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# Background Subtraction when model is horribly wrong: Lessons from MINERvA

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#### How do we know the model is horribly wrong?



- If it weren't, we wouldn't be doing the experiment
- First publications at MINERvA:  $v_{\mu}$  and anti- $v_{\mu}$  CCQE



Energy near vertex prefers with adding an extra proton to 25±9% of events, consistent with a multinucleon hypothesis

• Other early publications: pion production

GENIE has to be scaled by 0.46 to agree with Deuterium Data

*Pion energies, angles, and overall cross sections do not match GENIE* Rod,Wil,McF, EPJC 76 (2016)





#### **MINERvA Detector**

- Nuclear Targets
  - Allows side by side comparisons between different nuclei
  - Pure C, Fe, Pb, LHe, water
- Solid scintillator (CH) tracker
  - Tracking, particle ID, calorimetric energy measurements
  - Low visible energy thresholds
- Side and downstream electromagnetic and hadronic calorimetry
  - Allow for event energy containment
- MINOS Near Detector
  - Provides muon charge and momentum









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#### **MINERvA Events**



#### One out of three views shown, color = energy



#### **MINERvA's Neutrino Flux**

- Low energy beam:
  - Peak around 3GeV
  - "high energy tail" not negligible
  - Many processes will contribute backgrounds to any analysis (except maybe the "Charged Currrent Inclusive analysis")
- Medium Energy beam
  - Neutral currents will be larger background to  $v_e$  or v-electron scattering measurements than Low Energy beam





## **Case Study: coherent pion production**

- This low multiplicity process is a troublesome background for oscillation experiments and previous low energy data is confusing
- Model independent selection and high statistics allows test of pion kinematics
- 1628 (770) coherent neutrino (antineutrino) events







Phys. Rev.Lett. 113, 261802 (2014) and PRD in preparation.



# **Experimental Signature and Backgrounds**

- Signal:
  - Two final state particles (muon and charged pion)
  - Small momentum transfer to the nucleus
  - No visible recoil
- **Event Selection:** 
  - Two tracks, one matched to MINOS
  - dE/dx of short track NOT proton-like
  - Low energy around the vertex
- Backgrounds:
  - All other pion production
  - Quasi-elastic scattering with protonpion confusion



# Already see our model isn't perfect...

- Proton Score Discrepancy:
  - May be somewhat due to pion angle and momentum mismatch
  - Definitely depends on relative levels of QE and Resonance production
  - These plots ALREADY have non-resonant pion production reduced to 0.46\*GENIE from D2 measurement Rod, Wil, McF, EPJC 76 (2016)
- Vertex Energy:
  - We know we don't have the vertex energy in CCQE v events right



Energy near vertex prefers with adding an extra proton to 25±9% of events, also consistent with a multinucleon hypothesis





# • Muon momentum $p_{\mu}$ is measured from reconstructed muon in MINOS

- Muon angle  $\theta_{\mu}$  is measured from track in MINERvA
- pion energy ( $E_{\pi}$ ) s reconstructed calorimetrically
- Neutrino direction is parallel to the beam axis

# **Kinematics of Signal process**





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#### Sidebands to test background model

- Use events passing vertex energy cut but with 0.2<ltl<0.6GeV<sup>2</sup>
- Check "pion" kinematics and levels



#### So by scaling the background levels we can get the pion energy distribution to match in the sideband



<u>×</u>10<sup>3</sup>

3.04E+20 POT

Untuned Background

1.2

≥

 $\rightarrow \mu^{-} + \pi^{+} + \mathbf{A}$ 

Data

QE

Coherent

W > 2.0

Other

Non-QE, W < 1.4 1.4 < W < 2.0

4.5

# Sideband Tuning Result by Q<sup>2</sup>





**Reconstructed Q<sup>2</sup> (GeV/c)<sup>2</sup>** 



#### **Reconstructed Q<sup>2</sup> (GeV/c)<sup>2</sup>**

Channel	Scale Factor	Note: th
Charged Current Quasielastic	1.13±0.04	suppress
Non-Quasielastic, W <sub>gen</sub> <1.4GeV	0.73±0.08	weightin
1.4 <w<sub>gen&lt;2.0</w<sub>	0.81±0.05	non-reso
W <sub>gen</sub> >2.0	1.70±0.20	predictio
Other	1.0 (fixed)	(ref: EPJC

Note: this is a new suppression *after* weighting GENIE's non-resonant pion prediction by 0.46 ref: EPJC 76, 2016 )

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#### Pion angle in the sidebands after tuning



- There is still a mis-match, so we added a correction assuming that nature wants the pion angles we see in the sideband IN the signal region.
- Assumed the systematic uncertainty on the background's angular distribution is the difference between the tuned and untuned pion angle



# **Vertex Energy Uncertainty**

- The pion backgrounds were tuned AFTER a cut on the vertex energy.
- The CCQE background that survives that cut depends on the model you assume for the CCQE process
- Initial expectation was that
   P
   25% of the CCQE events had an extra proton with a momentum between 0 and 225MeV
- Re-extract the cross section after adding the additional proton to the CCQE sample, apply as a systematic uncertainty





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# **Uncertainty on Background Modeling**

- Evaluate δ(background prediction) by marginalizing over systematic uncertainties
- Additional "Sideband model" shows up differently in different observables



#### A. Mislivec, FERMILAB-THESIS-2016-30, PRD in preparation







#### **Lessons learned from Coherent Pions**



- Adding extra vertex energy and modifying the pion background kinematics as systematics is something MINERvA does for many measurements
  - Neutrino-electron scattering
  - Electron neutrino CCQE measurement
  - CCQE in the nuclear targets (there it's the signal, not the background)
- As we start to develop better models, the background prediction process also changes
  - Add "2p2h events" instead of just adding extra protons
  - Add different sources of "2p2h" instead of just turningn on or off 2p2h (nn, np, pp, or just extra QE contribution)
  - Stop using difference between GENIE and MINERvA result as a systematic uncertainty, use uncertainty ON MINERvA result
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#### **Neutrino Coherent Pion Results**



• Stay tuned, a long PRD is in preparation with these results...



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#### Next example: $v_e$ CCQE

- Event selection:
  - Identify an EM-like shower
    - Energy deposit at track end
    - "Width" of the track
    - Average dE/dx of entire track
  - Remove non-CCQE events
    - No Michel electrons
    - Anything not within a 7.5° e<sup>-</sup> cone or 30cm of vertex is called "extra energy", cut on Ψ= E(extra)/E(cone)
  - Remove photons by early dE/dx cut

#### Graphics from: J. Wolcott JETP 9/15









#### Events after e<sup>-</sup> ID and "extra energy" cut



Several different backgrounds persist



### Find sidebands to constrain backgrounds





# Graphics from: J. Wolcott JETP 9/15

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## **Signal and Sideband Distributions**





- Fit the kinematic
  distributions in the
  sidebands for
  overall
  normalizations for 3
  scale factors
  - $\begin{array}{l} \ 0.90 \ \text{for ``other $\nu_e$'',} \\ 1.11 \ \text{of ``Other NC} \\ \pi^{0"} \ \text{and ``CC $\nu_{\mu}$} \ \pi^{0"} \end{array}$
- But even after constraining model with the sidebands...

+ Data	$v_e^{}$ CCQE-like	Other CC $\nu_e$	v + e elastic
NC Coh	Other NC $\pi^0$	$CC \; \nu_{\mu} \; \pi^{0}$	Other



#### Need to add: Diffractive π<sup>0</sup> Production



# Systematic Uncertainties on Backgrounds

**Total Sys. Error** 

Coherent



- For  $v_e$  CCQE 0.6F ractional Uncertainty result: 0.5 sideband 0.4 model 0.3 not a big factor 0.2
- Excess process is a small contribution
- FSI still most important interaction systematic on CCQE







# Lessons learned from coherent and $v_e$ CCQE analyses:



- The more rare the process, the more different channels the backgrounds may have, some of which you didn't know existed
- The more channels you worry about, the more sidebands you need to constrain those backgrounds
- Award for most (confusing) sidebands: neutrino-electron scattering analysis



## **Neutrino-electron Scattering**



- Well-predicted cross section, useful for flux constraint
- Simple final state: single electron in direction of neutrino beam
- Can isolate electrons from dE/dx at beginning of the shower
- Observables:
  - electron energy (E $_{\rm e})$  and angle with respect to beam ( $\theta)$
  - From kinematics, know that  $E_e \theta^2$  should be  $m_e^2/2$
  - dE/dx at beginning of shower
- Cut on all energy outside of electron cone to get rid of backgrounds
- Lots of possible sidebands to pick



Phys. Rev. D 93, 112007 (2016)

#### v-e candidates after Electron ID cuts



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- This is after background tuning, but you see how many backgrounds contribute
- Tuning is done as function of OTHER variables



#### Sideband Definitions for v-e scattering

• Use dE/dx and  $E_e \theta^2$  to define the sidebands, then fit events in those windows as function of other observables



- Sideband (b) is then broken up into 3 regions to determine 3 overall normalization factors
  - Minimum dE/dx to prevent vertex energy mismodeling
- Remove cut on shower end transverse position and fiducial track length to get full statistical power of the sideband
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#### **Sideband Distributions before and after tuning**

- Shower End Transverse position distributions for  $E\theta^2 > 0.05 GeVrad^2$



### Systematic Uncertainties on v-e scattering

- Interaction Model is important—but uncertainties were reduced from sideband tuning
- CCQE shape uncertainty is called out separately
  - Need to extrapolate from high Eθ<sup>2</sup> to low Eθ<sup>2</sup>, similar to extrapolating from high Q<sup>2</sup> to low Q<sup>2</sup>
  - Took as the systematic uncertainty the entire difference between GENIE and MINERvA







#### Conclusions



- The better foundation you have to make models for all the different processes you have in your data, the better your background predictions will be
- Still will need sidebands and clever strategies to really test these background predictions
- MINERvA's medium energy data set has lots more statistics, so there are lots more background techniques we can explore
- Future focus on nuclear targets means more background subtraction challenges:
  - Need to subtract non-target backgrounds AND specific channel backgrounds

