

# Proton Study At The T2K Near Detector ND280



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- Second generation long baseline neutrino experiment situated in Japan

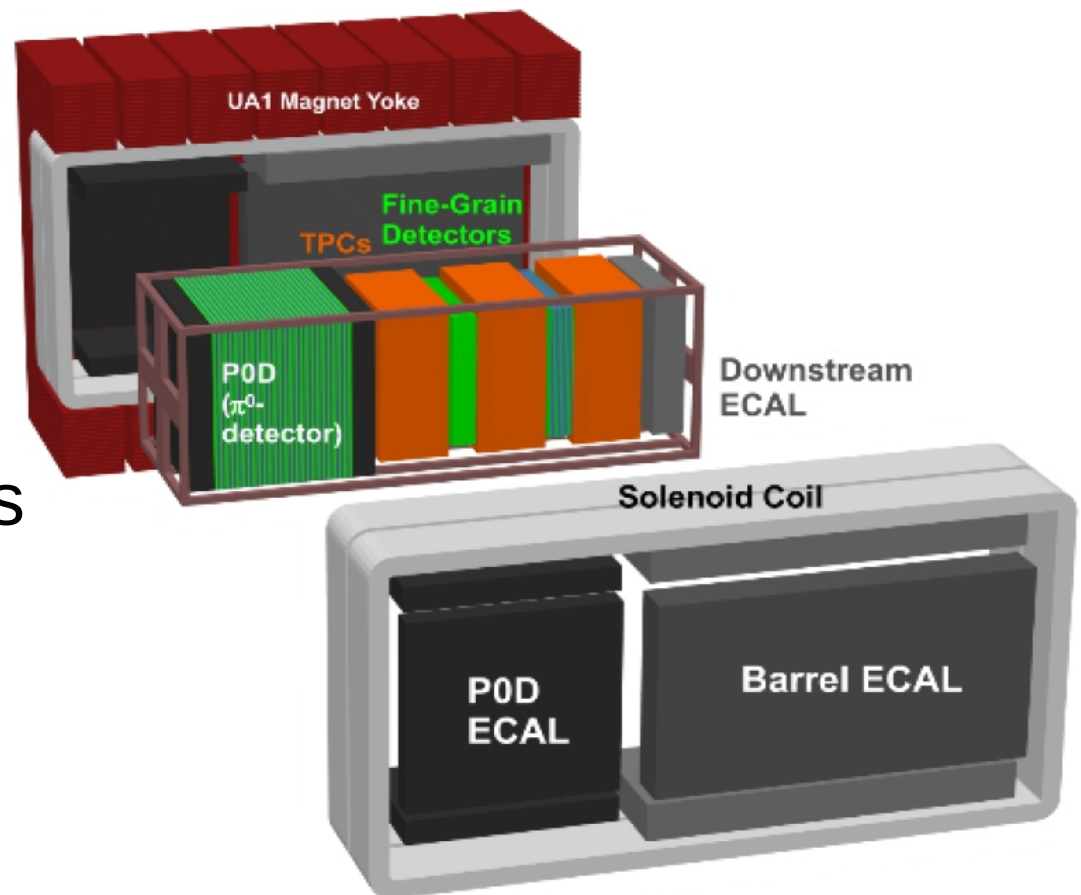
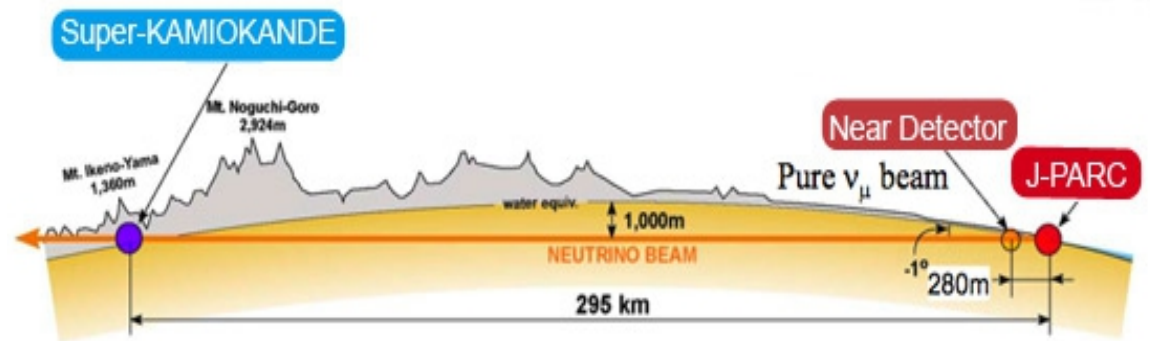
- Electron neutrino appearance

  - Mixing angle  $\theta_{13}$

- Muon neutrino disappearance,

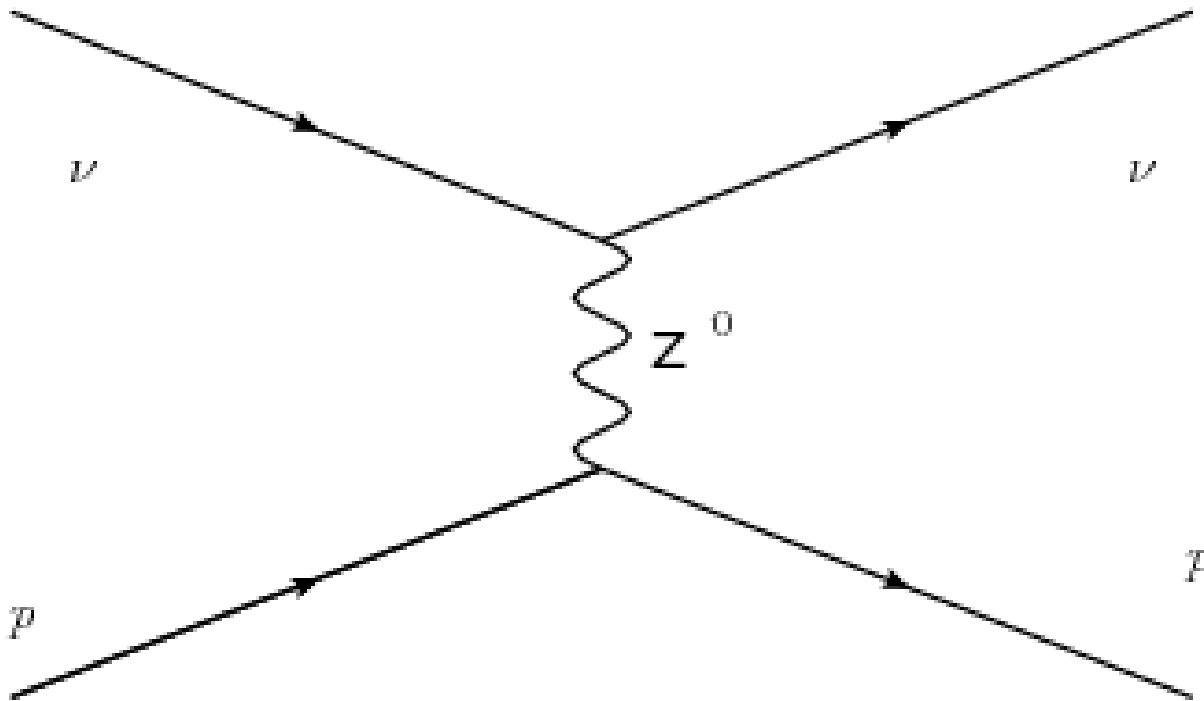
  - Mixing angle  $\theta_{23}$

- ND280 measures various cross sections



# NCQES Neutrino Interaction

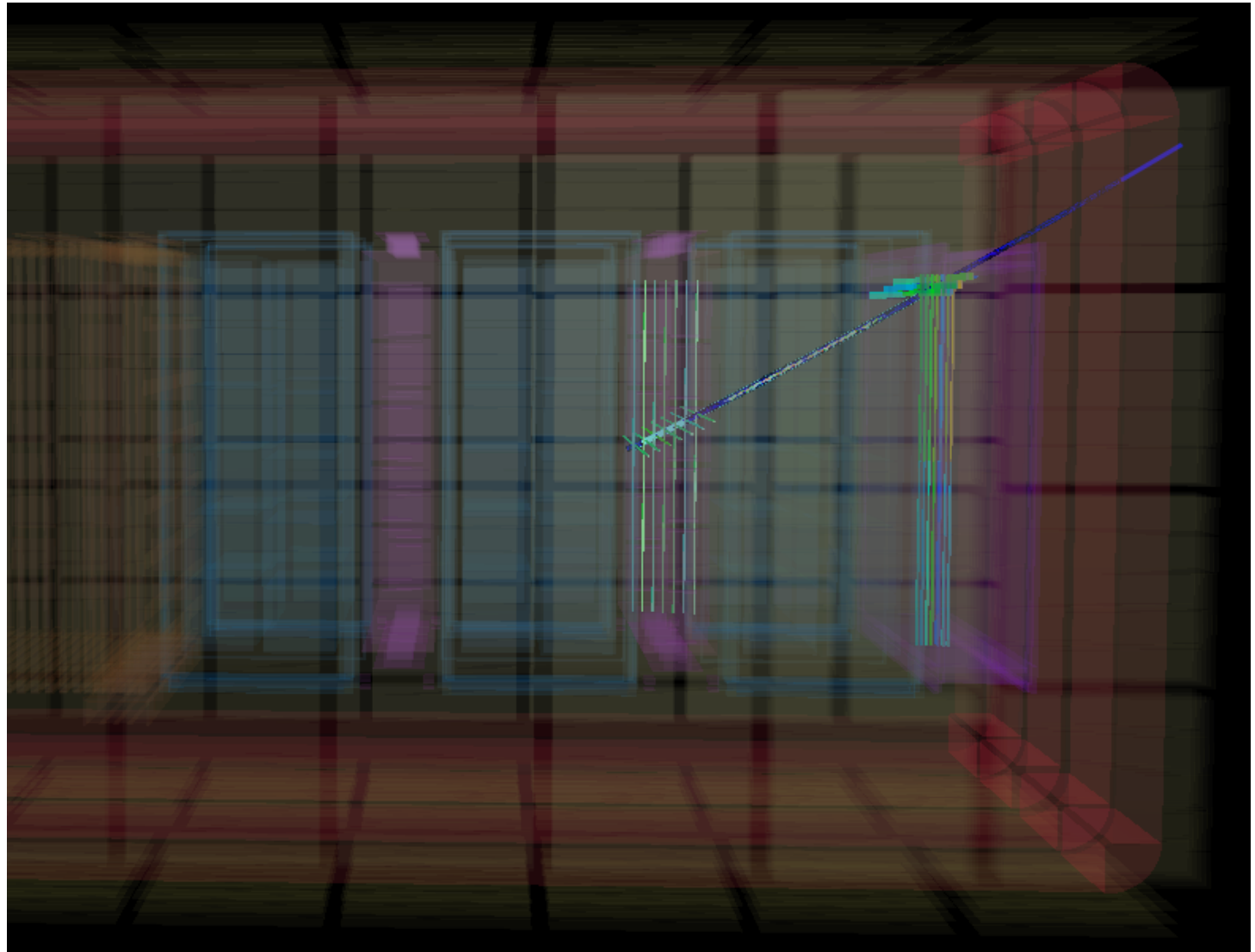
- Neutral Current Quasi Elastic cross section measurements
- Neutrino energy reconstruction



# Event selection FGD TPC

- Good tracking info
- Particle ID
  - TPC
  - ECAL

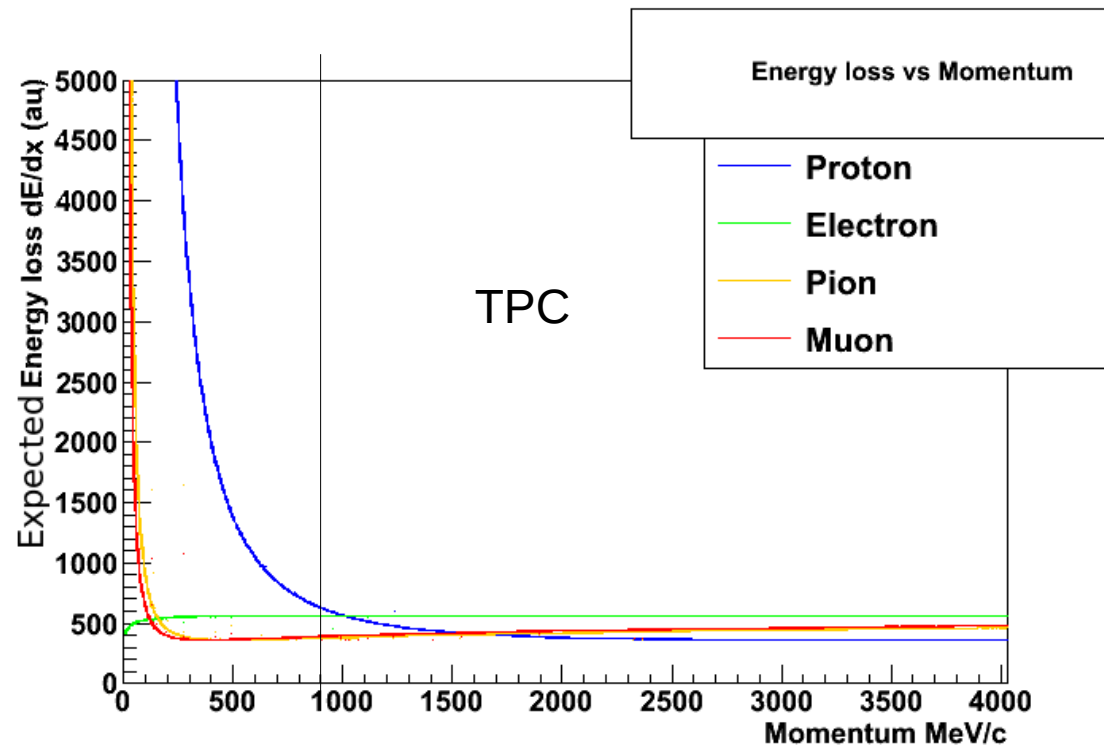
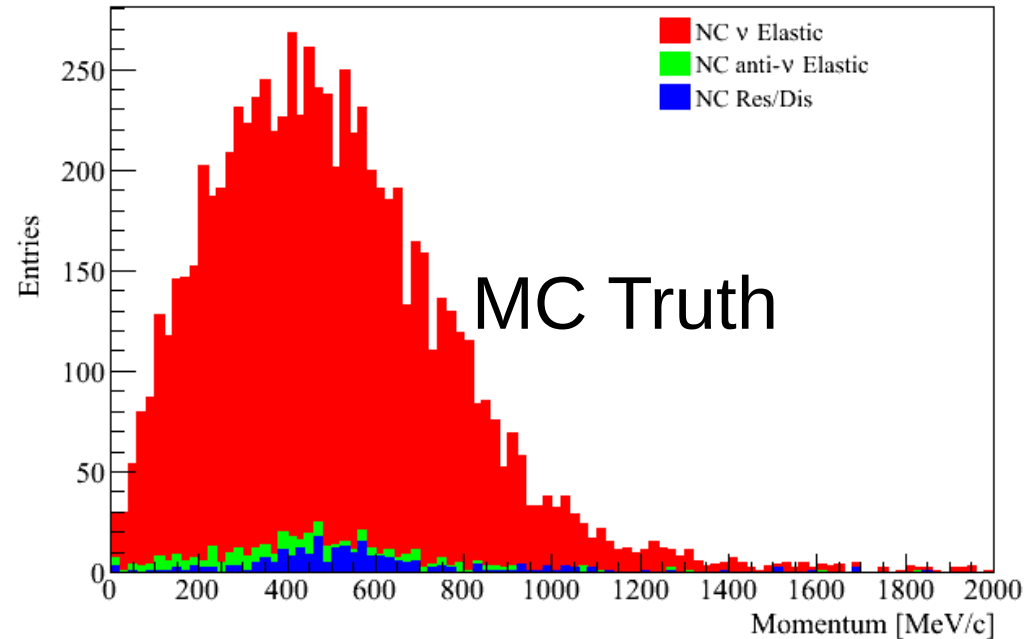
Single positive track  
Events start in FGD  
FGD->TPC->ECAL



# Particle Discrimination Using $dE/dx$

- At high momentum it is very difficult to discriminate protons from  $\mu$  and  $\pi$
- This is what we measure on TPC
- Use the ECAL above 800 MeV/c to improve proton selection

Single Proton Momentum Distribution

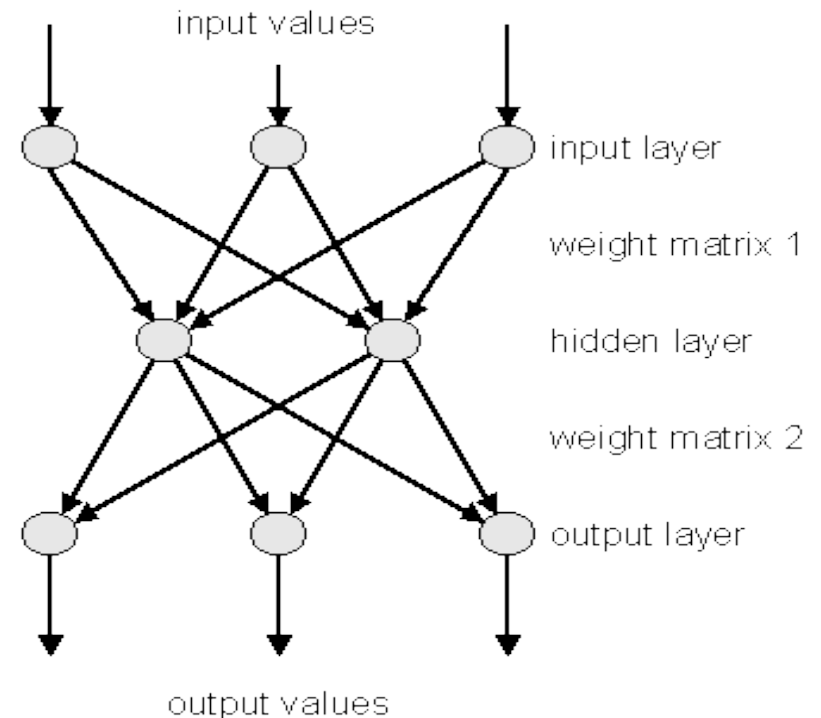


# Neural Network

- Neural Network (NNA) to use ECAL variables
- 3 Momentum Regions
  - $p < 800$  MeV/c, 800-1500 MeV/c and above 1500 MeV/c
- Particle Gun generated Monte Carlo were used for training and validation of the NNA
- NNA tested on Full ND280 Monte Carlo and Test Beam Data

# Neural Network

- A neural network was designed to mimic a central nervous system
- Consist of sets of adaptive weights
- A linear set of sigmoid functions can approximate any continuous function

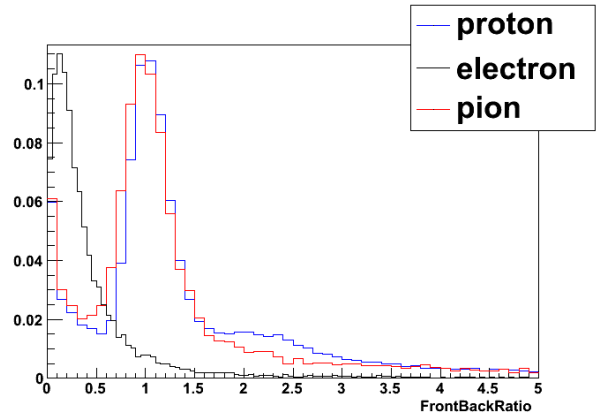
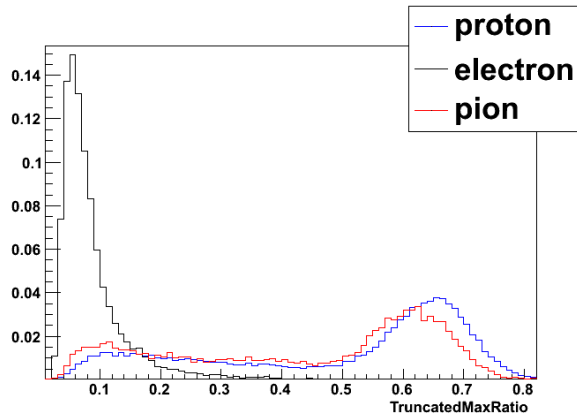
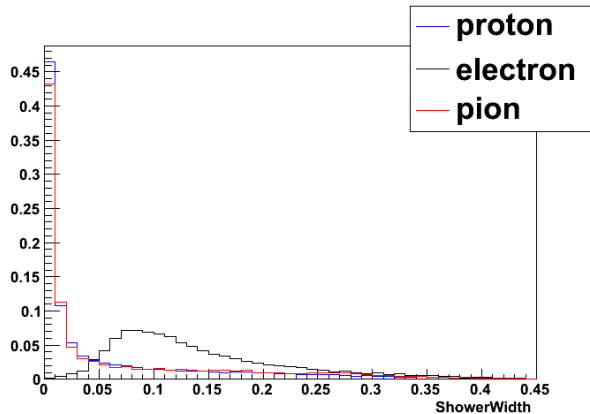
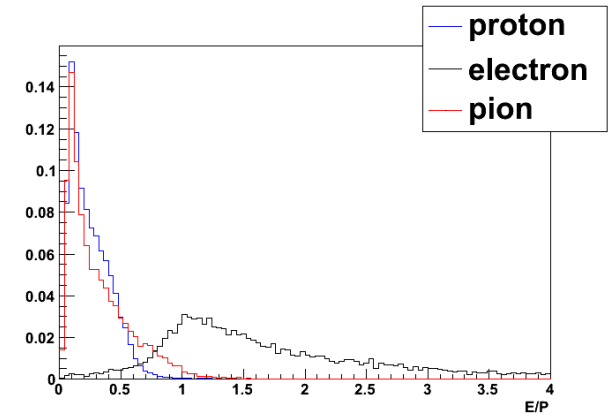
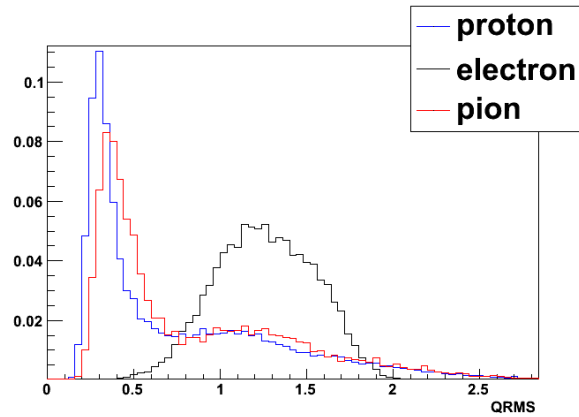
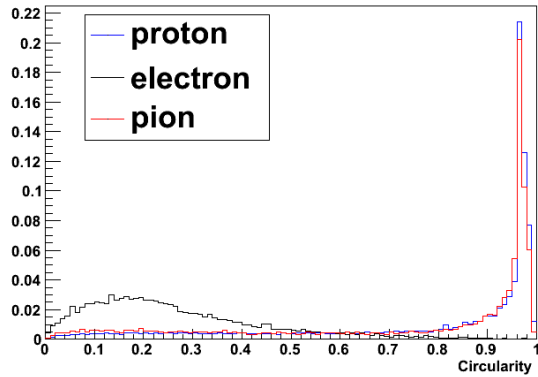
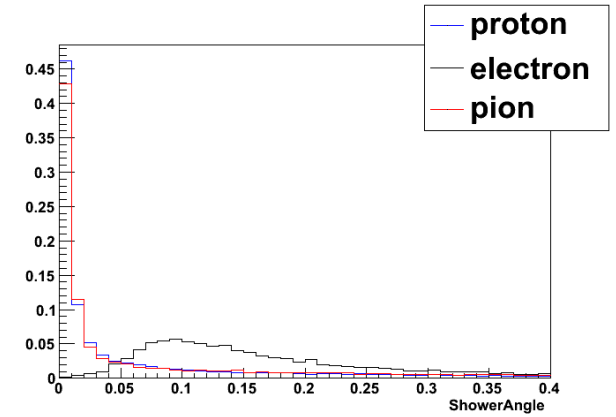


$$w_{ij}(t+1) = w_{ij}(t) + \Delta w_{ij}(t)$$

$$\Delta w_{ij}(t) = -\eta (d e_p / d w_{ij} + \delta) + \epsilon \Delta w_{ij}(t-1)$$

# ECAL Variables

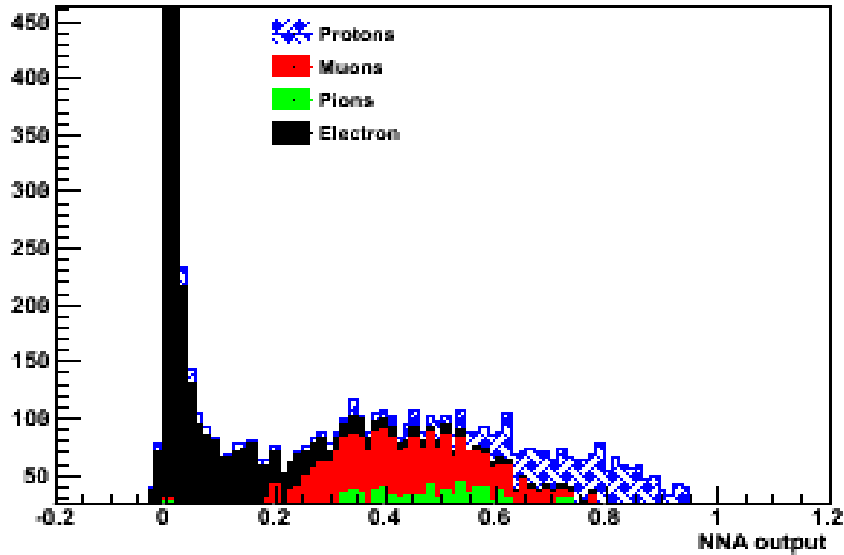
## Inputs for the Neural Network



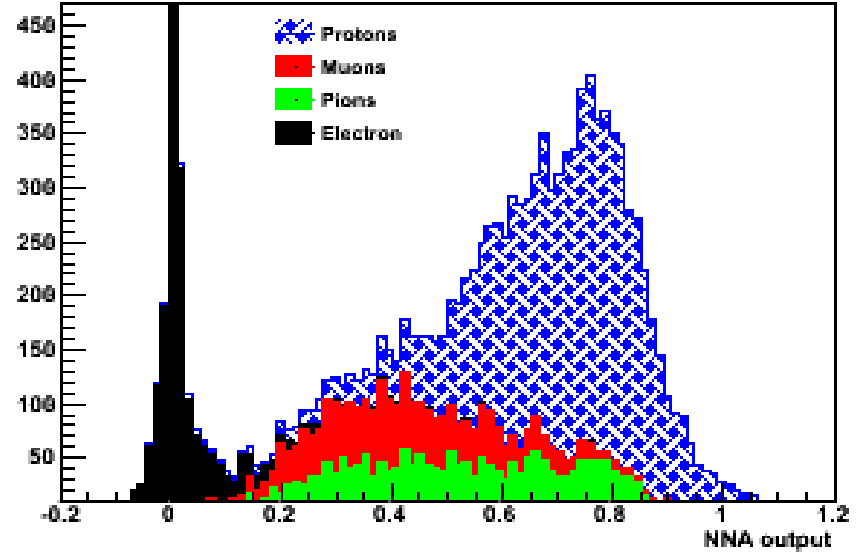


# Neural Network Training

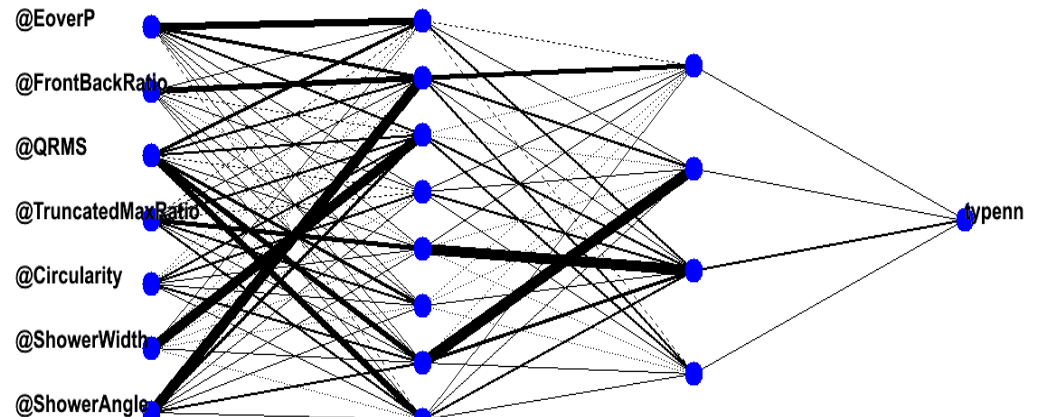
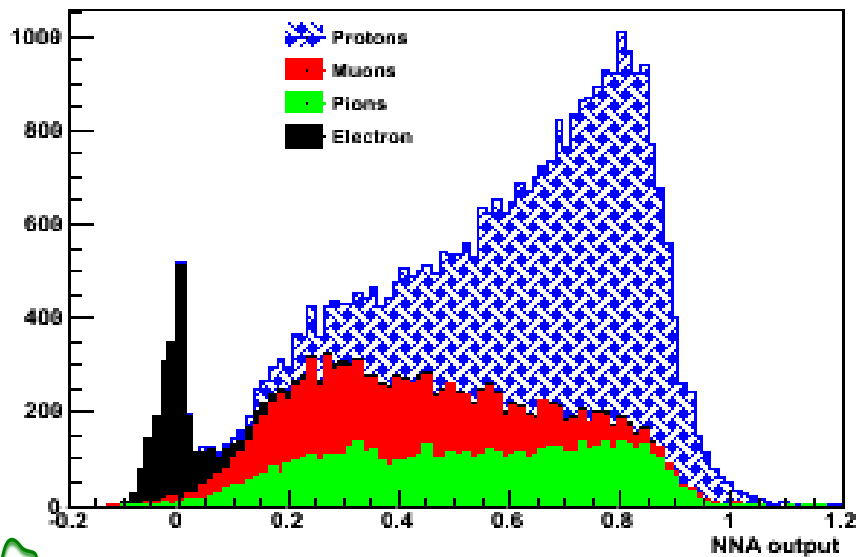
hs800  $p < 800$  MeV/c



hs8001500  $800 < p < 1500$  MeV/c

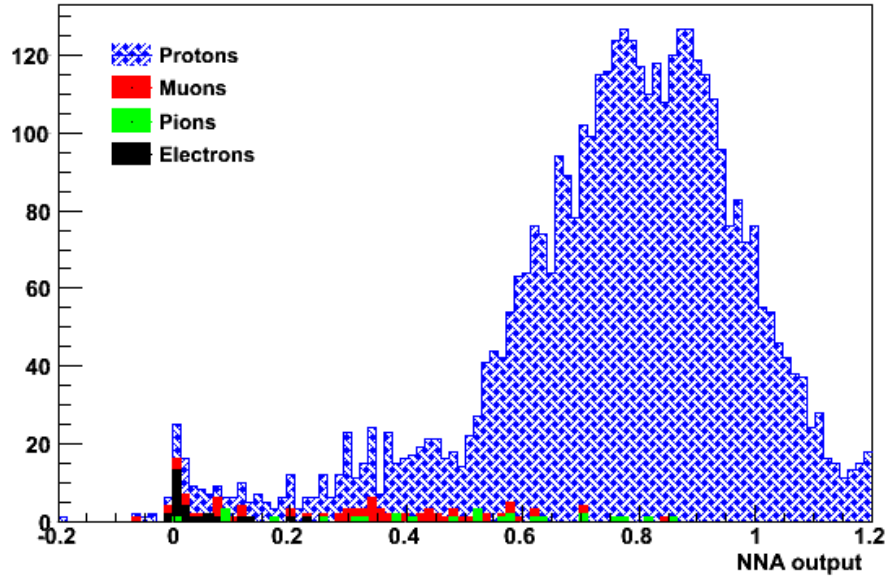


hs1500  $p > 1500$  MeV/c

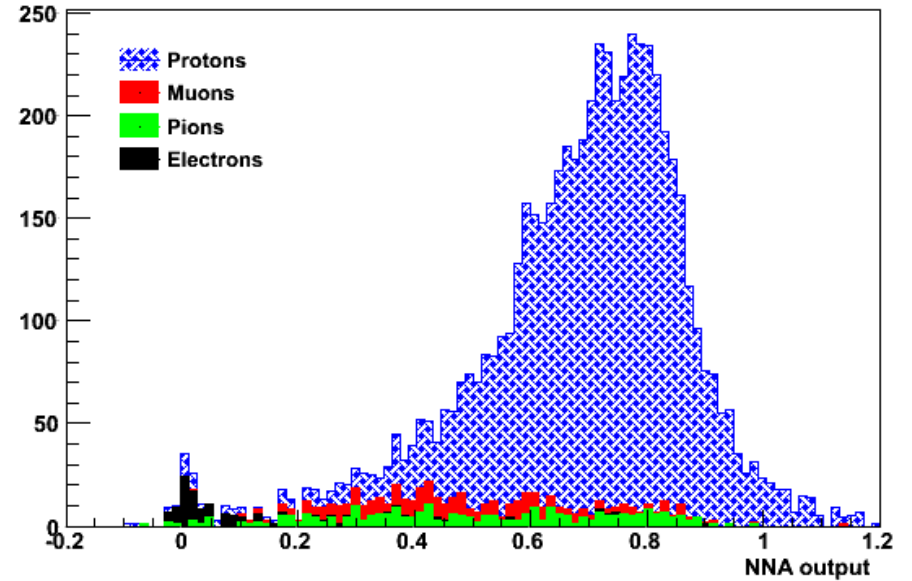


# Full ND280 MC NNA Results

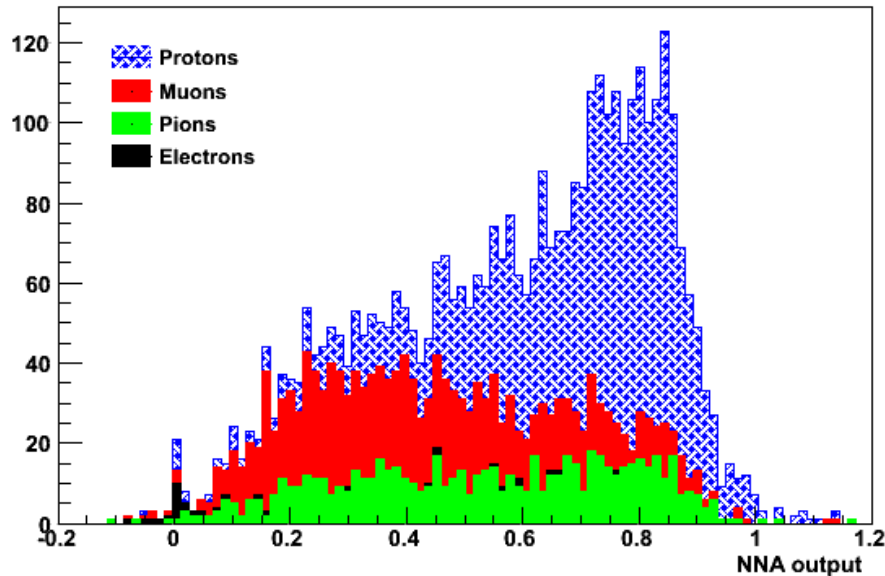
hs800  $p < 800$  MeV/c



hs8001500  $800 < p < 1500$  MeV/c



hs1500  $p > 1500$  MeV/c

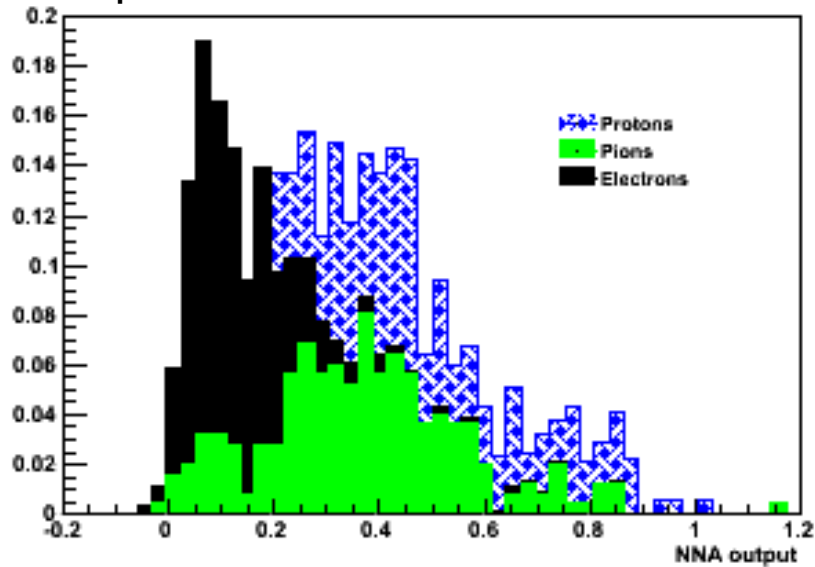


Performance on Full MC  
Full track selection  
TPC PID cut  
( $|\text{proton pull}| < 3$ )

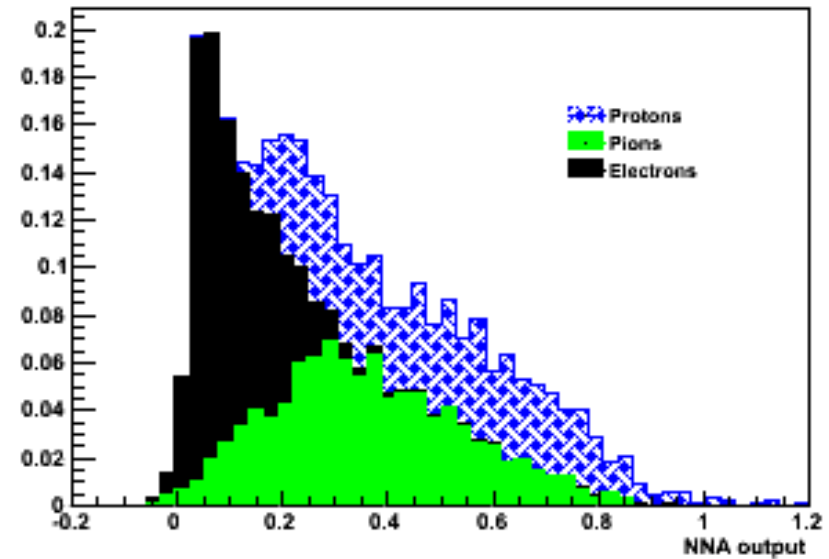
$$\text{pull} = \frac{\text{Expected } dE/dx - \text{Measured } dE/dx}{\sigma}$$

# Test Beam Results

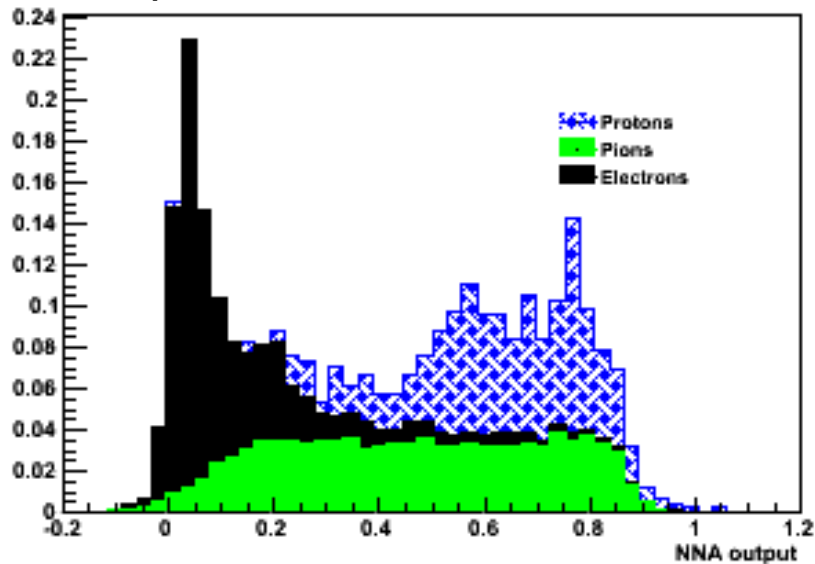
hs800  $p < 800$  MeV/c



hs8001500  $800 < p < 1500$  MeV/c



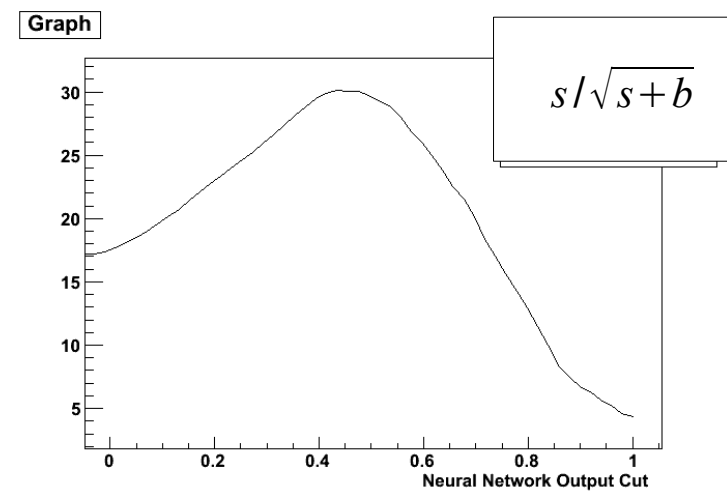
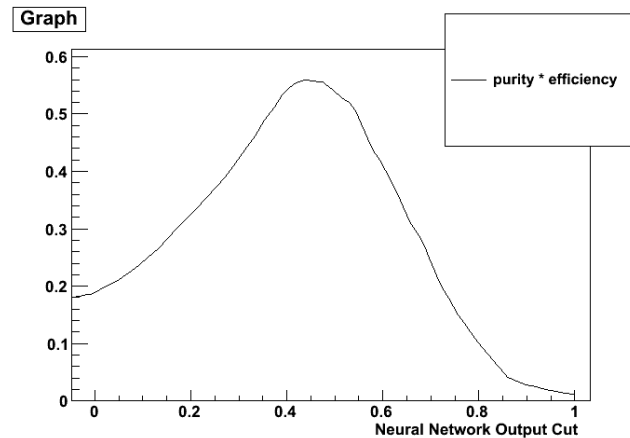
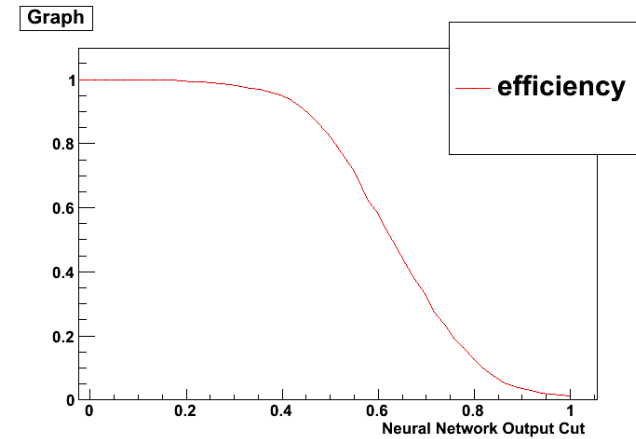
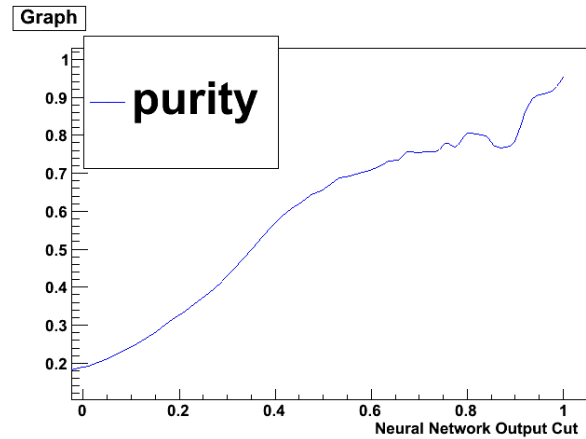
hs1500  $p > 1500$  MeV/c



- Test Beam Data on CERN from DsEcal sub detector
- NNA results for 3 momentum regions
- NNA output
- Stack histogram normalised

# Neural Network Results on MC

Statistical tests to quantify the NNA performance



# Summary

- I extended the proton PID above 800 MeV/c using the neural network with the Electromagnetic Calorimeter

## Future Work

- Finish the NNA (calculate systematics and run on data)
- Complete the proton selection
- Measure Neutrino NCQES cross section

Thank you for your attention.

Questions?

# BACK UP SLIDES

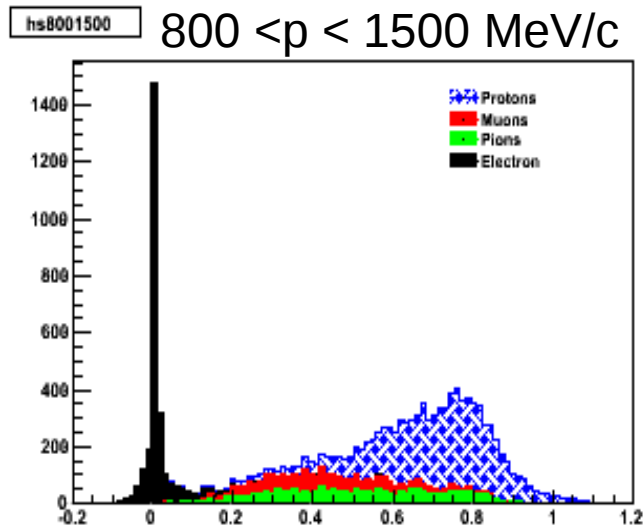
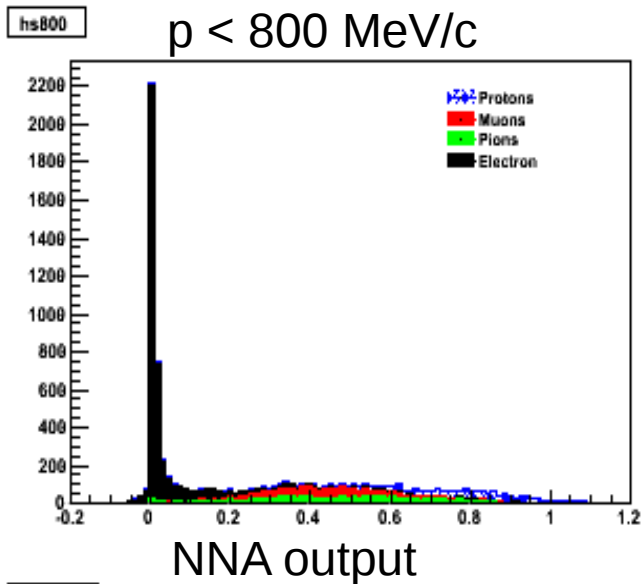
- ECAL Variables for the Neural Network
  - MaxRatio
  - ShowerAngle
  - ShowerWidth
    - Circularity
  - TruncatedMaxRatio
    - QRMS
    - FrontBackRatio
  - Energy/P(momentum)

# Full Spill MC Purity and Efficiency Using Only TPC

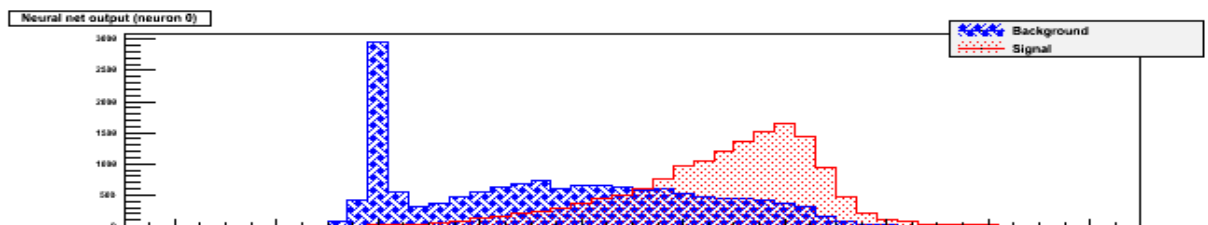
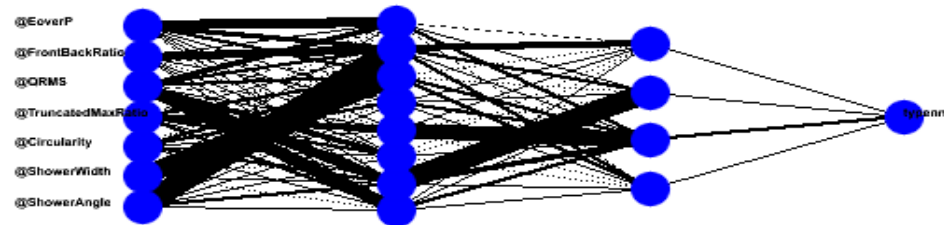
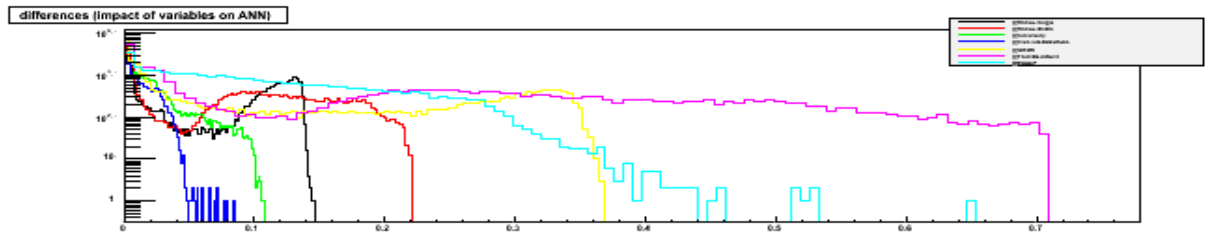
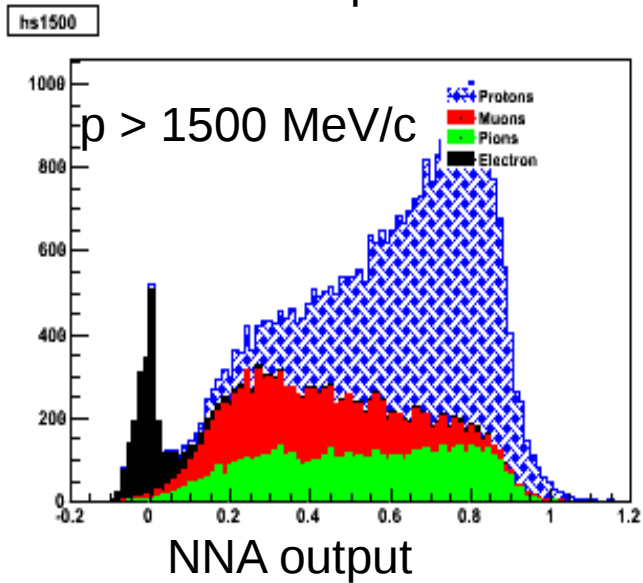
- $|\text{Proton Pull}| < 3$
- Momentum [0-800]
- Eff: 0.85 Pur: 0.91 Electrons : 75% Muons : 11% Pions : 14%
- Momentum [800-1500]
- Eff: 0.93 Pur: 0.57 Electrons : 75% Muons : 11% Pions : 8%
- Momentum [ >1500]
- Eff:0.93 Pur: 0.13 Electrons : 92% Muons : 7% Pions : 1%
  
- $|\text{Proton Pull}| < 3$   $|\text{e mu pi pull}| > 2$
- Momentum [0-800]
- Eff:0.85 Pur: 0.99 Electrons : 46% Muons : 27% Pions : 42%
- Momentum [800-1500]
- Eff:0.533 Pur: 0.96 Electrons : 69% Muons : 6% Pions : 23%
- Momentum [ >1500]
- Eff:0.13 Pur: 0.79 Electrons : 83% Muons : 10% Pions : 4%



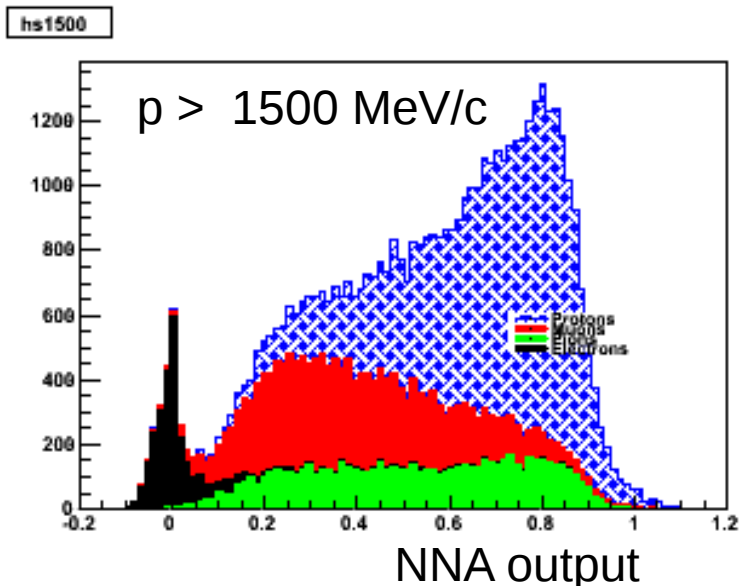
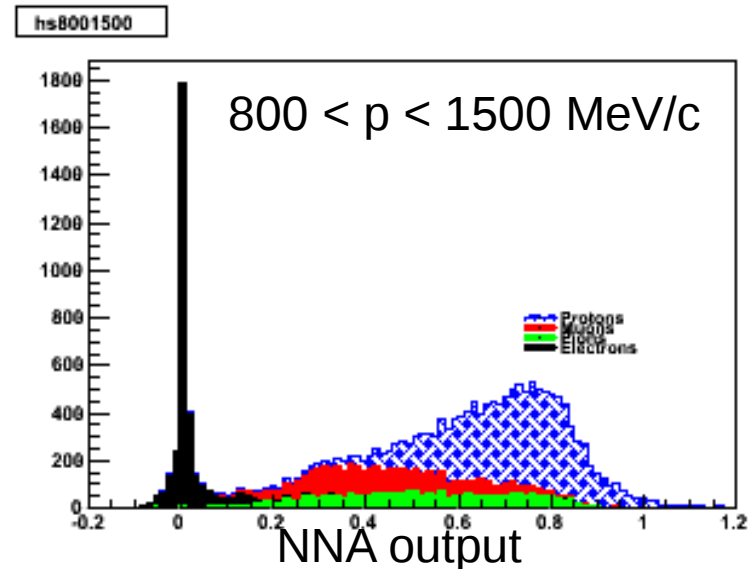
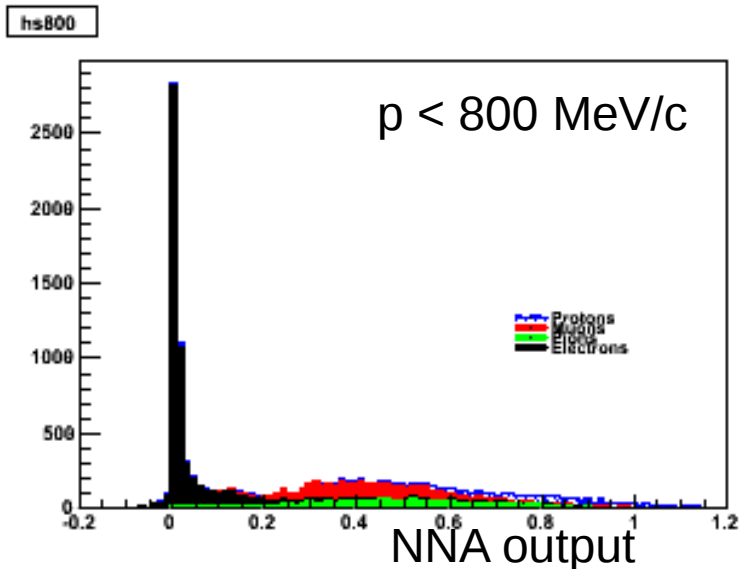
# Neural Network Training



NNA output



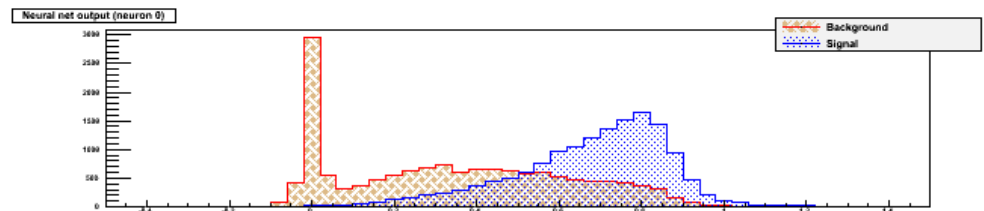
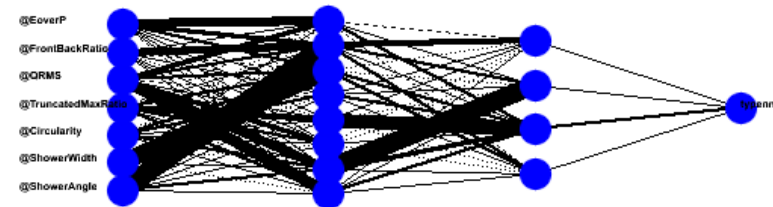
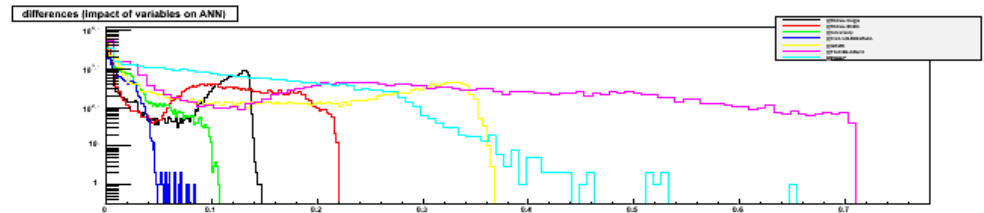
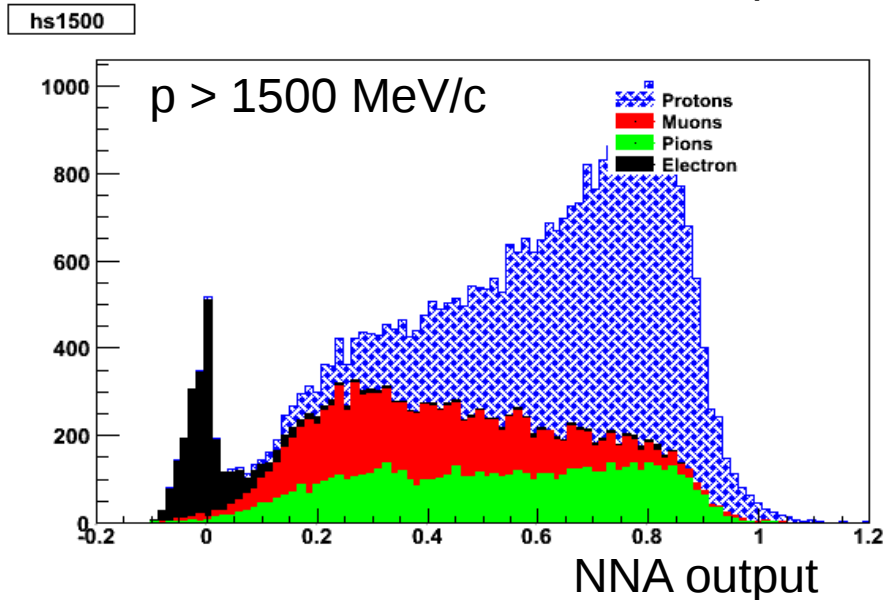
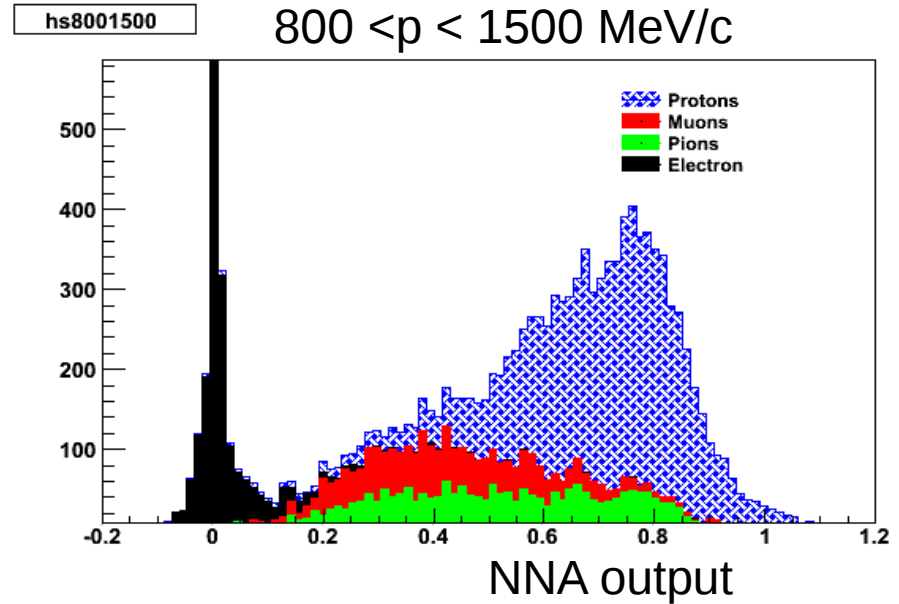
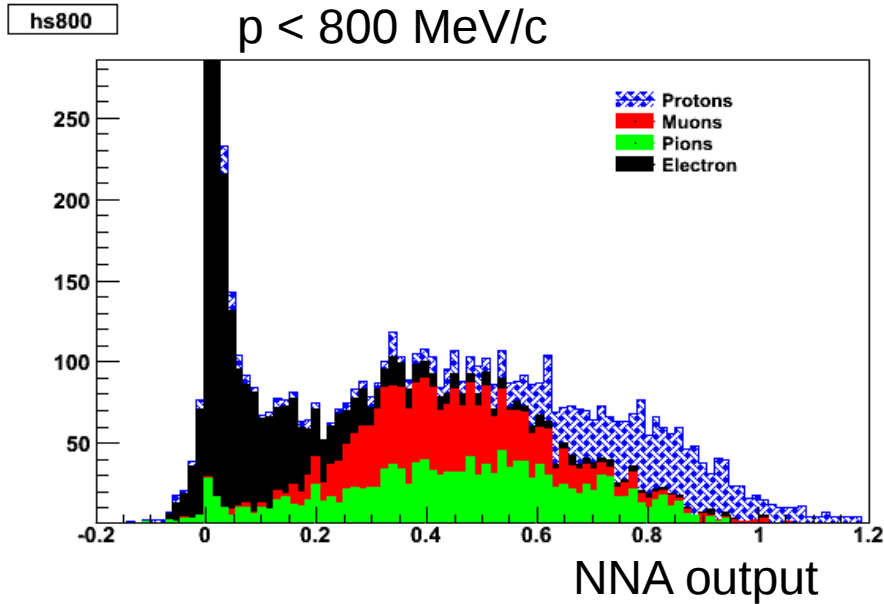
# Particle Gun NNA Results



A different set of particle gun data files generated for NNA validation to test the NNA performance

We test the ability of our NNA to discriminate between signal and background

# Neural Network Training



# Event selection FGD TPC

- Single positive track
- Events start in the FGD fiducial volume
- FGD ---> TPC ---> ECAL
- Good tracking info
- Particle ID
  - TPC
  - ECAL

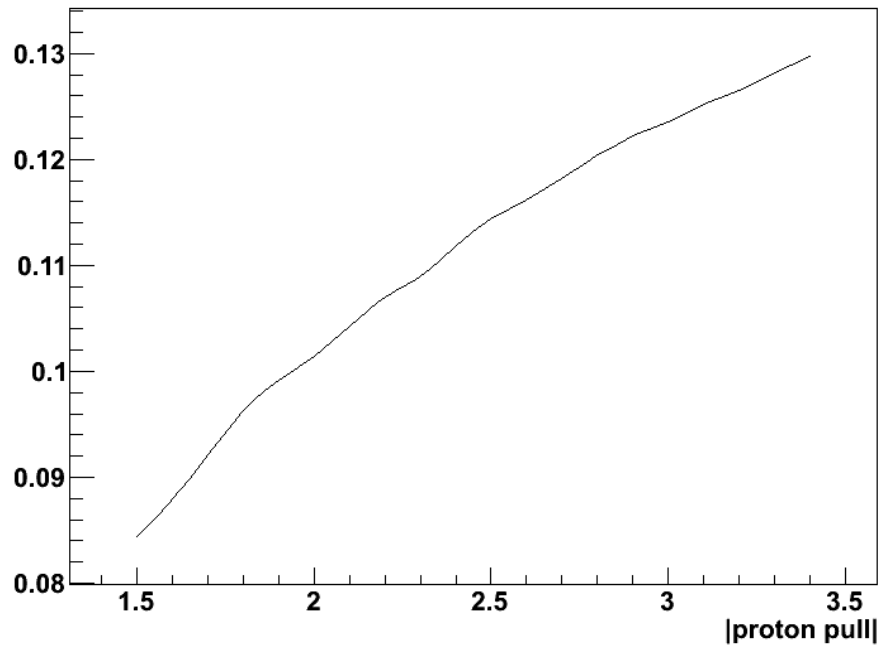
# Overview

- T2K and ND280 overview
- Proton PID physics motivation
- Steps of the analysis
- Results from MC and Test Beam Data files

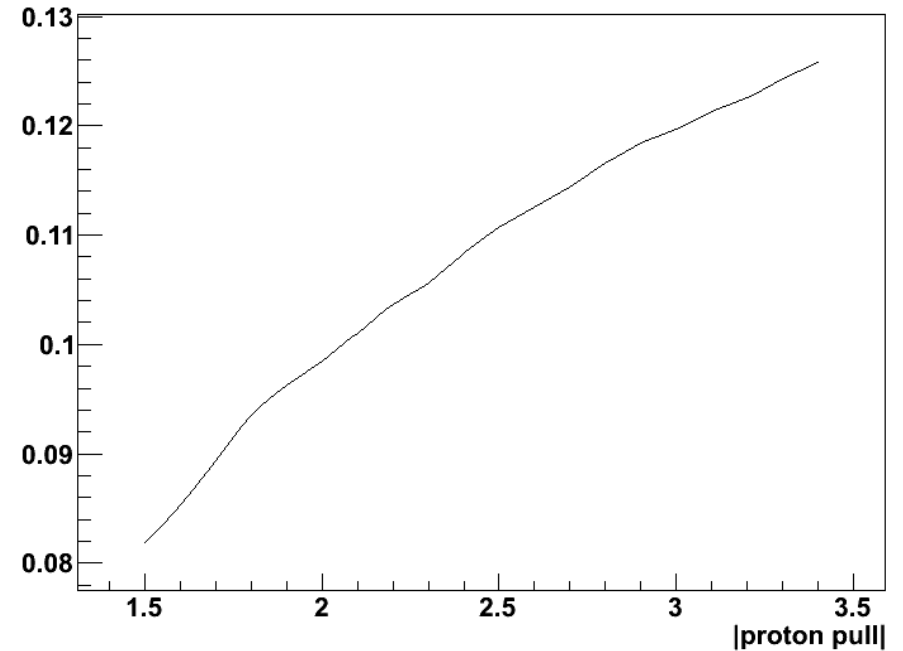
# Backup

- Criteria 1 : No restriction for  $e, \mu, \pi$  pull
- Criteria 2 :  $|\text{pull}| > 2.5$  for  $e, \mu, \pi$

Criteria 1 Efficiency



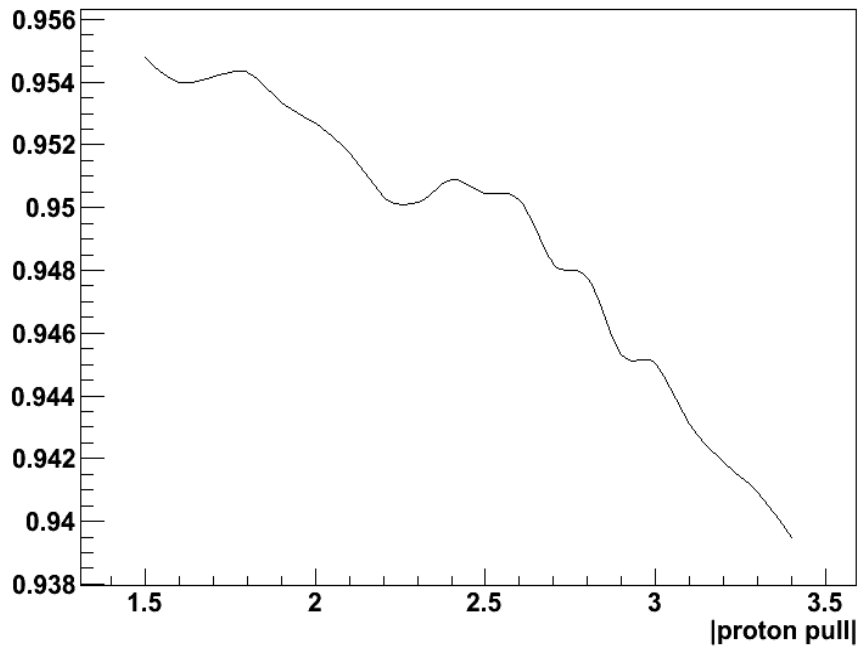
Criteria 2 Efficiency



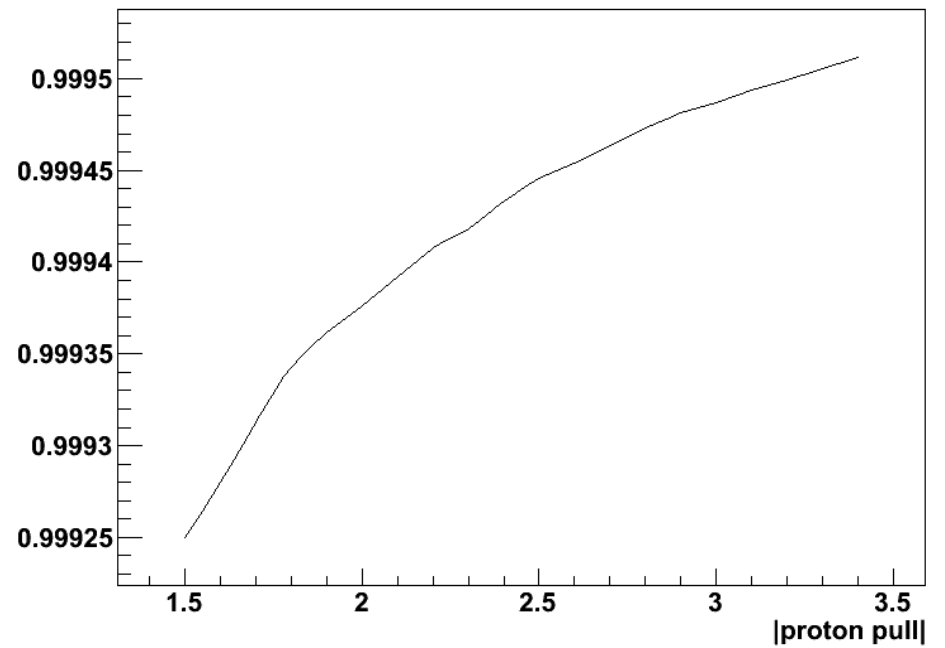
# Backup

- Criteria 1 : No restriction for  $e, \mu, \pi$  pull
- Criteria 2 :  $|\text{pull}| > 2.5$  for  $e, \mu, \pi$

Criteria 1 Purity



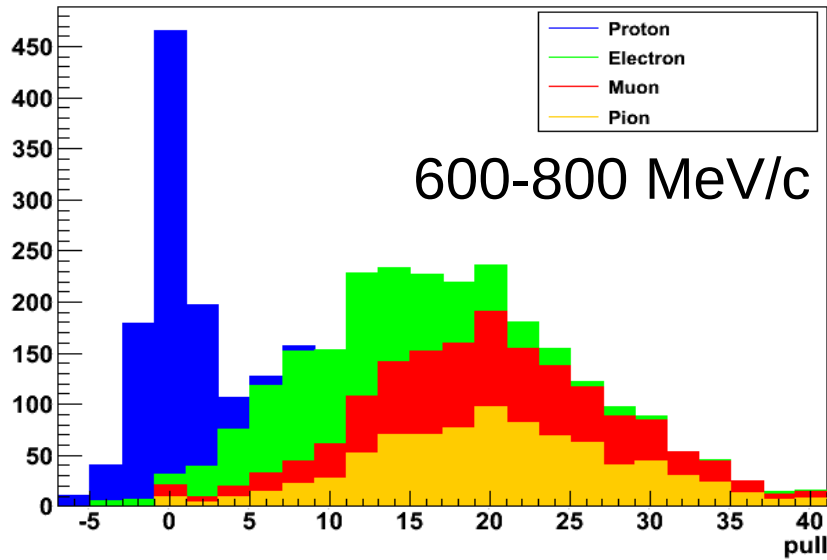
Criteria 2 Purity



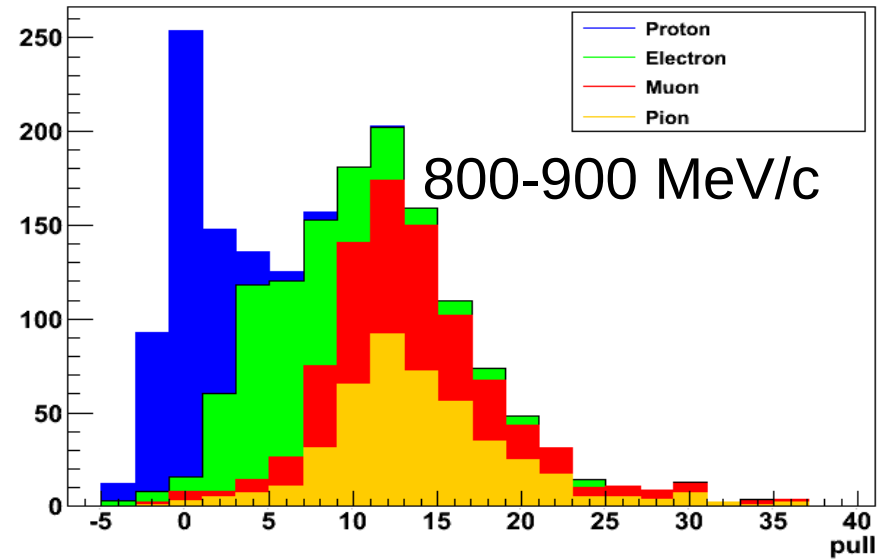
$$\text{pull} = \frac{\text{Expected } dE/dx - \text{Measured } dE/dx}{\sigma}$$

 $\sigma$ 

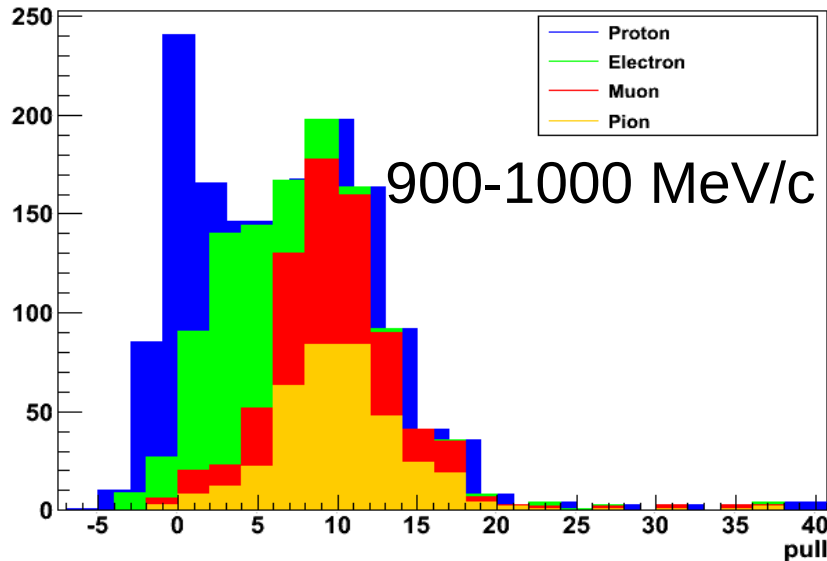
Pulls for momentum 600-800 MeV/c proton hypothesis



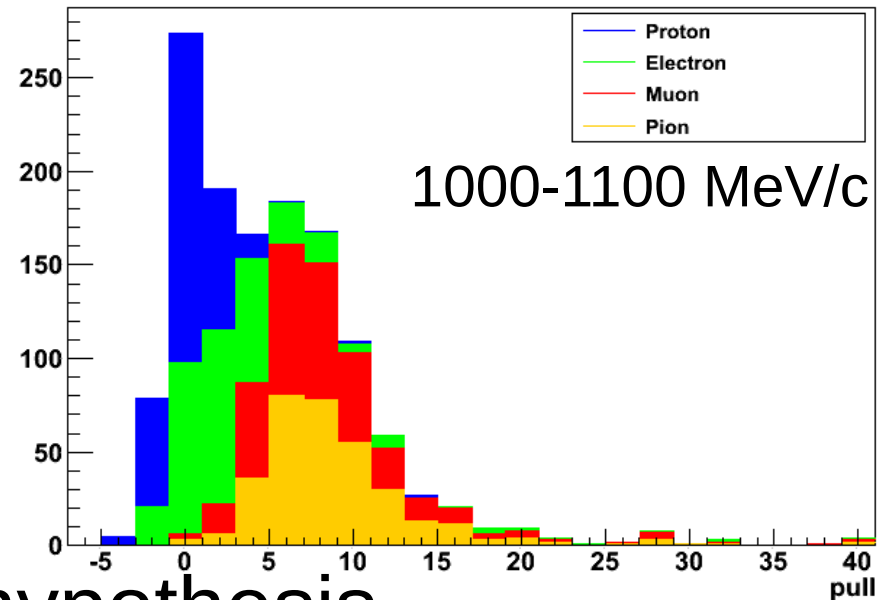
Pulls for momentum 800-900 MeV/c proton hypothesis



Pulls for momentum 900-1000 MeV/c proton hypothesis



Pulls for momentum 1000-1100 MeV/c proton hypothesis





# Optimising The Pull

- Momentum region  $< 900 \text{ MeV}/c$
- Criteria 1 : No restriction for  $e, \mu, \pi$  pull
- Criteria 2 :  $|\text{pull}| > 2.5$  for  $e, \mu, \pi$

Efficiency x Purity plot

