

Quark gluon tag in HL-LHC Constituent-Based Tagger

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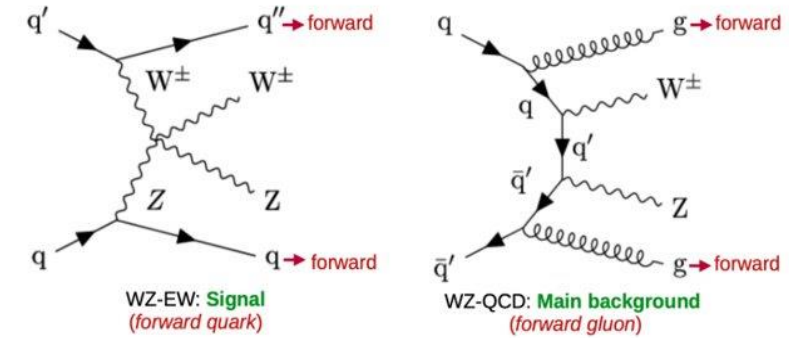
Jet tagging and scale factor meeting



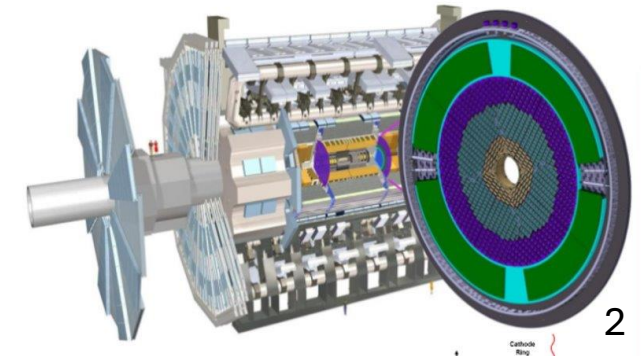
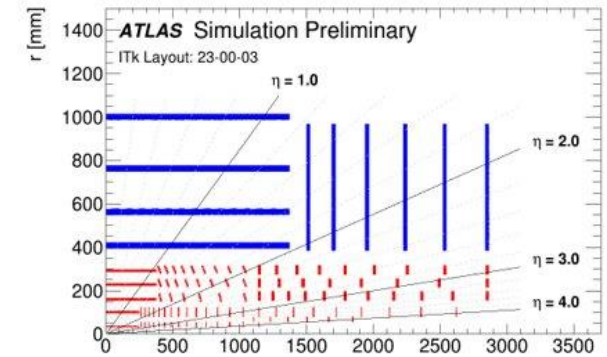
Outlook: quark gluon tag for HL-LHC

Constituents taggers :

CONSTITUENT	<p>▶ DeParT</p> <ul style="list-style-type: none"> • ParT enhancement 	<p>Constituent Interaction Variables</p> $\log \Delta^{ab} = \log \sqrt{(\eta^a - \eta^b)^2 + (\phi^a - \phi^b)^2}$ $\log k_T^{ab} = \log (\min(p_T^a, p_T^b) \Delta^{ab})$ $z^{ab} = \min(p_T^a, p_T^b) / (p_T^a + p_T^b)$ $\log m^{2,ab} = \log (p^{\mu,a} + p^{\mu,b})^2$	<p>Constituent Variables</p> $\Delta\eta = \eta - \eta^{\text{jet}}$ $\Delta\phi = \phi - \phi^{\text{jet}}$ $\Delta R = \sqrt{\Delta\eta^2 + \Delta\phi^2}$ $\log p_T$ $\log E$ $\log \frac{p_T}{p_T^{\text{jet}}}$ $\log \frac{E}{E^{\text{jet}}}$ m
	<p>▶ ParT arxiv:2202.03772</p> <ul style="list-style-type: none"> • Transformer 		
	<p>▶ ParticleNet (P.Net) arxiv:1902.08570</p> <ul style="list-style-type: none"> • Graph Neural Network 	<p>Linear Constituent Variables</p> $\Delta\eta = \eta - \eta^{\text{jet}}$ $\Delta\phi = \phi - \phi^{\text{jet}}$ $\Delta R = \sqrt{\Delta\eta^2 + \Delta\phi^2}$ $\frac{p_T}{p_T^{\text{jet}}}$	<p>High-level Jet Variable</p> <ul style="list-style-type: none"> jet 4-momentum total number of PFOs number of charged PFOs with $p_T > 1000\text{MeV}$ number of charged PFOs with $p_T > 500\text{MeV}$ jet width computed from charged PFOs with $p_T > 1\text{GeV}$ a fraction of energy of a jet deposited in EM calo charged fraction of a jet
	<p>▶ PFN arxiv:1810.05165</p> <ul style="list-style-type: none"> • Deep Sets 		
HIGHLEVEL	<p>▶ EFN arxiv:1810.05165</p> <ul style="list-style-type: none"> ▶ IRC safe 		
	<p>▶ Fully Connected (FC)</p> <ul style="list-style-type: none"> • MLP 		
	<p>▶ reduced Fully Connected (FC red.) arxiv:2308.00716</p> <ul style="list-style-type: none"> • closest to the previous BDT tagger 	$p_T, \eta, N_{\text{PFO}}, W_{\text{PFO}}, C_1^{\beta=0.2}$	



Detector upgrades:



JET Definition and Samples

- **Jets** are reconstructed with the anti- k_t with $R = 0.4$. PFlow jets no Calibrated
- **Cuts:** Only the two jets with the highest p_T are keep it. $p_T > 20$ GeV
- PFOs are a collection of **topo-clusters** formed from energy deposits in calorimeter cells and an algorithmic combination of charged-particle **tracks** with those topo-clusters (PFOs as constituents)
- Using official JETM2 production
- **Central Region:** Jets $p_T > 20$ GeV, $p_T < 2.5$ TeV, $|\text{Jets } y| < 2.5$
- **Forward Region:** Jets $p_T > 20$ GeV, $p_T < 500$ GeV, $|\text{Jets } y| > 2.5$ and $|\text{Jets } y| < 4.0$
- For training, only jets p_T is flatten
- Samples used for training/validation/testing:
 - Dijets, VBF, ttbar(allhad).
 - **PU 0:** Jets for training: 8.6M central, 4M forward
 - **PU 60:** Only evaluation

Taggers from Run 2

Constituent-based

DeParT and ParT

Constituent Interaction Variables

$$\log \Delta = \log \sqrt{(\eta^a - \eta^b)^2 + (\phi^a - \phi^b)^2}$$

$$\log k_T = \log (\min (p_T^a, p_T^b) \Delta)$$

$$z = \min (p_T^a, p_T^b) / (p_T^a + p_T^b)$$

$$\log m^2 = \log (p^{\mu,a} + p^{\mu,b})^2$$

Constituent Variables

$$\Delta\eta = \eta - \eta^{\text{jet}}$$

$$\Delta\phi = \phi - \phi^{\text{jet}}$$

$$\Delta R = \sqrt{\Delta\eta^2 + \Delta\phi^2}$$

$$\log p_T$$

$$\log E$$

$$\log \frac{p_T}{E^{\text{jet}}}$$

$$\log \frac{E}{E^{\text{jet}}}$$

$$m$$

Highlevel variables

FC Network

Highway Network

EMFrac

+ Jet pT

Jet width

TrackWidthPt1000

NumChargedPFOWidthPt1000

chf

FC Crafted*

$$N_{\text{PFO}} = \sum_{\text{PFO} \in \text{jet}}$$

+ Jet pT

$$C1^{\beta=0.2} = \frac{\sum_{i,j \in \text{jet}}^{i \neq j} p_{T,i} p_{T,j} (\Delta R_{i,j})^{\beta=0.2}}{(\sum_{i,j \in \text{jet}} p_T^{\text{PFO}})^2}$$

$$w^{\text{PFO}} = \frac{\sum_{\text{PFO} \in \text{jet}} p_T^{\text{PFO}} \cdot \Delta R_{\text{PFO}, \text{jet}}}{\sum_{\text{PFO} \in \text{jet}} p_T^{\text{PFO}}}$$

*FC crafted
mimic Run 2
BDT tagger

Constituents defined by jets_y for HL-LHC

Constituent-based

DeParT and ParT

Constituent Interaction Variables

$$\log \Delta = \log \sqrt{(y^a - y^b)^2 + (\phi^a - \phi^b)^2}$$

$$\log k_T = \log (\min (p_T^a, p_T^b) \Delta)$$

$$z = \min (p_T^a, p_T^b) / (p_T^a + p_T^b)$$

$$\log m^2 = \log (p^{\mu,a} + p^{\mu,b})^2$$

Constituent Variables

$$\Delta y = y - y_{\text{jet}}$$

$$\Delta \phi = \phi - \phi_{\text{jet}}$$

$$\Delta R = \sqrt{\Delta y^2 + \Delta \phi^2}$$

$$\log p_T$$

$$\log E$$

$$\log \frac{p_T}{p_{T,\text{jet}}}$$

$$\log \frac{E}{E_{\text{jet}}}$$

$$m$$

Highlevel variables

FC Network

Highway Network

EMFrac	+ Jet pT
--------	----------

Jet width

TrackWidthPt1000

NumChargedPFOWidthPt1000

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FC Crafted*

$$N_{\text{PFO}} = \sum_{\text{PFO} \in \text{jet}}$$

+ Jet pT

$$C1^{\beta=0.2} = \frac{\sum_{i,j \in \text{jet}}^{i \neq j} p_{T,i} p_{T,j} (\Delta R_{i,j})^{\beta=0.2}}{(\sum_{i,j \in \text{jet}} p_T^{\text{PFO}})^2}$$

$$w^{\text{PFO}} = \frac{\sum_{\text{PFO} \in \text{jet}} p_T^{\text{PFO}} \cdot \Delta R_{\text{PFO},\text{jet}}}{\sum_{\text{PFO} \in \text{jet}} p_T^{\text{PFO}}}$$

*FC crafted
mimic Run 2
BDT tagger

Evaluation. Central region.

Bins pT: (20, 60, 100, 150, 500, 1000, 2500) [GeV]

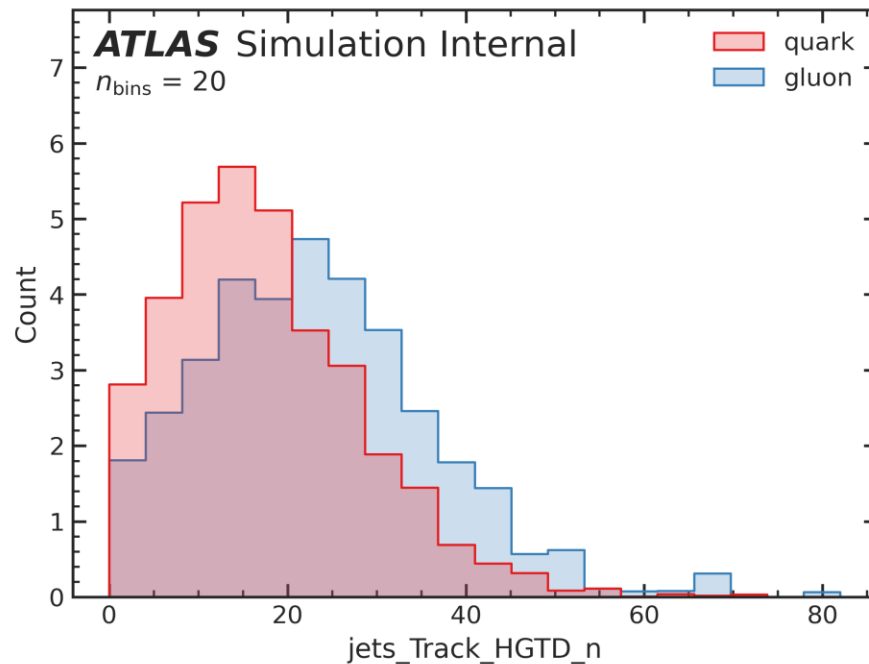
- Central region: jets_y < 2.5. Evaluation in jets_y: [0, 0.5, 1.0, 1.5, 2.0, 2.5]

- For the central region at low pT , we don't see much improvement when using transform-based (low-level variable) taggers compared to NN-based (high-level variable) taggers.

HGTD new variable: jets_Track_HGDT_n

```
const std::vector<float>& times = track->auxdataConst< std::vector<float> >("HGTD_cluster_time");
for (float value : times) {
    if (value != -1.0f) {
        track_HGTD_num++;
    }
}
}
else {
    track_cluster_time_0.push_back(-2);
    track_cluster_time_1.push_back(-2);
    track_cluster_time_2.push_back(-2);
    track_cluster_time_3.push_back(-2);
}
}
```

HGTD has 4 clusters

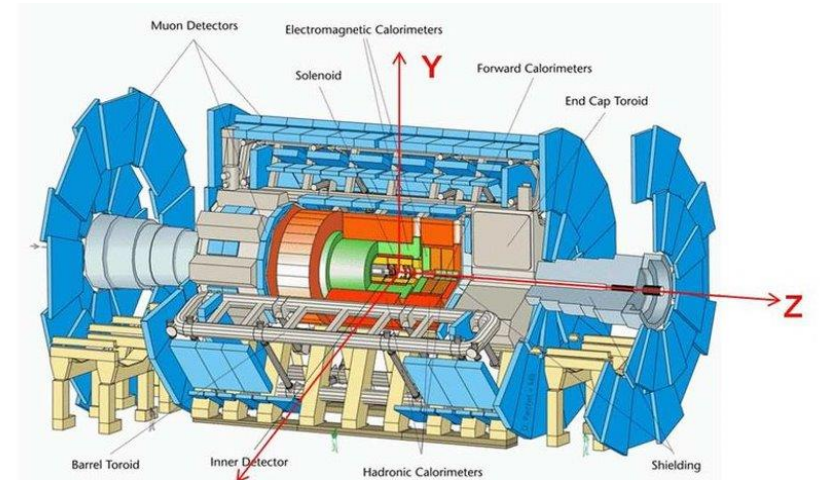


<i>d</i>	1
<i>u</i>	2
<i>s</i>	3
<i>c</i>	4
<i>b</i>	5
<i>t</i>	6
<hr/>	
<i>g</i>	21

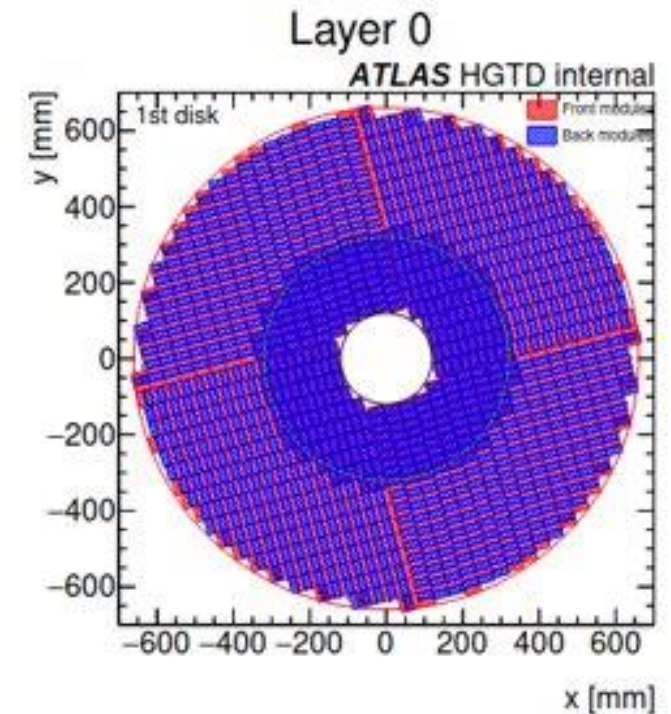
```
jets_PartonTruthLabelID { 3, 1 }
jets_Track_HGTD_cluster_time { {}, {}, {}, {}, {}, {}, {}, {}, {}, {}, {}, {}, {}, {}, {}, {}, { -0.0868788f, -1.00000f, -1.00000f, -1.00000f }, { -0.0626068f, -0.133852f, -1.00000f, -1.00000f }, { -0.0399399f, -0.131161f, -0.0712185f, -0.201877f }, { 1.00000f, -1.00000f, -1.00000f, -1.00000f }, { -1.00000f, -0.0767756f, -0.0902195f, -1.00000f }, { -0.104699f, -1.00000f, -0.0932989f, -0.0751143f } }
jets_Track_HGTD_cluster_truth_class { {}, {}, {}, {}, {}, {}, {}, {}, {}, {}, {}, {}, {}, {}, {}, {}, { 4, -1, -1, -1 }, { 1, 1, -1, -1 }, { 1, 1, 1, 1 }, { -1, -1, -1, -1 }, { -1, 1, 1, -1 }, { 1, -1, 1, 1 } }
jets_Track_n { 16, 6 }
```


HGTD low level variable

$$\log \Delta_{x,y}^{HGTD} = \log \sqrt{(x^a - x^b)^2 + (y^a - y^b)^2}$$

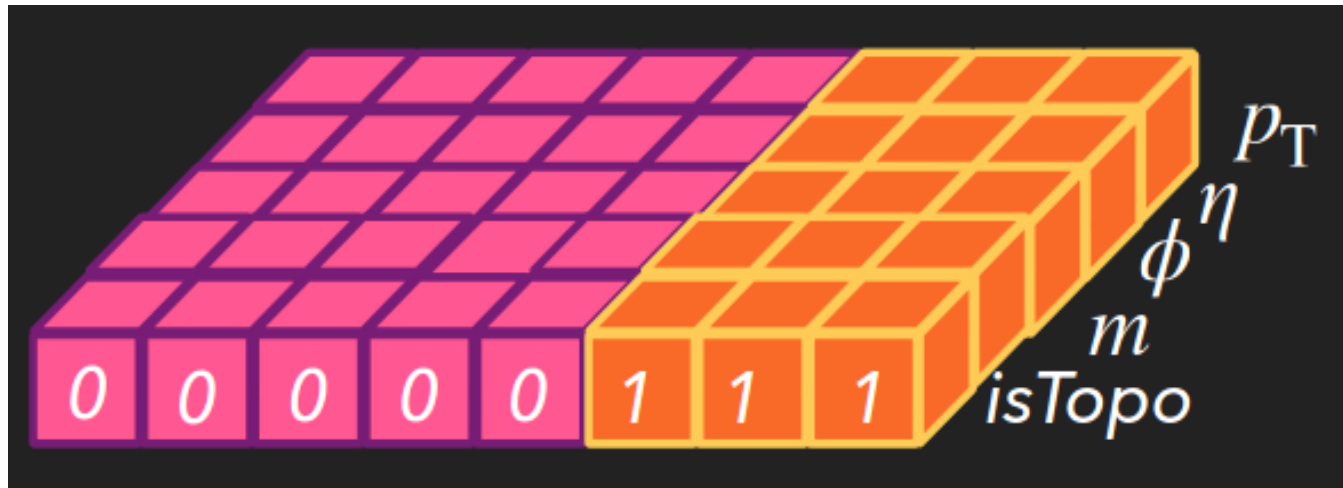


- InDetTrackParticlesAuxDyn.HGTD_cluster_merged
- InDetTrackParticlesAuxDyn.HGTD_cluster_raw_time
- InDetTrackParticlesAuxDyn.HGTD_cluster_shadowed
- InDetTrackParticlesAuxDyn.HGTD_cluster_time
- InDetTrackParticlesAuxDyn.HGTD_cluster_truth_class
- InDetTrackParticlesAuxDyn.HGTD_extension_chi2
- InDetTrackParticlesAuxDyn.HGTD_extrap_x
- InDetTrackParticlesAuxDyn.HGTD_extrap_y
- InDetTrackParticlesAuxDyn.HGTD_has_extension
- InDetTrackParticlesAuxDyn.HGTD_primary_expected



Input variables

- **PFOs are always used as input.**
- **For the forward region,** Topo Towers and Track information are included, along with the new HGTD variable.
- **For the central region,** Tracks are also added.
- These are concatenated with the PFOs, and an additional variable (isTopo or isTrack, depending on the object) is introduced. This approach follows the implementation by Samuel: [slides](#)



Constituent Interaction Variables

$$\log \Delta = \log \sqrt{(y^a - y^b)^2 + (\phi^a - \phi^b)^2}$$

$$\log \Delta_{x,y}^{HGTD} = \log \sqrt{(x^a - x^b)^2 + (y^a - y^b)^2}$$

$$\log k_T = \log (\min (p_T^a, p_T^b) \Delta)$$

$$z = \min (p_T^a, p_T^b) / (p_T^a + p_T^b)$$

$$\log m^2 = \log (p^{\mu,a} + p^{\mu,b})^2$$

Constituent Variables

$$\Delta y = y - y_{\text{jet}}$$

$$\Delta \phi = \phi - \phi_{\text{jet}}$$

$$\Delta \phi^{HGTD} = \phi^{HGTD} - \phi_{\text{jet}}$$

$$\Delta R = \sqrt{\Delta y^2 + \Delta \phi^2}$$

$$\log p_T$$

$$\log E$$

$$\log \frac{p_T}{p_{T,\text{jet}}}$$

$$\log \frac{E}{E_{\text{jet}}}$$

$$m$$

Evaluation. Forward region.

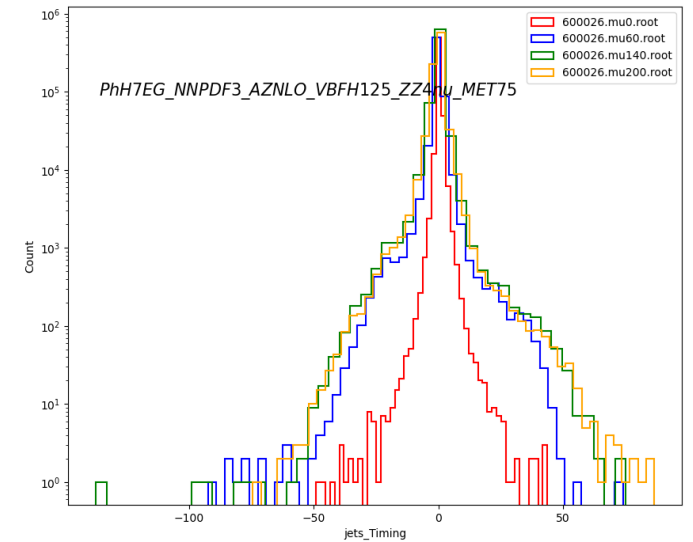
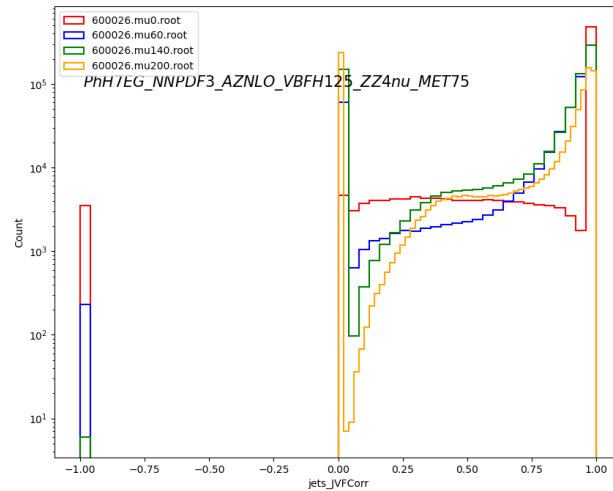
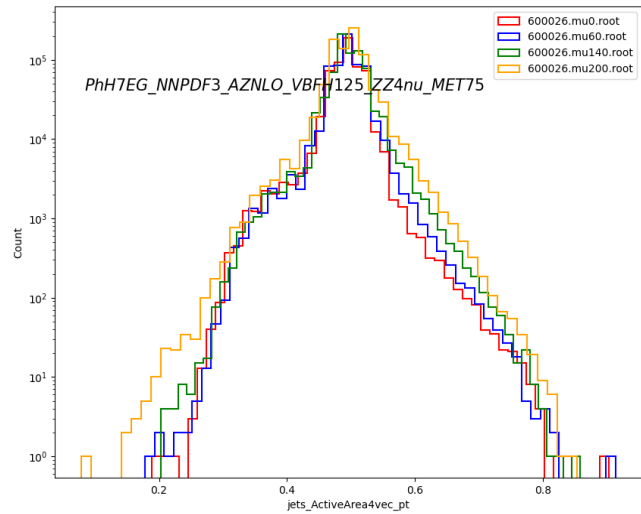
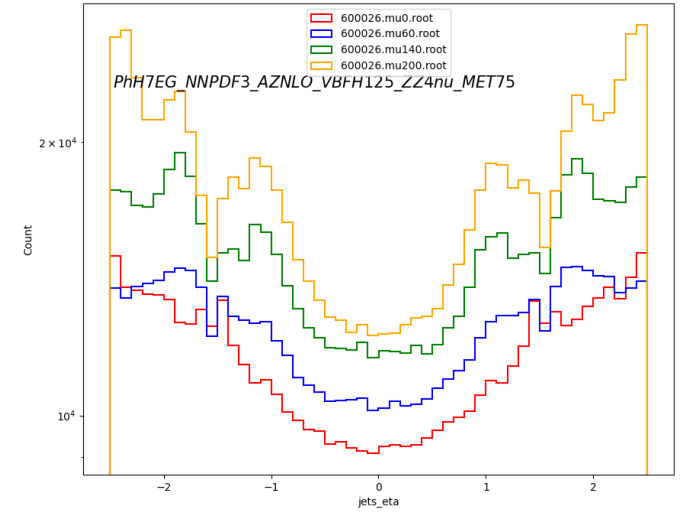
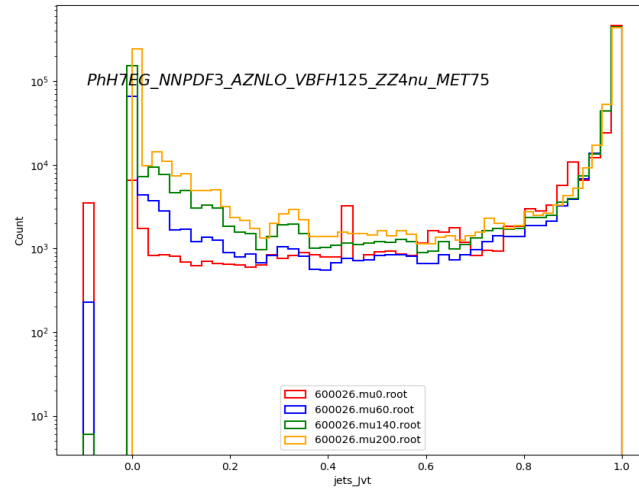
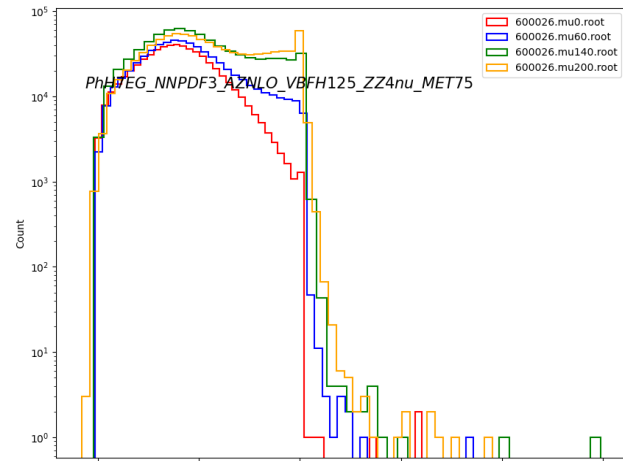
Bins split PT: (20, 60, 100, 150, 500) [GeV]

- Forward region: jets_y > 2.5. Evaluation in jets_y: [2.5, 3.0, 3.5, 4.0]

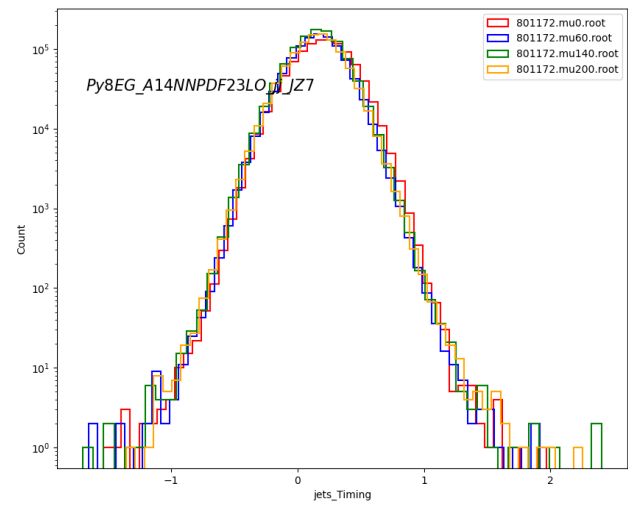
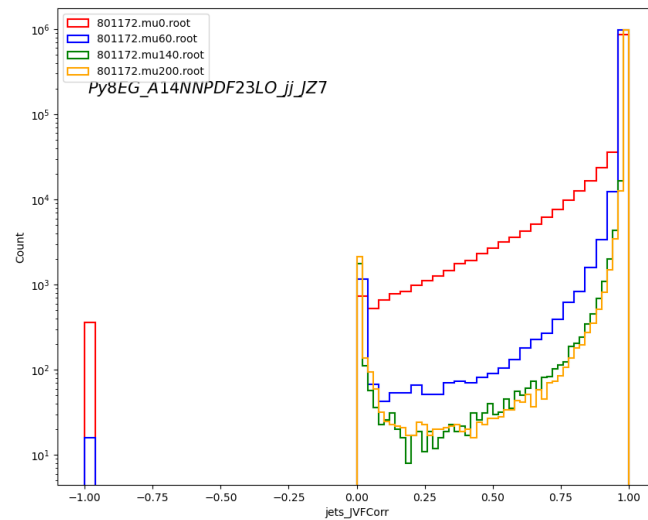
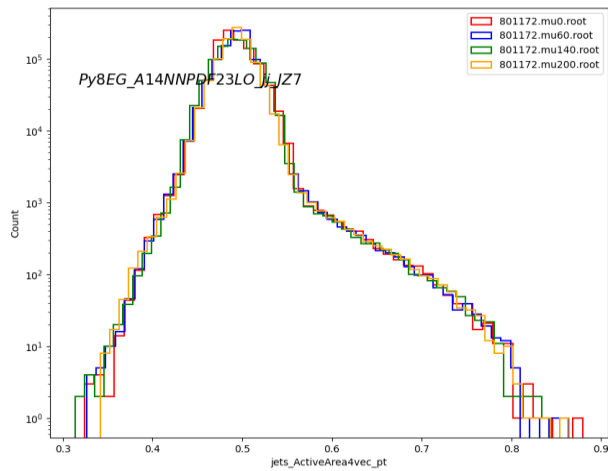
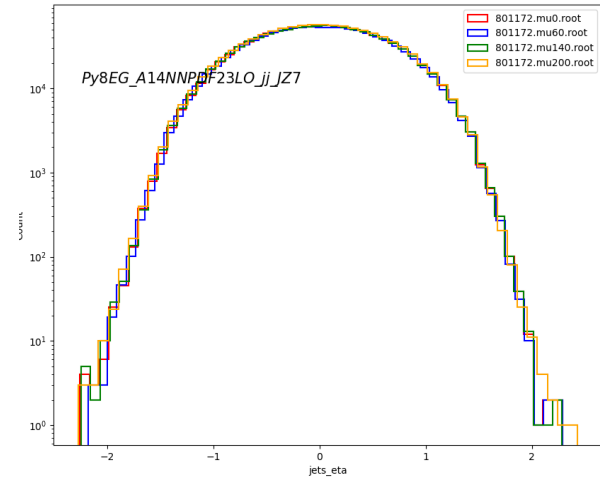
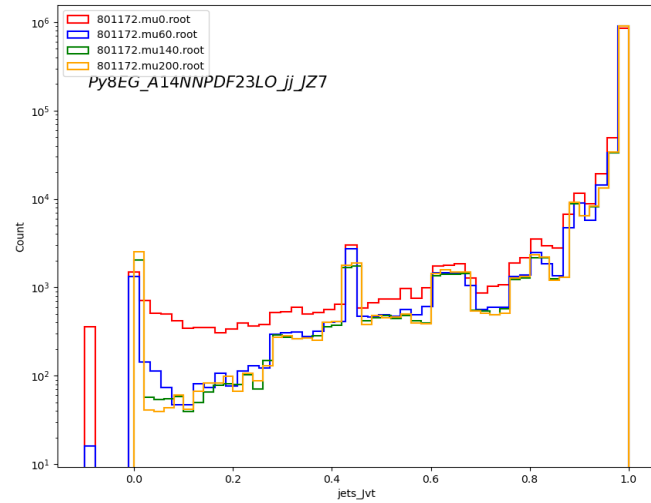
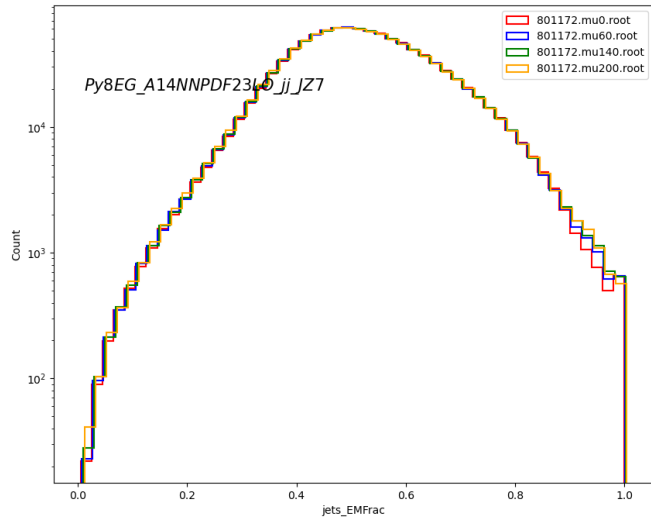
Pile-up studies

Test mu60

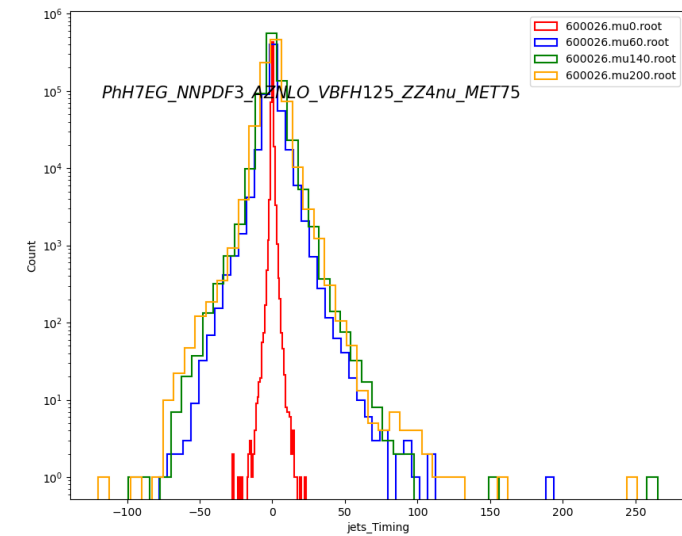
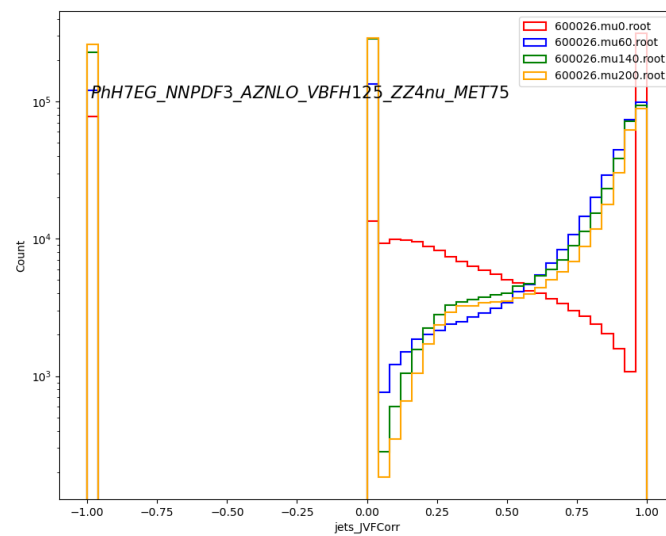
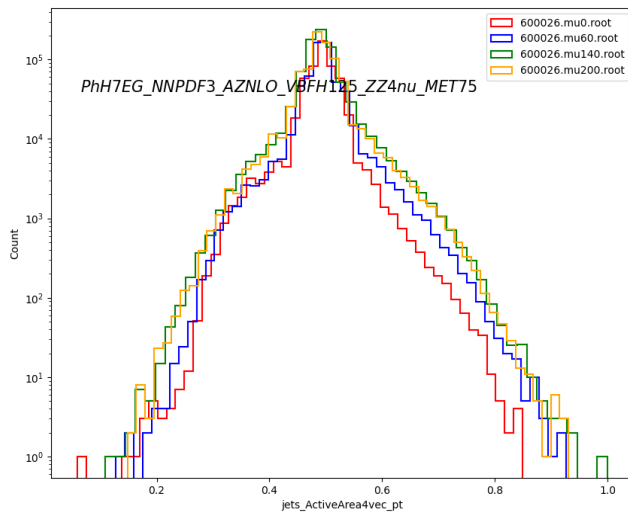
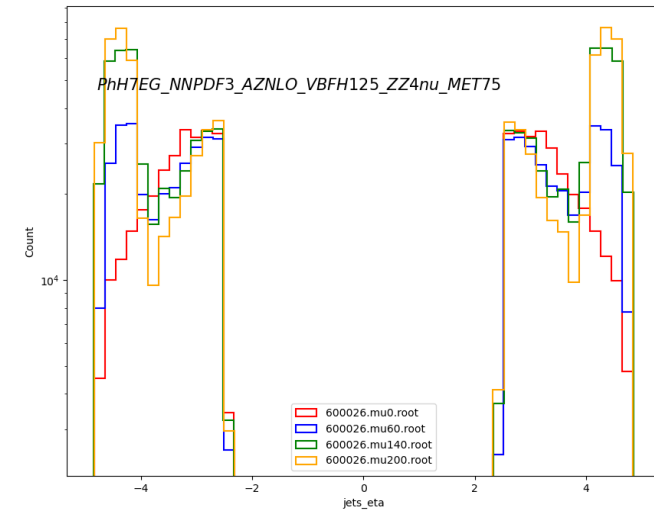
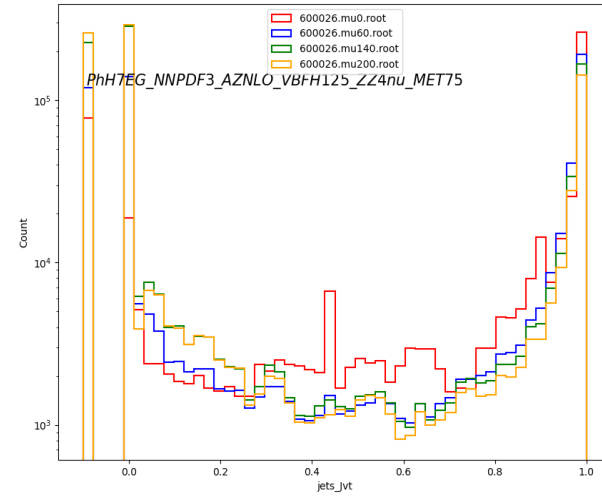
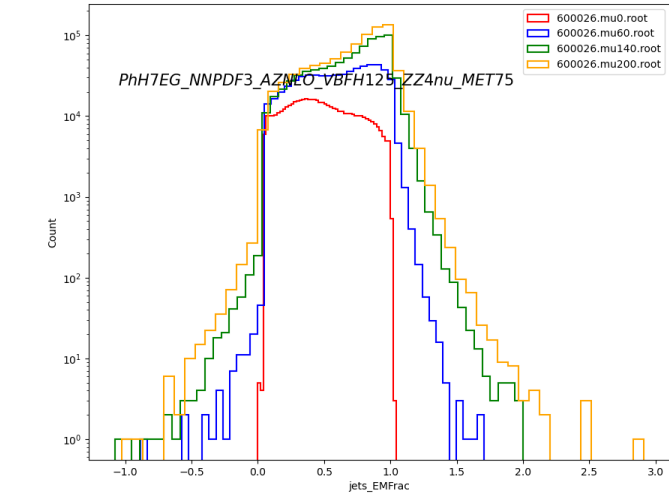
New input variables? Central region



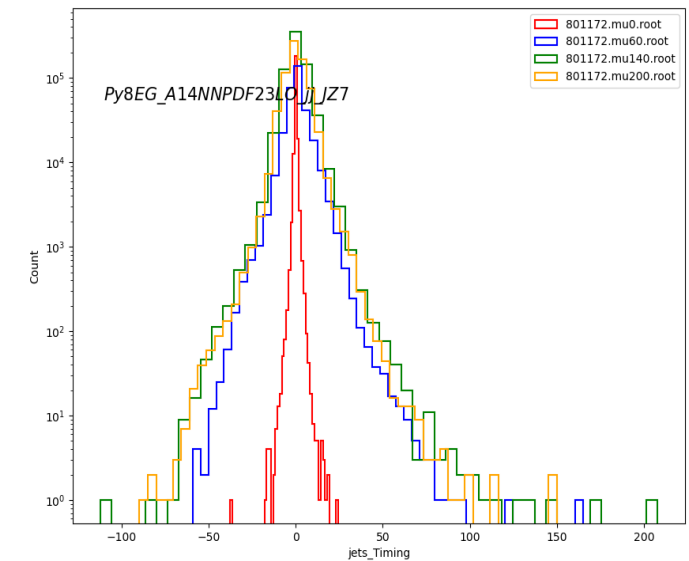
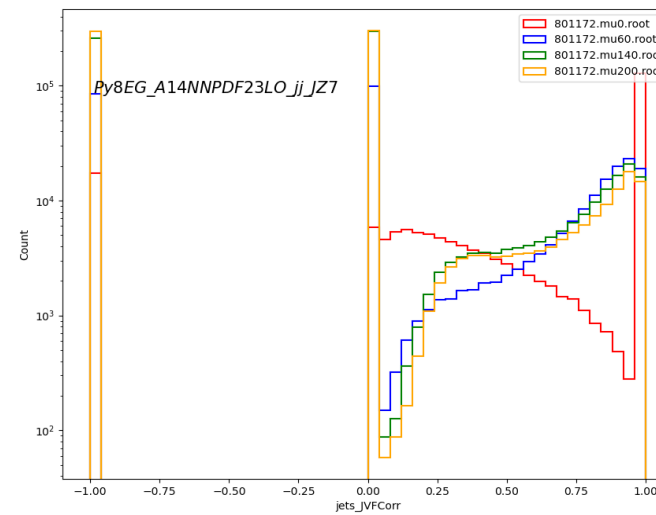
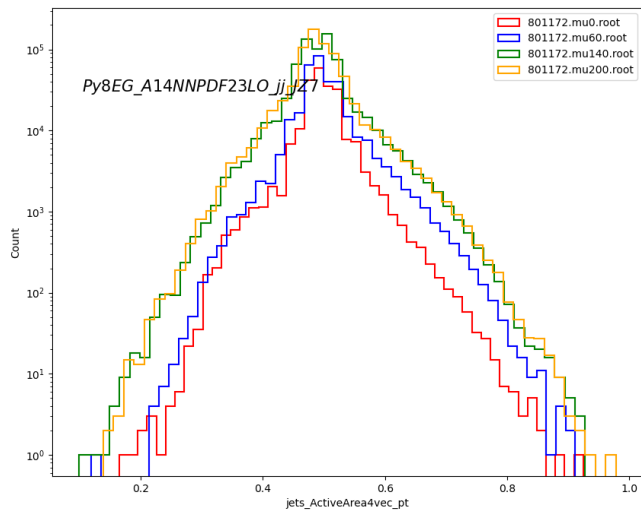
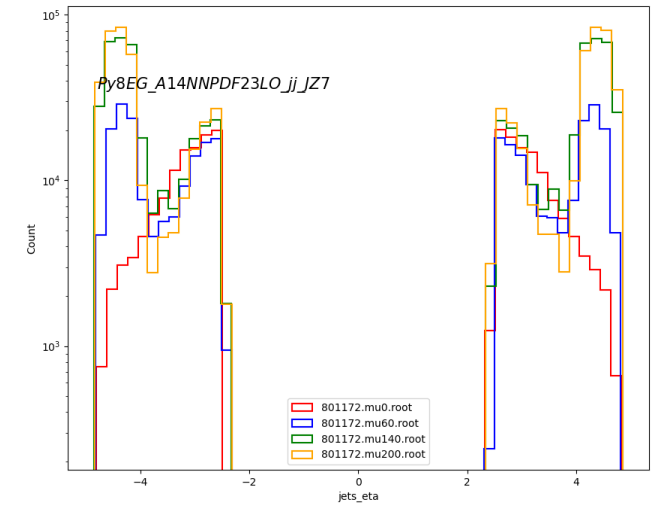
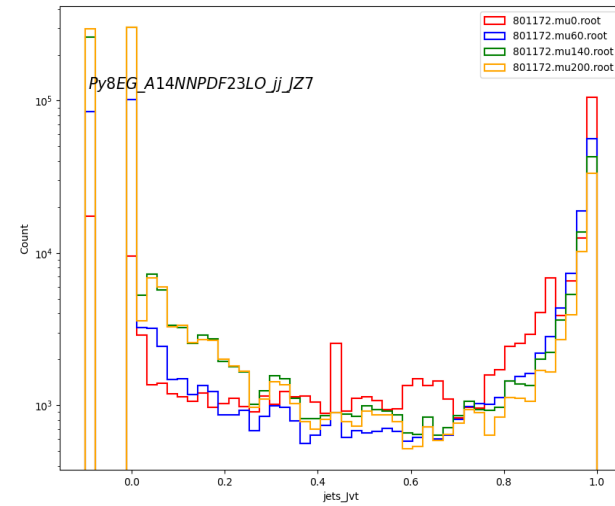
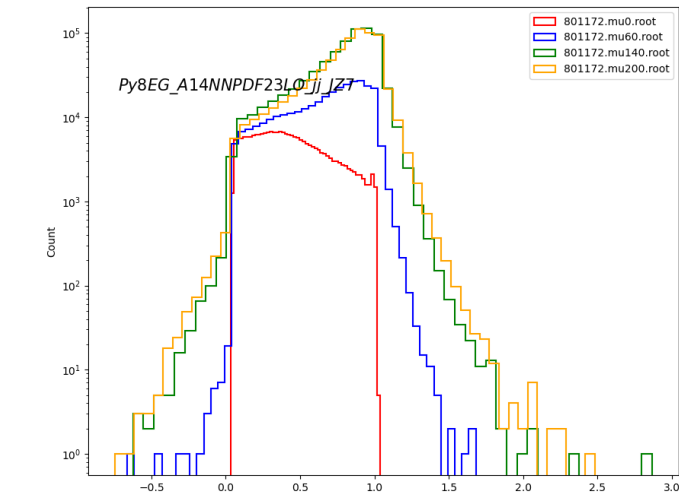
New input variables? Central region



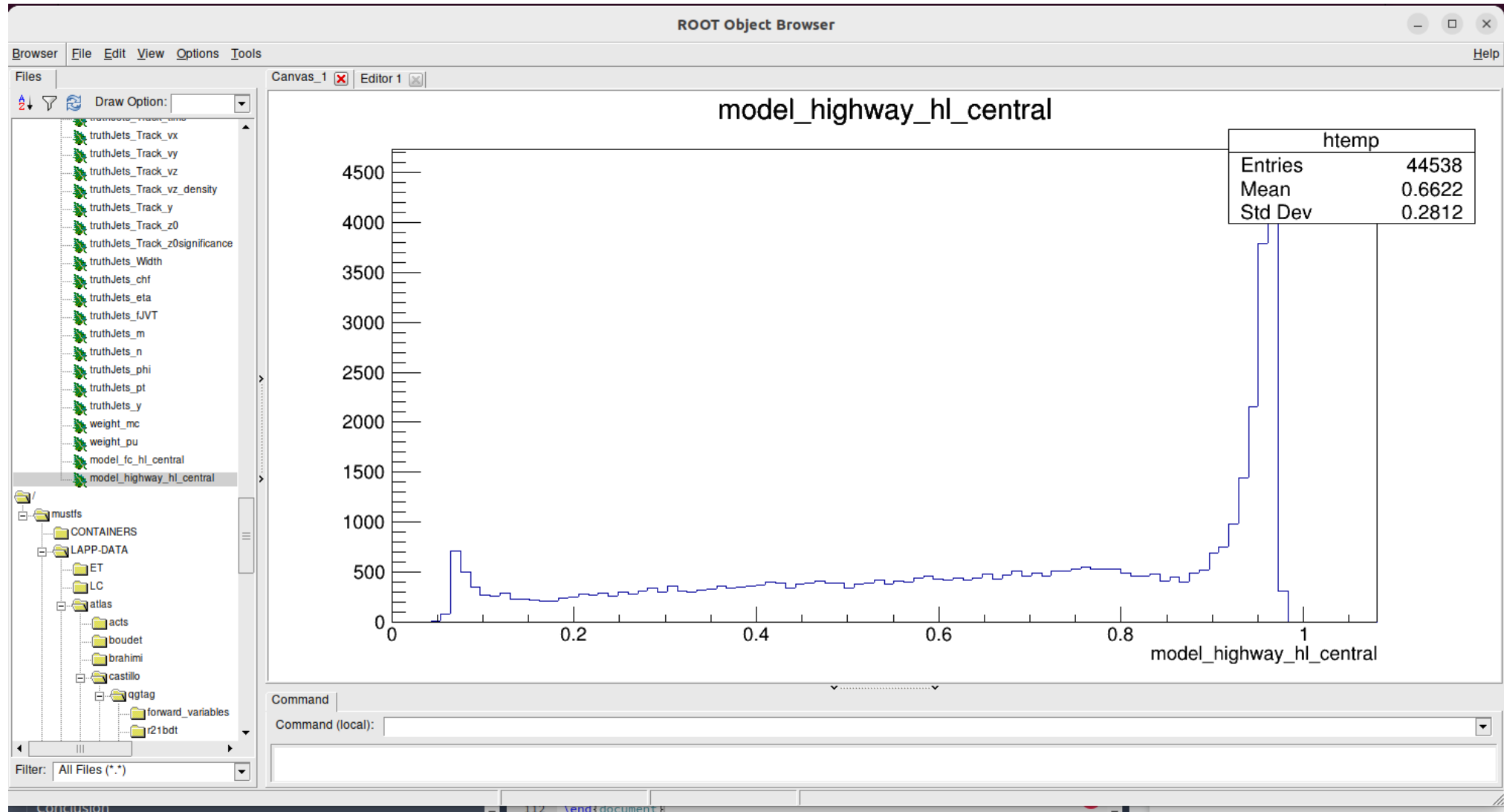
New input variables? Forward region



New input variables? Forward region



Scores in root files



Scores in root files

