

# RESULTS OF THE MiniBooNE NEUTRINO OSCILLATION SEARCH

E. D. Zimmerman  
University of Colorado

Brookhaven National Laboratory  
Particle Physics Seminar  
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# *Search for Neutrino Oscillations*

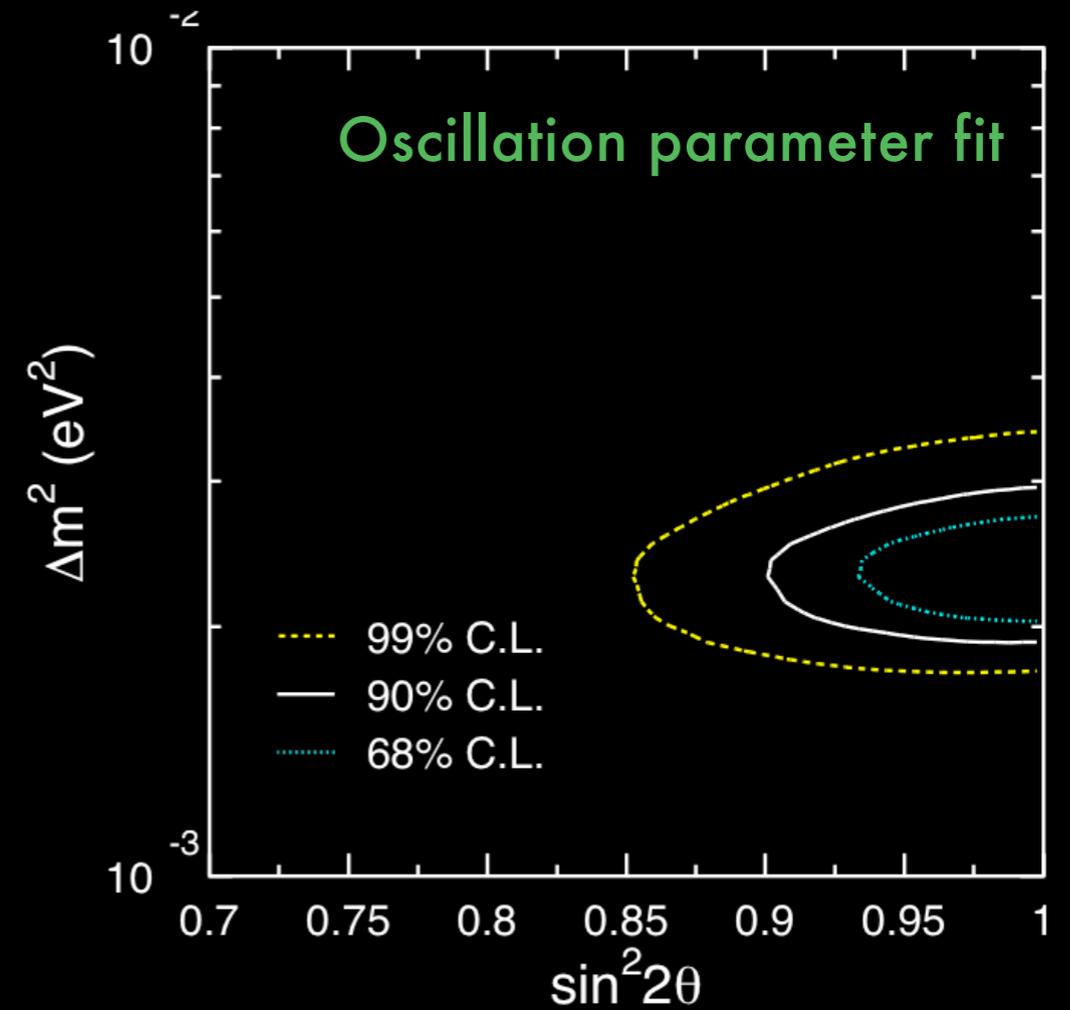
- Neutrino oscillations
- Introduction to MiniBooNE
- The oscillation analysis
- The initial results and their implications
- The next steps

# *Neutrino Oscillations: Experimental Evidence*

- Atmospheric Neutrinos
- Solar Neutrinos
- LSND

# Atmospheric Neutrinos

- Definitive discovery of oscillations, 1998 (muon disappearance only)
- $\nu_\mu$  disappearance
- Disappearance confirmed in long-baseline accelerator experiments



$$\Delta m^2 \approx (2 - 3) \times 10^{-3} \text{eV}^2 / c^4$$

$$\sin^2 2\theta \approx 1$$

Assuming  $\nu_\mu \rightarrow \nu_\tau$

# Solar Neutrinos

- Experiments looking for solar  $\nu_e$  have seen long-standing deficits in data compared to solar models
- Sudbury Neutrino Observatory (SNO) observed neutral/charged current ratio, confirming flavor mixing as the solution to solar neutrino “problem”
- KamLAND observed disappearance of reactor antineutrinos: confirmed oscillations and resolved an ambiguity in  $\Delta m^2$ .

$\nu_e$  disappearance

$$\Delta m^2 \approx 10^{-4} \text{eV}^2 / c^4$$

$$\sin^2 2\theta \approx 0.8$$

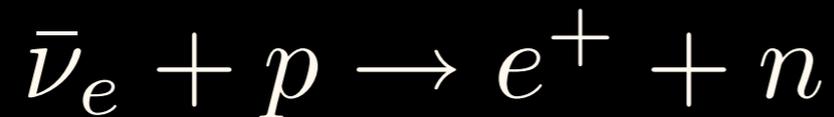
# LSND

- Liquid Scintillator Neutrino Detector at Los Alamos Meson Physics Facility (LAMPF) accelerator
- Neutrino source: stopped pion and muon decays
- Search for  $\bar{\nu}_\mu \rightarrow \bar{\nu}_e$  appearance
- $L = 30$  m,  $E = 30-53$  MeV

# LSND

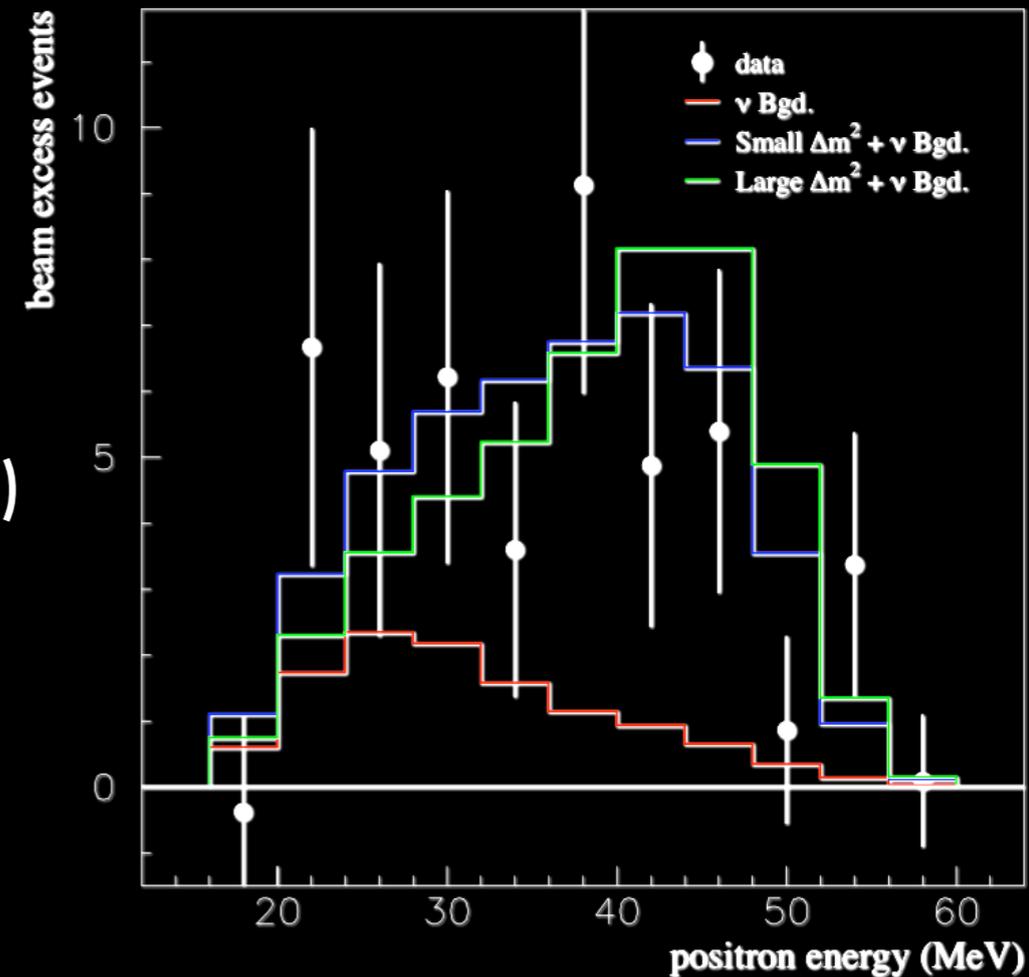
- Stopped  $\pi^+$  beam at Los Alamos LAMPF produces  $\nu_e, \nu_\mu, \bar{\nu}_\mu$  but no  $\bar{\nu}_e$  (due to  $\pi^-$  capture).

**Search for  $\bar{\nu}_e$  appearance** via reaction:



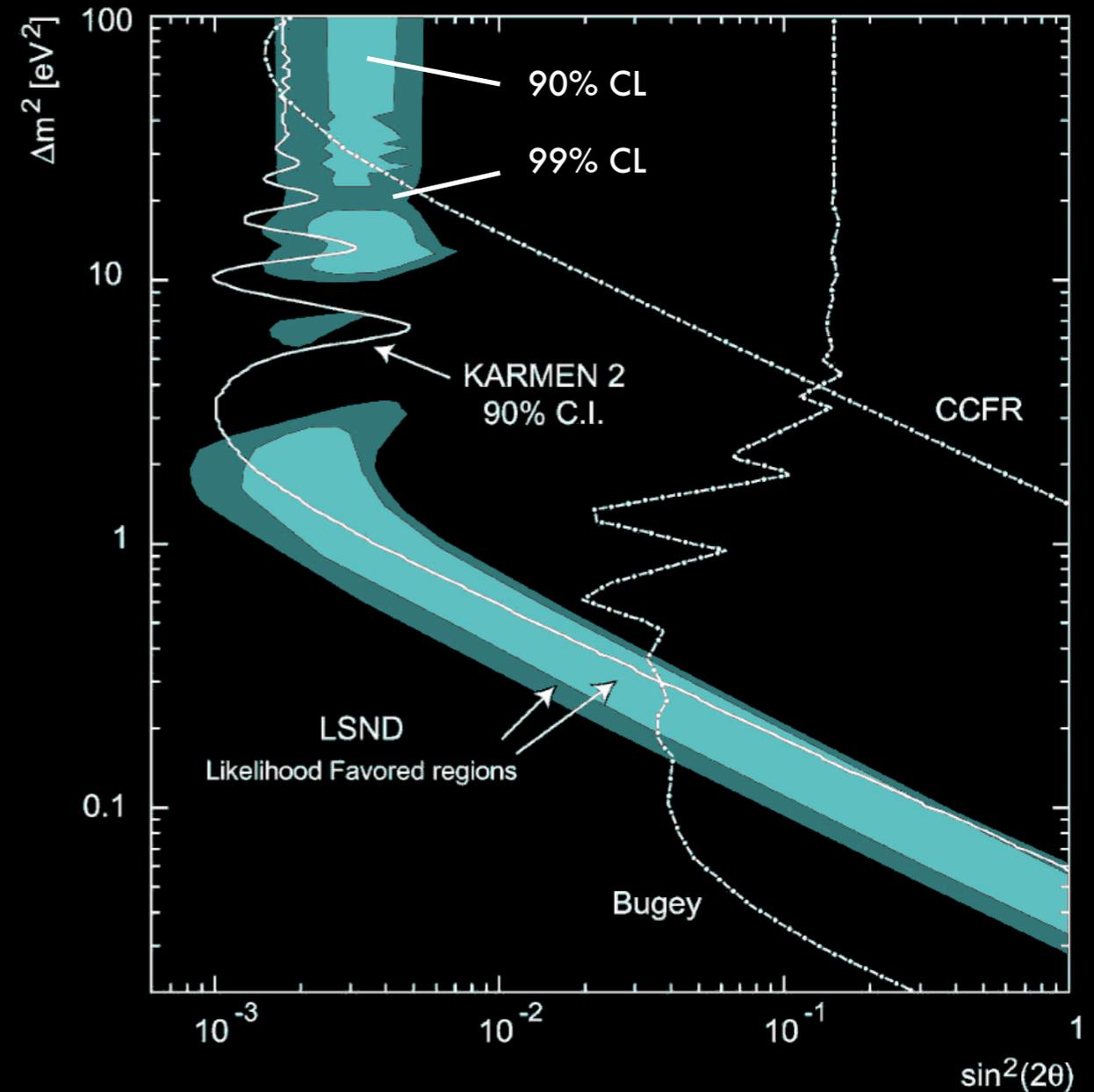
- Neutron thermalizes, captures  $\Rightarrow$  2.2 MeV  $\gamma$ -ray
- Look for the delayed coincidence.**
- Major background non-beam (measured, subtracted)
- 4 standard dev. excess above background.
- Oscillation probability:**

$$P(\bar{\nu}_\mu \rightarrow \bar{\nu}_e) = (2.5 \pm 0.6_{\text{stat}} \pm 0.4_{\text{syst}}) \times 10^{-3}$$



# LSND oscillation signal

- LSND "allowed region" shown as band
- KARMEN2 is a similar experiment with a slightly smaller L/E; they see no evidence for oscillations. Excluded region is to right of curve.

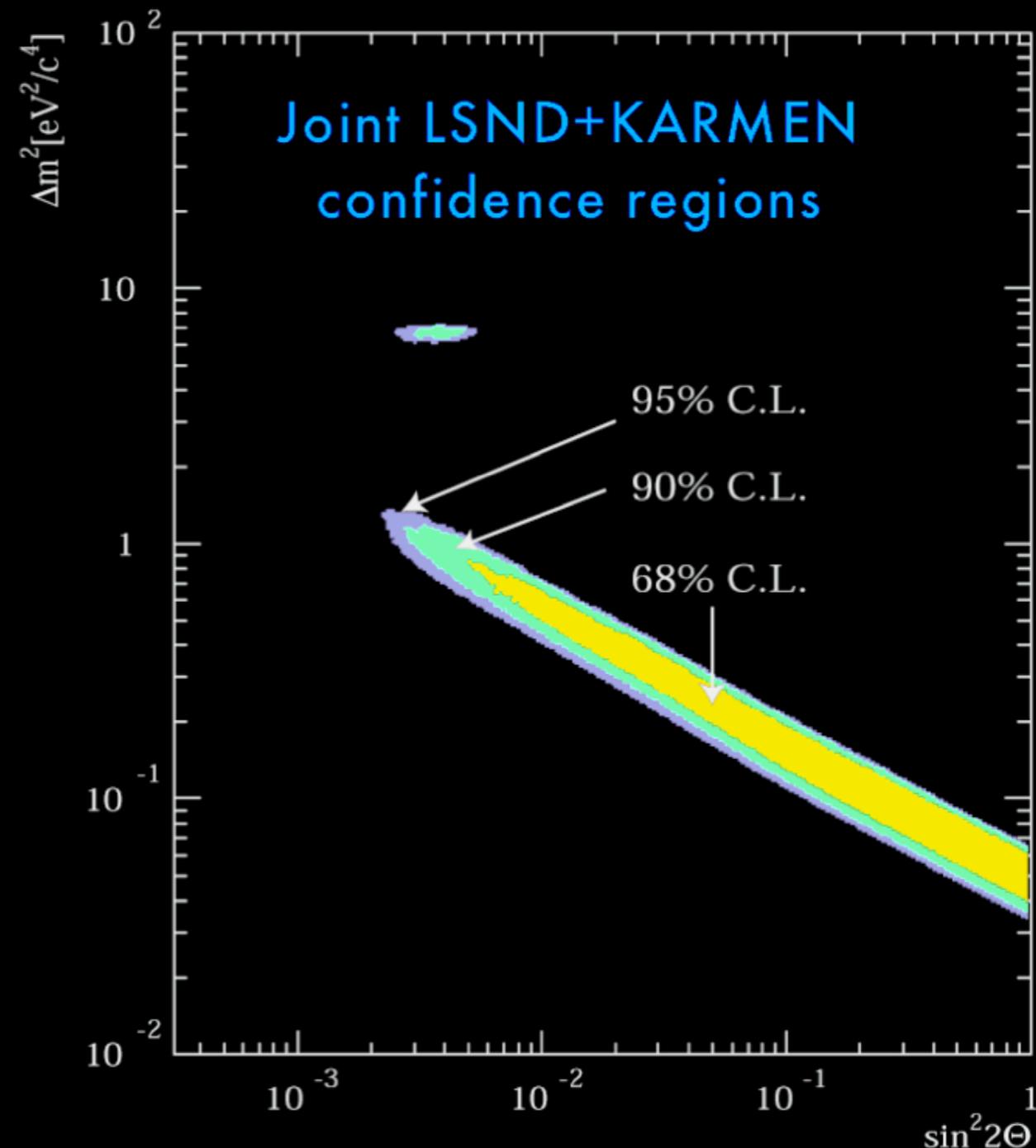


# LSND Oscillation allowed region

Confidence regions from joint analysis of LSND and KARMEN2 data

E. Church *et al.*, *Phys. Rev. D* **66**, 013001 (2002)

- Combined analysis:
  - Consistency at 64% confidence level
  - Restricted parameter region



# The Overall Picture

LSND	$\Delta m^2 > 0.1 \text{eV}^2$	$\bar{\nu}_\mu \leftrightarrow \bar{\nu}_e$
Atmos.	$\Delta m^2 \approx 2 \times 10^{-3} \text{eV}^2$	$\nu_\mu \leftrightarrow \nu?$
Solar	$\Delta m^2 \approx 10^{-4} \text{eV}^2$	$\nu_e \leftrightarrow \nu?$

With only 3 masses, can't construct 3  $\Delta m^2$  values of different orders of magnitude!

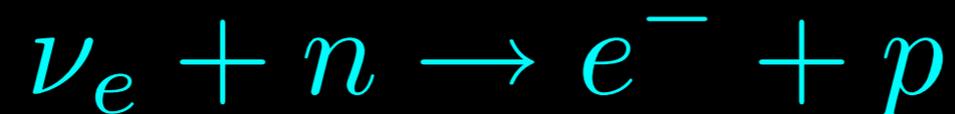
- Is there a fourth neutrino?
  - If so, it can't interact weakly at all because of  $Z^0$  boson resonance width measurements consistent with only three neutrinos.
- We need one of the following:
  - A "sterile" neutrino sector
  - Discovery that one of the observed effects is not oscillations
  - A new idea

# *MiniBooNE: E898 at Fermilab*

- Purpose is to test LSND with:
  - Higher energy
  - Different beam
  - Different oscillation signature
  - Different systematics
- $L=500$  meters,  $E=0.5-1$  GeV: same  $L/E$  as LSND.

# Oscillation Signature at MiniBooNE

- Oscillation signature is charged-current quasielastic scattering:



- Dominant backgrounds to oscillation:

- Intrinsic  $\nu_e$  in the beam

$\pi \rightarrow \mu \rightarrow \nu_e$  in beam

$K^+ \rightarrow \pi^0 e^- \nu_e, K_L^0 \rightarrow \pi^0 e^\pm \nu_e$  in beam

- Particle misidentification in detector

Neutral current resonance:

$\Delta \rightarrow \pi^0 \rightarrow \gamma\gamma$  or  $\Delta \rightarrow n\gamma$ , mis-ID as  $e$

# *Results presented here*

- A generic search for a  $\nu_e$  excess in the  $\nu_\mu$ -dominated beam
- A fit for neutrino oscillations in a two-flavor, appearance-only scenario
- Tests LSND in models where neutrinos and antineutrinos have same oscillations (and Lorentz invariance is respected)

# The BooNE Collaboration



S.J.Brice, B.C.Brown, D.A.Finley, R.Ford, F.G.Garcia, P.Kasper,  
T.Kobilarcik, I.Kourbanis, A.Malensek, W.Marsh, P.Martin,  
F.Mills, C.Moore, E.Prebys, A.D.Russell, P.Spentzouris, R.Stefanski  
**Fermi National Accelerator Laboratory**

D.Cox, T.Katori, H.Meyer, C.C.Polly, R.Tayloe  
**Indiana University**

G.T.Garvey, J.A.Green, C.Green, W.C.Louis, G.McGregor,  
G.B.Mills, H.Ray, V.Sandberg, R.Schirato, R.Van de Water,  
D.H.White

**Los Alamos National Laboratory**

R.Imlay, W.Metcalf, S.Ouedraogo, M.Sung, M.O.Wascko  
**Louisiana State University**

J.Cao, Y.Liu, B.P.Roe, H.J.Yang  
**University of Michigan**

A.O.Bazarko, P.D.Meyers, R.B.Patterson, F.C.Shoemaker,  
H.A.Tanaka  
**Princeton University**

P.Nienaber  
**St. Mary's University of Minnesota**

J. M. Link  
**Virginia Polytechnic Institute**

E.Hawker  
**Western Illinois University**

A.Curioni, B.T.Fleming  
**Yale University**

Y.Liu, D. Perevalov, I.Stancu  
**University of Alabama**  
S.Koutsoliotas  
**Bucknell University**

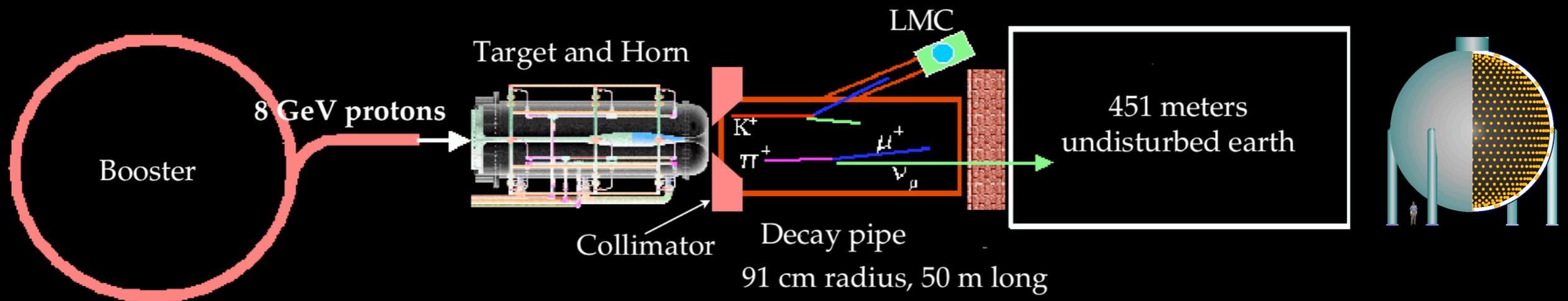
R.A.Johnson, J.L.Raaf  
**University of Cincinnati**

T.Hart, R.H.Nelson, M. Tzanov, M.Wilking,  
E.D.Zimmerman  
**University of Colorado**

A.A.Aguilar-Arevalo, L.Bugel, L.Coney, J.M.Conrad,  
Z.Djurcic, J.Monroe, D.Schmitz, M.H.Shaevitz, M.Sorel,  
G.P.Zeller  
**Columbia University**

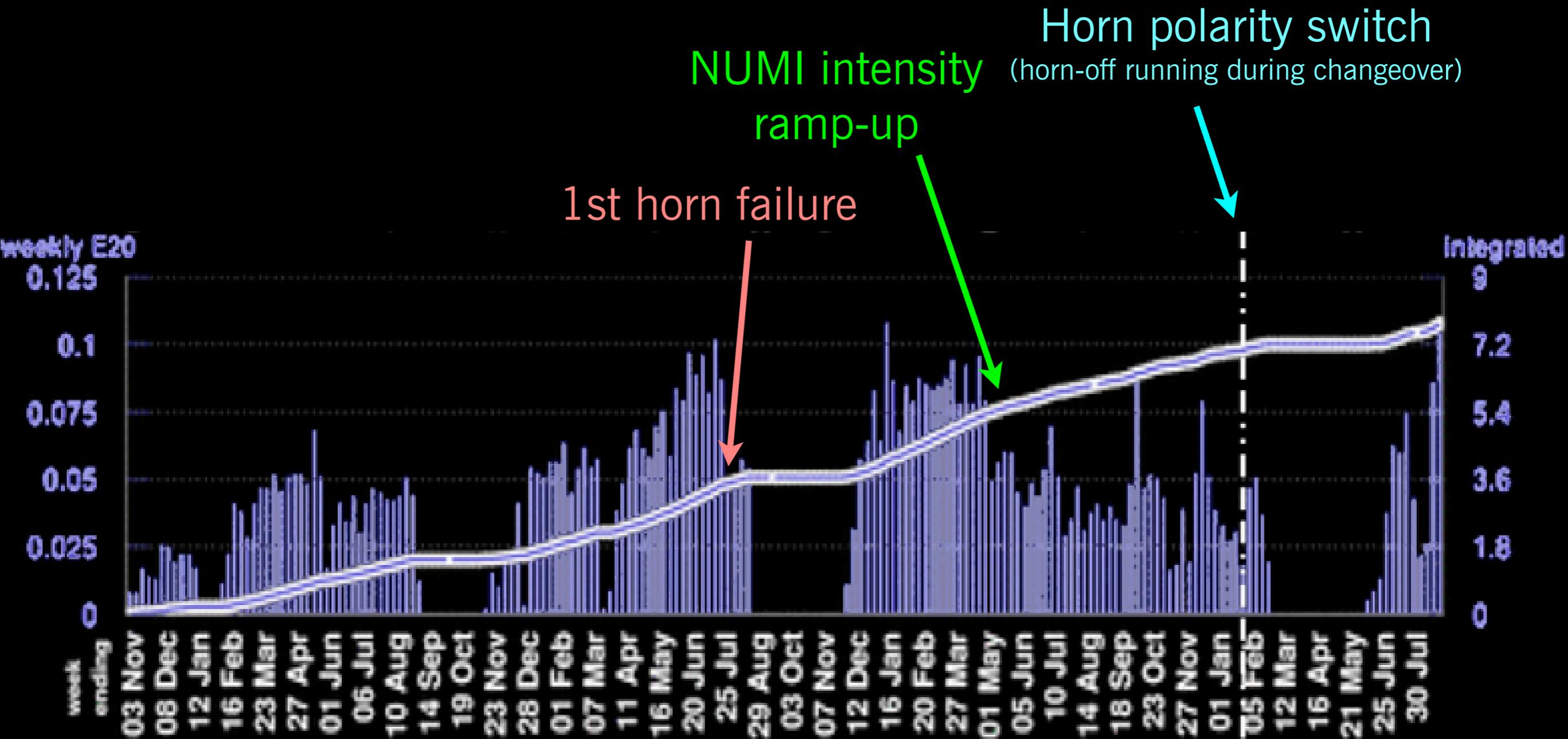
D.Smith  
**Embry Riddle Aeronautical University**

# MiniBooNE Beamline



- 8 GeV primary protons come from Booster accelerator at Fermilab
- Booster provides about 5 pulses per second,  $5 \times 10^{12}$  protons per  $1.6 \mu s$  pulse under optimum conditions

# Beam Delivery Milestones



2002

2003

2004

2005

2006

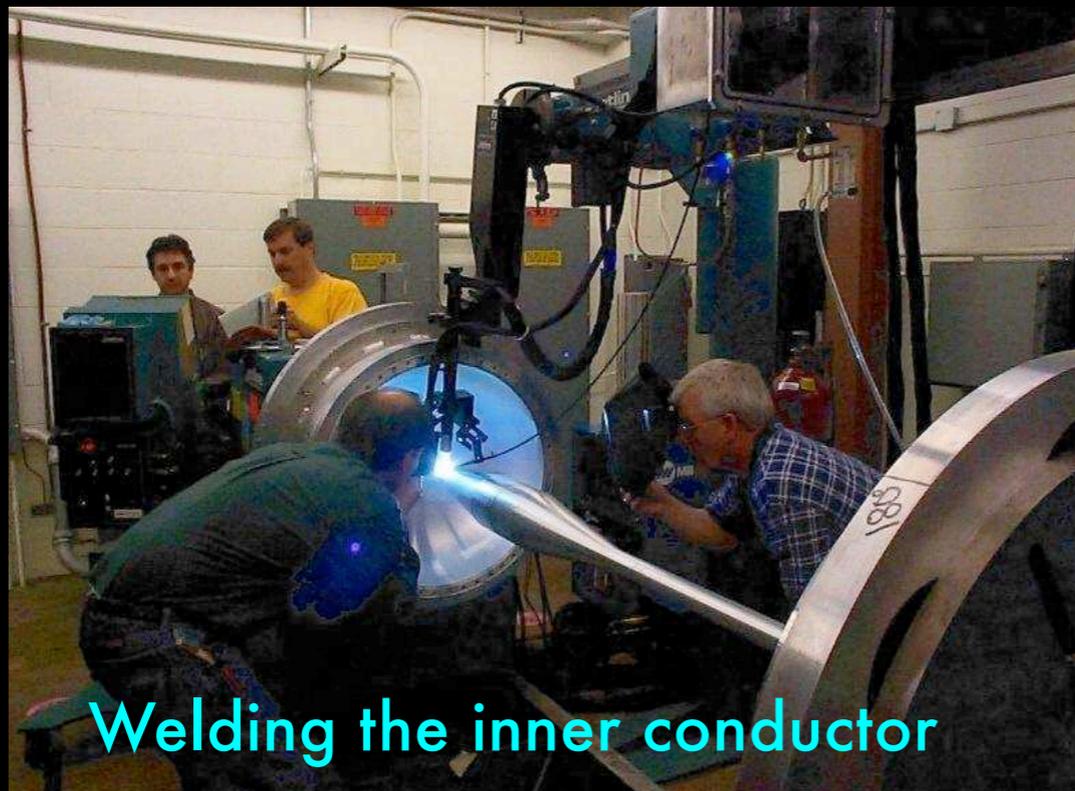
First oscillation result uses the 2002-2005 E898 data set ( $5.7E20$  pot).

# Secondary beam: horn and target

- Target is beryllium, 71 cm ( $1.7\lambda$ ).
- Cooling tube and target are cantilevered into the neck of the horn.
- MiniBooNE horn runs at 174 kA, 140  $\mu$ s pulse.
- This horn survived 96 million pulses – a world record! – before failing in July 2004.
- Replacement has already seen  $>10^8$  pulses and shows no sign of deterioration.



Target assembly

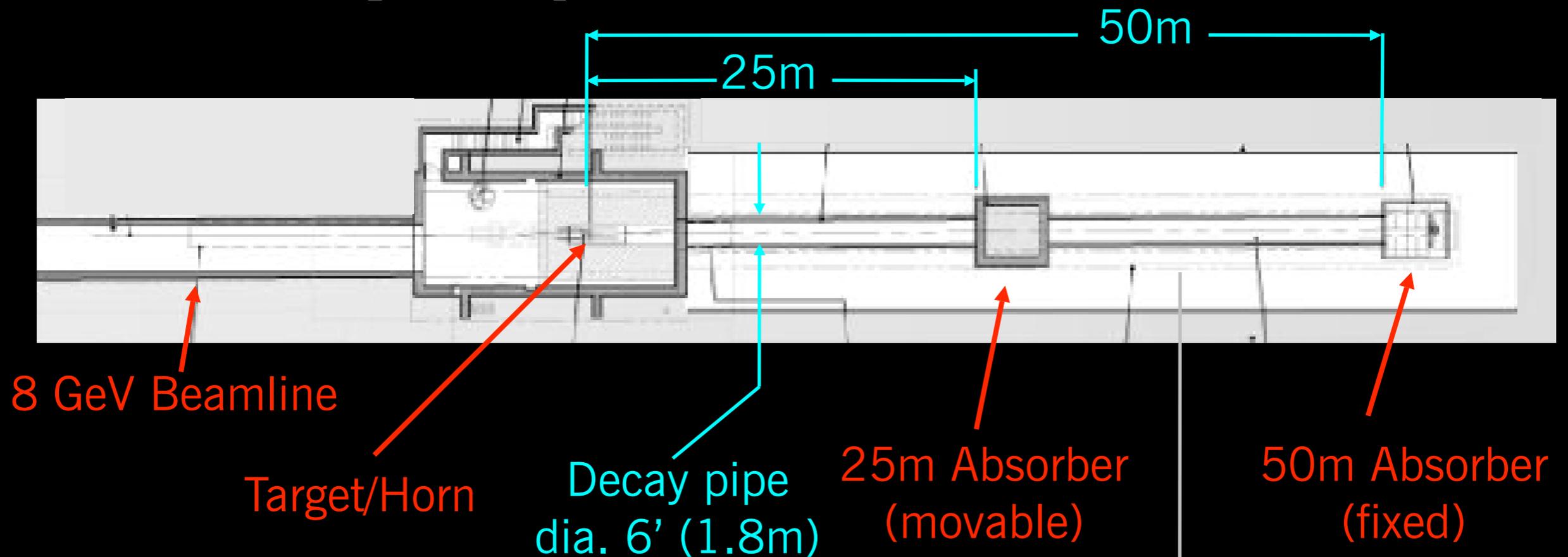


Welding the inner conductor



Assembled horn

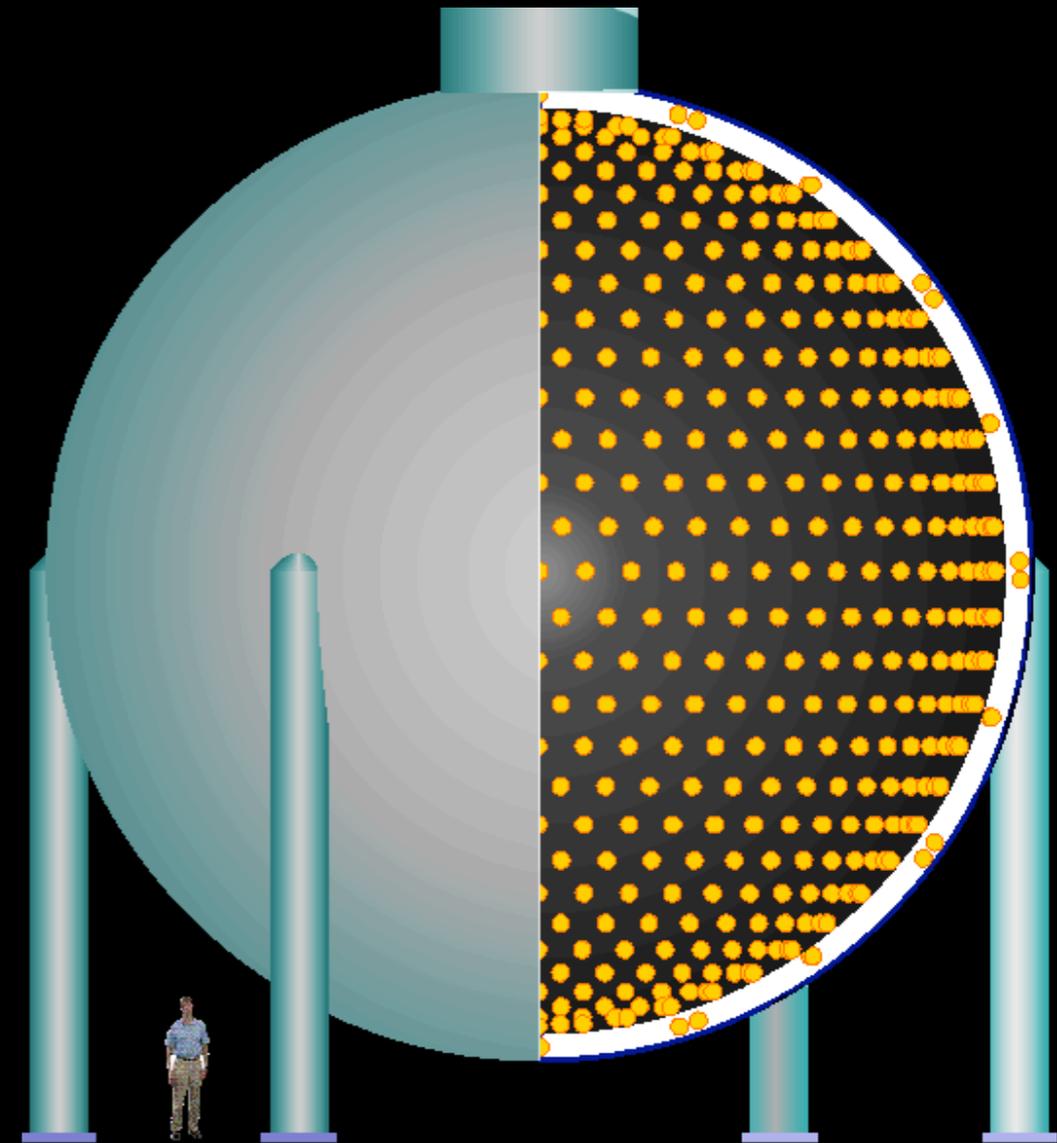
# Decay Pipe and absorber



- Decay region is filled with stagnant air shared with target pile.
- The 25m Absorber is designed to be lowered in for cross-checks if MiniBooNE sees a signal.
- Both absorbers contain muon monitors.

- Shielding provided by gravel fill and earth berm above decay pipe

# MiniBooNE neutrino detector

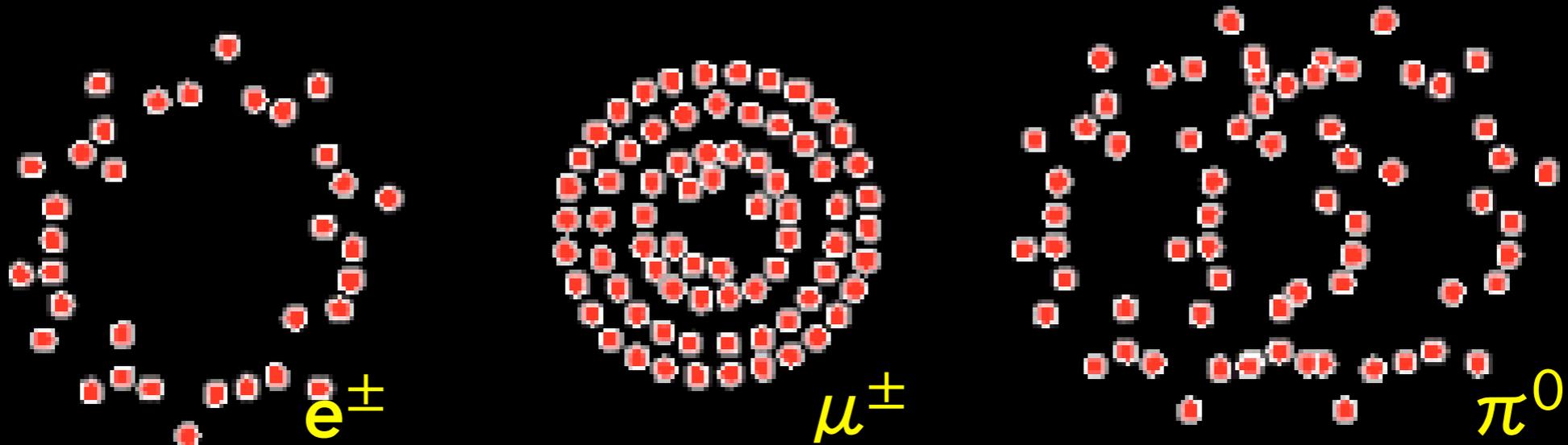


- Pure mineral oil
- 800 tons; 40 ft diameter
- Inner volume: 1280 8" PMTs
- Outer veto volume: 240 PMTs

# *The detector records:*

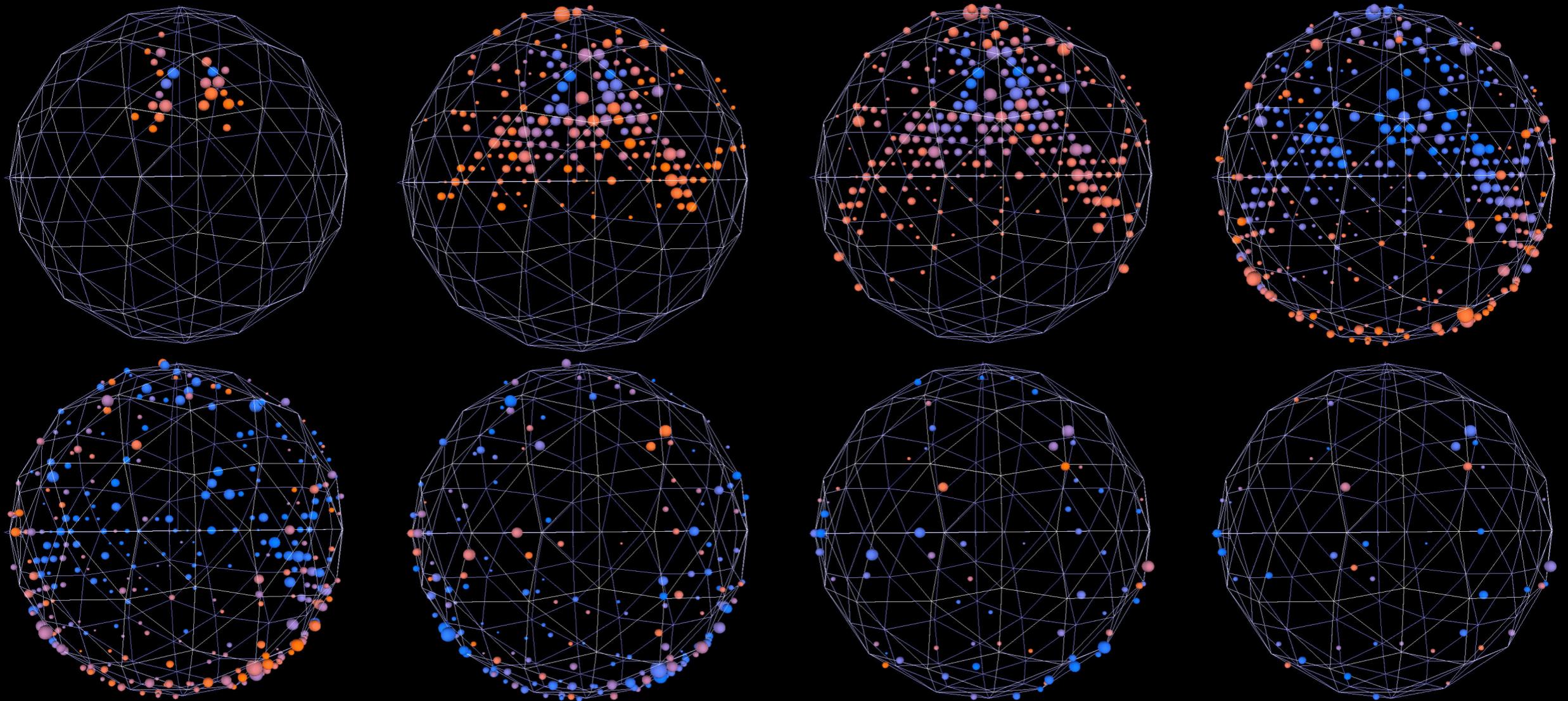
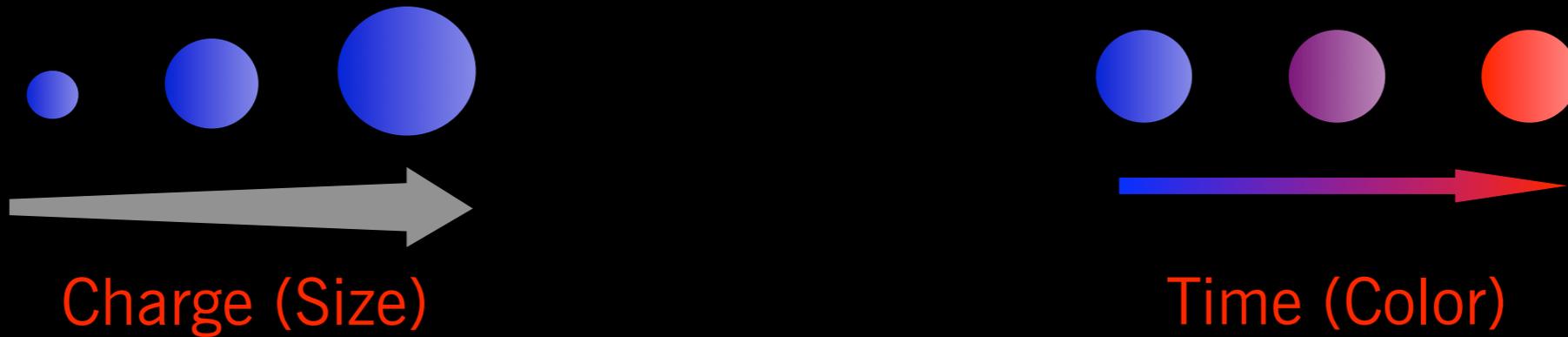
- Every 100 ns clock cycle:
  - **Total charge on each PMT**
    - Resolution  $\sim 1$  photoelectron
  - **Time of first hit on each PMT above threshold**
    - Resolution  $\sim 1.5$  ns
- Begin recording  $4 \mu\text{s}$  before beam pulse
  - Able to check for earlier entering cosmic rays
- Stop recording  $14 \mu\text{s}$  after beam pulse
  - Able to check for subsequent stopped muon decay ("Michel") electron

# Event types:



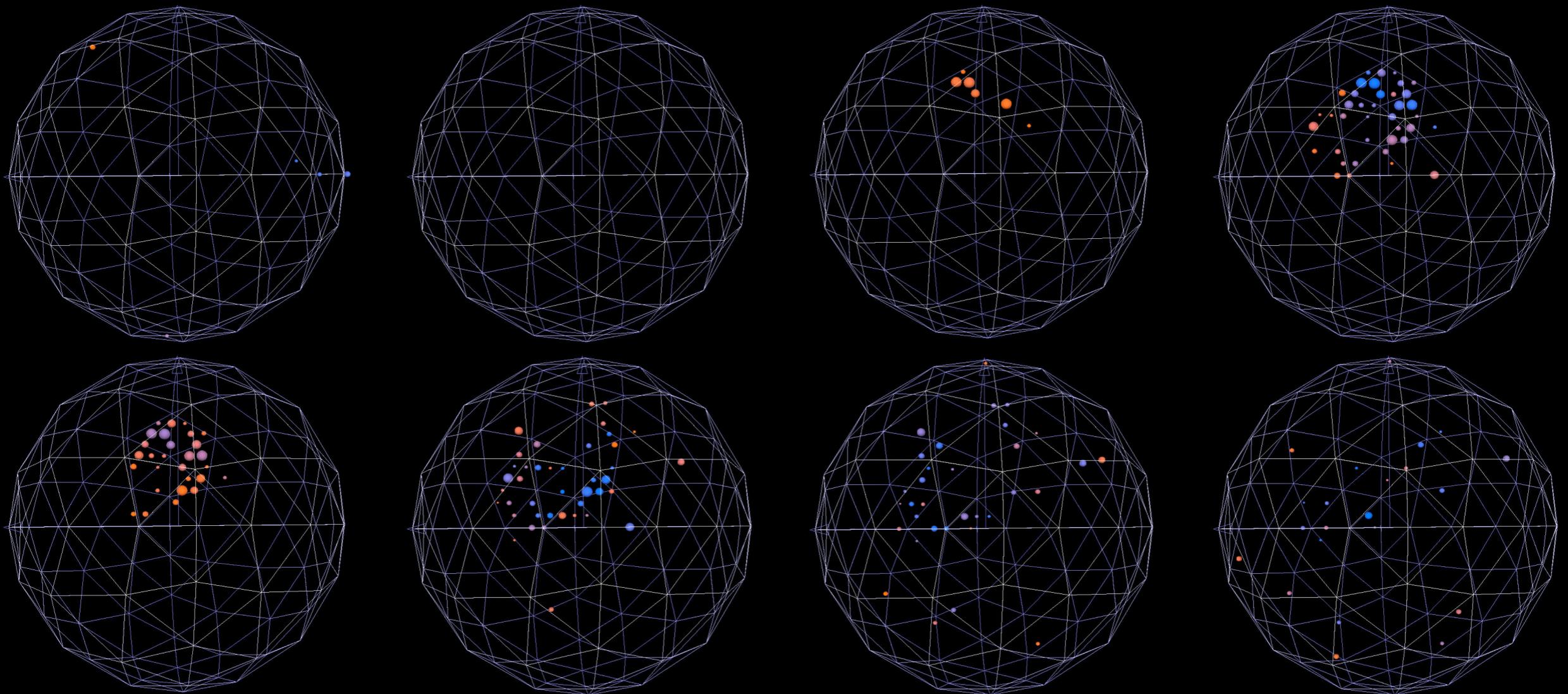
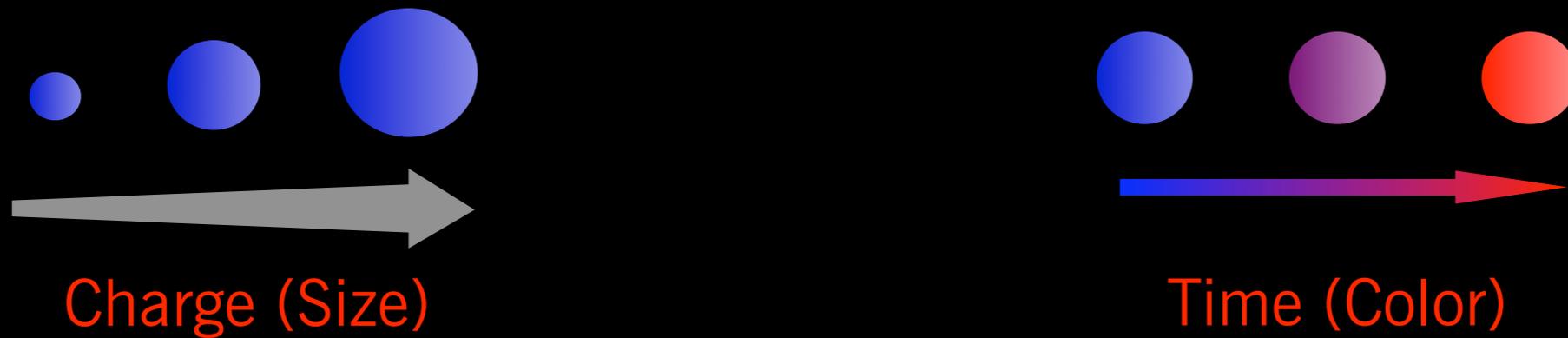
- Electrons: showers, scattering  $\Rightarrow$  poorly-defined ring
- Muons: straight, long track  $\Rightarrow$  well-defined ring
- $\pi^0 \rightarrow \gamma\gamma$ : two electron-like ring

# Event display: Cherenkov Rings



A cosmic-ray muon enters the tank and stops...

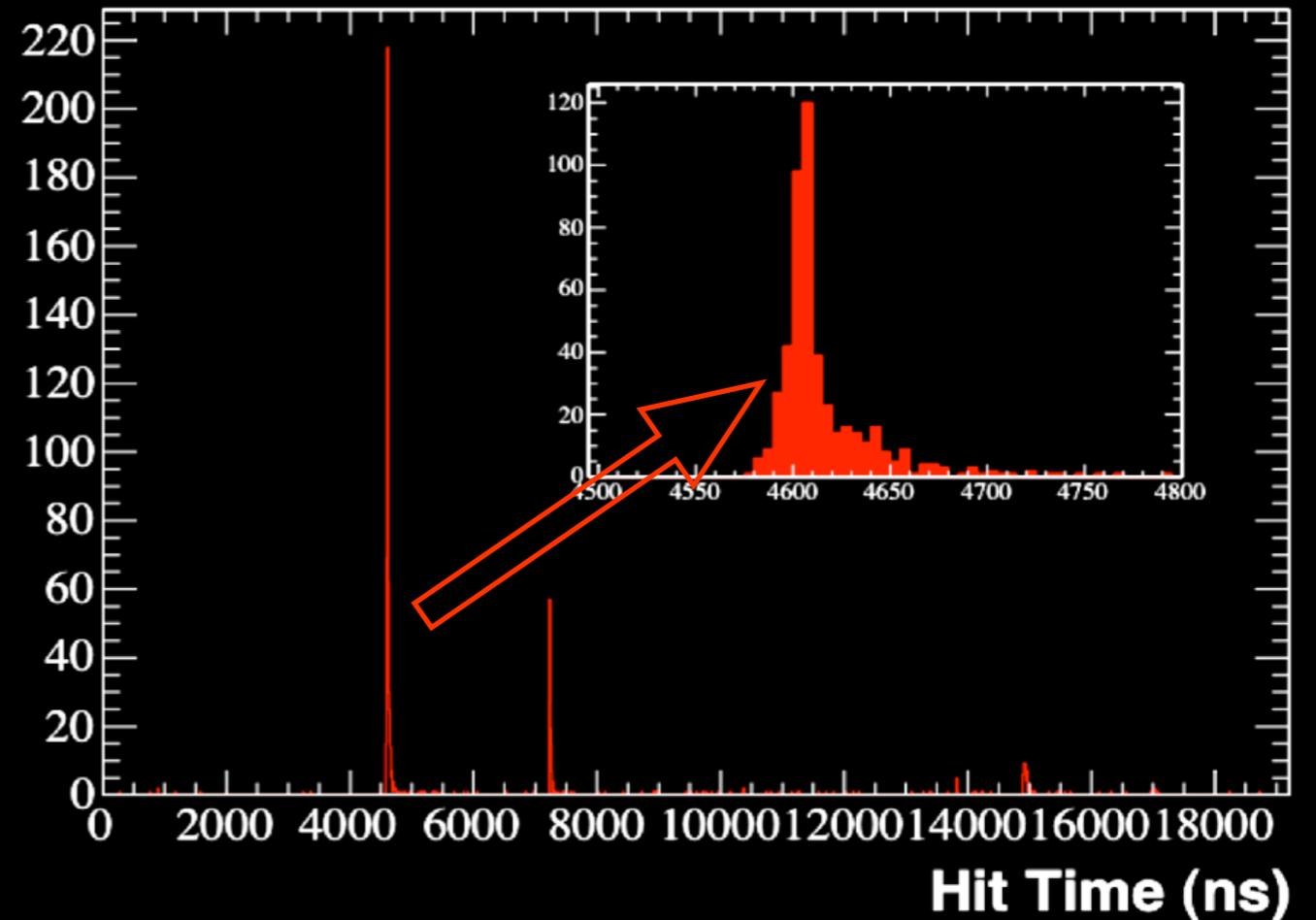
# Event display: Cherenkov Rings



...then the Michel electron is observed a few  $\mu\text{s}$  later.

# Subevents

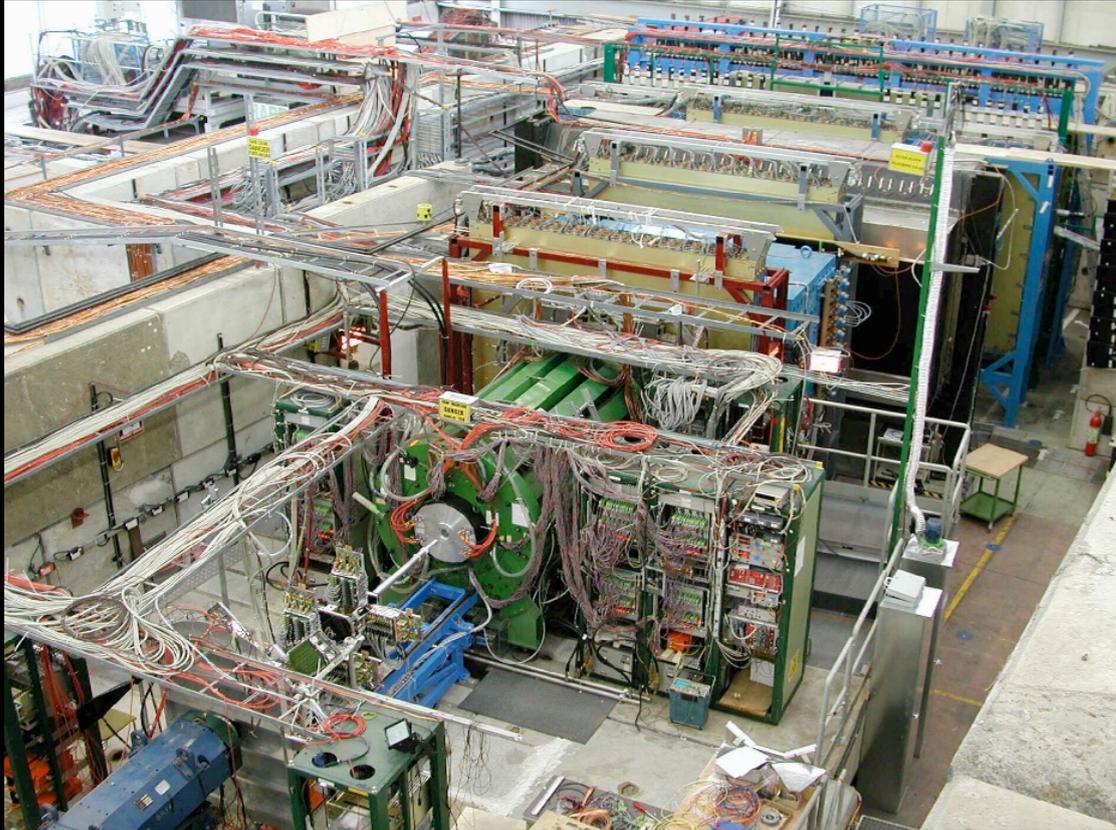
- We resolve the stopping muon and its Michel electron as two “subevents” (clusters of hits within  $\sim 100$  ns).
- The Michel electron subevent provides muon tag as well as a very well-understood charge/energy calibration
- Muons capture on nucleus with 8% probability; these capture events cannot be tagged.



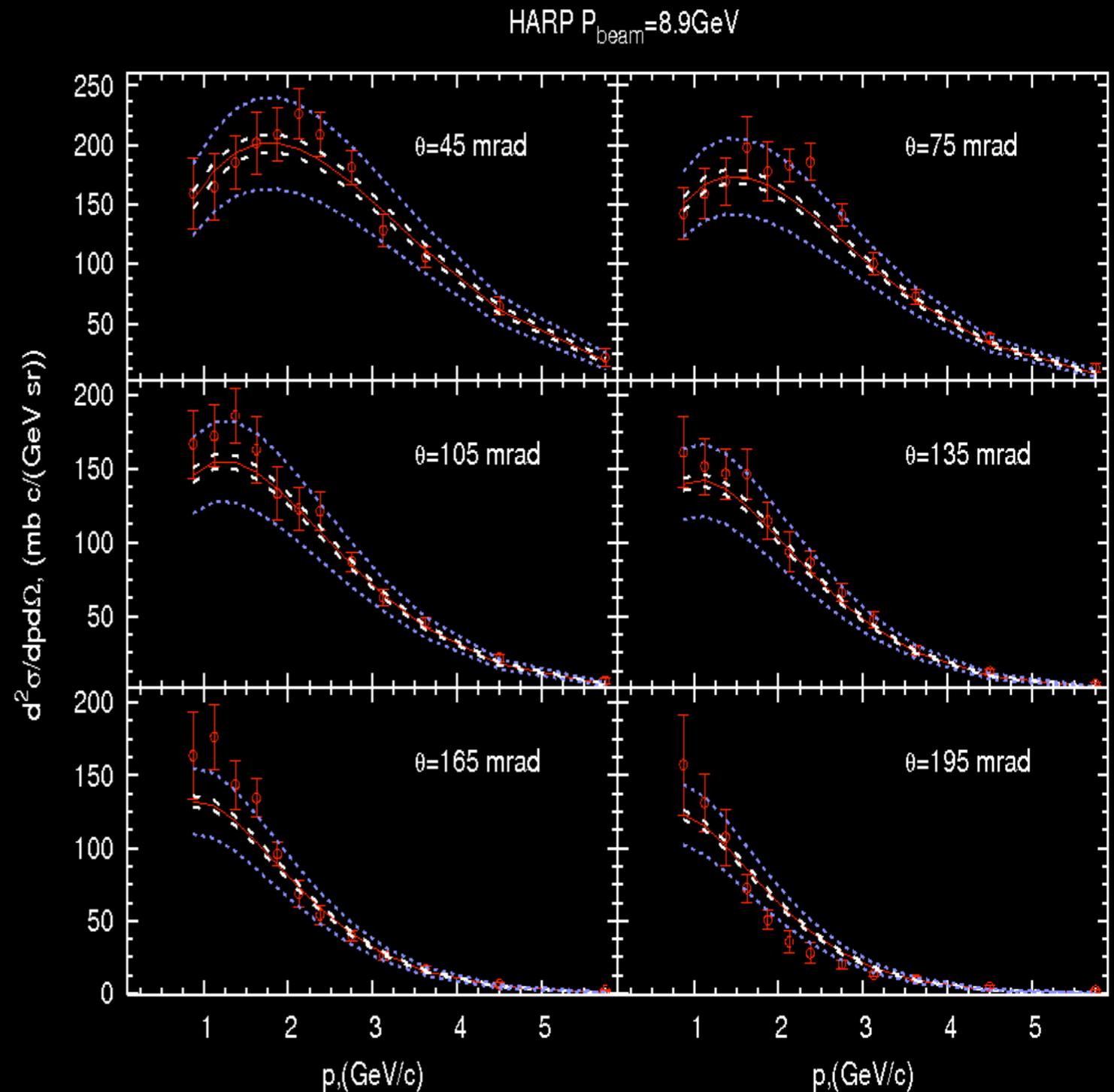
# *Oscillation Analysis*

- Steps to an oscillation result:
  - Predict flux
  - Model neutrino interactions in detector
  - Model detector response
  - Reconstruct events; particle ID
  - Oscillation fit

# Flux model: Pion production



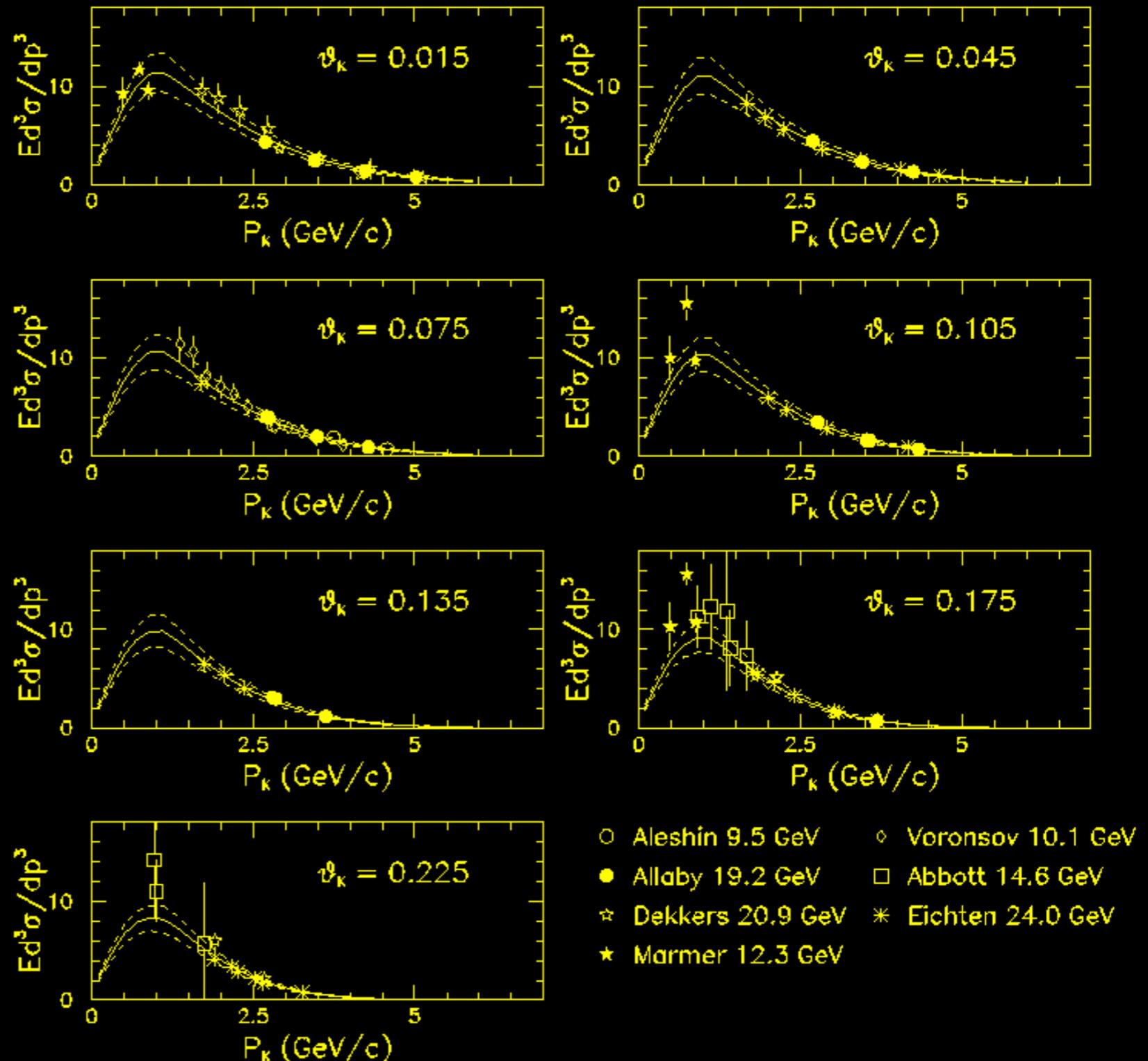
- Data from HARP experiment at CERN (taken with beryllium target at correct MiniBooNE beam momentum: [hep-ex/0702024](https://arxiv.org/abs/hep-ex/0702024))
- Fit data to Sanford-Wang parametrization
- Sanford-Wang model used in GEANT4 beam Monte Carlo



# Flux model: kaon production

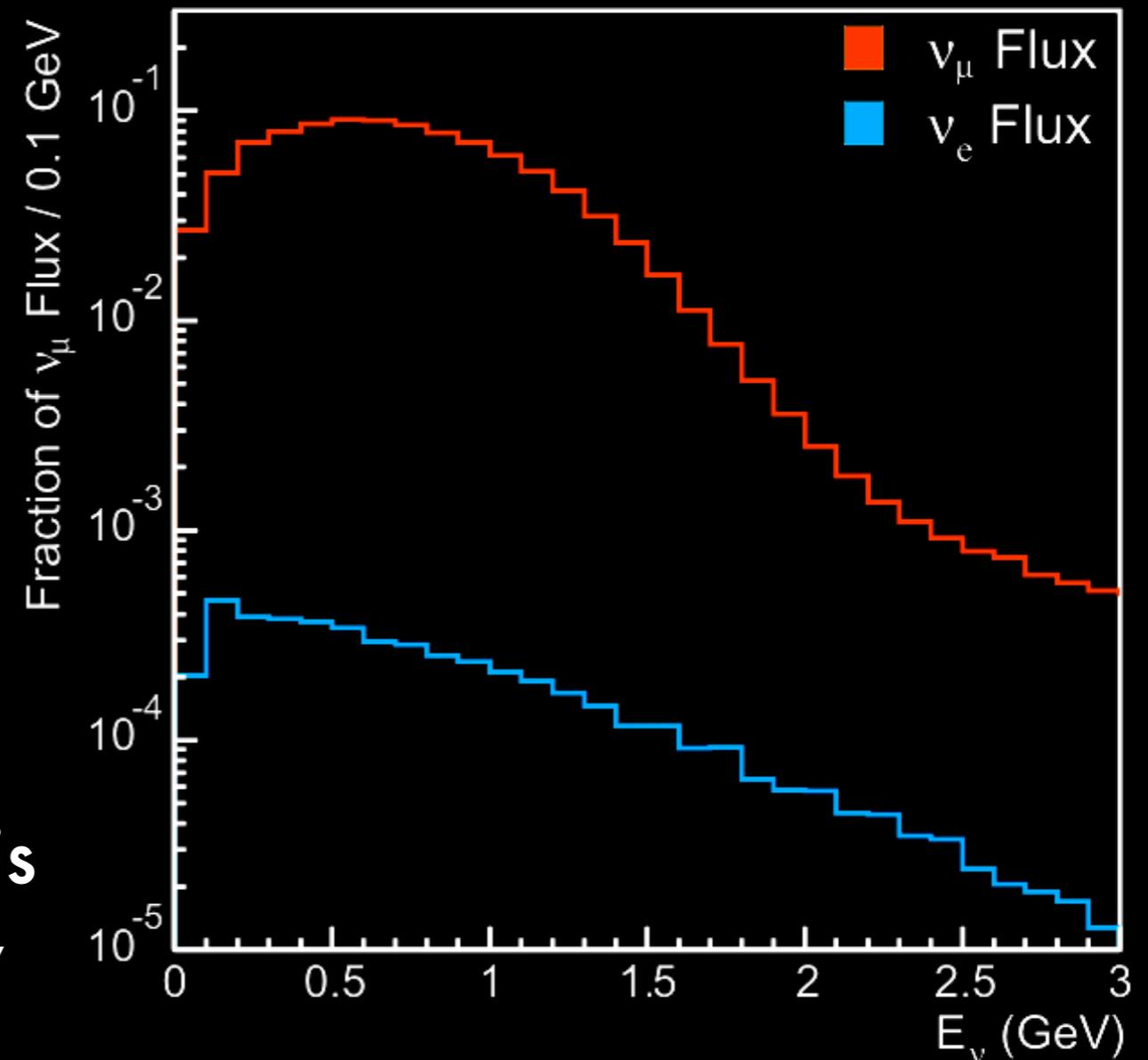
- Kaon production data from many experiments, with primary beam momentum  $9 \rightarrow 24$  GeV
- Fit data to a Feynman scaling parametrization
- Sanford-Wang model used as well; errors cover the differences in flux predictions for MiniBooNE

$K^+$  Production Data and Fit (Scaled to  $P_{\text{beam}} = 8.89$  GeV)

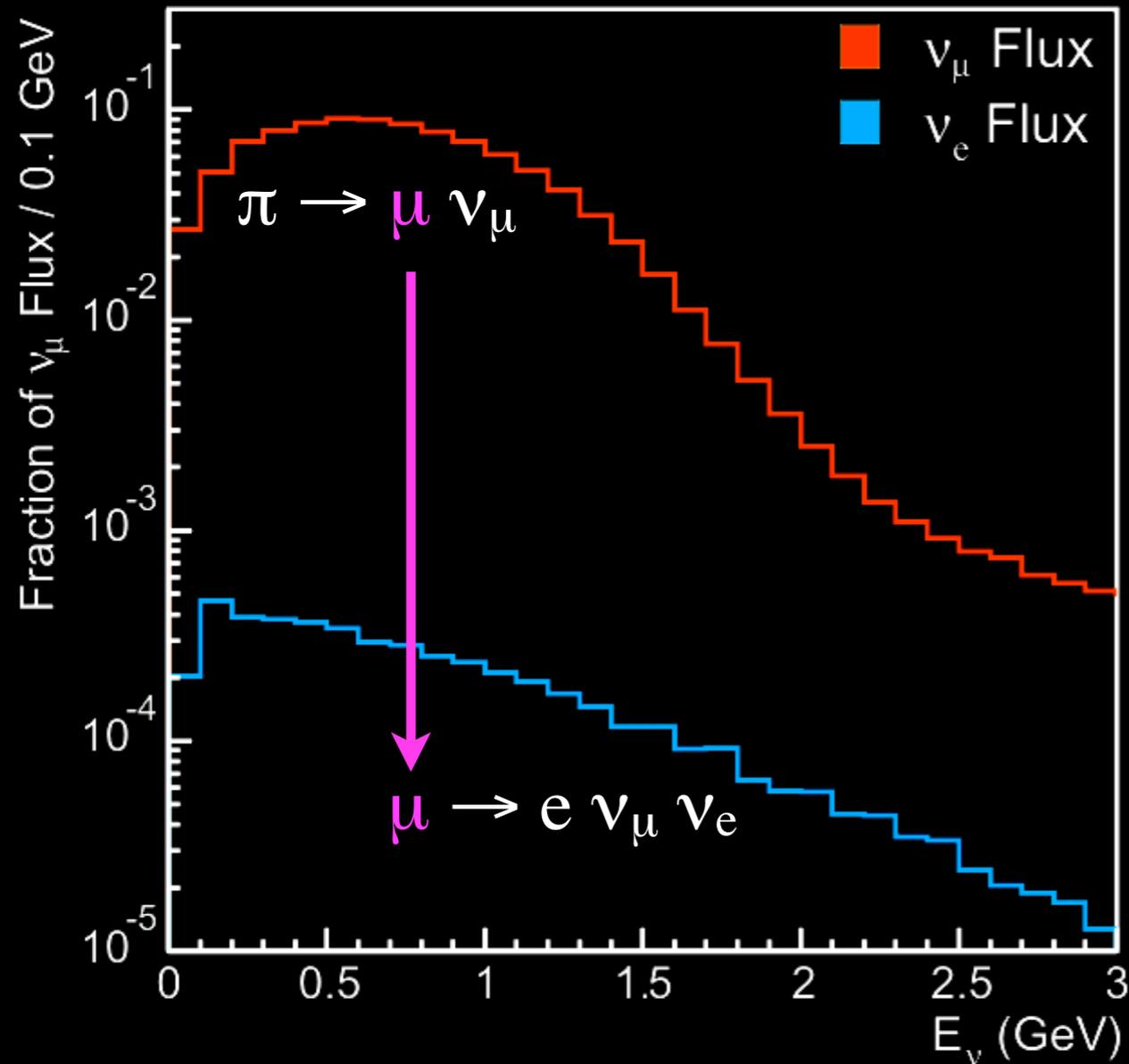


# Predicted flux at detector

- Predicted flux:
  - **99.5%**  $\nu_\mu + \bar{\nu}_\mu$
  - **0.5%**  $\nu_e + \bar{\nu}_e$ :
    - $\mu^+ \rightarrow e^+ \bar{\nu}_\mu \nu_e$  (52%)
    - $K^+ \rightarrow \pi^0 e^+ \nu_e$  (29%)
    - $K^0 \rightarrow \pi^+ e^- \bar{\nu}_e$  (7%)
    - $K^0 \rightarrow \pi^- e^+ \nu_e$  (7%)
    - $\pi^+ \rightarrow e^+ \nu_e$  (4%)
    - *Other* (<1%)
- Total antineutrino content is 6% (much of it at very low energy)

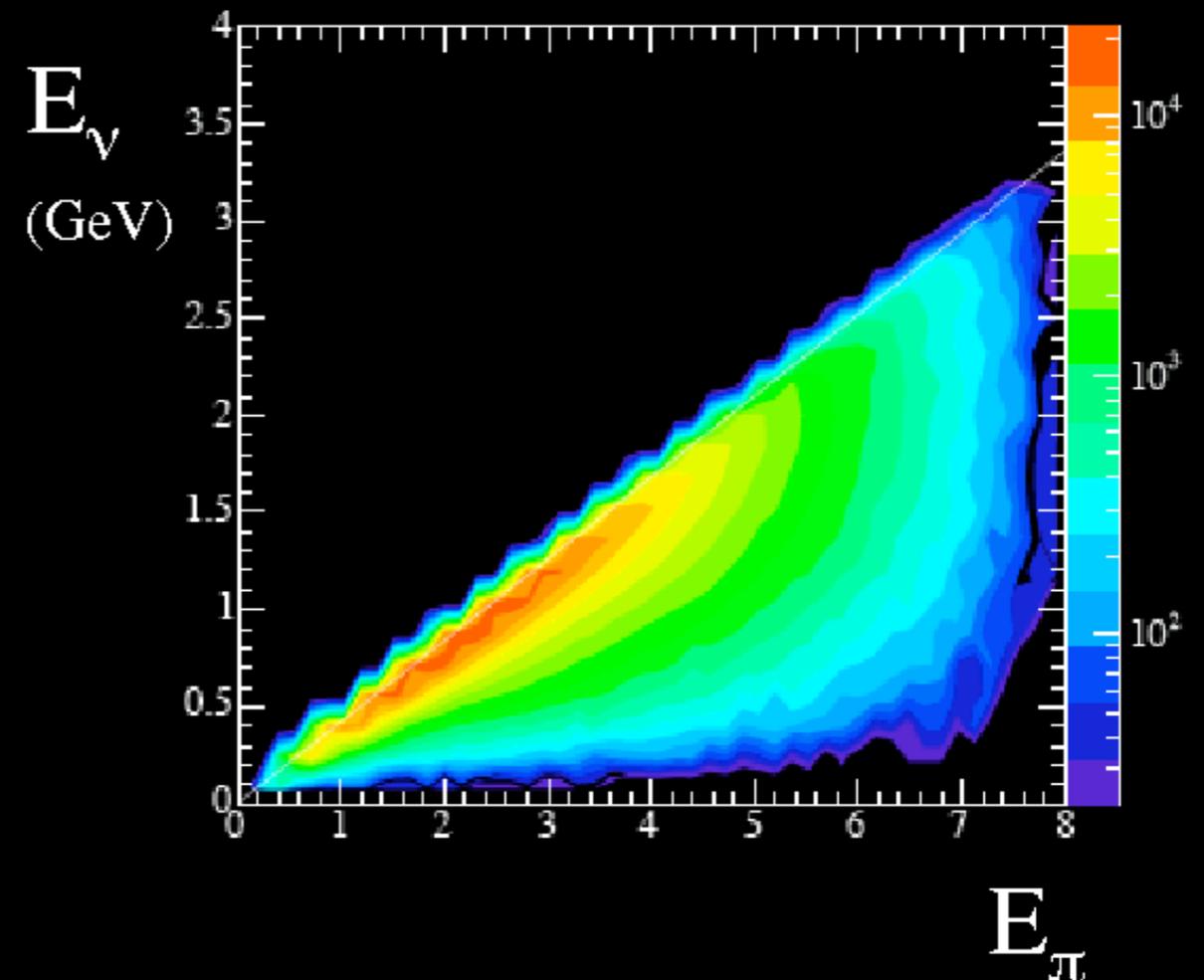


# Further constraint on muon-decay $\nu_e$

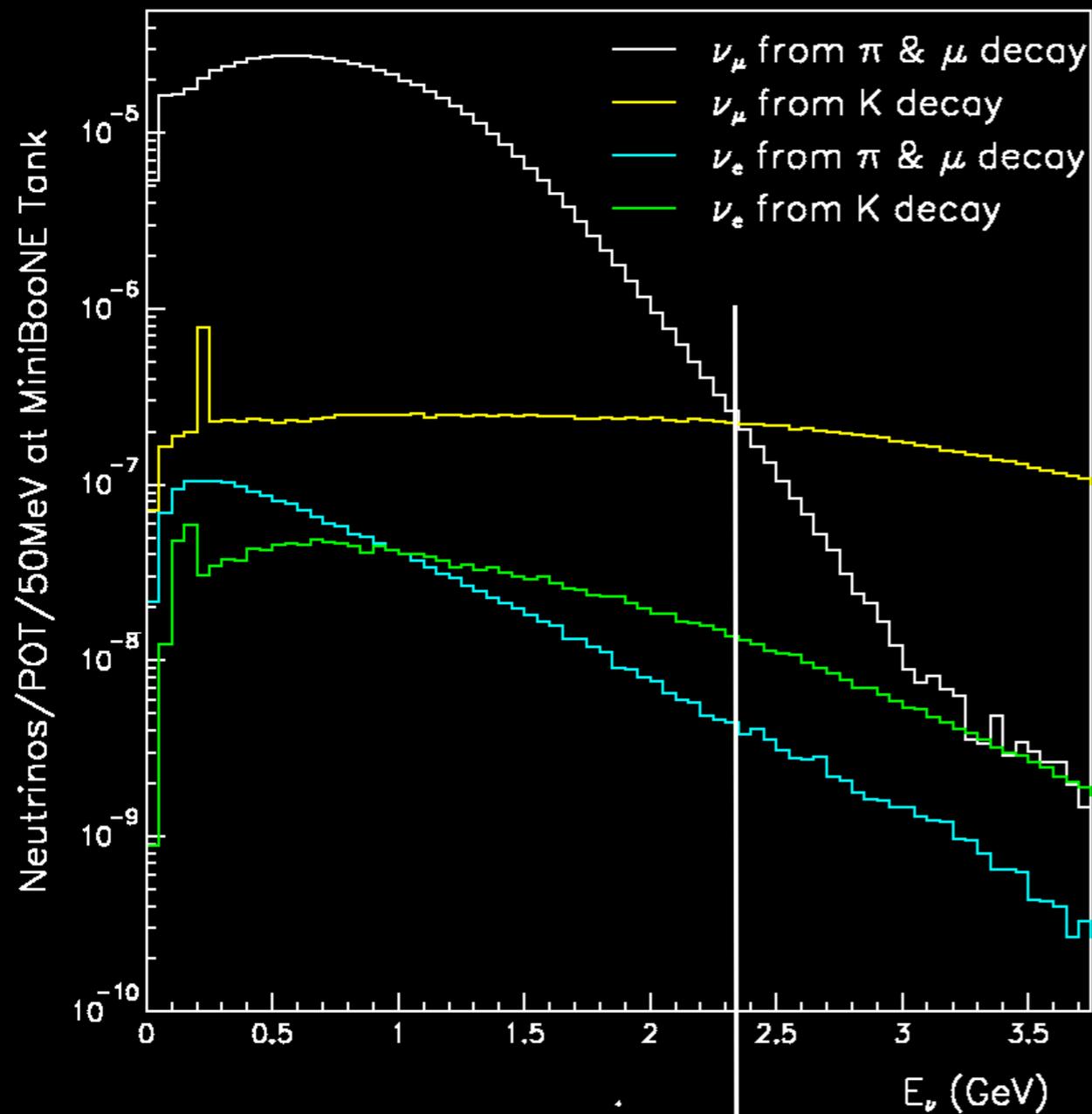


- These pions also produce  $\nu_\mu$  in detector, which are easily observed
- Kinematic correlation allows tight constraint on  $\pi^+ \rightarrow \mu^+ \rightarrow \nu_e$  chain

Muons originate predominantly from pion decays in secondary beam



# High energy events constrain kaon decay flux



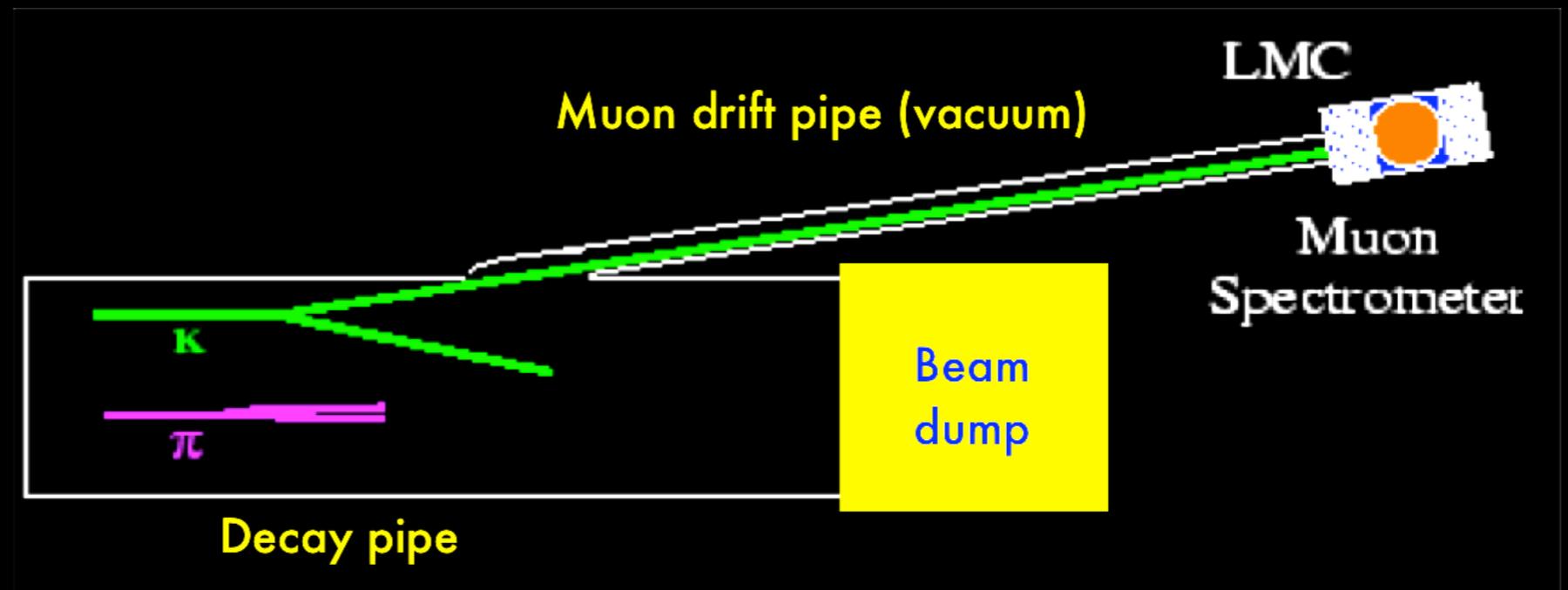
- Kaon decay has much higher Q-value than pion decay
- Kaons produce higher energy neutrinos
- Particularly true for two-body  $K^+ \rightarrow \mu^+ \nu_\mu$
- Use the high energy  $\nu_\mu$  events to constrain the kaon flux that produces  $\nu_e$  background

←  
Dominated by  
 $\pi$  decay

→  
Dominated by  
K decay

# *In-situ cross-check on kaon flux: Little Muon Counter (LMC)*

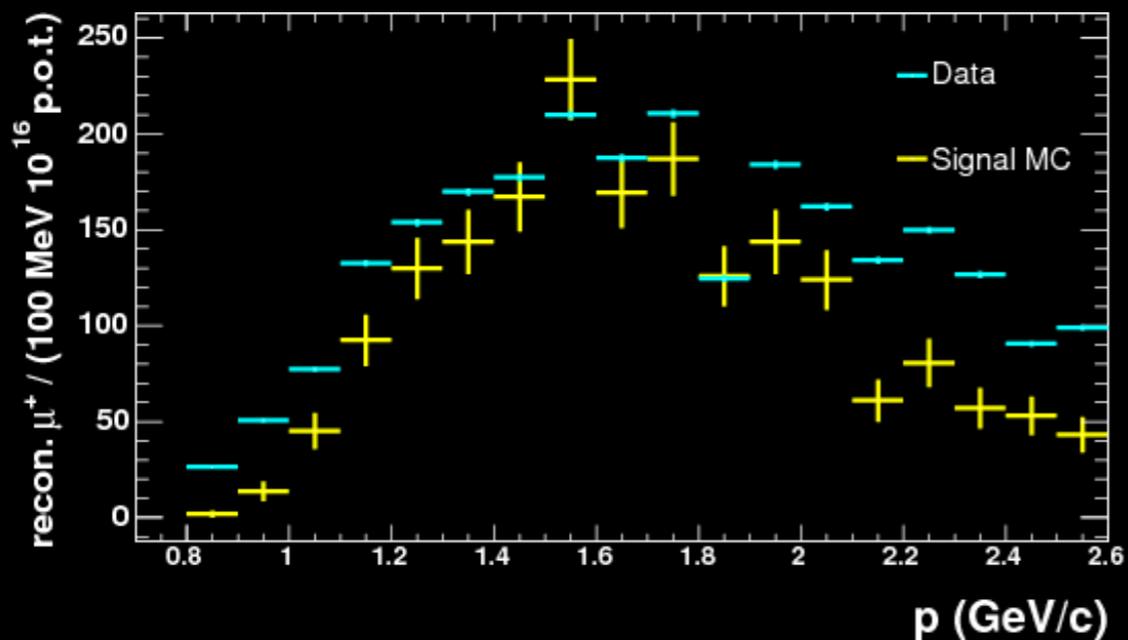
Use kinematics of the muons in the decay pipe to isolate kaon-decay contribution



- Phase space in two-body decays limits the accessible kinematic region of the products:
- High- $p_T$   $\mu$ 's come from  $K^+$  decay (mostly)
- Select off-axis decay muons by collimation, to turn  $p_T$  separation into an effective  $|p|$  separation.
- Scintillating fiber tracker / magnetic spectrometer measures muon spectrum

# In-situ cross-check on kaon flux: Little Muon Counter (LMC)

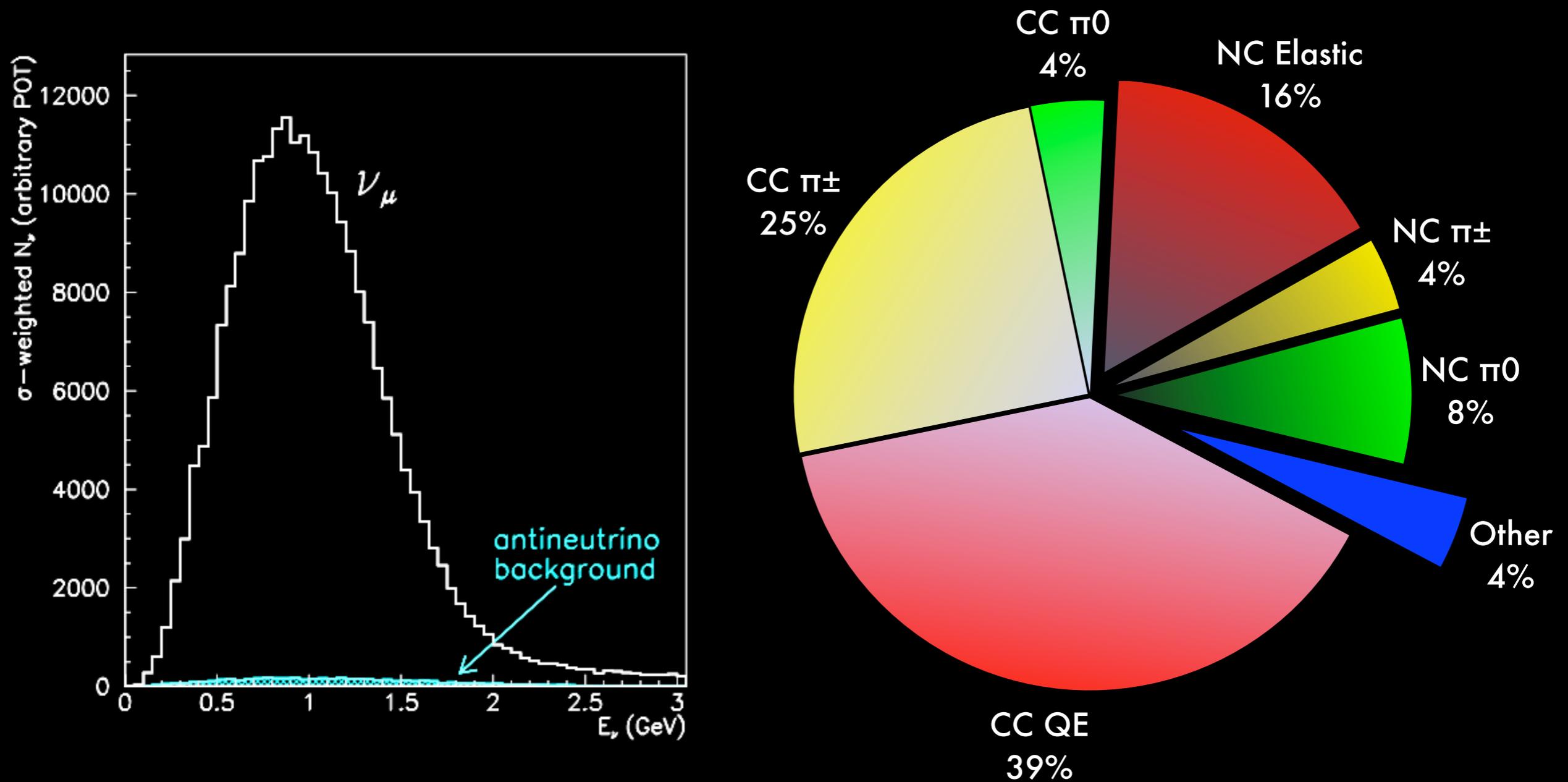
Data/MC ratio is constraint on the  $K^+$  flux normalization:



- MC simulates  $\pi$  and  $K$  decays.
- No hadronic interaction backgrounds simulated yet.
- Plot shows data vs MC for well-identified muons in a region where we expect lower backgrounds.

**Upper limit on the  $K^+$  flux normalization is 1.32 ( $\sim 1\sigma$  on the Feynman scaling fit).**

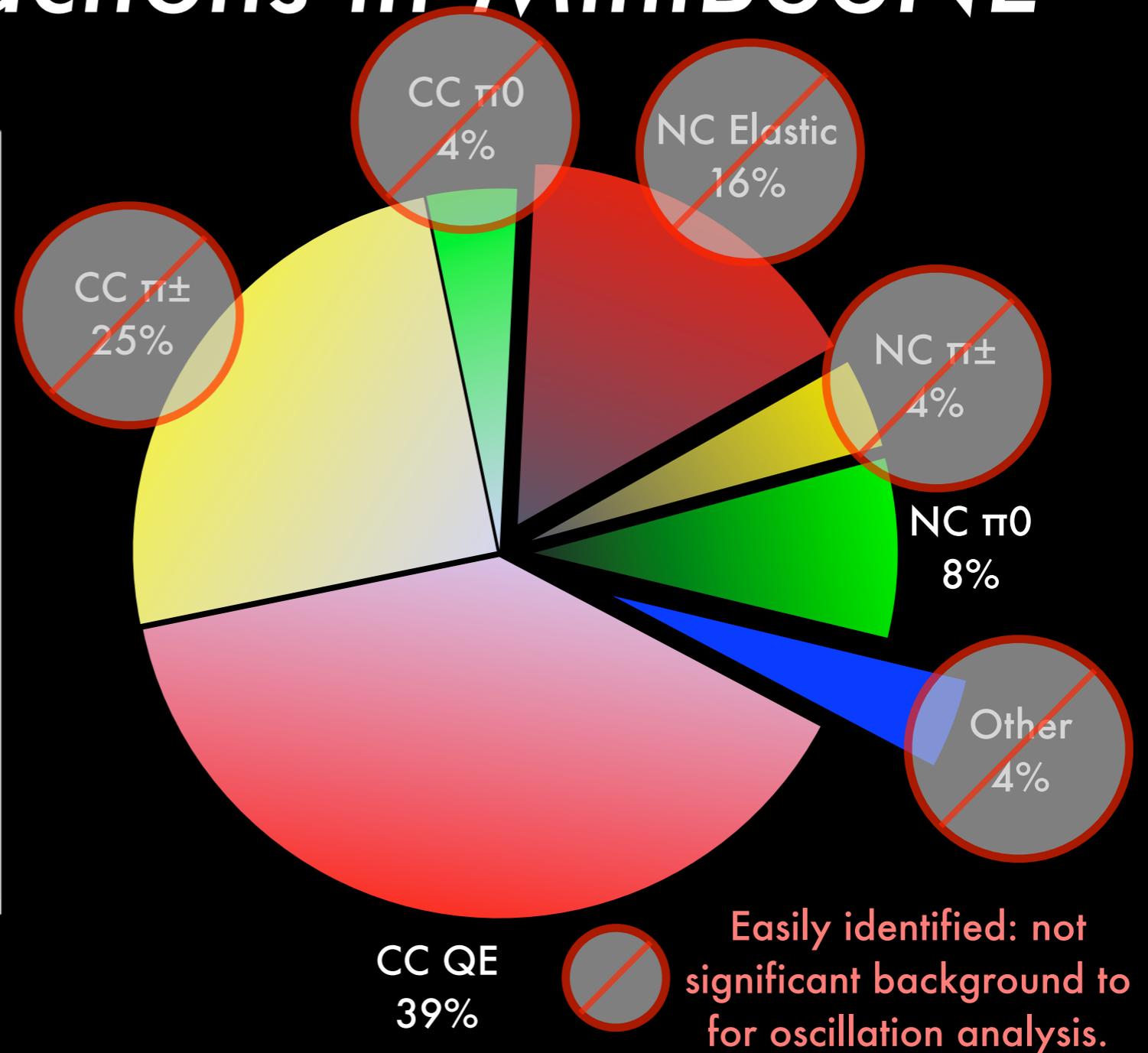
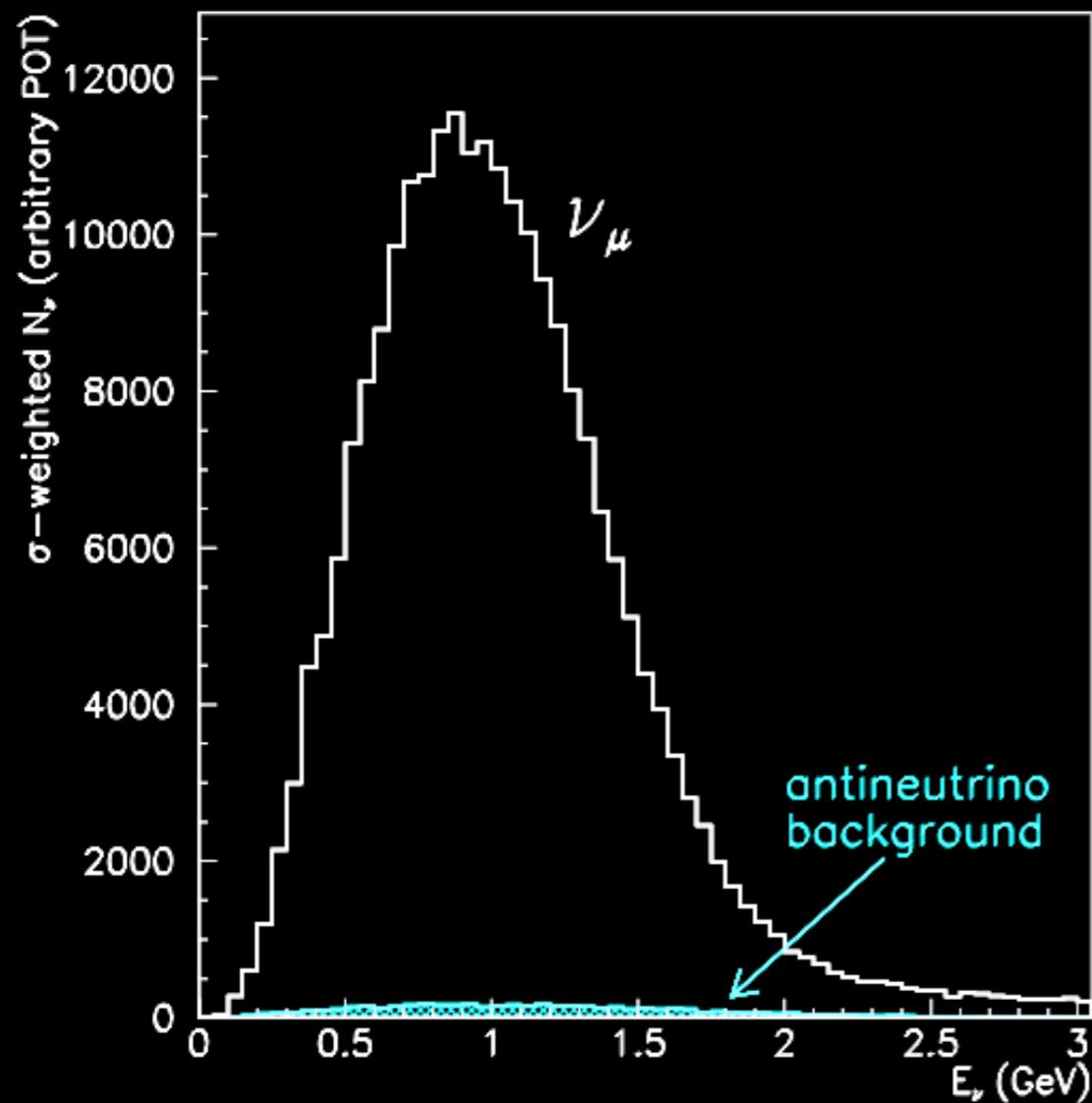
# Neutrino Interactions in MiniBooNE



Predicted event spectrum, fractions before cuts  
(NUANCE Monte Carlo)

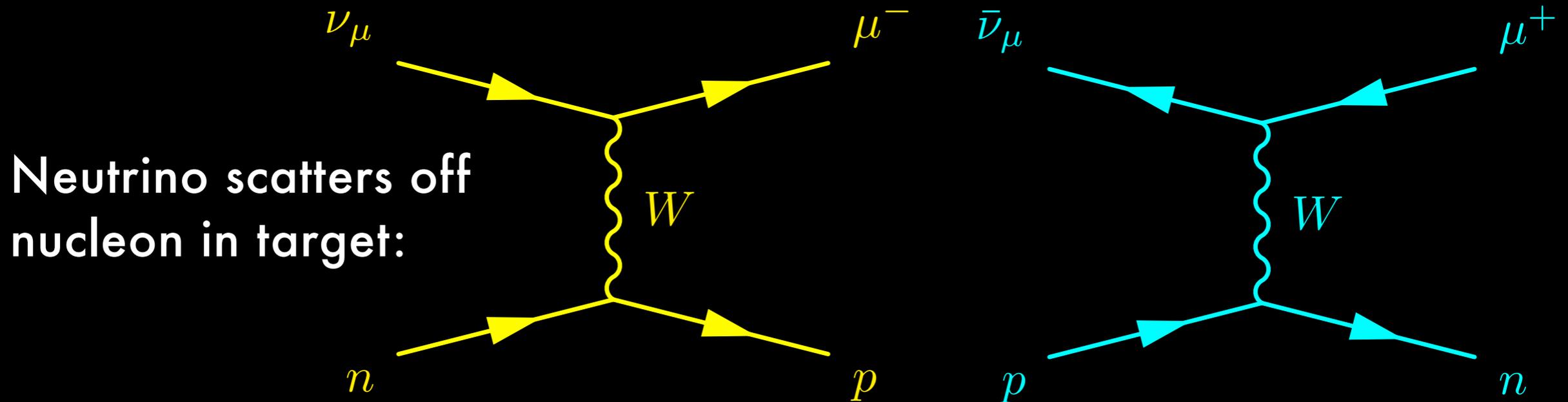
D. Casper, NPS, 112 (2002) 161

# Neutrino Interactions in MiniBooNE



Predicted event spectrum, fractions before cuts  
(NUANCE Monte Carlo)

# Charged-current quasielastic (CCQE)

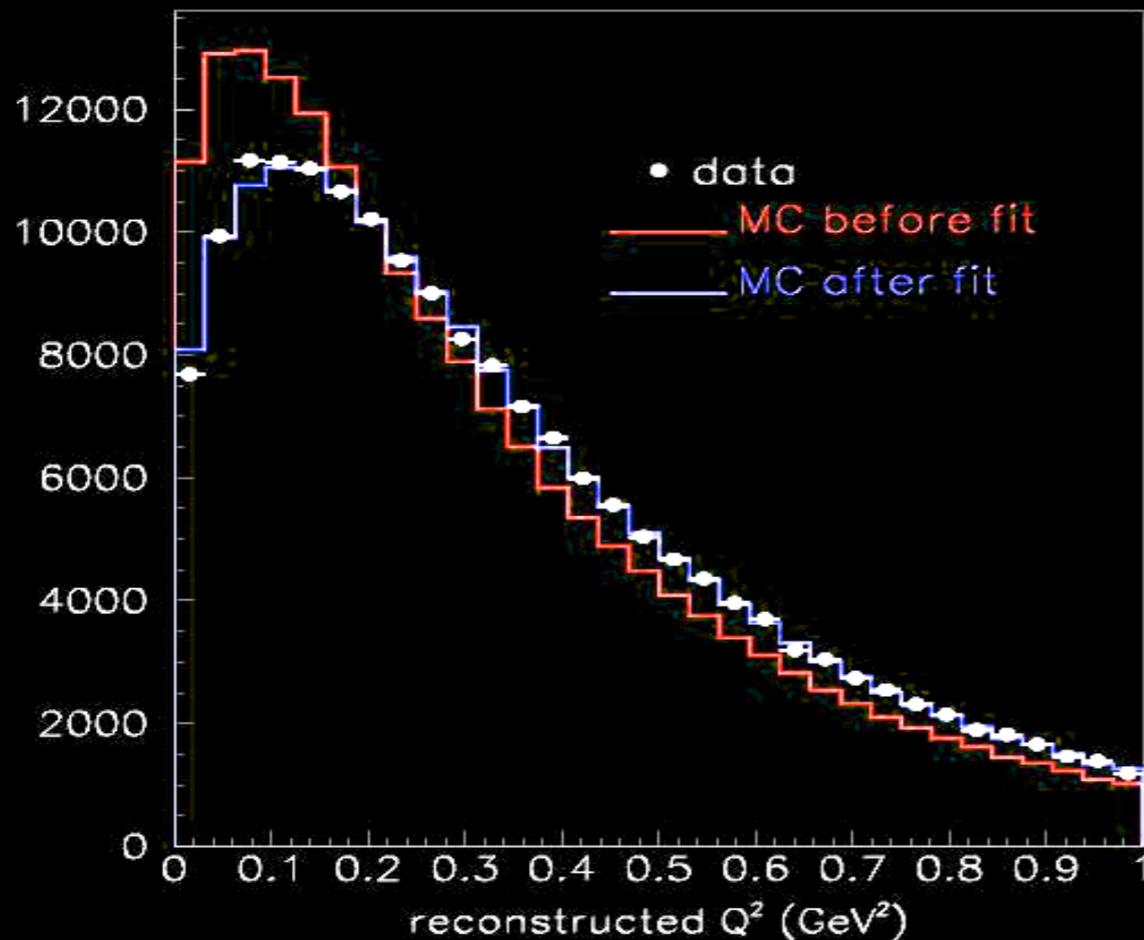


- **Golden signal mode for oscillation search:** clean events; neutrino energy can be calculated given known neutrino direction:

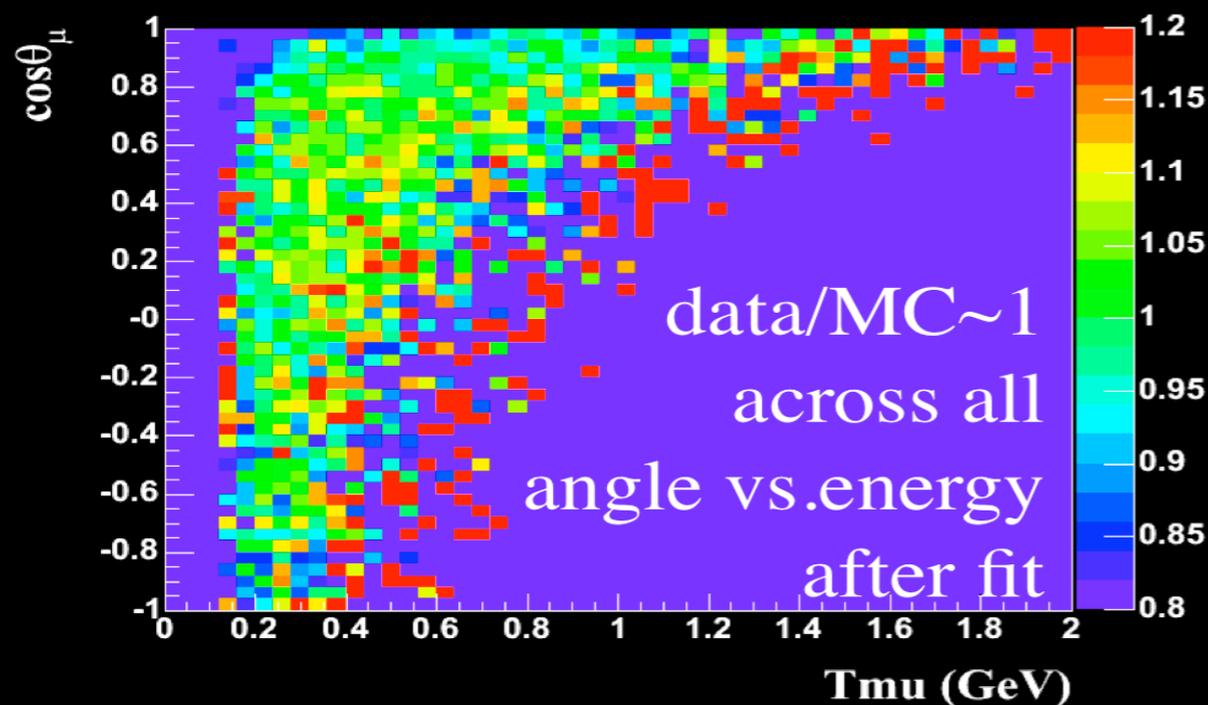
$$E_\nu^{\text{CCQE}} = \frac{m_N E_\ell - \frac{1}{2} m_\ell^2}{m_N - E_\ell + p_\ell \cos \theta_\ell}; \quad Q^2 = -2E_\nu (E_\nu - p_\ell \cos \theta_\ell) + m_\ell^2$$

- Nucleus may break up
- Final state nucleon not excited: no resonance, no pion, no (hard) gamma
- Physics to measure: axial form factor  $F_A$ , parametrized by  $M_A$  (axial mass)

# Cross-section parameters need tuning

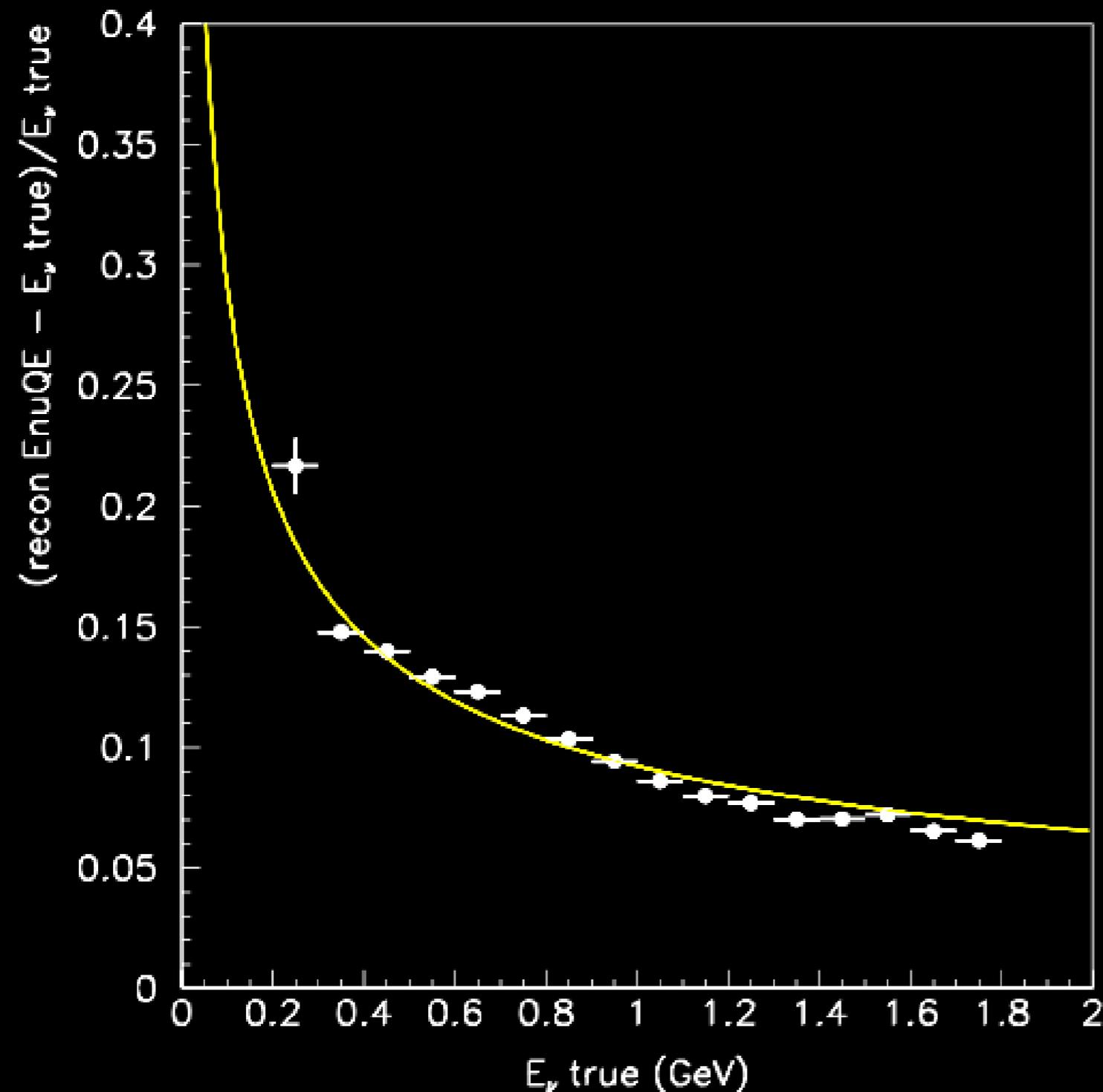


- From  $Q^2$  fits to MiniBooNE  $\nu_\mu$  CCQE data:
  - $M_A^{\text{eff}}$ : effective axial mass
  - $E_{\text{lo}}^{\text{SF}}$ : Pauli-blocking parameter



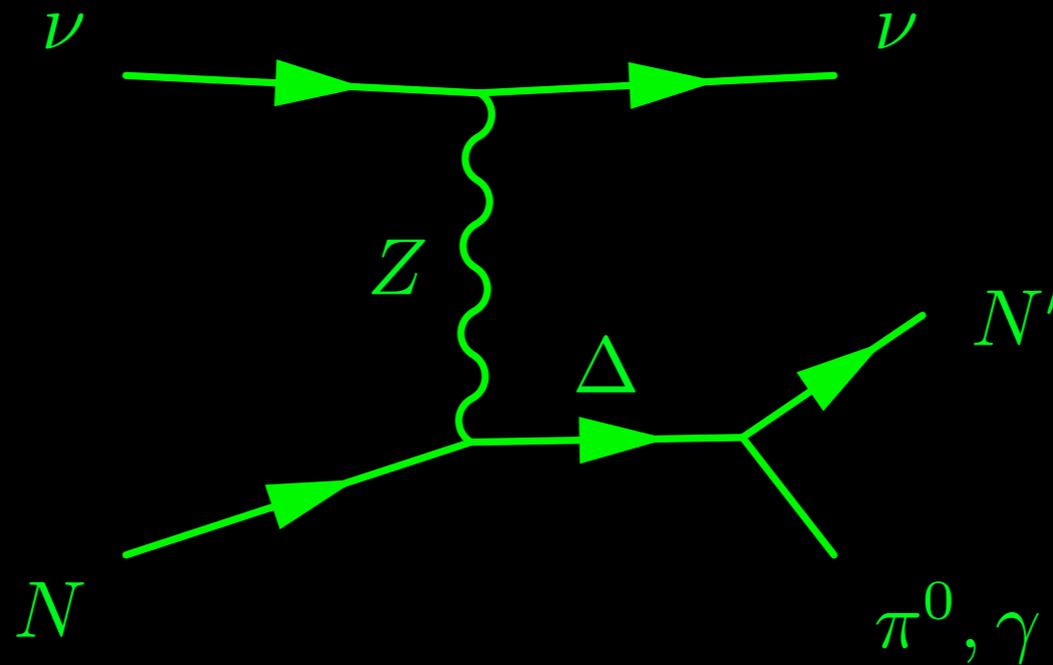
- From electron scattering data:
  - $E_b$  – binding energy
  - $p_F$  – Fermi momentum

# Charged-current quasielastic (CCQE)



- MiniBooNE  $E_{\nu}^{\text{CCQE}}$  Reconstruction
- Resolution 8-15% in region of interest (300-1200 MeV)

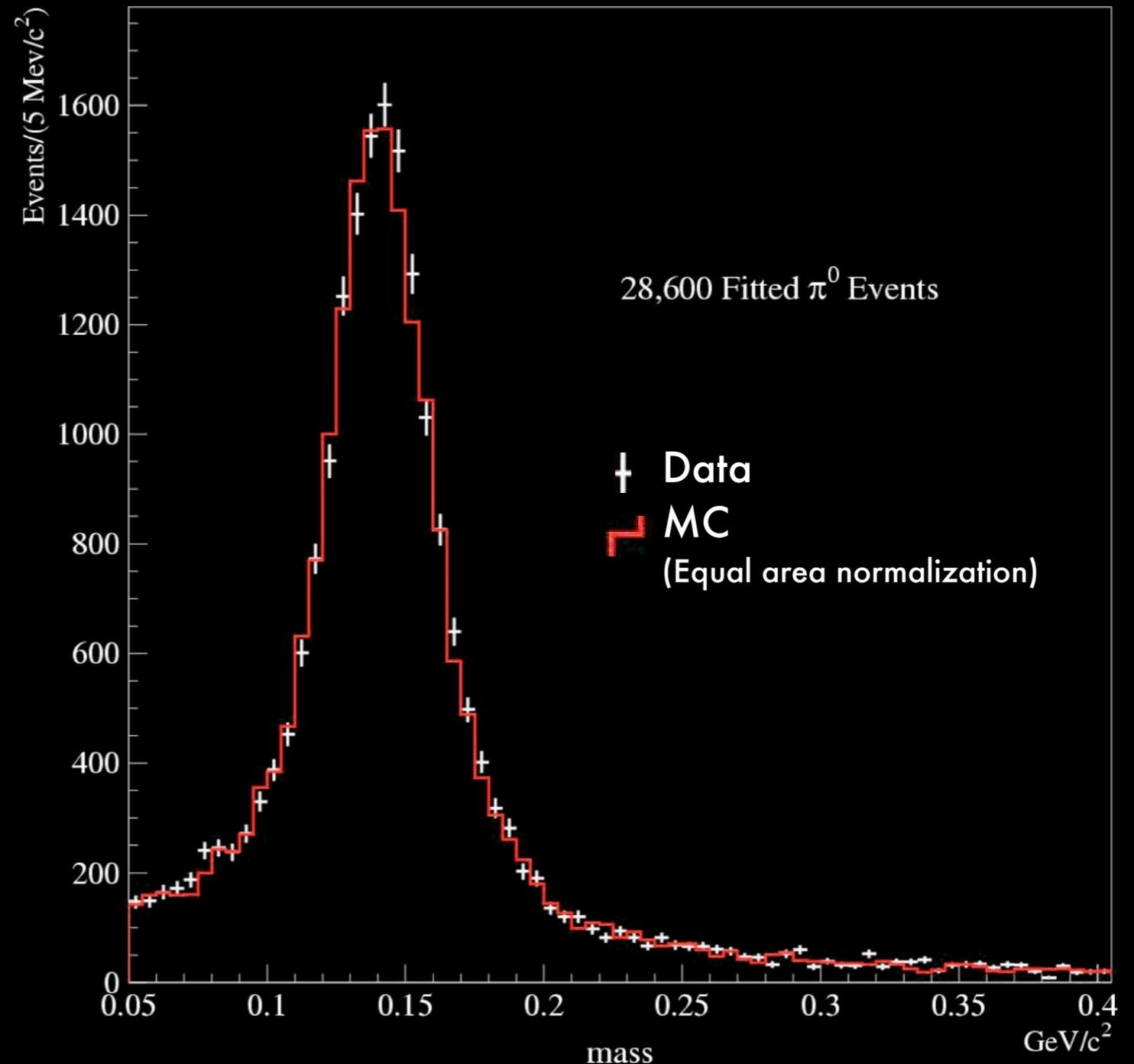
# Neutral Current $\Delta$ Resonances



- No Michel electron to tag events
- Gamma rays, electrons indistinguishable in the detector
- $\Delta \rightarrow N\pi^0$ : large decay branching ratio, but can usually detect both gammas
- $\Delta \rightarrow N\gamma$  radiative decay: small branching ratio ( $<1\%$ ), softer photon, but looks exactly like electron.
- **Neutral current  $\Delta$  resonance production is our largest source of particle misidentification background.**

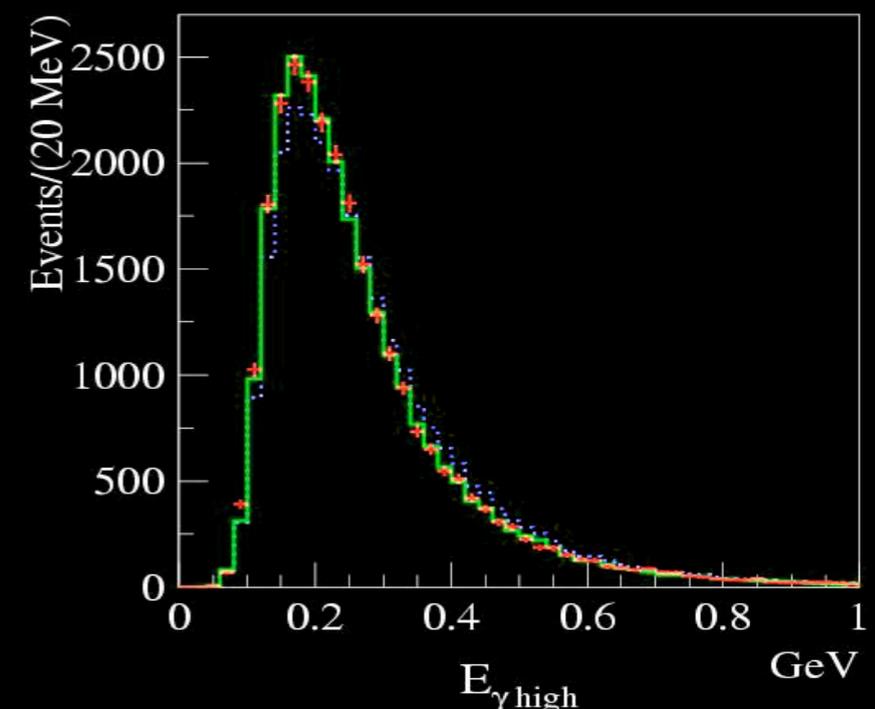
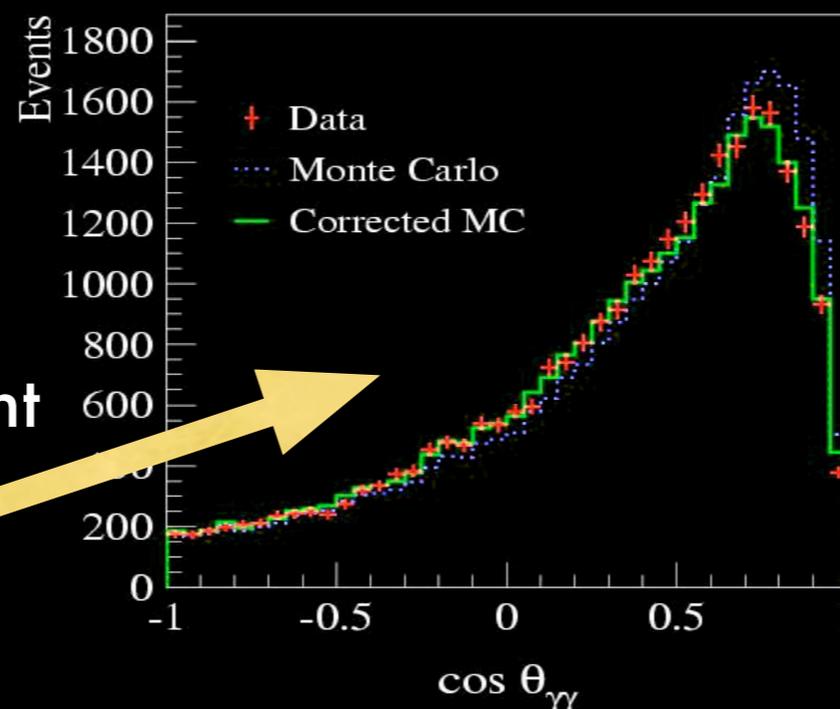
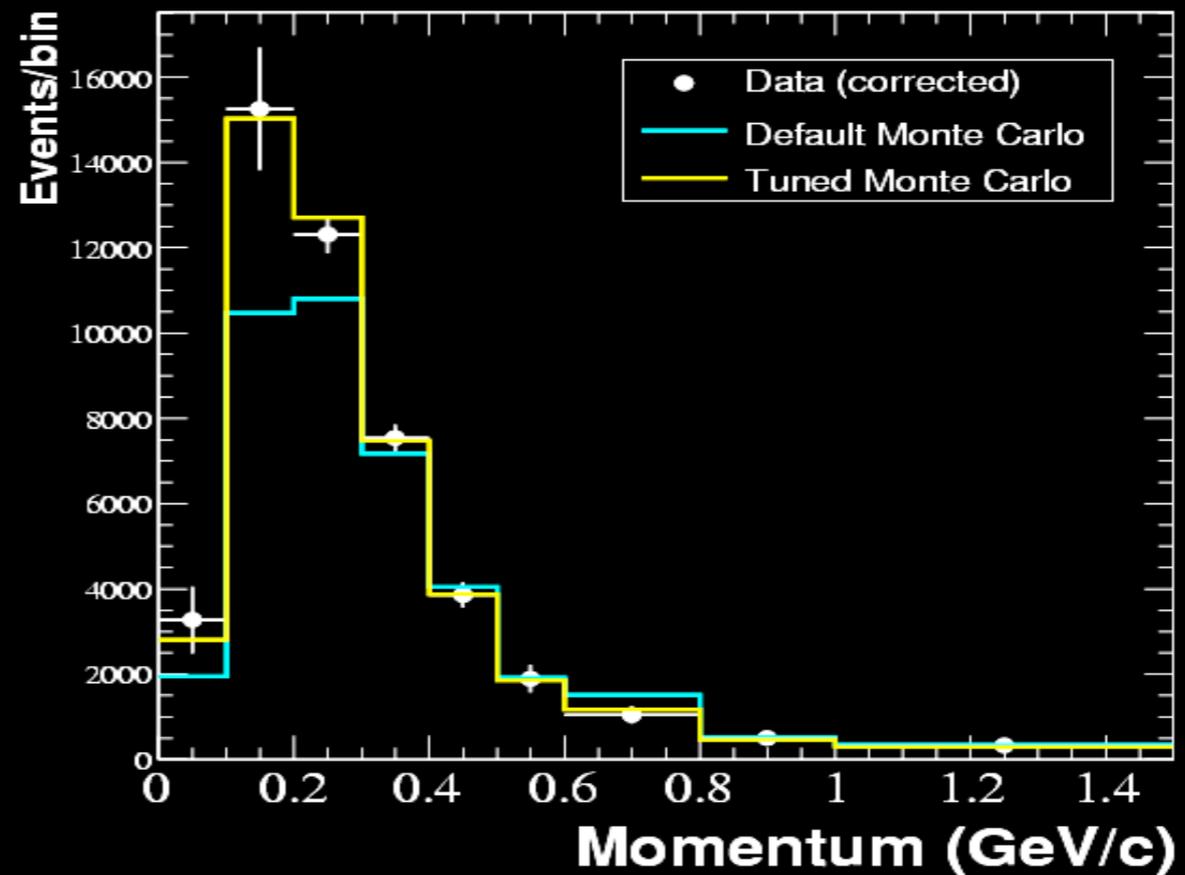
# Neutral Current $\Delta$ Resonances

- $\pi^0$  events
- Most  $\pi^0$  events have two reconstructible photon rings.
- Mass peak identifies neutral pions



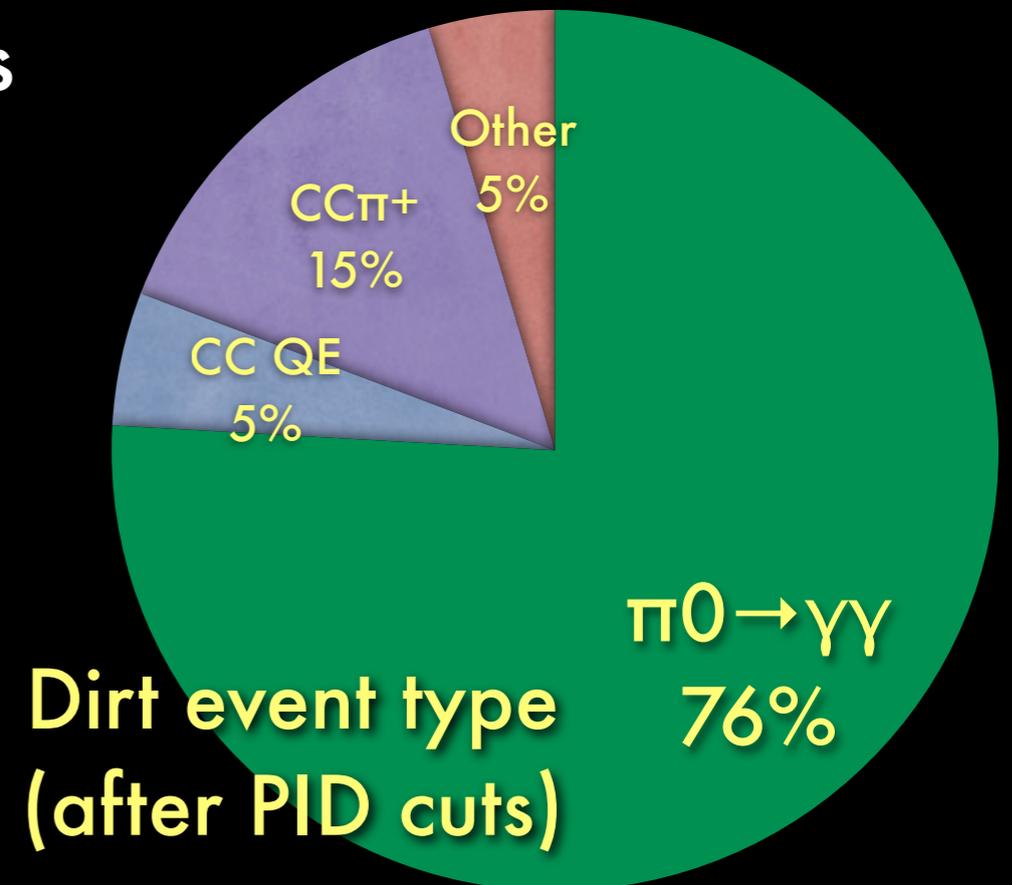
# Neutral Current $\Delta$ Resonances

- Total NC  $\Delta$  rate is measured from these fully-reconstructed  $\pi^0$  events.
- Use measured  $\pi^0$  total rate and momentum spectrum to reweight the  $\Delta$  Monte Carlo
- Reduces error on unreconstructed/misidentified  $\pi^0$  and radiative decays
- Also improves agreement in other distributions:



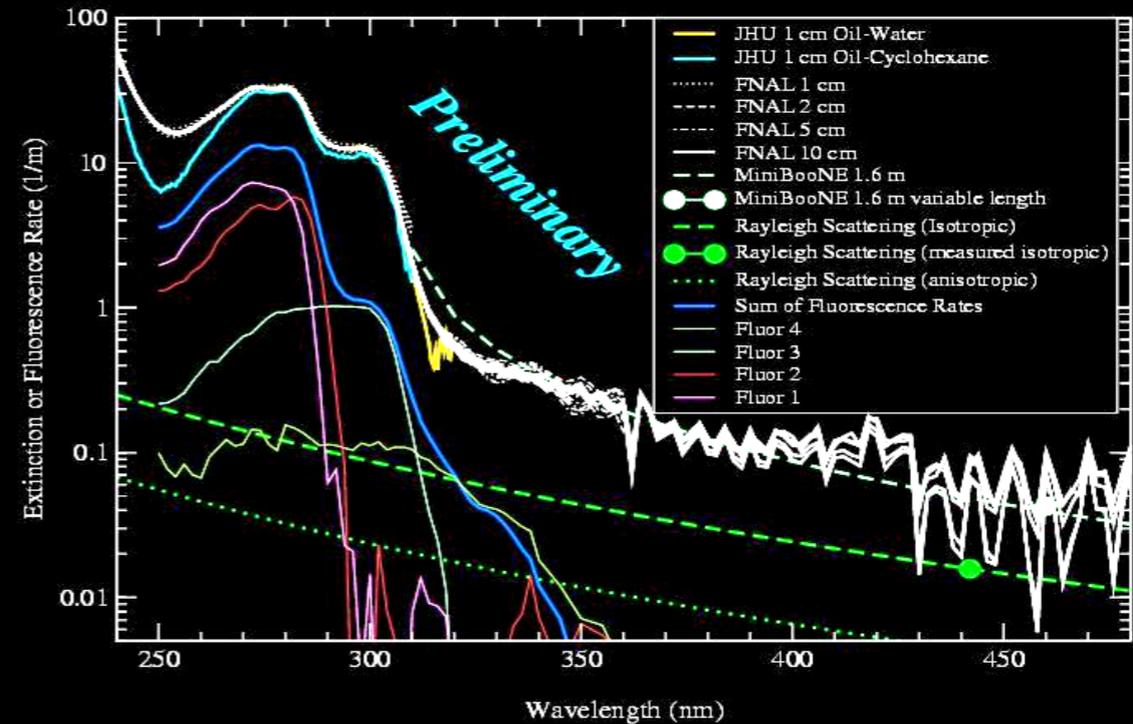
# External backgrounds

- “Dirt” events: neutrino interactions outside the detector
- Most events are cut by veto
- Background is dominated by  $\pi^0$  where only one photon enters detector
- Cosmic/other beam-unrelated background is very small:  $2.1 \pm 0.5$  events, measured with beam-off data



# Neutrino detector modeling: “optical” issues

Extinction Rate for MiniBooNE Marcol 7 Mineral Oil

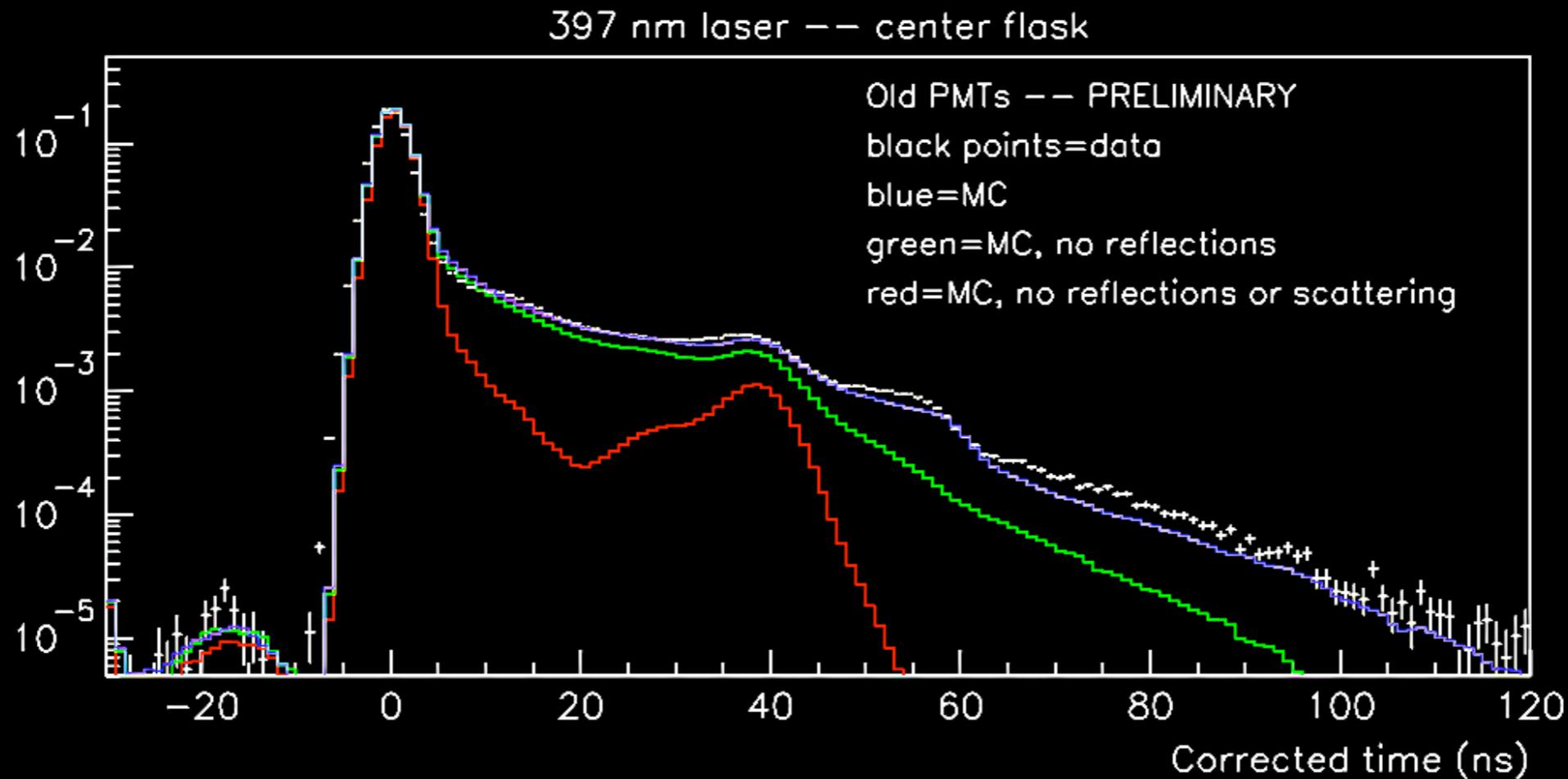


- **Primary light sources**
  - **Cherenkov**
    - Emitted promptly, in cone
    - known wavelength distribution

- **Scintillation**
  - Emitted isotropically
  - Several lifetimes, emission modes
  - Studied oil samples using Indiana Cyclotron test beam
  - Particles below Cherenkov threshold still scintillate

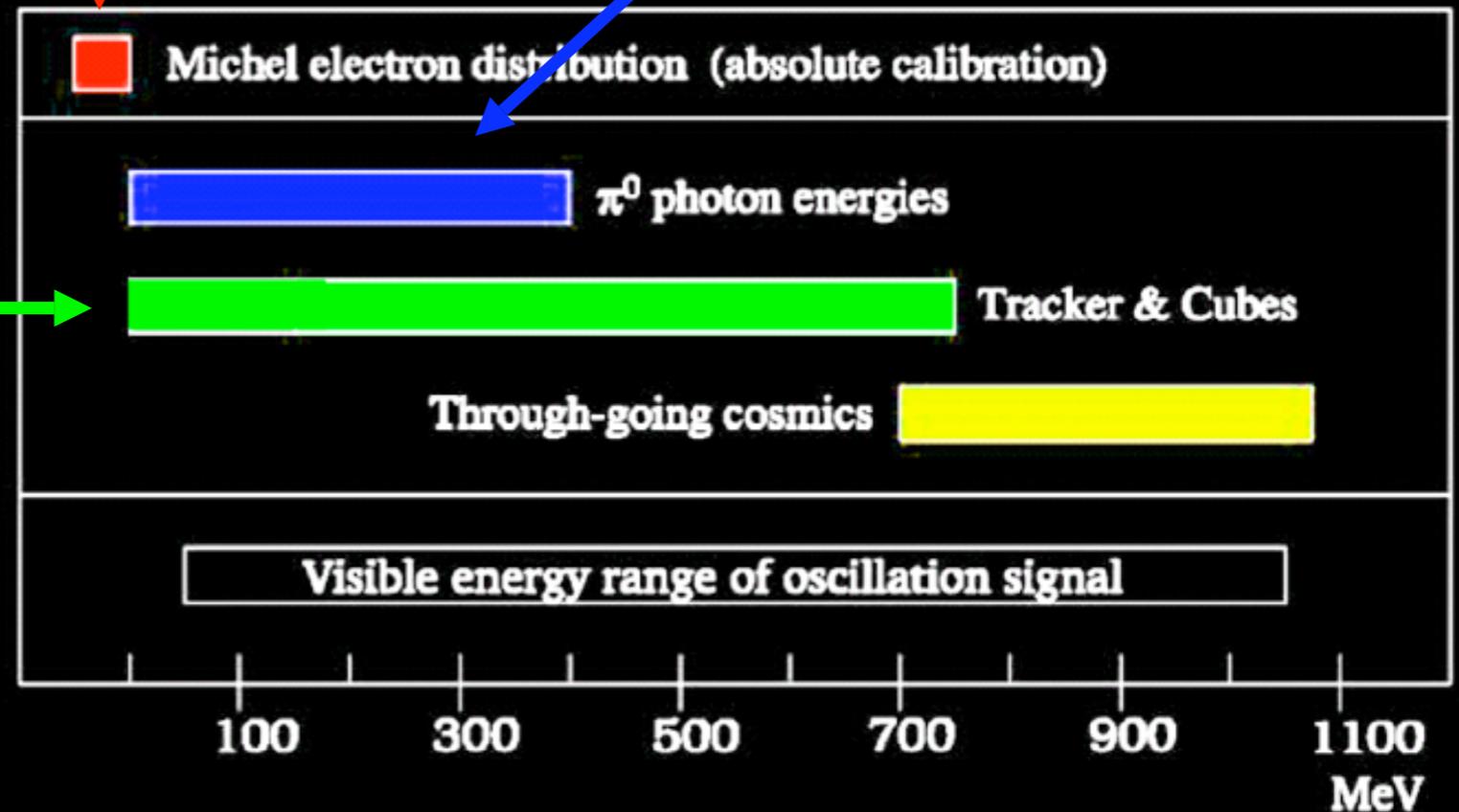
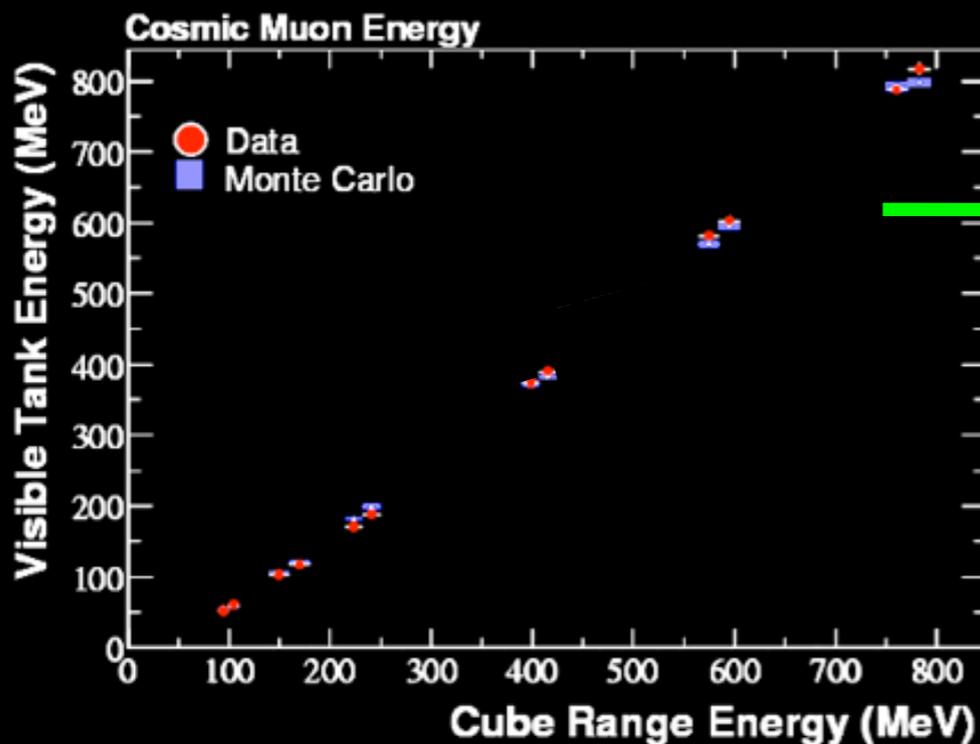
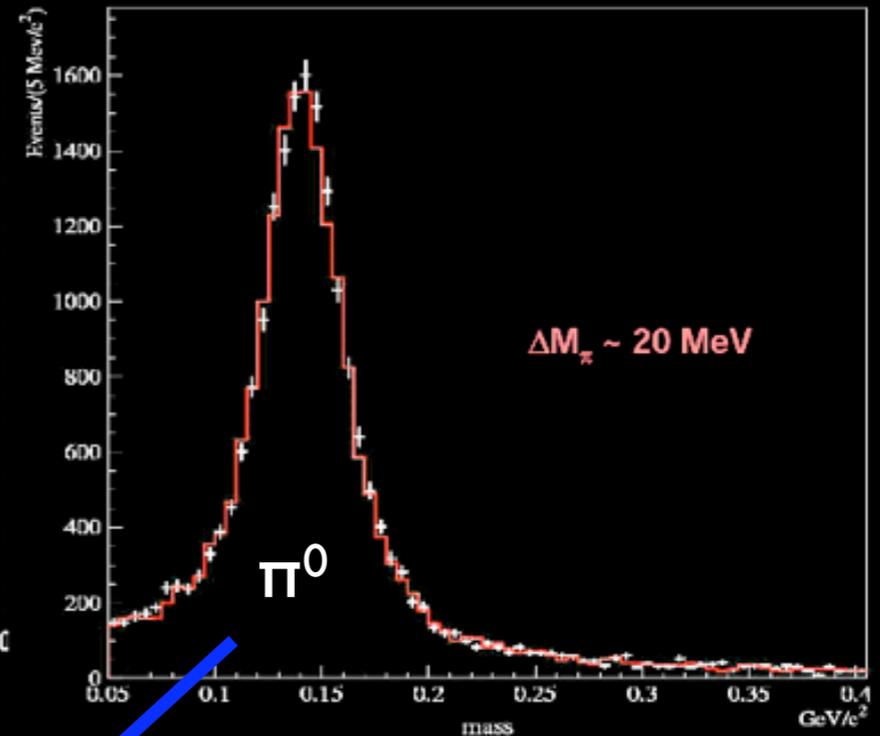
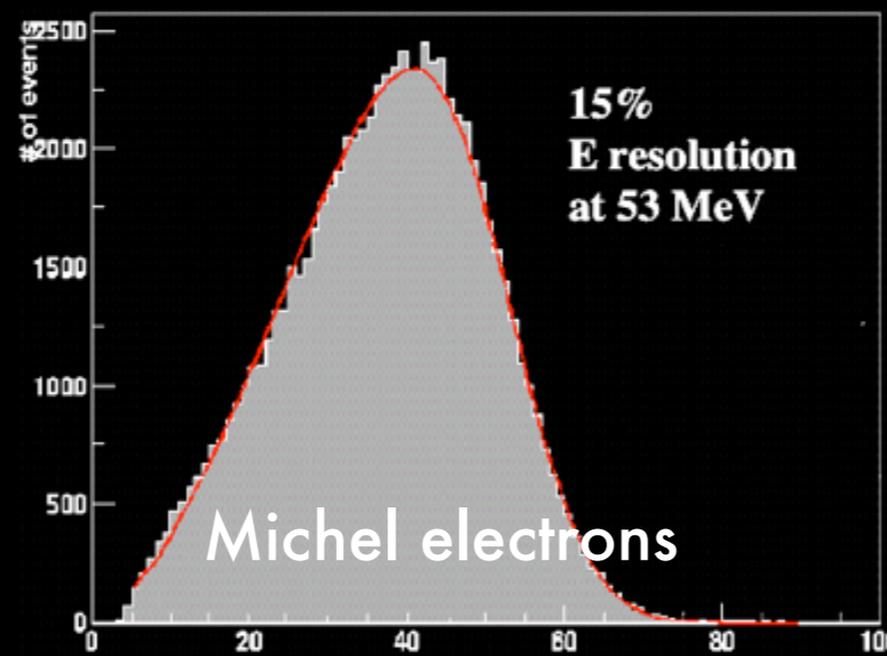
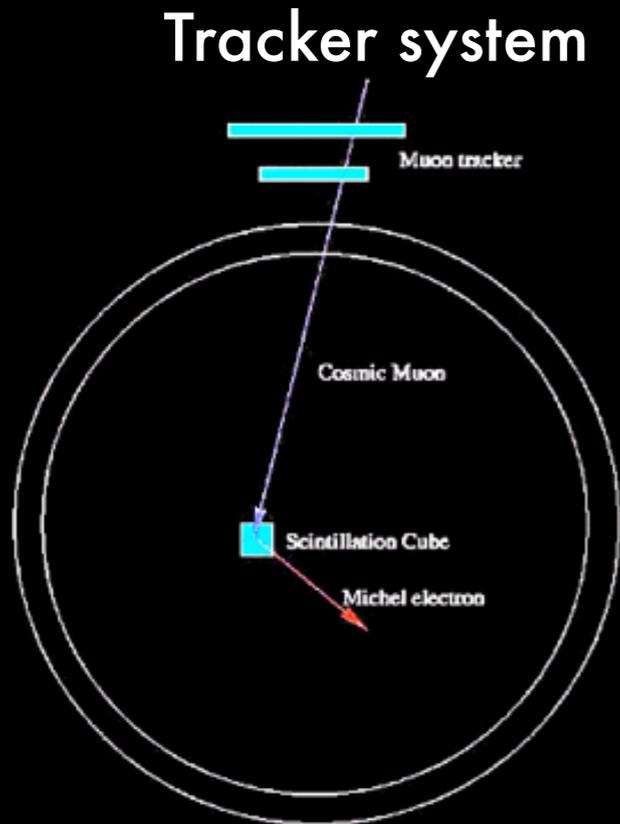
- **Optical properties of oil, detectors:**
  - Absorption (attenuation length >20m at 400 nm)
  - Rayleigh and Raman scattering
  - Fluorescence
  - Reflections
  - PMT response

# Neutrino detector: "optical" issues



- **Timing distribution for PMT hits**
  - Calibration laser source inside tank
  - Monte Carlo with full optical model describes most of the timing structure

# Calibration Sources



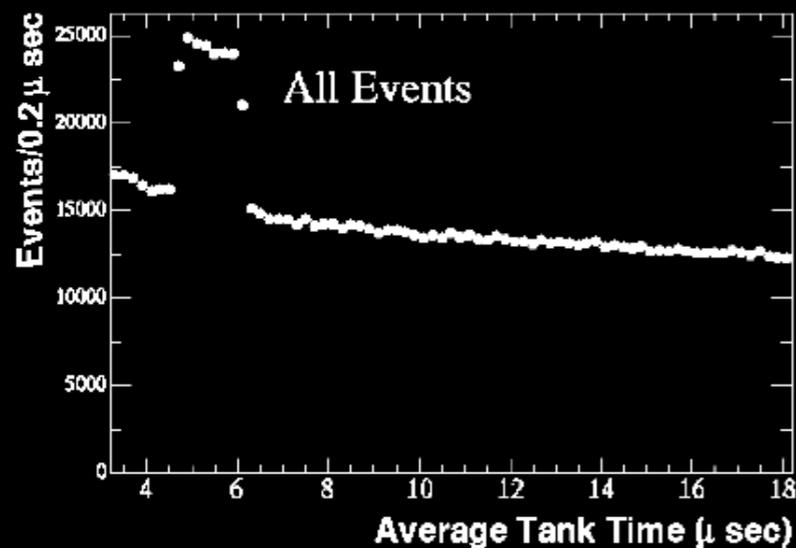
# *Event Reconstruction and Particle ID*

- **Parallel approaches to analysis: independent event reconstructions and PID algorithms**
- **Track/likelihood-based (TB) analysis:** detailed reconstruction of particle tracks; PID from ratio of fit likelihoods for different particle hypotheses. Less vulnerable to detector modeling errors.
- **Boosted decision trees (BDT):** algorithmic approach, able to extract particle ID information from larger set of lower-level event variables. Better signal/background, but more sensitive to detector modeling.

# Start with "precuts" to find neutrino-like subevents:

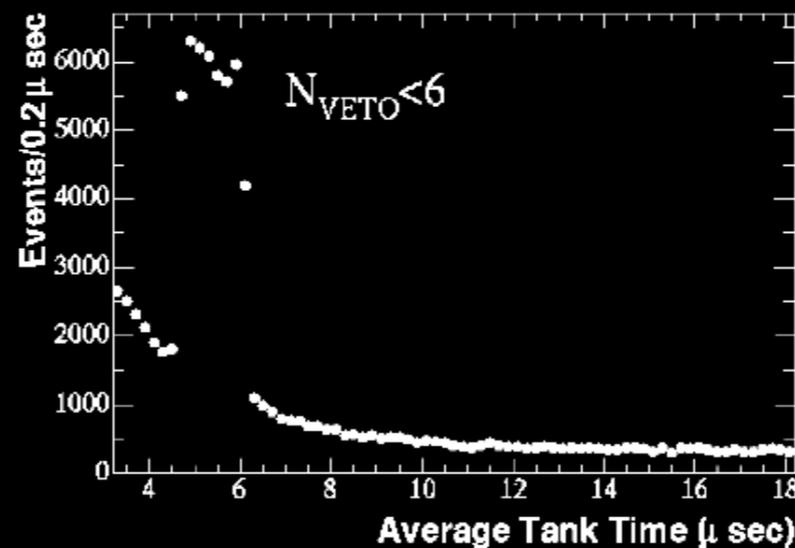
First subevent arrival time ( $\mu\text{s}$ ).

Beam pulse is from 4.5 to 6  $\mu\text{s}$ .



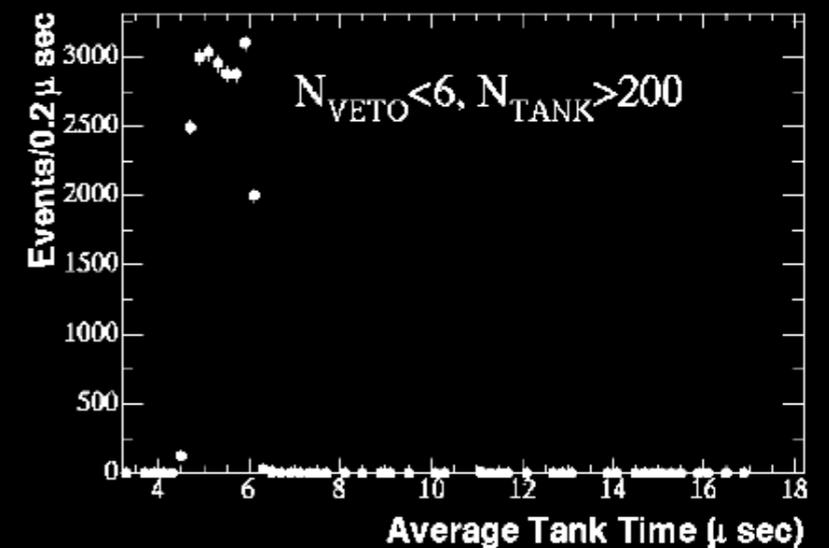
**ALL SUBEVENTS**

Cosmic rays dominate



**<6 VETO HITS**

Cosmic rays reduced (except for Michel electrons)



**>200 TANK HITS**

Cosmic rays nearly eliminated; only beam neutrinos survive

# *The Blindness Procedure*

- Philosophy: hide any event that could be an oscillation candidate from detailed analysis, while allowing aggregate or low-level information on all events to be examined.
- Early stages: highly restrictive, as particle ID was being developed: neutrino events closed by default. to open a sample of events for study, must show it is (nearly) oscillation-free.
- Later stages: MC and algorithms become more stable and trustworthy. Look in regions closer and closer to the signal; eventually all data open by default, and only the signal "box" (1% of events) was closed.
- Final stages: Open box in a series of steps, starting with fit quality values only, ending in full spectrum and oscillation fit.

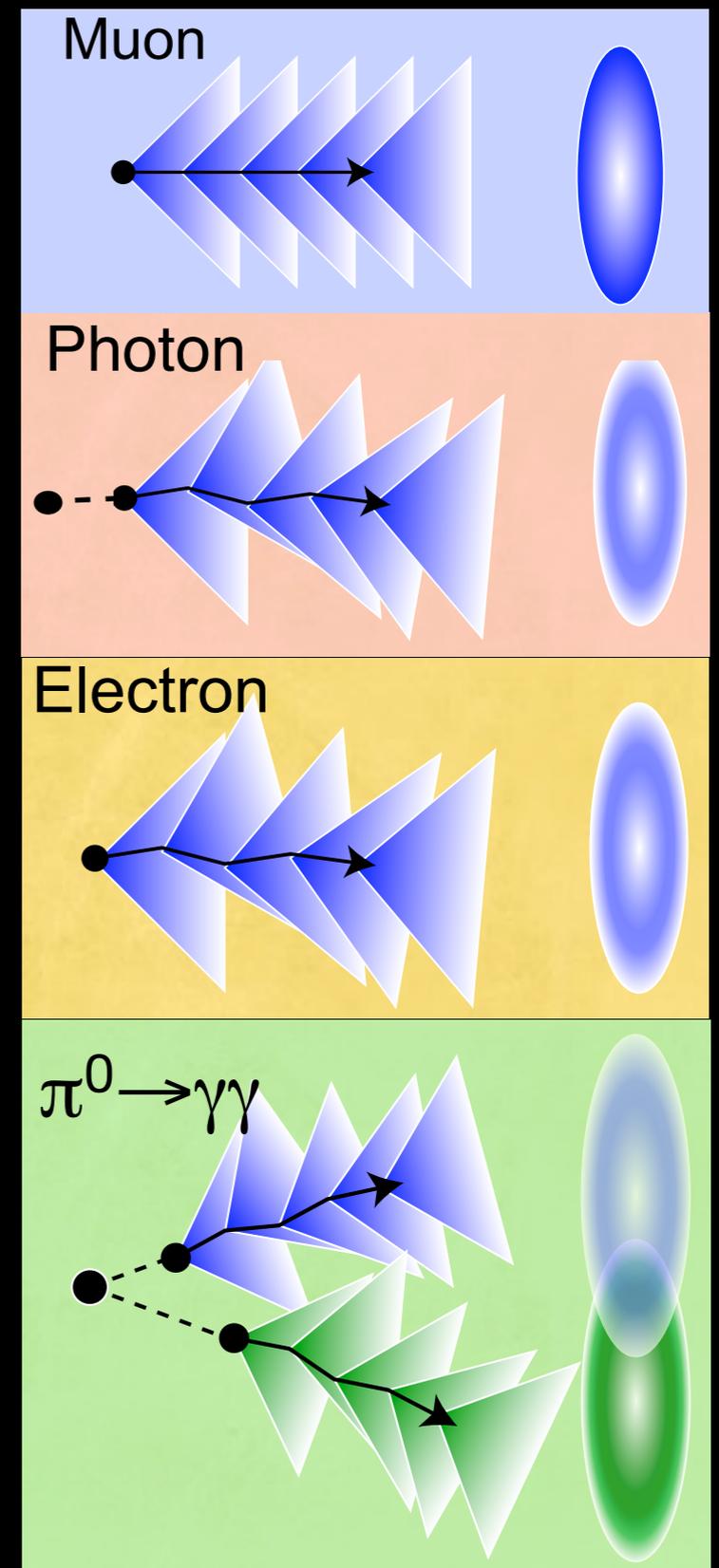
# *The Track-based Analysis:* *Reconstruction*

- A detailed analytic model of extended-track light production and propagation in the tank predicts the probability distribution for charge and time on each PMT for individual muon or electron/photon tracks.
- Prediction based on seven track parameters: vertex  $(x, y, z)$ , time, energy, and direction  $(\theta, \varphi) \Leftrightarrow (U_x, U_y, U_z)$ .
- Fitting routine varies parameters to determine 7-vector that best predicts the actual hits in a data event
- Particle identification comes from ratios of likelihoods from fits to different parent particle hypotheses

# The Track-based Analysis:

## Reconstruction

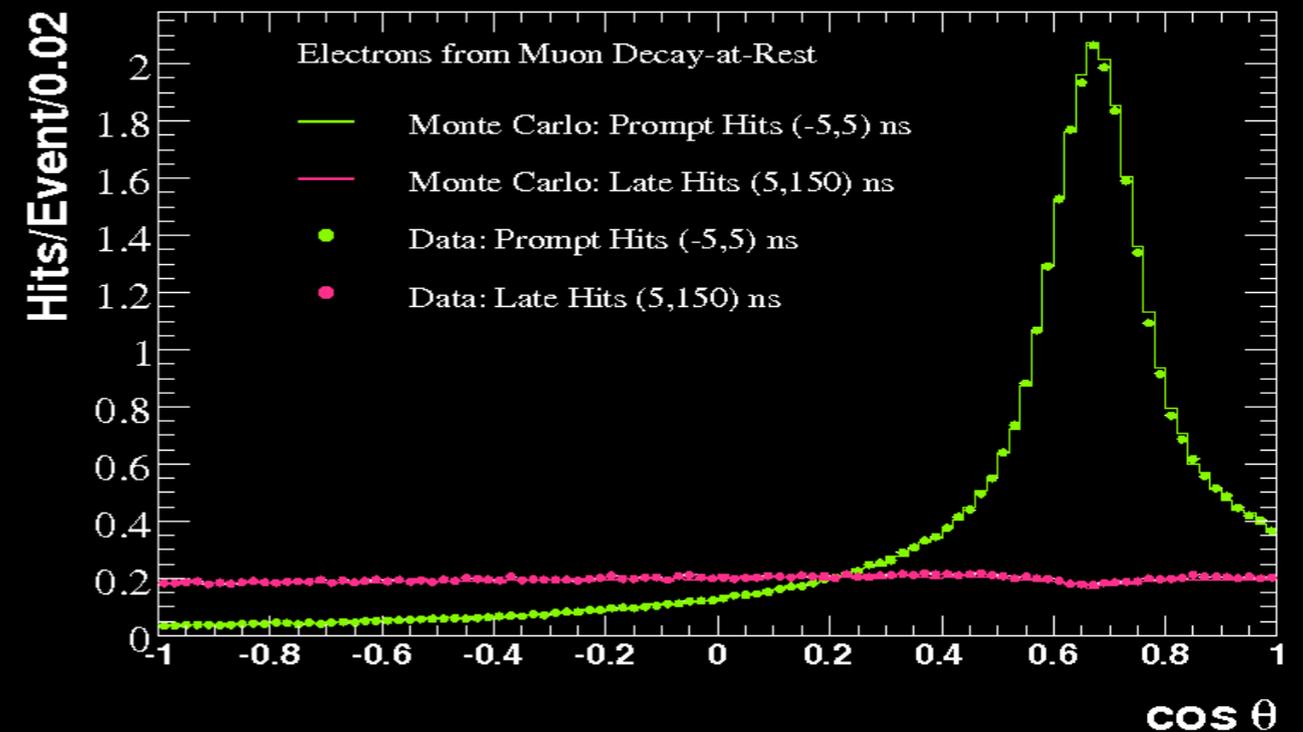
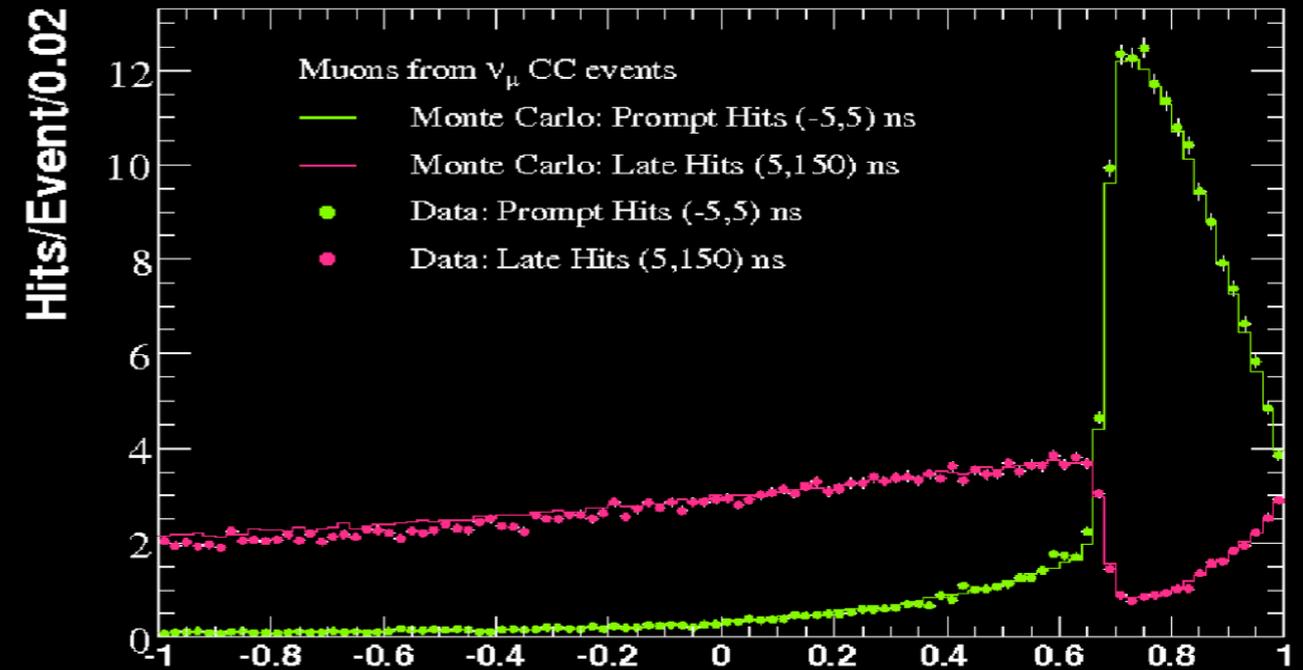
FIT HYPOTHESIS	NUMBER OF PARAMETERS
Single muon	7
Single electron/photon	7
Two photons from common vertex, mass unconstrained	12
Two photons from common vertex, mass constrained to $m(\pi^0)$	11



# The Track-based Analysis: Reconstruction

The track-based reconstruction accounts for:

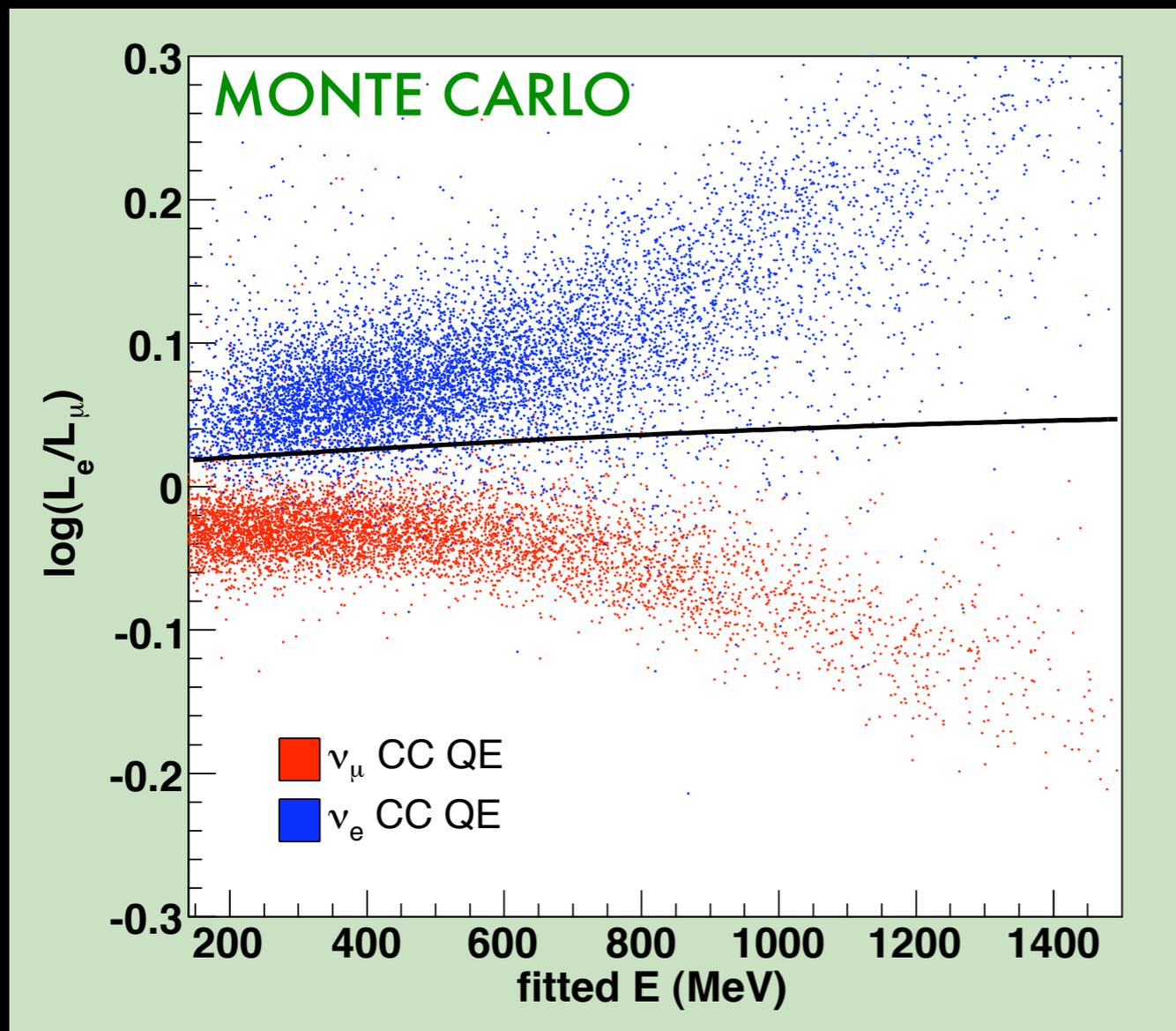
- Extended source of light ("track")
- Scattering, absorption of light
- Prompt light (Cherenkov, scattering, some scintillation)
- Delayed light (scintillation, fluorescence)
- Angular distribution of light from particles (due to showers, MCS)
- PMT efficiency and geometry
- $dE/dx$



# *The Track-based Analysis:* *Event Selection*

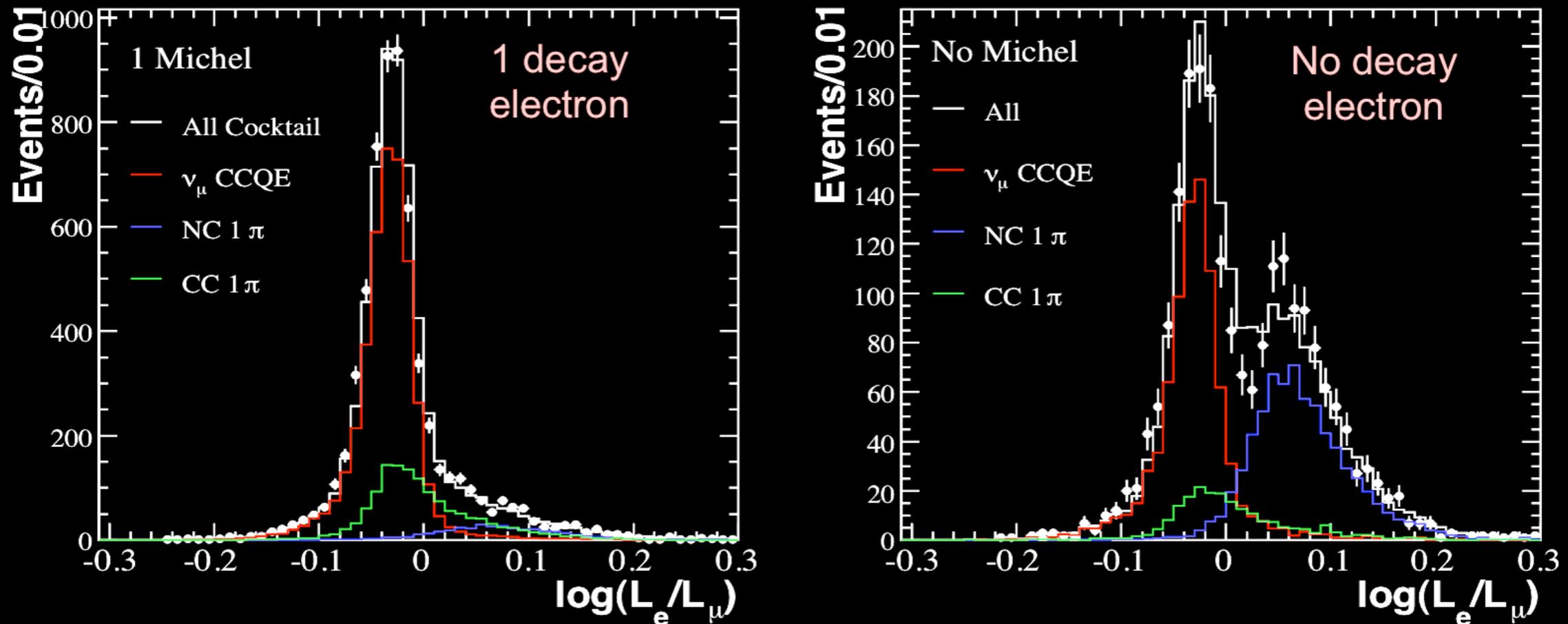
- Start with events that pass “precuts:”
  - Exactly one subevent during spill
  - NVETO < 6 hits
  - NTANK > 200 hits
- Perform all four fits: electron; muon; two-track, with and without  $\pi^0$  mass constraint
- Fiducial cuts:
  - Radius must be less than 500 cm (calculated from electron fit)
- Make track energy-dependent cuts on likelihood ratios, to reject specific backgrounds in order from easiest to hardest

# The Track-based Analysis: Muon rejection



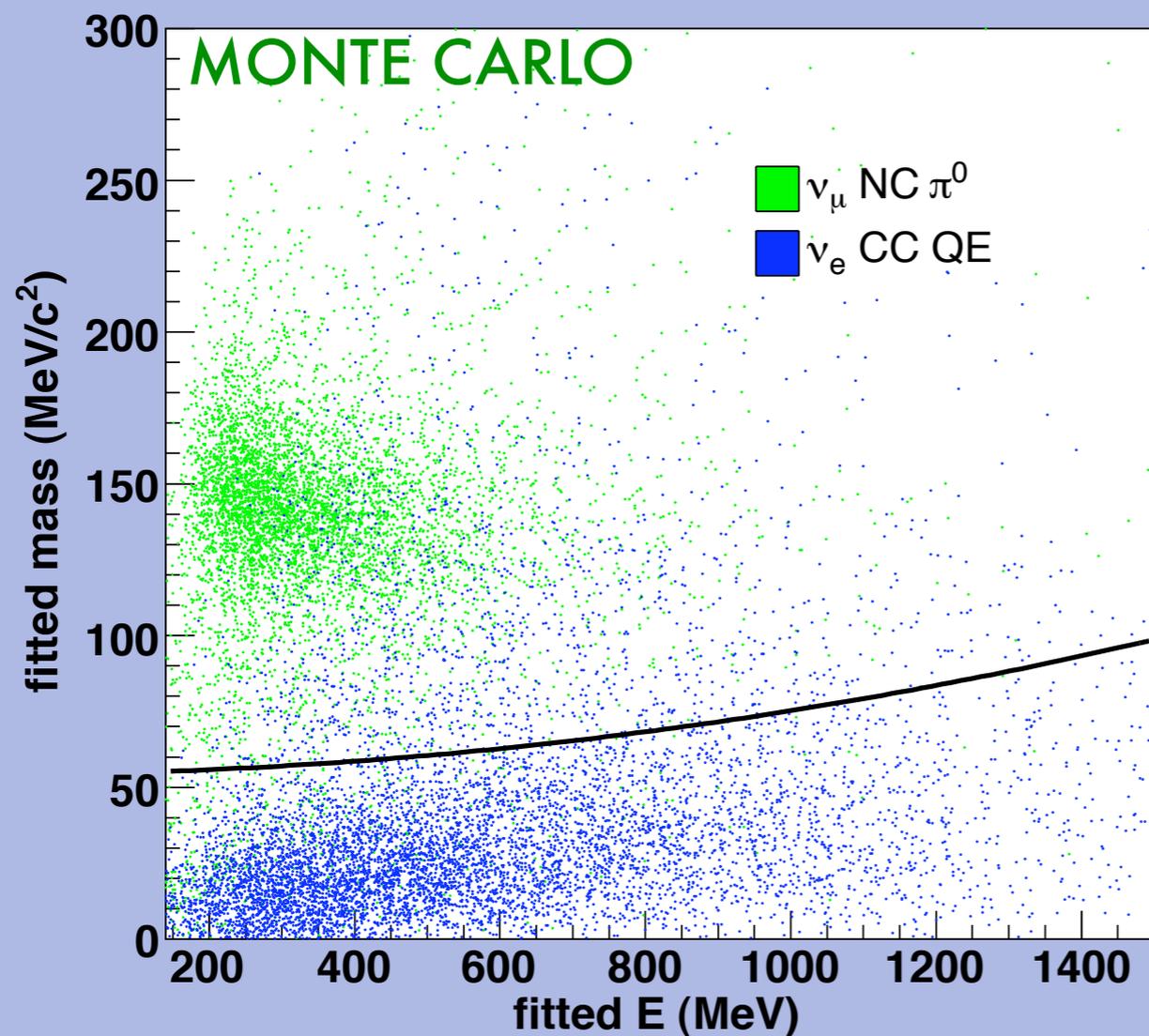
- $\log(L_e/L_\mu)$ : compare likelihoods returned by e and  $\mu$  fits.
- $\log(L_e/L_\mu) > 0$  indicates electron hypothesis is favored.
- Analysis cut is parabola whose parameters selected to optimize oscillation sensitivity
- Discrimination easier at higher energy (increasing muon track length)

# The Track-based Analysis: Muon rejection



- Can tag muons independently of particle ID by observing decay of stopped muon
- Valuable cross-check on data-Monte Carlo agreement
- In this variable, electrons and  $\pi^0$  are indistinguishable
- Electrons have been removed by selecting background-like  $\pi^0$  fit

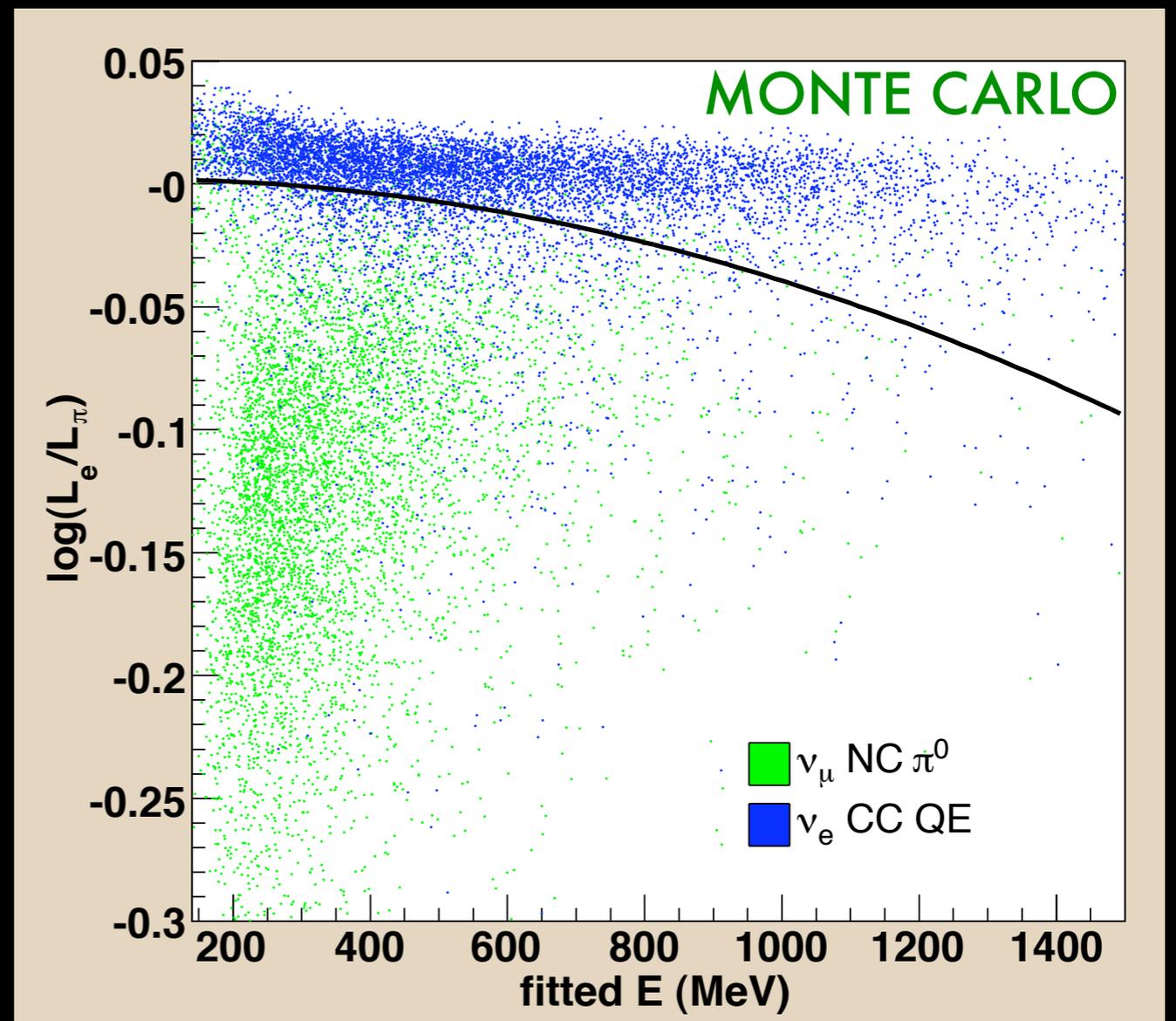
# The Track-based Analysis: Neutral pion rejection



- Free mass 2-track fit (2T) employed to reconstruct invariant mass
- Background  $\pi^0$  reconstruct near  $m(\pi^0)$ ; signal  $\nu_e$  have smaller mass

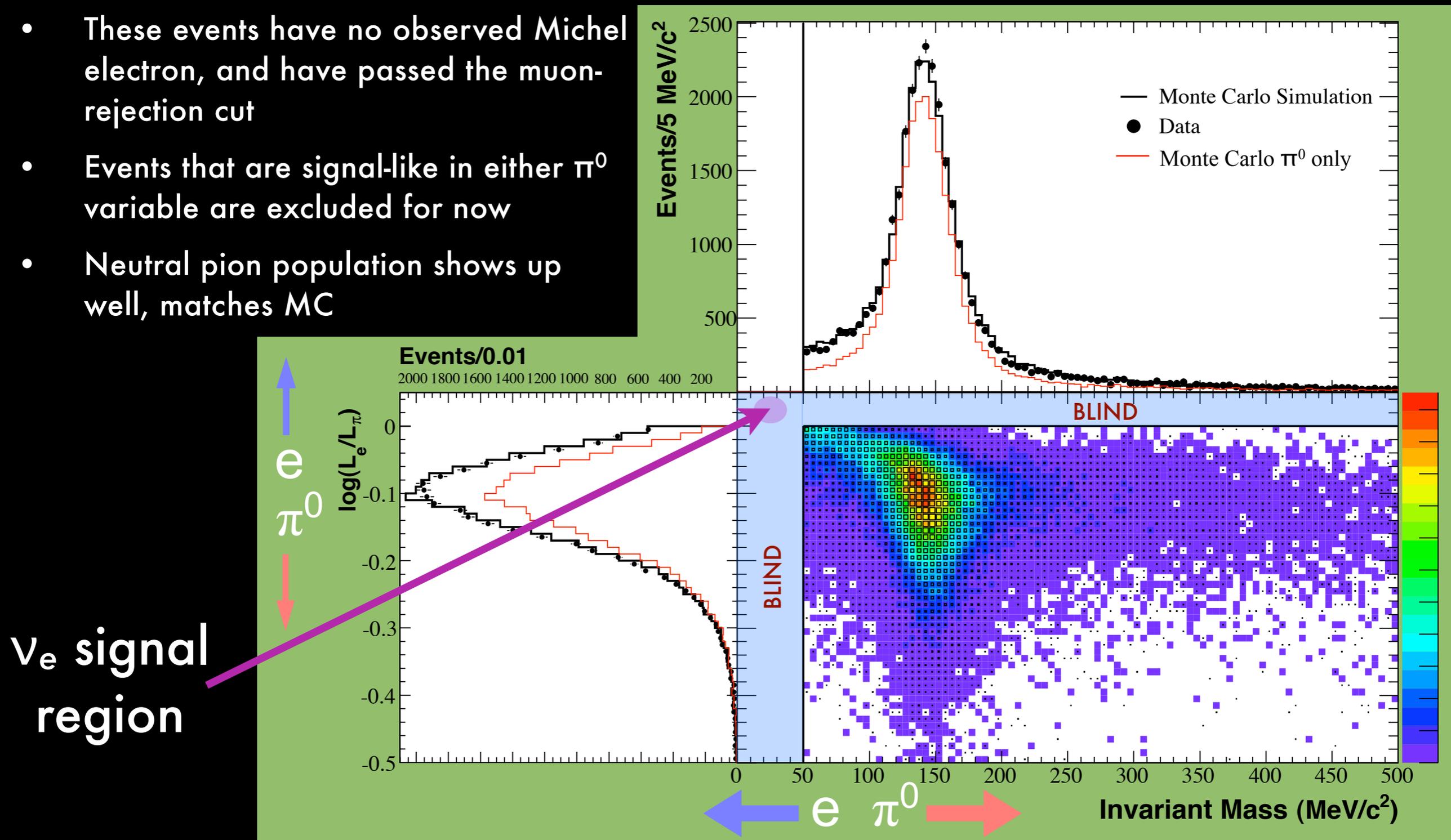
# The Track-based Analysis: Neutral pion rejection

- Fixed mass 2-track fit used to form  $L_\pi$
- $\log(L_e/L_\pi) > 0$  indicates electron hypothesis produces a better fit



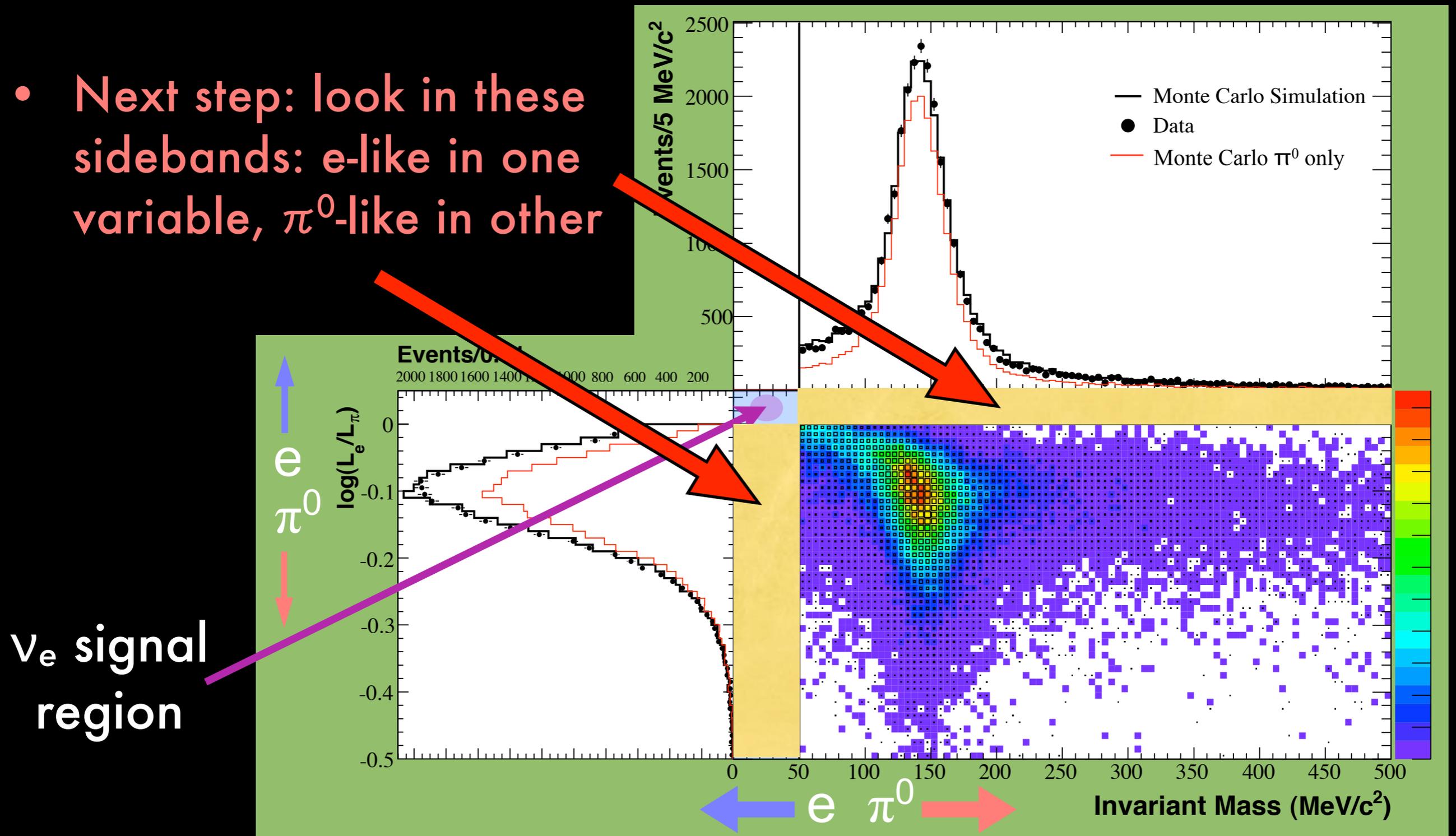
# The Track-based Analysis: Neutral pion rejection

- These events have no observed Michel electron, and have passed the muon-rejection cut
- Events that are signal-like in either  $\pi^0$  variable are excluded for now
- Neutral pion population shows up well, matches MC



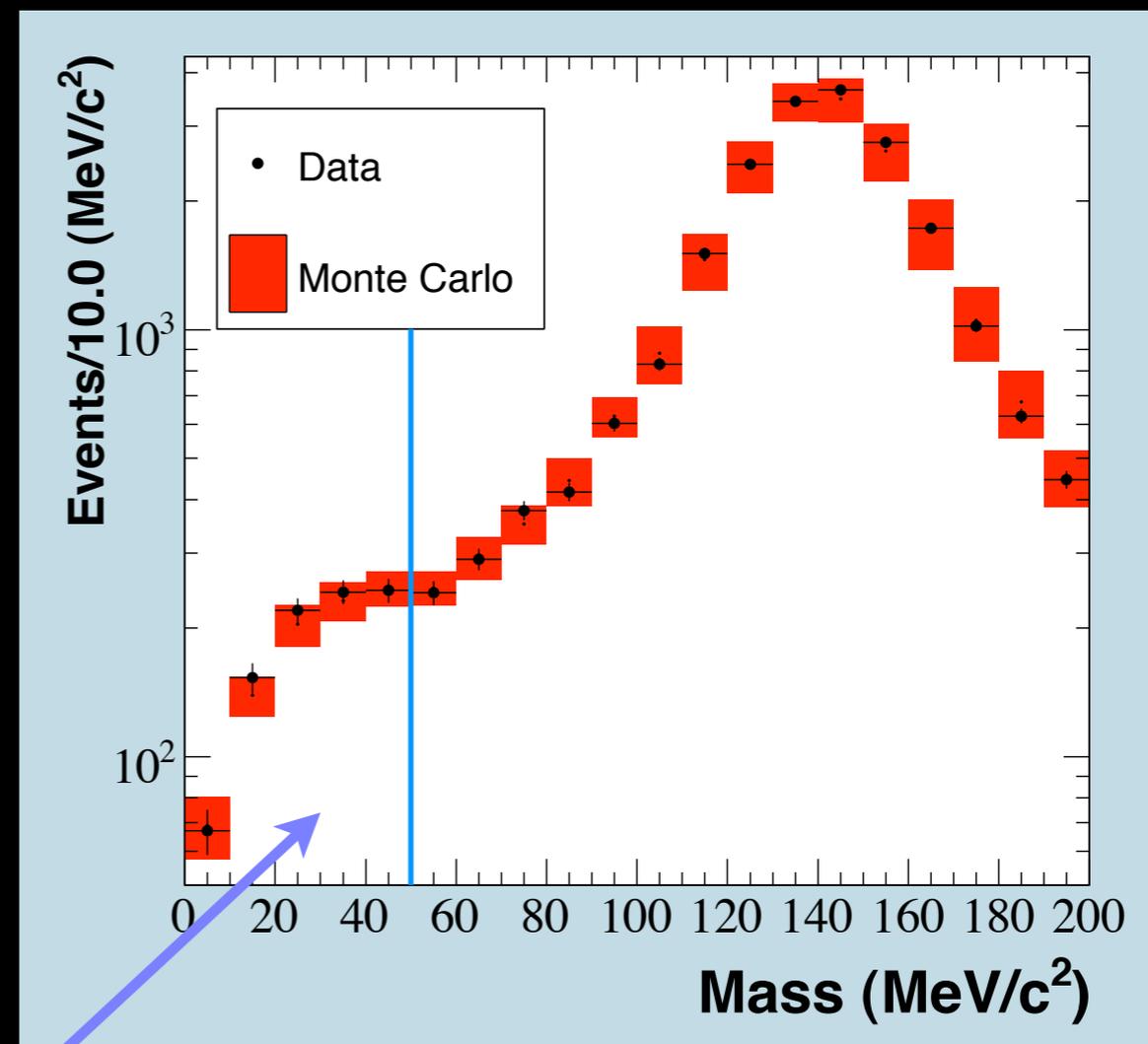
# The Track-based Analysis: Neutral pion rejection

- Next step: look in these sidebands: e-like in one variable,  $\pi^0$ -like in other



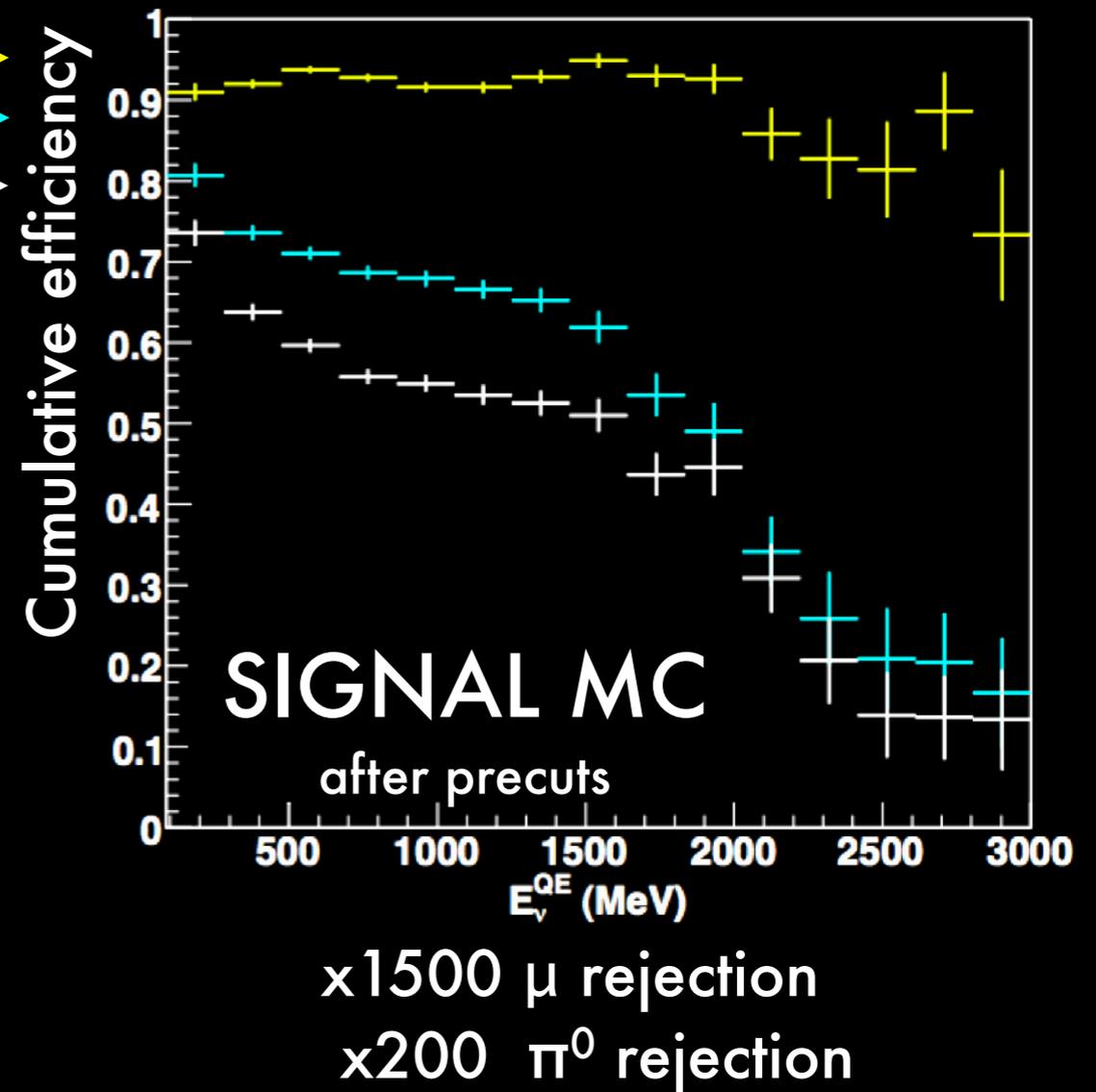
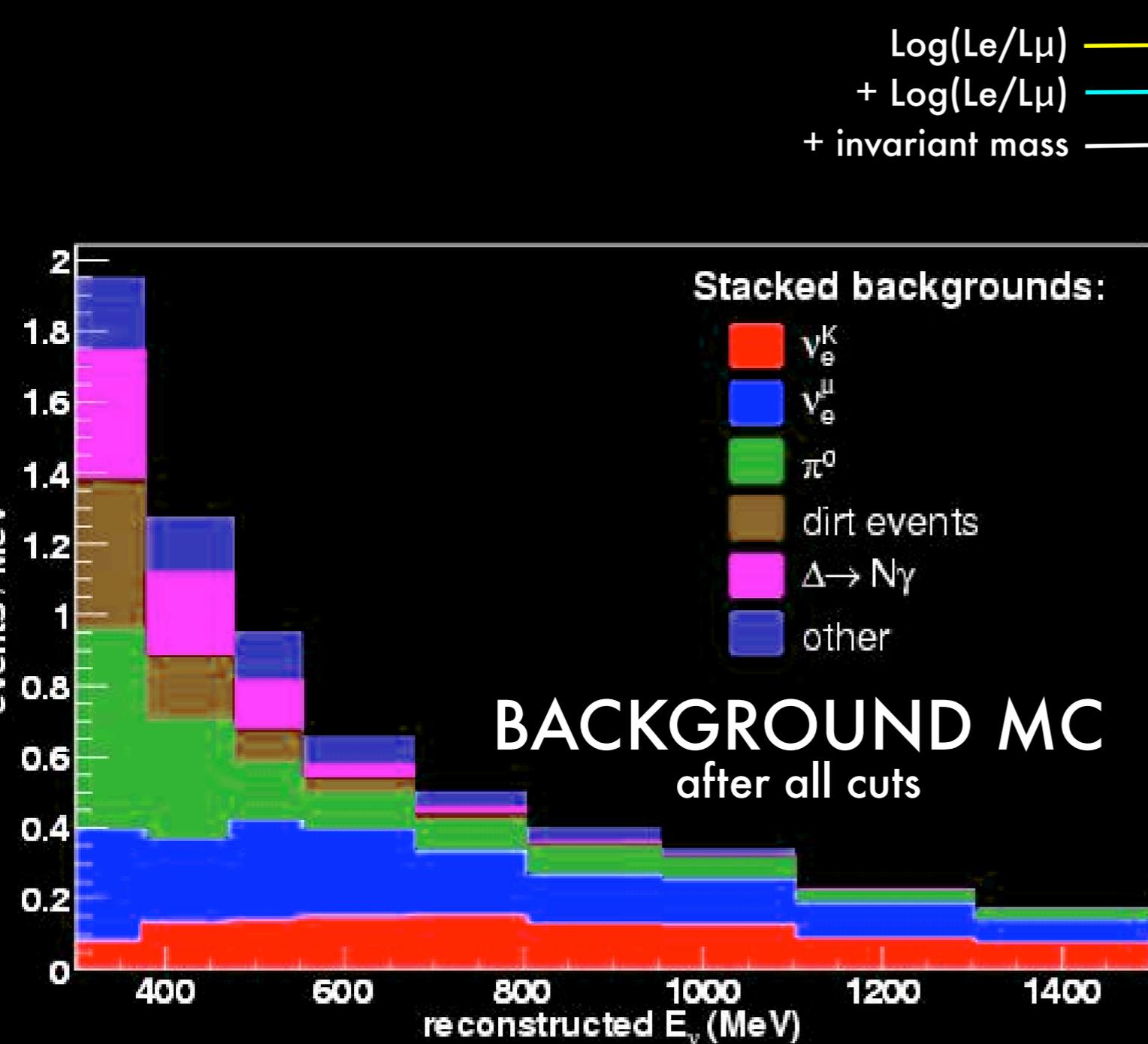
# The Track-based Analysis: Looking in the sidebands

- Look at full mass range for events with  $\log(L_e/L_\pi) < 0$
- These are signal-like in mass, but background-like in  $\log(L_e/L_\pi)$
- Nice data/MC agreement



sideband

# The Track-based Analysis: Efficiency and backgrounds

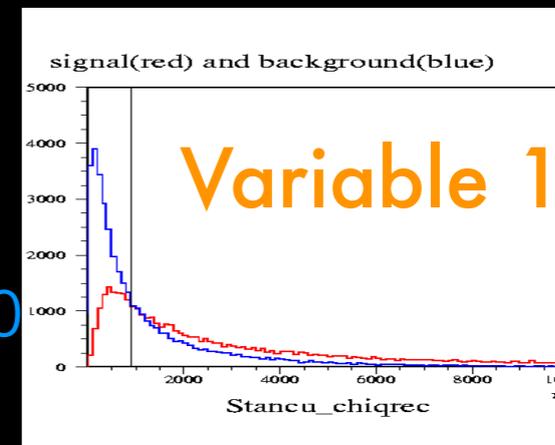


# Boosted Decision Trees (BDT)

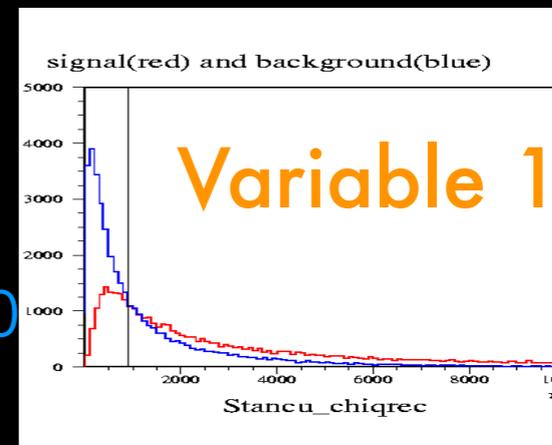
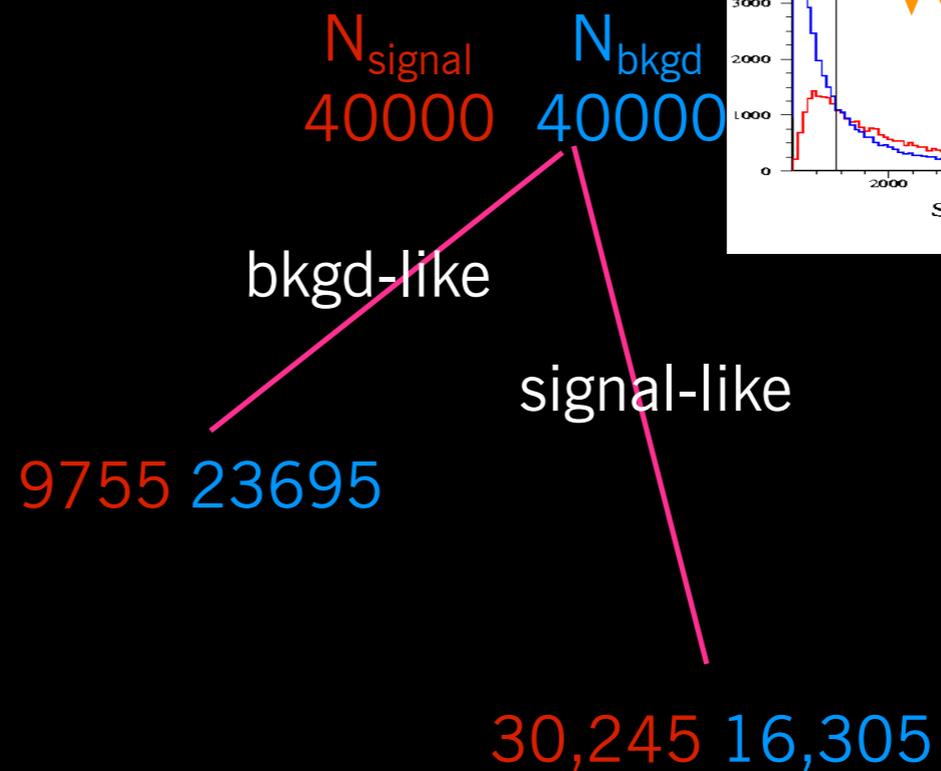
- An algorithm optimized to combine many weakly discriminating variables into one that provides powerful separation
- B. Roe *et al.*, *Nucl. Inst. Meth.* **A543** 577 (2005)
- Idea: Go through all analysis variables and find best variable and value to split a Monte Carlo data set.
  - For each of the two subsets repeat the process
  - Proceeding in this way, a “decision tree” is built, whose final nodes are called leaves

# A *Decision Tree*

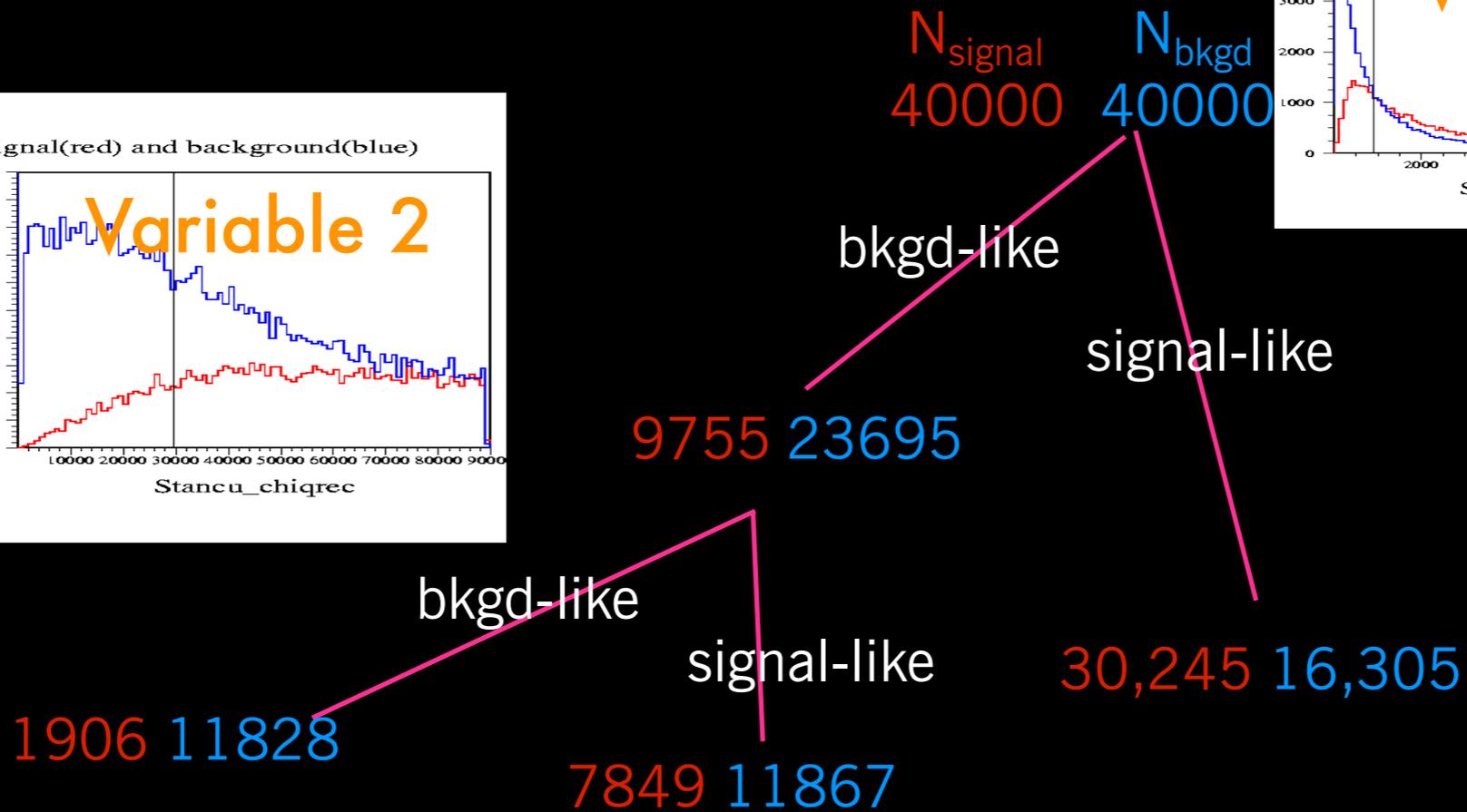
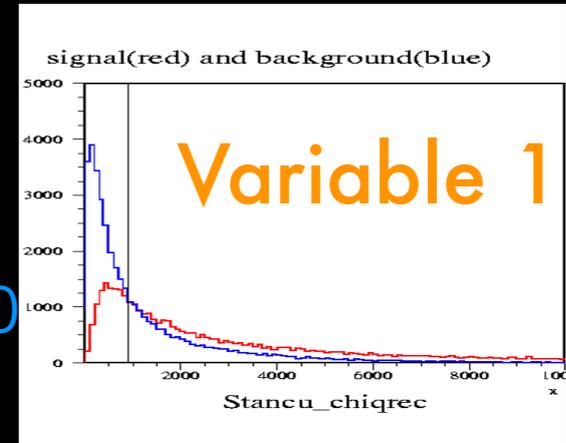
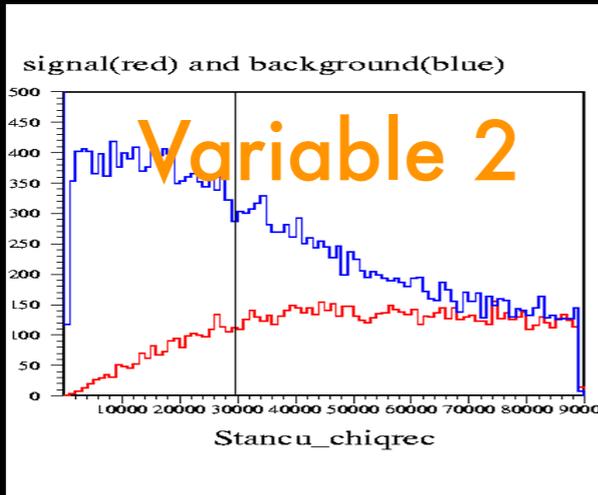
$N_{\text{signal}}$  40000  
 $N_{\text{bkgd}}$  40000



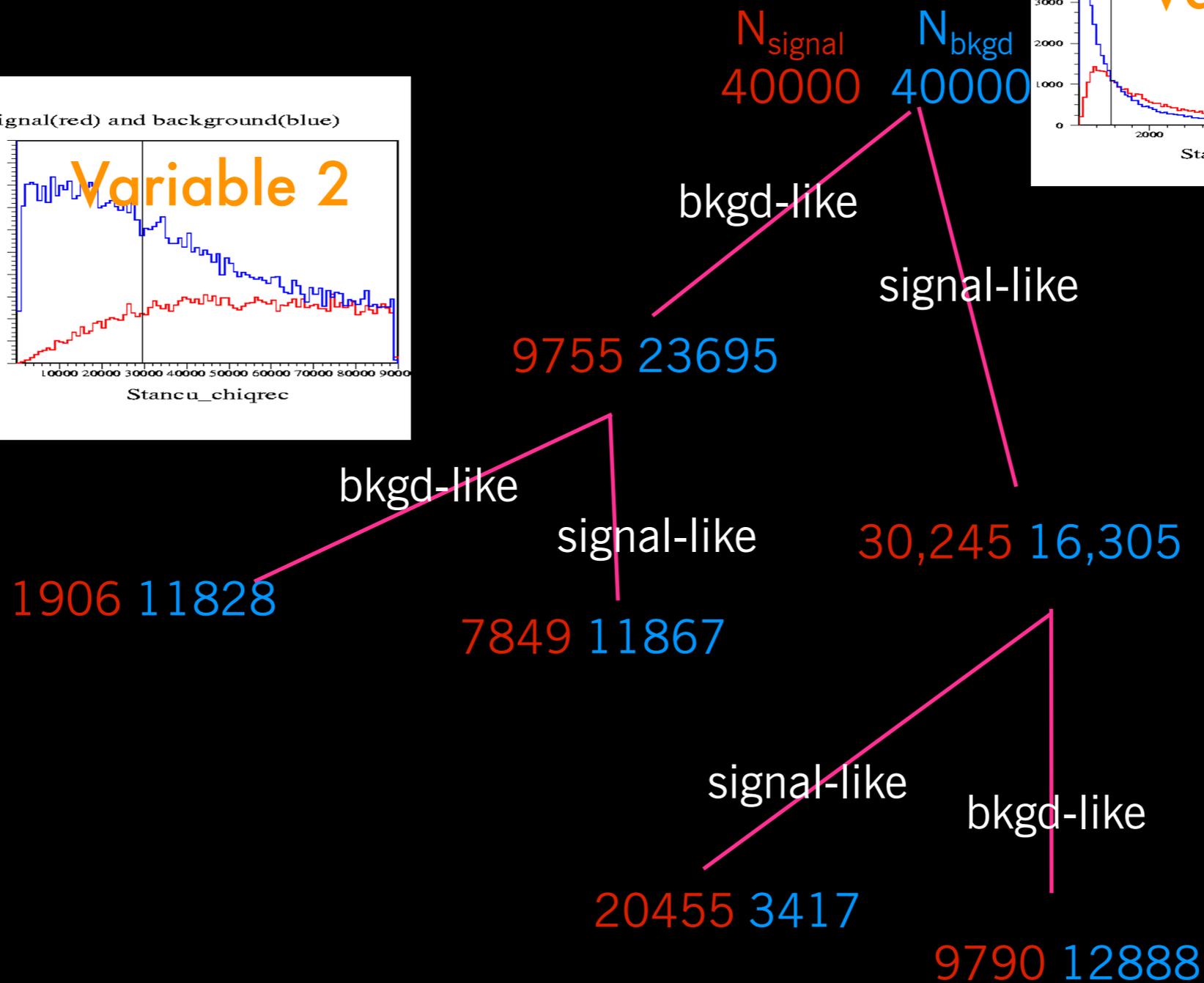
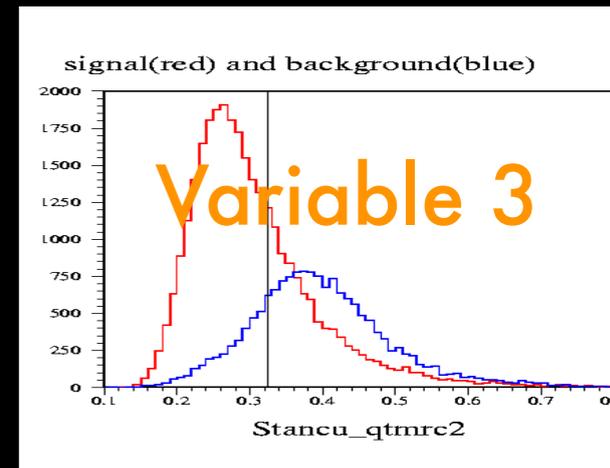
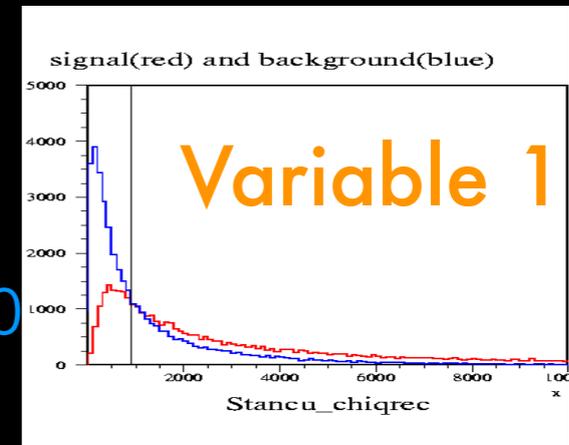
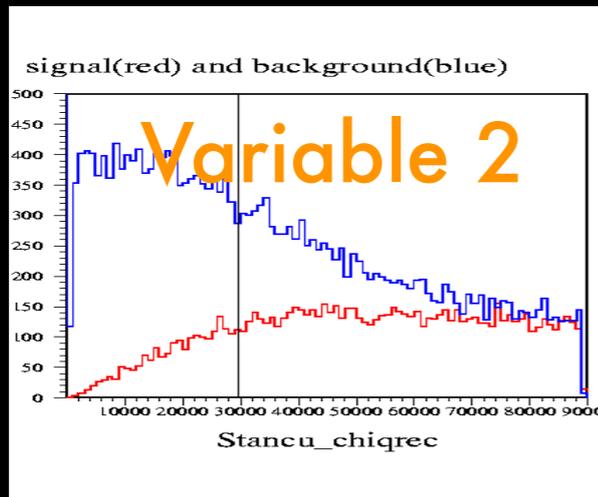
# A Decision Tree



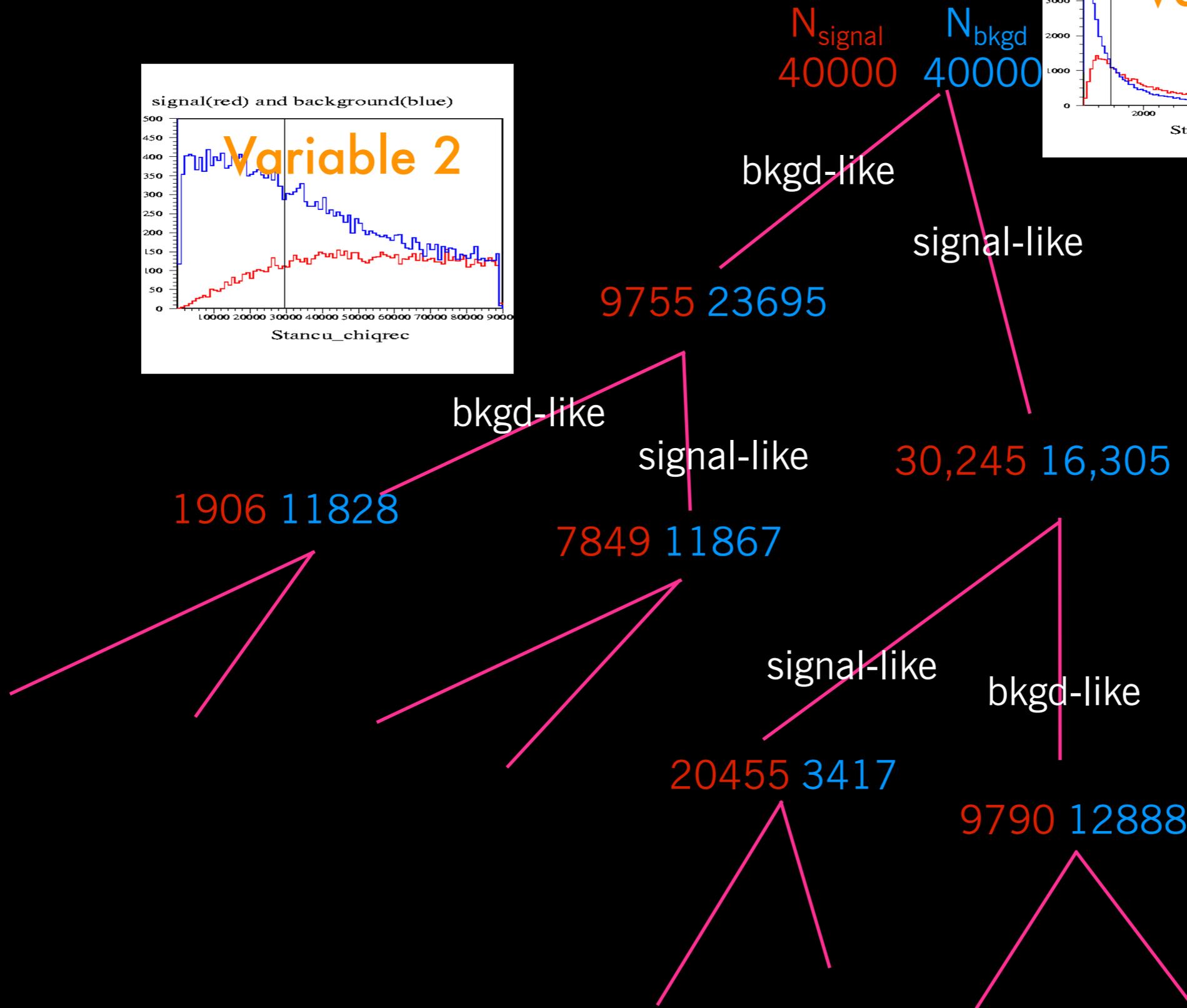
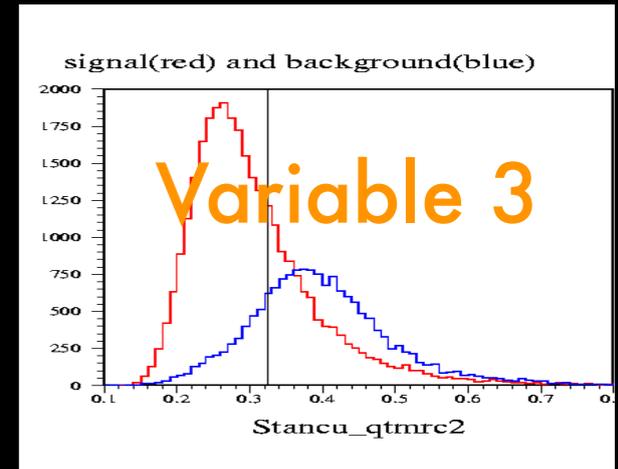
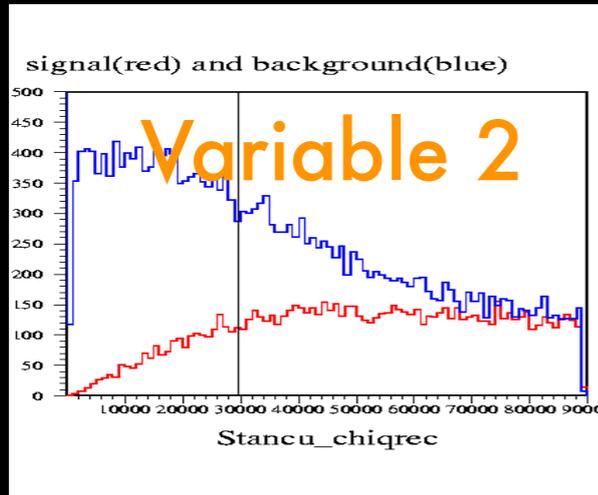
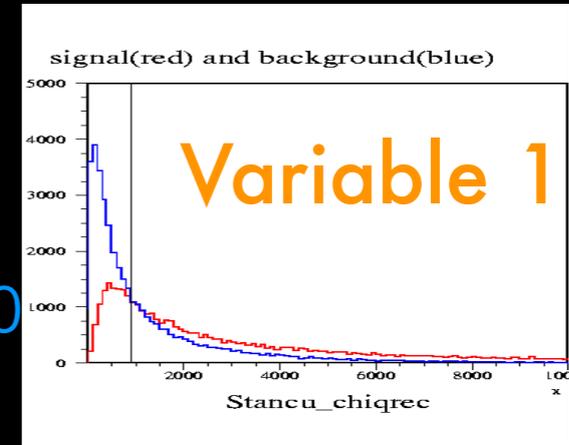
# A Decision Tree



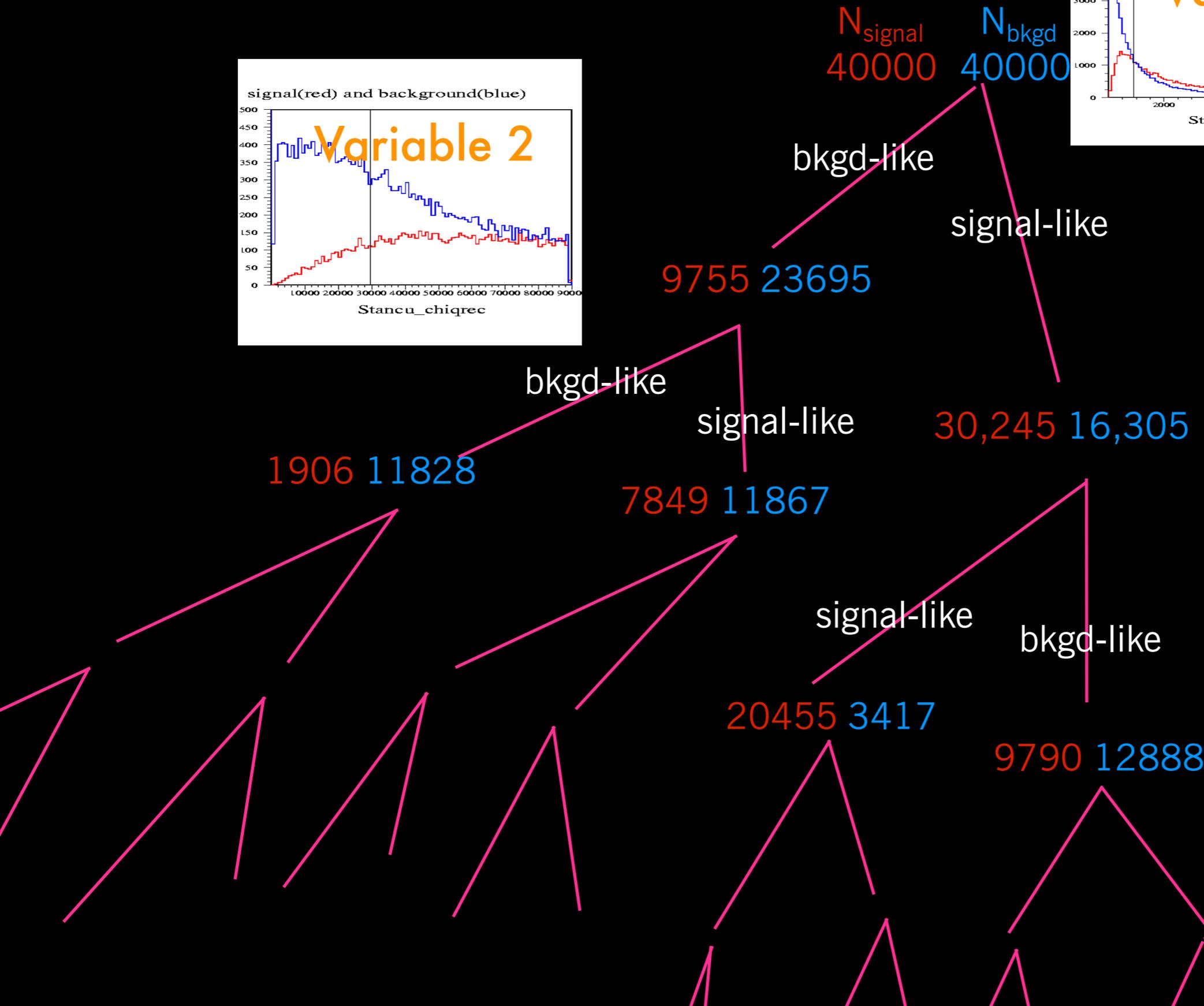
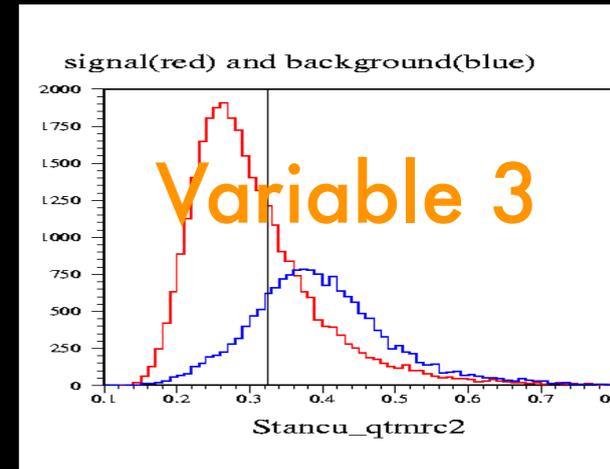
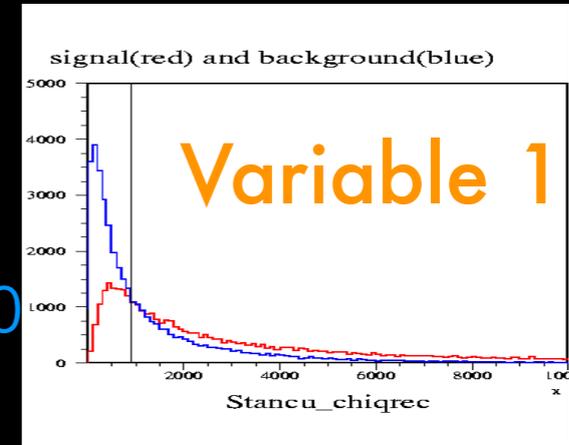
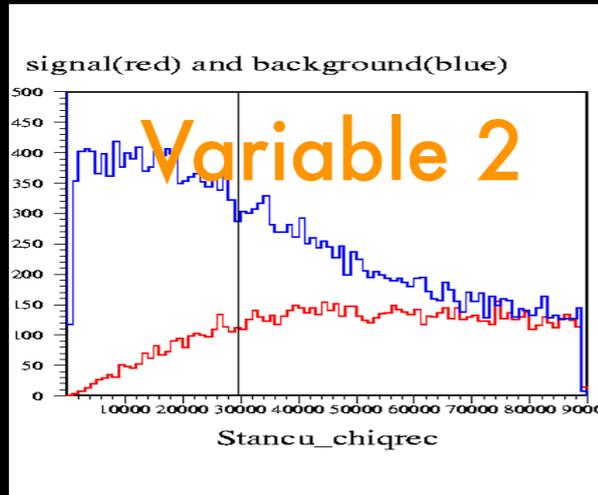
# A Decision Tree



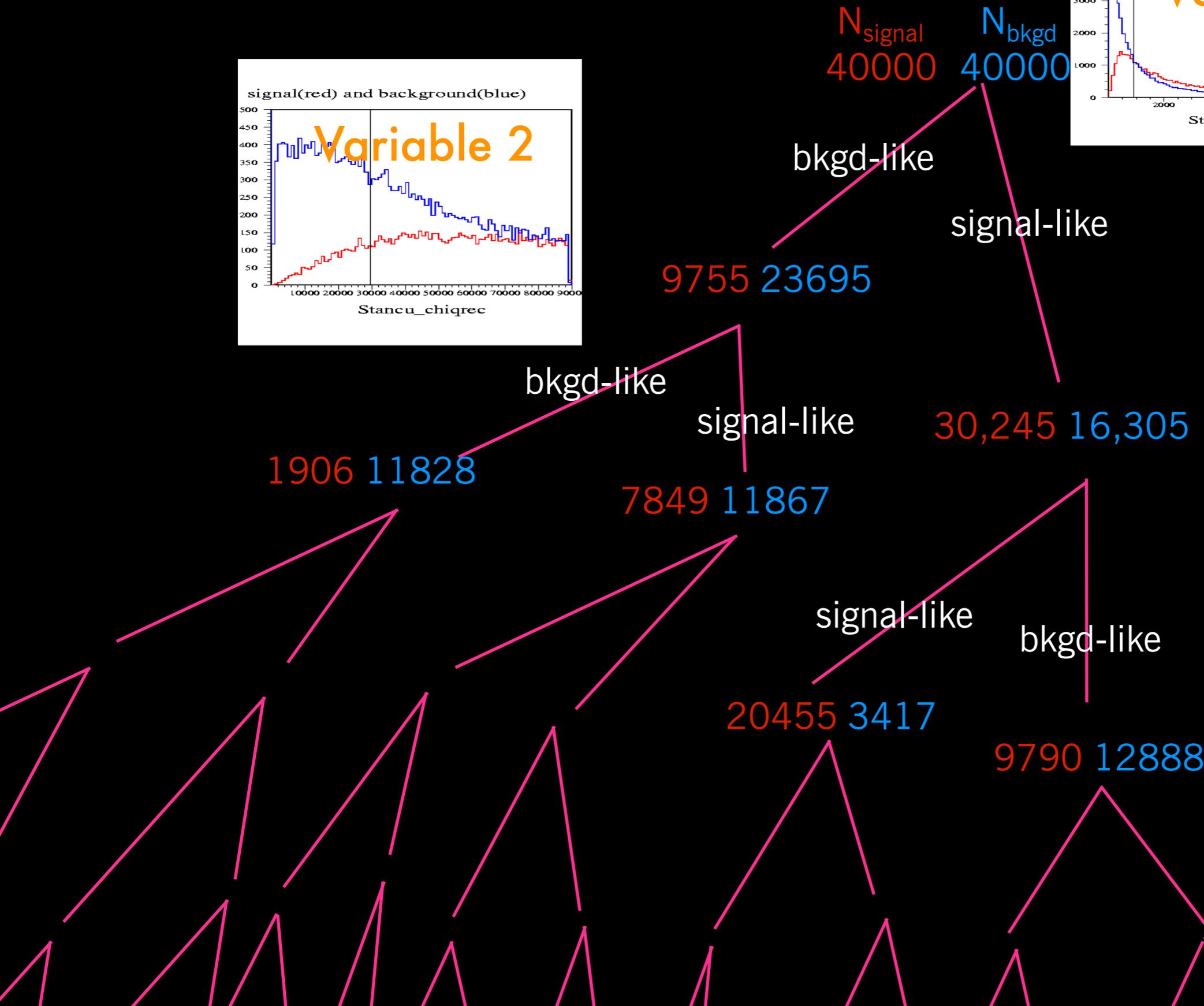
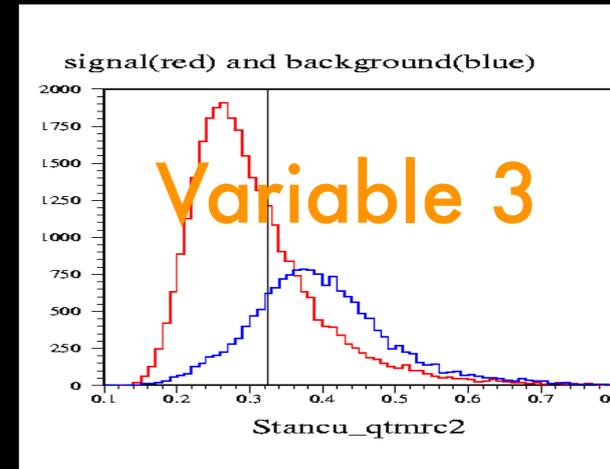
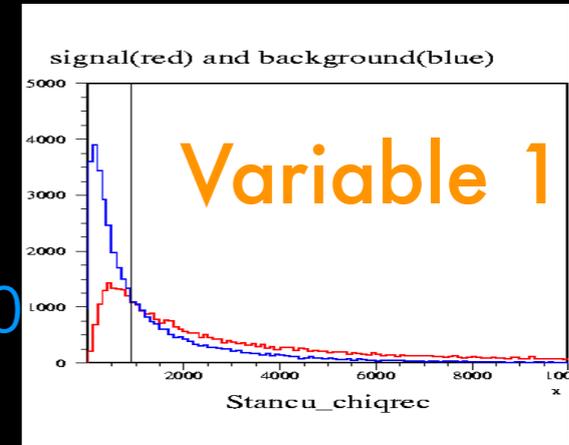
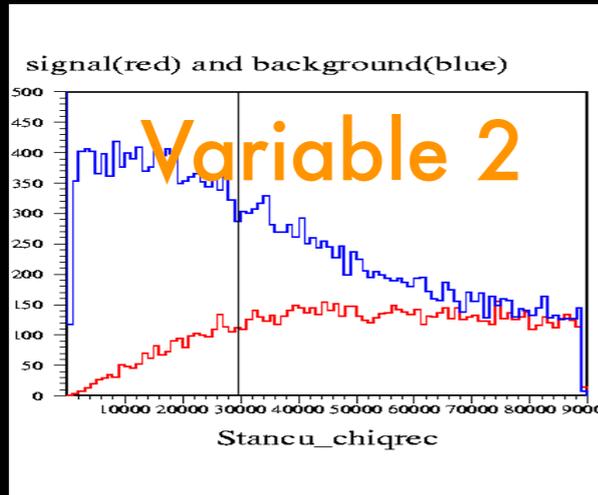
# A Decision Tree



# A Decision Tree



# A Decision Tree



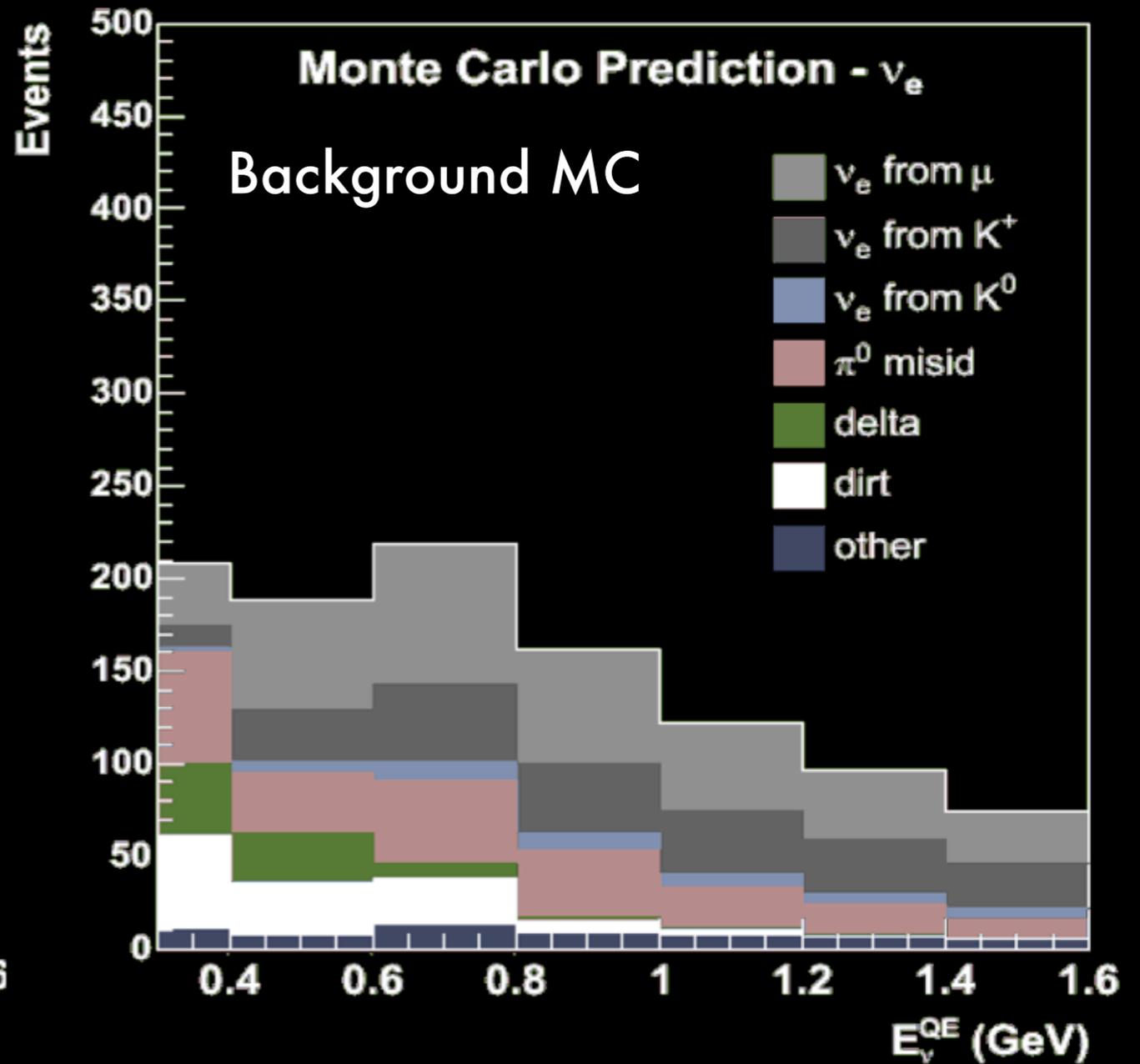
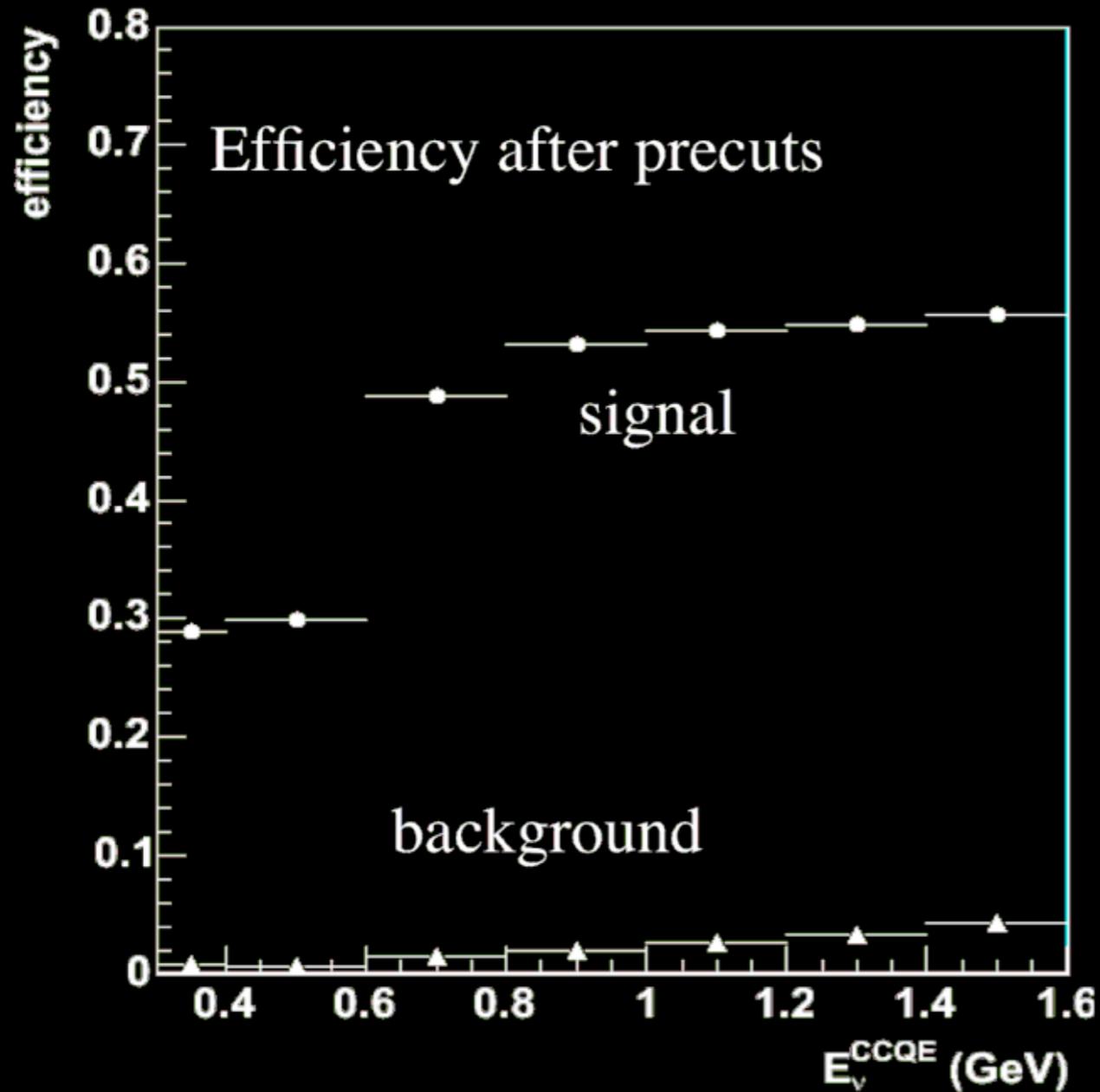
# Boosted Decision Trees (BDT)

- A tree is not unique
- After the tree is built, additional trees are built with the leaves re-weighted to emphasize the previously misidentified events (since those are hardest to classify). This is "boosting."
- Each data event is sent through every tree, and in each tree is assigned a value:
  - +1 if the event ends up on a signal leaf
  - -1 if the event ends up on a background leaf.
- PID output variable is a sum of event scores from all trees: background at negative values, signal at positive values.

## *Analysis variables used in BDT:*

- Low-level functions of fundamental variables like hit time, charge, etc.
- Examples of analysis variables:
  - Physics reconstruction variables ( $\cos\theta_\mu$ , vertex radius, ...)
  - Lower-level quantities (charge in theta range, etc)

# Efficiency of BDT PID cut



# *Cross-checks and Systematic Errors*

- Constraints from CCQE sample
- Cross-sections
- Optical model
- Error propagation
- Final estimate of errors and backgrounds

# *Constraints from $\nu_\mu$ CCQE sample*

## *Event rate normalization*

- Total  $\nu_\mu$  CCQE rate compared to Monte Carlo: appearance-only search will tie electron rate to this normalization
- Track-based:  $1.32 \pm 0.26$
- Boosting:  $1.22 \pm 0.29$

# Constraints from $\nu_\mu$ CCQE sample

- Each analysis approaches this differently:
- Track-based: Reweight MC prediction to match measured  $\nu_\mu$  result
- Boosting: include the correlations of  $\nu_\mu$  to  $\nu_e$  in the error matrix of a combined  $\nu_\mu + \nu_e$  fit:

$$\chi^2 = \begin{pmatrix} \Delta_i^{\nu_e} & \Delta_i^{\nu_\mu} \end{pmatrix} \begin{pmatrix} M_{ij}^{e,e} & M_{ij}^{e,\mu} \\ M_{ij}^{\mu,e} & M_{ij}^{\mu,\mu} \end{pmatrix}^{-1} \begin{pmatrix} \Delta_j^{\nu_e} \\ \Delta_j^{\nu_\mu} \end{pmatrix}$$

where  $\Delta_i^{\nu_e} = \text{Data}_i^{\nu_e} - \text{Pred}_i^{\nu_e}(\Delta m^2, \sin^2 2\theta)$  and  $\Delta_i^{\nu_\mu} = \text{Data}_i^{\nu_\mu} - \text{Pred}_i^{\nu_\mu}$

- Systematic (and statistical) uncertainties are included in  $(M_{ij})^{-1}$

# Neutrino cross-section errors for oscillation analysis

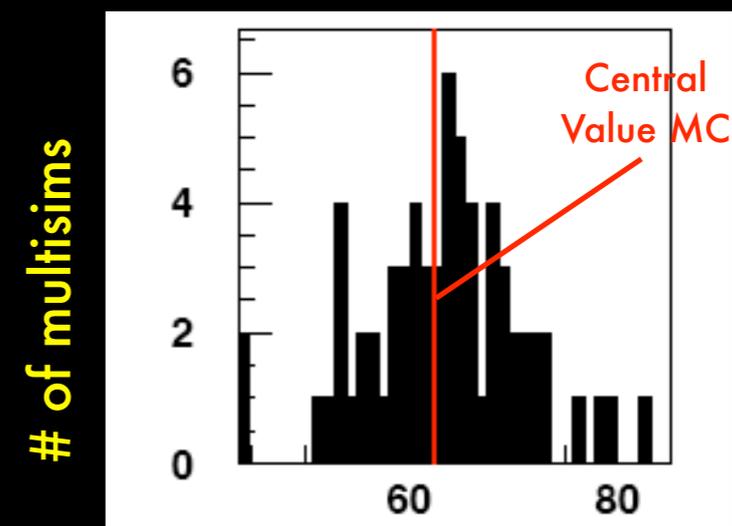
Parameter	Error/Value	Source
$M_A^{QE}, E_{lo}^{SF}$	6%, 2% (stat+bkg)	MiniBooNE $\nu_\mu$ CCQE
QE $\sigma$ norm	10%	MiniBooNE $\nu_\mu$ CCQE
NC $\pi^0$ rate	few % (depends on $p_\pi$ )	MiniBooNE NC $\pi^0$ data
$\Delta \rightarrow N\gamma$ rate	$\sim 10\%$	MiniBooNE NC $\pi^0$ data, $\Delta \rightarrow N\gamma$ BR
$E_B, p_F$	9 MeV, 30 MeV	External data
$\sigma_{DIS}$	25%	External data

These cross-sections and several others will be the subject of upcoming dedicated MiniBooNE analyses.

# Optical model uncertainties

- Optical model depends on 39 parameters such as absorption, scintillation, fluorescence behavior.
- Use “Multisim” technique to estimate error: vary the parameters according to a full covariance matrix, and run 70 full GEANT Monte Carlo “experiments” to map the space of detector responses to the parameters.
- Space of output results is used to produce error matrix for the oscillation candidate histogram
- Example of multisim outputs in a single osc. bin:

70 Optical Model multisims

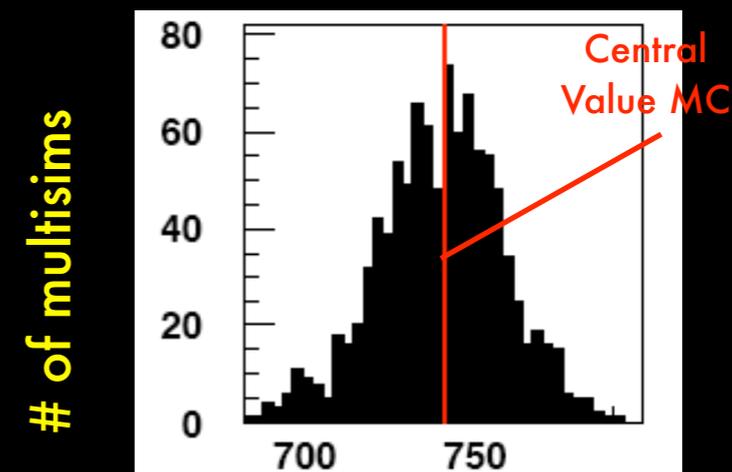


# events passing signal cuts in bin  $500 < E_\nu^{QE} < 600$  MeV

# Handling other uncertainties

- Flux and neutrino cross-section parameter variations do not affect the hit distributions for a given event, only the probability of that event occurring in the first place
- Rather than repeating hit-level MC, determine effect of varying by mocking up 1000 multisims by reweighting the same MC events: reduced MC statistics error and greatly reduced CPU usage.
- Similar procedure to produce error matrix for the oscillation candidate histogram
- Example of multisim outputs in a single osc. bin:

1000 K+ reweighting multisims



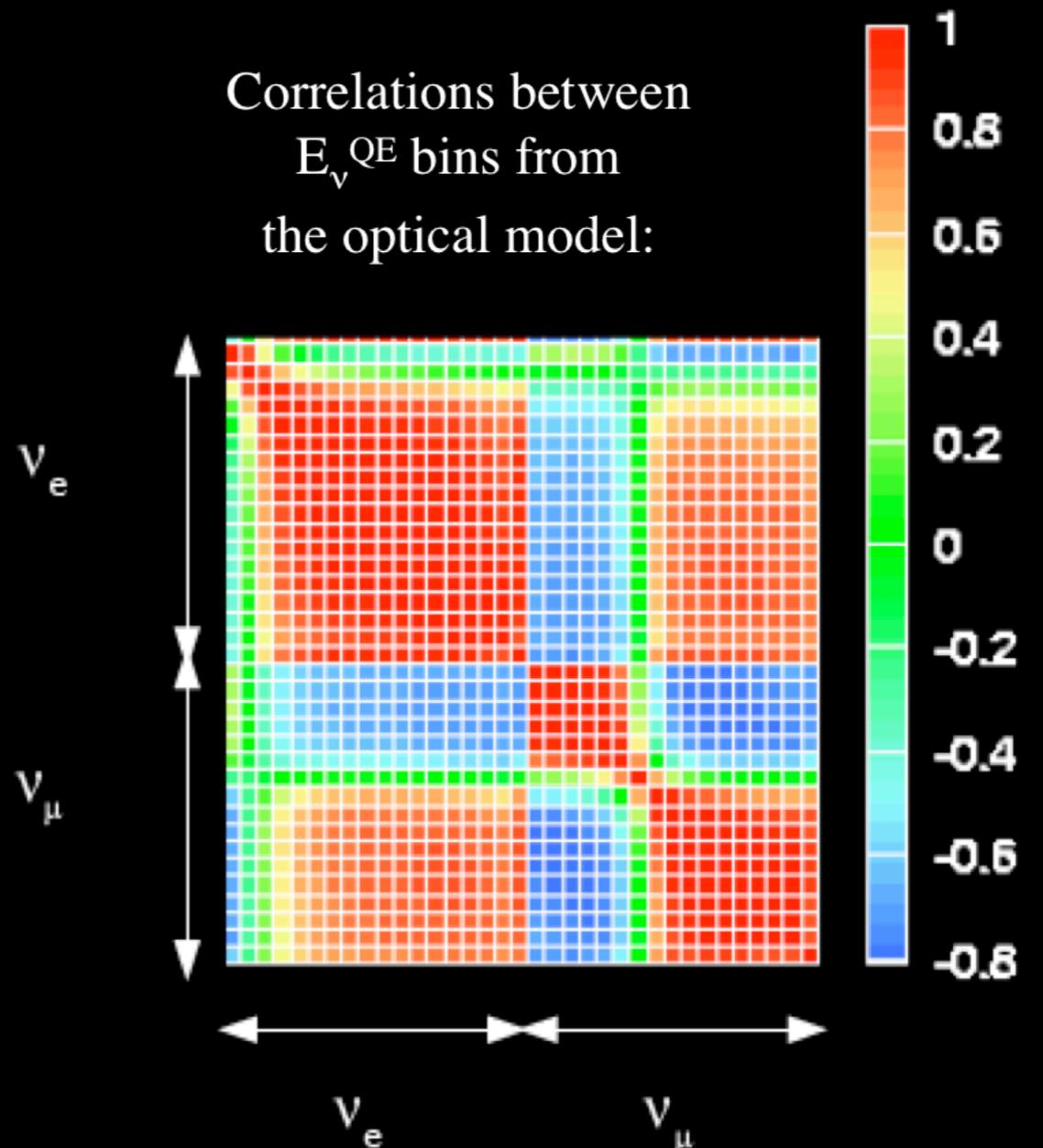
# events passing signal cuts in bin  $500 < E_{\nu}^{QE} < 600$  MeV

# The error matrix

$$E_{ij} = \frac{1}{M} \sum_{\alpha=1}^M (N_i^\alpha - N_i^{MC}) (N_j^\alpha - N_j^{MC})$$

- $N$ : Number of events passing cuts
  - $MC$ : Central value Monte Carlo
  - $\alpha$ : index represents a given multisim
  - $M$ : total number of multisims
  - $i, j$ :  $E_\nu^{\text{QE}}$  bins
- Brings in correlations among the input parameters, and the resulting correlations among the data bins
  - Total error matrix is sum from each source (optical model,  $K$  production, QE cross-section, etc...)
  - Track-based: uses error matrix in  $\nu_e E_\nu^{\text{QE}}$  only ( $\nu_\mu$  CCQE information comes in reweighting instead of fit)
  - Boosting: uses combined error matrix in  $\nu_\mu + \nu_e E_\nu^{\text{QE}}$  bins

Correlations between  $E_\nu^{\text{QE}}$  bins from the optical model:



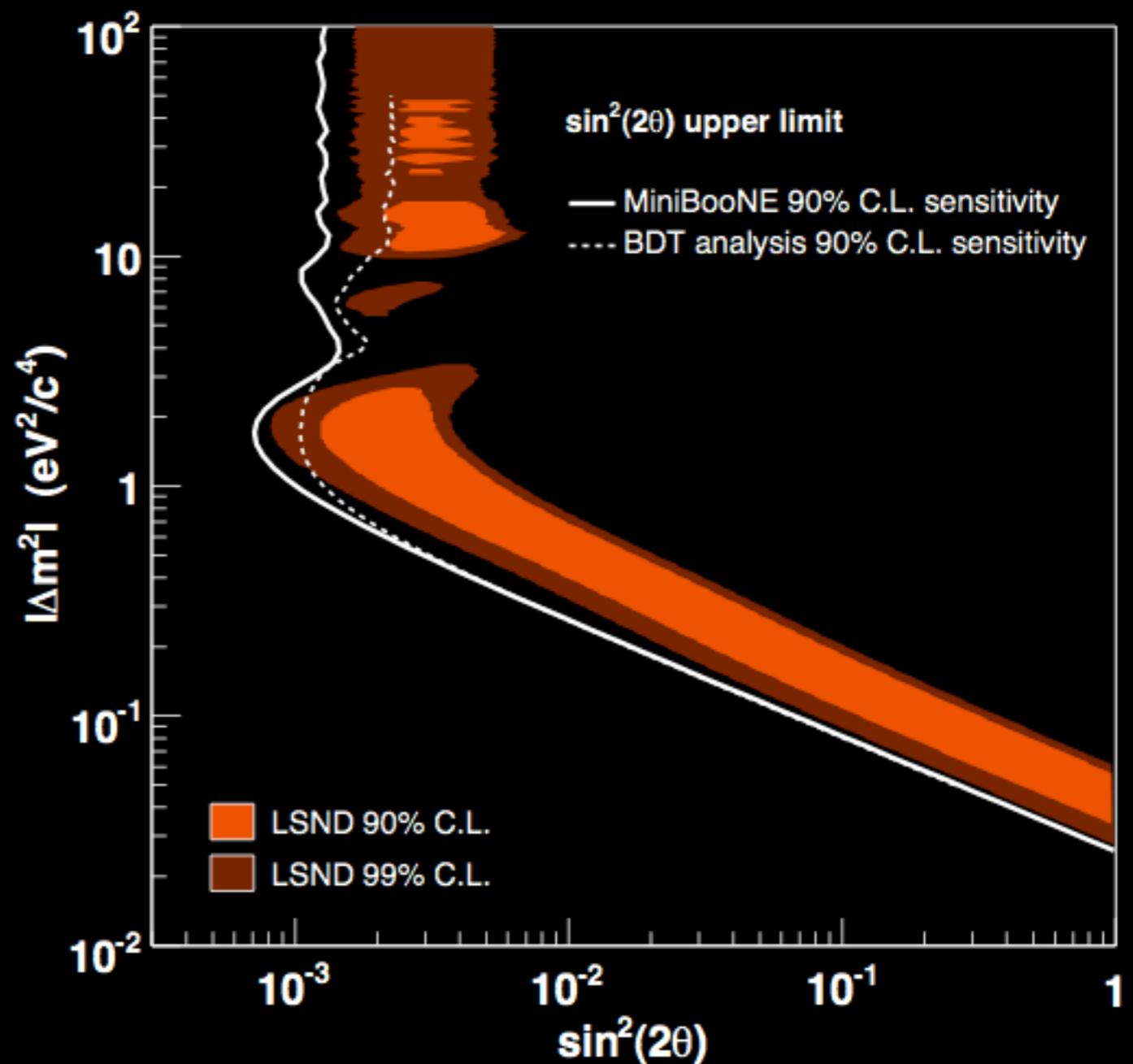
# Expected background events by source

PROCESS	EVENTS AFTER SELECTION
BEAM UNRELATED	2
DIRT	$17 \pm 3$
NEUTRAL CURRENT $\pi^0$	$62 \pm 10$
NC RADIATIVE $\Delta$ DECAY	$20 \pm 4$
NC COHERENT AND RADIATIVE	$<1$
$\nu_\mu$ QUASIELASTIC	$10 \pm 2$
NEUTRINO-ELECTRON ELASTIC	$7 \pm 2$
OTHER $\nu_\mu$	$13 \pm 5$
INTRINSIC $\nu_e$ FROM MUONS	$132 \pm 10$
INTRINSIC $\nu_e$ FROM $K^+$	$71 \pm 26$
INTRINSIC $\nu_e$ FROM $K^0$	$23 \pm 7$
INTRINSIC $\nu_e$ FROM $\pi^+ \rightarrow e^+ \nu_e$	$3 \pm 1$
<b>TOTAL BACKGROUND</b>	<b><math>358 \pm 35</math> (syst)</b>
$0.26\% \nu_\mu \rightarrow \nu_e$	163

If LSND correct

# Oscillation sensitivity

- Track-based algorithm has slightly better sensitivity to 2-neutrino oscillations
- This will therefore be our primary result



# *Unblinding*

- First step:
  - Perform fit, but do not report results
  - Return  $\chi^2$  probability for a set of diagnostic variables, *not* including the quasielastic energy on which the fit is performed, compared to Monte Carlo *with (still hidden) best-fit signal*
- Second step:
  - Compare these plots directly, with no normalization info
- Third step:
  - Report the  $\chi^2$  for the oscillation parameter fit
- Final step:
  - Report the results of the fit and the full energy distribution

# Results

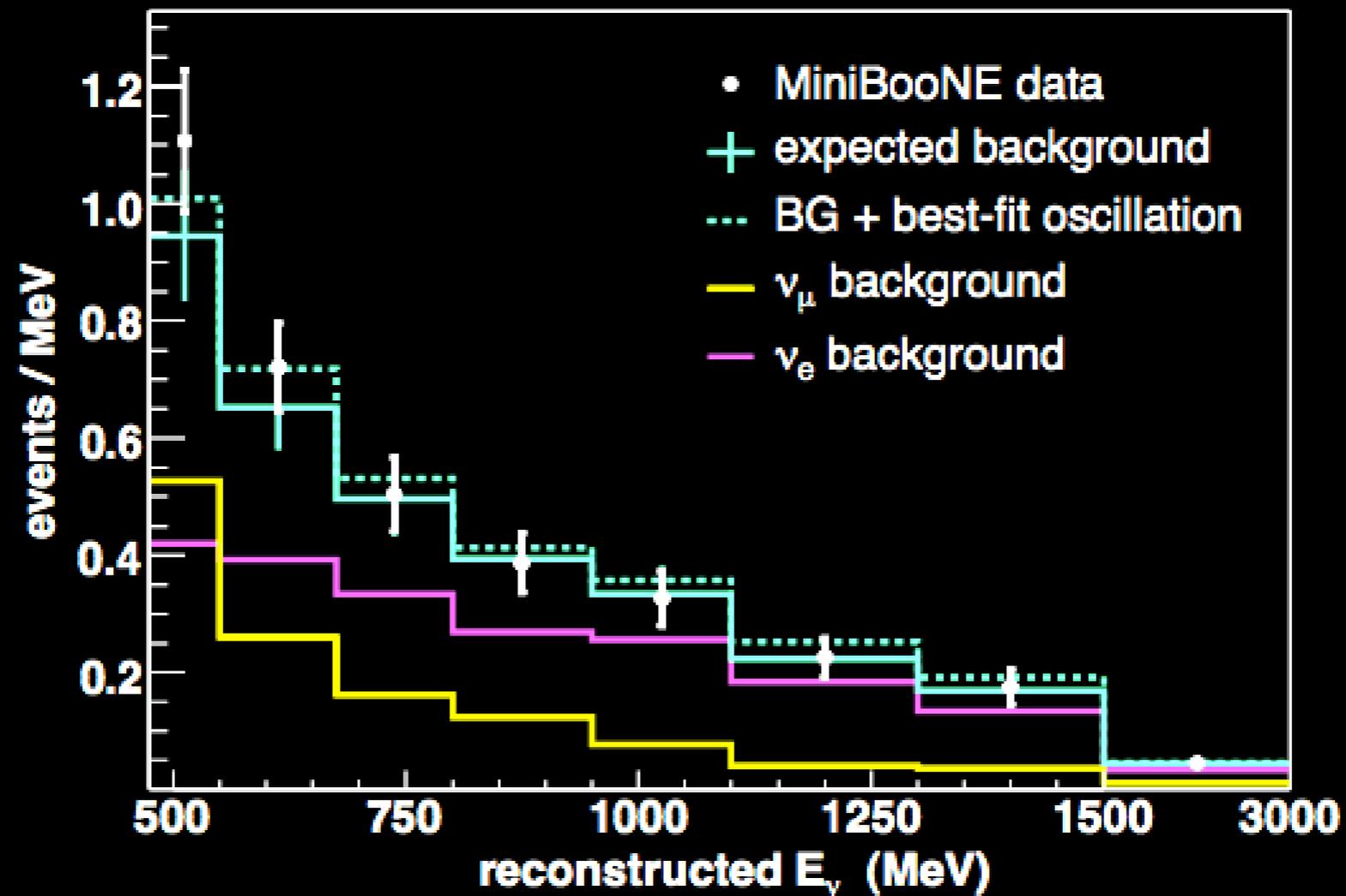
- Step 1 ( $\chi^2$  probability for a set of diagnostic variables):
  - Only probabilities revealed, not full histograms
  - 12 variables for track-based analysis: 11 look good
  - 46 variables for boosting analysis: all look good
- $E_{\text{visible}}$  (not  $E_{\nu}^{\text{QE}}$ ) distribution in track-based analysis returned a probability of  $<1\%$ :
  - Track-based analysis revised to limit oscillation fit range to  $E_{\nu}^{\text{QE}} > 475$  MeV, eliminating two low-energy bins where backgrounds known to rise.
  - New sensitivity almost identical to old
  - No change to the Boosting analysis

# Results

- Track based analysis:  $475 < E_{\nu}^{\text{QE}} < 1250 \text{ MeV}$ 
  - Expected background:  
 $358 \pm 19 \text{ (stat)} \pm 35 \text{ (syst)}$
  - Observed: 380      Discrepancy:  $0.55 \sigma$

NO EVIDENCE FOR OSCILLATIONS  
IN COUNTING ANALYSIS

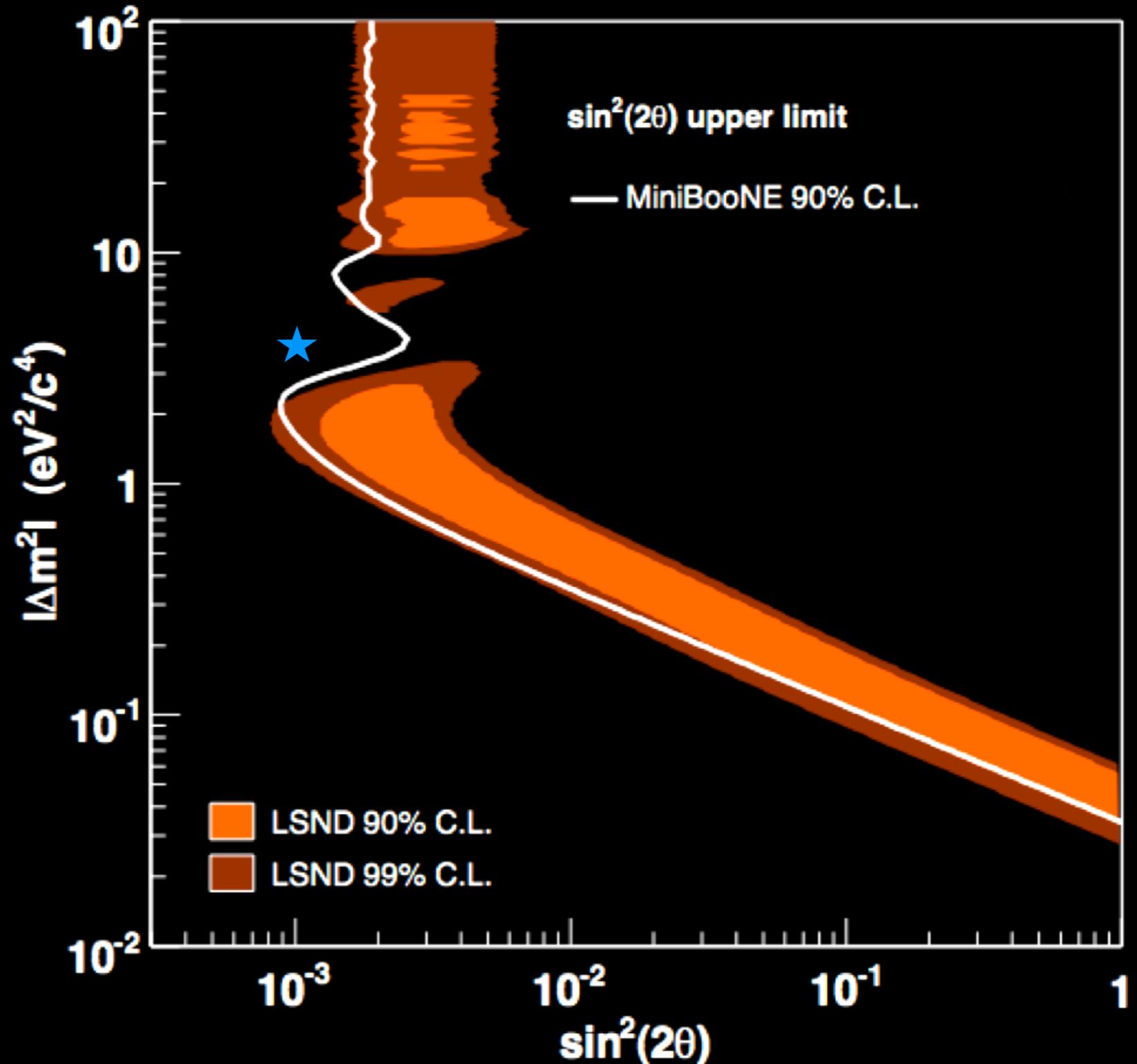
# Energy fit and spectrum



- Good agreement with background only (93% CL)
- Best Fit (dashed):  $(\sin^2 2\theta, \Delta m^2) = (0.001, 4 \text{ eV}^2)$ , 99% fit CL

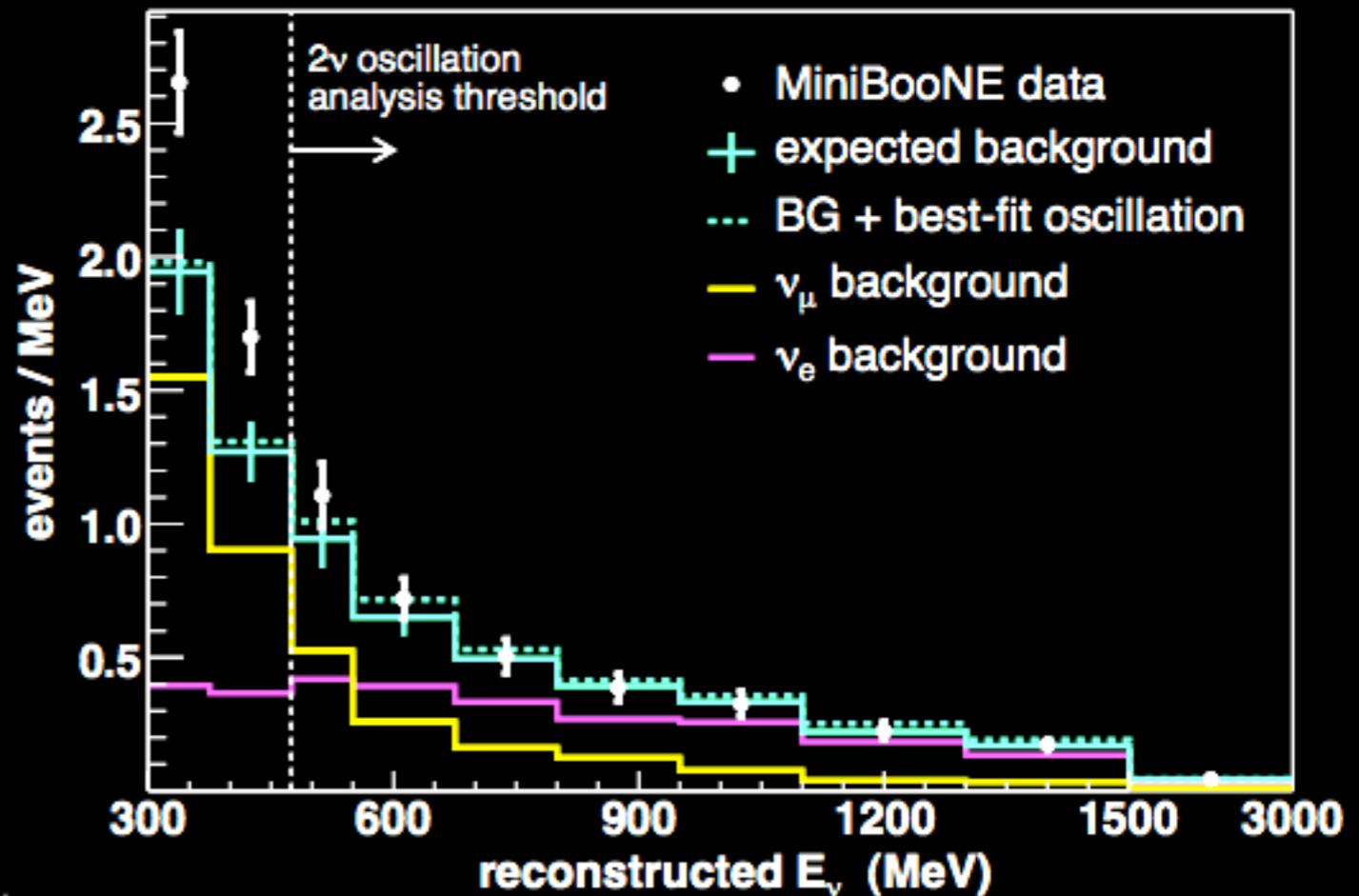
# Oscillation Limit

- Single-sided 90% confidence limit
- Best fit (star):  
 $(\sin^2 2\theta, \Delta m^2) = (0.001, 4 \text{ eV}^2)$

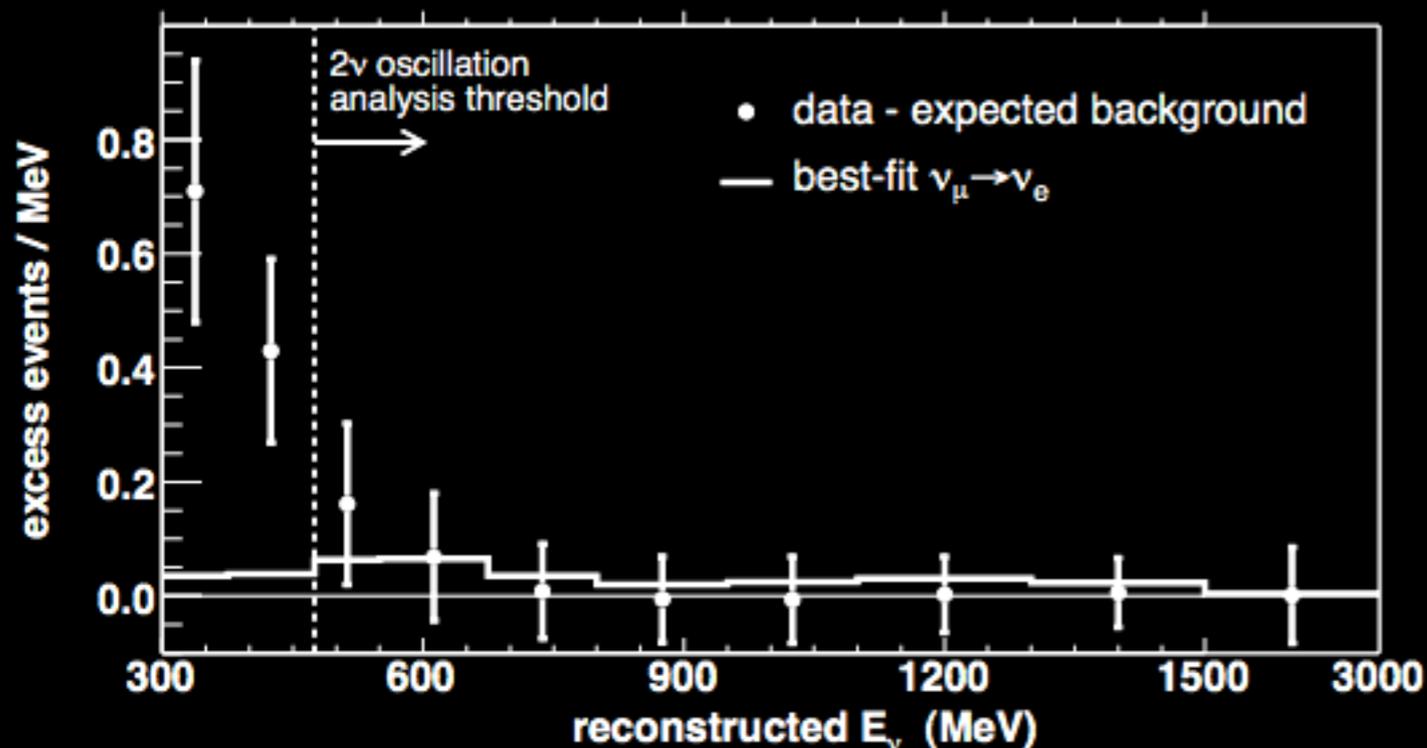


# The full spectrum

- Extending the plot down to the 300 MeV threshold
- A significant data/MC discrepancy exists in the lower bins



## BACKGROUND SUBTRACTED

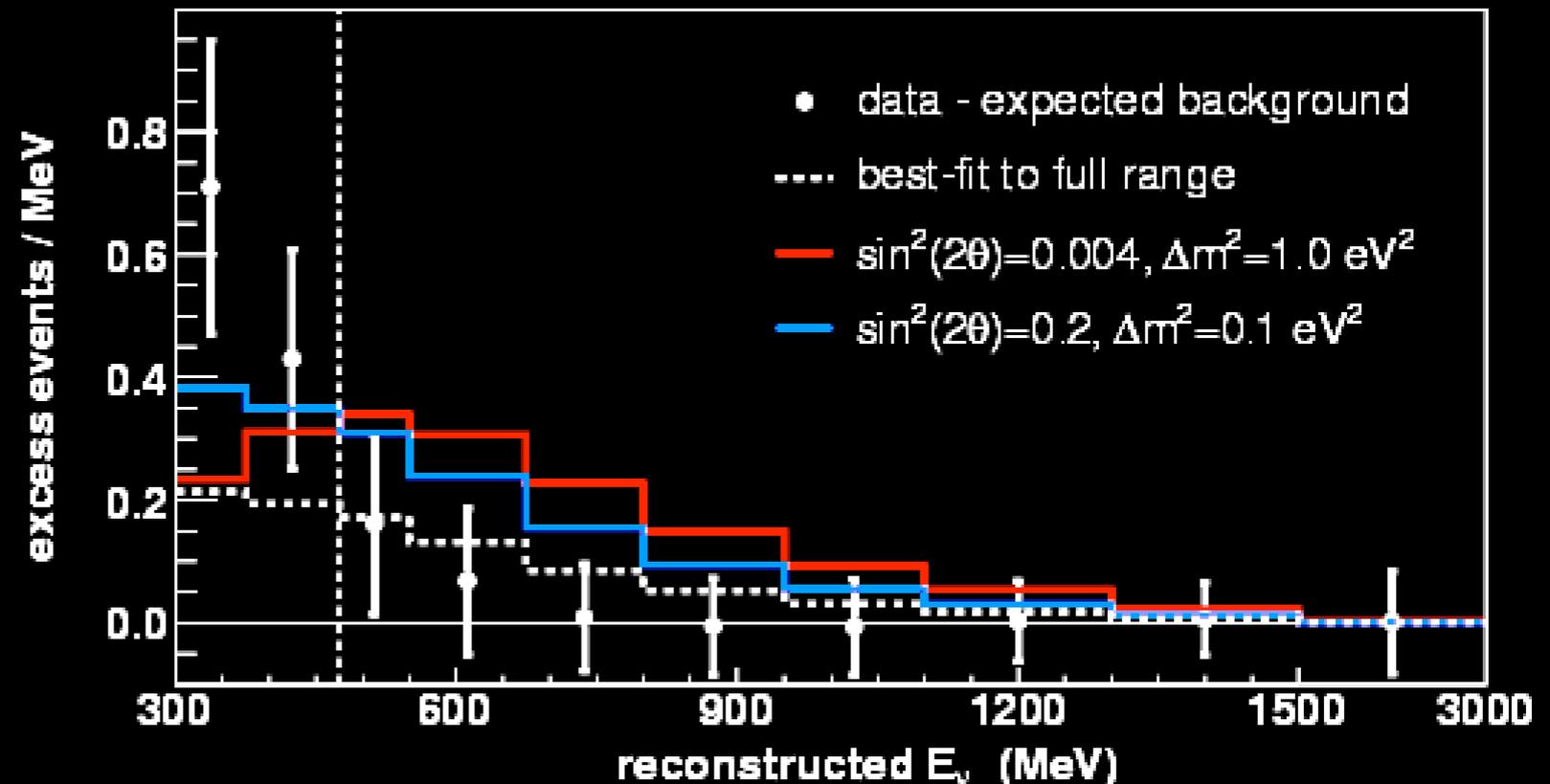


Focusing on the lowest two bins only:

- Excess is  $96 \pm 17 \pm 20$  events

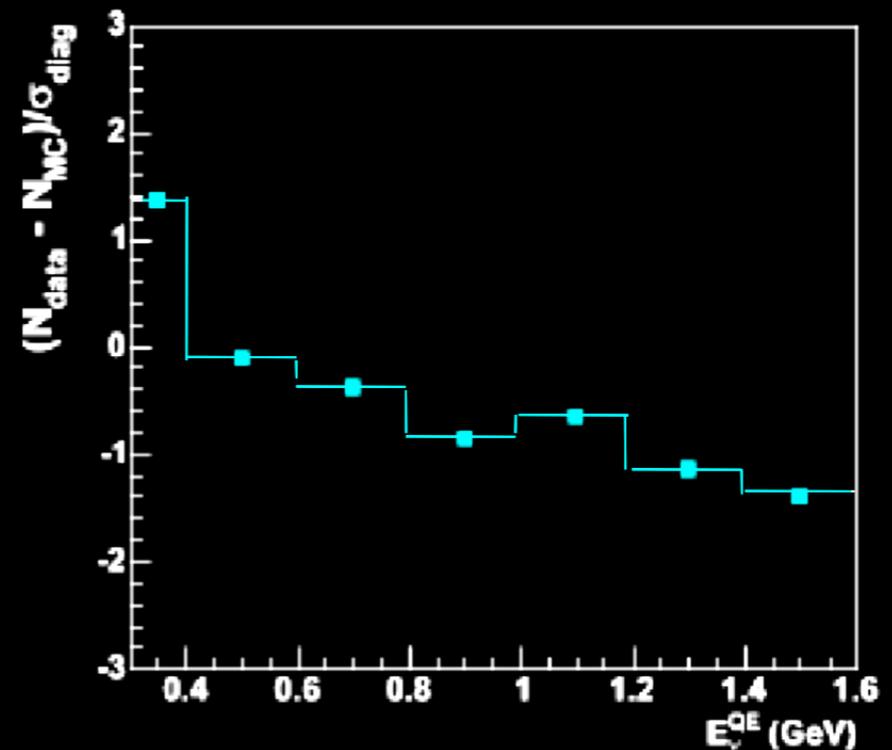
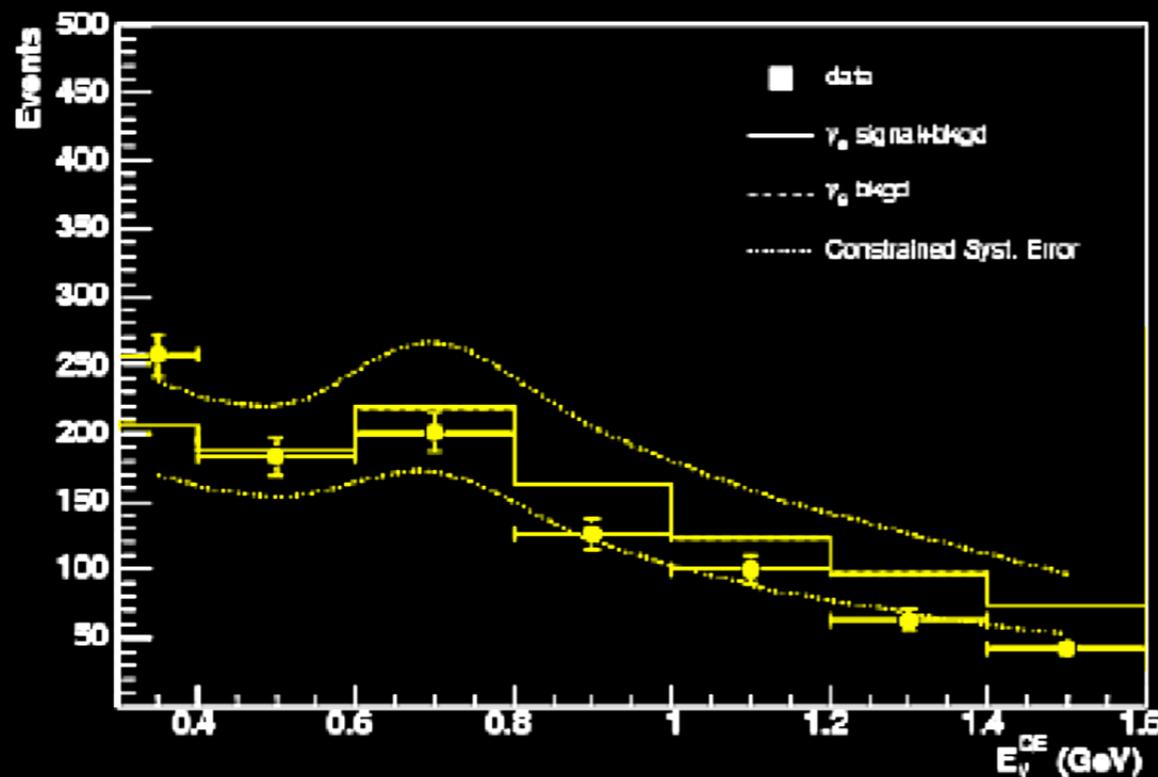
# 2-neutrino fit to full spectrum

- Best fit has 18% probability
- $(\sin^2 2\theta, \Delta m^2) = (1.0, 0.03 \text{ eV}^2)$
- These parameters are completely excluded by reactor experiments in 2-nu model
- Null hypothesis has 3% probability
- **Spectrum does not resemble LSND-type oscillations**



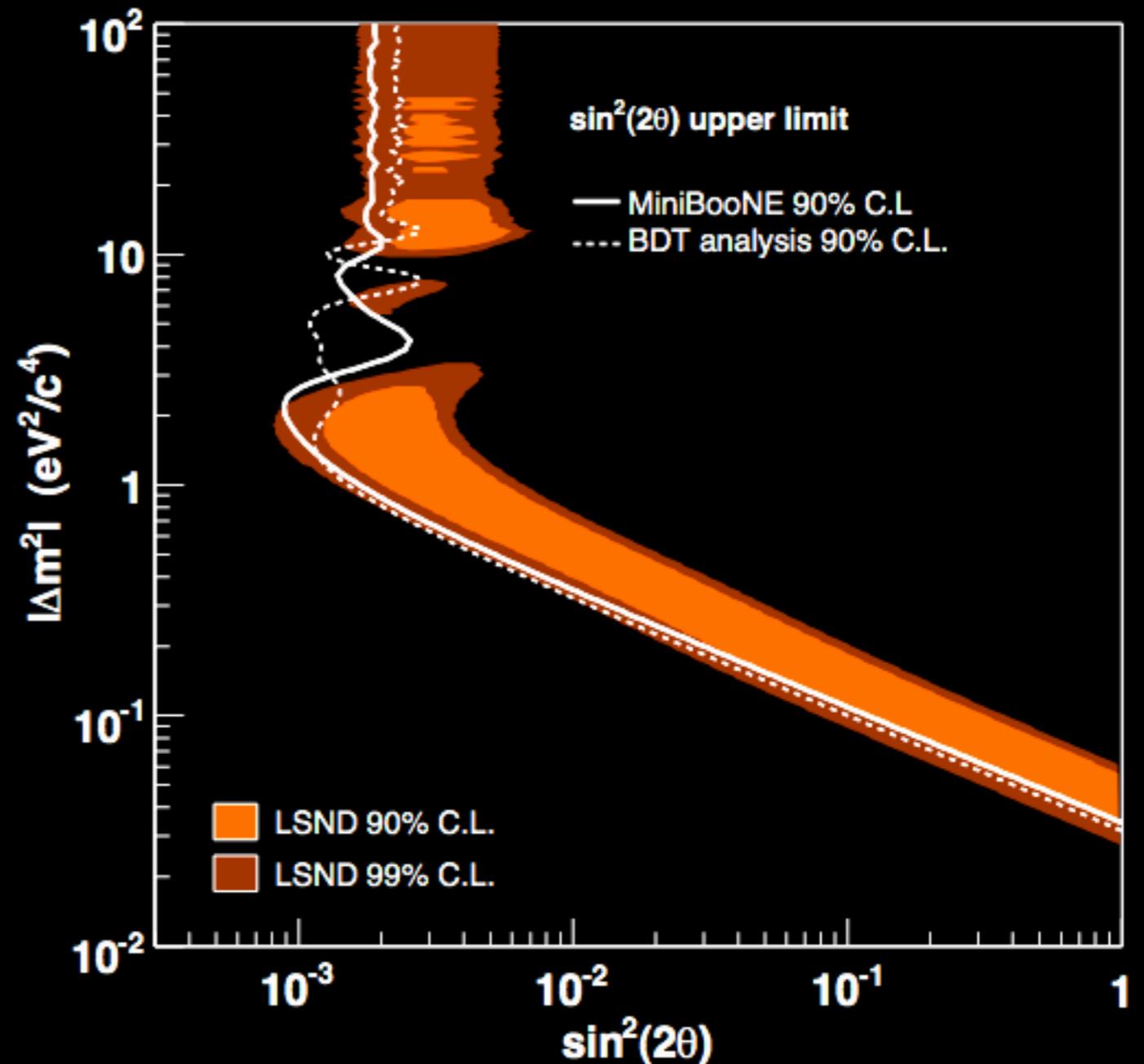
# Oscillation fit in Boosting Analysis

- Best fit probability is 62%
- Less significant excess at low energy (but larger normalization error)
- Only diagonal errors shown – fit uses full error matrix
- Counting Experiment:  $300 < E_{\nu}^{\text{QE}} < 1600$  MeV
  - Data: 971 events
  - Background expectation:  $1070 \pm 33$  (stat)  $\pm 225$  (sys) events
  - Overall counting significance:  $-0.38 \sigma$



# Comparing the limits

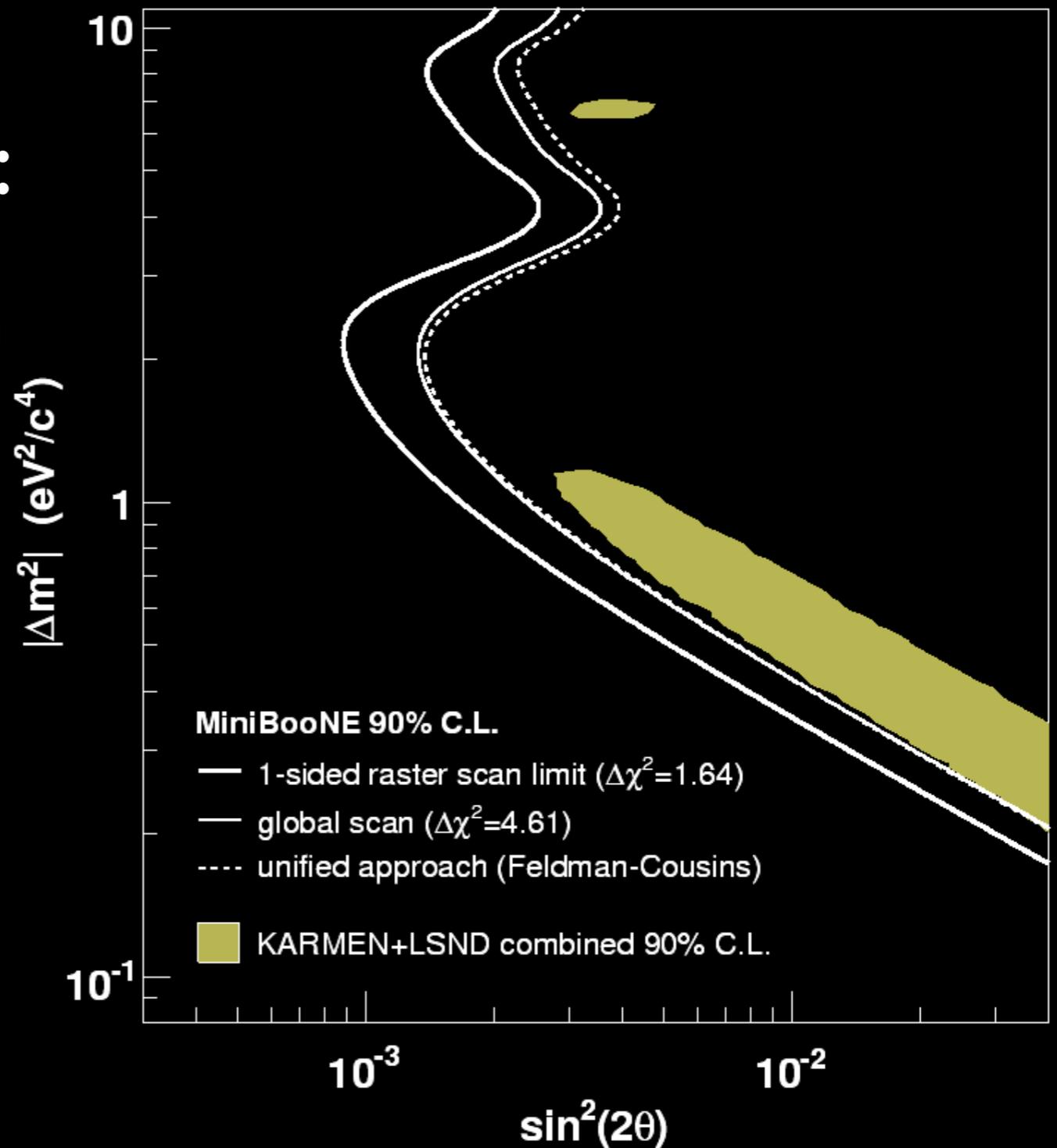
- Solid: Track-based
- Dashed: Boosting
- The two analyses have very consistent fit results.
- Track-based fit remains our primary result.



# Limit curves under different confidence bound options

## Ways to present limits:

- Single sided raster scan (historically common, our default)
- Global  $\chi^2$  scan
- Unified approach (Feldman-Cousins)



# MiniBooNE vs. LSND:

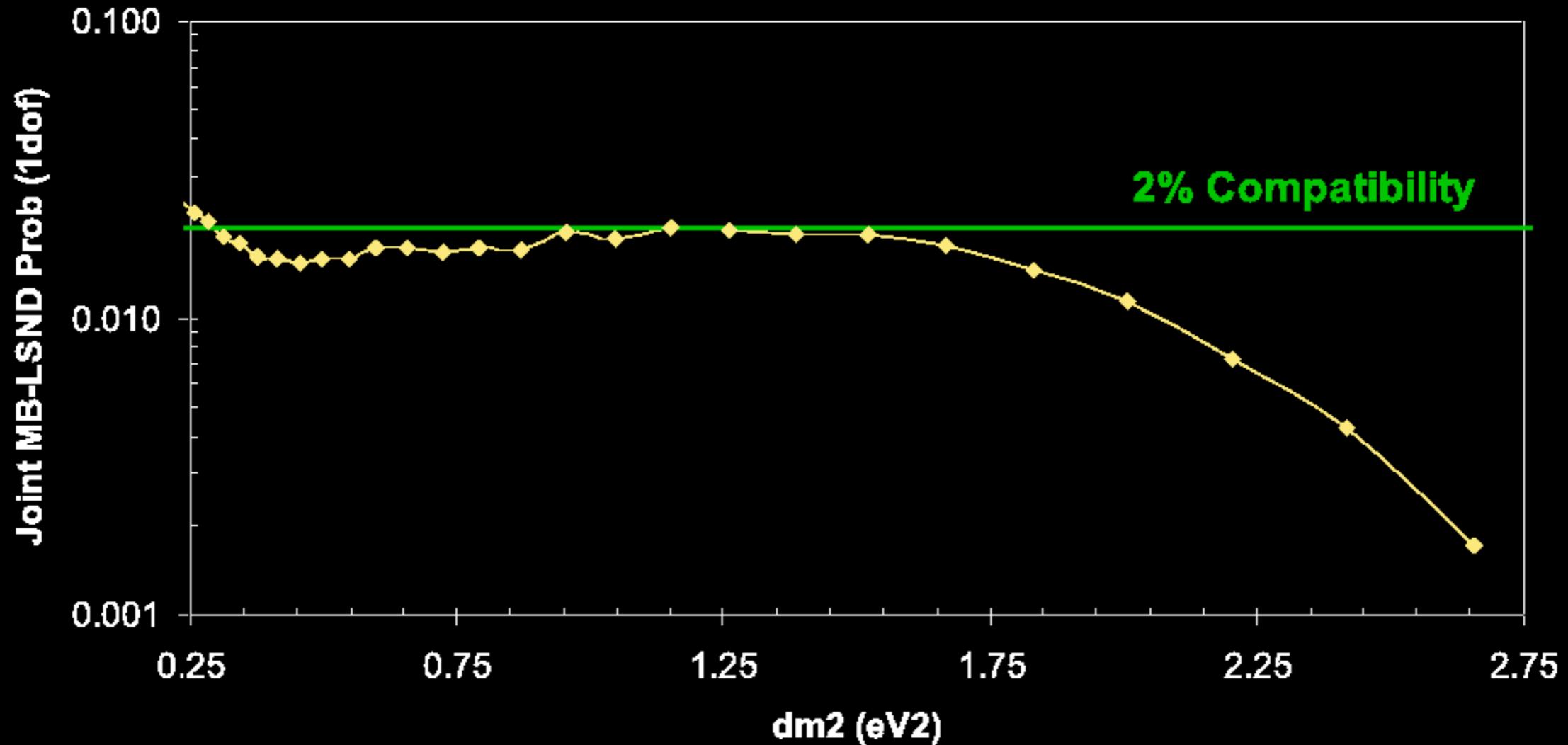
## A simple compatibility test

- For each  $\Delta m^2$ , determine the MiniBooNE ( $M$ ) and LSND ( $L$ ) measurement of  $\sin^2(2\theta)$ :
  - $z_M \pm \sigma_M, z_L \pm \sigma_L$  where  $z \equiv \sin^2(2\theta)$  and  $\sigma_M, \sigma_L$  evaluated at that  $\Delta m^2$
- For each  $\Delta m^2$ , form  $\chi^2$  between MiniBooNE and LSND measurement:

$$\chi_0^2 = \frac{z_M - z_0}{\sigma_M^2} + \frac{z_L - z_0}{\sigma_L^2} \quad \begin{array}{l} \bullet M: \text{MiniBooNE} \\ \bullet L: \text{LSND} \end{array}$$

- Find  $z^0$  that minimizes  $\chi^2$  (weighted average of two measurements of  $\sin^2(2\theta)$ ); this gives  $\chi_{\min}^2$
- Find probability of  $\chi_{\min}^2$  for 1 dof; this is the joint probability at this  $\Delta m^2$  if the two experiments are measuring the same thing.

# LSND-MiniBooNE compatibility

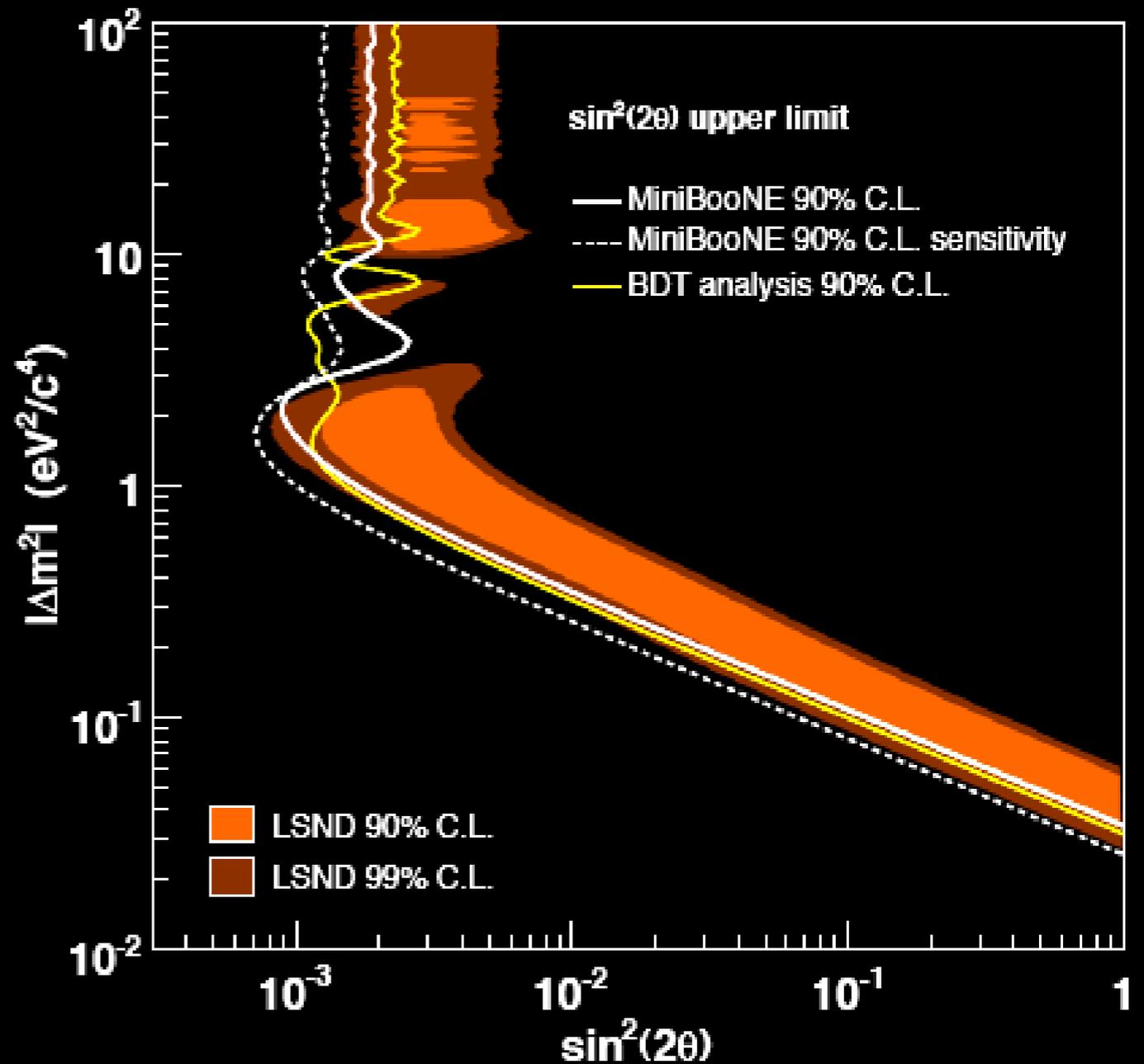


- MiniBooNE is incompatible with a  $\nu_{\mu} \rightarrow \nu_e$  appearance-only interpretation of LSND at 98% CL

# Next Steps

- Further investigation of low-energy excess
  - Cross-sections? (Further MiniBooNE, SciBooNE studies)
  - Other non-oscillation effects?
- Further interpretation of oscillation limit
  - Full MiniBooNE+LSND+KARMEN joint analysis
  - Combined track-based and boosting analysis

# Conclusions



- MiniBooNE sets a limit on  $\nu_\mu \rightarrow \nu_e$  oscillations. We strongly exclude LSND in a CP-conserving two-neutrino model.
- Data show discrepancy vs. background at low energies, but spectrum inconsistent with two-neutrino oscillation.