UCDAVIS

# Event Reconstruction Techniques for ANNIE Phase II



**Jingbo Wang** on behalf of the ANNIE collaboration Department of Physics, UC, Davis May 30, 2018, CIPANP, Palm Springs



### Outline



- Introduction on ANNIE
- Phase II simulation
- Phase II event reconstruction
  - Two detector configurations (w/o 5 LAPPDs)
  - Vertex and track reconstruction
  - Energy reconstruction
  - Momentum transfer
- Summary







- **ANNIE:** Accelerator Neutrino Neutron Interaction Experiment
- 26-ton Gd-loaded water Cherenkov detector placed downstream of the Booster Neutrino Beam (BNB) at Fermilab
  - On-axis neutrino flux
  - Beam energy peaks around 700 MeV (relevant to atmospheric neutrinos)
  - 14x10<sup>3</sup> v<sub>µ</sub> of CC interactions per ton of water per year



### **ANNIE Goals**



- **ANNIE primary physics goal:** Measure the **neutron multiplicity** from neutrinonucleus interactions in water as a function of momentum transfer
  - Help to understand the uncertainties on energy reconstruction in long baseline oscillation measurement
  - Neutron yield is a possible handle for neutrino/antineutrino separation
  - Neutron tagging provides signal/background separation for proton decay measurements and supernova neutrino observations.
- ANNIE technological goals:
  - First application of **Gd-doped water** in a beam experiment: large capture cross section for final state neutrons.
  - First application of Large-Area Picosecond Photodetectors (LAPPDs): precision timing to localize interaction vertices in the small fiducial volume



### **ANNIE Detector Overview**





- **Ultra-pure water** in a 3m x 4m tank
- 2 layers of paddles in FACC and 2 layers in MRD.
- Neutron capture vessel (NCV) filled with 0.25% Gd-loaded liquid scintillator (EJ-335)
- 60 8 inch-PMTs act as a veto to the NCV.
- Data taking completed in September 2017.
- Background is sufficiently low to proceed to Phase II

- Gadolinium (0.2%) loaded water
- Full MRD: 11 layers and 310 channels
- 125 PMTs + 5 LAPPDs
- Calibration studies with AmBe source.
- It will be commissioned in the Fall 2018.
- Phase II will be capable of making neutron final state neutrino cross-section measurements





- 1 Charge Current neutrino interaction in the fiducial volume
- 1 Neutrino vertex and muon direction reconstructed using Cherenkov light detected by fast-timing LAPPDs
- 1 Muon momentum reconstructed by the MRD
- 2 Final state neutrons are getting thermalized in the water volume
- 3 Neutron capture on Gd emitting an 8 MeV gamma cascade
- 4 Gamma rays are detected by PMTs

### LAPPDs in ANNIE





Next talk by V. Fischer

#### LAPPDs are MCP-based fast-timing photodetectors

- Flat, Large-area: 20 cm × 20 cm
- Picosecond timing: <100 ps for SPE</li>
- Quantum efficiency: >20%
- Position resolution: mm
- Lower Cost per Unit Area
- Atomic Layer Deposited Micro-channel Plate (MCP)
- INCOM. Inc has commercialized the LAPPDs. The performance is quickly approaching the specifications needed by ANNIE





### **Phase II Simulation**



- ANNIE Phase II simulation in WCSim: 128 PMTs + 128 LAPPDs
- Dataset of  $v_{\mu}$  interactions provided by the GENIE generator
- Investigated event reconstruction capability using two different photodetector configurations:
  - PMT-only configuration including 128 8-inch traditional PMTs (about 20% coverage of the inner surface of the tank).
  - LAPPD+PMT Combined configuration including 128 8-inch traditional PMTs and additional 5 LAPPDs on the downstream wall of the tank.





## **Phase II Reconstruction Strategy**



#### **Reconstruction techniques**

- 1) Vertex and track are reconstructed in water tank using maximum likelihood fit
- 2) Track length in MRD is reconstructed by fitting the hit position in all MRD layers
- **3)** Track length in water is reconstructed using Deep Learning Neural Network machine learning algorithm
- 4) Neutrino and muon energies are reconstructed using Boosted Decision Tree machine learning algorithm
- 5)  $Q^2$  is calculated assuming CCQE interaction



### Vertex and track reconstruction

- A single muon track can be specified by **6 kinematic variables:** 
  - A vertex position (X, Y, Z)
  - A vertex time (T)
  - A track direction  $(\theta, \varphi)$
- Measurement from photodetectors
  - Hit position and time
  - Hit charge

#### **Basic strategy:**

- A timing-based likelihood (FOM<sub>time</sub>) function is used to fit the vertex position and time
- A charge-based likelihood function (FOM<sub>cone</sub>) is used to fit the cone-edge then the track direction
- 3) Six parameters are varied and the combined likelihood functions is used to fit the track





## Vertex constraints in two directions



- Timing places a weak constraint longitudinal to the muon direction due to the ambiguity issue of T<sub>0</sub>
- Scattered light outside the cone helps a little, but not sufficiently.
- Cherenkov cone-edge offers better constraint to T<sub>0</sub>, which significantly improves the vertex resolution along the muon track
- In ANNIE, the strong transverse constraint is provided by 5 downstream LAPPDs, and the longitudinal constraint is strengthened by the PMTs
- Overall constraint transverse to the muon direction is much stronger





### Vertex Displacement: Δr



Idealized reconstruction: take the true vertex and track direction as the seed for the track fit

- Only the muons that are produced within a fiducial volume and stop inside the MRD are selected
- LAPPDs show significant improvement on the vertex resolution
- 128 PMT-only (20% coverage) : 38 cm
- 5 LAPPDs + 128 PMTs : 12 cm



### Track Angular Displacement: Δφ



Idealized reconstruction: take the true vertex and track direction as the seed for the track fit

- 128 PMT-only (20% coverage) : 10 degree track angle resolution
- 5 LAPPDs + 128 PMTs: 5 degree track angle resolution (a factor of two improvement!)



Angle between the true and the reconstructed muon tracks

### **Energy reconstruction**



- Boosted Decision Trees (BDT) machine learning algorithm was used
- Select CCQE events with E<sub>v</sub> < 2GeV</li>
- Select events with muon stopped within the MRD
- The algorithm is trained with multiple input parameters

### **Input Variables:**

- Track length in water calculated by Deep Learning Neural Network
- Track length in MRD reconstructed using 10 layer of scintillator paddles
- Angle difference between the reconstructed track direction and the beam direction
- The total number of hits in PMTs and LAPPDs
- The reconstructed vertex coordinates
- The distances of the reconstructed vertex from the detector walls (D<sub>R</sub>, D<sub>y</sub>)

**E. Drakopoulou** , arXiv:1710.05668v3



### **Energy Reconstruction**



- Figure of merit:  $\Delta E/E = 100 * (E_{true} E_{reco}) / E_{true}$
- The muon (neutrino) energy resolution achieved at the 68<sup>th</sup> percentile of all reconstructed events from the sample is 10% (14%).



**E. Drakopoulou ,** arXiv:1710.05668v3

#### Marcus O'Flaherty (University of Sheffield)



Momentum transfer reconstruction

- Stopped muon events are selected for which the muon energy is measured as the sum of energy deposited in the water tank and the MRD.
- Assuming CCQE interaction, the reconstructed muon and neutrino energies, together with the muon angle are used to calculate the momentum transferred.





#### Slide 17

### Momentum transfer reconstruction

- $\Delta Q^2 = Q^2_{reco} Q^2_{true}$ , reconstructed by the ANNIE detector with 128 PMTs only and 5 LAPPDs + 128 PMTs
- The 1-sigma Q<sup>2</sup> resolution is extracted from the  $\Delta Q^2$  distribution for 4 bins in true  $Q^{2}$ .
- The addition of 5 LAPPDs improves the Q<sup>2</sup> resolution.





### Summary



- ANNIE's physics goal is to measure the neutron multiplicity from neutrino interactions in water, as a function of momentum transfer
- ANNIE has finished Physics I background measurement and is moving to Phase II physics measurement (2018 fall).
- Simulation and Reconstruction tools for ANNIE Phase II are in place and show good performance.
  - Vertex & track reconstruction with PMT + LAPPD configuration
  - Machine learning tools are used for energy reconstruction
  - Momentum transfer reconstruction improves with 5 LAPPD
- Futhher development and improvement of the reconstruction techniques are ongoing

### **Thanks for your Attention! Questions?**





### Long Baseline Oscillation Physics

- In order to turn neutrino physics into a precision science, we need to understand the complex neutrino-nucleus interactions
  - Dominant source of uncertainties on energy reconstruction
  - Neutrino-nucleus interaction is hard to model
  - Need comprehensive measurements of neutron/proton multiplicity for a variety of targets/Ev
  - ANNIE focuses on the CCQE-like events and measure final state neutrons in water from 0.5 – 3 GeV
    - Better identification of pure CCQE interactions —
    - Possible handle for neutrino/antineutrino separation
    - Complementarity with proton multiplicity measurements in liquid argon

signal-background separation in a number of physics analyses!







### **Proton Decay**



- Proton decay (PDK) remains one of the generic predications made by Grand Unification Theories (GUT)
- Main background from atmospheric neutrino interactions
- Backgound rejection using neutron tagging (n-Gd capture)
- Data is needed to implement the neutron yield in simulation of PDK backgrounds





**Diffuse SuperNova Background (DSNB): continuous neutrinos flux from all** past core-collapse supernovae =>difficult to detect

 Supernova neutrino is detected via the Inverse Beta Decay (IBD):

 $\overline{v_e} + p \to e^+ + n$ 

 Main background (E>20 MeV): from decay of sub-Cherenkov muons produced by atmospheric neutrinos:

$$\mu^{+} \rightarrow e^{+} + v_{e} + \overline{v_{\mu}}$$
$$\mu^{-} \rightarrow e^{-} + \overline{v_{e}} + \mu$$

 To discriminate signal and background, understanding of the atmospheric neutrino interactions is needed Beacom & Vagins, PRL, 93 (2004) 171101



## Why does ANNIE need LAPPDs?



#### LAPPDs are key detectors for the ANNIE physics measurement

- Simulation shows that neutrons created in ANNIE can drift up to 2 meters.
  - In the direction transverse to beam, drift is symmetric
  - In the direction along the beam, drift is mostly forward with respect to the interaction point.
- In order to get a clean sample of neutrons, the analysis must be restricted to a small ~1 ton fiducial volume far from the walls of the tank to capture the neutrons
- To properly identify events in FV, vertex resolution of ~ 10 cm is needed
  - This is beyond the capability of traditional PMTs!
  - LAPPDs use fast-timing to localize the vertices, which is essential for ANNIE analysis





### LAPPD commercialized by INCOM.



#### INCOM. http://www.incomusa.com/



A. Lyashenko, Incom LAPPD, Pico-Second Workshop, Kansas City Sept 15-18 2016





### Vertex and track reconstruction

Conceptualize Cherenkov light as coming from a point source

Step1: "Simple vertex" fit

- Assume a hypothesized point-source location  $(x_{hvp}, y_{hvp}, y_{hvp})$  $z_{hyp}, t_{hyp})$
- For each photon hit, calculate the point time residual:

 $\Delta t = t_{hit} - \left(\frac{L_p}{c/n}\right) -$ 

For all the hits, calculate the timing-based Figure-of-Merit (timing likelihood)

Adjust four parameters to maximize time FOM. FOM takes the maximum value when the width of the time residual distribution is minimized

 $(x_{hit}, y_{hit}, Z_{hit}, t_{hit})$ 

 $(x_{hyp}, y_{hyp}, z_{hyp}, t_{hyp})$ 



four parameter fit: (x, y, z, t)



## Vertex and track reconstruction



### **Step2:** "Extended vertex" fit six parameter fit: $(x, y, z, t, \theta, \varphi)$

 Starting from the "simple vertex" obtained from step1, assume a hypothesized track (x<sub>hyp</sub>, y<sub>hyp</sub>, z<sub>hyp</sub>, t<sub>hyp</sub>, θ<sub>hyp</sub>, φ<sub>hyp</sub>)



$$\Delta t = t_{hit} + \frac{\frac{L_p}{c}}{\frac{c}{n}} - \begin{pmatrix} \frac{L_t}{c} \\ c \end{pmatrix} \longrightarrow \text{muon travel time}$$

Lt

 $(x_{hyp}, y_{hyp}, z_{hyp}, t_{hyp})$ 

 $\theta_{hyp}, \varphi_{hyp}$ )

- For each hit, compare the measured cone edge to the simulated one.
- For all hits, calculated the overall FOM (FOM<sub>time</sub> + FOM<sub>cone</sub>)
- Adjust six parameters to maximize the FOM

### **Track length reconstruction**



- Muon energy is measured as the sum of energy deposit in water and MRD
- Track length in the water tank is calculated using a Deep Learning Neural Network (from Tensorflow package).
- Tracks in MRD are reconstructed in two 2D views and then matched into a 3D view
- MRD reconstruction is done in a separate framework. For the present studies, the track length is calculated as the distance between the true entry and stop points of the muon (neglect scattering)

