## $\nu_{\rm e}$ Selections with SPINE for BNB and NuMI

Dan Carber, October 16th, 2024





Overview of Workflow

- Generator: prodcorsika\_genie\_protononly\_icarus\_numi{\_nue}.fcl, prodcorsika\_bnb{\_nue}\_genie\_protononly\_icarus.fcl
- Filter: filter\_genie\_active\_icarus.fcl (Only on BNB)
- G4: larg4\_icarus\_cosmics\_sce\_2d\_drift.fcl
- Detsim: detsim\_2d\_icarus\_fitFR\_refactored.fcl
- Stage 0: stage0\_run2\_icarus\_mc\_refactored.fcl
- Stage 1: stage1\_run2\_1d\_larcv\_icarus\_MC.fcl
- Cafmaker: cafmakerjob\_icarus\_detsim2d.fcl

## Scalable Particle Imaging with Neural Embeddings (SPINE)





NuMI  $v_e$ Event





## BNB $\nu_e$ Selection Dae Heun Koh



## Sample and Data Processing

MC samples

- BNB  $\nu$  + out of time cosmics (~300,000 events)
  - Icaruscode version v09\_84\_00\_01
- BNB  $v_e$  + out of time cosmics (~100,000 events)
  - (Icaruscode version v09\_89\_01\_01)
- Actively making MC samples to study systematics

Run 2 Data (Icaruscode version v09\_84\_00\_01)

- BNB Offbeam Majority
  - LArCV files have been transferred to SLAC
  - Processed for Justin Mueller's Analysis
- BNB Onbeam Majority (~1.92E20 POT)
  - LArCV files have been transferred to SLAC
  - Processed for Justin Mueller's Analysis

## BNB $\nu_e$ Selection

- Containment
  - Require depositions to be within the TPC that it was collected only for tracks
    - 5 cm margin on TPC borders
    - -5 cm margin on the cathode
- Fiducial volume: 25 cm from X and Y detector boundaries, 30 cm from beam-side and 50 cm from downstream edge in Z (same as used in Pandora-based selections)
- Signal Definition:
  - 1 primary electron with energy greater than 100 MeV
  - N > 0 primary protons with energy greater than 40 MeV
  - Any other primary particle must be greater than 25 MeV
- Flash Matching:
  - Utilizing OpTOFinder to constrain flash match to be withing BNB beam window

## BNB $v_e$ Heuristic Selections

- Shower Conversion Distance: An electron primary shower must be within 2 cm from the vertex
- Multi-Shower Check:
  - All electron primary showers must not have two distinct shower fragments that are separated more than 41 degrees (threshold not fine-tuned)
- Track-Shower Merger:
  - Merge a track to a leading shower in a given interaction if it satisfies all of the following conditions:
    - Track is less than 50cm
    - (Reco) Track direction and (Reco) shower direction angular separation less than 10 degrees
    - Track start  $\frac{dE}{dx}$  is less than 15 MeV / cm (to avoid merging colinear protons)
    - Track is within 1cm from leading shower
- Primary-Track Vertex Adjacency:
  - All track primaries must be within 3cm from vertex (if not, we override the primary labels and classify them as non-primaries)

## BNB $\nu_e$ Selection

Cuts	Efficiency (%)	# Efficiency	Purity (%)	# Purity
True $ u_e$	100.00	487 / 487	0.0045	555 / 12234234
Containment (Tracks)	96.3	469 / 487	0.052	$537 \ / \ 1025739$
Fiducial	94.9	462 / 487	0.100	$512 \ / \ 514064$
Flash Time	92.4	450 / 487	0.374	$452 \ / \ 120799$
Final State	70.8	345 / 487	30.5	345 / 1131
Visible Final State	71.5	348 / 487	50.4	348 / 690
<b>PID-Semantic Agreement</b>	71.0	346 / 487	50.4	346 / 686
PID Score Thresholding	60.4	294 / 487	51.2	$294 \ / \ 574$
Shower Conversion Distance	52.4	$255 \ / \ 487$	63.4	$255 \ / \ 402$
Multi-Shower Check	49.7	$242 \ / \ 487$	75.4	242 / 321
Track-Shower Merger	53.8	262 / 487	75.9	262 / 345
Primary Track-Vertex Adjacency	55.2	$269 \ / \ 487$	73.7	$269 \ / \ 365$

TABLE 1. Effects of cuts for BNB  $\nu$  + COSIKA sample ( $\approx$ 300k).

## BNB $\nu_e$ Selection

Efficiency = 55.24% (269 / 497), Purity = 73.70% (269 / 365)



## $v_e$ Selection (with PID score thresholding)

Efficiency = 55.24% (269 / 497), Purity = 73.70% (269 / 365)



Selected 1eNp Interactions

# NuMI $\nu_e$ Selection Dan Carber



## Sample and Data Processing

MC samples

- NuMI  $\nu$  + out of time cosmics (~300k events)
  - Samweb def:

icaruspro\_production\_v09\_89\_01\_01p01\_2024A\_ICARUS\_NuMI\_MC\_NuMI\_MC\_{caf,larcv}

- NuMI  $v_e$  + out of time cosmics (~100k events)
  - Samweb def:

icaruspro\_production\_v09\_89\_01\_01p01\_2024A\_ICARUS\_NuMI\_nue\_MC\_NuMI\_nue\_MC\_{ caf,larcv}

Run 2 Data

- NuMI Offbeam Majority
  - LArCV files have been transferred to SLAC
- NuMI Onbeam Majority (~2.4E20 POT)
  - LArCV files have been transferred to SLAC

Selection of 1eNp(N > 0)

Containment:

Require depositions to be within the TPC that it was collected only for tracks

- 5 cm margin on TPC borders
- -5 cm margin on the cathode

Signal Definition:

Selecting primary particles associated to interaction

- Electrons must be greater than 70 MeV
- Protons must be greater than 40 MeV
- All other particles > 25 MeV
- 1eNp: 1 primary electron and N>0 primary protons

Flash Matching:

Utilizing OpTOFinder to constrain flash match to be withing NuMI beam window 0-9.6 µseconds Conversion distance cut:

Requires closest point of primary shower to be < 2 cm from the vertex



## Selection of 1eNp (N > 0)

	Signal: 1eNp (N > 0)					
Cuts	Efficiency %	# Efficiency	Purity %	# Purity		
Containment	94.4%	$\frac{12272}{12998}$	.028%	2211 793717		
Flash Match	90.6%	$\frac{11779}{12998}$	.98%	$\frac{1938}{201677}$		
Final State	60.3%	$\frac{7833}{12998}$	75.8%	$\frac{1224}{1614}$		
Conversion Distance	51.5%	$\frac{6691}{12998}$	81.4%	$\frac{1040}{1278}$		

Purity is done with NuMI  $\nu$  + cosmics (~300k events), Efficiency is done with NuMI  $\nu_e$  + cosmics (~100k events)

### **Energy Reconstruction of Showers**

Reco Good Shower Energy Vs. True Shower Energy



![](_page_16_Figure_3.jpeg)

## Energy Spectrum of 1eNp Selection

![](_page_17_Figure_1.jpeg)

![](_page_17_Picture_2.jpeg)

## Efficiency, Purity Vs. Energy

![](_page_18_Figure_1.jpeg)

Overall Efficiency: 51.5%

Overall Purity: 81.4%

Efficiency drop at higher energies are due to the training sample energy ranges

## Conclusion and Next Steps

BNB  $\nu_{\rm e}$ 

- Utilizing shower  $\frac{dE}{dx}$  to remove  $v_{\mu}$  NC backgrounds
- Selections that have removed most background events
  - Most backgrounds are now due to signal definitions and events that resemble 1eNp events
- Planning for full description of MC systematics in the coming month
- BNB  $\nu_{\rm e}$  selection demonstration paper by end of the calendar year
- Thesis defense by sometime during March or before

NuMI  $\nu_{\rm e}$ 

- Identify sources of efficiency loss and apply fixes
  - Fix vertex reconstruction
  - Apply new trainings from samples with larger energy ranges
- Look into reducing NC pi0 background
  - Utilizing reconstructed pi0 mass peak
  - This will help with CC  $v_{\rm e}$  Inclusive
- Data/Monte Carlo comparisons with 10% unblinded data from Run 2
- Plan for NuMI 1eNp cross-section result by summer of 2025

## Back Up Slides

![](_page_20_Picture_1.jpeg)

#### Multi-Shower Check

![](_page_21_Figure_1.jpeg)

- 2. Normalize and map to unit sphere
- 3. Cluster points on unit sphere using DBSCAN and cosine distance.
- 4. Measure mean direction vector for each clusters

## 1. Compute displacement vectors from shower start to all points

![](_page_21_Figure_6.jpeg)

#### Multi-Shower Check

![](_page_22_Figure_1.jpeg)

5. Compute separation angle between mean vectors 6. If  $\theta \ge \theta_{threshold}$ , reject shower as candidate electron shower.

![](_page_22_Figure_3.jpeg)

ICARUS ML Meeting

#### Multi-Shower Check

![](_page_23_Figure_1.jpeg)

5. Compute separation angle between mean vectors 6. If  $\theta \ge \theta_{threshold}$ , reject shower as candidate electron shower.

![](_page_23_Figure_3.jpeg)

#### Track-Shower Merger

![](_page_24_Figure_1.jpeg)

![](_page_24_Figure_2.jpeg)

ICARUS ML Meeting

- ν<sub>μ</sub> NC: 12% (45 events)
  - 48% (22/45) due to 1gNp-like events (g is attached to vertex)
    - $\gamma$  from  $\pi^0$  decay either escaping detector volume entirely, or second shower barely visible
  - 31% (14/45) due to 2gNp-like events (one g attached, usually merged)
    - Mostly due to two-arm cut failures
  - 4/45 are (visually) detached 1gNp events, but passed shower-vertex adjacency due to small pixels near vertex
  - 4/45 Dalitz decay
  - 5/45 pid mistakes (p -> pi, and other)

#### Nue Selection (before shower containment removal + truth primary label fix)

- ν<sub>e</sub> CC (non-signal): 10% (36 events)
  - 33% (12/36) due to low energy protons (1e -> 1e1p)
  - 42% (15/36) due to p -> pi pid mistakes
  - 5 / 36 true nonfiducial / true uncontained, but reconstructed as valid 1eNp
  - 3 / 36 proton inelastic GENIE non-primaries having particle startpoint just outside
     0.5cm true vertex true particle startpoint threshold.

#### Nue Selection

![](_page_27_Figure_1.jpeg)

#### Nue Selection

![](_page_28_Figure_1.jpeg)

#### Nue Selection (1g1p -> 1e1p)

![](_page_29_Figure_1.jpeg)

ICARUS ML Meeting

#### Nue Selection (1g1p -> 1e1p)

![](_page_30_Figure_1.jpeg)

ICARUS ML Meeting

## 1eNp Selection Background breakdown

![](_page_31_Figure_1.jpeg)

#### Other $v_e$

- 55/100 1e1piNp
- 19/100 1e1pi
- 18/100 1e
- 3/100 1e2piNp
- 1/100 1g1e
- 1/100 1e2pi
- 1/100 1g1e2p
- 1/100 2g1e1pi
- 1/100 2g1e3p

#### $u_{\mu}$

- 14/30 1muNp
- 7/30 2g1muNp
- 4/30 1mu1piNp
- 1/30 1mu
- 2/30 1g1m1piNp
- 1/30 2g1m1pi
- 1/30 1e1m7p

## Efficiency and Failure Mode Breakdown

![](_page_32_Figure_1.jpeg)