

Cosmic Rejection based on Neural Network

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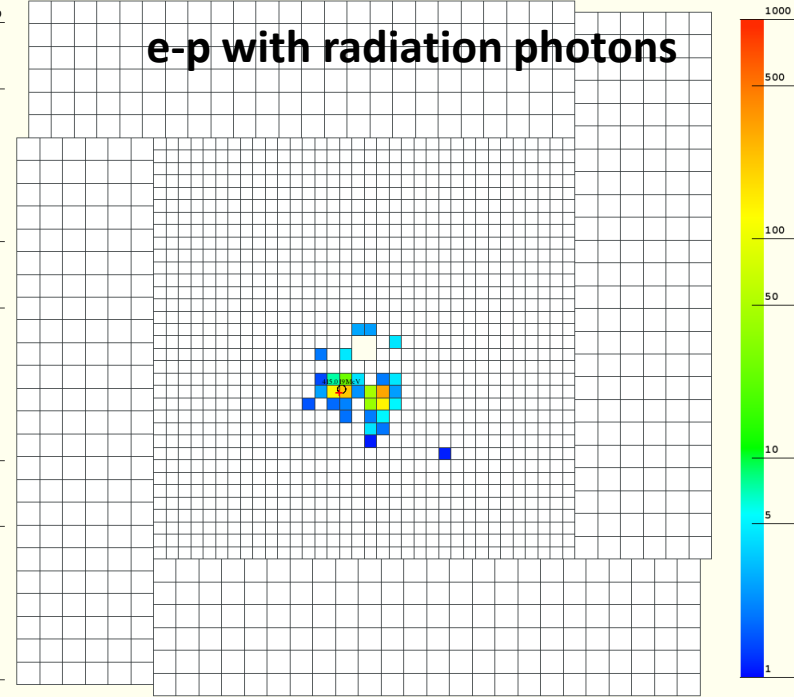
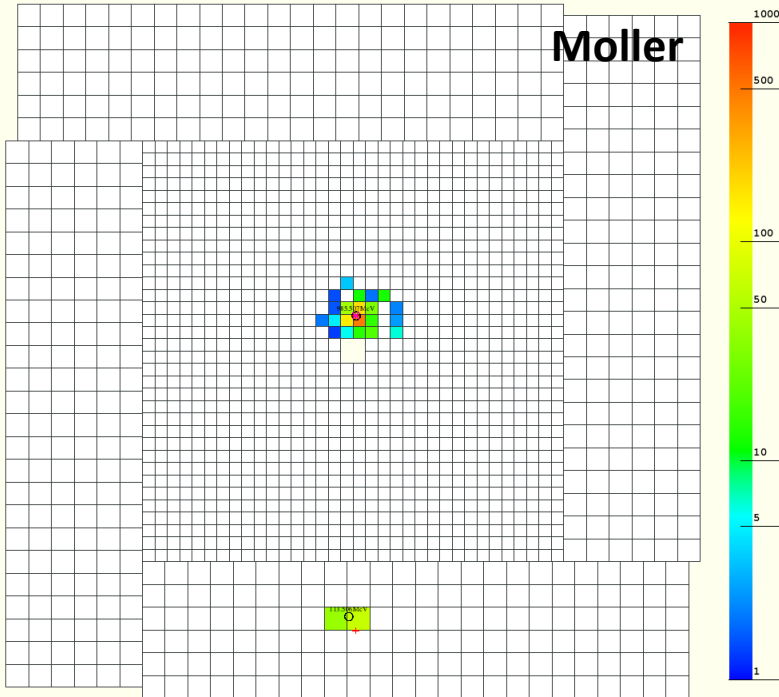
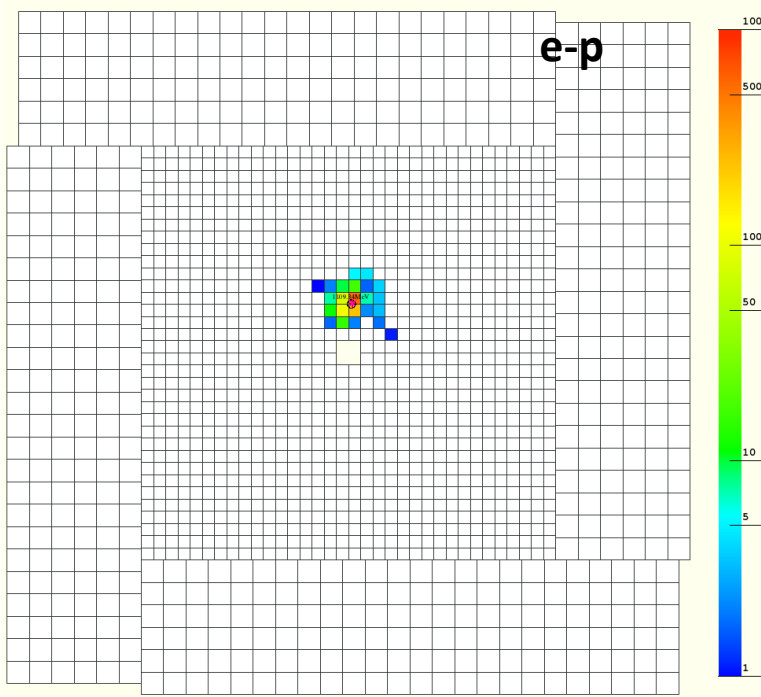
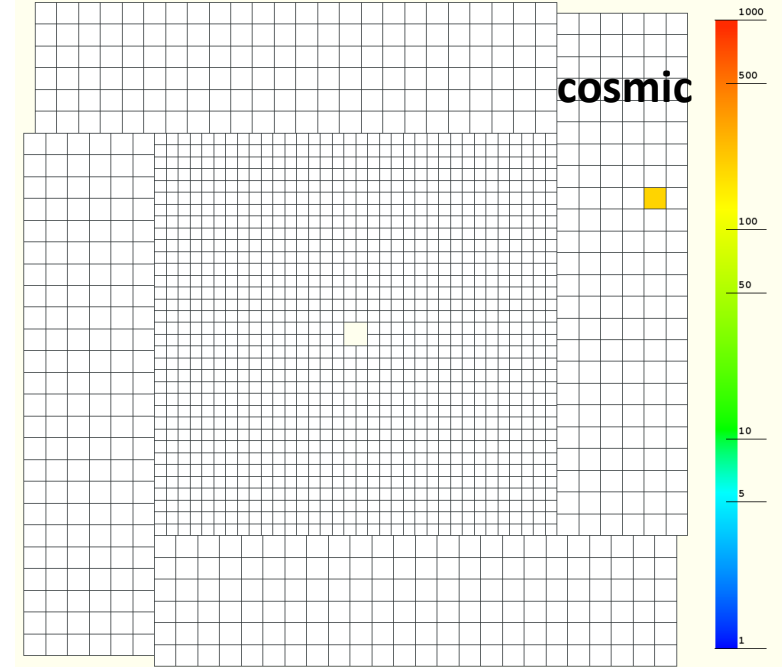
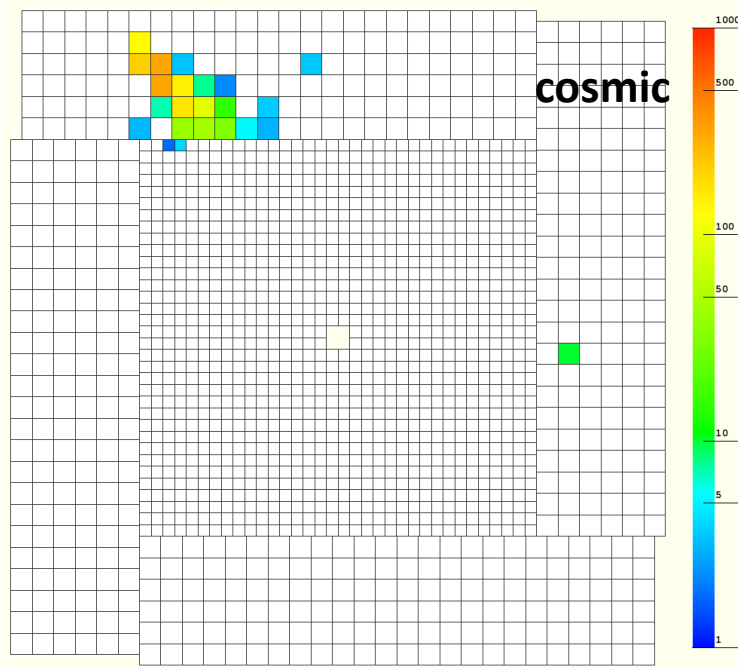
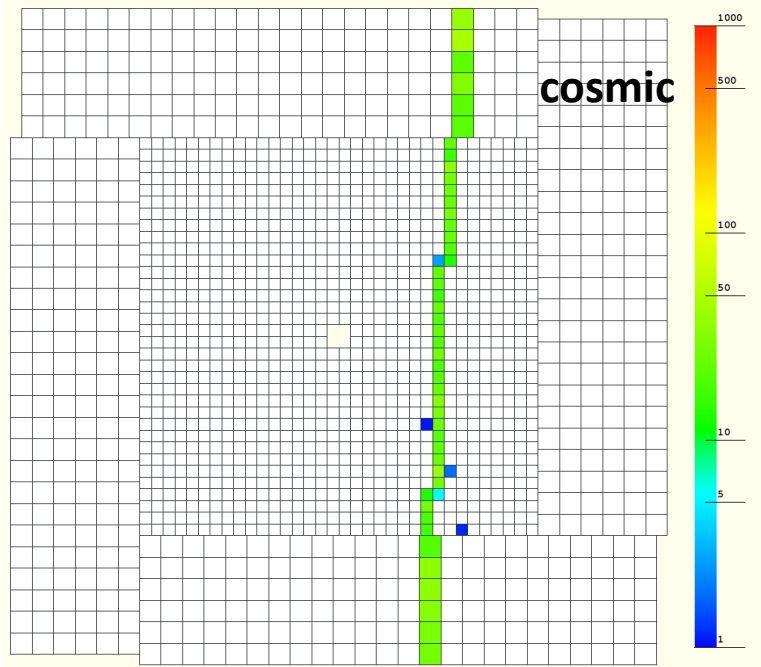
01/31/2017

Outline

- Cosmic Rejection in PRad
- Neural Network
 - Structure
 - Training
- Preliminary Result
- Future Plan

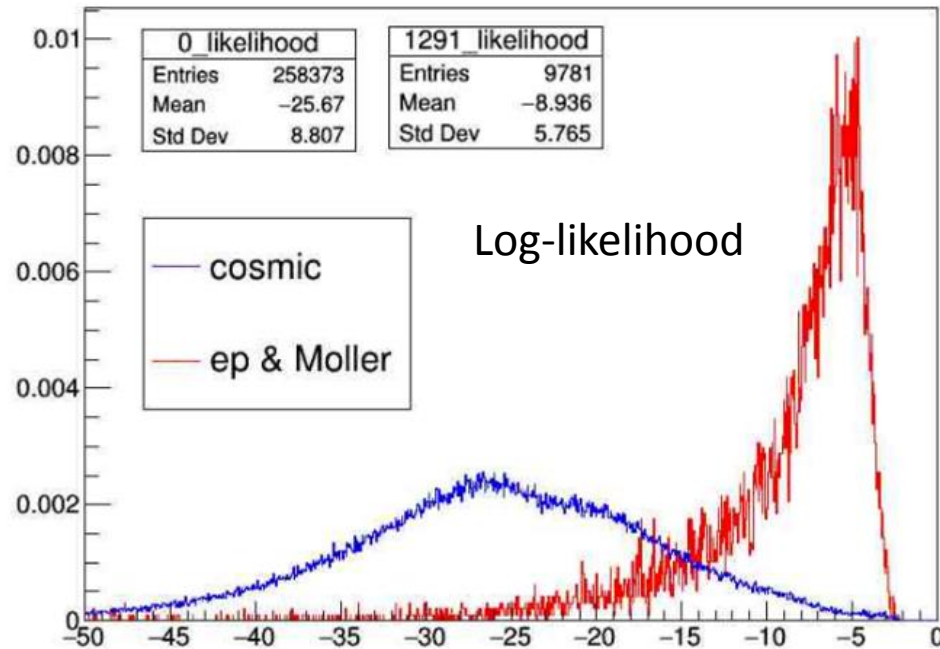
Cosmic Rejection in PRad

- For GEM efficiency study, we need a good cosmic rejection
 - Aim at $< 0.2\%$ uncertainty for the efficiency
 - Cosmic may be falsely identified as an event missed by GEM
 - Cosmic events ratio is about $2\% \sim 5\%$ at 1.1 GeV
 - **Effective:** $> 90\%$ cut on cosmic, so the efficiency is less affected.
 - **Safe:** rejection of ep/Moller $< 0.05\%$ without GEM matching



Cosmic Rejection in PRad

- Previously studied by Yuqi, very good progress made
 - Cut on log-likelihood of HyCal cluster profile
 - Cosmic rejection: 56% ~ 58%, ep/Moller rejection: 1% ~ 3%
 - Single dimension cut is not enough for such a task



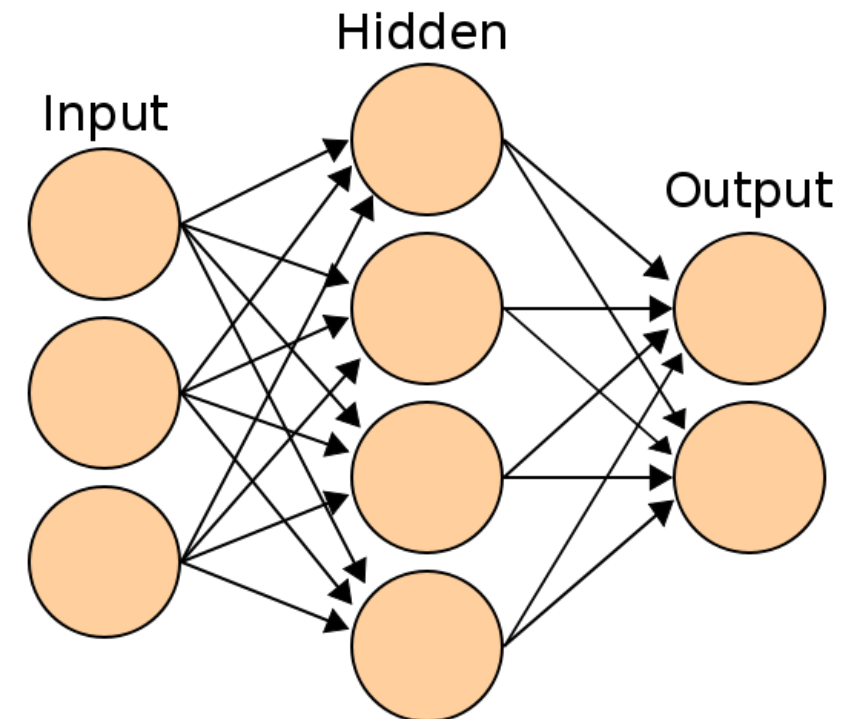
Neural Network

- A general structure for machine learning, analogy of brain
- Excel at classification and multi-dimension cuts

- **Basic Structure**

- Neurons are connected layer by layer
- Feedforward signal, generated by the weighted sum of inputs from all connected neurons

$$y = f\left(\sum_{i=0}^K w_i x_i\right) = f(\mathbf{w}^T \mathbf{x})$$



By en>User:Cburnett - Own workThis vector image was created with Inkscape., CC BY-SA 3.0, <https://commons.wikimedia.org/w/index.php?curid=1496812>

Neural Network Training

- Supervised training and back propagation algorithm
 - Provide training data sets with expected output
 - Define the error function that to be minimized
 - Back propagate the errors to all neurons, update the weights via stochastic gradient descent

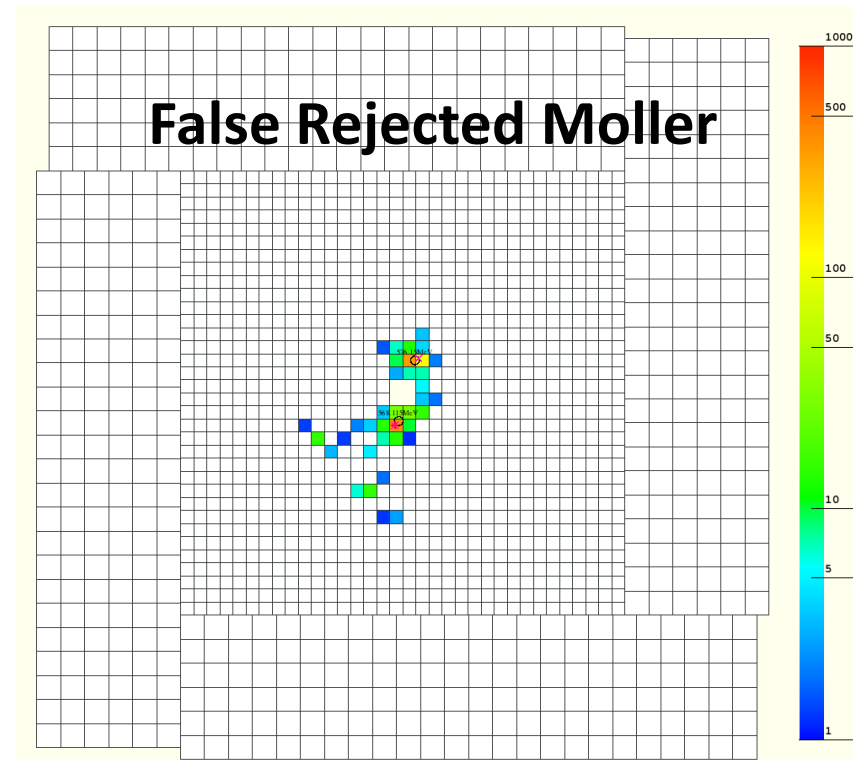
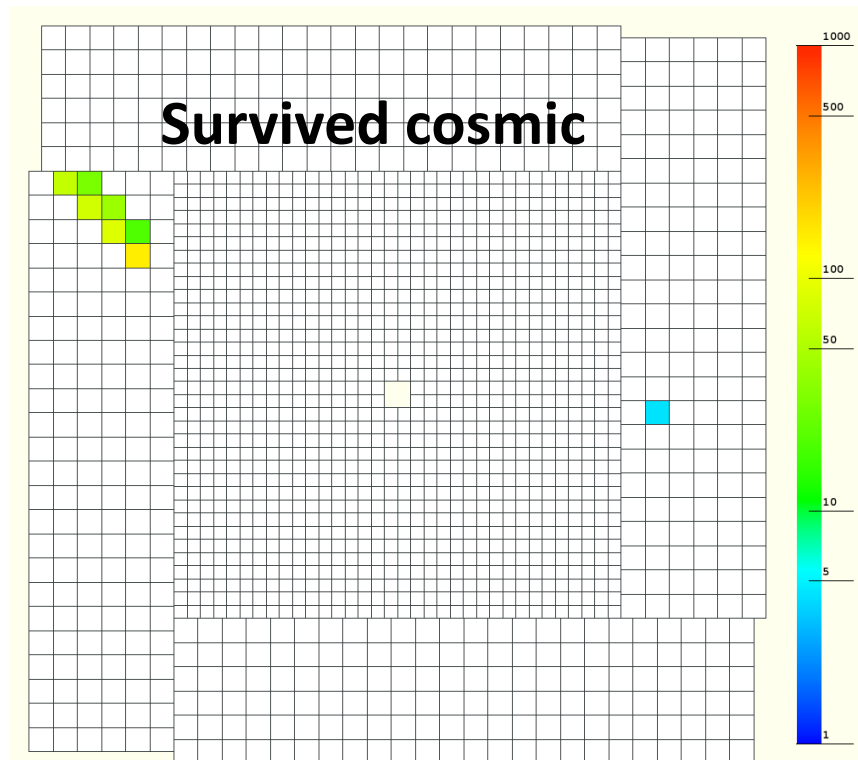
$$w_{ij,new} = w_{ij} - \eta \frac{\partial E}{\partial w_{ij}}$$

Preliminary Result

- Simple network, total 60 neurons, less than 800 connections between them
- 6 inputs per event to the network
 - hits number
 - maximum hit energy
 - Size and energy uniformity of the largest cluster
 - R-square/Chi-square of the linear fitting for the largest cluster
- Trained with two data sets
 - Cosmic data, taken during the experiment without beam
 - Good data, using production data with requirement of GEM matching

Preliminary Result

- Reject **88.96%** of the events from cosmic data.
- Reject **$\sim 0.7\%$** of the ep/Moller events



Future Plan

- Summary
 - Neural network is excel at classification, it shows a very promising result on cosmic rejection
 - We could continue refine the method to have a effective and safe rejection on cosmic, and thus better systematics in determining GEM efficiency
- To do
 - Add more information about the event (more inputs to the network)
 - Partitioned data for classification training (single cluster, double clusters, cosmic...), and particular training on the easy-to-be-cut good events to improve the safety
 - May utilize the method from computer vision to treat the whole HyCal as a pixel map and identify the cosmic rays
 - Maybe a good project for Yuqi to continue work on