



# Extraction of the Inclusive Muon Neutrino Charged Current Cross Section at MicroBooNE using Wiener SVD Unfolding

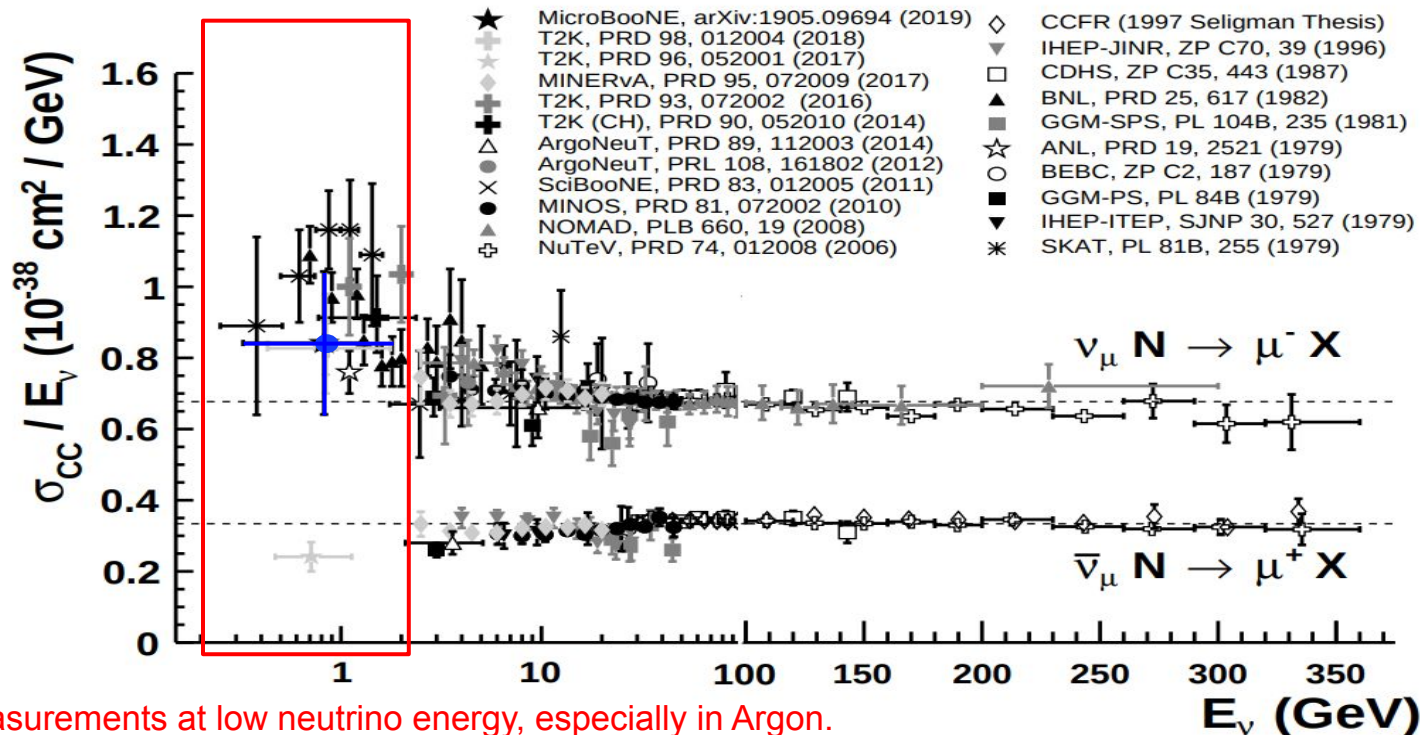
London Cooper-Troendle and Wenqiang Gu  
on behalf of the MicroBooNE collaboration



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# Neutrino Cross Section Measurements



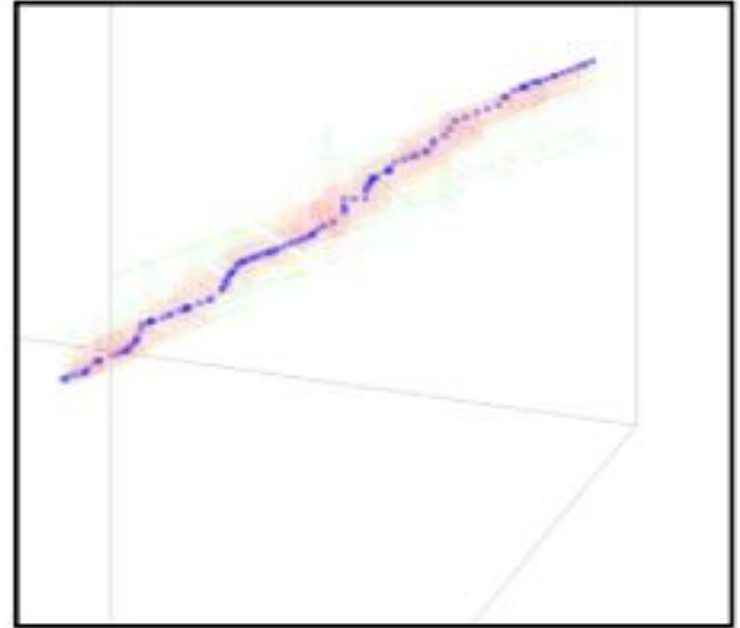
Few measurements at low neutrino energy, especially in Argon.

MicroBooNE total cross section measurement in blue.

# Wire-Cell Reconstruction

- Wire-Cell is a fully 3D event reconstruction that arranges charge in a graph structure.
- Use of 2D deconvolution allows for accurate charge reconstruction.
- Many-to-many flash-charge matching allows for accurate cosmic ray tagging.
- Trajectory fit and particle flow create robust particle identification capabilities.

MicroBooNE Preliminary

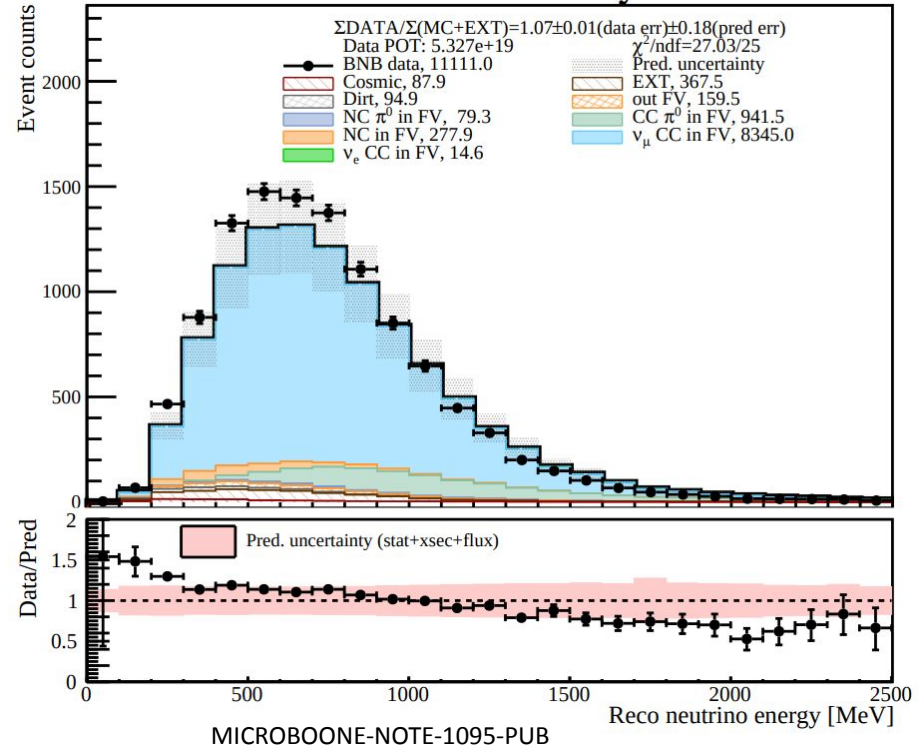


A muon charge deposition (red) with trajectory fit overlaid (blue).

# Wire-Cell Generic Neutrino Selection

- Wire-Cell has reconstructed an inclusive neutrino selection with high efficiency (64%) and high purity (93%).
- This high efficiency is maintained across the full range of three important kinematic variables for differential cross sections:  $E_\nu$ ,  $E_\mu$ , and  $E_{\text{transfer}}$  (aka  $\nu$ ).

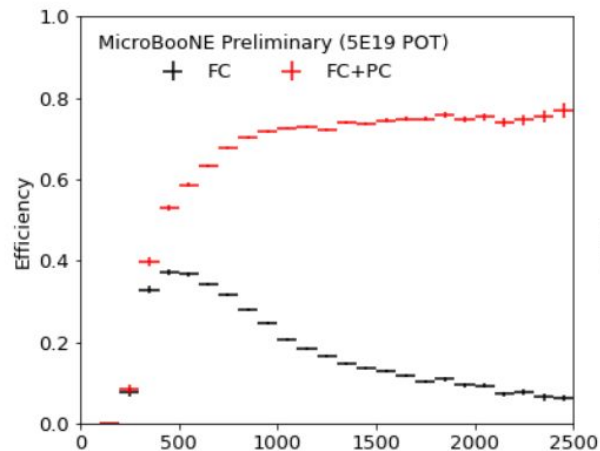
## MicroBooNE Preliminary



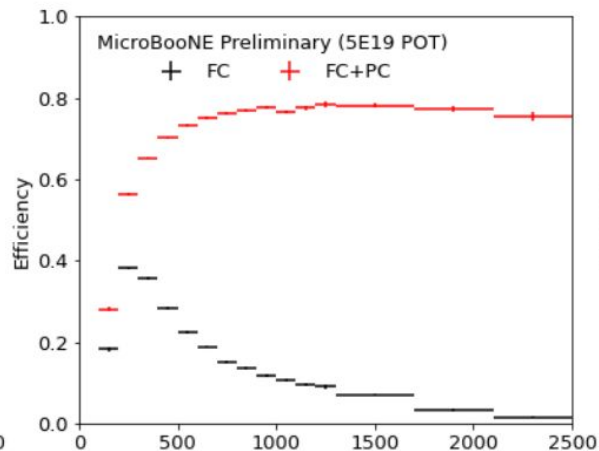
# Kinematic Variables for Differential Cross Sections

Fully contained (FC) events begin and end inside the detector.

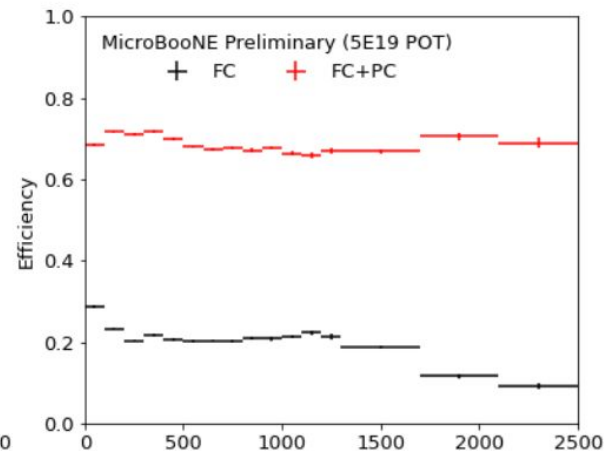
Partially contained (PC) events enter or leave the detector.



$E_{\nu}^{\text{true}}(\text{MeV})$



$E_{\mu}^{\text{true}}(\text{MeV})$



$E_{\text{transfer}}^{\text{true}}(\text{MeV}) = E_{\nu} - E_{\mu}$

$\nu_{\mu}$  CC selection efficiency as a function of true neutrino energy, true muon energy, and true transferred energy to Ar, respectively.

# The Purpose of Unfolding

- Allows for direct comparison with other experimental measurements.
- Allows data to help refine generator predictions by favoring and disfavoring existing predictions / underlying assumptions.
- Both the above are of key importance when considering the upcoming SBN and DUNE programs.

# Wiener Unfolding in MicroBooNE with Wire-Cell

- Can we Unfold?
  - MC model accurately describes data within uncertainties.
  - Robust data event selection allows for rigorous validation of model.
- Why Wiener Unfolding:
  - Reduced instability compared to simple unfolding.
  - Wiener filter maximizes signal-to-noise ratio in frequency domain.
  - Does not depend on choice of regularization strength parameter.

# Measuring the $\nu_\mu$ CC Cross Section Using Unfolding

Measurement **M**

Background **B**

Response matrix **R**

Signal **S**

Covariance matrix **C**

Test statistic  $T = (\mathbf{M} - \mathbf{B} - \mathbf{R} \cdot \mathbf{S})^T \cdot \mathbf{C}^{-1} \cdot (\mathbf{M} - \mathbf{B} - \mathbf{R} \cdot \mathbf{S})$

$$\mathbf{M} - \mathbf{B} = \mathbf{R} \cdot \mathbf{S}$$



Minimize **T**

$$\mathbf{S} = (\mathbf{R}^T \cdot \mathbf{C}^{-1} \cdot \mathbf{R})^{-1} \cdot \mathbf{R}^T \cdot \mathbf{C}^{-1} \cdot (\mathbf{M} - \mathbf{B})$$

Allows for cross section to be computed as a function of truth variables.

This standard weighted least squares approach suffers from instability in the computation.



# Wiener SVD Unfolding

Measurement **M**

Background **B**

Response matrix **R**

Signal **S**

Covariance matrix **C**

Test statistic  $T = (\mathbf{M} - \mathbf{B} - \mathbf{R} \cdot \mathbf{S})^T \cdot \mathbf{C}^{-1} \cdot (\mathbf{M} - \mathbf{B} - \mathbf{R} \cdot \mathbf{S}) + T_{\text{reg}}$

$$\mathbf{M} - \mathbf{B} = \mathbf{R} \cdot \mathbf{S}$$



Minimize **T**

$$\mathbf{S} = \mathbf{A}_C \cdot (\mathbf{R}^T \cdot \mathbf{C}^{-1} \cdot \mathbf{R})^{-1} \cdot \mathbf{R}^T \cdot \mathbf{C}^{-1} \cdot (\mathbf{M} - \mathbf{B})$$

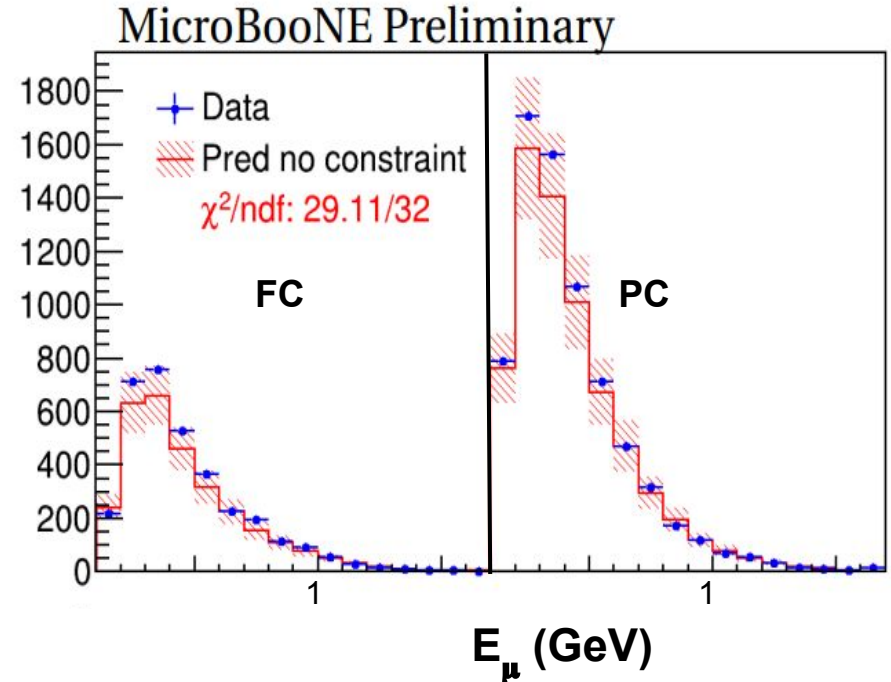
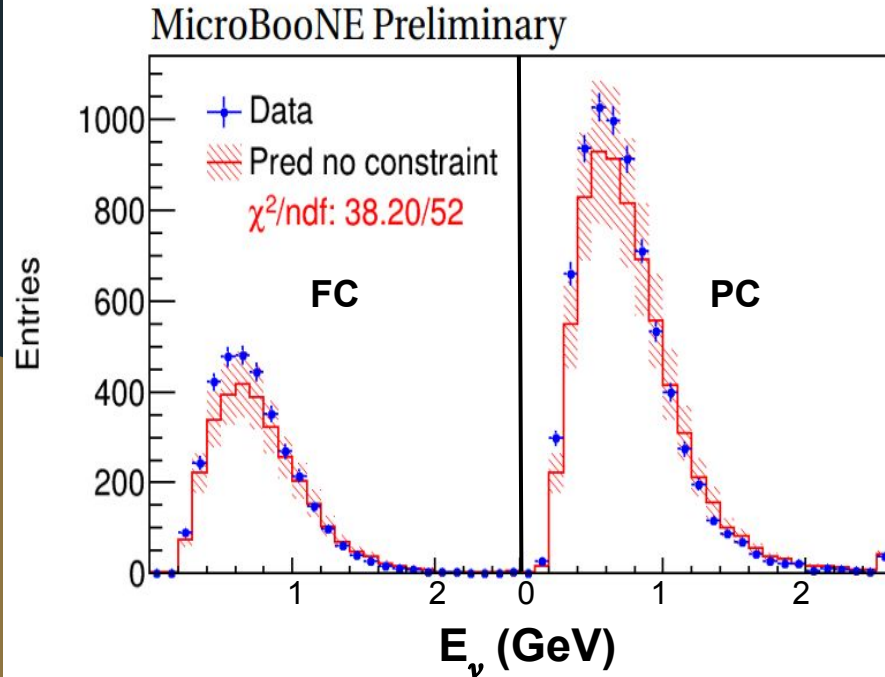
$T_{\text{reg}}$  is generated from the MC truth expectation, and helps the fit stability.

The Wiener filter used to generate  $\mathbf{A}_C$  maximizes signal/noise ratio in the relevant frequency domain.

# Assumptions of Wiener SVD Unfolding

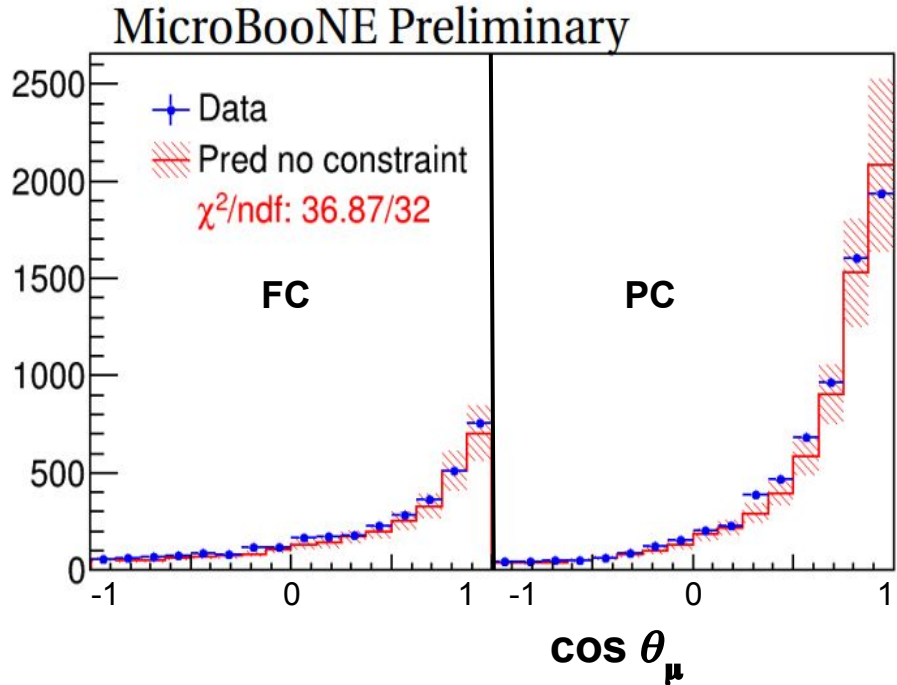
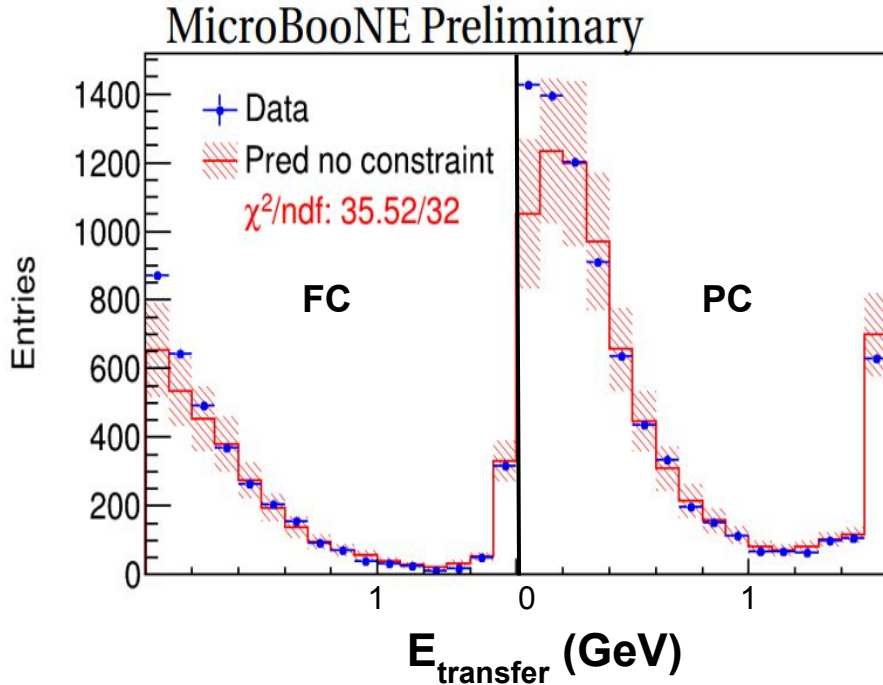
- The model used for the regularization term  $T_{\text{reg}}$  / smearing matrix  $A_c$  in unfolding must accurately predict data
- Covariance matrix formalism should accurately describe systematic uncertainties, and these uncertainties should cover any data/MC difference.
- There must be no data reconstruction gap in phase space across kinematic variables. (Strength of LArTPC and Wire-Cell).

# Validation of Model with Goodness of Fit



Fully contained (left) and partially contained (right) events are shown for each variable.  
Data from 5e19 POT open dataset.

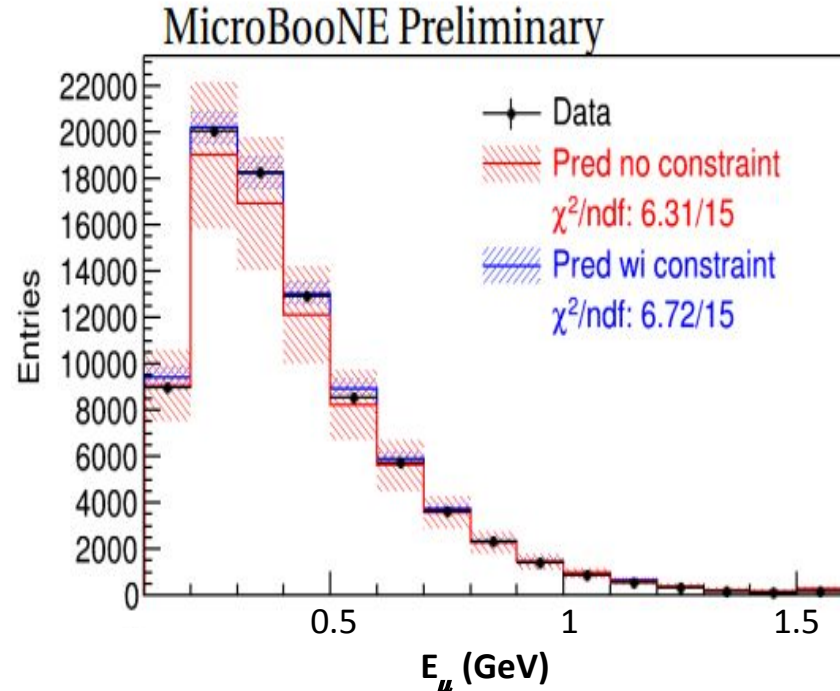
# Validation of Model with Goodness of Fit



Fully contained (left) and partially contained (right) events are shown for each variable.  
Data from 5e19 POT open dataset.

# Applying Constraints to Goodness of Fit

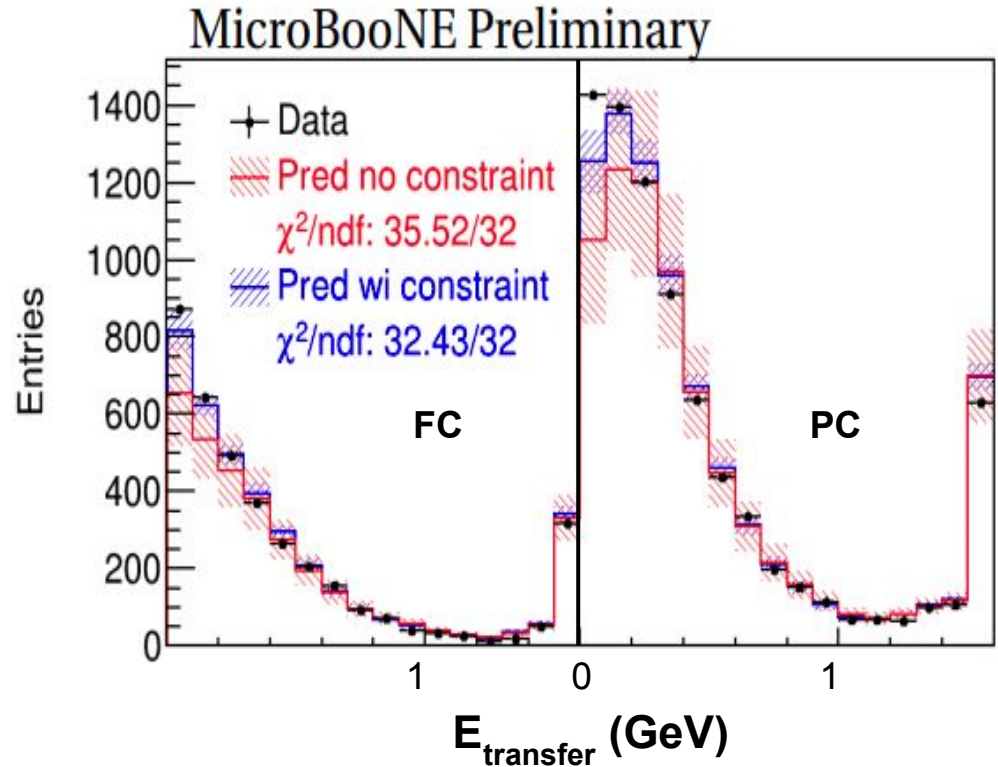
- Goodness of fit of partially-contained events  $E_\mu$  compared before and after constraining by fully contained events.
- The constraint reduces uncertainties but also shrinks data/MC difference, maintaining GoF value.
- This validates our energy reconstruction model for partially contained events.



Partially contained events GoF before and after constraint from fully contained events.

# Constraining Hadron Energy with Muon Energy

- Muon energy measurement constraint significantly reduces uncertainty.
- Constrained measurements agree better with MC, improving  $\chi^2/\text{ndf}$ .
- This helps reduce worry of hadronic-specific reconstruction issue in data.



# Summary

- Wire-Cell's high-efficiency, inclusive  $\nu_\mu$  selection provides high statistics for numerous differential cross sections.
- Unfolding allows for cross sections to be measured as a function of truth variables.
- The interaction model is validated with data/MC GoF comparisons to ensure accurate unfolding.
- Multiple cross section measurements are in progress and hope to be published soon!

# References

- Wire-Cell Software Package for LArTPC: <https://lar.bnl.gov/wire-cell/>
- Neutrino Interaction Model and Uncertainties for MicroBooNE Analyses.  
[MICROBOONE-NOTE-1074-PUB](#)
- Wire-Cell Neutrino Selection [MICROBOONE-NOTE-1095-PUB](#)
- [Data Unfolding with Wiener SVD Method](#)