

# Neural Network Analysis of Germanium Detector Waveforms



THE UNIVERSITY of NORTH CAROLINA at CHAPEL HILL

# The LEGEND Experiment







- Neutrinoless Double-Beta Decay:  $2n \rightarrow 2p + 2e^{-}(0\nu\beta\beta)$
- Possible if the neutrino is its own antiparticle
- Direct observation of lepton number violation; could explain matter-antimatter asymmetry
- LEGEND: next generation  $0\nu\beta\beta$  detector<sup>1</sup>
  - Uses High Purity Germanium (HPGe) detectors for high energy resolution; Ge-76 acts as  $0\nu\beta\beta$  source
  - Identifying backgrounds during initial 200-kg phase key to creating background model for 1000-kg phase

## **Compton Cameras**



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- Compton scattering: elastic collision between photon + charged particle  $\rightarrow$  scattering angle related to magnitude of energy loss<sup>2</sup>
- Compton camera technique measures scattered photons to determine location of gamma source
- My Project: train neural network to reconstruct source position from waveforms to improve potential HPGe detector Compton camera setups for LEGEND

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# Neural Networks

- Recurrent neural networks: specialized for time series data such as waveforms<sup>3</sup>
- Information retained from sequential inputs
- Network implemented using Pytorch library in Python
- Adapted from Aobo Li's NetworkPSA model
- Recurrent layer feeds into fully connected network
- Classifies each waveform into vertical and azimuthal position classes

## **Data Collection**





- Co-60 source; two gamma peaks at 1172 & 1330 keV used for study
- Source holder was designed to aim source at detector from different angles
- Detector cooled w/ liquid nitrogen, biased to +4000 V
- Data collected at 3 vertical positions, 8 azimuthal positions

#### References

1. LEGEND Collaboration, N. Abgrall, I. Abt, M. Agostini, A. Alexander, C. Andreoiu, G. R. Araujo, F. T. Avignone, W. Bae, A. Bakalyarov, et al., Legend-1000 preconceptual design report, 2021. 2. G. F. Knoll, Radiation detection and measurement, 3rd (John Wiley & Sons, Inc., 2000) 3. I. Goodfellow, Y. Bengio, and A. Courville, *Deep learning*, http://www.deeplearningbook.org (MIT) Press, 2016). Additional Image Credits: Aobo Li

Ravi Pitelka on behalf of the LEGEND Collaboration



Diagrams of Recurrent Neural Network (top) and Fully Connected Network (bottom)



Diagram of a Germanium Detector



- azimuthal classes was found
- worse for middle (z1) position



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• 70% average classification accuracy for vertical position classes indicates significant separation power Best at classifying top (z0) and bottom (z2) positions,

Network had preference for two azimuthal classes; may indicate that detector was off-center in cryostat

• Explanation of azimuthal classification anomaly • Simulations of gamma interactions with the detector could inform interpretation of result LEGEND-200 background identification • Test network performance on low energy events • Investigate backgrounds, with Compton camera technique, including liquid Ar scatter information

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