

Prompt lepton tagger with the ATLAS detector

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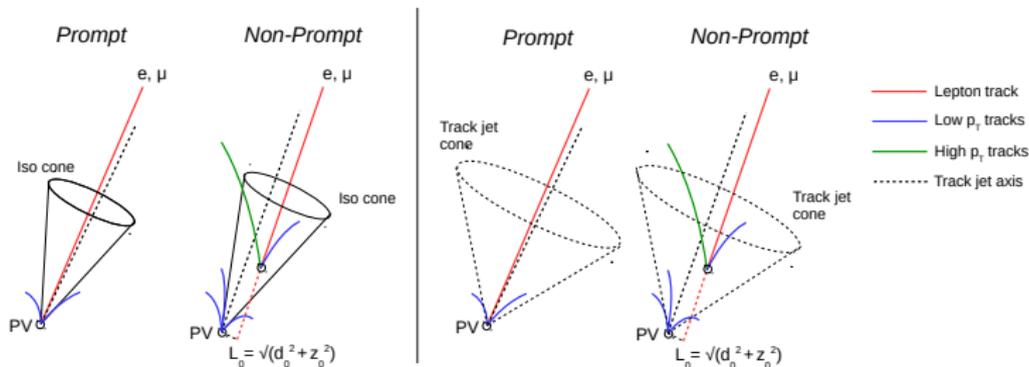


OUTLINE

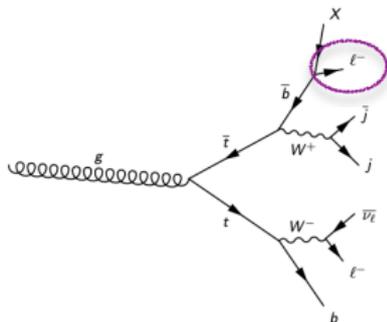
- ▶ **Introduction of the prompt lepton tagger algorithm.**
- ▶ **Newly developed calorimeter isolation variable**
- ▶ **Develop dedicated lifetime observables**
- ▶ **Training procedures and inputs**
- ▶ **Current results for electrons and muons**
- ▶ **Conclusion**

Introduction

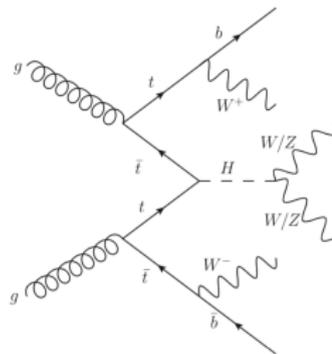
- ▶ *Prompt Lepton Tagger aims to identify prompt electrons/muons from W/Z decays:*
 - Non-prompt leptons produced in B/C decays are significant background for many analyses
 - Use isolation and lifetime observables to veto non-prompt leptons
- ▶ **Current status:**
 - The *PromptLeptonVeto* BDT is the previous version of the *Prompt Lepton Tagger* that we developed last year.
 - Gives $\sim 70\%$ higher rejection of non-prompt leptons compared to ATLAS official isolation working point (*FixedCutTight*).
 - Used and increase the sensitivity in the [ttH](#), [VVV](#) and [ttW](#) analysis.



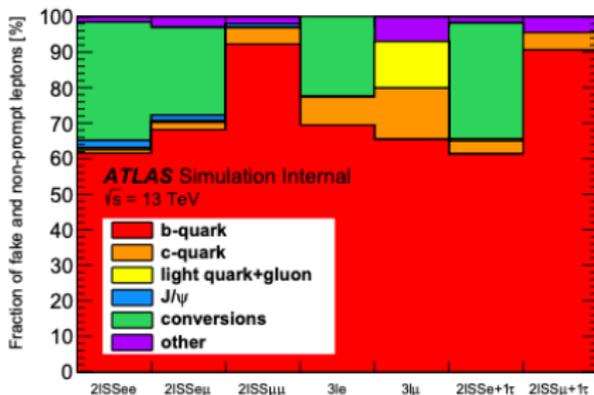
Introduction



$t\bar{t}$ contribute to same sign 2 lepton channel



ttH Feynman diagram



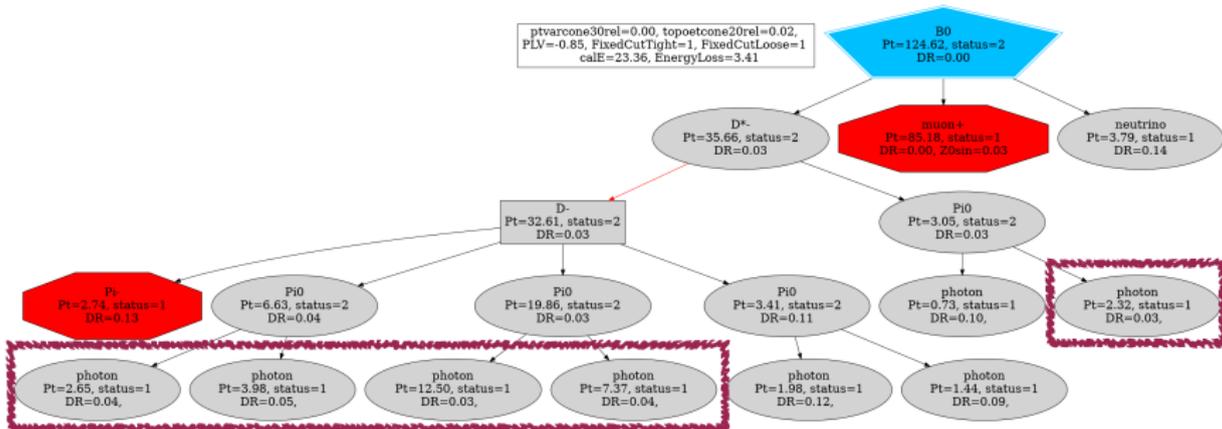
- ▶ The **non-prompt background** is the limiting factor in an early observation of ttH .
- ▶ The isolation cut significantly reduces the background from $t\bar{t}$, but the cross section of signal process like ttH is small enough.

Newly developed calorimeter isolation variable

Non-prompt muon event display

► Non-prompt muon below passes standard isolation requirement

- B^0 decays to muon, ν_μ and D^- within the small angle to the muon ($\Delta R = 0.03$)
- D^- further decays to a π^- and several π^0 s which decay to photons
- *Results in large calorimeter energy deposit close to the reconstructed muon*

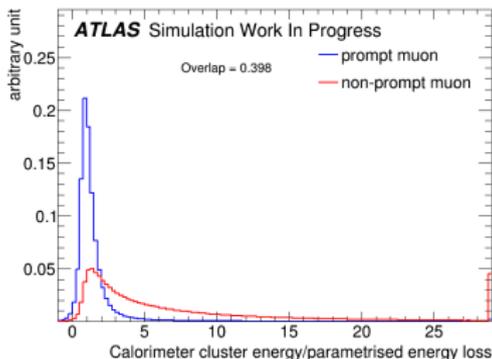


► Standard isolation tools do not include the core energy around the lepton.

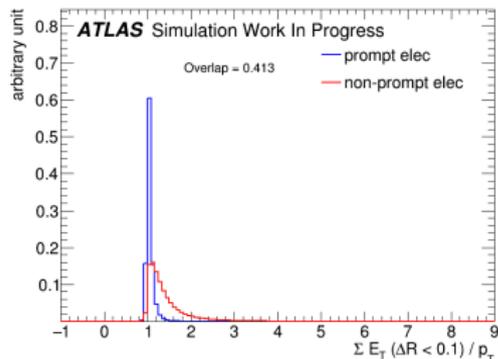
Newly developed isolation variables

- ▶ For muon, $E_{\text{cluster}}^{\mu} / E_{\text{expected}}$ = muon cluster energy / Parameterised energy loss.
 - E_{cluster}^{μ} : collect all the energy of the clusters associated to the muon trajectory.
 - E_{expected} : refers to the estimated energy loss of the muon by reconstruction.
 - **The boosted b-jet will contribute to the non-prompt muon cluster energy.**
- ▶ For electron, we use $\Sigma E_{T, \text{cluster}}^e (\Delta R < 0.15) / p_T^e$
 - Electron will deposit all its energy does not have the "energy loss".

$E_{\text{cluster}}^{\mu} / E_{\text{expected}}$ – muon



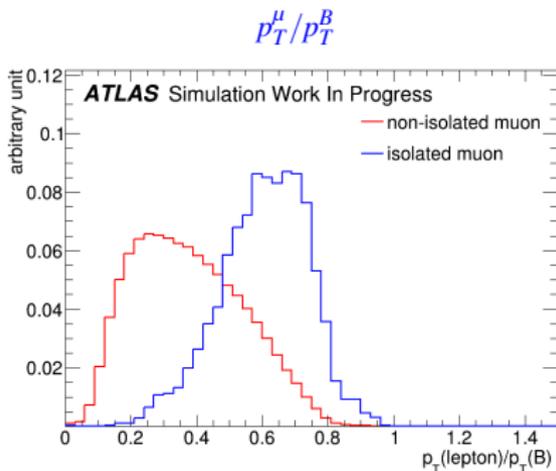
$\Sigma E_{T, \text{cluster}}^e (\Delta R < 0.15) / p_T^e$ – electron



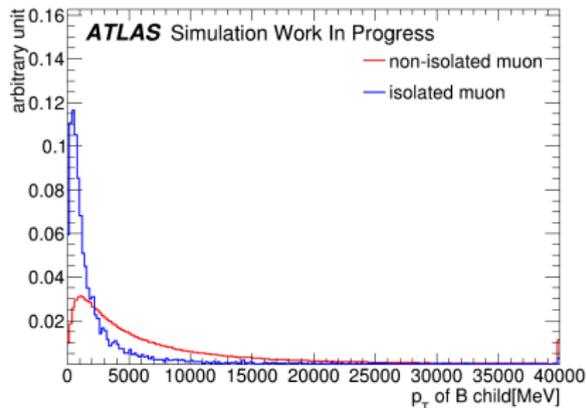
Develop dedicated lifetime observables

Properties of B semi-leptonic decays on MC

- ▶ Inclusive reconstructed non-prompt muons with $p_T > 10$ GeV
- ▶ Isolated non-prompt muons: in addition passed isolation requirement.



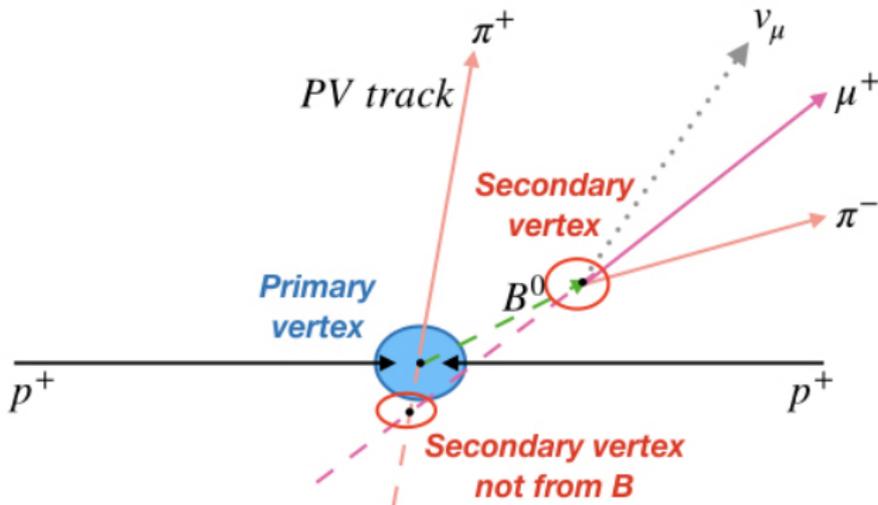
p_T of additional charged hadrons produced in B decay



- ▶ Properties of **isolated non-prompt** muons:
 - Muon carries the majority of B hadron p_T
 - Charged hadrons (that are produced in B decay) have low p_T
- ▶ Collect looser tracks with $p_T > 500$ MeV while BTag use 1 GeV typically.
 - Will include in average $\sim 8.43\%$ more tracks from B decay.

Vertex fit using muon and track pair

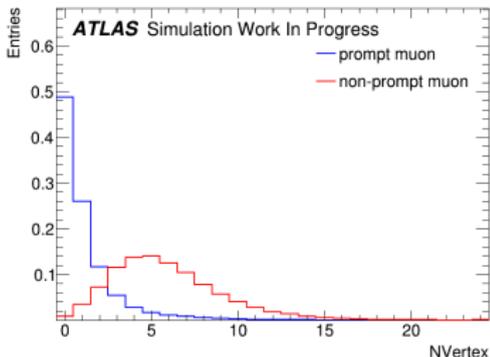
- ▶ Fit each lepton + ID track combination for 2-track vertices.
- ▶ Merge 2-track vertices that close to each other.



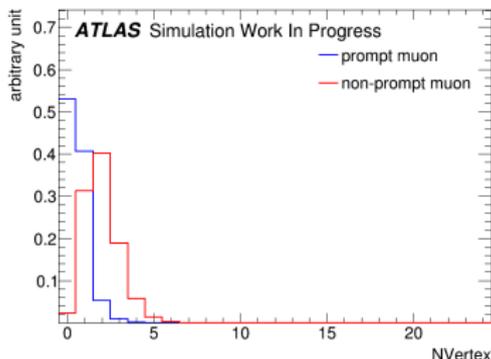
Secondary vertex multiplicity - muon

- ▶ $\sim 47\%$ of prompt muons will have reconstructed vertex. $\sim 98\%$ of non-prompt muons will have reconstructed vertex
 - Merge 2-track vertices will reduce the number of vertex for each leptons.
 - One vertex (primary vertex) reconstructed for **prompt** muon is expected.
 - For **non-prompt** muons, we will more often find both primary vertex and secondary vertex.
- ▶ **Similar observation for electrons.**
 - Vertices from material interaction are also considered.

N 2-track vertices for inclusive muons



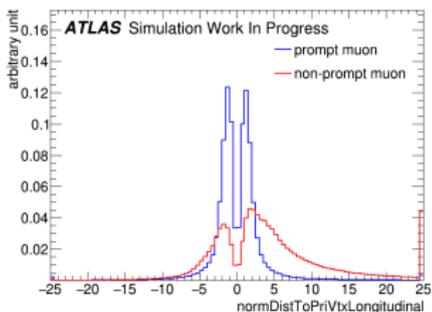
N vertices for inclusive muons – after merging



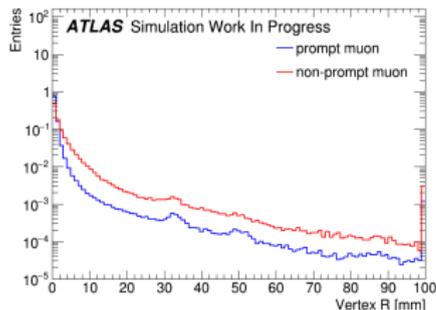
Merged vertex variables

- ▶ $l_{SV \text{ to PV}}^{\text{longitudinal}} / \sigma$: the longitudinal significance distance between SV and the PV.
- ▶ Performed additional vertex selection for electron vertices: clean the SV along the lepton track direction.

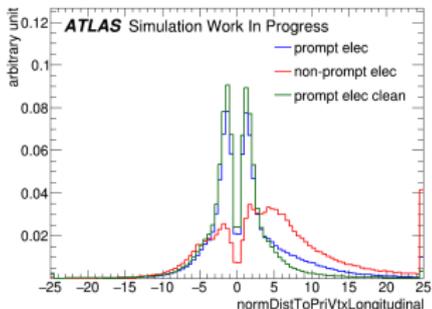
$l_{SV \text{ to PV}}^{\text{longitudinal}} / \sigma$ – muon



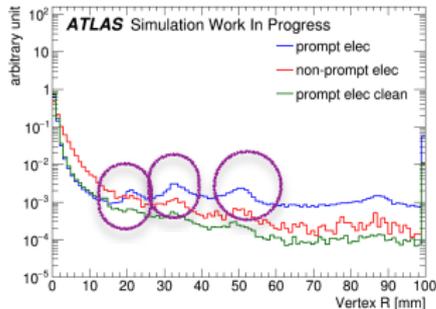
$\sqrt{x^2 + y^2}$ – muon



$l_{SV \text{ to PV}}^{\text{longitudinal}} / \sigma$ – electron



$\sqrt{x^2 + y^2}$ – electron



Training procedures and inputs

Training procedures and inputs

- ▶ BDT_{new}^{μ} : 8 input variables; p_T bin normalization is performed; do loose isolation pre-selection on training samples.
- ▶ BDT_{new}^e : 10 input variables; train forward electrons and central electrons separately; p_T bin normalization is performed; do loose isolation pre-selection on training samples.
- ▶ p_T bin normalization - suppress the strong p_T dependence
 - p_T bins (muons): 10, 15, 20, 25, 31, 40, 10000 GeV
 - p_T bins (electrons): 10, 20, 40, 10000 GeV
 - Normalize non-prompt muon yield to prompt muon yield in each p_T bin, to remove p_T dependence – [check_ptnorm.pdf](#)

Inputs	Description	BDT_{new}^{μ}	BDT_{new}^e
RNNIP	RNN using track impact parameters and other variables ¹	✓	✓
$\frac{longitudinal\ SV\ to\ PV}{\sigma}$	Secondary vertex longitudinal significance using tracks with $p_T > 500$ MeV	✓	✓
$p_T VarCone30/p_T$	Lepton isolation using ID tracks within a cone of $\Delta R < 0.3$	✓	✓
$E_T TopoCone30/p_T$	Lepton isolation using topological clusters within a cone of $\Delta R < 0.3$	✓	✓
$\frac{E_{cluster}^{\mu}}{\sum_{\Delta R < 0.15} E_T / p_T}$	Relative muon calorimeter cluster energy sum of cluster energy divided by lepton p_T	✓ -	- ✓
N_{track} in track jet	Number of tracks clustered by the track jet	-	✓
$\frac{p_T^{rel}}{p_T}$	Lepton p_T along the track jet axis: $p \cdot \sin(\angle \text{lepton, track jet})$	-	✓
$\frac{lepton\ track\ p_T}{p_T}$	Lepton track p_T divided by track jet p_T	✓	✓
$\Delta R(\text{lepton, track jet})$	ΔR between the lepton and the track jet axis	✓	✓
p_T^{lepton} bin number	Index of the bin of lepton p_T	✓	✓

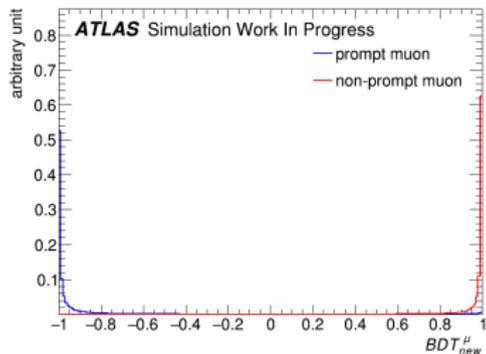
¹ will re-train it dedicated to prompt lepton tagging

Performance

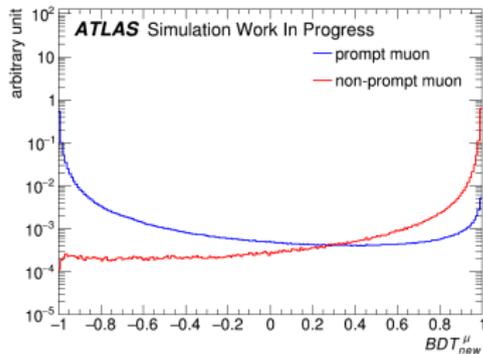
BDT score of muon

- ▶ Perform on medium reconstructed muon with $p_T > 10$ GeV

BDT_{new}^{μ}



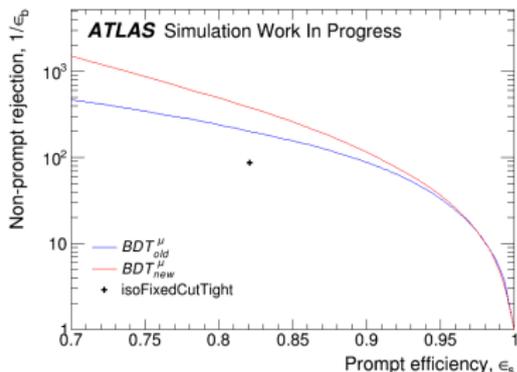
$BDT_{new}^{\mu} - \log y$



- ▶ BDT type: Gradient BDT.
- ▶ BDT configuration: NTrees=1000; NCuts=100; MaxDepth=7; MinNodeSize=0.05%;

Current performance for the muons

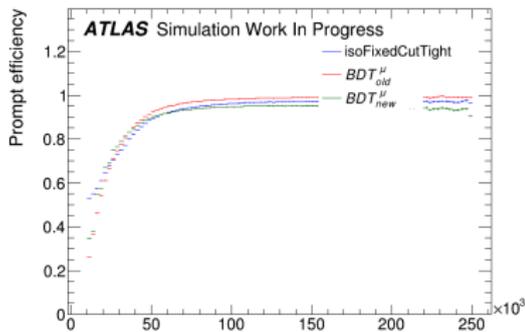
- ▶ Check non-prompt muon rejection for medium reconstructed muons with $p_T^{\text{lepton}} > 10 \text{ GeV}$
- ▶ *Prompt Lepton Tagger(s)* reject more non-prompt muons compared to isolation cuts
- ▶ BDT_{new}^{μ} is the recommend one now.
- ▶ Substantial improvement with updated algorithms



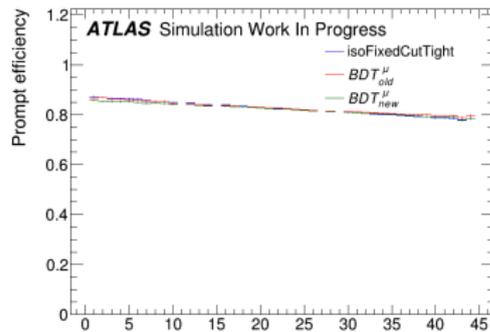
Algorithm	prompt eff. cut	prompt efficiency(%)	Bkg. rejection (1/eff.)
BDT_{new}^{μ}	-0.875	$82.14^{+0.01}_{-0.01}$	$381.6^{+5.8}_{-5.9}$
BDT_{old}^{μ}	-0.805	$82.14^{+0.01}_{-0.01}$	$201.1^{+2.2}_{-2.2}$
isoFixedCutTight	1.	$82.14^{+0.01}_{-0.01}$	$85.3^{+0.6}_{-0.6}$

Muon efficiency

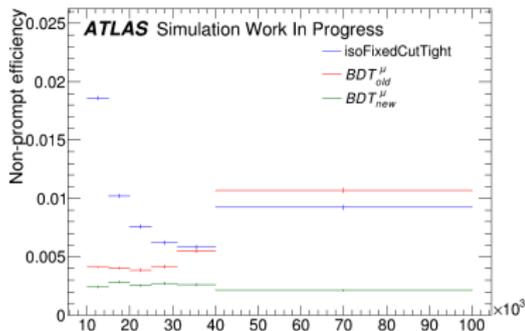
- ▶ Prompt muon efficiency at same overall efficiency of $p_T > 10$ GeV muons as the FixedCutTight
eff. vs. p_T – prompt



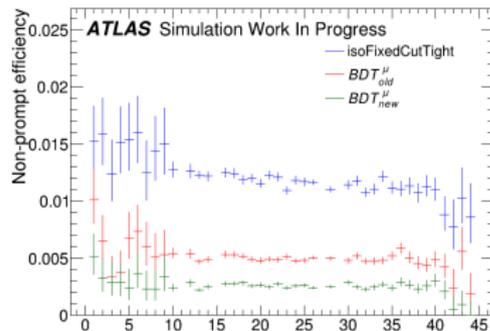
eff. vs. Average Interactions – prompt



- ▶ BDT_{new}^{μ} has better non-prompt muon rejection in high p_T region.
eff. vs. p_T – non-prompt



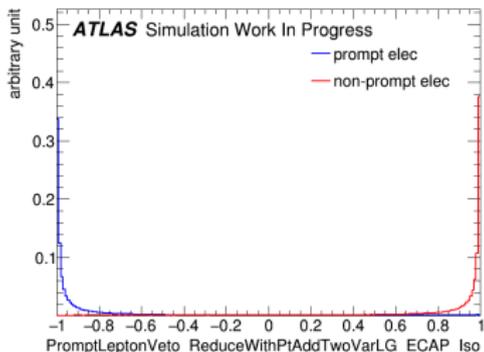
eff. vs. Average Interactions – non-prompt



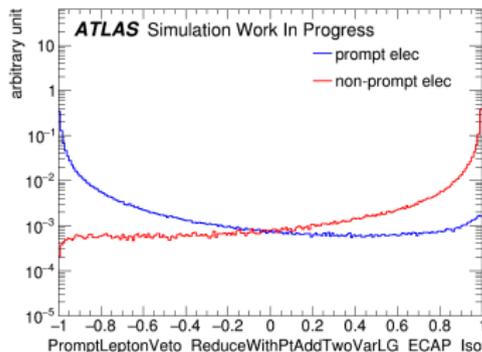
BDT score of electron

- ▶ Use the same BDT type and configuration as the muons.
- ▶ Perform on $p_T > 10$ GeV **forward** electron (above) and **central** electron (below).

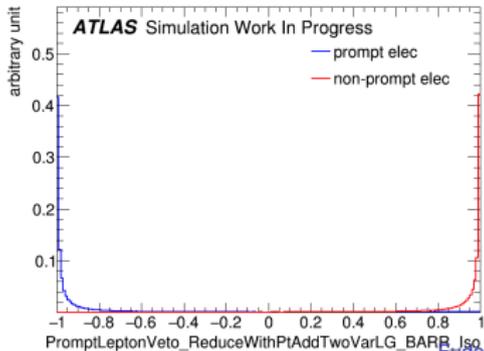
$BDT_{new,forward}^e$



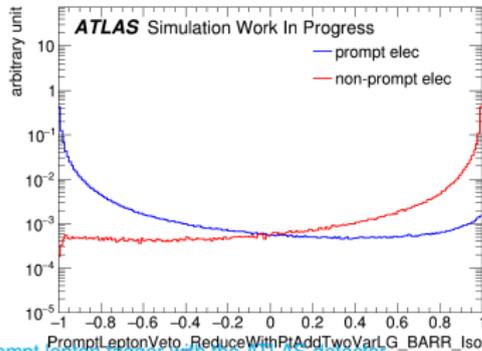
$BDT_{new,forward}^e - \log y$



$BDT_{new,central}^e$



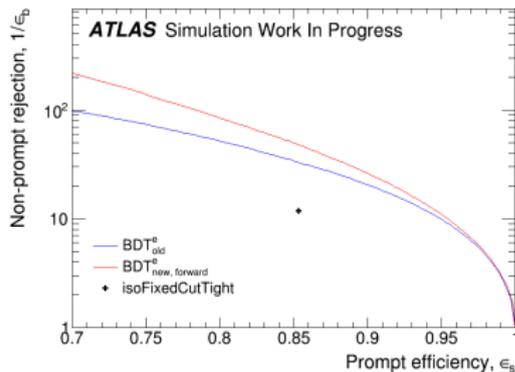
$BDT_{new,central}^e - \log y$



Current performance for the electrons

- ▶ Substantial improvement with updated algorithms

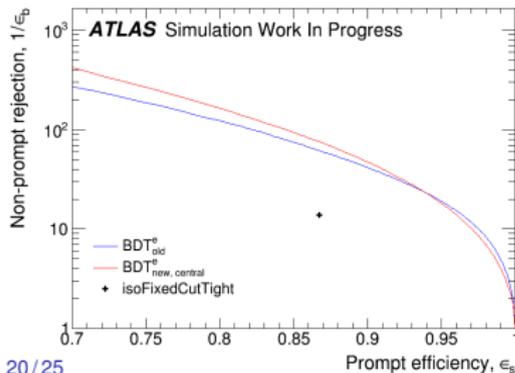
BDT^e_{new,forward}



- ▶ Perform on $p_T > 10$ GeV **forward** electron.

Algorithm	prompt eff. cut	prompt efficiency(%)	Bkg. rejection (1/eff.)
<i>BDT^e_{new,forward}</i>	-0.615	85.37 ^{+0.04} _{-0.04}	47.8 ^{+0.7} _{-0.7}
<i>BDT^e_{olde}</i>	0.045	85.37 ^{+0.04} _{-0.04}	32.9 ^{+0.4} _{-0.4}
isoFixedCutTight	1.	85.37 ^{+0.04} _{-0.04}	11.7 ^{+0.1} _{-0.1}

BDT^e_{new,central}



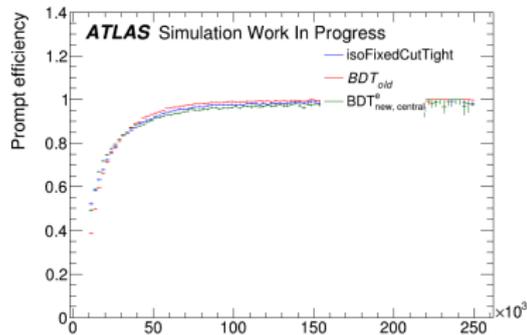
- ▶ Perform on $p_T > 10$ GeV **central** electron.

Algorithm	prompt eff. cut	prompt efficiency(%)	Bkg. rejection (1/eff.)
<i>BDT^e_{new,central}</i>	-0.705	86.76 ^{+0.02} _{-0.02}	75.4 ^{+0.8} _{-0.8}
<i>BDT^e_{olde}</i>	-0.535	86.76 ^{+0.02} _{-0.02}	61.2 ^{+0.6} _{-0.6}
isoFixedCutTight	1.	86.76 ^{+0.02} _{-0.02}	13.7 ^{+0.1} _{-0.1}

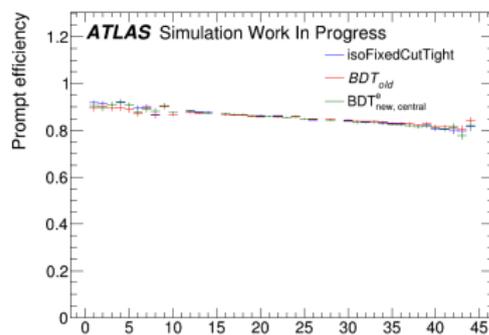
Forward electron efficiency

- Prompt forward electron efficiency at same overall efficiency of $p_T > 10$ GeV forward electrons as the FixedCutTight

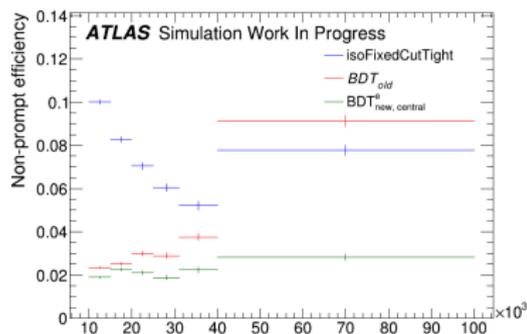
eff. vs. p_T – prompt



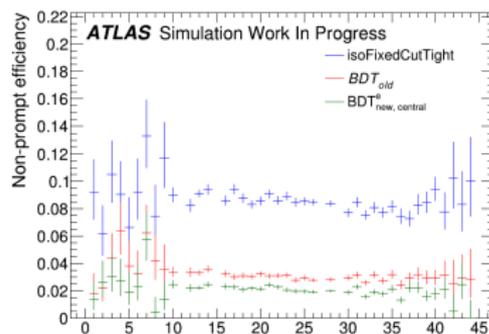
eff. vs. Average Interactions – prompt



eff. vs. p_T – non-prompt



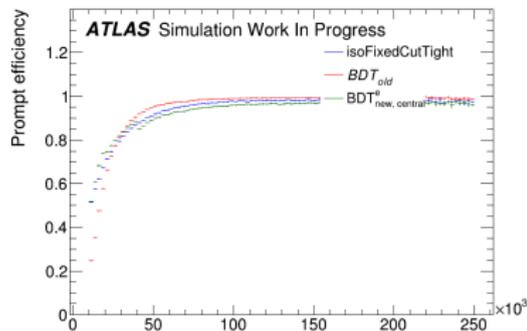
eff. vs. Average Interactions – non-prompt



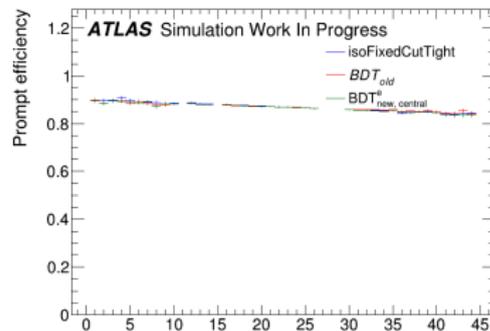
Central electron efficiency

- Prompt central electron efficiency at same overall efficiency of $p_T > 10$ GeV central electrons as the FixedCutTight

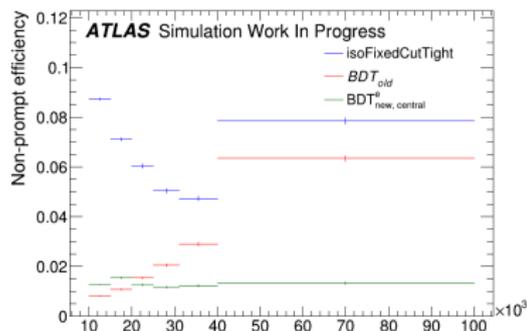
eff. vs. p_T – prompt



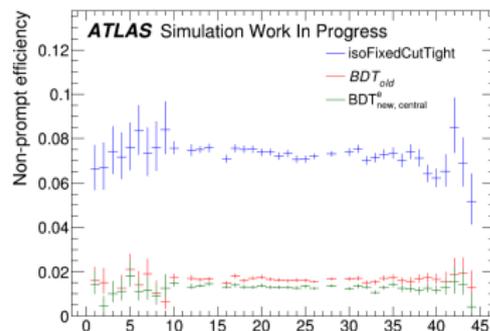
eff. vs. Average Interactions – prompt



eff. vs. p_T – non-prompt



eff. vs. Average Interactions – non-prompt



Conclusion

Conclusion

- ▶ BDTs combined isolation information and lifetime information outperform standard isolation working points in selecting prompt leptons.
- ▶ Dedicated isolation variable and lifetime variables are developed for the prompt lepton tagging.
- ▶ New BDTs with optimized training procedure have shown better performance than the current BDTs (PromptLeptonVeto).
- ▶ This study will be finalized sooner after adding new RNN variable.

Thank you for your time !

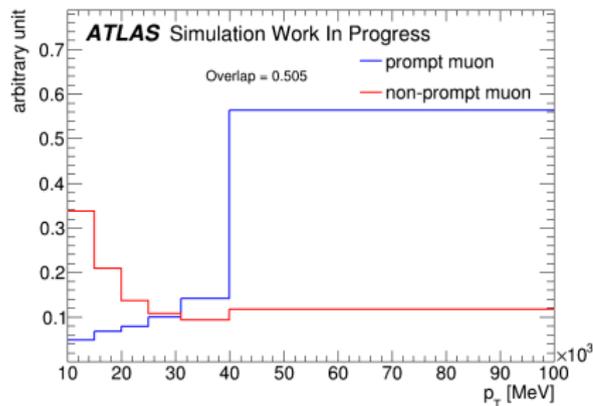
BACKUP

Soft vertex finding

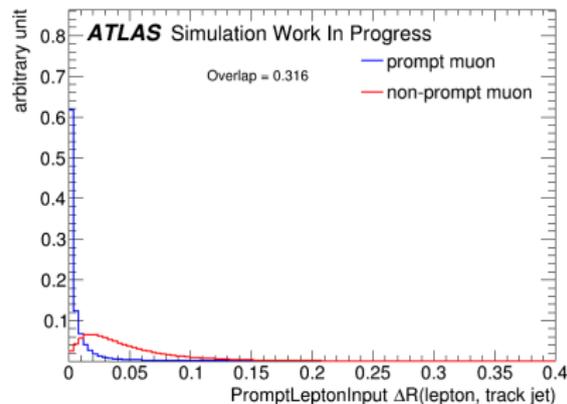
- Collect loose ID tracks within a cone of $\Delta R = 0.4$ centered at the muon
- Fit 2-track vertexes using muon track + ID track pairs
 - Vertex fitter candidates: [Trk::TrkVKalVrtFitter](#), [Trk::FastVertexFitter](#) and [Trk::SequentialVertexFitter](#).
 - Three fitters above show similar performance in our case.
 - Choose [Trk::FastVertexFitter](#) for our study since it has higher efficiency and straightforward [theory](#).
- Select vertexes with fit probability at $< 3\%$
- Sort selected 2-track vertexes by track pT , then start with highest pT track
- Iteratively add each 2-track vertex, starting with closest vertex, then fit merged vertex
- Include ID tracks that fail 2-track vertex fit with lepton track - aim to reconstruct charm decay vertex.

Muon inputs

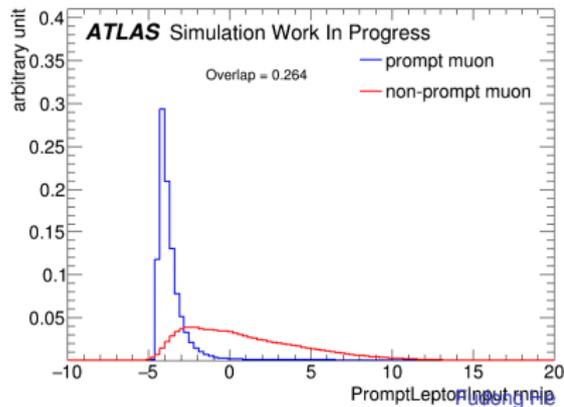
XPTBin



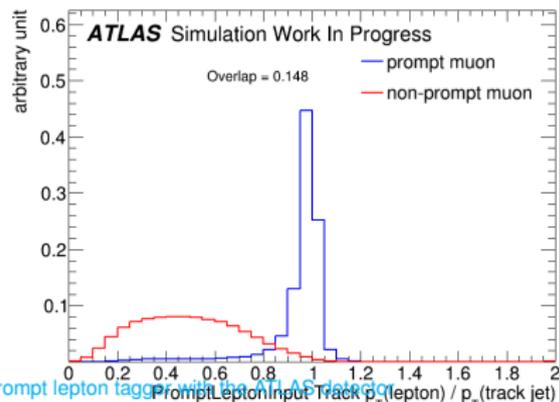
$\Delta R(\text{lepton, track jet})$



RNNIP

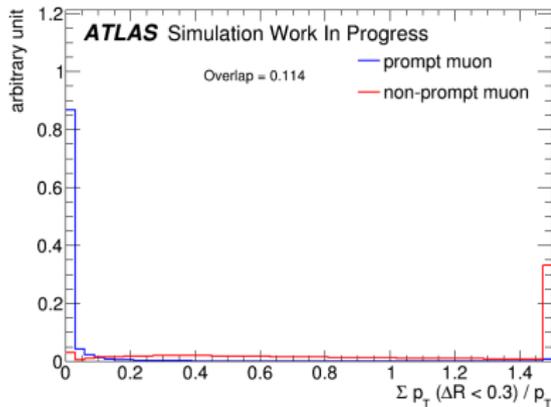


$p_T^{\text{lepton track}} / p_T^{\text{track jet}}$

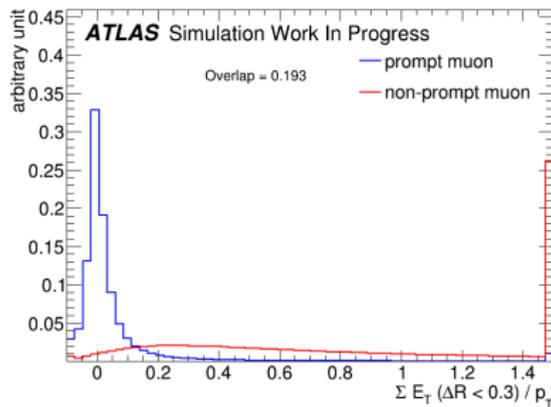


Muon inputs

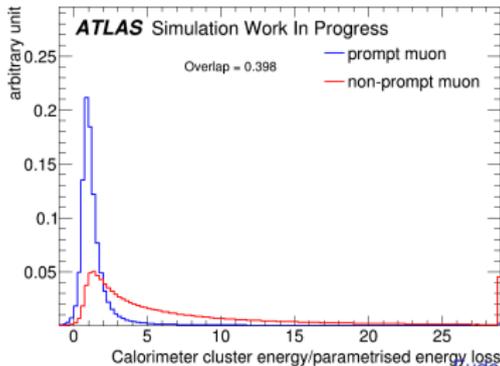
$p_T \text{VarCone30}/p_T$



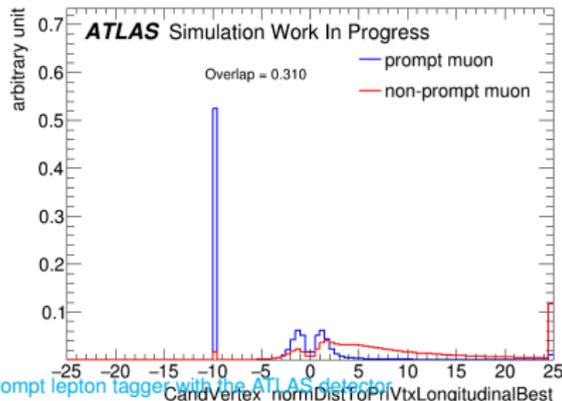
$E_T \text{TopoCone30}/p_T$



$E_{\text{cluster}}^{\mu} / E_{\text{expected}} - \text{muon}$



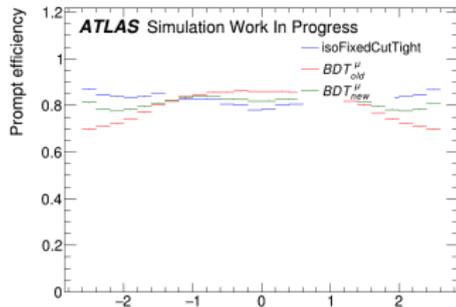
longitudinal SV to PV / σ



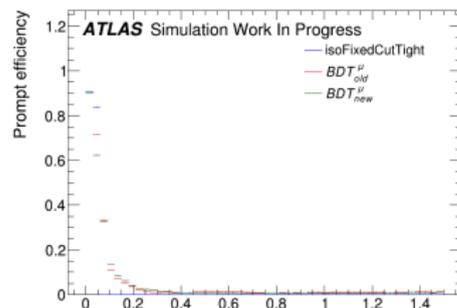
Muon efficiency

- Prompt muon efficiency at same overall efficiency of $p_T > 10$ GeV muons as the FixedCutTight

eff. η

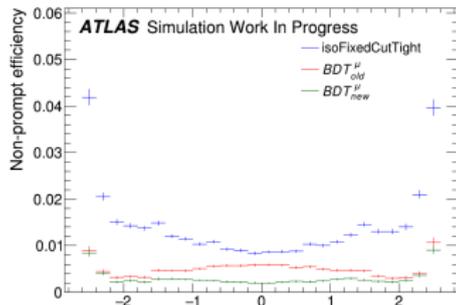


eff. $P_T \text{VarCone30}/p_T^{lepton}$



- ReduceWithPt_Iso outperforms ReduceWithPt in topoetcone30rel < 0.3 region.

eff. η



eff. $P_T \text{VarCone30}/p_T^{lepton}$

