

Application of the RNN in the fundamental physics with KamLAND experiment

Shingo Hayashida

Tohoku University, Japan

The development of the machine learning in recent years has begun to profit the elemental physics research. In the neutrino detector KamLAND getting to unravel the mysteries of the universe, discriminating gamma-ray that inhibits the signal has been ultimate task. This research made it possible by using recurrent neural networks (RNN).

Neutrinos are a kind of elementary particles, and their masses are hardly understood except that they are extremely light. As one of the mysteries of neutrinos, there is the possibility that the particle and anti-particle are the same property (Majorana). It is possible for only neutrinos to have this property, which is a clue to unravel the mass of neutrinos and mystery of matter dominant universe. Majorana property is verified by detecting characteristic energy peak of the neutrinoless double beta decay ($0\nu\beta\beta$) of nuclei. A experiment to realize this is KamLAND-Zen in Japan. KamLAND-Zen measures radiation energy by detecting liquid scintillation light with optical sensors.

Although $0\nu\beta\beta$ decay has not been found yet in KamLAND-Zen, it has the lower limit of $0\nu\beta\beta$ half-life (1.07×10^{26} yr, 90% C.L.), which represents the difficulty of $0\nu\beta\beta$ decay. In the measurement, the $10C$ decay background event has the same energy as $0\nu\beta\beta$, which hinders the observation. The identification of $10C$ decay is important to discovery $0\nu\beta\beta$ signal.

Methods and Materials : For $0\nu\beta\beta$ decay, $10C$ decay includes γ -rays which has a spread in time, and it is reflected in the scintillation waveform. In addition to this, $\sim 50\%$ of $10C$ decay have ortho-positronium (oPs) which half-life is ~ 2.9 ns in LS. In this research, $10C$ decay is identified by discriminating the scintillation waveform difference using "Recurrent Neural Networks (RNN)". * $\sim 50\%$ of $10C$ decay have para-positronium (pPs) which half-life is short.

Results: The conditions of $10C$ identification is decided from classifier output distributions. It shows that each event type has a different distribution. If $\beta\beta$ inefficiency $\sim 20\%$ is allowed, $10C$ decay events are able to be rejected with $\sim 55\%$ efficiency. In this evaluation, MC samples are used. Since Efficiency/Inefficiency are

evaluated by MC, support by Data is necessary. $60Co$ source calibration Data (γ -ray) is useful for evaluation. In comparison of MC and Data, distribution of classifier output and rejection efficiency are in good consistency. Efficiency/Inefficiency calculated by MC have enough confidence.

The neutrino detector "KamLAND" aims to unravel the mysteries of the universe. Reduction of $10C$ decay background is indispensable for verifying the Majorana property of neutrinos. To identify $10C$ decay events, discriminating the scintillation waveform difference by using RNN. In this research, 2-layers stacked LSTM was developed. And then it is able to reject $\sim 55\%$ of $10C$ decay events with $\beta\beta$ inefficiency $\sim 20\%$ is allowed. From the evaluation by using $60Co$ source calibration data, this efficiency/inefficiency have enough confidence. This research realizes the improvement of the sensitivity to discover $0\nu\beta\beta$ signals.

RNN processes the time valuation of data. It is thought that RNN which developed in this research classified the event type based on the spread of scintillation waveform. As its basis, $10C$ -oPs with larger scintillation spread are lower in $\beta\beta$ classification output than $10C$ -pPs in.