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# Neutrinos through a PRISM

Rutherford Appleton Laboratory Luke Pickering 2020-11-17

Pronouns: He/Him/His





# My Background

- PhD On T2K At Imperial College London
- PDRA at Michigan State since July 2017
   T2K
  - Neutrino Interactions Working Group Convener
  - DUNE
    - DUNE-PRISM working group convener
    - A leader analyzer for the recent TDR oscillation sensitivity study
      - Motivating DUNE beam neutrino flux uncertainties

#### • NUISANCE

 Lead developer of framework for comparing and tuning neutrino interaction generator predictions to published cross section data.





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#### This Talk

- Primer: Neutrino Oscillations
- State of the Nation: A T2K Perspective
- Introduction to DUNE
- The DUNE-PRISM Concept











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What is the mass ordering of the neutrino mass states?

What are the precise values of the neutrino oscillation parameters?





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Is there significant CP violation in the neutrino sector?

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Could neutrino sector CP violation explain the matter/anti-matter asymmetry?





What is the mass ordering of the neutrino mass states?

What are the precise values of the neutrino oscillation parameters?

#### Experiment

Is there significant CP violation in the neutrino sector?

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Could neutrino sector CP violation explain the matter/anti-matter asymmetry?

Theory





# **Primer: Neutrino Oscillations**





#### Neutrinos



#### • Three generations of matter:

 Three neutrinos paired with charged leptons: electron, muon, tau.

#### Neutrinos are:

- Electro-magnetically neutral
- Massless within the standard model
- Interact via mainly via the weak force.
- Absurdly abundant



#### **Neutrino Sources**



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$$\begin{pmatrix} \nu_e \\ \nu_\mu \\ \nu_\mu \end{pmatrix} = \begin{bmatrix} U_{e1} & U_{e2} & U_{e3} \\ U_{\mu 1} & U_{\mu 2} & U_{\mu 3} \\ U_{\tau 1} & U_{\tau 2} & U_{\tau 3} \end{bmatrix} \begin{pmatrix} \nu_1 \\ \nu_2 \\ \nu_3 \end{pmatrix}$$

$$\underbrace{\mathbf{M}_{\rm PMNS}}_{\rm Momentary Methods}$$
Pontecorvo-Maki-Nakagawa-Sakata



Journal of Physics G: Nuclear and Particle Physics. 43. 10.1088/0954-3899/43/8/084001



#### **Neutrino Oscillation: PMNS**

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$$\underbrace{\mathbf{M}_{PMNS}}_{\mathbf{M}_{PMNS}}$$
Pontecorvo–Maki–Nakagawa–Sakata

#### **Re-parameterizing the PMNS**

$$\begin{pmatrix} \nu_e \\ \nu_\mu \\ \nu_\tau \end{pmatrix} = \begin{pmatrix} 1 & 0 & 0 \\ 0 & c_{23} & s_{23} \\ 0 & -s_{23} & c_{23} \end{pmatrix} \begin{pmatrix} c_{13} & 0 & s_{13}e^{-i\delta_{CP}} \\ 0 & 1 & 0 \\ -s_{13}e^{i\delta_{CP}} & 0 & c_{13} \end{pmatrix} \begin{pmatrix} c_{12} & s_{12} & 0 \\ -s_{12} & c_{12} & 0 \\ 0 & 0 & 1 \end{pmatrix} \begin{pmatrix} \nu_1 \\ \nu_2 \\ \nu_3 \end{pmatrix}$$

- Unitarity lets us re-parameterize PMNS matrix in terms of:
  - Three mixing angles:  $C_{ij} = cos(\theta_{ij})$
  - CP violating phase:  $0 < \delta_{CP} < 2\pi$

#### **Re-parameterizing the PMNS**



- Unitarity lets us re-parameterize PMNS matrix in terms of:
  - Three mixing angles:  $C_{ii} = cos(\theta_{ii})$
  - CP violating phase:  $0 < \delta_{CP} < 2\pi$

# **Oscillation Channels**

• Long baseline experiments study two oscillation channels:

#### Muon neutrino disappearance



**Electron neutrino appearance** 

 $\nu_{\mu} 
ightarrow 
u_{
m e}$ 





# **Oscillation Channels**

• Long baseline experiments study two oscillation channels:



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### **Muon Neutrino Disappearance**

 To leading order, muon neutrino survival probability depends on mixing angles, and mass-squared splittings.

$$\begin{split} P(\nu_{\mu} \rightarrow \nu_{\mu}) \simeq 1 - 4 \cos^2 \theta_{13} \sin^2 \theta_{23} \\ \times \left[1 - \cos^2 \theta_{13} \sin^2 \theta_{23}\right] \sin^2 \frac{\Delta m_{32}^2 L}{4E} \\ + (\text{solar, matter effect terms}) \end{split}$$

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# **Muon Neutrino Disappearance**

 $\rightarrow 
u_{\mu}$ 

 $P(
u_{\mu}$ 

- To leading order, muon neutrino survival probability depends on mixing angles, and mass-squared splittings.
- Choose L/E for maximum effect:

$$\sin^2\left(\Delta m_{23}^2 L/4E\right) \simeq 1$$

$$P(\nu_{\mu} \rightarrow \nu_{\mu}) \simeq 1 - 4\cos^{2} \theta_{13} \sin^{2} \theta_{23}$$

$$\times [1 - \cos^{2} \theta_{13} \sin^{2} \theta_{23}] \sin^{2} \frac{\Delta m_{32}^{2} L}{4E}$$

$$+ (\text{solar, matter effect terms})$$

$$\int_{1}^{0.8} \Delta m_{32}^{2} = 2.56 \text{ xl} 0^{-3} \text{ eV}^{2}$$

$$L = 295 \text{ km}$$

$$\int_{0}^{1} \text{First maximum}$$

$$First maximum$$

$$E_{\nu}(\text{GeV})$$









 Mass-squared splitting shifts the 'dip'







# **Oscillation Channels**

• Long baseline experiments study two oscillation channels:

#### Muon neutrino disappearance





### **Electron Neutrino Appearance**

- Electron neutrino appearance probability has 'CP odd' term.
  - Sign flip between matter and antimatter.

 $P(\stackrel{(\leftrightarrow)}{\nu_{\mu}} \rightarrow \stackrel{(\leftrightarrow)}{\nu_{e}}) \simeq \sin^{2} \theta_{23} \sin^{2} 2\theta_{13} \sin^{2} \frac{\Delta m_{32}^{2} L}{4E}$   $(+)-\left[\sin 2\theta_{12} \sin 2\theta_{23} \sin 2\theta_{13} \cos \theta_{13} + (\text{CP-even, solar, matter effect terms})\right]$ 

### **Electron Neutrino Appearance**

- Electron neutrino appearance probability has 'CP odd' term.
  - Sign flip between matter and antimatter.

$$P(\stackrel{()}{\nu_{\mu}} \rightarrow \stackrel{()}{\nu_{e}}) \simeq \sin^{2} \theta_{23} \sin^{2} 2\theta_{13} \sin^{2} \frac{\Delta m_{32}^{2} L}{4E}$$

$$(+) - \left[ \sin 2\theta_{12} \sin 2\theta_{23} \sin 2\theta_{13} \cos \theta_{13} - \frac{\Delta m_{21}^{2} L}{4E} \sin^{2} \frac{\Delta m_{32}^{2} L}{4E} \sin^{2} \frac{\Delta m_{32}^{2} L}{4E} \right]$$

$$+ (CP-even, solar, matter effect terms)$$



# **Electron Neutrino Appearance**

- Electron neutrino appearance probability has 'CP odd' term.
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$$\begin{split} P(\stackrel{(\leftarrow)}{\nu_{\mu}} \rightarrow \stackrel{(\leftarrow)}{\nu_{e}}) &\simeq \sin^{2} \theta_{23} \sin^{2} 2\theta_{13} \sin^{2} \frac{\Delta m_{32}^{2} L}{4E} \\ & (+) - \left[ \sin 2\theta_{12} \sin 2\theta_{23} \sin 2\theta_{13} \cos \theta_{13} \right. \\ & \times \sin \frac{\Delta m_{21}^{2} L}{4E} \sin^{2} \frac{\Delta m_{32}^{2} I}{4E} \left. \frac{\sin \delta_{CP}}{4E} \right] \\ & + (\text{CP-even, solar, matter effect terms}) \end{split}$$



T2K B.F. 2018, L=295 km,  $\delta_{CP} = 0$ 

### **Electron Neutrino Appearance**

- Electron neutrino appearance probability has 'CP odd' term.
  - Sign flip between matter and Ο antimatter.



(0.1)

 $E_{\nu}(\text{GeV})$ 

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### **Electron Neutrino Appearance**

- Electron neutrino appearance probability has 'CP odd' term.
  - Sign flip between matter and antimatter.




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# Measuring Neutrino Oscillations with





# **Measuring Neutrino Oscillations**







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• Look for signature 'oscillation' shape in flux at the far detector

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• Look for signature 'oscillation' shape in flux at the far detector

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• Look for signature 'oscillation' shape in flux at the far detector

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• We cannot observe the neutrino flux, only the event rate





• Look for signature 'oscillation' shape in flux at the far detector

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• We cannot observe the neutrino flux, only the event rate



### **Measuring Oscillations: Interactions**

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## **Measuring Oscillations: Interactions**



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## **Measuring Oscillations: Interactions**



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- Look for signature 'oscillation' shape in flux at the far detector
- We cannot observe the neutrino flux, only the event rate





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• Look for signature 'oscillation' shape in flux at the far detector

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We cannot observe the neutrino flux, only the event rate



• Look for signature 'oscillation' shape in flux at the far detector...

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- We cannot observe the neutrino flux, only the event rate
- We have to reconstruct the energy from observables



- Look for signature 'oscillation' shape in flux at the far detector...
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## The T2K Oscillation Analysis









• Wiggle model parameters at the Near Detector







#### • Wiggle model parameters at the Near Detector

• Uses near detector data to constrain model parameters (flux, detector, cross section)







- Wiggle model parameters at the Near Detector
  - Uses near detector data to constrain model parameters (flux, detector, cross section)
- Trust model + uncertainties to predict far detector data for a given oscillation hypothesis.





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- Wiggle model parameters at the Near Detector
  - Uses near detector data to constrain model parameters (flux, detector, cross section)
- Trust model + uncertainties to predict far detector data for a given oscillation hypothesis.

• Infer oscillation parameters from observed data



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## **Model-driven Extrapolation**

- What if the model isn't correct? We can end up:
  - ⇒ Attributing data/MC discrepancy to the wrong energy range at the near detector

# **Model-driven Extrapolation**

- What if the model isn't correct? We can end up:
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  - ⇒ Predicting an incorrect observed far detector spectrum

# **Model-driven Extrapolation**

- What if the model isn't correct? We can end up:
  - $\Rightarrow$  Attributing data/MC discrepancy to the wrong energy range at the near detector
  - ⇒ Predicting an incorrect observed far detector spectrum
  - $\circ \Rightarrow$  Exacting biased oscillation parameters.



• Uncertain 'missing energy' for interactions with bound nucleons.







# An Example from **JZK**

- Uncertain 'missing energy' for interactions with bound nucleons.
- More missing energy → less
  visible lepton energy for the same true neutrino energy.







# An Example from **JZK**

- Uncertain 'missing energy' for interactions with bound nucleons.
- More missing energy → less
  visible lepton energy for the same true neutrino energy.
- Incorrect prediction at far detector induces significant biases in  $\Delta m_{23}^2$







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# **PRISE** State of the Nation





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• Evidence for neutrino oscillation is overwhelming: *c.f.* 2015 Nobel Prize

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- We know: all mixing angles and both mass-squared splittings ≠ 0.

**PDG 2020:** Neutrino Masses, Mixing, and Oscillations  $\sin^2(\theta_{12}) = 0.307 \pm 0.013$  $\Delta m_{21}^2 = (7.53 \pm 0.18) \times 10^{-5} \text{ eV}^2$  $\sin^2(\theta_{23}) = 0.547 \pm 0.021$  (Inverted order)  $\sin^2(\theta_{23}) = 0.545 \pm 0.021$  (Normal order)  $\Delta m_{32}^2 = (-2.546^{+0.034}_{-0.040}) \times 10^{-3} \text{ eV}^2$ (Inverted order)  $\Delta m_{32}^2 = (2.453 \pm 0.034) \times 10^{-3} \text{ eV}^2$ (Normal order)  $\sin^2( heta_{13}) = (2.18 \pm 0.07) imes 10^{-2}$ 

- Evidence for neutrino oscillation is overwhelming: *c.f.* 2015 Nobel Prize
- We know: all mixing angles and both mass-squared splittings ≠ 0.
- Search for CP violation in the neutrino sector—*i*.e. measure δ<sub>CP</sub>
  - $\circ$  Current generation experiments have some sensitivity to  $\delta_{_{CP}}$



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### Search for CP violation in the neutrino sector—*i.e.* measure δ<sub>CP</sub>

- $\circ$  Current generation experiments have some sensitivity to  $\delta_{\rm CP}$ , but disagree on the value...
- Most sensitivity when other parameters are well known

# n: Where are we now?





### Search for CP violation in the neutrino sector—*i.e.* measure δ<sub>CP</sub>

- Current generation experiments have some sensitivity to  $\delta_{CP}$ , but disagree on the value...
- Most sensitivity when other parameters are well known
- Need new experiment for definitive 'five sigma' result...

# n: Where are we now?



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# The Deep Underground Neutrino Experiment





# The Deep Underground Neutrino Experiment



### Collaboration

- >1100 Collaborators
- 34 Countries

### **PMNS Oscillations**

- Unprecedented sensitivity to osc.
   params.
- Measurement of  $\boldsymbol{\delta}_{\text{CP}}$  and mass ordering

### **Rich Physics Program**

- Solar v's NSI
- Geo v's
- SN v's Cross

Banana 1

sections

Sterile v's

# The Deep Underground Neutrino Experiment



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<del>Banana v's</del>

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<del>Banana **v**'s</del>

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Cross

Sterile v's

#### L. Pickering The Deep Underground Neutrino Experiment



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<del>Banana **v**'s</del>

sections

Cross

Sterile v's

# The Deep Underground Neutrino Experiment



# The Deep Underground Neutrino Experiment

• Far Detector

• Near Detector

#### Neutrino beam





 Proton beam strikes a fixed target producing secondary hadrons: mostly pions and kaons

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 Proton beam strikes a fixed target producing secondary hadrons: mostly pions and kaons

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• These are sign-selected and focussed by one or more magnetic horns.



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- Proton beam strikes a fixed target producing secondary hadrons: mostly pions and kaons
- These are sign-selected and focussed by one or more magnetic horns.
- This secondary beam of particles decays to produce neutrinos.



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Neutrino mode, focussing positive particles

- Proton beam strikes a fixed target producing secondary hadrons: mostly pions and kaons
- These are sign-selected and focussed by one or more magnetic horns.
- This secondary beam of particles decays to produce neutrinos.
- The horn current can be inverted to produce mostly anti-neutrinos



Anti-neutrino mode, focussing negative particles

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- Proton beam strikes a fixed target producing secondary hadrons: mostly pions and kaons
- These are sign-selected and focussed by one or more magnetic horns.
- This secondary beam of particles decays to produce neutrinos.
- The horn current can be inverted to produce mostly anti-neutrinos



















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## **Off Axis Fluxes**

 Boosted π decay kinematics result in lower energy neutrinos off beam axis.



- Boosted π decay kinematics result in lower energy neutrinos off beam axis.
  - Exploited by T2K and NOvA to achieve narrow-band beam for maximal oscillation signal at first oscillation maximum



## LBNF: The DUNE Neutrino Beam

- By contrast, DUNE will use an on axis, wide band beam:
  - Access to physics at higher order oscillation maxima where non-standard oscillations expected to be stronger.



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## LBNF: The DUNE Neutrino Beam

- By contrast, DUNE will use an on axis, wide band beam:
  - Access to physics at higher order oscillation maxima
- Unprecedented neutrino rate







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# The Deep Underground Neutrino Experiment

• Far Detector

• Near Detector

• Neutrino beam



#### **DUNE Near Detector Concept**

NDLAr: LAr TPC
• Primary target, similar to FD

<b>DUNE Preliminary</b>	NDLAr FV				NDGAr FV
	All int.	Selected			All int.
Run duration	$N\nu_{\mu}CC$	NSel	WSB	NC	$N\nu_{\mu}CC$
1/2 yr.	$25.5\mathrm{M}$	11.3M	0.2%	1.4%	680,000

#### **DUNE Near Detector Concept**

- NDLAr: LAr TPC
  - Primary target, similar to FD
- NDGAr: GAr TPC + ECal + Low mass magnet
  - Charge/momentum/PID
  - Low threshold neutrino target



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## **DUNE Near Detector Concept**

- ArgonCube: LAr TPC
  - Primary target, similar to FD
- **MPD**: GAr TPC + ECal + Low mass magnet
  - Charge/momentum/PID
  - Low threshold neutrino target
  - SAND: 3D plastic scintillator detector inside a superconducting solenoid:
    - Beam monitor
    - Neutrino interaction physics



<b>DUNE Preliminary</b>	NDLAr FV				NDGAr FV
	All int.	Selected			All int.
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# The Deep Underground Neutrino Experiment

• Far Detector

• Near Detector

• Neutrino beam



• 4x10 kT LAr TPCs



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SURF underground

facilities







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#### SURF underground facilities

#### 4x10 kT LAr TPCs:

Unprecedented FD event resolution and event rate! Ο











# **Oscillation Analysis On DUNE**





• Why can we not just look at near/far ratio?



- Why can we not just look at near/far ratio?
  - Because it isn't quite that simple...

$$N_{\text{near}}(E_{\text{obs}}) = \int dE_{\nu} \Phi_{\text{near}}(E_{\nu}) \cdot \sigma(E_{\nu}) \cdot \mathbf{D}_{\text{near}}$$
$$N_{\text{far}}(E_{\text{obs}}) = \int dE_{\nu} \Phi_{\text{far}}(E_{\nu}) \cdot \mathbf{P}_{osc}(E_{\nu}) \cdot \sigma(E_{\nu}) \cdot \mathbf{D}_{\text{far}}$$
Want to know this

- Why can we not just look at near/far ratio?
  - Because it isn't quite that simple...
  - Convolution of detector effects with flux · cross section
  - Cannot directly compare near and far observables to extract oscillations

$$N_{\text{near}}(E_{\text{obs}}) = \int dE_{\nu} \Phi_{\text{near}}(E_{\nu}) \cdot \sigma(E_{\nu}) \cdot \mathbf{D}_{\text{near}}$$

$$N_{\text{far}}(E_{\text{obs}}) = \int dE_{\nu} \Phi_{\text{far}}(E_{\nu}) \cdot P_{osc}(E_{\nu}) \cdot \sigma(E_{\nu}) \cdot \mathbf{D}_{\text{far}}$$
Want to know this









#### **Off Axis at the Near Detector**



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## **Off Axis at the Near Detector**

- Use a mobile Near Detector
  - Sample different neutrino energy spectra at different positions





## Off Axis at the Near Detector

- Use a mobile Near Detector
  - Sample different neutrino energy spectra at different positions

 $E_{\nu}$  (GeV)

• Build up 2D measurement





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### Off Axis at the Near Detector

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 $E_v$  (GeV)

### **Off Axis at the Near Detector**









### **Discrete Fourier Transforms**

 Approximate function as a linear sum of sines and cosines





### **Discrete Fourier Transforms**

 Approximate function as a linear sum of sines and cosines



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### **Discrete Fourier Transforms**

 Approximate function as a linear sum of sines and cosines



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 Approximate function as a linear sum of sines and cosines



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### **Building an Oscillated Flux**

• Want to measure oscillated flux at the near detector





### **Building an Oscillated Flux**

- Want to measure oscillated flux at the near detector
  - Try to decompose into a linear sum of off-axis near detector fluxes (c.f. Discrete FT)





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- Want to measure oscillated flux at the near detector
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  - Solve for weights at each off axis position





### **Building an Oscillated Flux**

- Want to measure oscillated flux at the near detector
  - Try to decompose into a linear sum of off-axis near detector fluxes (c.f. Discrete FT)
  - Solve for weights at each off axis position
  - How good is the approximation?





• Can construct oscillated fluxes over the allowed parameter space

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• Each set of oscillation parameters requires a different set of weights



### How does that help?

• Use the PRISM method to build:  $\Phi_{\text{near}}(E_{\nu}, x_{\text{off axis}}) \times \vec{c} = \Phi_{\text{far}}(E_{\nu}) P_{osc}(E_{\nu})$ 





### How does that help?



### How does that help?

- Use the PRISM method to build:  $\Phi_{\text{near}}(E_{\nu}, x_{\text{off axis}}) \times \vec{c} = \Phi_{\text{far}}(E_{\nu}) P_{osc}(E_{\nu})$
- Cross sections are not position dependent

$$N_{\text{near}}(E_{\text{obs}}) = \int dE_{\nu} \Phi_{(E\nu)} \Phi_{(E\nu)} \cdot \sigma(E_{\nu}) \cdot \mathbf{D}_{\text{near}}$$
$$\Phi_{\mu e^{ar}}(E_{\nu}) \cdot \sigma(E_{\nu}) \cdot \mathbf{D}_{\text{near}}$$
$$N_{\text{far}}(E_{\text{obs}}) = \int dE_{\nu} \Phi_{\text{far}}(E_{\nu}) \cdot P_{osc}(E_{\nu}) \cdot \sigma(E_{\nu}) \cdot \mathbf{D}_{\text{far}}$$

### How does that help?

- Use the PRISM method to build:  $\Phi_{\text{near}}(E_{\nu}, x_{\text{off axis}}) \times \vec{c} = \Phi_{\text{far}}(E_{\nu}) P_{osc}(E_{\nu})$
- Cross sections are not position dependent
- When we pick the correct oscillation hypothesis:
  - Signal event rates are the same near and far!

$$N_{\text{near}}(E_{\text{obs}}) = \int dE_{\nu} \Phi_{(E\nu)} \Phi_{(E\nu)} \cdot \sigma(E_{\nu}) \cdot \mathbf{D}_{\text{near}}$$
$$N_{\text{far}}(E_{\text{obs}}) = \int dE_{\nu} \Phi_{\text{far}}(E_{\nu}) \cdot P_{osc}(E_{\nu}) \cdot \sigma(E_{\nu}) \cdot \mathbf{D}_{\text{far}}$$

• Linear sum only depends on off axis position and flux prediction.

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- The same weights can be applied to sampled interactions
- in any observable quantity



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- Linear sum only depends on off axis position and flux prediction.
  - The same weights can be applied to sampled interactions
  - in any observable quantity
- The Power of PRISM:
  - Predicted the far detector observable signal event rate for some oscillation hypothesis

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• Have not yet invoked a neutrino interaction model!











- Do have to correct for:
  - Imperfect flux matching
  - Backgrounds in the near and far selection
- Majority of oscillated far prediction is rearranged near detector signal data.







- Do have to correct for:
  - Imperfect flux matching
  - Backgrounds in the near and far selection
- Majority of oscillated far prediction is rearranged near detector signal data.
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  - Imperfect flux matching
  - Backgrounds in the near and far selection
- Majority of oscillated far prediction is rearranged near detector signal data.
  - PRISM transfers near detector
    'constraint' even if the near
    detector sample is mis-modelled.
- In a traditional analysis, the whole spectrum would be a predicted by a model.
  MICHIGAN STATE





# **Putting PRISM Into Practice**





### A 'mock' data Study

• What if the interaction model is wrong but it was missed?





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- Can imagine a world where the model can be fit to near detector data, but E<sup>v</sup><sub>True</sub>⇒E<sup>v</sup><sub>Obs</sub> is wrong.





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- Case Study:
  - Move 20% of proton KE to neutrons but fit model to on-axis ND data.
  - Not able to simultaneously describe on an off axis data with incorrect model
  - But not obvious how to incorporate this in a traditional analysis...





### Mock Data Spectrum

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  - $E^{v}_{True} \Rightarrow E^{v}_{Obs}$  would be wrong
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    - More data wouldn't help
- What if we ask PRISM?





#### Let PRISM Have a Go

• PRISM Predicts far detector observation well even with incorrect interaction model!





#### Let PRISM Have a Go

- PRISM Predicts far detector observation well even with incorrect interaction model!
  - The direct extrapolation of near detector data largely side-steps the modelling problem.





#### **PRISM Prediction**

- Oscillation parameters can absorb poor interaction modelling.
- As expected, the traditional analysis would be badly biased.
- For this study, PRISM showed no such bias.







#### **DUNE-PRISM Summary**

- DUNE-PRISM is the critical analysis innovation that will enable DUNE to meet its oscillation physics goals.
- A moveable near detector is now part of the DUNE design
- The DUNE-PRISM oscillation analysis will produce minimally biased results even without precise neutrino interaction models.









## **Thanks for listening**





# **DUNE-PRISM**





## **Flux Uncertainties**





#### **Flux Systematics**

- For each step of an oscillation analysis:
  - o flux systematic parameters may move
  - flux predictions change
  - must re-determine PRISM coefficients.



## **Flux Systematics**

- For each step of an oscillation analysis:
  - flux systematic parameters may move
  - flux predictions change
  - must re-determine PRISM coefficients.
- Different coefficients change the flux matching residual
  - The residual correction uses FD MC
  - This sets the scale that signal cross-section uncertainties enter.



## **Flux Systematics**

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- Take a given systematic variation and study how much the FD flux prediction and the PRISM prediction vary relative to nominal to each other.
  - e.g. one systematically varied hadron production universe.
  - e.g. 100 hadron production universes



## **Other Oscillation Parameters**













Try it yourself!







Try it yourself!







Try it yourself!







Try it yourself!







Try it yourself!







Try it yourself!







Try it yourself!







Try it yourself!







Try it yourself!





#### **Analysis Flow: Disappearance**



L. Pickering

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#### Narrow-band fluxes

 Also of interest to construct narrow band flux measurements.







#### Narrow-band fluxes

- Also of interest to construct fine band flux measurements.
  - Can be used to probe the 'true' reconstructed energy bias and inform simulation improvements













#### Is this the only Game we can Play?





L. Pickering

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#### Is this the only Game we can Play?



L. Pickering

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## Fixing for an appearance

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- Instead:
  - Use ND  $v_{u}$  sample
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## Fixing for an appearance

- For appearance, cannot match ND  $v_{e} \Rightarrow$  FD  $v_{e}$
- Instead:
  - Use ND  $v_{\mu}$  sample
  - Build appeared FD  $v_e$  flux
- Have to correct for electron/muon reconstruction & cross-section differences.





#### ND nue fits

- Sample ND  $v_e$  flux while scanning off axis angle.
  - v<sub>e</sub> produced in 3-body decay:
    relative rate rises off axis.
    - Match ND  $v_{\mu}$  to ND  $v_{e}$
- Use to check simulation of cross-section and reconstruction for v<sub>µ</sub> and v<sub>e</sub> in a similar flux





9 10 *E*<sub>v</sub> (GeV)

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## Near Far Differences





#### **Geometric Efficiency Estimate**

• Want to understand selection efficiency in an as-model-independent-way-as-possible.




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#### Active Volume





# **Geometric Efficiency Estimate**

- Want to understand selection efficiency in an as-model-independent-way-as-possible.
  - For a selected data event, can estimate the probability of selecting an equivalent event geometrically.
  - Not just a model-based average as in current generation analyses





# **Geometric Efficiency Estimate**

- Exploit symmetry of interactions in LAr ND:
  - Translation around an off axis bin
  - Rotation around beam axis.
- How often would we have selected this event?
  - Does a rotation move observed hadronic deposits into the veto region?
  - For the Muon, train an NN to predict containment/selection by tracker.
  - Average over many toys to estimate efficiency.
- Ongoing work at Stony Brook and CERN, see <u>talk</u> by Cris Vilela for more details.



- Exploit symmetry of interactions in LAr ND:
  - Translation around an off axis bin
  - Rotation around beam axis.



## **Hadronic Shower Selection**



L. Pickering 185







# **Muon Selection Efficiency**

- Train neural network to predict fate of muon as a function of its position and momentum.
  - Output is the probability for the muon to be sampled in the **tracker**, be **contained** in the liquid argon, or **not** be **selected**.
- For initial studies use true position and momentum, but plan to use reconstructed quantities in the future.
- Start with simple neural network with 2 hidden layers with 64 nodes each and ReLU activation.
  - Implemented in PyTorch: <u>https://github.com/cvilelasbu/MuonEffNN</u>



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  - Never get a good constraint on such events from the data.



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# ND/FD Efficiency Differences

- There will be some regions of kinematical phase space that are not well sampled by the near detector.
  - High energy/very inelastic events result in large showers that are rarely well contained by the ND
  - Never get a good constraint on such events from the data.
  - This is true regardless for any analysis, not just PRISM.
- Can apply event-by-event efficiency algorithms on FD data and determine which events are not well-constrained by the ND
  - Separate these into a separate sample which is compared to FD MC (as in a traditional analysis).



## vPRISM

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- DUNE-PRISM born out of earlier work to build a mobile Water Cherenkov detector in the J-PARC beam for Hyper-K.
- J-PARC PAC Proposal





## Hand Picked Fake Data

#### INTRODUCTION

#### C. Vilela: DUNE Jan 2019

- Want to generate a fake data set that **biases oscillation parameters** but is not constrained by an on-axis near detector fit.
  - Developed in the context of DUNE-PRISM studies.



#### • Procedure:

- Shift 20% of the energy carried by protons in CC interactions to neutrons.
  - This will change  $E_{true}^{\nu} \rightarrow E_{rec}^{\nu}$  as neutrons are largely unseen.
- Find a reweighting scheme that recovers the unshifted **distributions** of observables at an on-axis near detector.





# **Multivariate ReWeighting**

- Reweighting/Fake data technique that is being used more on T2K and DUNE (originated in Collider land).
- Get BDT to give you event weights that make your nominal MC look like something else in many distributions at once (but get the correlations correct).

### MULTIVARIATE REWEIGHTING

 Train a BDT to classify ND CC events as either nominal or shifted based on the following six variables:

C. Vilela: DUNE Jan 2019

• Lepton energy, energy deposits due to protons,  $\pi^\pm$ s and  $\pi^0$ .

• 
$$E_{rec}^{\nu}$$
 and  $y_{rec} \ (= 1 - \frac{E_{rec}^{lep}}{E_{rec}^{\nu}}$ ).

- Oscillation analysis uses these variables.
- Output of the BDT gives, for each event:
  - $p_{shifted}(E_{rec}^{\nu}, y_{rec}, E_{rec}^{lep}, E_{dep}^{\pi^{\pm}}, E_{dep}^{\pi^{0}}) \sim \frac{N_{shifted}}{N_{nominal} + N_{shifted}}$
- Applying weight  $w = \frac{1}{p_{shifted}} 1$  to shifted events results in a distribution that looks just like the **nominal**.

Based on A. Rogozhnikov, J.Phys.Conf.Ser. 762 (2016) no.1, 012036 [arXiv:1608.05806]





## **Missing Proton Fake Data**

C. Vilela: DUNE Jan 2019



## More Observables

- There are limits to this technique, but they're much further off than multi-dimensional histogram
  - reweighting.
- It's still reweighting, cannot change total phase space.
- Doesn't always produce a consistent model, for medium sized sets, weights can be noisey.







# **Horn Current**







## Flux Mismatch Correction















## **Flux Mismatch Correction**

- Have to correct for this mismatch by using far detector simulation:
  - Want to minimize model assumptions wherever possible...







# **Flux Mismatch Correction**

- Have to correct for this mismatch by using far detector simulation:
  - Want to minimize model assumptions wherever possible...
- This happens because no off axis fluxes peak higher than on axis











• If we vary the current in the magnetic horns, we change their momentum acceptance







- If we vary the current in the magnetic horns, we change their momentum acceptance:
  - For a lower current, some higher energy pions might not be well focussed...







- Small variations are better:
  - Less change in far detector exposure
- Lower currents are better:
  - Current horn and power supply designed with 293 kA as the operating current.







- Small variation are better:
  - Less change in far detector exposure
- Lower currents are better:
  - Current horn and power supply designed with 293 kA as the operating current.
- 280 kA looks useful





- Including an on-axis run at 280 kA drastically improves the flux matching!
  - Much less far detector model correction required.







## Parent Species Off axis.



- Can make flux predictions under different beam conditions:
  e.g. Varied horn currents
- Seems to really change the game in terms of reducing the need for FD MC!
- Only need an on-axis sample: minimal disruption of FD data taking.





