

Department of Physics
University of Cincinnati

ND Searches for anomalous ν_τ appearance (Updates)

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Objectives

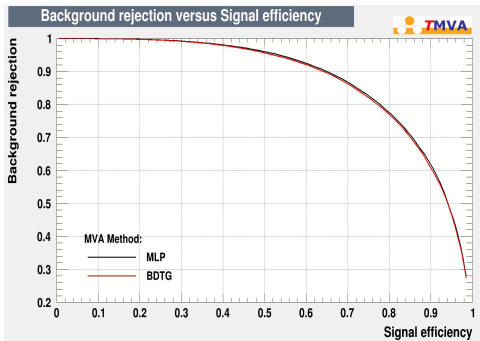
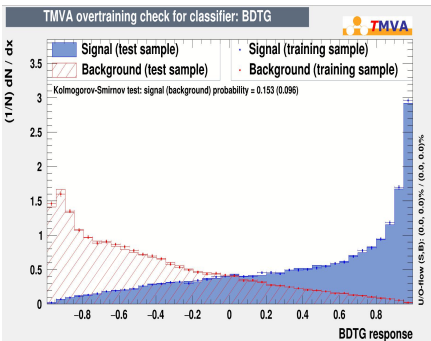
- ▶ **Main objective** : study of eventual tau neutrinos that we may have in the DUNE Near detector coming from short baseline oscillations in a sterile neutrino scheme.
Evaluate the ν_τ appearance sensitivity of DUNE ND in both leptonic and hadronic tau decay channels.
- ▶ **Event classification** : signal and background separation based on kinematic differences. (Kinematic variables similar to those used in NOMAD)
- ▶ **Simulation** : Events were simulated using GENIE and propagated through the Near Detector using EDEP-SIM.
- ▶ **Beam used** : Optimized beam for ν_τ appearance in the DUNE FD.

Electron channel



$\tau \rightarrow e^-$ channel

TMVA Classification based on TRUE GENIE kinematic variables



BDTG response (Trained on a flat energy flux)

$\tau \rightarrow e^-$ channel

- ▶ **Sensitivity** : based on event counting. All events were normalized such that they would correspond to **1.1e21 P.O.T. and 67t** fiducial mass.

- ▶
$$FOM = \frac{signal}{\sqrt{signal + background}}$$

(statistics only)

- ▶
$$FOM = \frac{s}{\sqrt{(s + b) + (0.1 \cdot (s + b))^2}}$$
 (with 10% systematics and select those with $FOM \geq 1.7$).

- ▶ **Event selection** : select events with ν_τ **BDTG score** > 0.995 (region with almost no background for a background sample of 4.5 million events).

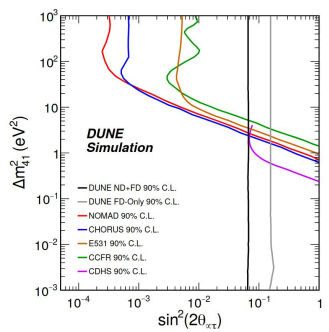


Figure : (For reference) Comparison of exclusion limits from various experiments - DUNE TDR, BSM Chapter

Electron channel

Sensitivity



$\tau \rightarrow e^-$ channel

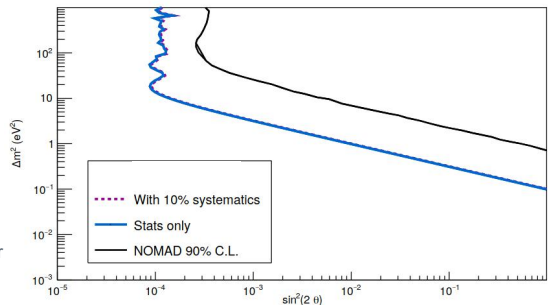
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► Event selection : select events with ν_τ BDTG score > 0.995 (region with almost no background for a background sample of 4.5 million events).

Sensitivity (1.1e+21 POT and 67t Fiducial mass)



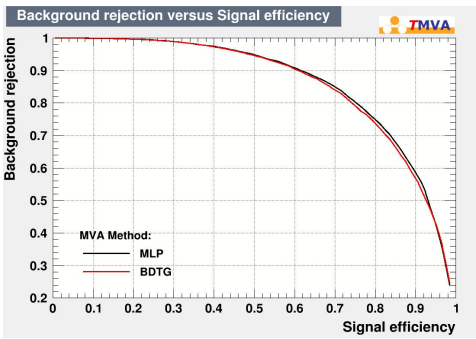
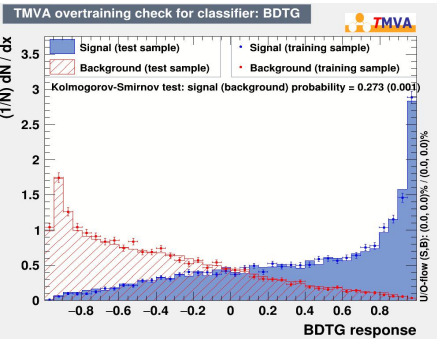
Muon channel

ν_τ CC ($\tau^- \rightarrow \mu^-$) and ν_μ CC separation



$\tau \rightarrow \mu^-$ channel

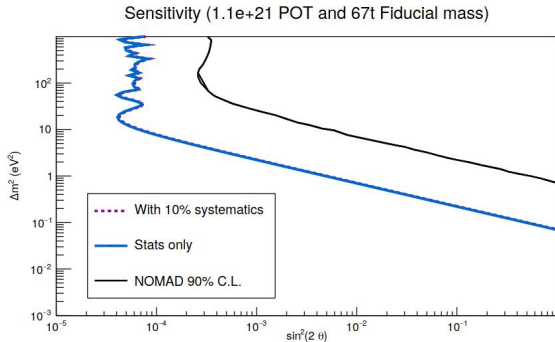
▶ TMVA Classification based on TRUE GENIE kinematic variables



BDTG response (Trained on a flat energy flux)

$\tau \rightarrow \mu^-$ channel

- ▶ **Event selection** : select events with ν_τ BDTG score > 0.995 (region with almost no backgrounds for a background sample of 4.5 million events).



$\tau \rightarrow \rho^-$ channel

- ▶ **Steps** : develop a ρ selector then develop a classifier that separates NC events from $\nu_\tau(\tau \rightarrow \rho^-)$.
- ▶ **ρ classification** : TMVA Classification based on kinematic informations.
 - **Signal (true ρ)** : - from ν_τ CC events : $\tau \rightarrow \rho^- + \nu_\tau$; $\rho^- \rightarrow \pi^- + \Pi^0$;
 $\Pi^0 \rightarrow 2\gamma$
- from NC events : $\rho^- \rightarrow \pi^- + \Pi^0$ (the ρ is recorded)
 - **Background (false ρ)** : any $\pi^\pm + \Pi^0$ couple that doesn't come from a true ρ^- from the hadronic system or τ decay.

Hadronic channel

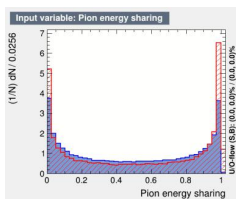
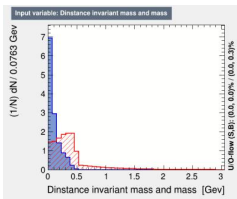
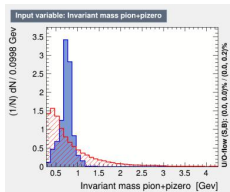
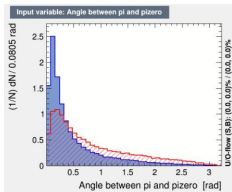
ρ selector



$\tau \rightarrow \rho^-$ channel

Kinematic variables including :

$$d = \sqrt{(M_{\pi^0}^{(inv)} - m_{\pi^0})^2 + (M_{\rho}^{(inv)} - m_{\rho})^2}$$



$$r_{\pi}^K = \frac{E_{\pi}^K}{E_{\pi}^K + E_{\pi^0}^K}$$

Inspired by Thomas Kosc's work on ν_{τ} analysis in the DUNE FD.

Hadronic channel

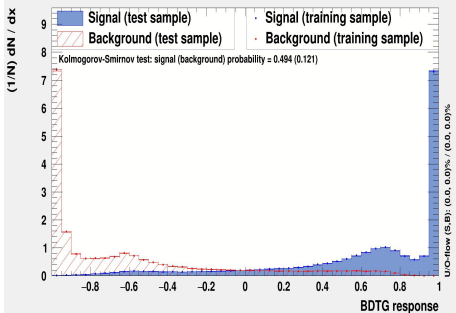
ρ selector



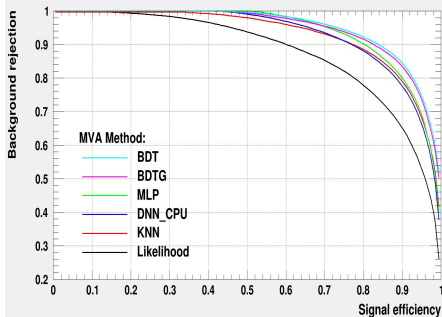
ρ candidate selector

BDTG response

TMVA overtraining check for classifier: BDTG



Background rejection versus Signal efficiency



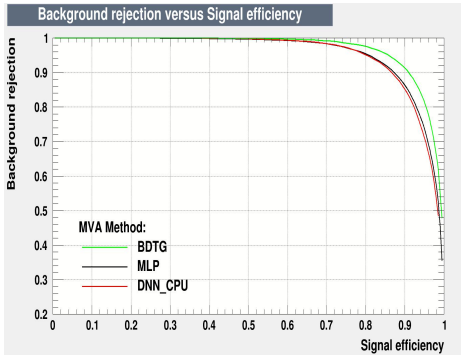
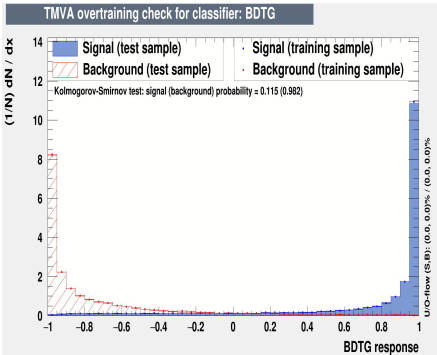
Hadronic channel

ν_τ CC ($\tau^- \rightarrow \rho^-$) and NC separation



ν_τ CC vs NC

▶ TMVA Classification based on TRUE GENIE kinematic variables



Sensitivity

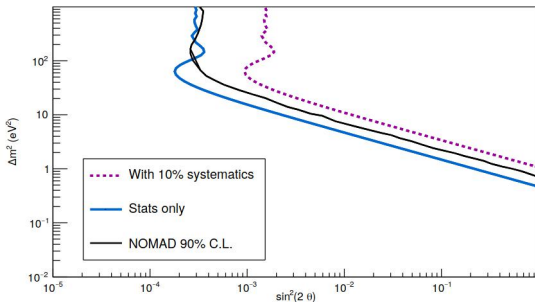
- ▶ **Step 1** : get all the events with potential ρ candidates for ν_τ CC events and NC events. (Anything that has $\pi^\pm + \pi^0$ or $\pi^\pm + 2\gamma$). Look at all possible ρ system combination.

1st cut : select those with ρ BDTG score > 0.99

- ▶ **Step 2** : pass through the ν_τ CC vs NC selector to get a ν_τ BDTG score.

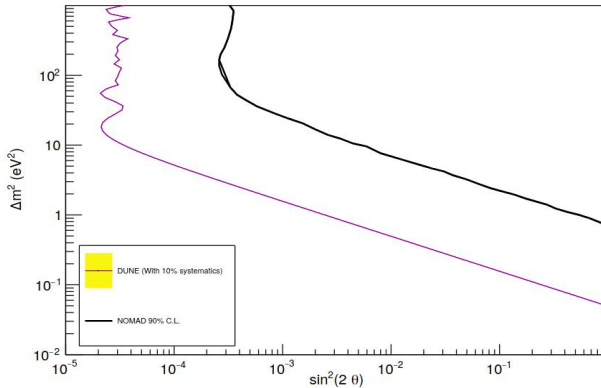
2nd cut : select those with ν_τ BDTG score > 0.99

Sensitivity (1.1e+21 POT and 67t Fiducial mass)



Combined sensitivity

Combined sensitivity (1.1e+21 POT and 67t Fiducial mass)



Constraints on NC Backgrounds for leptonic channels



- ▶ **Muon / Pion separation** : μ^- loses energy via Multiple Coulomb scattering
 π^- : Coulomb scattering + Hadronic scattering.
- ▶ **Separation** : each information at each point is recorded : scattering angle Θ - dedx, differentiation done using Recurrent Neural Network.

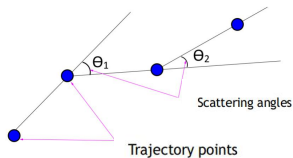
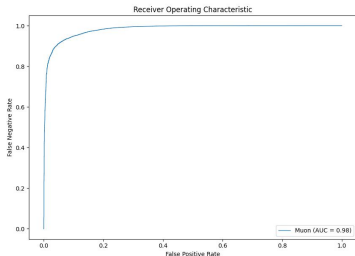
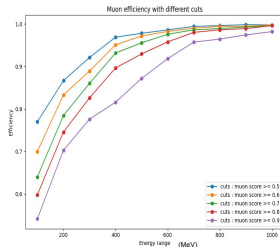


Figure : Scattering angles



- ▶ Area under curve : 0.98



- ▶ **Current work** : develop an electron/gamma shower classifier.

- ▶ Classification based on kinematic variables gives a reasonable output for tau leptonic and hadronic decay channels.

- ▶ Sensitivities : based on the true GENIE information studies, DUNE ND's sensitivity to eventual tau neutrino appearance from sterile oscillation is competitive compared to other experiments.

- ▶ **Next steps :**
 - Develop an electron/gamma shower classifier
 - Current study is using just the single bin FOM with event counting. Eventually do a proper multi-bin shape analysis
 - Integrate analysis with CAFAna framework being developed by M. Wallbank and evaluate the sensitivities with more realistic systematics

Thank you very much!

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Backup

ν_τ CC vs ν_e or ν_μ CC separation kinematic variables

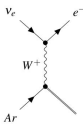


Figure : ν_e CC interaction

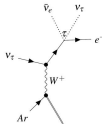


Figure : ν_τ CC ($\tau \rightarrow \mu^-$) interaction

- ▶ For ν_τ CC : resulting neutrinos from decay take away some momentum \rightarrow Kinematic differences.

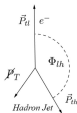


Figure : ν_e CC interaction products in the transverse plane

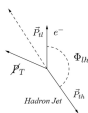
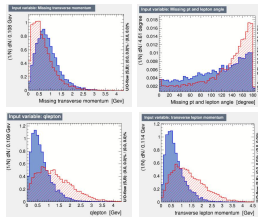


Figure : ν_τ CC ($\tau \rightarrow e^-$) interaction products in the transverse plane



- ▶ Larger missing transverse momentum, \vec{P}_T^{miss} for ν_τ CC.
- ▶ Can be applied to other τ decay channels.
- ▶ Separation : used ROOT TMVA in which a total of 9 kinematic variables were used (full list in backup slides).

Backup

Muon vs pion separation variables

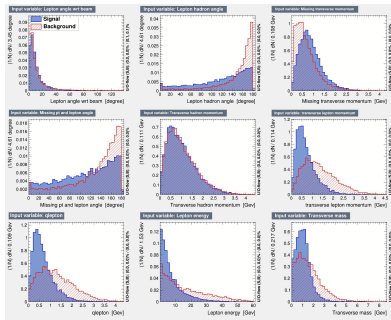


Figure : TMVA Input - CC kinematic variables from events with flat energy distribution (using **GENIE TRUE INFORMATION**)

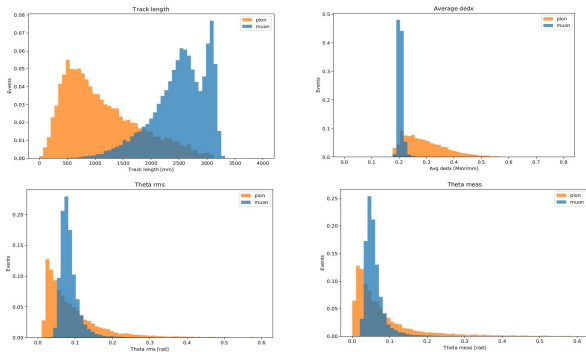
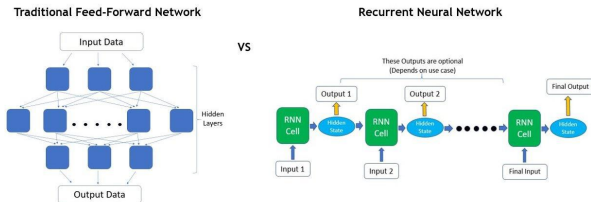


Figure : Sample Muon and Pion separating variables distributions at 700 MeV

- ▶ Recurrent Neural Network: deals with **sequential data**

Comparison Between:



- ▶ Difference : TNN : fixed amount of input data - fixed amount of output. RNN : do not take all inputs at once, take them one at a time in a sequence.
- ▶ Non-sequential variables: are handled with traditional neural nets. Those features combined with the features from the Recurrent Neural Network gives the feature for separating pion and muon.

Backup

ρ selection kinematic variables

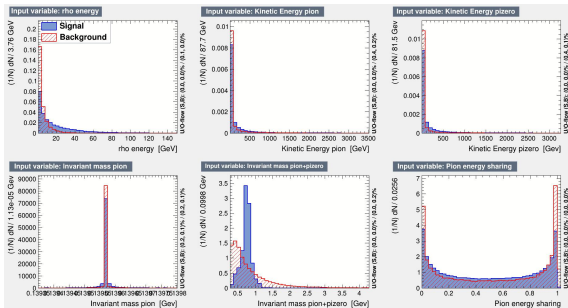


Figure : TMVA Input - rho selection variables

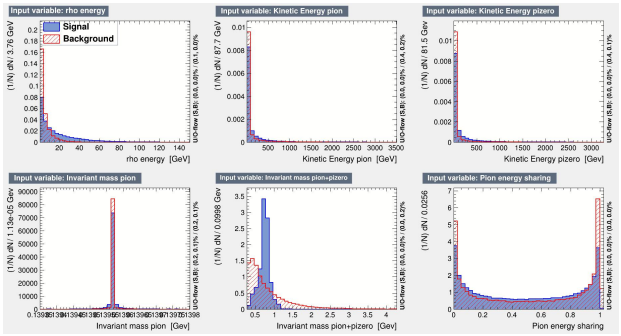


Figure : TMVA Input - rho selection variables

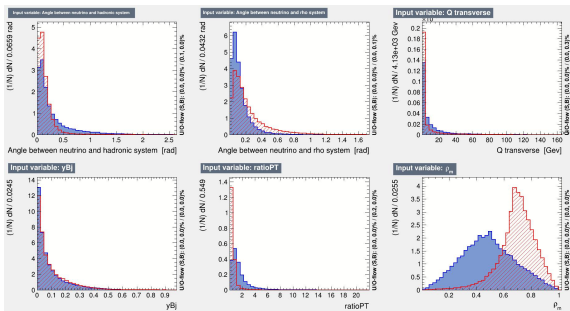


Figure : TMVA Input - NC / nutau CC selection variables (in addition rho selection vars and usual kinematic info)