A deep-learning based raw waveform region-of-interest finder for the liquid argon time projection chamber (LArTPC)

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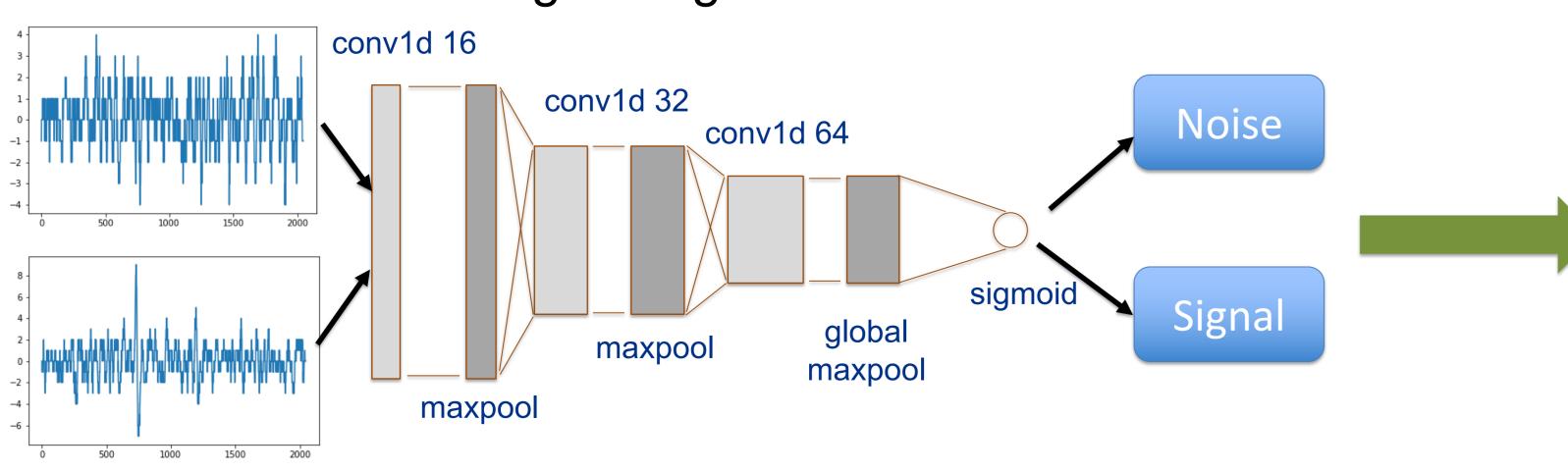
Introduction

- The LArTPC detector offers excellent spatial and energy resolution for the low energy physics.
- Extracting small signals from huge background becomes very challenging for low-energy phenomena.
- ArgoNeuT already shows the ability to reconstruct activity at the MeV scale in a LArTPC [1].
- An application of a 1D-CNN to the task of finding the region-of-interest (ROI) in LArTPC raw waveforms is considered and tested on the ArgoNeuT experiment.
- The 1D-CNN ROI finder shows promise in its ability to extract small signals and can be implemented in early stages of reconstruction as a very effective filter to remove noise. It offers great potential for low-energy physics, such as supernova, solar neutrino interactions, and some new physics scenarios [1-2].

[1] Phys. Rev. D 99 (1),012002 (2019), arXiv: 1810.06502 [2] Phys. Rev. Letters 124, 131801 (2020) arXiv: 1911.07996

1D - Conventional Neural Network (CNN)

- This effort began by adapting 1D-CNNs used for analyzing cellphone accelerometer data to the analysis of LArTPC waveforms.
- After a successful proof-of-concept demonstration, the initial model was replaced with a more optimal design that was faster, more compact, and more accurate.
- Its capability as a simple classifier of signal vs noise waveforms was further expanded to permit the localization of the signal region within the waveform.

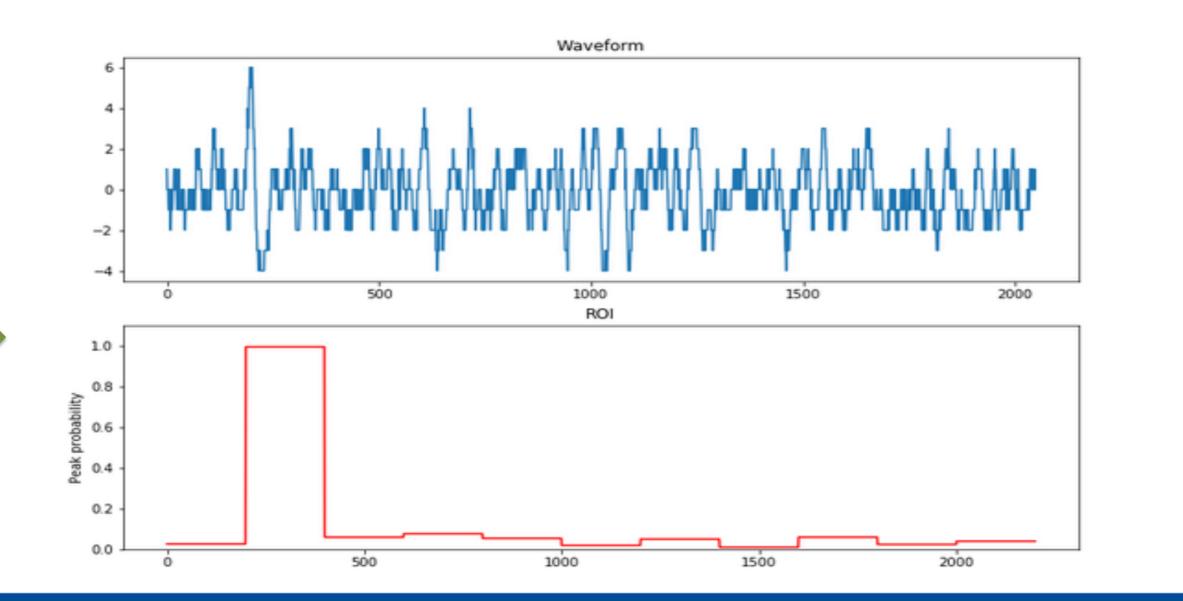


ArgoNeuT LArTPC

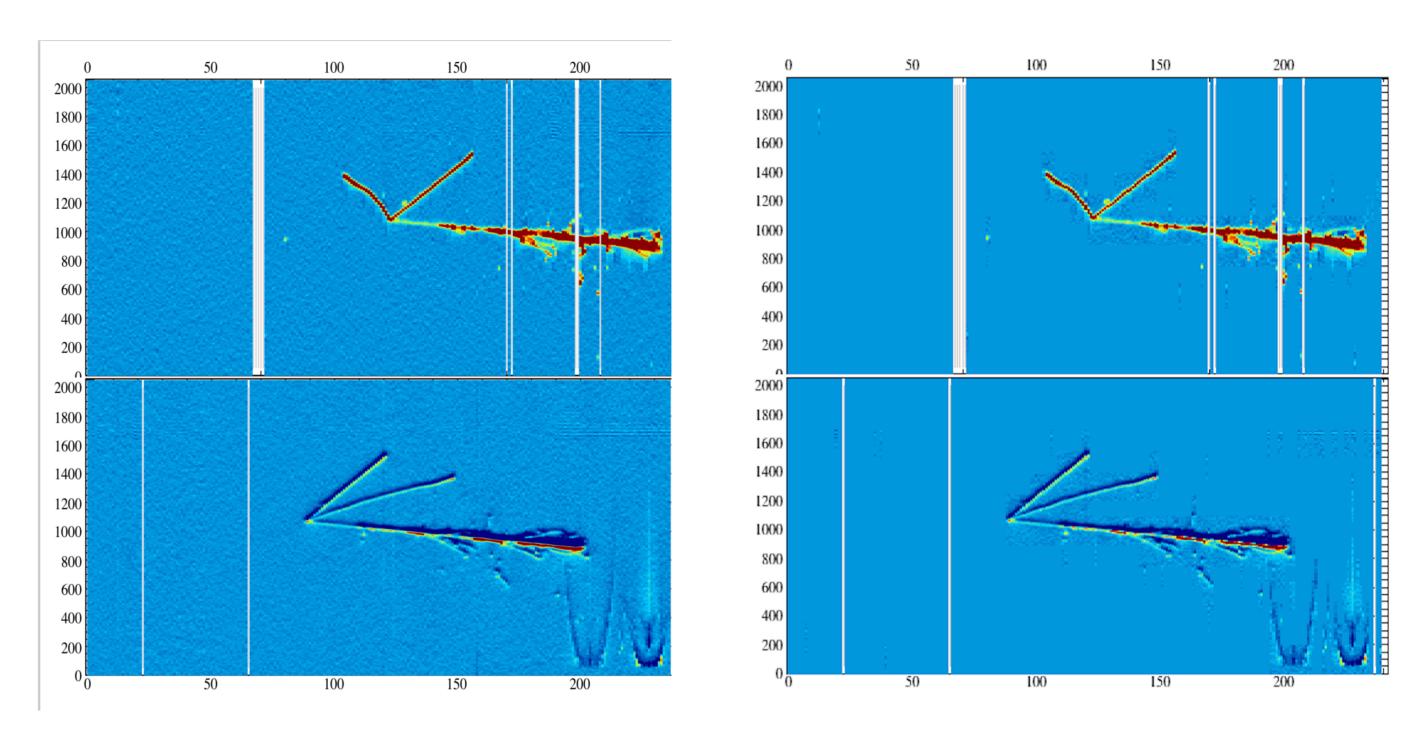
- Argon Neutrino Teststand detector located in front of MINOS near detector.
- 40×47×90 cm³ [vertical, drift, horizontal (beam)].
- 240 induction wires and collection wires; 2048 samples with 198 ns sampling time.
- Data taking in $\nu/\bar{\nu}$ mode in 2009-2010.

Data Driven Noise Model & Noise Removal

- Coherent noise removal was applied in order to study the data driven noise model.
- Perform an FFT on data noise noise frequency to find noise simulation.
- model that can be used in $_{5000 \times e^{\left[-\frac{1}{2}(\frac{x-p_1}{p_2})^2\right]} \times (\frac{p_3}{x+p_1}+1)+p_5+e^{-p_6(x-p_7)}}$
- Coherent noise removal is applied according to wire noise correlation.
- Adaptive baseline subtraction is used to remove noise from electronics and cable readout responses.

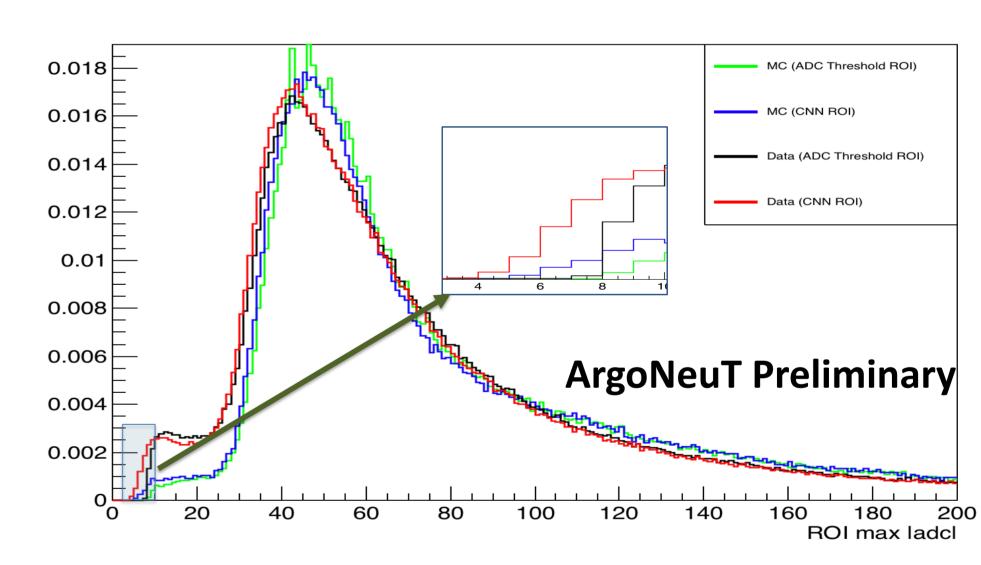


1D-CNN ROI Finder



• Event displays for ArgoNeuT run 806, subrun 1, event 19509: left after noise removal and right from 1D-CNN ROI.

Performance on Data and MC



- Traditional over threshold ROI finder is considered in order to check the performance of 1D-CNN ROI finder.
- 1D-CNN ROI finder shows comparable results and demonstrates better sensitivity for small signals.

Conclusions

- Encouraging results in the application of a 1D-CNN to the task of finding ROI in raw LArTPC waveforms using ArgoNeuT data are shown.
- The 1D-CNN shows a promising ability to extract small signals and offers great potential for low-energy neutrino physics.