options that work well in all metrics are shown below
- Improvements possible compared to the current definition (solid black line)
 - PFO jets provide best performance in this kinematic range (TCC best at high $p_{T,T}$, in backup)

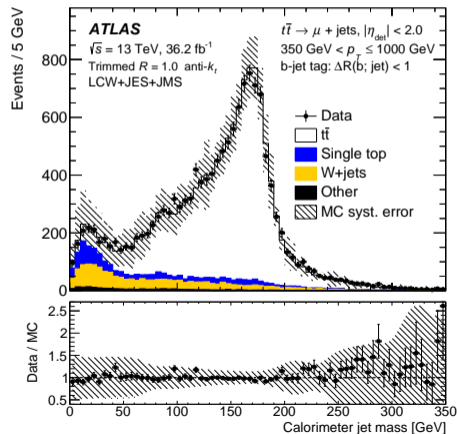
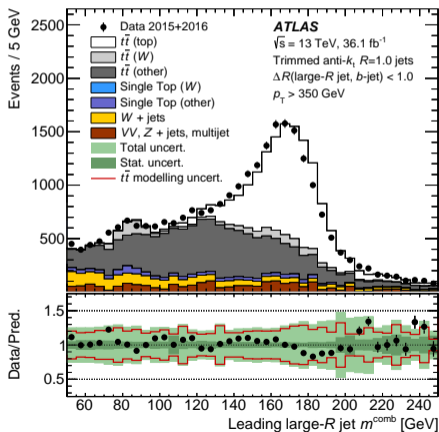


- W/Z/top taggers are becoming increasingly complex
 - Historically two-variable taggers, increasingly moving towards ML-based taggers
- ML tagging efficiencies are extracted in dedicated regions
 - Semi-leptonic $t\bar{t}$ used for top-jets and low p_T W-jets
 - V+jets used for high p_T W/Z-jets, as long as there is no peak-like mass shaping
 - QCD multijets and γ +jets used for background efficiencies
- The jet definition strongly influences the jet tagging potential
 - Studying improved jet inputs, constituent-level pileup mitigation, and grooming algorithms
 - Promising initial signs of tagging performance improvements to follow

Backup Material

Mass calibration and the top peak

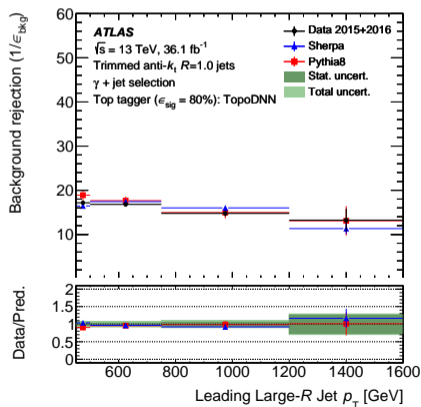
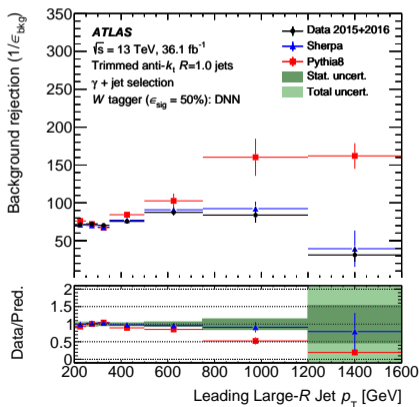
- In the scale factor pre-tag plot, there is a clear jet mass scale shift
- This is fixed by application of the *in situ* calibration, see [C. Wanotayaroj's](#) talk for details



Resulting background scale factors

Both: JETM-2018-03

- As before, these are for the W-tagging DNN and the top-tagging topocluster-based DNN
 - Multijet (body): W- and top-tagging both agree with Pythia8, disagree with Herwig++
 - γ +jet (below): W-tagging agrees with Sherpa not Pythia8, top-tagging agrees with both



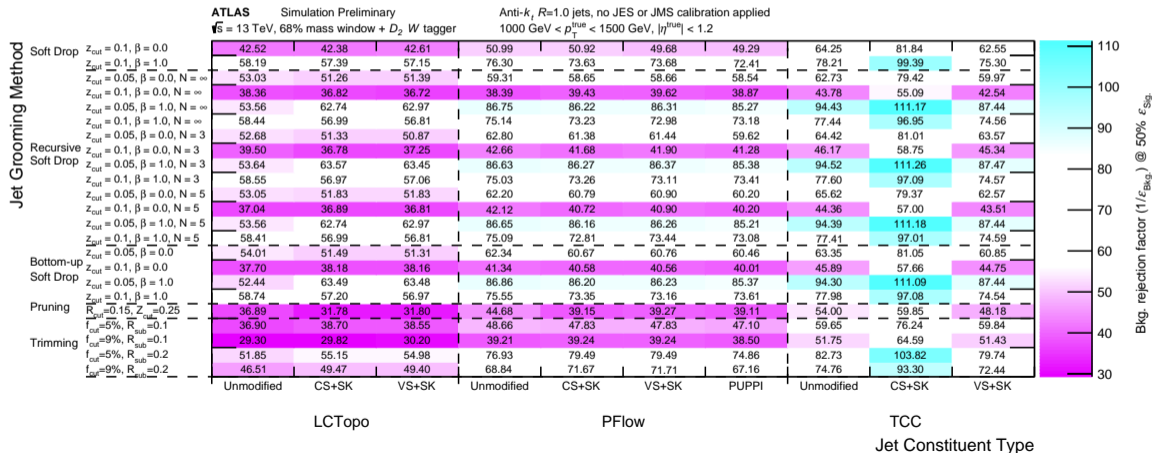
Looking forward: revisiting the jet definition

New @ BOOST2019

Plot: PUB-2019-027



- Huge effort underway to revisit the jet definition; tagging is an important consideration
- Below is the W -tagging background rejection for 50% signal efficiency, using mass+ D_2



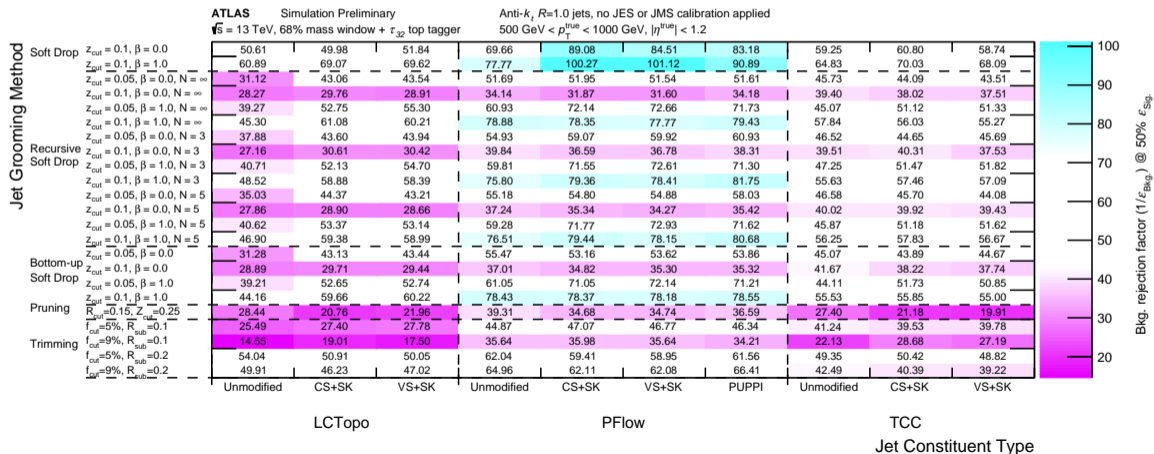
Looking forward: revisiting the jet definition

New @ BOOST2019

Plot: PUB-2019-027



- Huge effort underway to revisit the jet definition; tagging is an important consideration
- Below is the top-tagging background rejection for 50% signal efficiency, using mass+ τ_{32}



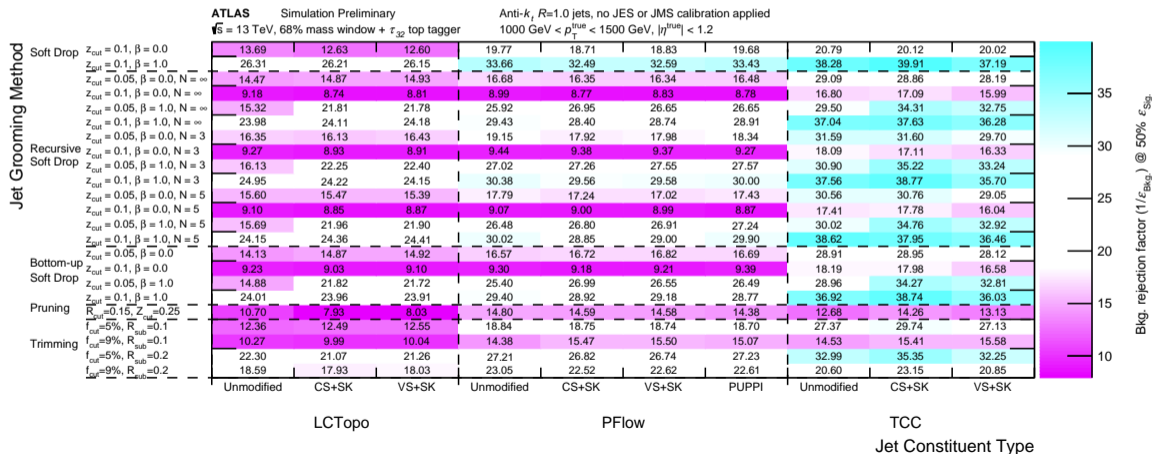
Looking forward: revisiting the jet definition

New @ BOOST2019

Plot: PUB-2019-027



- Huge effort underway to revisit the jet definition; tagging is an important consideration
- Below is the top-tagging background rejection for 50% signal efficiency, using mass+ τ_{32}



Alternative jet definition tagging performance

- Tagging performance is not the only important metric for picking a jet definition
 - A few options that work well in all metrics are shown below
- Improvements possible compared to the current definition (solid black line)
 - TCC jets provide the best performance in this kinematic range (lower p_T in body)

