



Results from NOvA

Ryan Nichol



### NOvA Experiment

- Longest baseline accelerator neutrino search
  - NuMI is a beam of mainly muonneutrinos created at Fermilab
  - Two functionally identical detectors
- Measured muon-neutrino disappearance and electron-neutrino appearance
  - And starting to do the same with anti-neutrinos
- Sensitive to PMNS matrix, mass hierarchy, CP violation, sterile neutrinos, interaction physics, supernova, ...



#### How to make a neutrino beam

![](_page_2_Figure_1.jpeg)

120GeV protons from the main injector

- Focus secondary pions using magnetic horns
  - Focus positive hadrons for neutrino beam, negative for antineutrino
- Pions decay to produce muon neutrinos
  - Decay kinematics mean a detector at 14.6mrad sees a narrowly peaked energy spectrum
- 97.5% muon-neutrino, only 0.7% electronneutrino (remainder wrong-sign)

![](_page_2_Figure_8.jpeg)

Rock

#### NuMI Beam Performance

- Results today from data collected between February 6, 2014 and May 2, 2016
- Data equivalent to 6.05x10<sup>20</sup> protons-on-target in a full 14 kT detector
- Achieved 700 kW design goal, most powerful neutrino beam in the world
- Switched to antineutrino beam

![](_page_3_Figure_5.jpeg)

#### NOvA Detectors

![](_page_4_Figure_1.jpeg)

- Extruded plastic cells alternating vertical and horizontal orientation filled with liquid scintillator
- Charged particles passing through cells produce light which is collected by a wavelength shifting fibre

Particle Trajectory

> Waveshifting Fiber Loop

> > 3.9cm 6.6cm

#### Far Detector 550 µs Readout Window

![](_page_5_Figure_1.jpeg)

NOvA @ NeuTel, Ryan Nichol Cell hits coloured by recorded charge (~photoelectrons)

#### Far Detector 10 µs NuMI Beam Window

![](_page_6_Figure_1.jpeg)

NOvA @ NeuTel, Ryan Nichol Cell hits coloured by recorded charge (~photoelectrons)

#### Far Detector Neutrino Interaction

![](_page_7_Figure_1.jpeg)

NOvA @ NeuTel, Ryan Nichol Cell hits coloured by recorded charge (~photoelectrons)

#### **Event Topologies**

![](_page_8_Figure_1.jpeg)

#### **Detector Calibration**

- Cosmic ray muons used to correct attenuation
- Stopping muons used as a standard candle

![](_page_9_Figure_3.jpeg)

![](_page_9_Figure_4.jpeg)

![](_page_9_Figure_5.jpeg)

![](_page_9_Figure_6.jpeg)

#### Muon-neutrino disappearance

![](_page_10_Picture_1.jpeg)

## Muon-Neutrino Disappearance

- Two-flavour approximation still basically valid (although analysis uses full three-flavour formalism)
- Measure neutrinos in the ND
- 'Extrapolate' measurements to form FD prediction
  - Taking into account geometry, efficiencies, purities, energy resolutions, etc.
- Compare FD data to predictions to find the best fit oscillation parameters

![](_page_11_Figure_6.jpeg)

 $P(v_{\mu} \rightarrow v_{\mu}) = 1 - \sin^2 \left(2\theta\right) \sin^2 \left(1.27\Delta m^2 L / E\right)$ 

![](_page_11_Figure_8.jpeg)

## Muon-Neutrino Selection

- Separate  $v_{\mu}$ -CC interactions from NC and cosmic-ray backgrounds
- Containment cuts remove activity near walls
- Four variable k-Nearest Neighbour to select muons
  - Track length
  - dE/dx along track
  - Scattering along track
  - Track-only plane fraction
- Selection is 81% efficient and 91% pure

![](_page_12_Figure_9.jpeg)

#### **Cosmic Rejection**

- Far Detector is on the surface and sees
  150 kHz of cosmic induced events
- 10 µs beam window every 1.3s reduces background by 10<sup>5</sup>
- Additional factor of 10<sup>7</sup> rejection achieved from event topology and a boosted decision tree (BDT) based on:
  - track direction
  - start/end points of track
  - track length
  - energy
  - number of hits
- Predict 2.7 cosmic background events

Good spills Data quality Cosmic rej. Containment **Cosmic background** NC rejection CC v\_ prediction (max. mixing) E<5 GeV 10<sup>5</sup>  $10^{2}$  $10^{3}$ **10**<sup>4</sup>  $10^{6}$  $10^{7}$ 10 Number of events in the spill window

#### **NOvA Preliminary**

![](_page_13_Figure_12.jpeg)

## **Energy Estimation**

- Muon dE/dx used in length-to-energy conversion
- Hadronic energy estimated from calorimetric sum of non-muon hits
- ~7% resolution on neutrino energy

![](_page_14_Figure_4.jpeg)

## **Energy Estimation**

- Muon dE/dx used in length-to-energy conversion
- Hadronic energy estimated from calorimetric sum of non-muon hits ٠
- ~7% resolution on neutrino energy

![](_page_15_Figure_4.jpeg)

## Extrapolation

- Use high statistics ND data/MC to adjust prediction at FD
  - Translate ND data/MC observation to true energy
  - Oscillate ratio to the FD
  - Smear back into reconstructed energy

![](_page_16_Figure_5.jpeg)

## Muon-Neutrino Disappearance

- Using 6.05x10<sup>20</sup> POT equivalent
- 473 +/- 30 events predicted in the absence of oscillations
- Observed 78 events
- 82 events predicted at the best fit point including 3.7 beam background and 2.9 cosmic induced events

arXiv:1701.05891

![](_page_17_Figure_6.jpeg)

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![](_page_18_Figure_6.jpeg)

#### Muon-Neutrino Disappearance

![](_page_19_Figure_2.jpeg)

- Maximal-mixing disfavoured at 2.6 sigma
- Interesting tension between NOvA and T2K, new results eagerly anticipated

## Electron-Neutrino Appearance

![](_page_20_Picture_1.jpeg)

## Electron-Neutrino Appearance

- Electron-neutrino appearance is a sub-dominant oscillation mode at the NOvA L/E
- Matter effects matter (almost 3 times longer baseline than T2K)
- Sensitive to
  - Mass hierarchy
  - · CP violating phase
  - Octant of  $\theta_{23}$

![](_page_21_Figure_7.jpeg)

## New Classification Algorithm

![](_page_22_Picture_1.jpeg)

![](_page_22_Picture_2.jpeg)

![](_page_22_Picture_3.jpeg)

- Take advantage of recent advances in machine learning/computer vision
- Deep networks extract complex features from input data, GPUs greatly improve training time
- · Inputs to the network are pixels in image
- Apply convolutional kernels to pull out event features

#### Convolutional Visual Network (CVN) Selection

• Showing a muon neutrino interaction and the first layer of feature maps extracted from the convolutional kernels

![](_page_23_Figure_2.jpeg)

#### **Convolutional Neural Networks**

- Showing a electron neutrino interaction and the first layer of feature maps extracted from the convolutional kernels
- The strong features extracted are the shower as opposed to the track

![](_page_24_Figure_3.jpeg)

#### **Electron Neutrino Selection**

#### arXiv:1703.03328

![](_page_25_Figure_2.jpeg)

- 73%  $v_{\rm e}$  CC selection efficiency, 76% purity with CVN classifier
- Good ND Data/MC agreement
- CVN provides better cosmic rejection and similar systematics to 2015
  classifiers

#### **Electron Neutrino Selection**

#### arXiv:1703.03328

![](_page_26_Figure_2.jpeg)

Bin analysis in four bins of energy and three of CVN

#### Data Driven Background Corrections

- v<sub>e</sub>-CC selection in the ND picks out FD backgrounds
  - Beam v<sub>e</sub>-CC
  - $v_{\mu}$ -CC
  - Neutral current
- ~10% excess of data over MC in the ND
- Extrapolate data/MC differences to adjust FD prediction
- Each component oscillates differently
- Must decompose the data into constituent components

![](_page_27_Figure_10.jpeg)

#### arXiv:1703.03328

## Electron-neutrino appearance

- Observe 33 events on background of 8.2 +/- 0.8 events
- Over 8 significance of • electron-neutrino appearance

![](_page_28_Figure_3.jpeg)

![](_page_28_Figure_4.jpeg)

# $v_{\mu} \rightarrow v_{e}$ Oscillation Results

- Fit for hierarchy,  $\delta_{CP}$ ,  $\sin^2 \theta_{23}$ 
  - Constrain  $\sin^2 2\theta_{13} = 0.085 \pm 0.005$  from reactor experiments
  - Simultaneous fit NOvA disappearance data
- Global best fit, two degenerate points in Normal Hierarchy

$$\delta_{cp} = 1.48\pi, \sin^2(\theta_{23}) = 0.404$$

$$\delta_{cp} = 0.74\pi, \sin^2(\theta_{23}) = 0.623$$

- best fit IH-NH,  $\Delta \chi 2=0.47$
- Lower octant, IH is disfavoured at greater than 93% C.L for all values of  $\delta_{\rm CP}$

![](_page_29_Figure_9.jpeg)

arXiv:1703.03328

#### Looking Forward

![](_page_30_Figure_1.jpeg)

- Switched to anti-neutrino running in February 2017
- Run 50% neutrino, 50% anti-neutrino after 2018
  - 3  $\sigma$  sensitivity to maximal mixing of  $\theta_{23}$  in 2018
  - 2  $\sigma$  sensitivity to mass hierarchy and  $\theta_{23}$  octant in 2018-2019

#### Conclusions

- Analysis of 6.05x10<sup>20</sup> POT of NOvA data (1 nominal year)
- Muon-neutrino disappearance (<u>arXiv:1701.05891</u>)
  - Best fit is non-maximal value of  $\theta_{23}$ , maximal mixing disfavoured at 2.5 $\sigma$
- Electron neutrinos appearance (arXiv:1703.03328)
  - First joint fit of NOvA appearance and disappearance data
  - Weak preference for normal hierarchy
  - Inverted hierarchy, lower octant is disfavoured at > 93% C.L.
- Didn't mention sterile neutrino search, neutrino interaction, supernova, monopoles, and a lot more
- Switched to anti-neutrino running just a few weeks ago

![](_page_32_Picture_0.jpeg)

![](_page_33_Figure_0.jpeg)

$$\begin{split} & \forall \mu \longrightarrow \forall e \text{ Appearance channel} \\ & \forall \mu \longrightarrow \forall e \text{ Appearance channel} \\ & \mathsf{P}(v_{\mu} \rightarrow v_{e}) \approx \left| \sqrt{P_{atm}} e^{-i(\Delta_{32} + \delta)} + \sqrt{P_{sol}} \right|^{2} \\ & = P_{atm} + P_{sol} + 2\sqrt{P_{atm}} P_{sol} (\cos \Delta_{32} \cos \delta \mp \sin \Delta_{32} \sin \delta) \\ & \sqrt{P_{atm}} = \sin \theta_{23} \sin 2\theta_{13} \frac{\sin(\Delta_{31} - aL)}{\Delta_{31} - aL} \Delta_{31} \\ & \mathsf{Depends on relative sign of "a"} \\ & \mathsf{and } \Delta_{31} \\ & \sqrt{P_{sol}} = \cos \theta_{23} \sin 2\theta_{12} \frac{\sin(aL)}{aL} \Delta_{21} \\ & a = \frac{G_{F}N_{e}}{\sqrt{2}} \approx \frac{1}{3500km} \\ & \mathsf{aL} = 0.08 \text{ for } L = 295 \text{km T2K baseline} \\ & \mathsf{aL} = 0.23 \text{ for } L = 810 \text{km NOvA} \\ & \mathsf{baseline} \\ & \mathsf{Oscillation probability is} \\ & \mathsf{sensitive to: mass ordering,} \\ & \mathsf{CP violating phase, and } \theta_{23} \\ & \mathsf{octant} \\ \end{split}$$

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![](_page_35_Picture_0.jpeg)

![](_page_36_Picture_0.jpeg)

## Convolutional Neural Networks

- Architecture adapted from GoogLeNet
  - · C. Szegedy et al., arXiv:1409.4842
  - Input is 80 cell x 200 plane detector pixel map
  - Each event view processed separately and then merged
- Network implemented and trained in the Caffe Framework (Y. Jia et al., arXiv:1408.5093)
- Trained on 4.7 million simulated events on Fermilab GPU cluster
- Output classifies neutrino interaction type (v\_{\mu},v\_{\tau},v\_{e},NC)
- Used in appearance analysis.
- Performance gain over previous classifiers equivalent to adding 30% more detector mass
   A. Aurisano and A. Radovic and D. Rocco et. al,

JINST 11 P09001 (2016) 38 NOvA @ NeuTel, Ryan Nichol

Concatenation Softmax Output 3×3 Convolution 5×5 Convolution 1×1 Convolution Avg Pooling 6×5 1×1 Convolution 1×1 Convolution 3×3 Pooling Inception Module Previous Layer Inception Inception Module Module Max Pooling Max Pooling  $3 \times 3$ , stride 2 3×3, stride 2 Inception Inception Module Module Inception Inception Module Module Max Pooling Max Pooling  $3 \times 3$ , stride 2  $3 \times 3$ , stride 2 LRN LRN Convolution Convolution 3×3 3×3 Convolution Convolution 1×1 1×1 LRN LRN Max Pooling Max Pooling  $3 \times 3$ , stride 2  $3 \times 3$ , stride 2 Convolution Convolution  $7 \times 7$ , stride 2  $7 \times 7$ , stride 2 X View Y View

Filter

1×1 Convolution

![](_page_38_Figure_0.jpeg)

t-SNE representation of CVN classification. Truth labels shown for the training sample.

![](_page_39_Figure_0.jpeg)

t-SNE representation of CVN classification. Truth labels shown for the training sample.

## Systematic Uncertainties

Various sources of systematic uncertainty considered

 Propagate the effect of each though the extrapolation with specially modified MC samples

• Include as pull terms in fit

 Table shows increase in quadrature of measurement uncertainty

Systematic	Effect on sin²(θ <sub>23</sub> )	Effect on Δm <sup>2</sup> 32	
Normalisation	± 1.0%	± 0.2 %	
Muon E scale	± 2.2%	± 0.8 %	
Calibration	± 2.0 %	± 0.2 %	
Relative E scale	± 2.0 %	± 0.9 %	
Cross sections + FSI	± 0.6 %	± 0.5 %	
Osc. parameters	± 0.7 %	± 1.5 %	
Beam backgrounds	± 0.9 %	± 0.5 %	
Scintillation model	± 0.7 %	±0.1%	
All systematics	± 3.4 %	± 2.4 %	
Stat. Uncertainty	± 4.1 %	± 3.5 %	

#### vµ -> vµ Oscillation Results

![](_page_41_Figure_1.jpeg)

Best fit  $\chi 2/DOF = 41.5/17$  is driven by the high energy tail

There is no pull in the oscillation fit from the tail

#### **NOvA Preliminary**

## **Evaluating Signal Efficiency**

- Remove cosmic ray muon from FD events in data and simulation
- Apply selection to remaining bremsstrahlung shower to benchmark simulation of electron selection

![](_page_42_Figure_4.jpeg)

![](_page_42_Figure_5.jpeg)

- EM showers should be well modelled, check if selection efficiency differences come from hadronic side
- Remove reconstructed muons from selected vµ events, replace with simulated electron (MRE)
- better than 1% agreement between efficiency for selecting data MRE events and efficiency for selecting MC MRE events

### ND Data Decomposition: Beam v<sub>e</sub> CC

- Low energy  $v_{\mu}$  and  $v_{e}$  trace back to the same  $\pi$  ancestors
- Use  $v_{\!\scriptscriptstyle \rm U}$  at lower energy to reweight decaying pions in (pT , pz ) space
- Decreases  $v_e$  with  $\pi$ + parent 3-4%
- Weight  $v_e$  with K+ parents up 17% based on  $v_u$  high-E tail
- Overall effect is 1% increase in 1-3 GeV range in intrinsic beam  $v_e$  CC events

![](_page_43_Figure_6.jpeg)

#### ND Data Decomposition: Michel Electrons

![](_page_44_Figure_1.jpeg)

- +  $v_{\mu}$  CC events contain Michel electron from muon decay
- ~1 more Michel in  $v_{\mu}$  events then  $v_{e}$  or NC
- Fit observed number of Michels in each bin of energy and PID by adjusting  $v_{\mu}/NC$  ratio
- Data excess assigned between NC (+17%) and  $v_{\mu}$  CC (+10%)

#### Systematic Uncertainties

![](_page_45_Figure_1.jpeg)

- Multiple sources of systematic error considered
- Extrapolate FD predictions with special MC samples for each effect.
- Uncertainty quoted as difference between shifted and nominal predictions
- Fit nuisance parameters as pull terms
- · Statistical uncertainties dominate

#### $v\mu$ -> ve Oscillation Prediction

 Prediction dependent on oscillation parameters

Signal events  $(\pm 5\%$  systematic uncertainty):

NH, 3π/2,	IH, π/2,
28.2	11.2

![](_page_46_Figure_4.jpeg)

#### Background by component

 $(\pm 10\%$  systematic uncertainty):

Total BG	NC	Beam v <sub>e</sub>	$v_{\mu}$ CC	$v_{\tau}$ CC	Cosmics
8.2	3.7	3.1	0.7	0.1	0.5

#### **NOvA Preliminary**

# $v_{\mu} \rightarrow v_{e}$ Oscillation Results

- Fit for hierarchy,  $\delta$ CP, sin2023
  - Constrain sin2(2θ13)=0.085±0.05
  - Constrain
    Δm2=2.44±0.06x10-3 eV2,
    NH
  - (-2.49±0.06x10-3 eV2, IH)
- Systematic effects included as nuisance parameters (normalization, flux, calibration, cross section, and detector response effects

![](_page_47_Figure_7.jpeg)

#### **Nuclear Model Corrections**

Near Detector hadronic energy distribution suggests unsimulated process between quasi-elastic and delta production

![](_page_48_Figure_2.jpeg)

Similar conclusions from MINERvA data reported in P.A. Rodrigues et al., PRL 116 (2016) 071802

![](_page_48_Figure_4.jpeg)

Solution: 2-particle, 2-hole (2p2h) events where neutrino is scattering off a nucleon-nucleon pair

![](_page_48_Picture_6.jpeg)

#### **Nuclear Model Corrections**

- Enable GENIE's emperical Meson Exchange Current model<sup>1</sup>
- Reweight to matched observed excess as a function of momentum transfer

**NOvA** Preliminary

🚰 Fermilab

• Weight single non-resonant pion production down by effectively 50%<sup>2</sup>

![](_page_49_Figure_4.jpeg)

<sup>1</sup>S. Dytman, based on J. W. Lightbody, J. S. OConnell, Comp. in Phys. 2 (1988) 57 <sup>2</sup>P.A. Rodrigues et al., arXiv:1601.01888

![](_page_49_Picture_6.jpeg)

#### **Nuclear Model Corrections**

- Take 50% systematic uncertainty on MEC component
- Reduces hadronic energy scale and quasi-elastic cross section systematic uncertainties

![](_page_50_Figure_3.jpeg)

<sup>1</sup>S. Dytman, based on J. W. Lightbody, J. S. OConnell, Comp. in Phys. 2 (1988) 57 <sup>2</sup>P.A. Rodrigues et al., arXiv:1601.01888

![](_page_50_Picture_5.jpeg)

# NC disappearance results

![](_page_51_Picture_1.jpeg)

#### Observe 95 NC-like event in Far Detector MC extrapolated prediction: 83.71 ± 9.15 (stat.) ± 8.28 (syst.) within 1σ of three-flavour prediction NOvA sees no evidence for sterile neutrino mixing

![](_page_51_Figure_3.jpeg)

**NOvA Preliminary** 

JETP seminar, Fermilab - 07/29/2016

# Far detector NC selection

![](_page_52_Picture_1.jpeg)

FD NC selection uses the same variables as the ND selection, with identical cut values

![](_page_52_Figure_3.jpeg)

#### **NOvA** Preliminary

## R-ratio comparison with 3-flavour

![](_page_53_Picture_1.jpeg)

![](_page_53_Figure_2.jpeg)

JETP seminar, Fermilab - 07/29/2016

G. S. Davies (Indiana U.), NOvA

Calorimetric Energy (GeV)

# 3+1 model

![](_page_54_Picture_1.jpeg)

$$1 - P(\nu_{\mu} \rightarrow \nu_{s}) \approx 1 - \cos_{14}^{4} \cos_{34}^{2} \sin^{2}2\theta_{24} \sin^{2}\Delta_{41} - \frac{\sin_{34}^{2}}{\sin^{2}2\theta_{23}} \sin^{2}\Delta_{31} - \frac{1}{2} \sin\delta_{24} \sin_{24} \sin^{2}\theta_{34} \sin^{2}\theta_{23} \sin^{2}\Delta_{31}$$

![](_page_54_Figure_3.jpeg)

## 3+1 1D limits

![](_page_55_Picture_1.jpeg)

![](_page_55_Figure_2.jpeg)

For 0.05 eV<sup>2</sup> <  $\Delta m_{41}^2$  < 0.5 eV<sup>2</sup>:  $\theta_{24}$  < 21° at 90% C.L.  $|U_{\mu4}|^2$  < 0.14 at 90% C.L.  $\theta_{34}$  < 35° at 90% C.L.  $|U_{\tau4}|^2$  < 0.33 at 90% C.L.

#### **Future Sterile Sensitivities**

![](_page_56_Figure_1.jpeg)

Competitive with current best  $\theta_{34}$  limits (Super-K)

![](_page_56_Picture_3.jpeg)

#### **NOvA Physics Results**

- 1.  $v_{\mu} \rightarrow v_{\mu}$  disappearance channel
  - Clear deficit of  $v_{\mu}$  CC events as a function of energy
  - Sensitive to  $|\Delta m^2_{32}|$  and  $\sin^2(2\theta_{23})$
  - 2015 analysis results
    Phys.Rev.D93.051104

![](_page_57_Figure_5.jpeg)

- 2.  $v_{\mu} \rightarrow v_e$  appearance channel
  - Matter effect enhanced by 810 km baseline
  - Sensitive to  $\theta_{13}$ ,  $\theta_{23}$ ,  $\delta_{CP}$ , and mass hierarchy
  - 2015 analysis results PRL.
    116.151806

- 3. Disappearance of neutral current events
  - Evidence for oscillations involving additional sterile neutrinos
  - Fit to a 3+1 neutrino model
  - $\Delta m^2_{41}, \, \theta_{34}, \, \theta_{24}$
  - New result

Additionally, many cross section measurements, exotic physics searches and non-beam physics studies underway.

![](_page_57_Picture_16.jpeg)