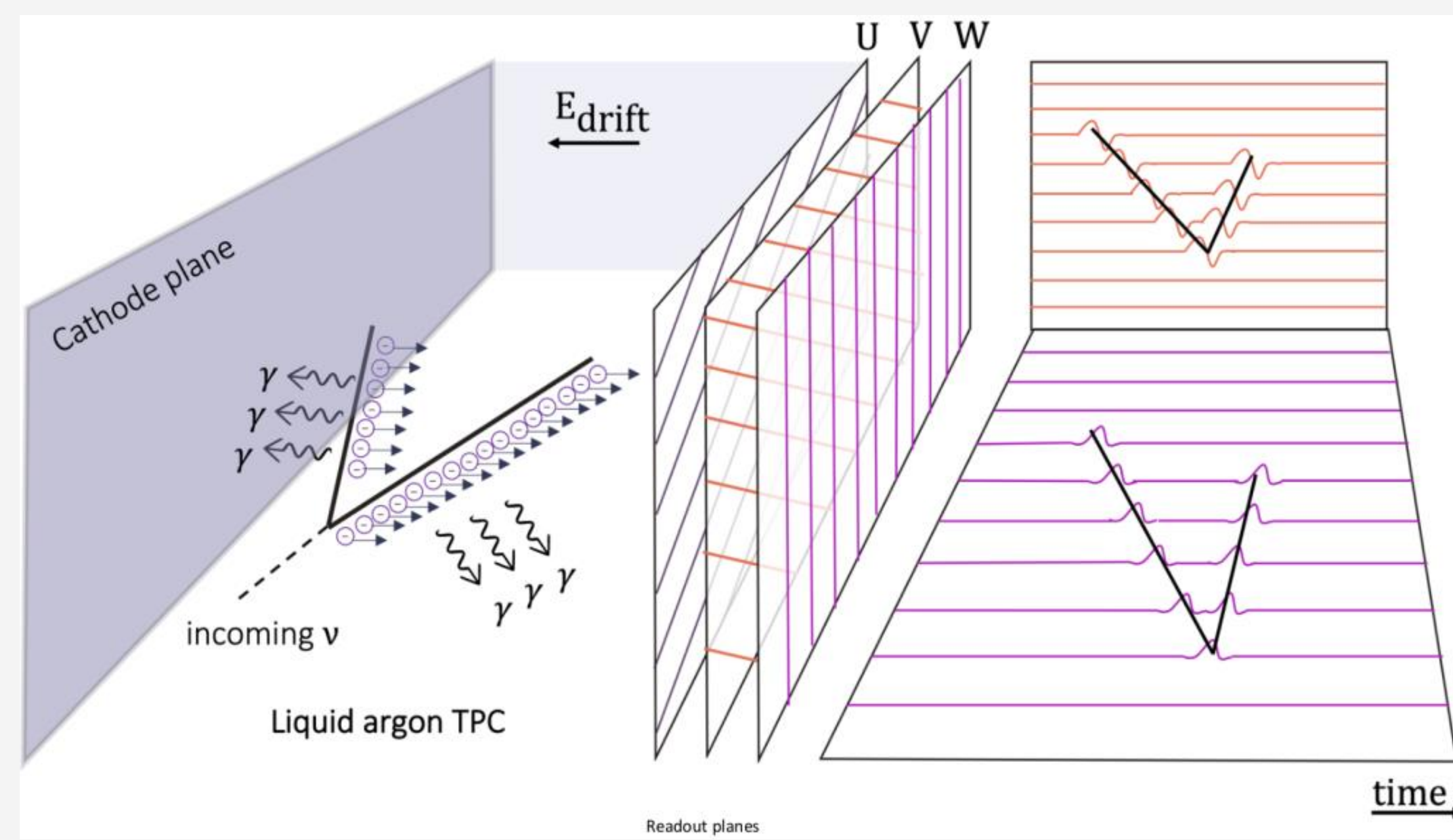


Abstract

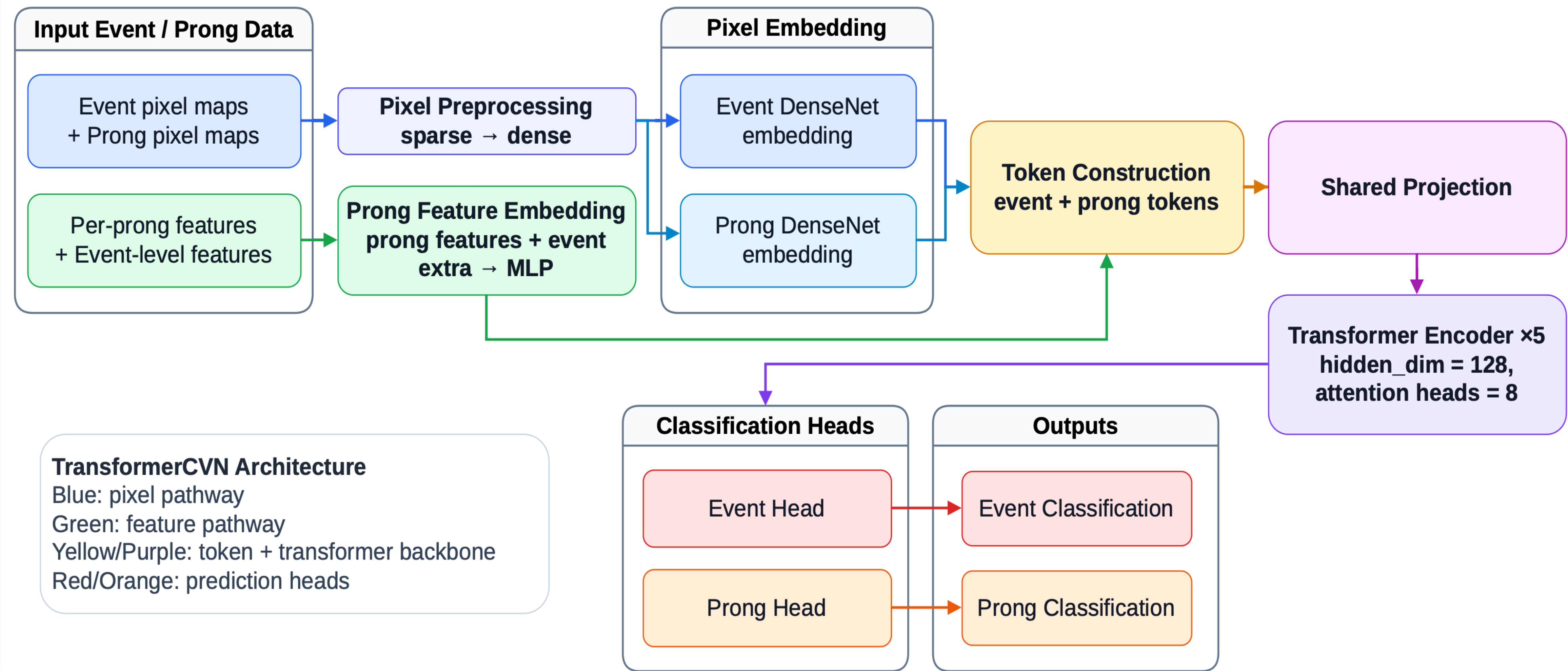
Neutron-antineutron ($n \rightarrow \bar{n}$) transitions[1] are a baryon number violating process with $\Delta B=2$. The Deep Underground Neutrino Experiment (DUNE) is sensitive to this process through its high-resolution liquid argon time projection chamber.

This work presents a new transformer-based machine learning approach for $n \rightarrow \bar{n}$ search.



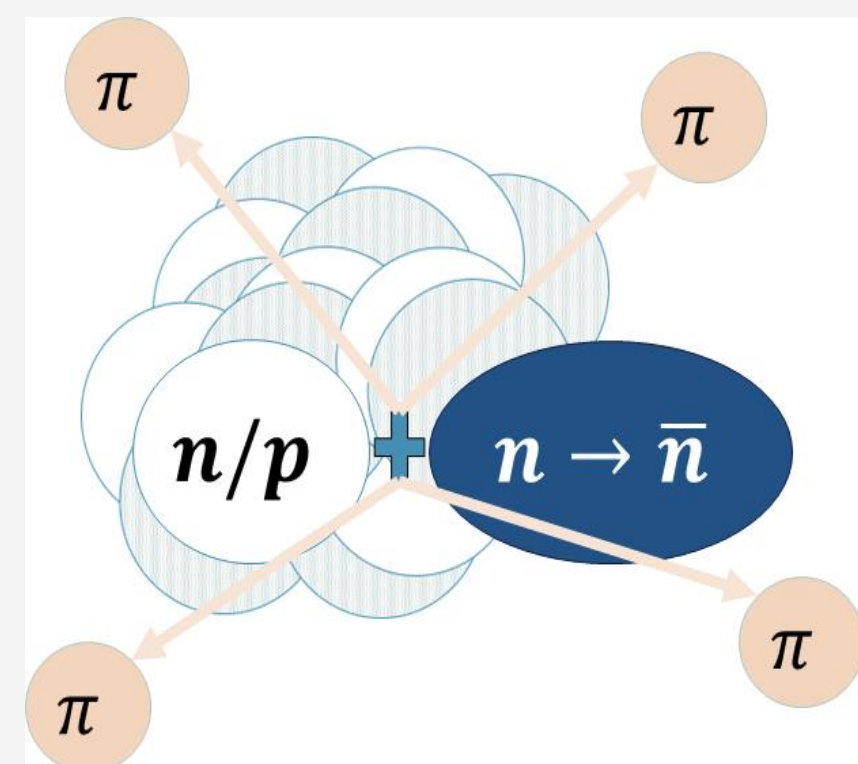
Model

We use a custom-designed Transformer-based neural network, specifically optimized for the complex sparse topologies of LArTPC events. The backbone of our model is inherited from DUNE TransformerCVN[2]. The pipeline is shown below.



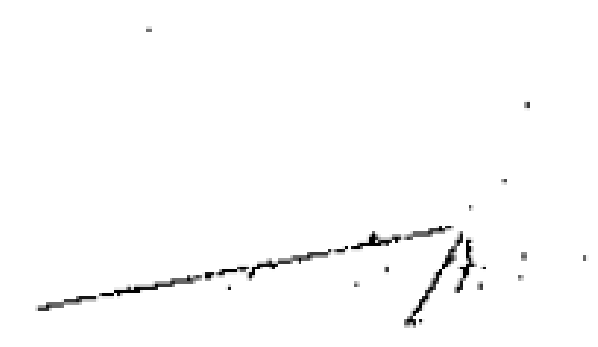
Neutron-antineutron Transition

- A neutron in Ar nucleus oscillates to an antineutron.
- The antineutron annihilates, producing multiple pions.



We want to preserve more $n \rightarrow \bar{n}$ events while maintaining the same background level.

Hadronic activity with prominent muon track



A simulated atmospheric neutrino (background)

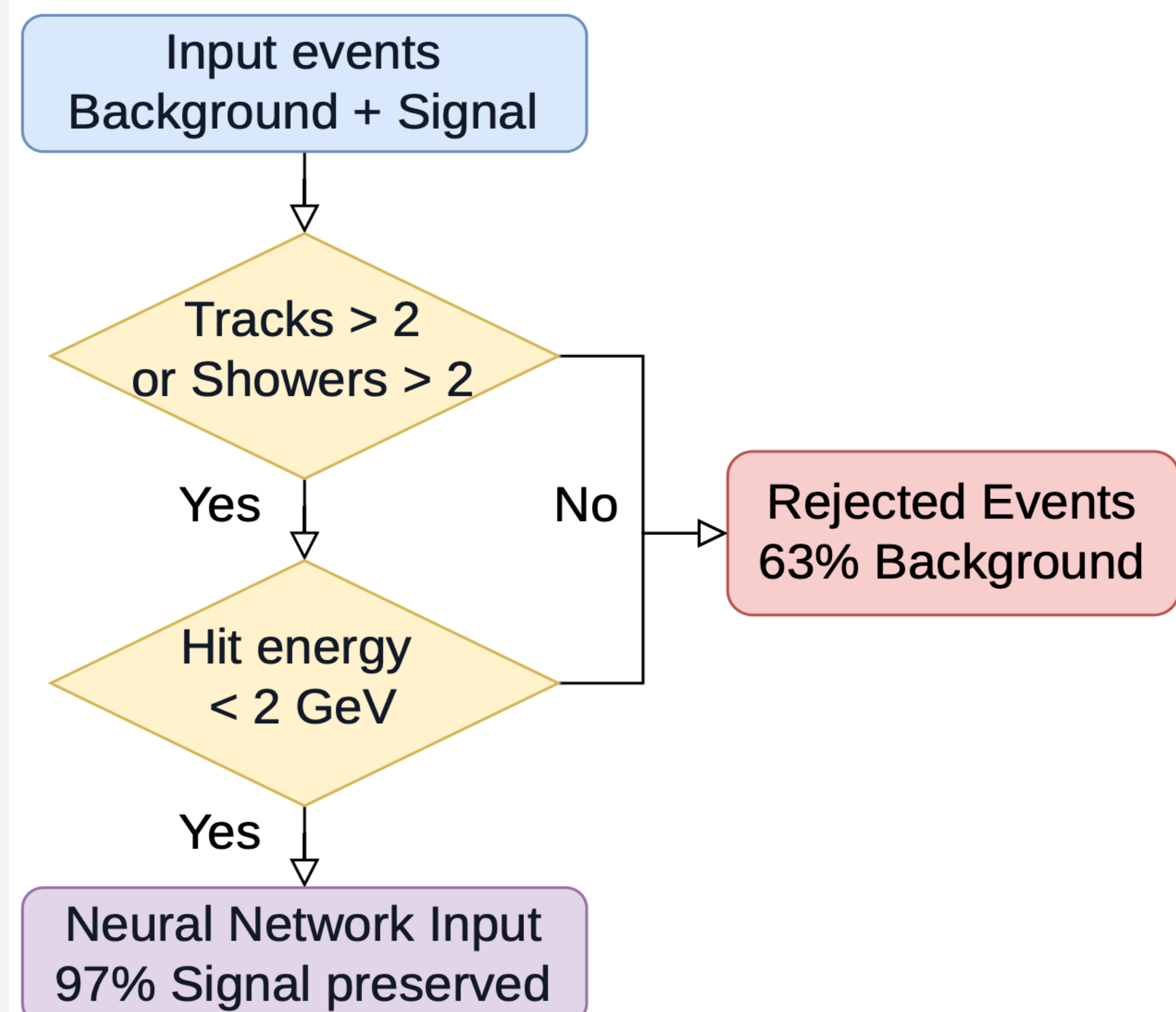
Isotropic hadronic activity



A simulated $n \rightarrow \bar{n}$ transition (signal)

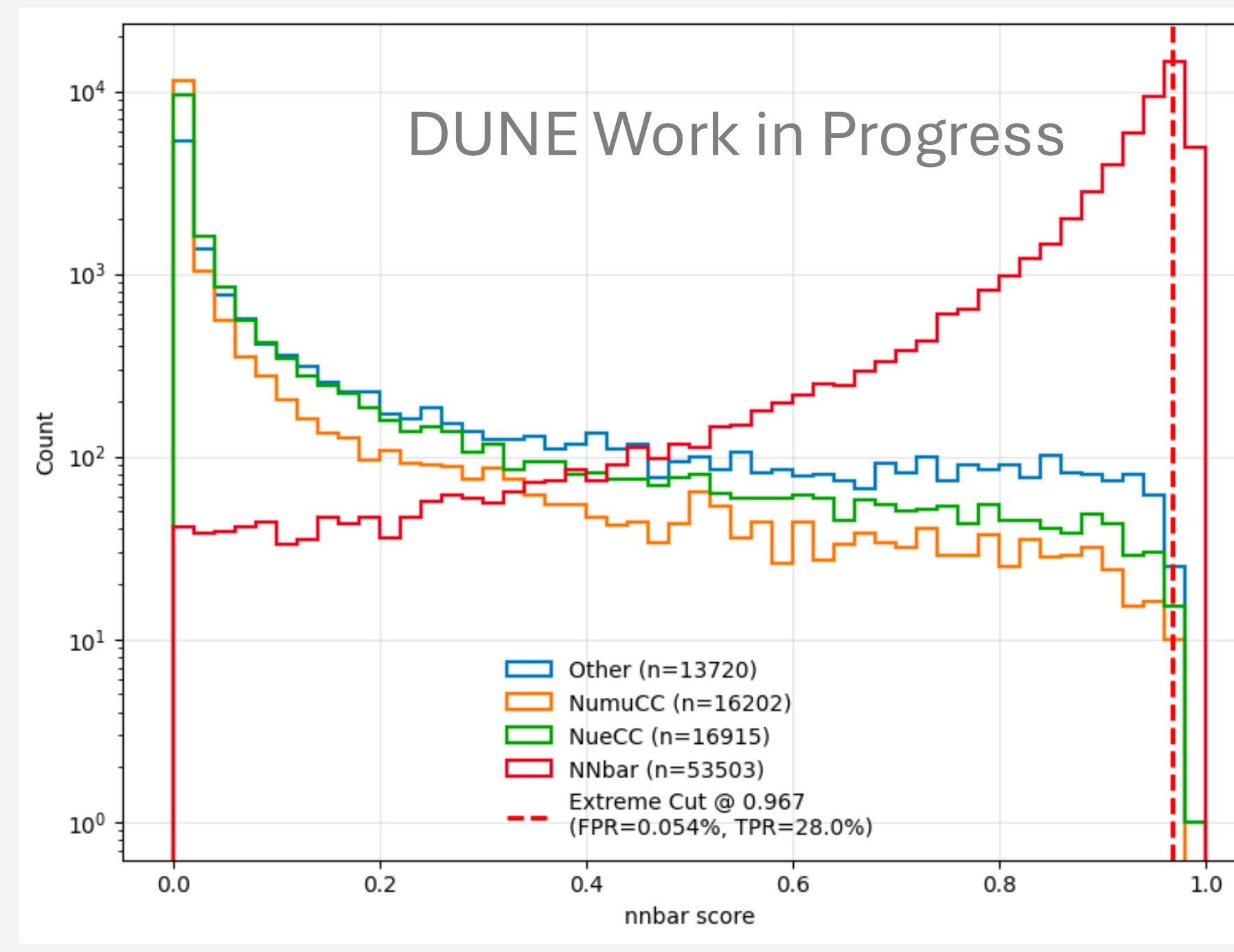
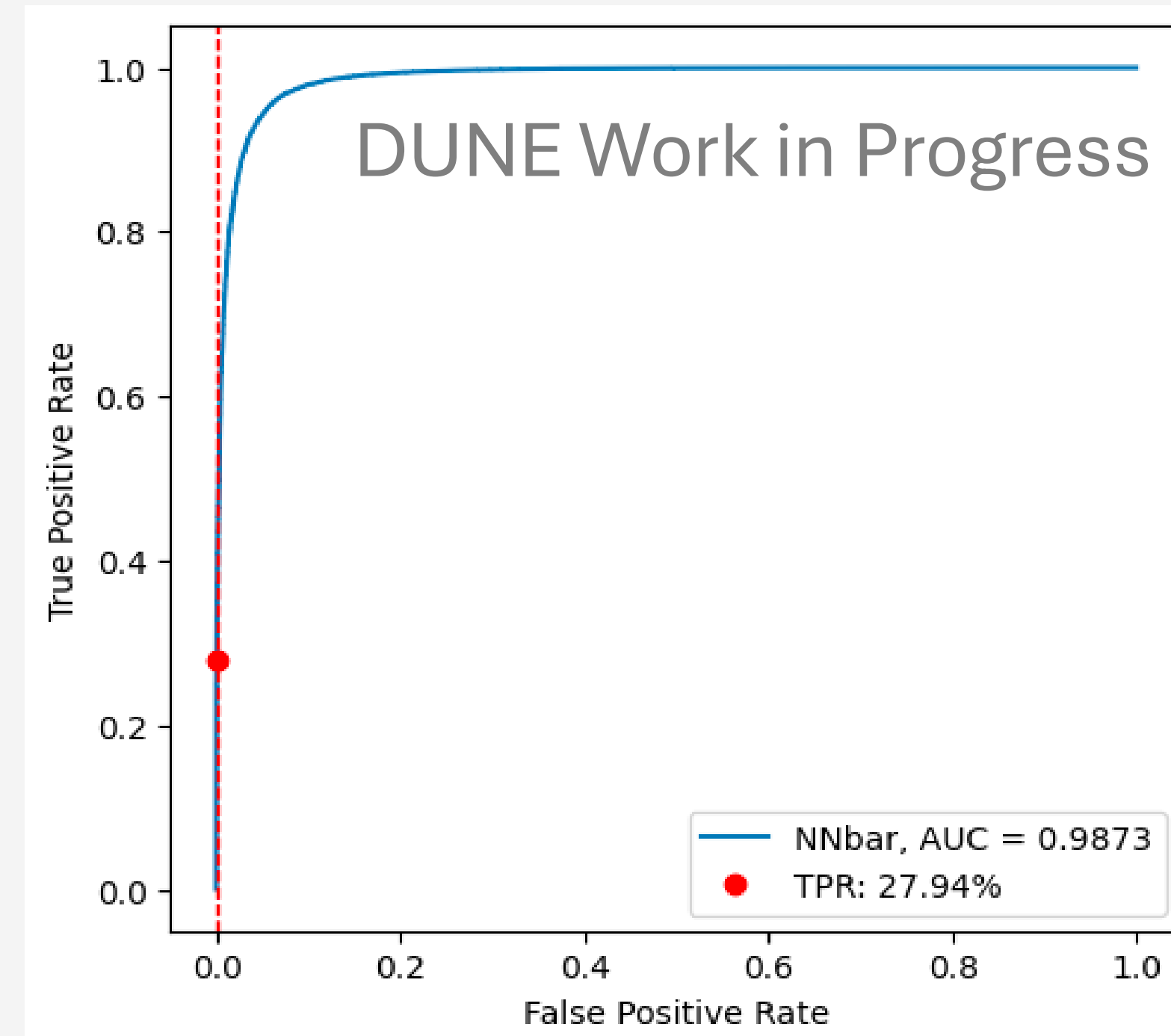
Data & Pre-processing

- We use Local Fermi Gas, Effective Spectral Function, and Bodek-Ritchie for nuclear modeling, and hA and hN for final state modeling, in the GENIE generator.
- 2 million events in total.
- 6 different $n \rightarrow \bar{n}$ model, 1 atmosphere neutrino (background) model.
- 2 cm pixel size and 7 m map size for computation efficiency.
- Dataset pre-cut shown below.



Performance

- By deploying our Transformer-based architecture and optimized kinematic precuts, we drastically boosted the $n \rightarrow \bar{n}$ true positive rate to 27.94%—achieving a 3x performance improvement over the DUNE TDR[3] baseline (8% signal efficiency).
- ROC curve is shown with chosen background efficiency.
- Event counts vs threshold is shown. At the red dotted line, signal efficiency is 27.98% ± 0.19%.
- We further evaluated its performance across six distinct datasets embodying various Final State Interaction (FSI) scenarios. Results shown in the table.
- We will do other systematic uncertainty evaluations and push towards a sensitivity result.



Model	Precut efficiency	CVN efficiency	Total efficiency
hA-LFG	97.13% ± 0.05%	28.94% ± 0.49%	28.11% ± 0.48%
hA-ESF	97.26% ± 0.05%	29.39% ± 0.44%	28.59% ± 0.43%
hA-BR	97.40% ± 0.05%	27.08% ± 0.44%	26.38% ± 0.43%
hN-LFG	97.75% ± 0.05%	27.21% ± 0.47%	26.60% ± 0.45%
hN-ESF	97.09% ± 0.06%	27.87% ± 0.53%	27.06% ± 0.52%
hN-BR	97.16% ± 0.06%	26.96% ± 0.48%	26.19% ± 0.47%

Acknowledgement

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References

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- [2] Shmakov, Alexander, et al. "Interpretable Joint Event-Particle Reconstruction for Neutrino Physics at NOvA with Sparse CNNs and Transformers." arXiv preprint arXiv:2303.06201 (2023).
- [3] Abi, Babak, et al. "Deep underground neutrino experiment (dune), far detector technical design report, volume ii: Dune physics." arXiv preprint arXiv:2002.03005 (2020).