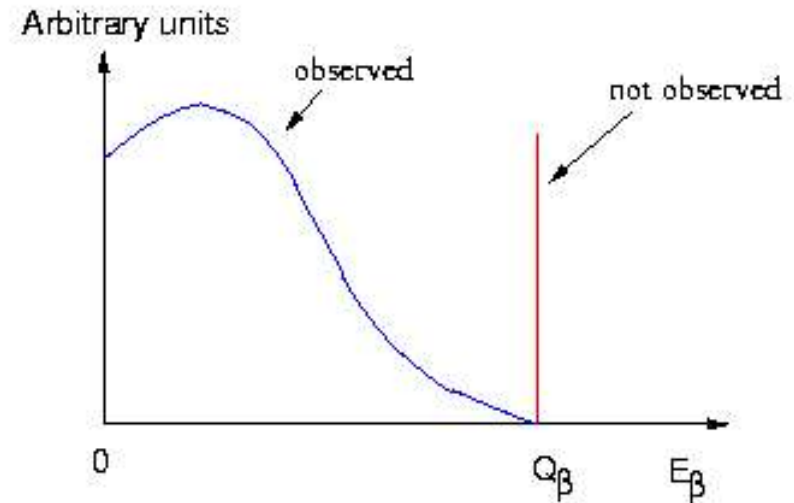
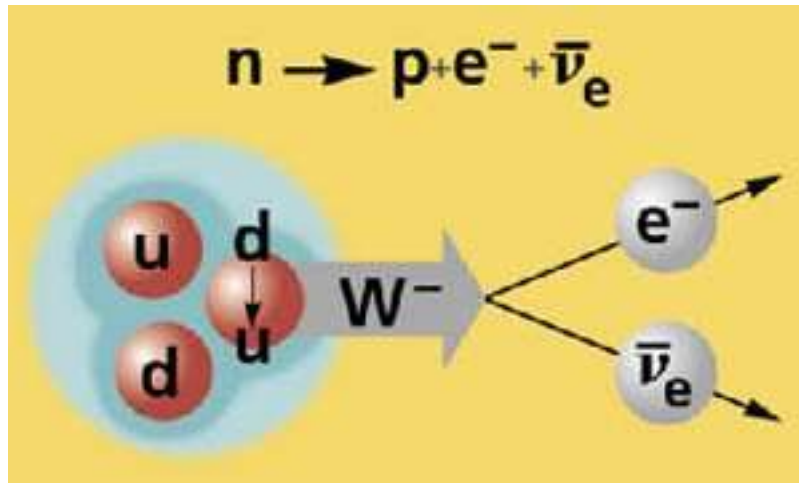


B. T. Fleming  
SLAC Summer Institute  
August 9th, 2007

# MiniBooNE First Oscillation Results



# The beginnings of the neutrino: Desperate Remedies



Bohr was ready to abandon Conservation of Energy to explain this missing energy phenomena until Pauli proposed this "desperate remedy": the neutrino

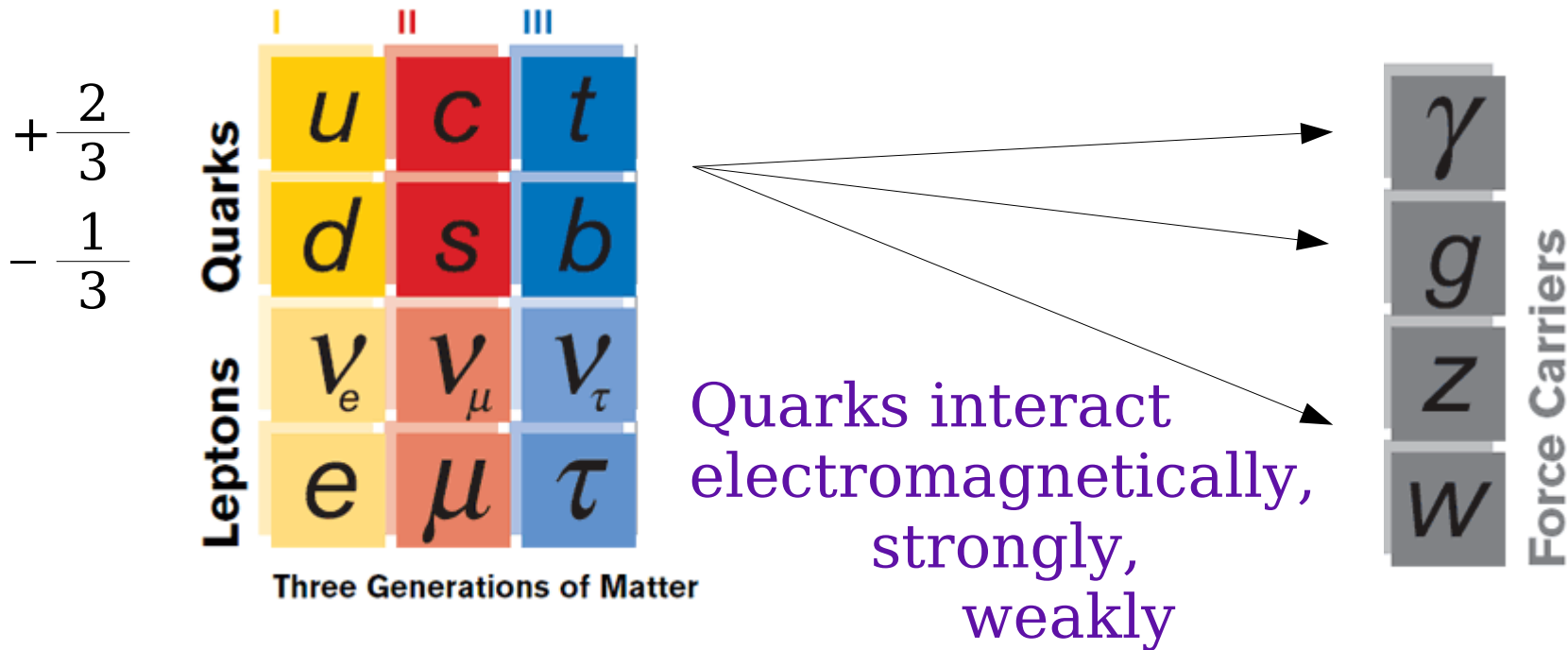


1930: Pauli  
"...I have predicted something which shall never be detected experimentally!"

1956: Electron neutrino detected

2007: Continually growing field of neutrino physics!

# Neutrinos in the Standard Model



Quark masses range from  $\sim 1$  MeV to 170 GeV

Quarks mix between their flavors

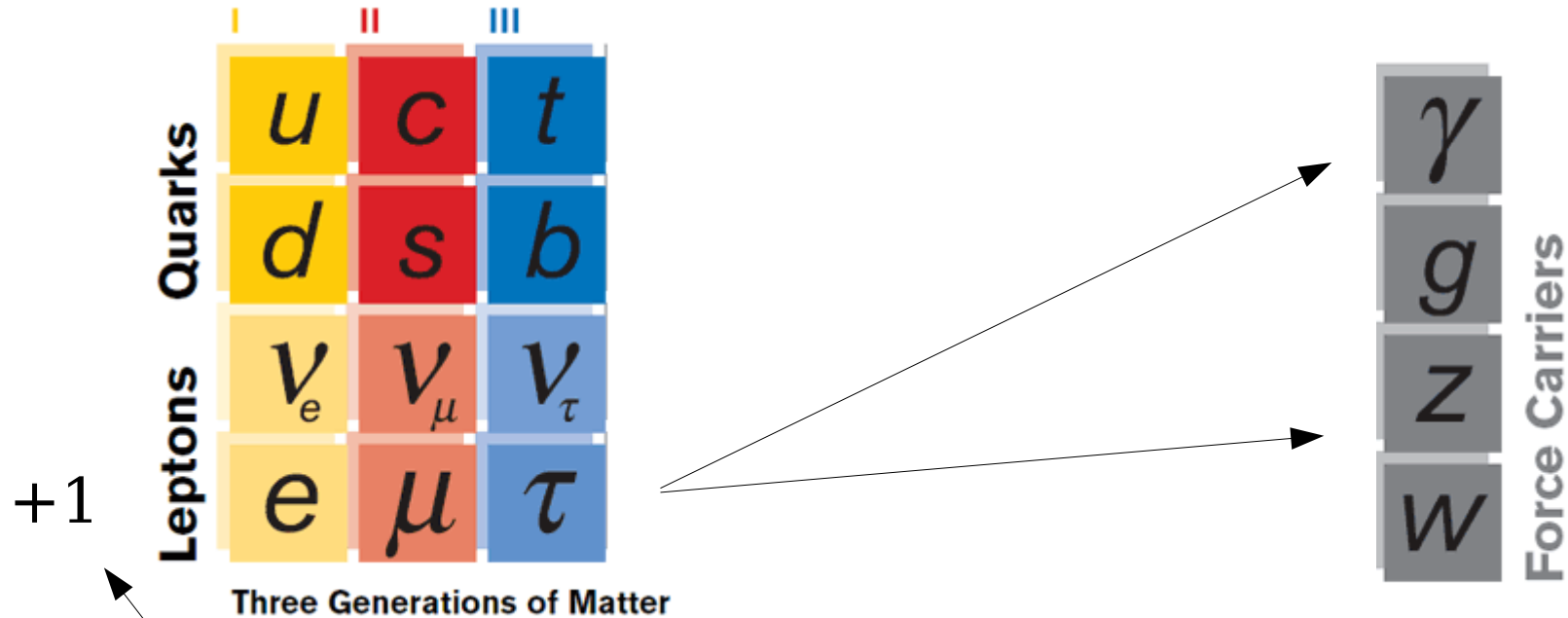
Quarks

	I	II	III
$u$	$c$	$t$	
$d$	$s$	$b$	

The CKM Matrix

$$\begin{bmatrix} d' \\ s' \\ b' \end{bmatrix} = \begin{bmatrix} V_{ud} & V_{us} & V_{ub} \\ V_{cd} & V_{cs} & V_{cb} \\ V_{td} & V_{ts} & V_{tb} \end{bmatrix} \begin{bmatrix} d \\ s \\ b \end{bmatrix}$$

# Neutrinos in the Standard Model



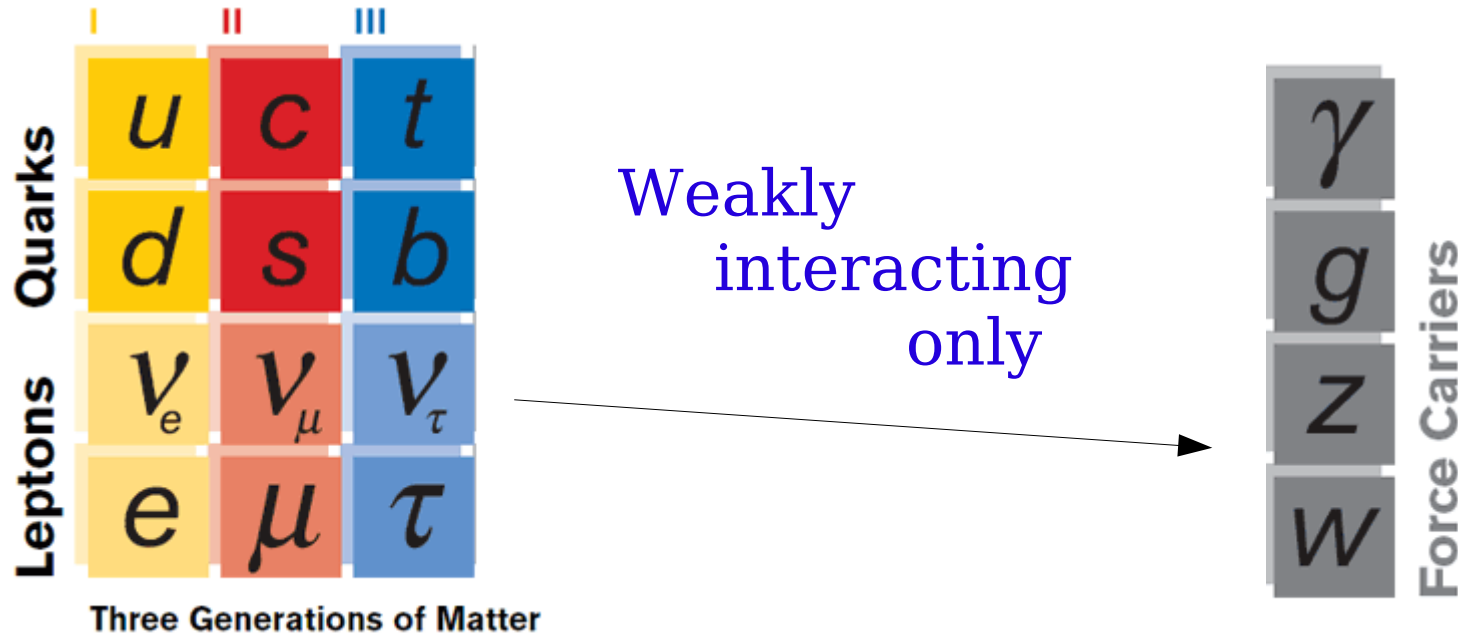
Charged leptons interact  
electromagnetically and weakly

Charged leptons range in mass from  
0.5 MeV to 1.7 GeV



paired in doublets  
with neutrinos

# Neutrinos in the Standard Model



By comparison, we know relatively little about the neutrinos....



paired in doublets  
with electrons  
no charge  
until recently....no mass?

Why have we known so little?

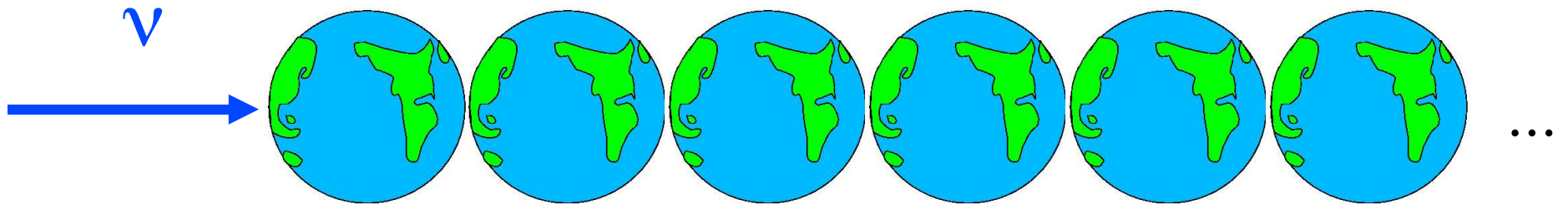
→ Took 26 years from Pauli just to see the neutrino

the weak force is **weak!**

neutrinos interact

100,000,000,000

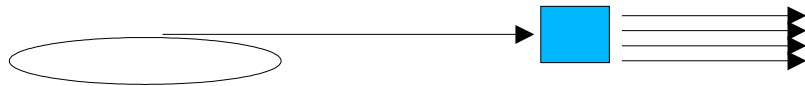
times less often than quarks



A neutrino has a good chance of traveling through  
200 earths before interacting at all!

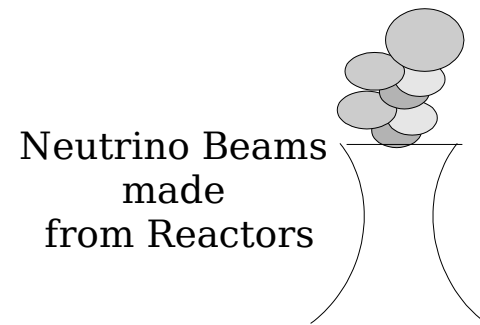
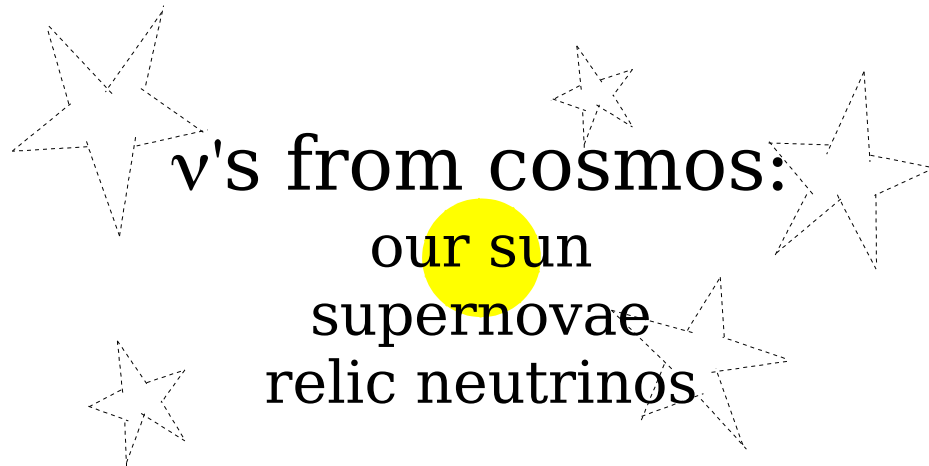
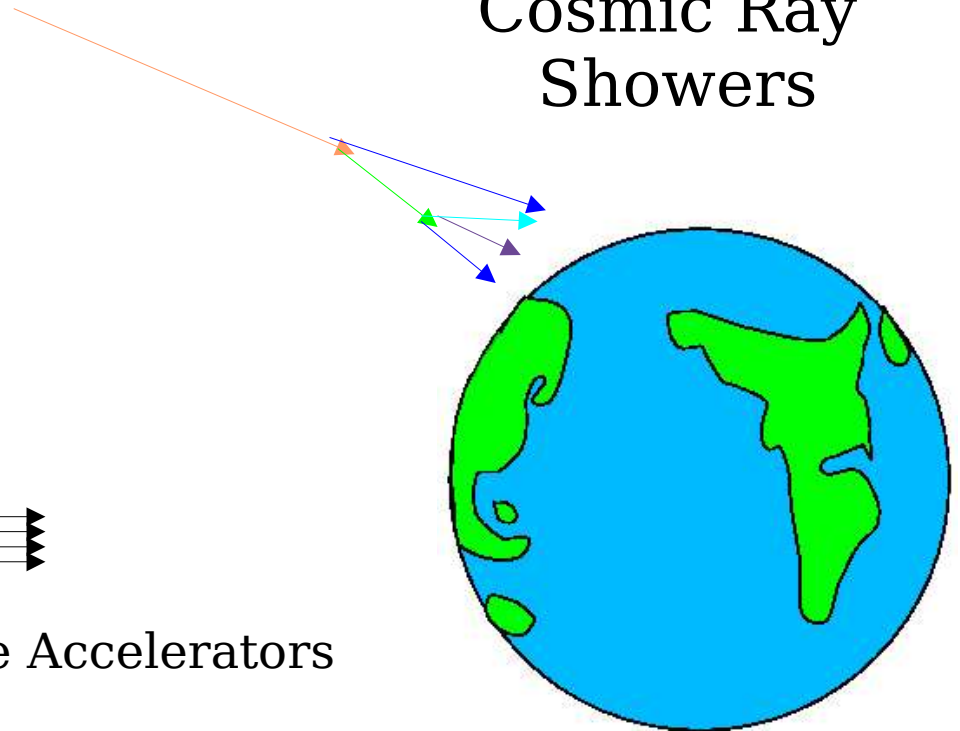
Fortunately, there are many sources of neutrinos from all over the universe!

Unfortunately, they are so small, they don't make up much of the universe



Neutrino Beams made from Particle Accelerators

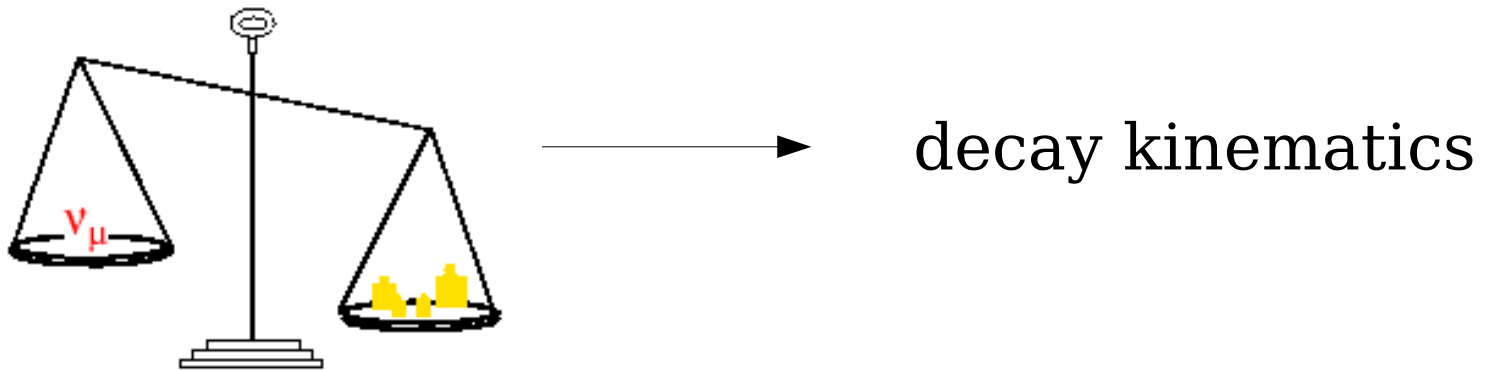
created in particle decay:  
Cosmic Ray Showers



## Neutrino Mass:

Mass is a fundamental property of particles

Took many years to demonstrate neutrinos have mass  
So small -> Can't measure mass in the usual way...



What other behavior is associated with  
mass?

A quantum mechanical effect called  
Neutrino Oscillations

$$\nu_\mu \longrightarrow \nu_e$$



# Neutrino Oscillations indication of mass:

If we postulate:

- Neutrinos have (different) masses
- The **Weak Eigenstate** is a mixture of **Mass Eigenstates**:

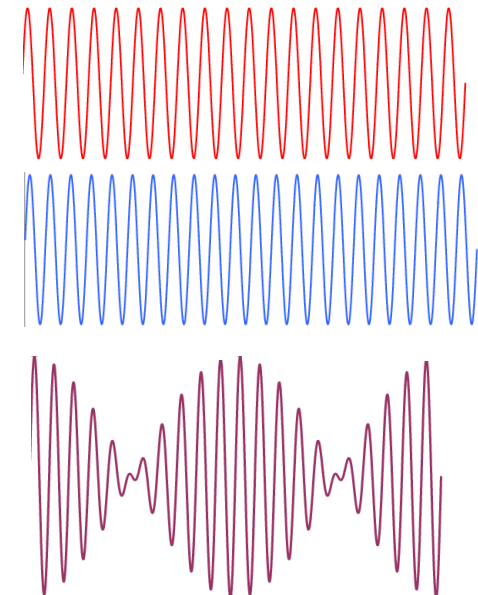
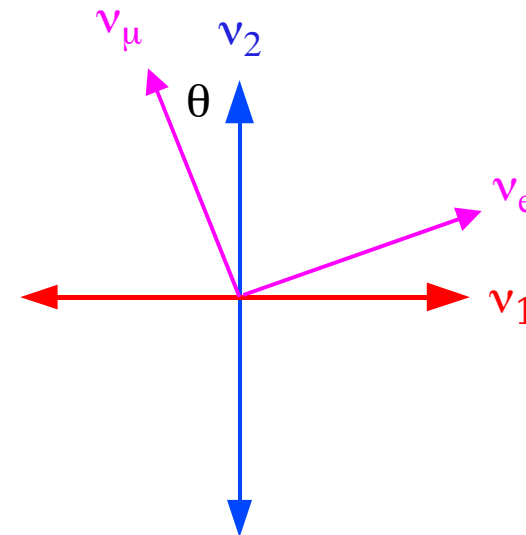
$$\begin{pmatrix} \nu_e \\ \nu_\mu \end{pmatrix} = \begin{pmatrix} \cos \theta & \sin \theta \\ -\sin \theta & \cos \theta \end{pmatrix} \begin{pmatrix} \nu_1 \\ \nu_2 \end{pmatrix}$$

Then a pure  $\nu_\mu$  beam at  $t = 0$ ,  
may evolve a  $\nu_e$  component with time!

*The Probability for Oscillations...*

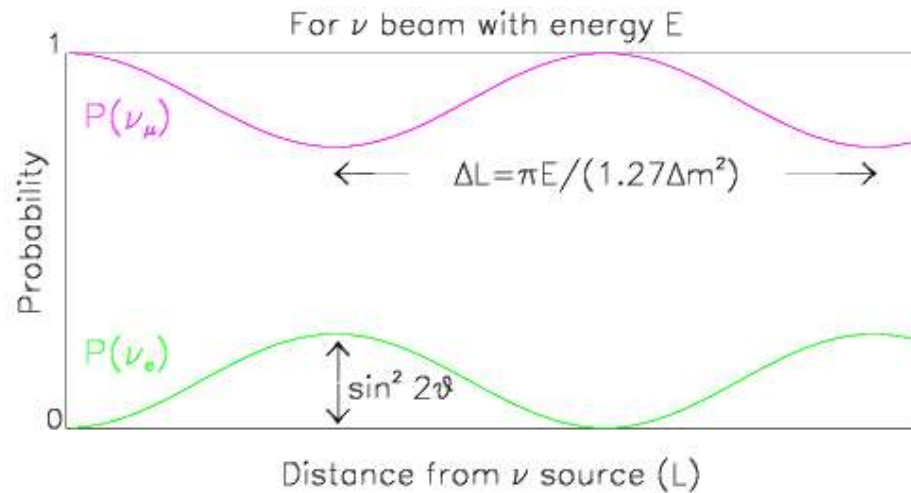
$$P_{osc} = \sin^2 2\theta \sin^2(1.27 \Delta m^2 L/E)$$

in 2 neutrino dimensions:



straightforward to extend to the 3 neutrino world...

$$P_{osc} = \sin^2 2\theta \sin^2(1.27\Delta m^2 L/E)$$

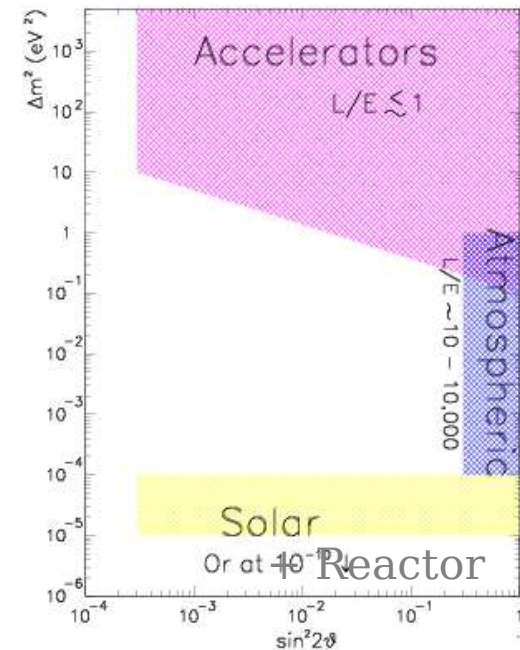


$\nu_\mu$  disappearance

$\nu_e$  appearance

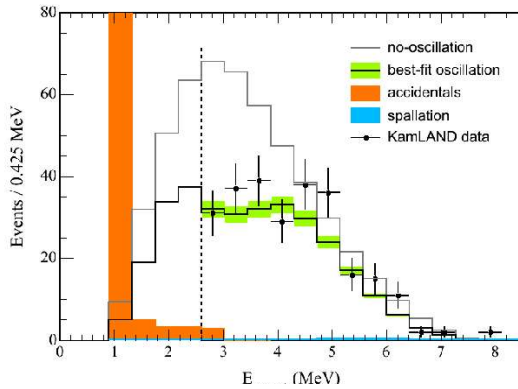
Oscillation Probability depends on:

- Two fundamental parameters
  - $\Delta m^2$
  - $\sin^2 2\theta$
- Two experimental parameters
  - L: distance from source to detector
  - E: Neutrino energy



Probe different oscillation parameters by changing L and E

# Oscillation Landscape

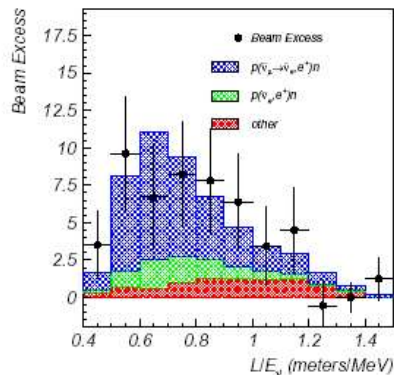
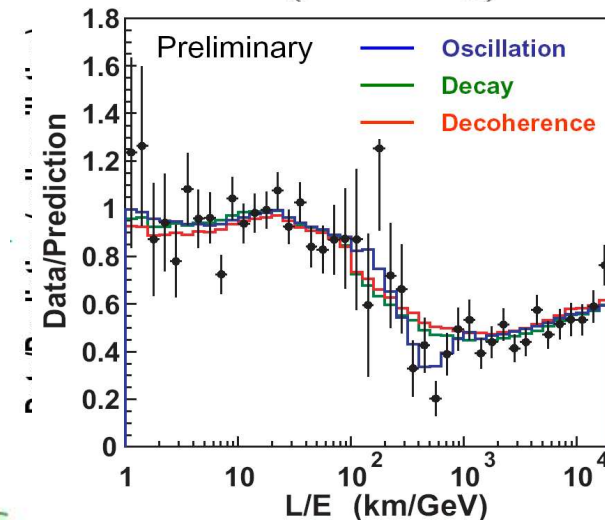


## Solar Neutrino Oscillations

- Deficit of  $\nu_e$  observed from Sun  
Cl (Homestake), H<sub>2</sub>O ((Super-)K), Ga (GALLEX, SAGE)
- Confirmation at SNO and KamLAND (reactor  $\bar{\nu}_e$ )

## Atmospheric Neutrino Oscillations

- Zenith angle-dependent deficit of  $\nu_\mu$ :  
Kamioka, Super-Kamiokande, Soudan, MACRO
- Confirmed by accelerator exp K2K; MINOS



## LSND Neutrino Oscillations

- Excess of  $\bar{\nu}_e$  in  $\bar{\nu}_\mu$  beam produced from  $\mu^+$  decay-at-rest
- Unconfirmed by other experiments, but not excluded

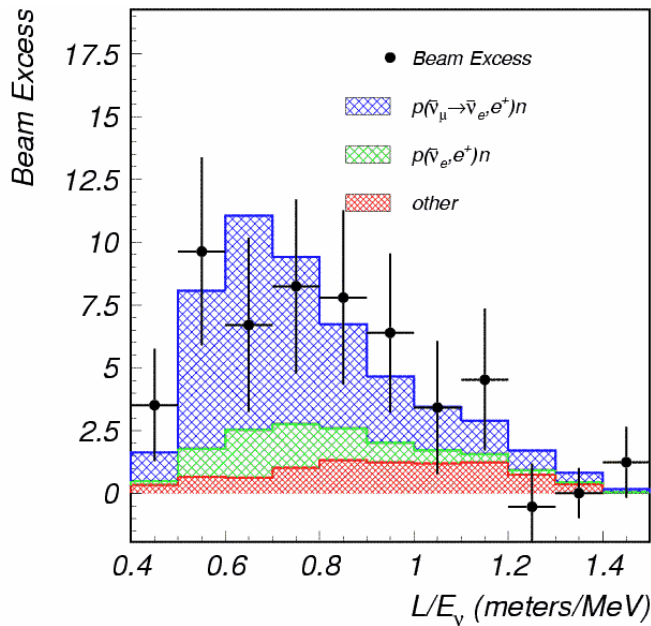
# LSND anomaly:

an excess of  $\bar{\nu}_e$  events in a  $\bar{\nu}_\mu$  beam,

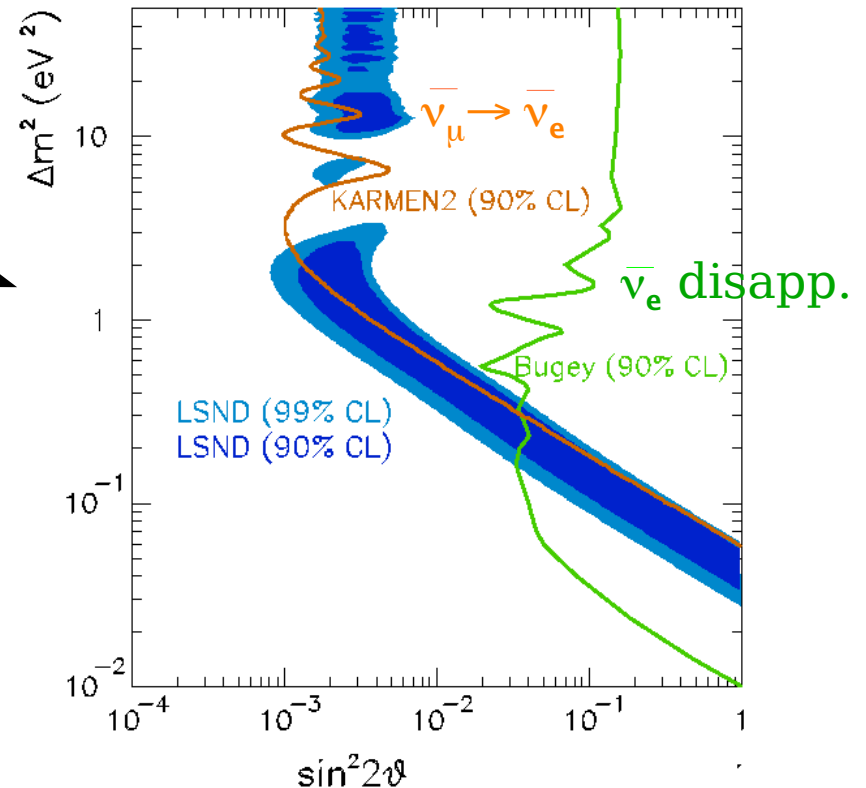
$$87.9 \pm 22.4 \pm 6.0 \quad (3.8\sigma)$$

which can be interpreted as  $\bar{\nu}_\mu \rightarrow \bar{\nu}_e$  oscillations:

LSND Collab, PRD 64, 112007

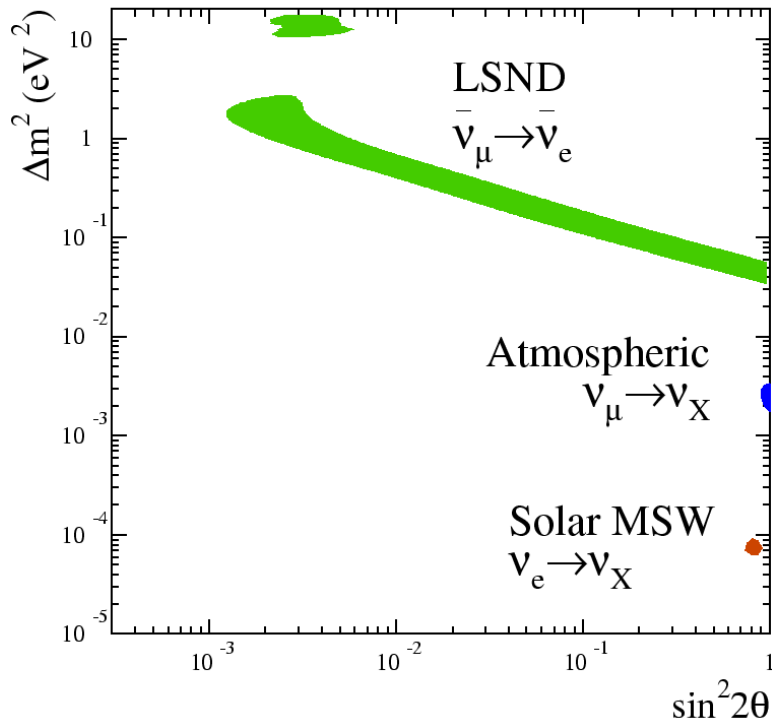


Points -- LSND data  
 Signal (blue)  
 Backgrounds (red, green)



In a simple 3 neutrino picture:

$$P_{osc} = \sin^2 2\theta \sin^2(1.27\Delta m^2 L/E)$$



There are too many signals!

increasing (mass)<sup>2</sup>

$\nu_1$              
 $\nu_2$   $\frac{\Delta m_{12}^2}{\Delta m_{23}^2}$      $\Delta m_{13}^2 = \Delta m_{12}^2 + \Delta m_{23}^2$   
 $\nu_3$            

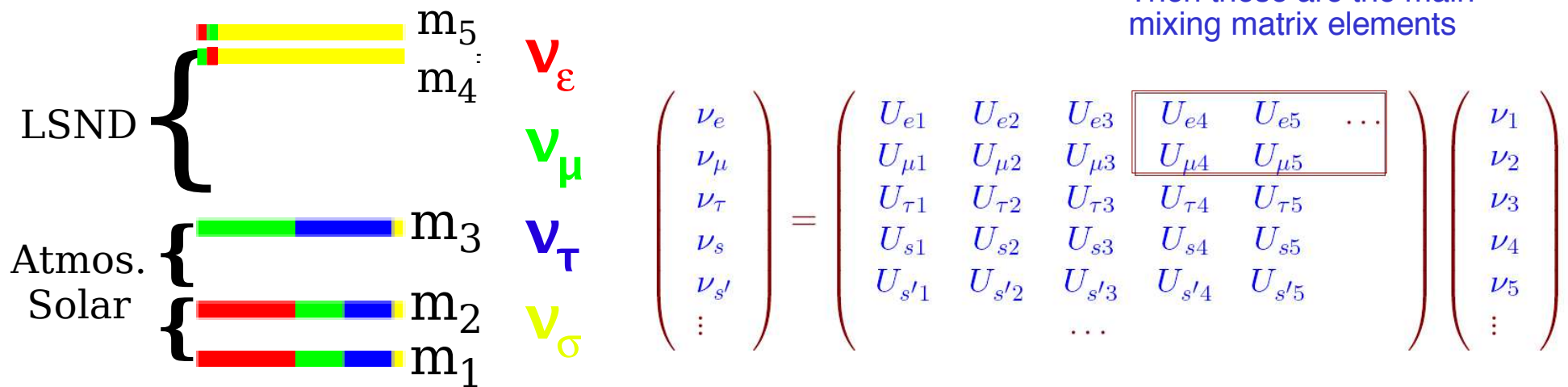
The three oscillation signals cannot be reconciled without introducing Beyond Standard Model Physics

1) LSND is wrong?

Too many signals...

2) There are sterile neutrinos  
 -possible....as crazy an idea as Pauli's *“desperate remedy”*

### 3+1 and 3+2 models



Then these are the main mixing matrix elements

4) Something else unexpected?

a) Background that has not been predicted

b) Other new physics: neutrinos in the bulk,  
 neutrino decay....

# MiniBooNE: address the LSND anomaly

——► look for  $\nu_e$  appearance in a  $\nu_\mu$  beam at Fermilab

## The MiniBooNE Collaboration

A. A. Aguilar-Arevalo, A. O. Bazarko, S. J. Brice, B. C. Brown,  
L. Bugel, J. Cao, L. Coney, J. M. Conrad, D. C. Cox, A. Curioni,  
Z. Djurcic, D. A. Finley, B. T. Fleming, R. Ford, F. G. Garcia,  
G. T. Garvey, J. A. Green, C. Green, T. L. Hart, E. Hawker,  
R. Imlay, R. A. Johnson, P. Kasper, T. Katori, T. Kobilarcik,  
I. Kourbanis, S. Koutsoliotas, J. M. Link, Y. Liu, Y. Liu,  
W. C. Louis, K. B. M. Mahn, W. Marsh, P. S. Martin, G. McGregor,  
W. Metcalf, P. D. Meyers, F. Mills, G. B. Mills, J. Monroe,  
C. D. Moore, R. H. Nelson, P. Nienaber, S. Ouedraogo,  
R. B. Patterson, D. Perevalov, C. C. Polly, E. Prebys, J. L. Raaf,  
H. Ray, B. P. Roe, A. D. Russell, V. Sandberg, R. Schirato,  
D. Schmitz, M. H. Shaevitz, F. C. Shoemaker, D. Smith, M. Sorel,  
P. Spentzouris, I. Stancu, R. J. Stefanski, M. Sung, H. A. Tanaka,  
R. Tayloe, M. Tzanov, M. O. Wascko, R. Van de Water, D. H. White,  
M. J. Wilking, H. J. Yang, G. P. Zeller, E. D. Zimmerman



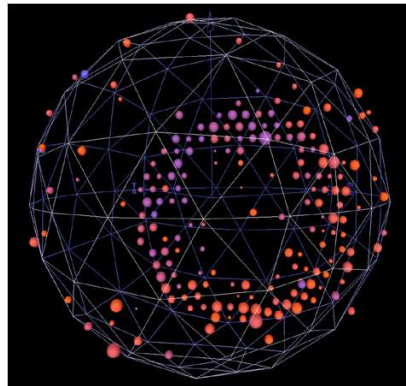
**University of Alabama**  
**Bucknell University**  
**University of Cincinnati**  
**University of Colorado**  
**Columbia University**  
**Embry Riddle University**  
**Fermi National Accelerator Laboratory**  
**Indiana University**

**Los Alamos National Laboratory**  
**Louisiana State University**  
**University of Michigan**  
**Princeton University**  
**Saint Mary's University of Minnesota**  
**Virginia Polytechnic Institute**  
**Western Illinois University**  
**Yale University**

# The New York Times

April 12, 2007

## How Did the Universe Survive the Big Bang? In This Experiment, Clues Remain Elusive



MiniBooNE's first results!

Pauli Predicts the Neutrino

Fermi's theory of weak interactions

Reines & Cowan discover (anti)neutrinos

2 distinct flavors identified  
Davis discovers the solar deficit

Kamioka II confirms solar deficit

LEP shows 3 active flavors

SAGE and Gallex see the solar deficit

Kamioka II and IMB see atmospheric neutrino anomaly

Kamioka II and IMB see supernova neutrinos

Nobel prize for discovery of distinct flavors!

LSND sees possible indication of oscillation signal

Nobel Prize for  $\bar{\nu}$  discovery!

Super K sees evidence of atmospheric neutrino oscillations

Super K confirms solar deficit and "images" sun

SNO shows solar oscillation to active flavor

Nobel Prize for neutrino astroparticle physics!

KamLAND confirms solar oscillations

K2K confirms atmospheric oscillations

1930

1955

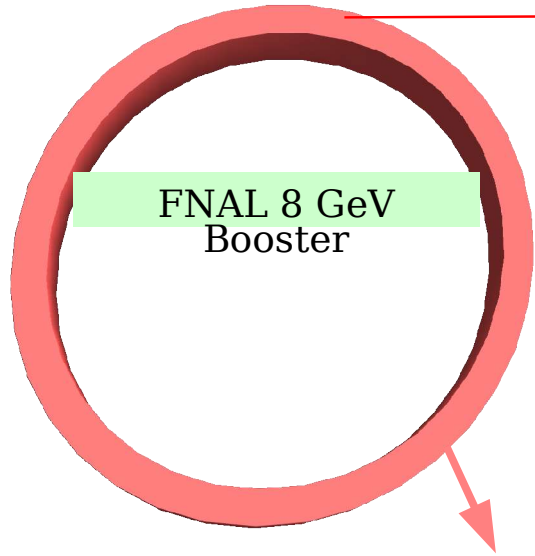
1980

2005

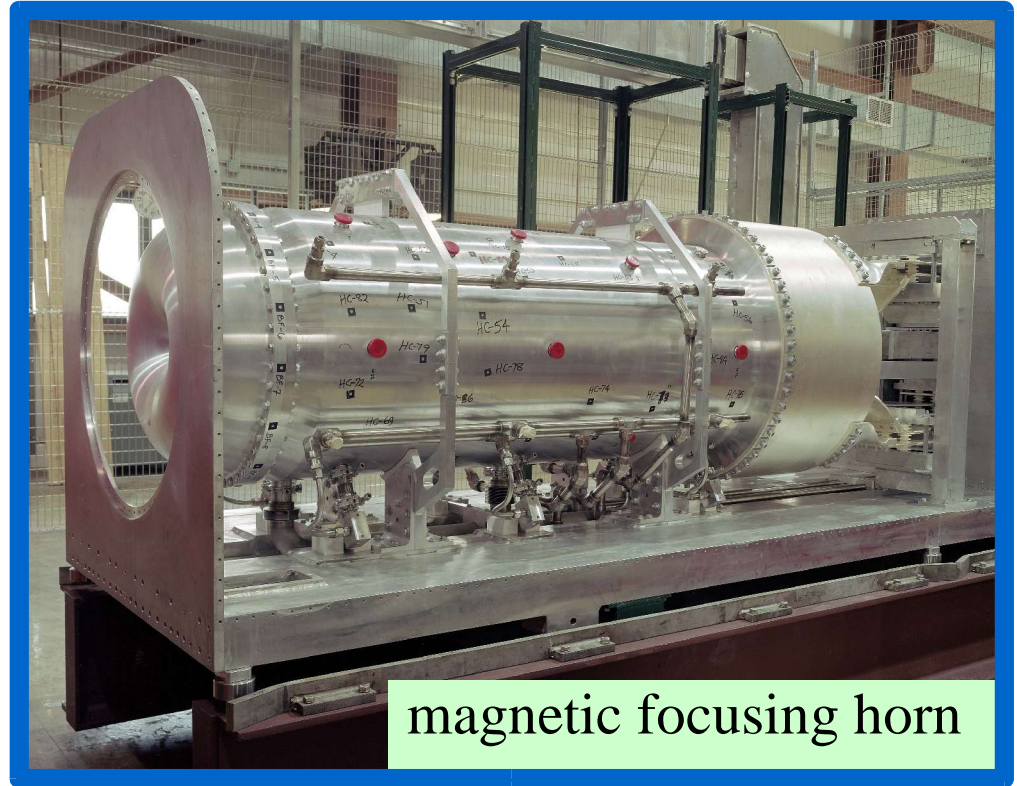
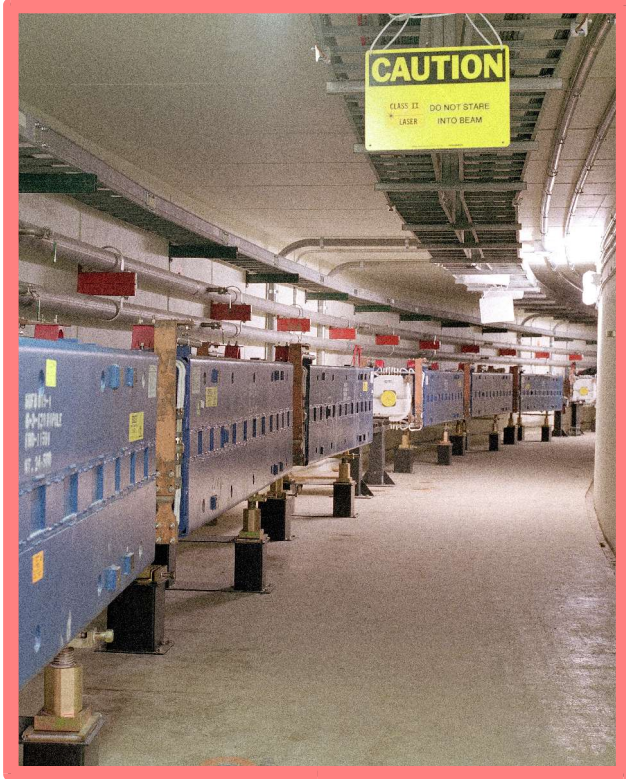
2007

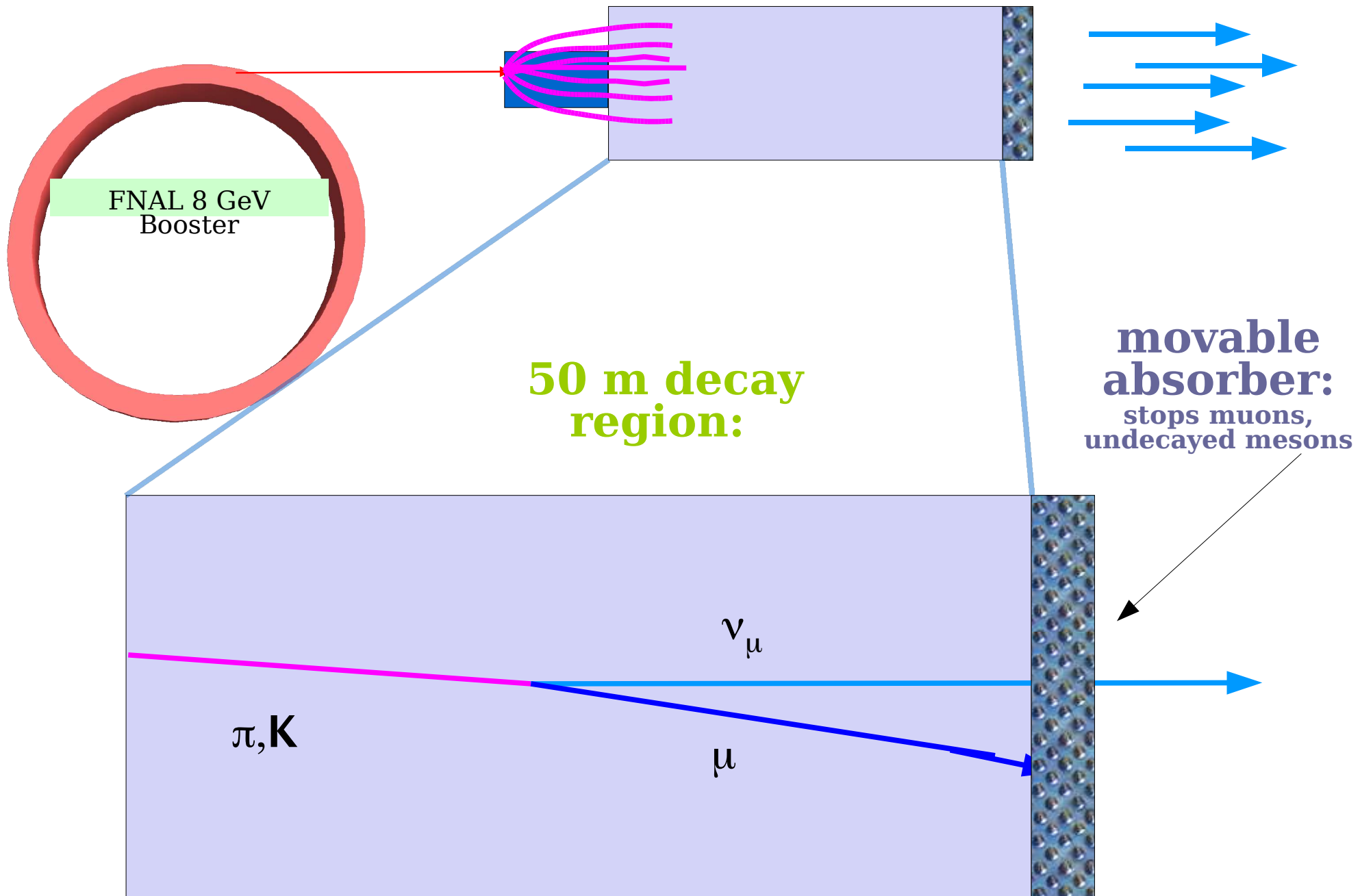


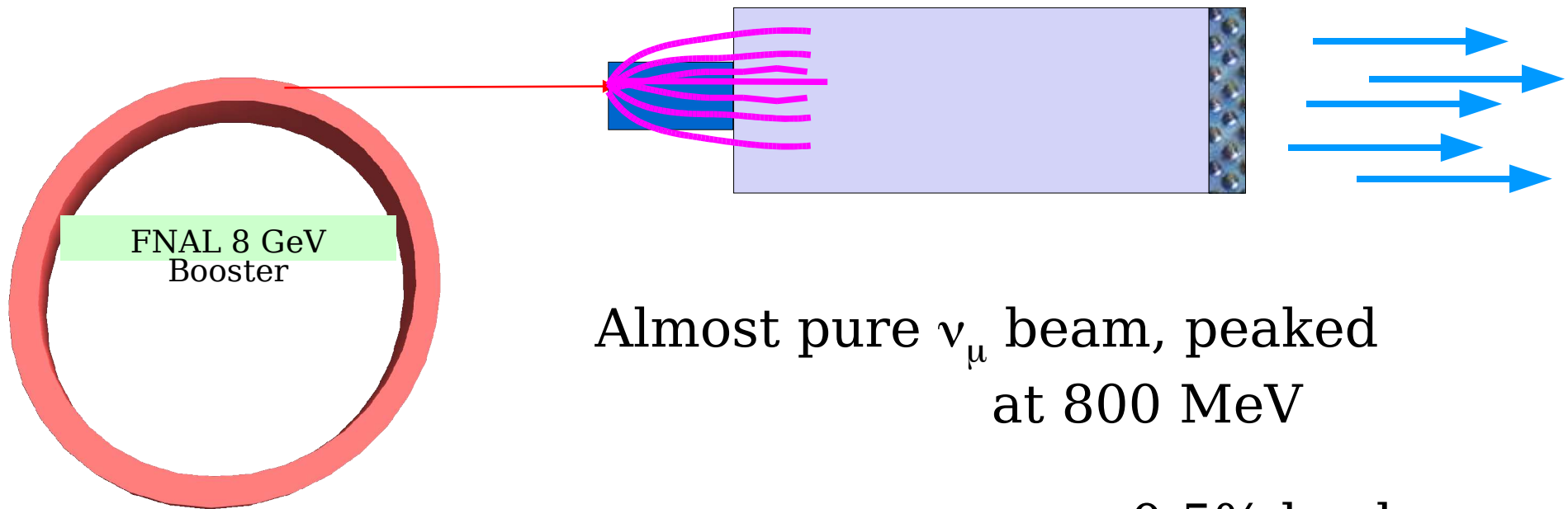
- 
- The Experimental Setup
  - Two Independent Data Analyses
  - Errors and Constraints
  - First Results



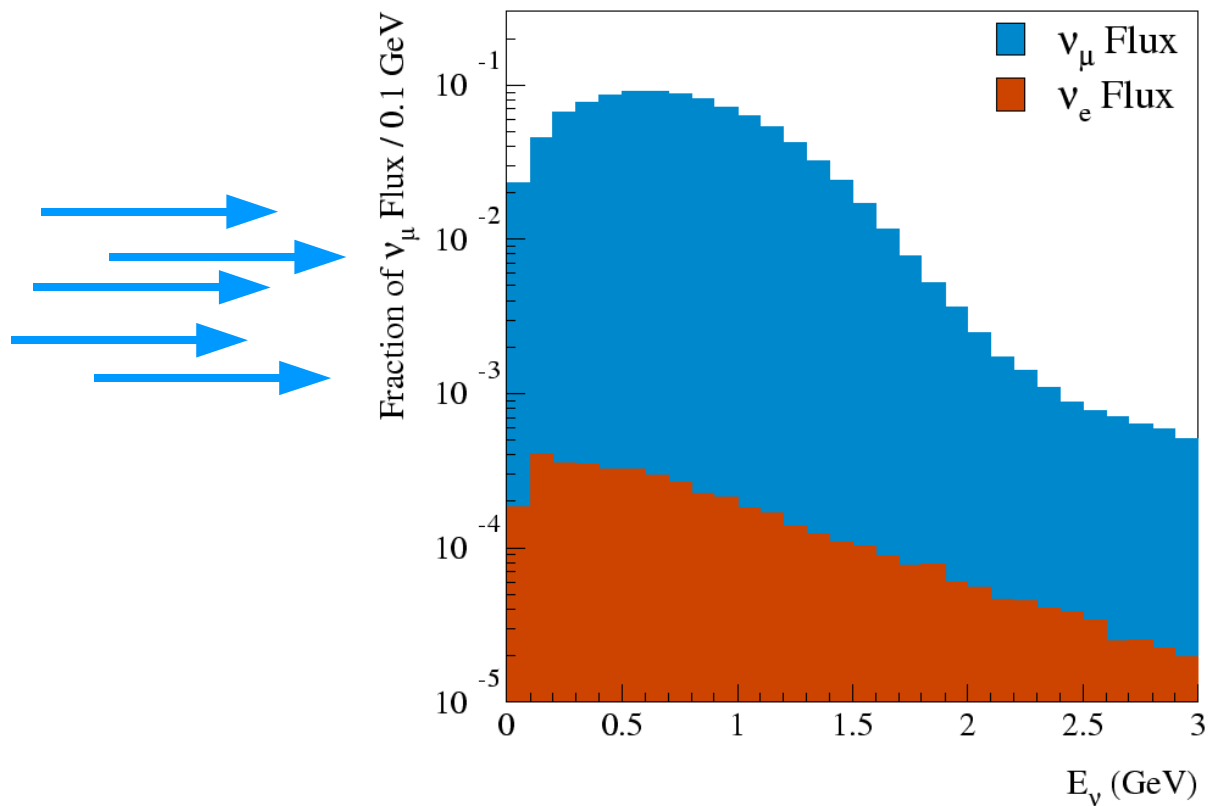
8 GeV protons on Beryllium Target  
in a magnetically focusing horn



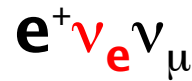
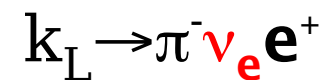
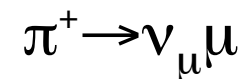


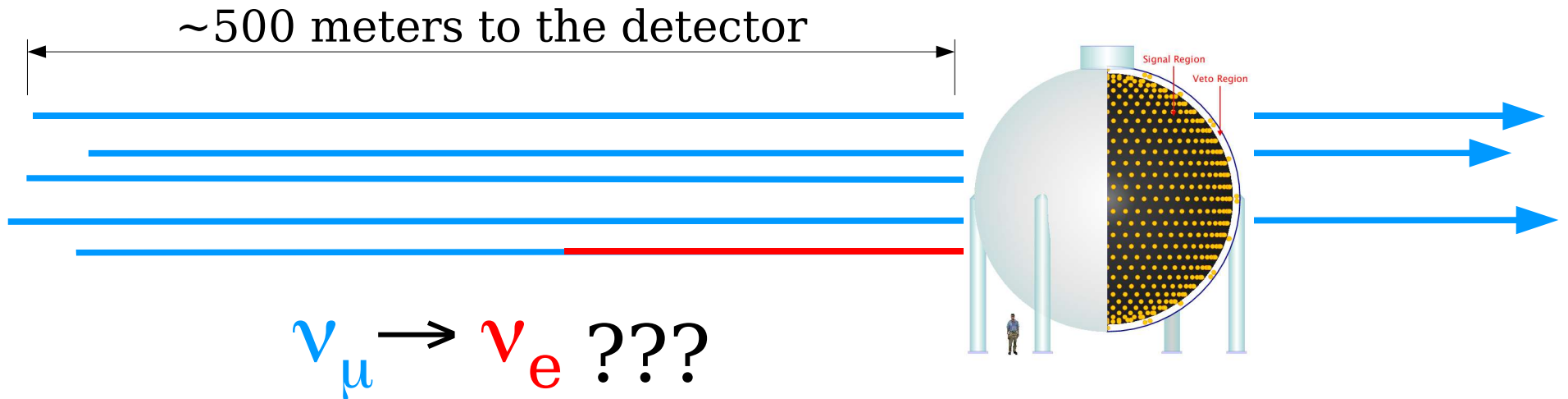


~0.5% background  
“intrinsic”  $\nu_e$ s

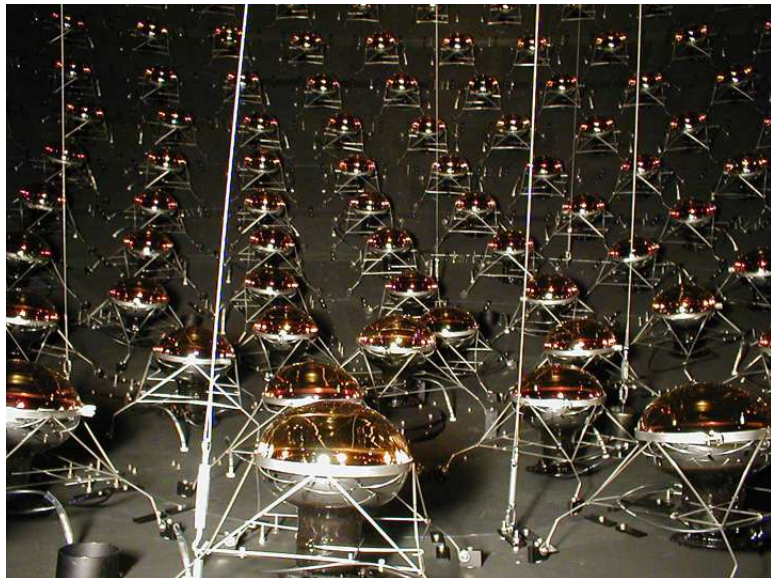


$\nu_e$  intrinsics:





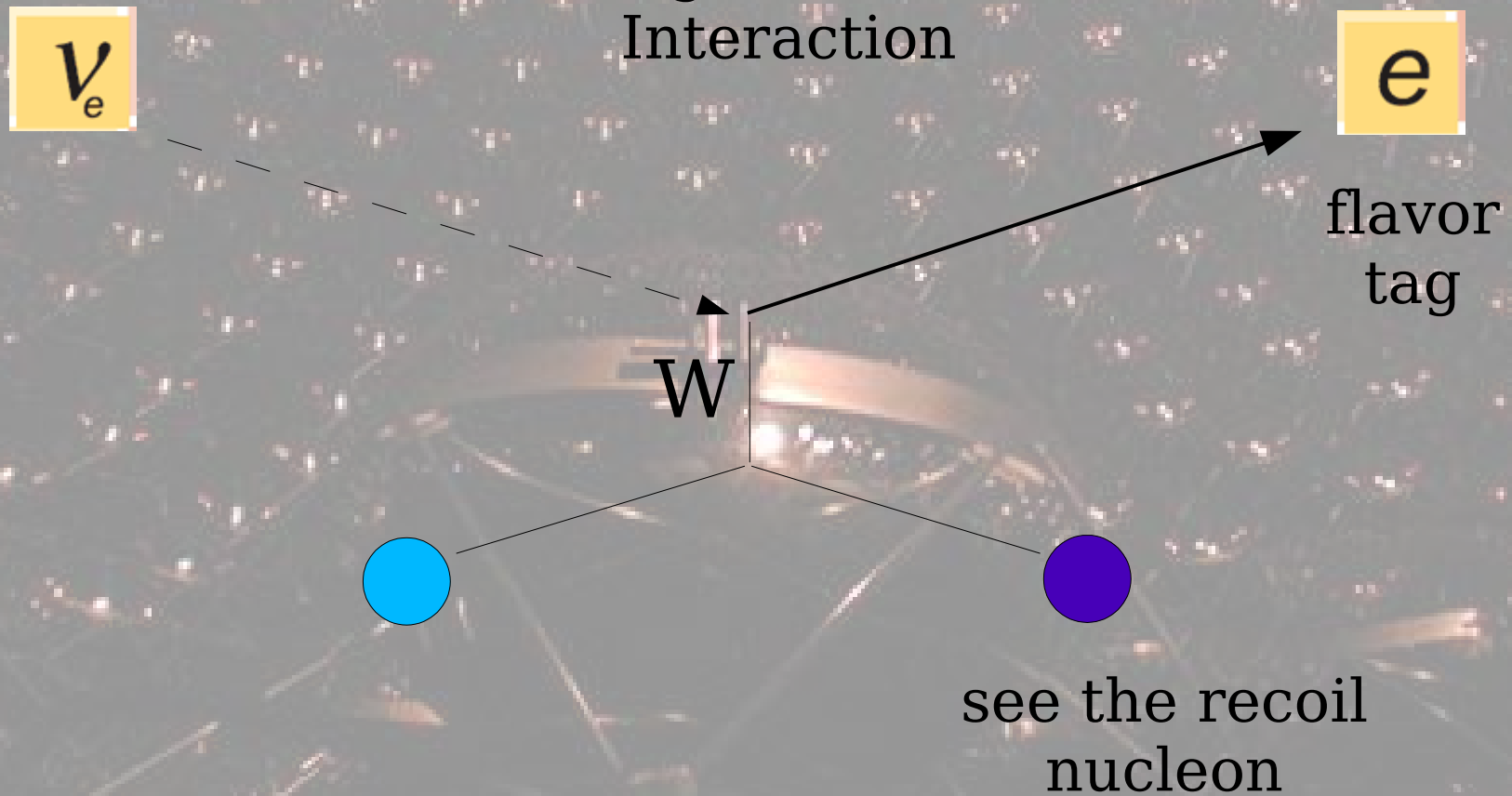
MiniBooNE  
Detector



- 12m in diameter sphere
- 800 tons of  
ultra pure mineral oil
- sphere-within-a-sphere
- light tight signal region  
1280 PMTs
- veto region  
240 PMTs

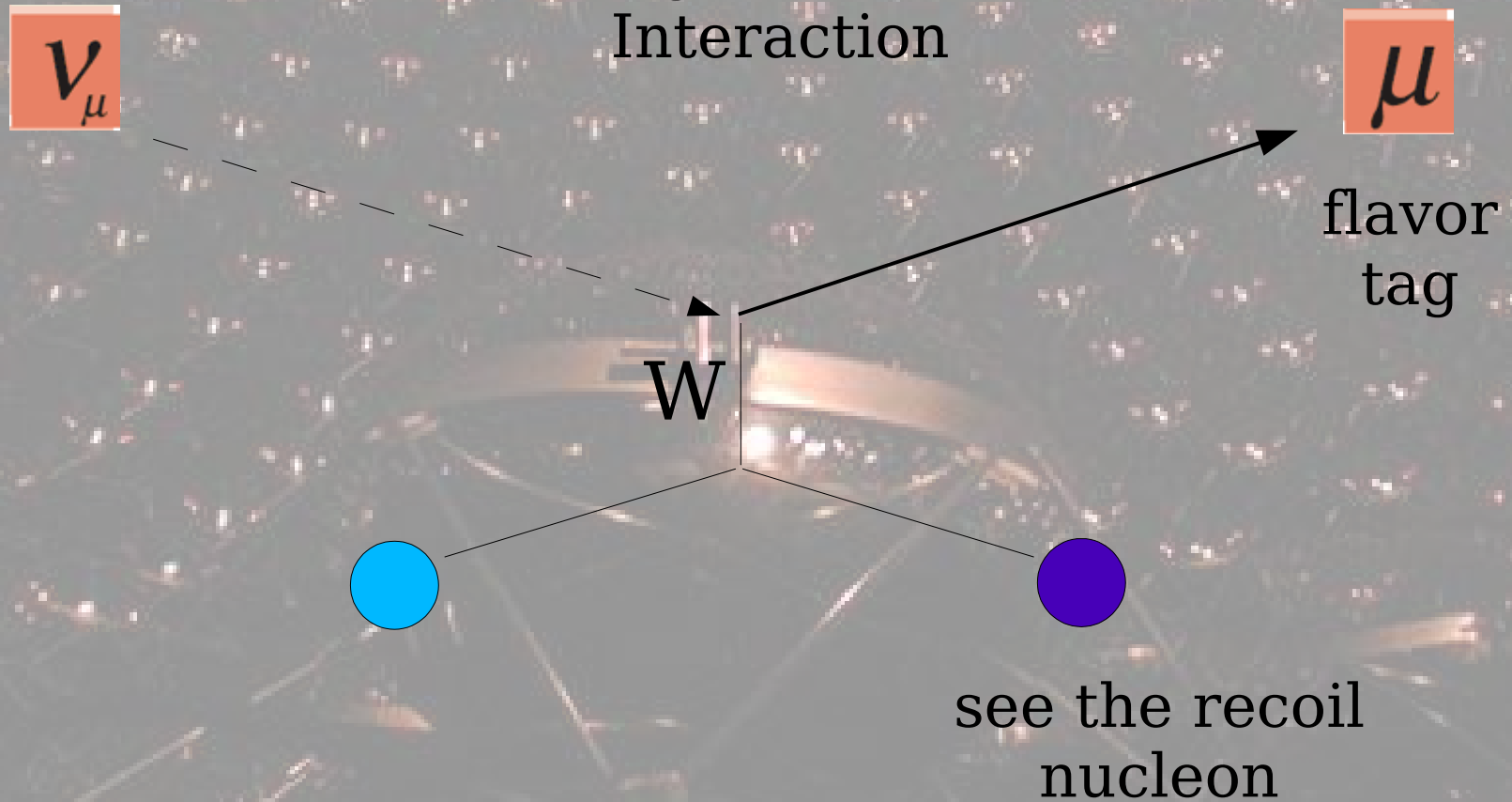
See them interact by seeing remnants  
of the interaction....

Quasi-Elastic Scattering:  
Charged Current  
Interaction



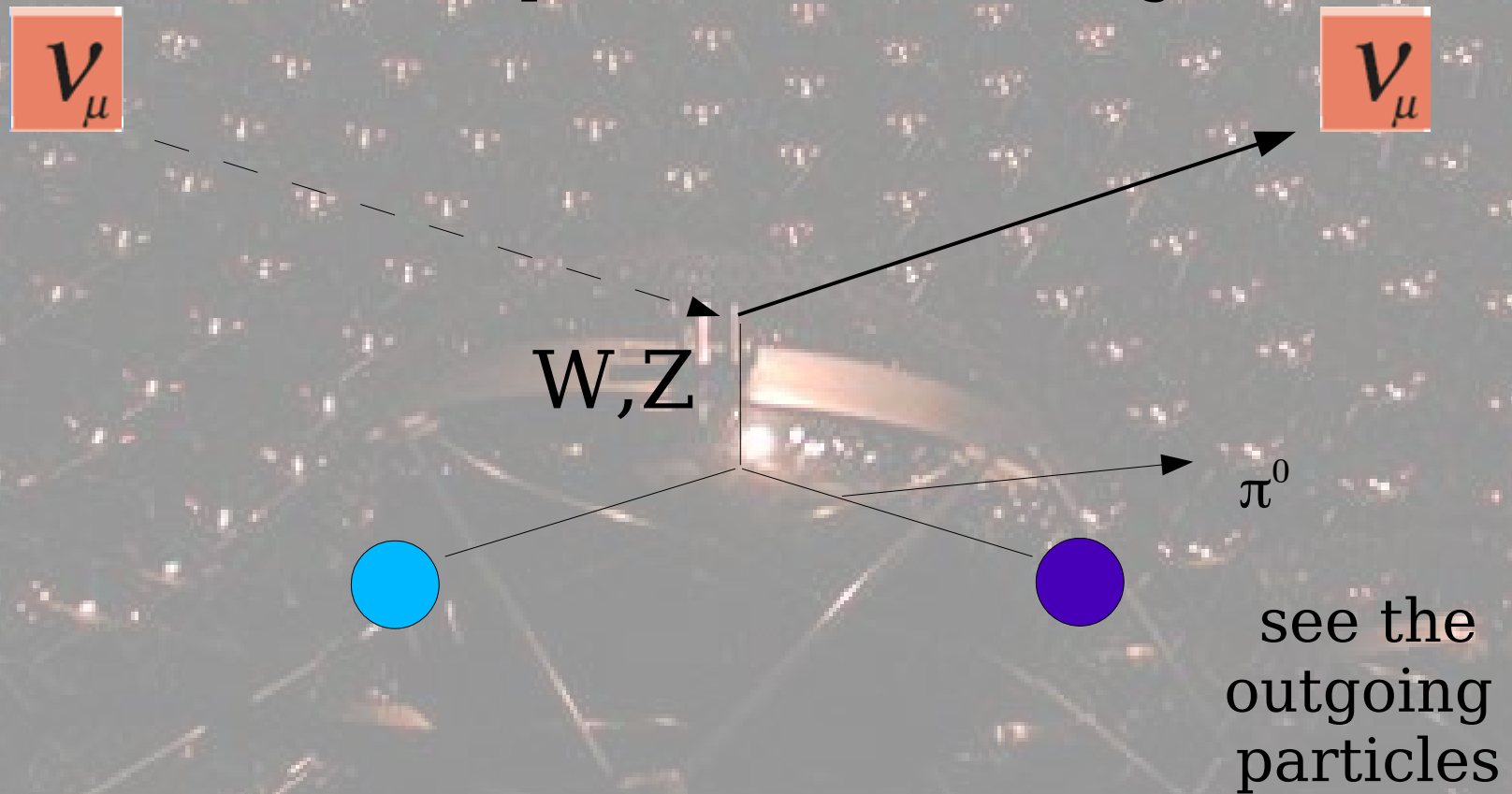
See them interact by seeing remnants  
of the interaction....

Quasi-Elastic Scattering:  
Charged Current  
Interaction



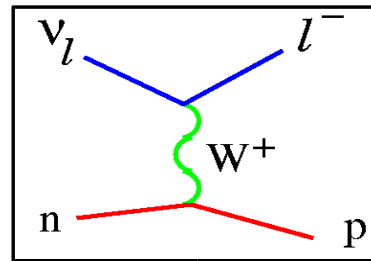
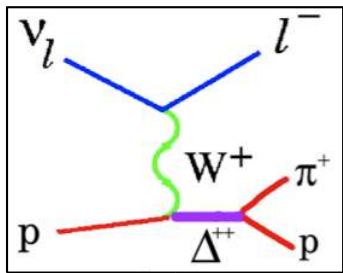
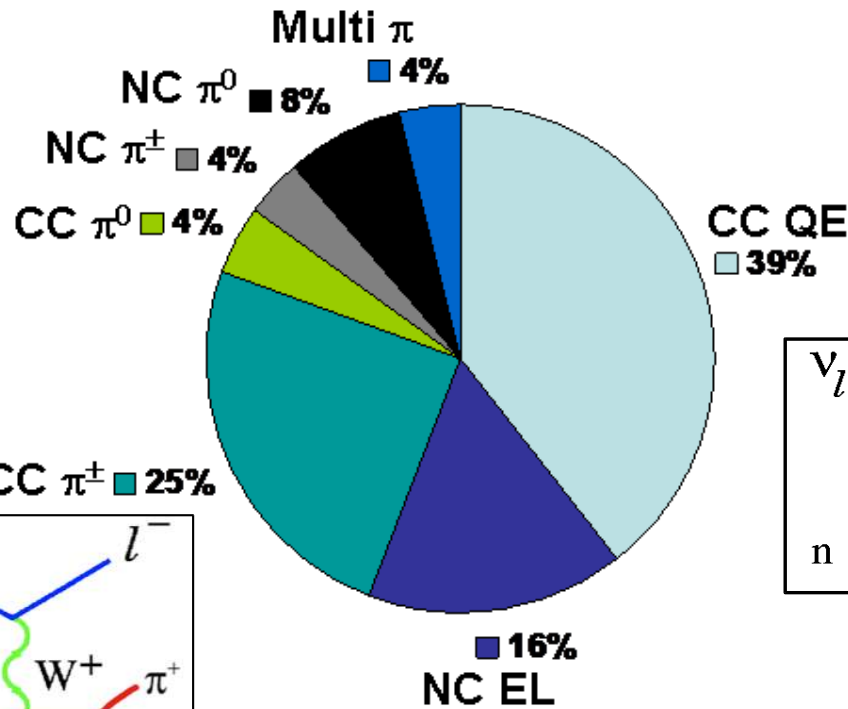
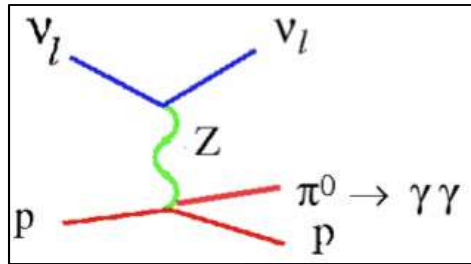
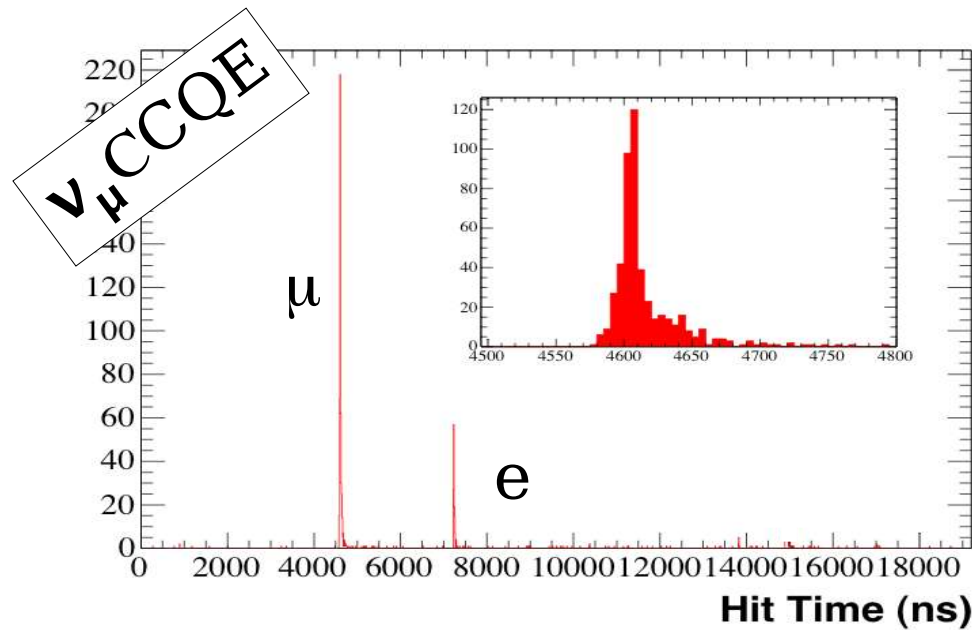
See them interact by seeing remnants  
of the interaction....

### Single Pion Production to Deep Inelastic Scattering





# Neutrino interactions in MiniBooNE...



Event signature: First cluster of hits (first subevent) is the muon. Followed by smaller cluster of hits: decay electron

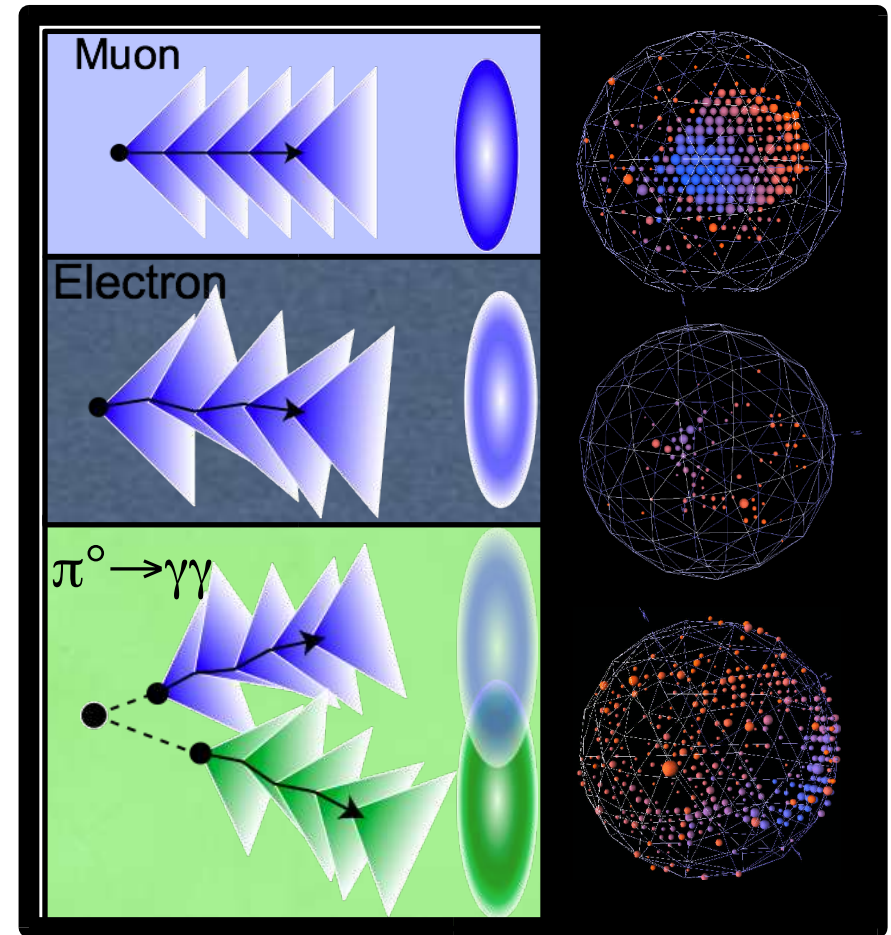
signal channel

Predicted event rates before cuts (NUANCE Monte Carlo)

Muons:  
Produced in most CC events.

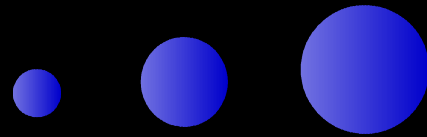
Electrons:  
Tag for  $\nu_{\mu} \rightarrow \nu_e$  CCQE signal.

$\pi^0$ s:  
Can form a background if one  
photon is weak or exits tank.

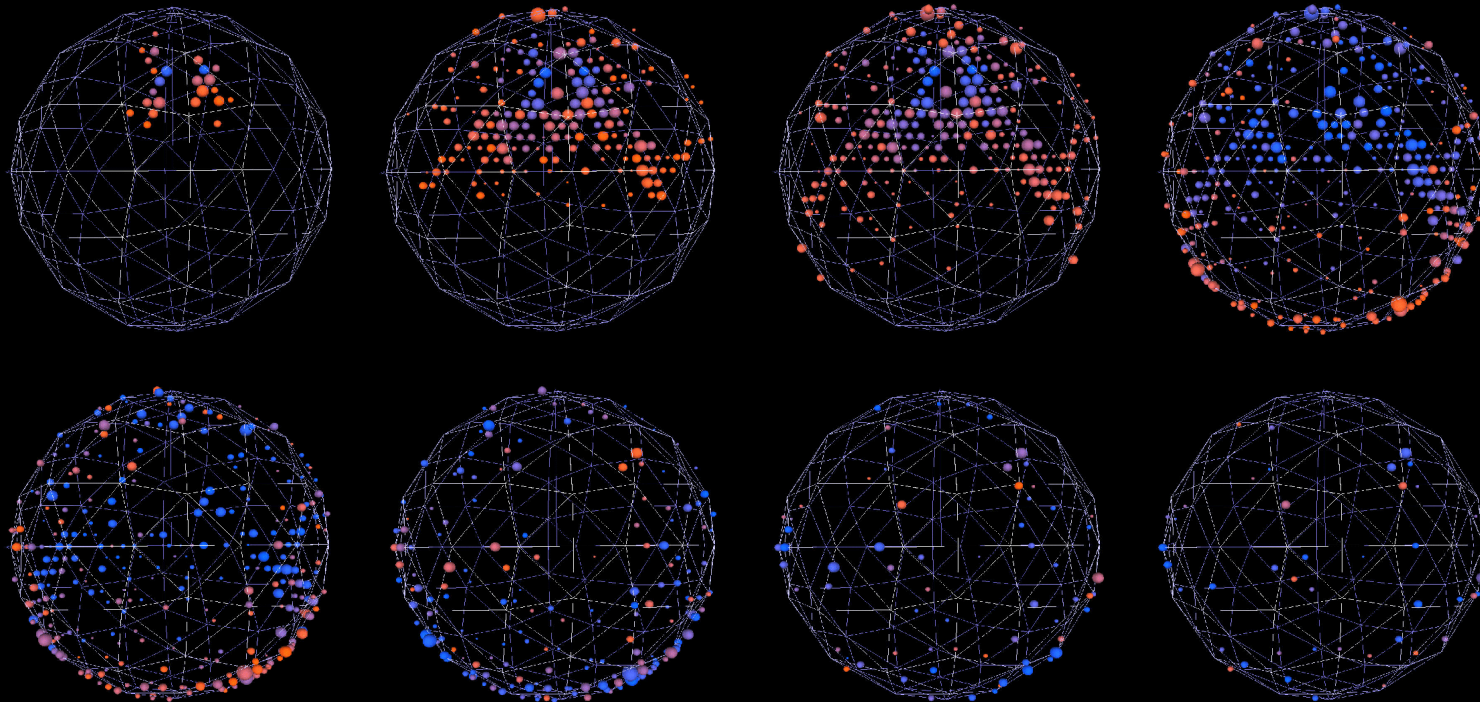


# Example of Cerenkov Rings: A stopping cosmic ray

Charge (Size)



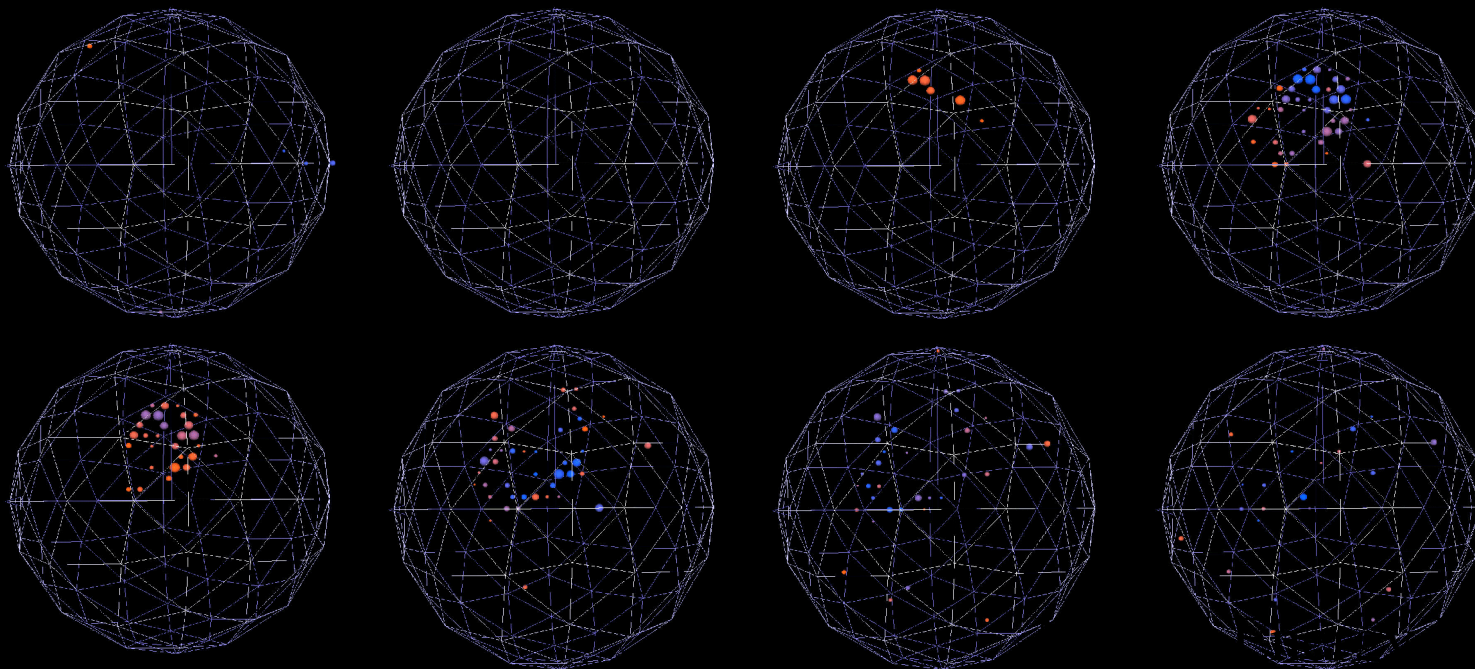
Time (Color)



First the muon enters the tank and stops...

Later a the Michel electron is observed

---



Michel electrons provide muon tags and calibration

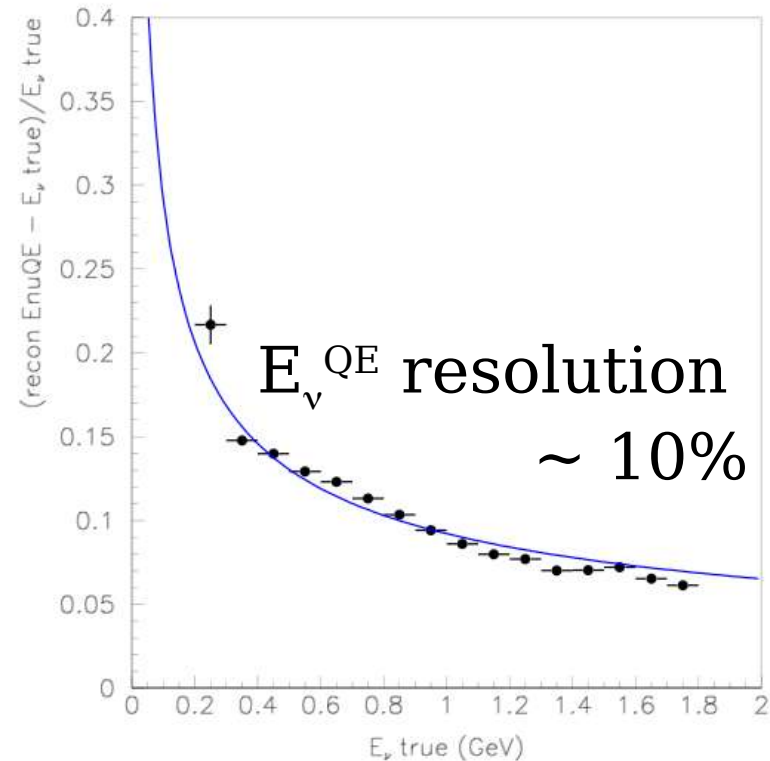
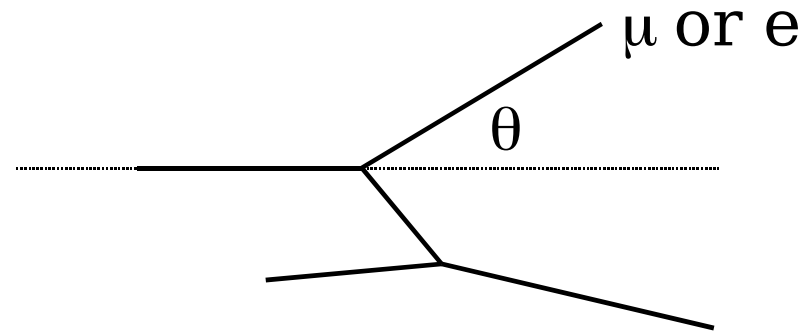
# CCQE (Charged Current Quasi-Elastic)

39% of total

- Events are “clean” (few particles)
- Energy of the neutrino can be reconstructed

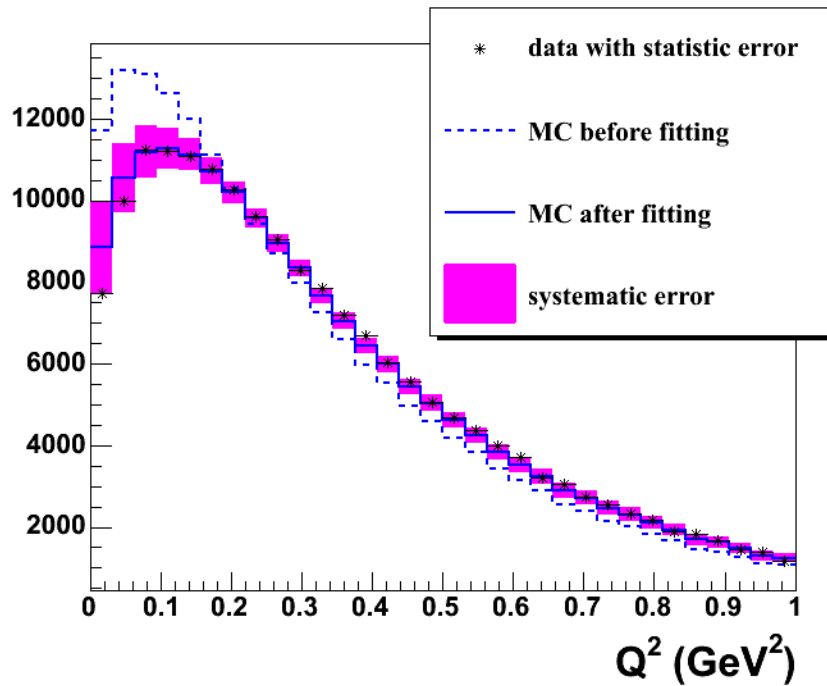
$$E_{\nu}^{QE} = \frac{1}{2} \frac{2M_p E_l - m_l^2}{M_p - E_l + \sqrt{(E_l^2 - m_l^2) \cos^2 \theta_l}}$$

Reconstructed from:  
Scattering angle  
Visible energy ( $E_{\text{visible}}$ )



An oscillation signal is  
an excess of  $\nu_e$  events as a function of  $E_{\nu}^{QE}$

# NUANCE Parameters:



Model describes CCQE  $\nu_\mu$  data well

From  $Q^2$  fits to MB  $\nu_\mu$  CCQE data:

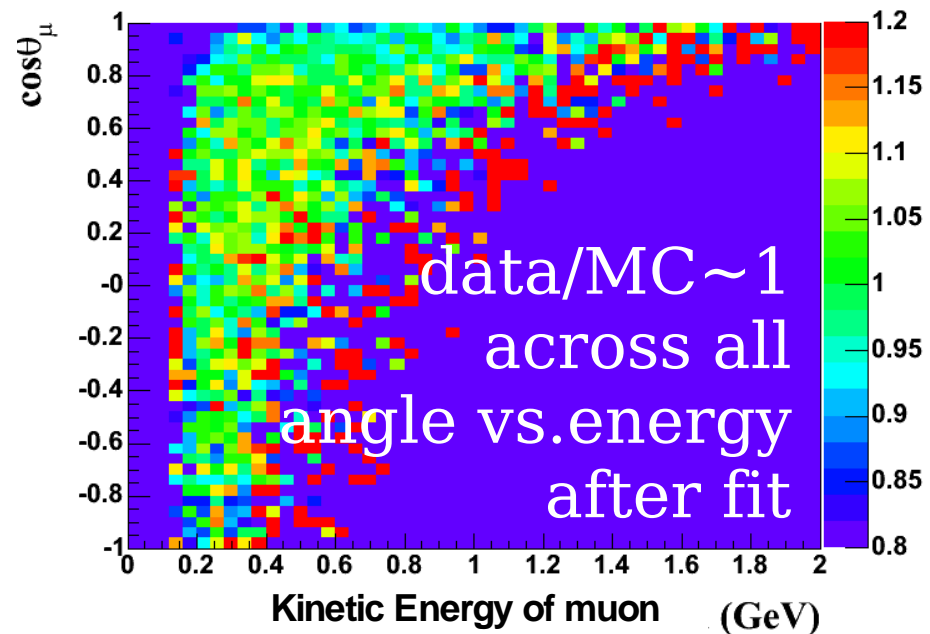
$M_A^{\text{eff}}$  -- effective axial mass

$E_{10}^{\text{SF}}$  -- Pauli Blocking parameter

From electron scattering data:

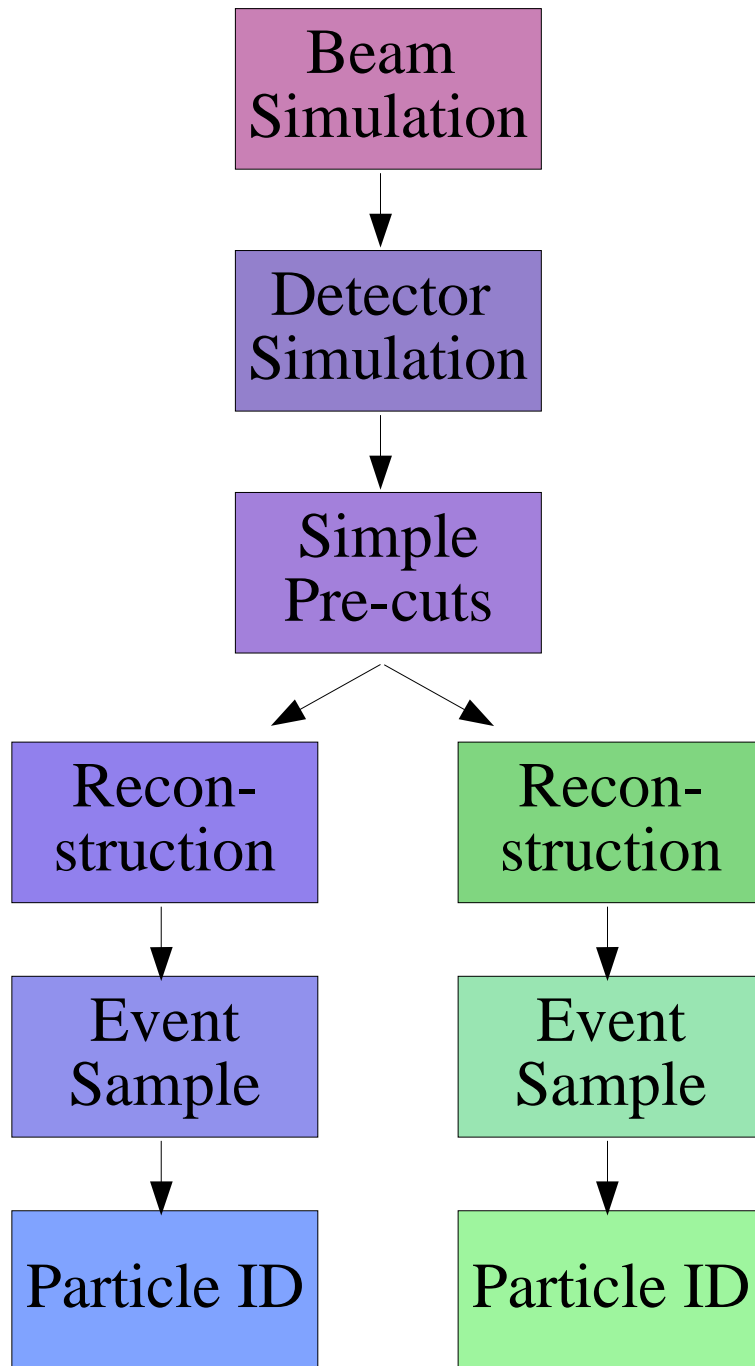
$E_b$  -- binding energy

$p_f$  -- Fermi momentum



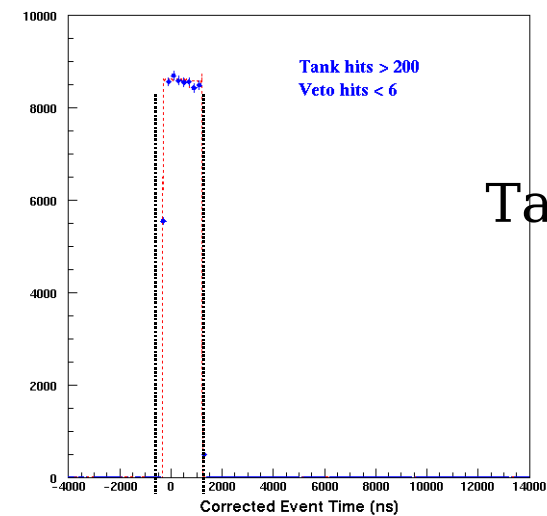
- The Experimental Setup
- Two Independent Data Analyses
  - Track Based Analysis ←
  - Boosted Decision Trees
- Errors and Constraints
- First Results





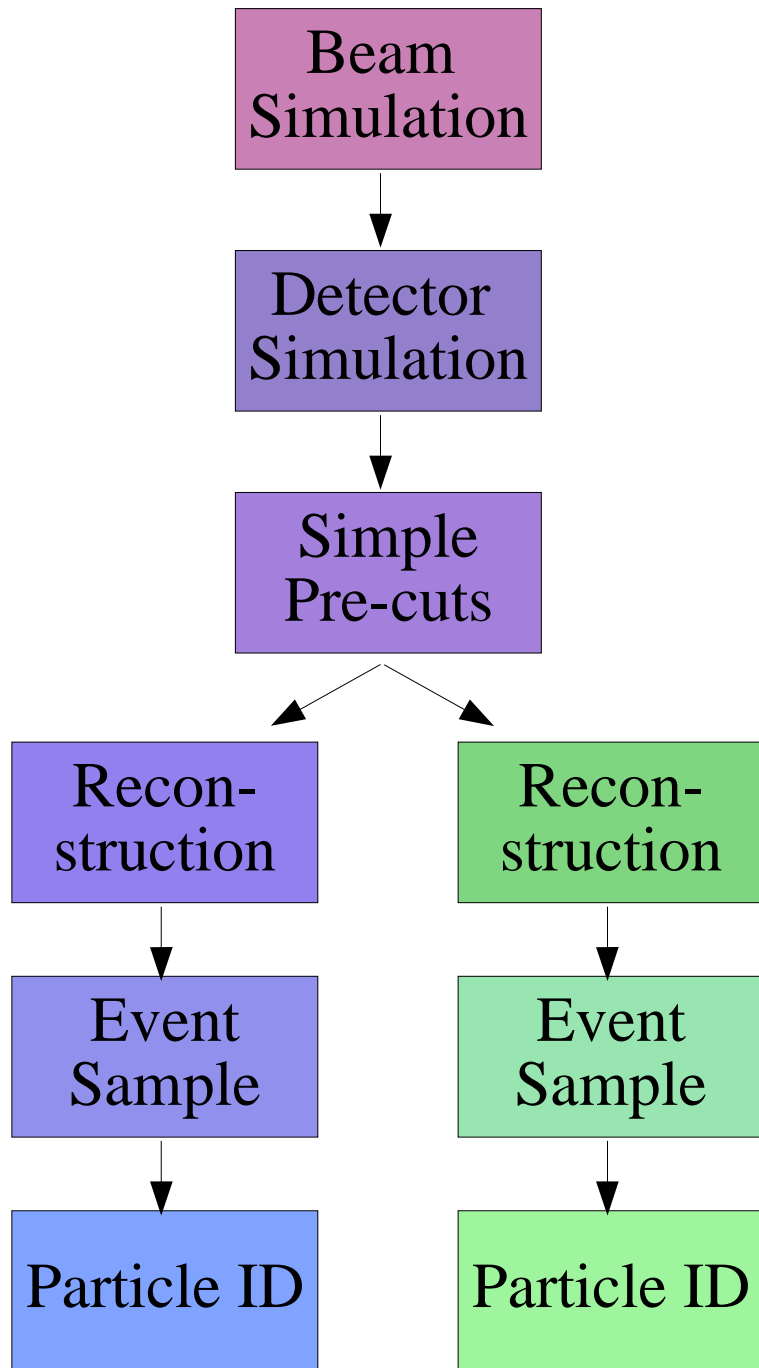
## Share

- GEANT 4 beam Monte Carlo
- NUANCE v3 event generator
- GEANT3 detector Monte Carlo
- Simple pre-cuts



removes low energy Michel electrons  
(+ 1 subevent and  $R < 500$  cm)





Both were blind analyses:

data  
↓

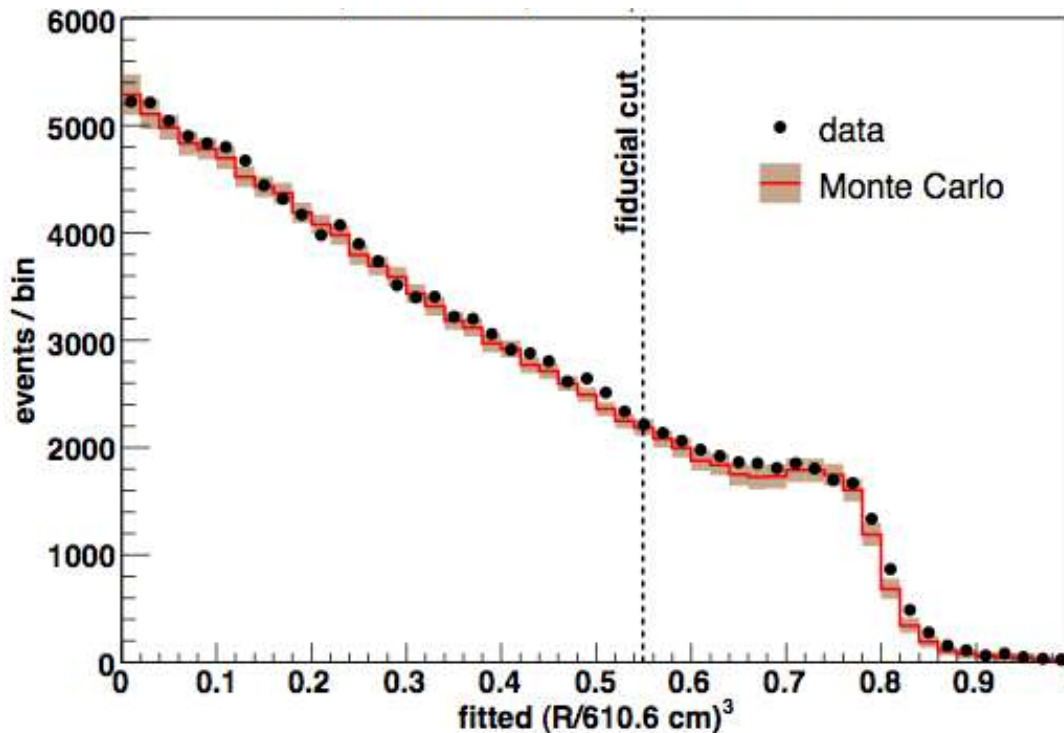
Filter: electron-like events  
were hidden from analysis

non-electron like (~99% of  
events) available for analysis

As well, for all events, low  
level information was  
available

Each event is characterized by 7 reconstructed variables:  
vertex (x,y,z), time, energy, and  
direction  $(\theta, \varphi) \rightarrow (U_x, U_y, U_z)$ .

Resolutions:      vertex: 22 cm  
                          direction:  $2.8^\circ$   
                          energy: 11%



$\nu_\mu$  CCQE events

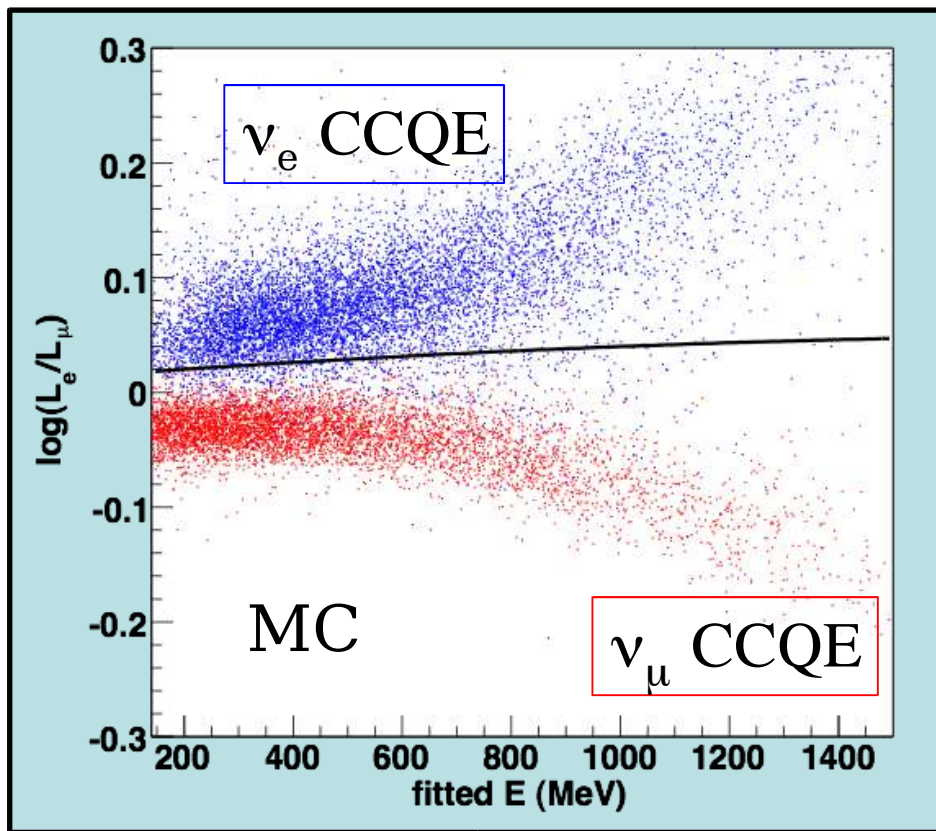
2 subevents

Veto Hits < 6

Tank Hits > 200

Each event is reconstructed under several different reconstruction hypotheses  
electron like ( $L_e$ ), Muon-like ( $L_\mu$ ),  $\pi^0$  like, ( $L_{\pi^0}$ )

$\log(L_e/L_\mu) > 0$  favors electron-like hypothesis



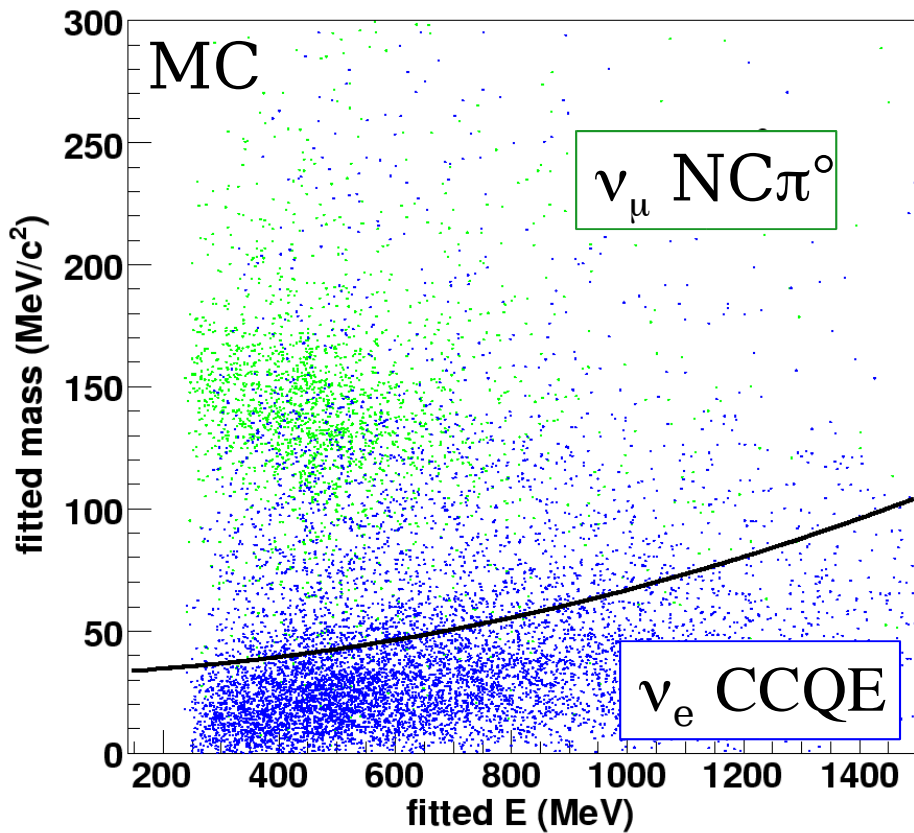
Separation is clean at high energies where muon-like events are long.

Analysis cut was chosen to maximize the  $\nu_\mu \rightarrow \nu_e$  sensitivity

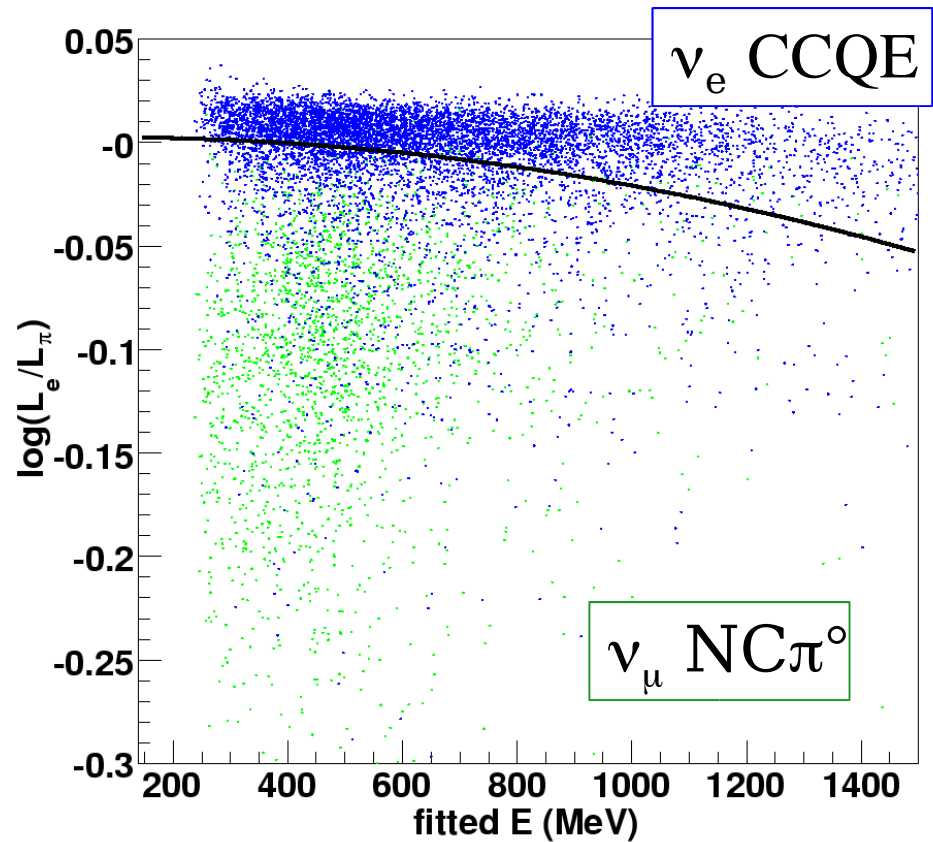
Photon conversions are electron-like. These are not cut here

# Rejecting “ $\pi^0$ -like” events

Using a mass cut



Using  $\log(L_e/L_{\pi^0})$



Cuts were chosen to maximize  $\nu_\mu \rightarrow \nu_e$  sensitivity

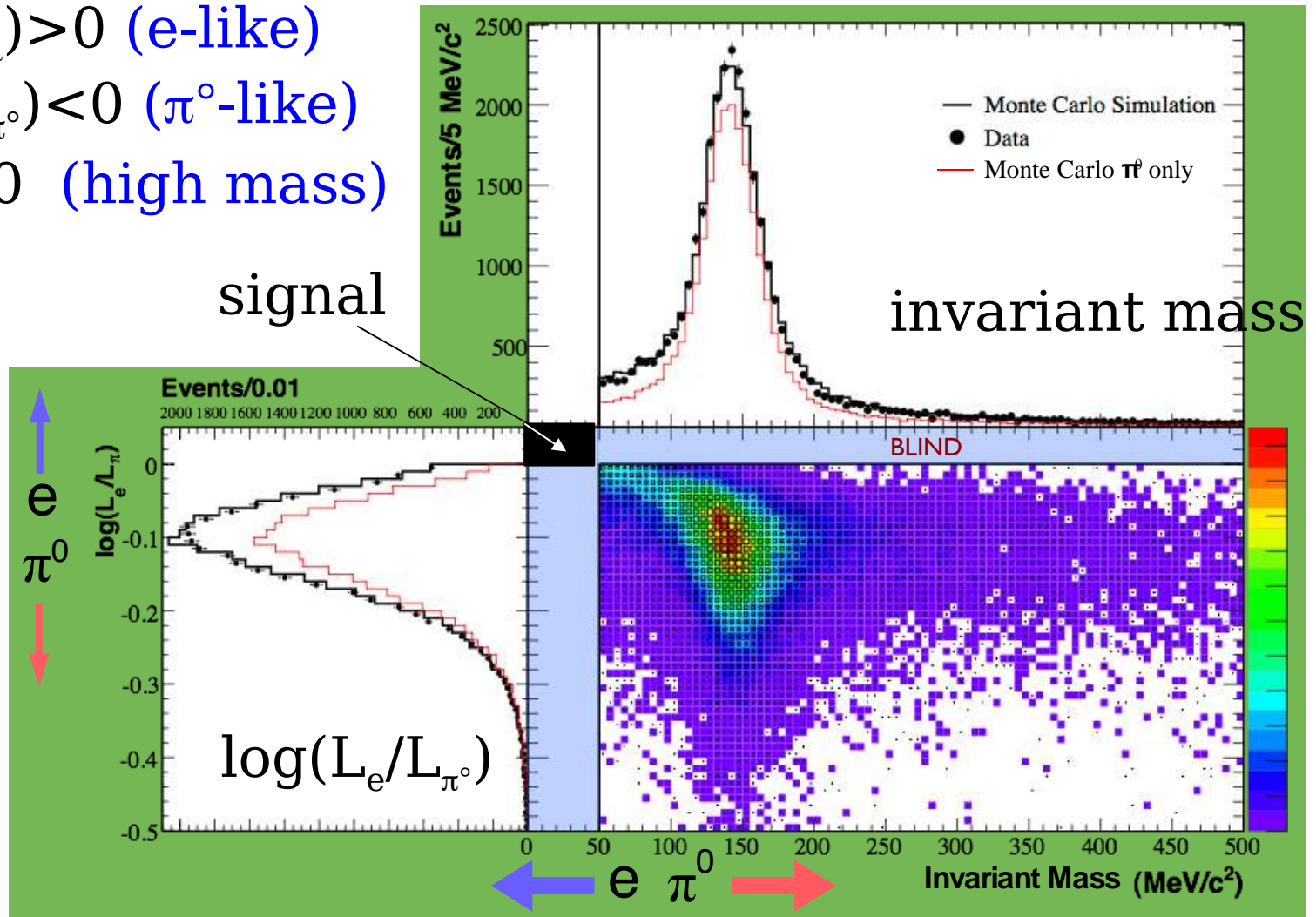
# Testing $e\pi^0$ separation using data

1 subevent

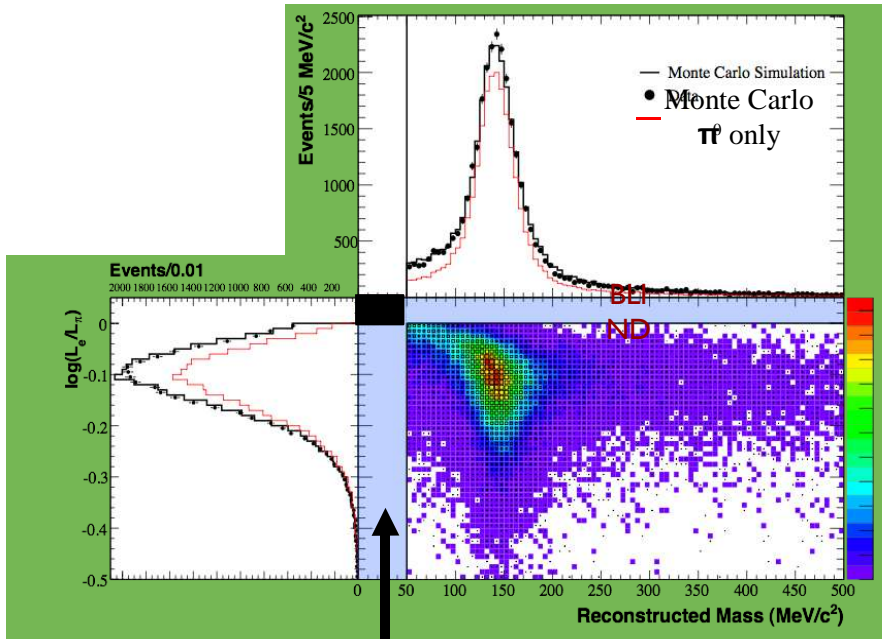
$\log(L_e/L_\mu) > 0$  (e-like)

$\log(L_e/L_{\pi^0}) < 0$  ( $\pi^0$ -like)

mass > 50 (high mass)

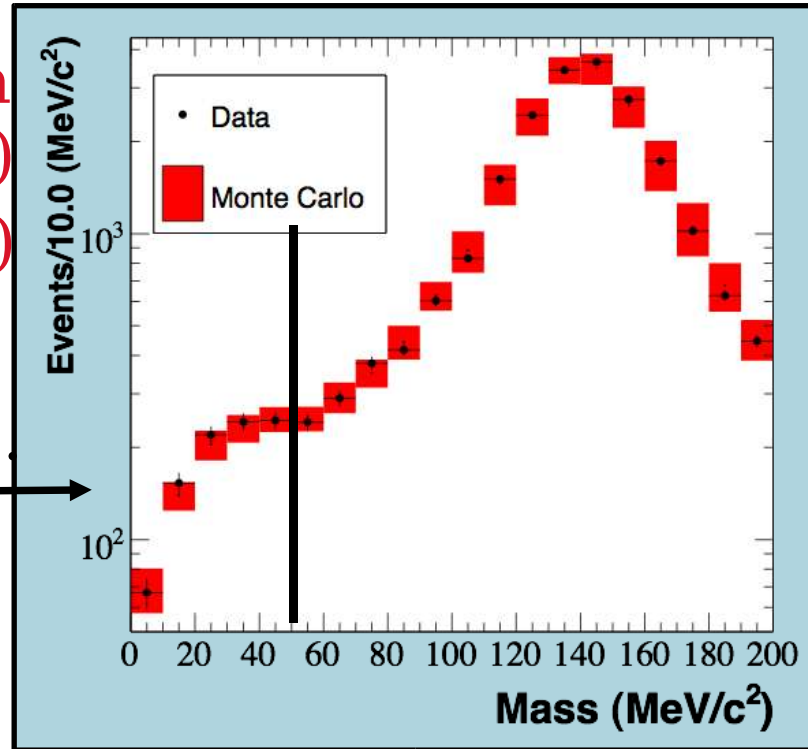


1 subevent  
 $\log(L_e/L_\mu) > 0$  (e-like)  
 $\log(L_e/L_{\pi^0}) < 0$  ( $\pi^0$ -like)  
 $\text{mass} < 200$  (high mass)



Next: look here...

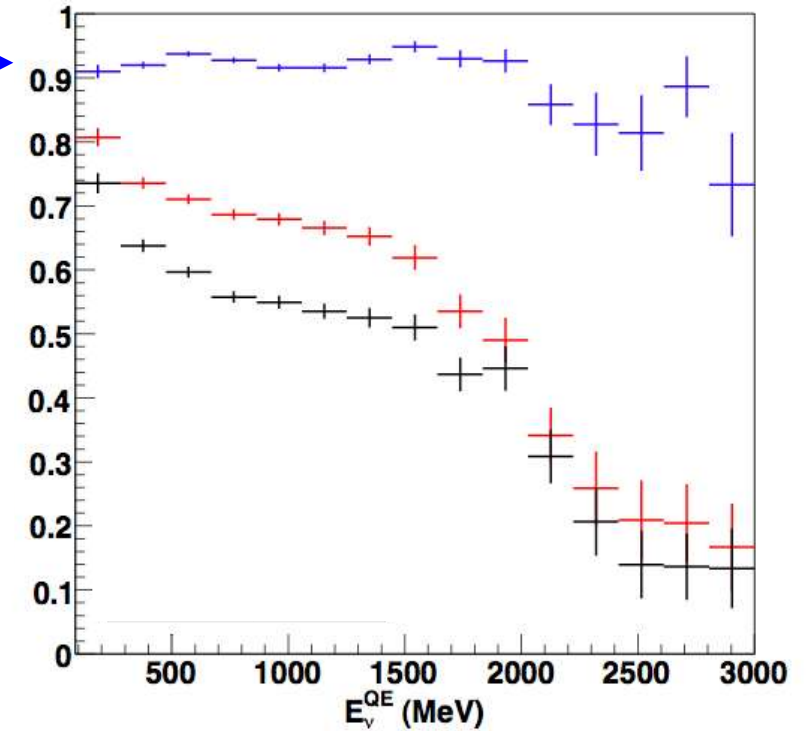
$\chi^2$  Prob for  $\text{mass} < 50 \text{ MeV}$   
 ("most signal-like"): 69%



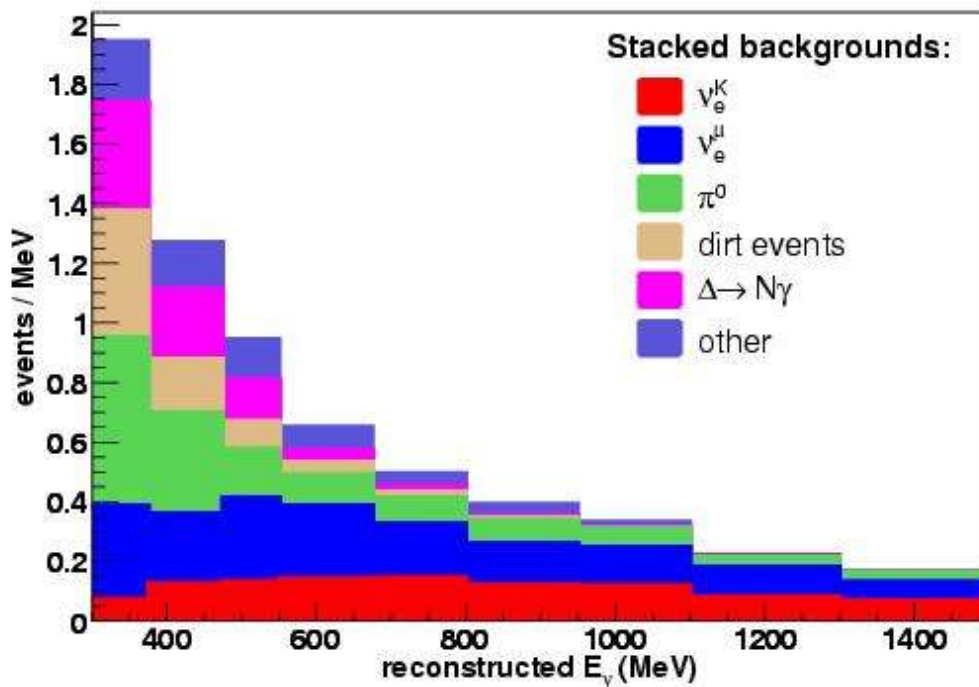
# Summary of TB cuts

$\text{Log}(L_e/L_\mu)$   $\longrightarrow$   
 $\text{Log}(L_e/L_{\pi^0})$   $\longrightarrow$   
invariant mass  $\longrightarrow$

Efficiency:



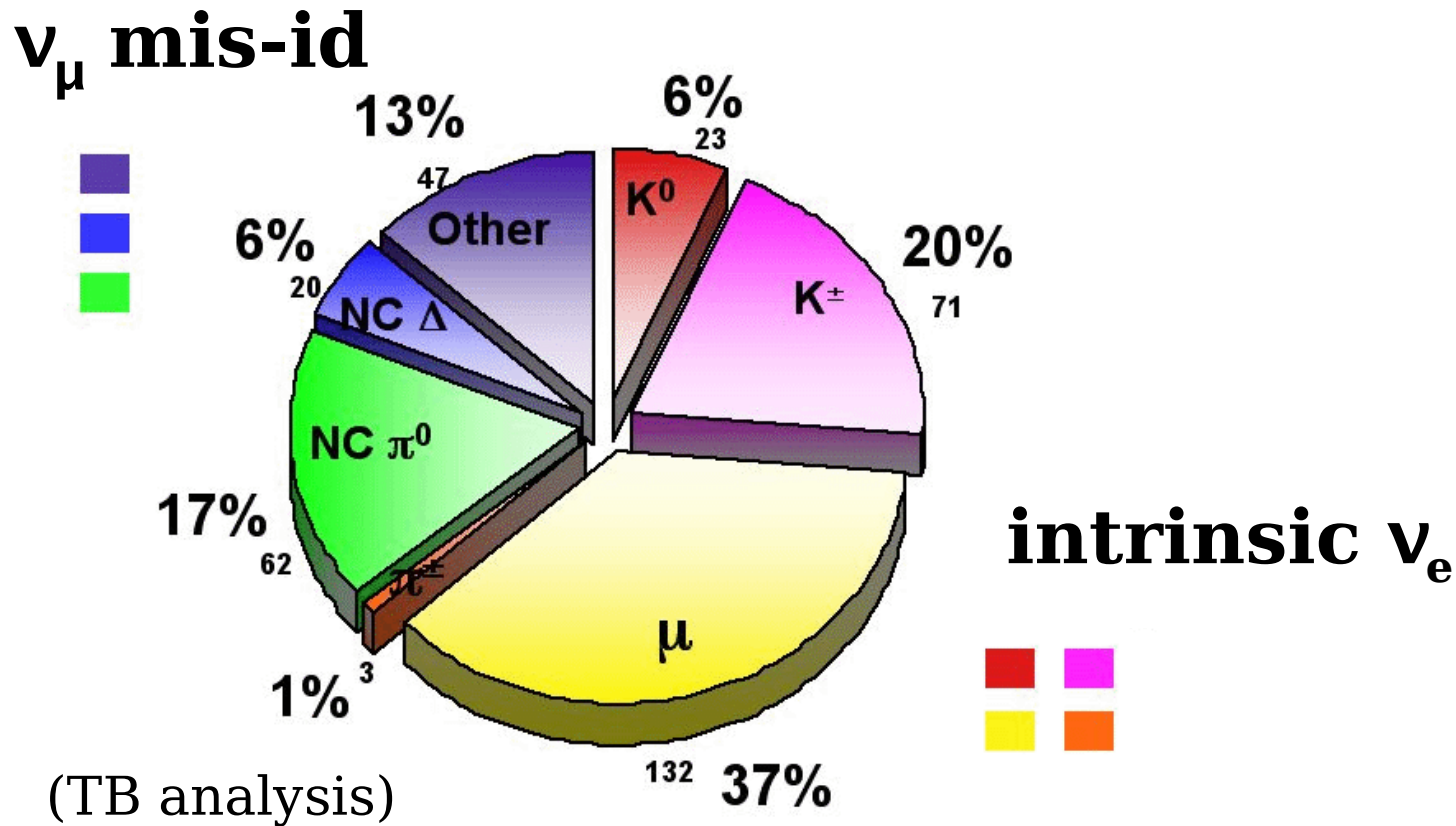
## Backgrounds after cuts



- 
- The Experimental Setup
  - Two Independent Data Analyses
  - Errors and Constraints
  - First Results



We have two categories of backgrounds:



Predictions of the backgrounds are among the nine sources of significant error in the analysis

Summary of predicted backgrounds for  
the final MiniBooNE result  
(TB Analysis):

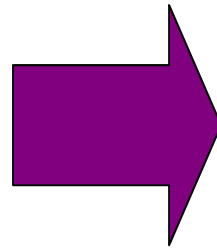
Process	Number of Events
Beam Unrelated	2
$\nu_\mu$ CCQE	10
$\nu_\mu e \rightarrow \nu_\mu e$	7
Miscellaneous $\nu_\mu$ Events	13
NC $\pi^0$	62
NC $\Delta \rightarrow N\gamma$	20
NC Coherent & Radiative $\gamma$	< 1
Dirt Events	17
$\nu_e$ from $\mu$ Decay	132
$\nu_e$ from $K^+$ Decay	71
$\nu_e$ from $K_L^0$ Decay	23
$\nu_e$ from $\pi$ Decay	3
Total Background	358
0.26% $\nu_\mu \rightarrow \nu_e$	(example signal) 163

## Handling uncertainties in the analyses:

What we begin with...

... what we need

For a given source  
of uncertainty,  
Errors on a wide range  
of parameters  
in the underlying model



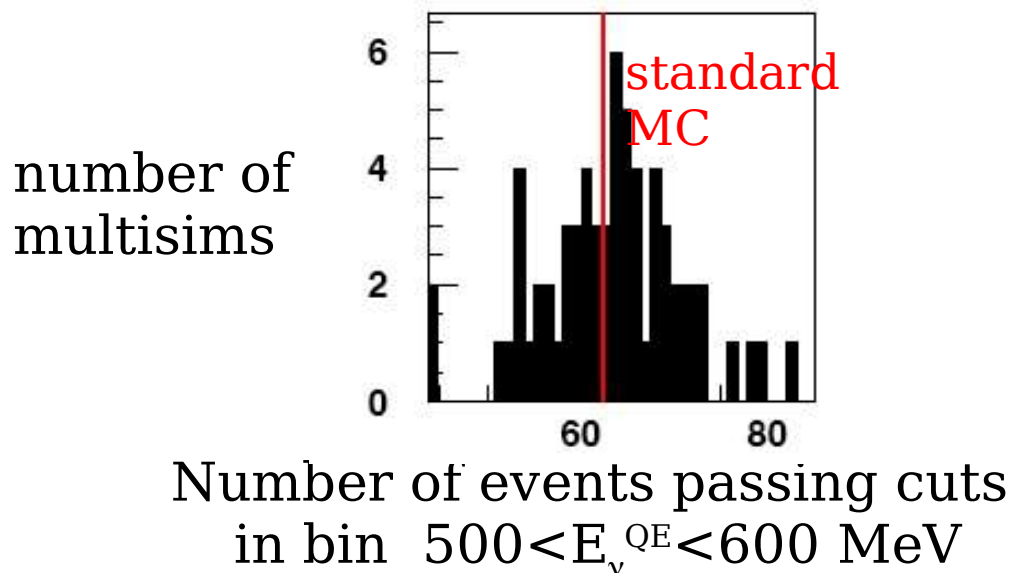
For a given source  
of uncertainty,  
Errors in bins of  
 $E_{\nu}^{QE}$   
and information on  
the correlations  
between bins

Use “Multisims” To convert from errors on parameters  
to errors in  $E_\nu^{\text{QE}}$  bins:

For each error source,

“Multisim” experiments are generated within the  
allowed variations by reweighting the standard Monte Carlo.  
In the case of the OM, hit-level simulations are used.

70 multisims  
for the Optical Model



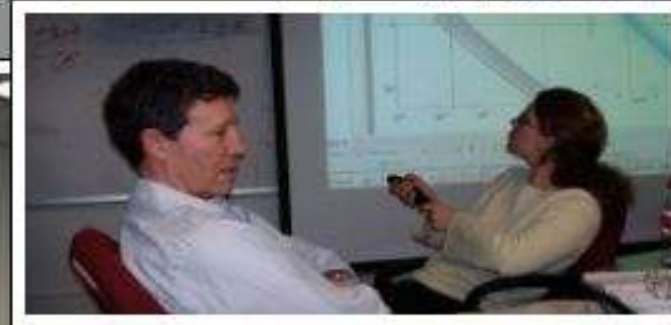
From differences  
between central value  
and each Multisim,  
Form correlated Error  
Matrices

Error bars on plots are the diagonals of the error matrix,  
but the fully correlated matrix goes into oscillation fit

- The Experimental Setup
- Two Independent Data Analyses
- Errors and Constraints
- First Results



# The Box Opening



The Track-based  $\nu_{\mu} \rightarrow \nu_e$  Appearance-only Result:

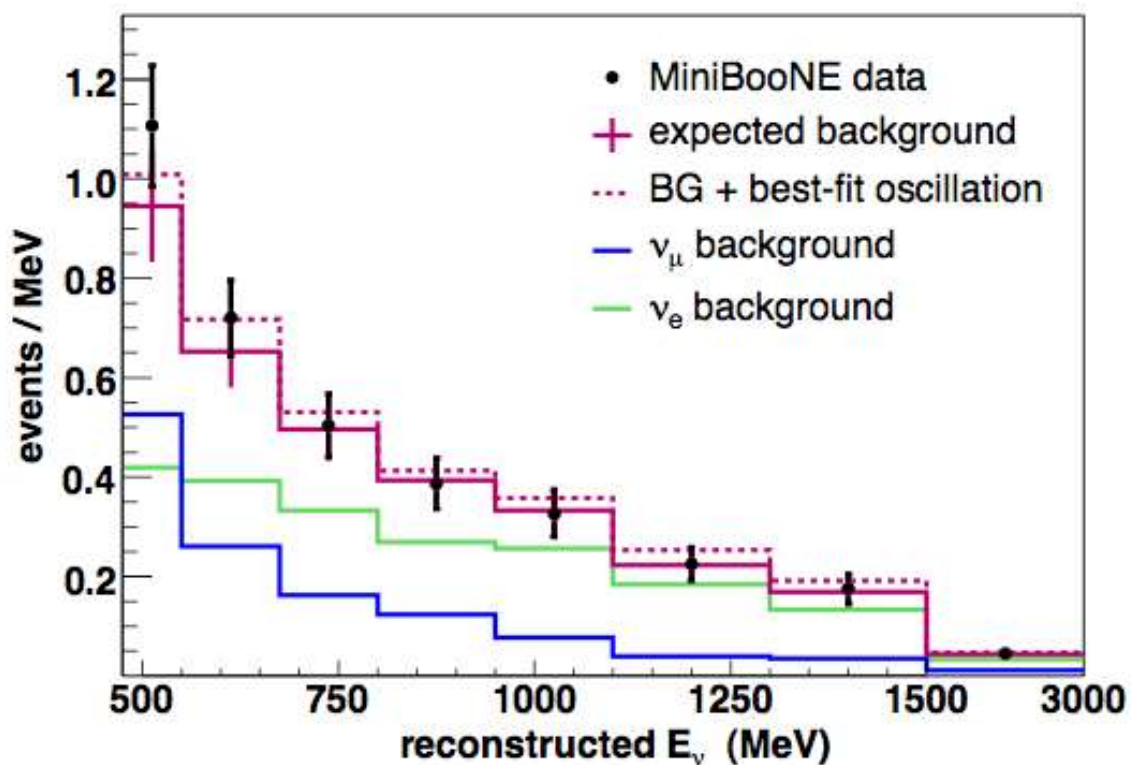
Counting Experiment:  $475 < E_{\nu}^{\text{QE}} < 1250$  MeV

data: 380 events

expectation:  $358 \pm 19$  (stat)  $\pm 35$  (sys) events

significance: $0.55 \sigma$
--------------------------------

## TB energy dependent fit results:



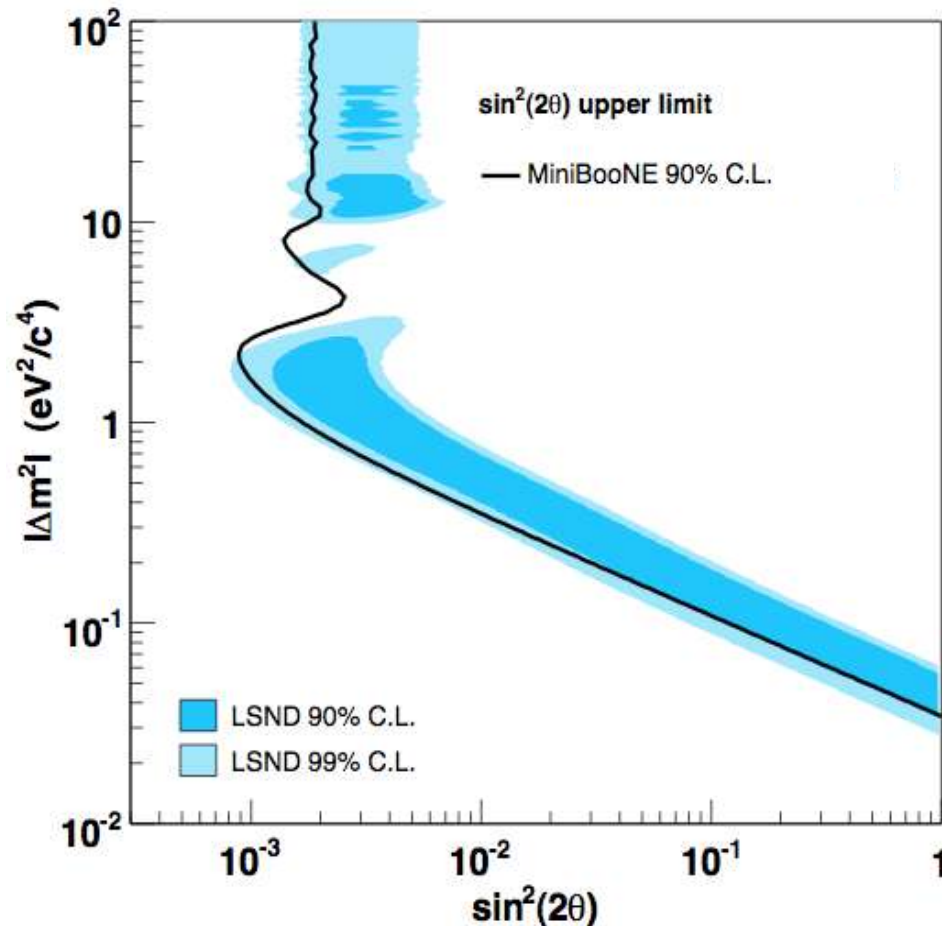
Error bars are diagonals of error matrix.

Fit errors  
for  $>475$  MeV:  
Normalization 9.6%  
Energy scale: 2.3%

Best Fit (dashed):  $(\sin^2 2\theta, \Delta m^2) = (0.001, 4 \text{ eV}^2)$



This places a limit on on oscillations  
for  $\nu_\mu$  to  $\nu_e$  appearance only oscillations



Incompatible with  
the LSND experiment  
at 98% CL.

Energy fit:  $475 < E_{\nu}^{\text{QE}} < 3000$  MeV

Boosted decision tree analysis is consistent (both  
as counting experiment and in energy fit) with this

*Across a broader range  
of energies:*

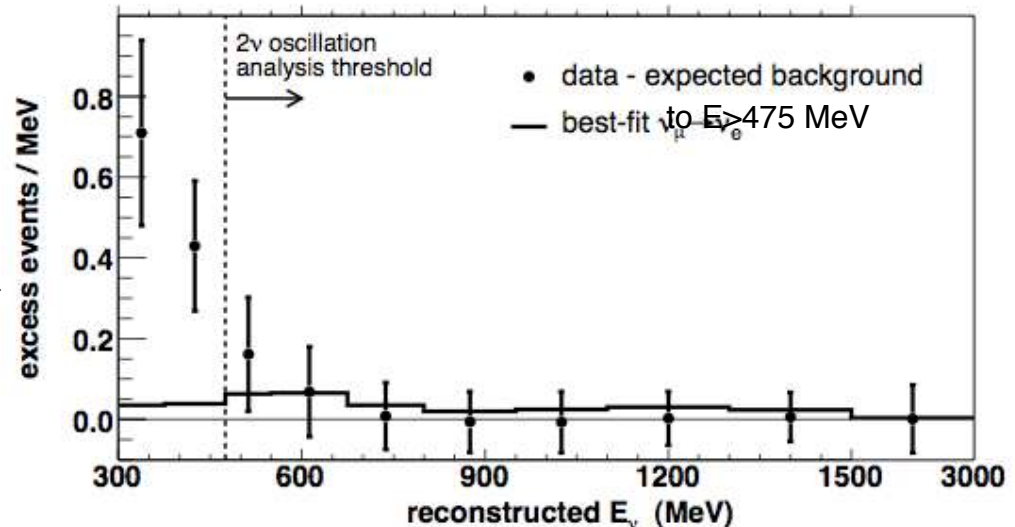
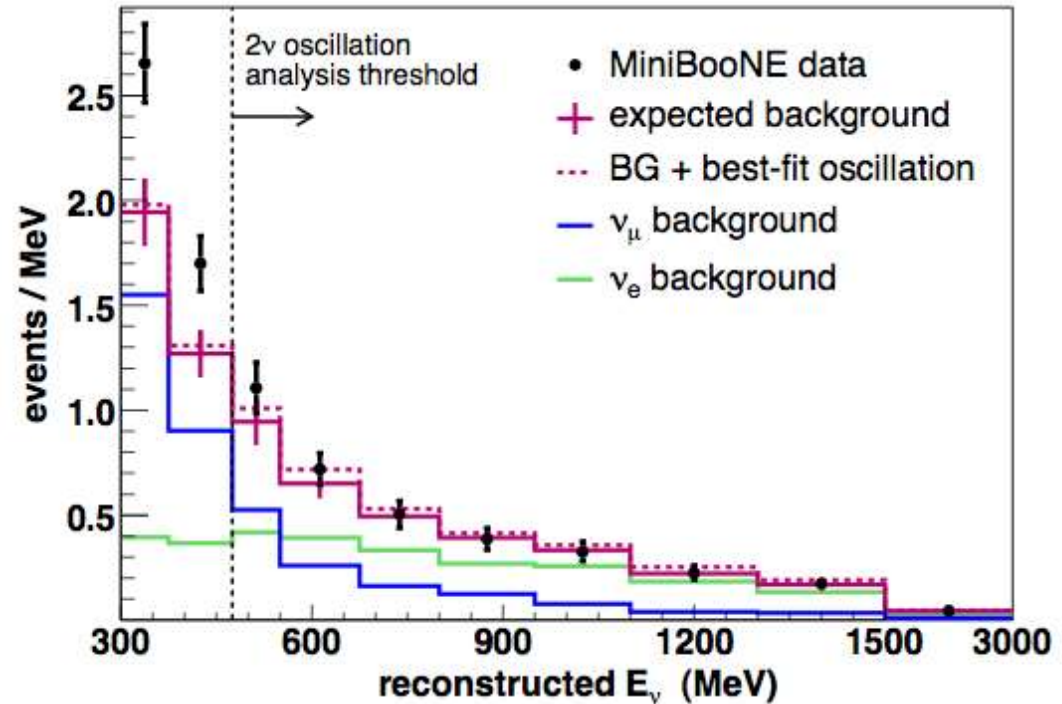
$$300 < E_{\nu}^{\text{QE}} < 3000 \text{ MeV}$$

$96 \pm 17 \pm 20$  events  
above background,  
for  $300 < E_{\nu}^{\text{QE}} < 475 \text{ MeV}$

Background-subtracted:

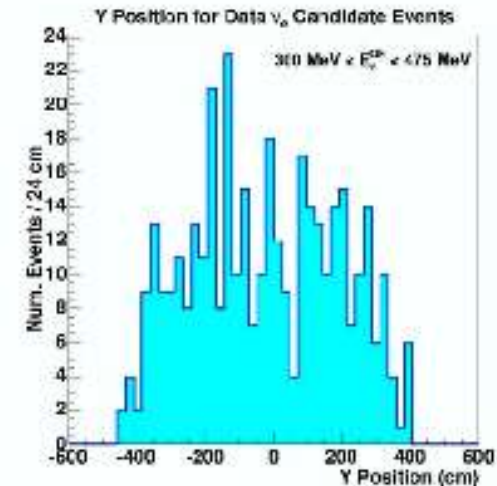
MiniBooNE investigating  
low energy events:  
Need to understand these  
in any case:

- new physics
- background which must be understood for next class of experiments

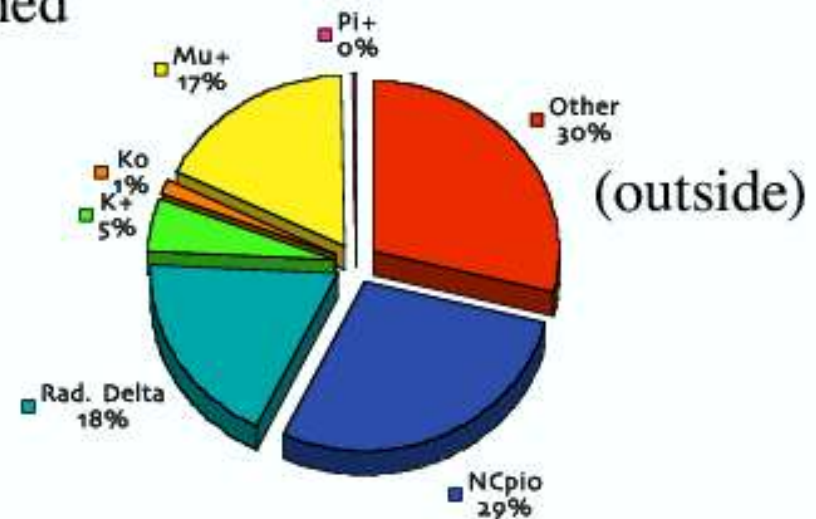


# What we already know about these events.....

- They are spread throughout the run,
- They show no bias in event timing
- They show no bias in spatial distribution (they are not from outside)
- The backgrounds in this region are large, but they are well constrained



Likelihood Analysis  
300 MeV to 475 MeV



1) LSND is wrong?

*LSND is not standard muon neutrino to electron neutrino appearance*

2) There are sterile neutrinos

## 3+1 and 3+2 models

Then these are the main mixing matrix elements

$$\begin{pmatrix} \nu_e \\ \nu_\mu \\ \nu_\tau \\ \nu_s \\ \nu_{s'} \\ \vdots \end{pmatrix} = \begin{pmatrix} U_{e1} & U_{e2} & U_{e3} & U_{e4} & U_{e5} & \dots \\ U_{\mu1} & U_{\mu2} & U_{\mu3} & U_{\mu4} & U_{\mu5} & \\ U_{\tau1} & U_{\tau2} & U_{\tau3} & U_{\tau4} & U_{\tau5} & \\ U_{s1} & U_{s2} & U_{s3} & U_{s4} & U_{s5} & \\ U_{s'1} & U_{s'2} & U_{s'3} & U_{s'4} & U_{s'5} & \\ \dots & & & & & \end{pmatrix} \begin{pmatrix} \nu_1 \\ \nu_2 \\ \nu_3 \\ \nu_4 \\ \nu_5 \\ \vdots \end{pmatrix}$$

4) Something else unexpected?

a) Background that has not been predicted

b) Other new physics: neutrinos in the bulk,  
neutrino decay....

1) LSND is wrong?

*3+1 models are ruled out but 3+2 and 3+3 fit MiniBooNE + LSND well*

*...tension with SBL disappearance expts.*

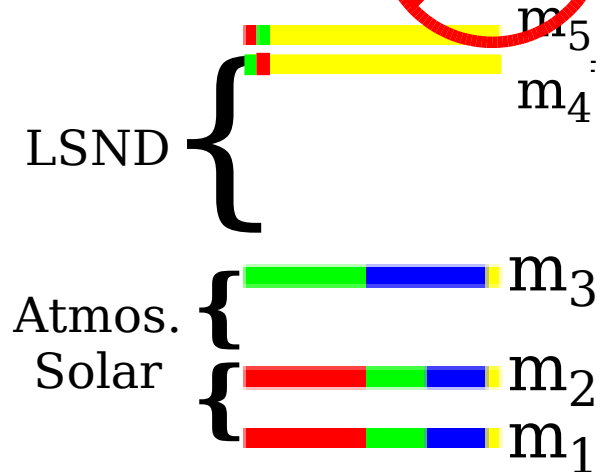
*...tension for some configurations with*

2) There are sterile neutrinos

*cosmological constraints*



## ~~3+1~~ and 3+2 models



$\nu_\epsilon$

$\nu_\mu$

$\nu_\tau$

$\nu_\sigma$

$$\begin{pmatrix} \nu_e \\ \nu_\mu \\ \nu_\tau \\ \nu_s \\ \nu_{s'} \\ \vdots \end{pmatrix} = \begin{pmatrix} U_{e1} & U_{e2} & U_{e3} & U_{e4} & U_{e5} & \dots \\ U_{\mu1} & U_{\mu2} & U_{\mu3} & U_{\mu4} & U_{\mu5} \\ U_{\tau1} & U_{\tau2} & U_{\tau3} & U_{\tau4} & U_{\tau5} \\ U_{s1} & U_{s2} & U_{s3} & U_{s4} & U_{s5} \\ U_{s'1} & U_{s'2} & U_{s'3} & U_{s'4} & U_{s'5} \\ \dots \end{pmatrix} \begin{pmatrix} \nu_1 \\ \nu_2 \\ \nu_3 \\ \nu_4 \\ \nu_5 \\ \vdots \end{pmatrix}$$

Then these are the main mixing matrix elements

4) Something else unexpected?

a) Background that has not been predicted

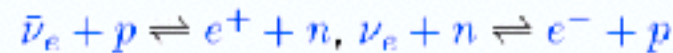
b) Other new physics: neutrinos in the bulk,  
neutrino decay....

Are sterile neutrinos an asset for astrophysics?

## The R-process needs a large neutron imbalance

How do you create a very large neutron-imbalance?

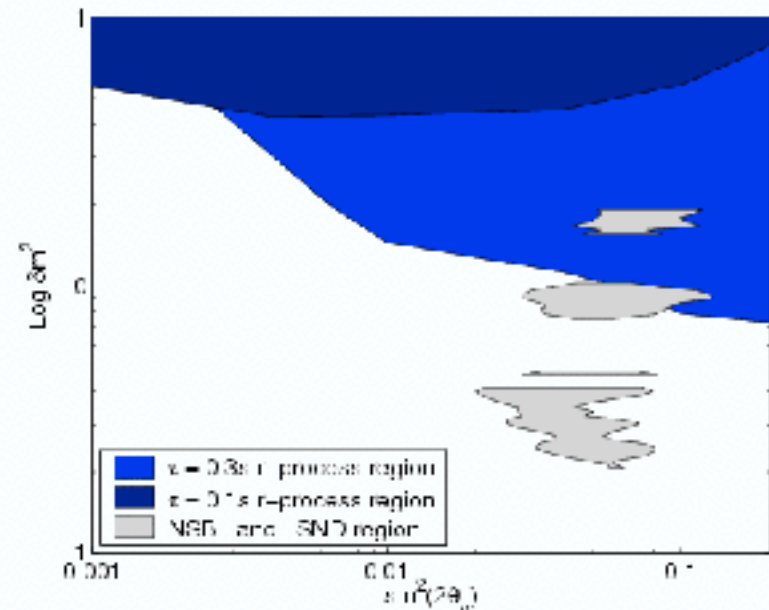
First create an anti-electron neutrino rich environment.



... which works if the conditions are right (high electron density, right oscillation parameters) to produce a  $\nu_e \rightarrow \nu_s$  “resonance”

Allowed ranges for oscillation to enable sufficient U production

Beun, Surman, McLaughlin & Hix,  
preliminary



Are they a problem for cosmology?

Cosmology constrains neutrino mass to  $\sim 1-2$  eV

Depending on the sterile neutrino mass ordering,

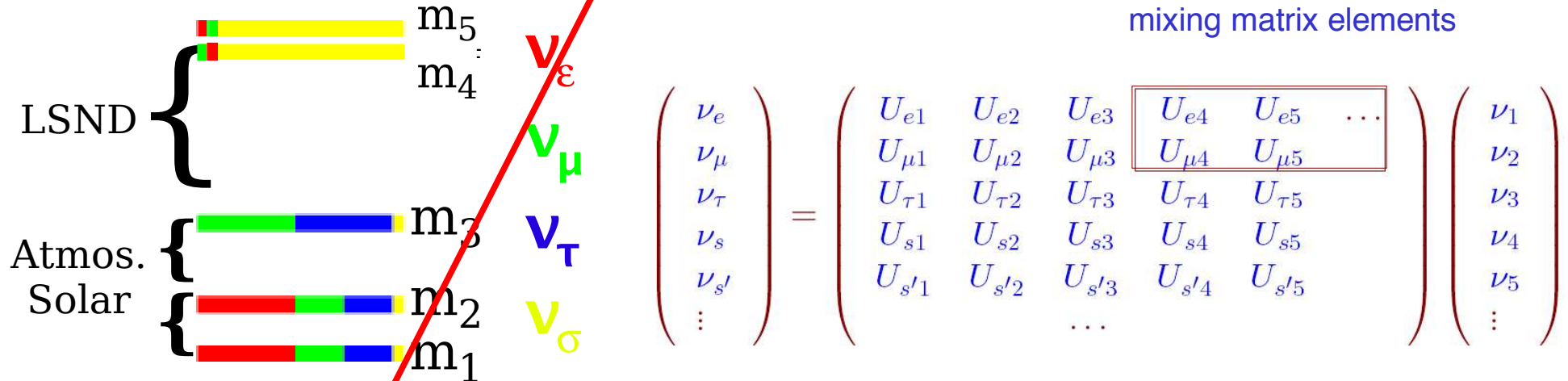
neutrino mass  $\sim 2-10$  eV. So some constraints are there.

1) LSND is wrong?

2) There are sterile neutrinos

- *New physics? Possible*
- *Background? Well constrained but we're still looking!*
- *MiniBooNE, SciBooNE and follow-on experiments will look*

### 3+1 and 3+2 models



4) Something else unexpected?

a) Background that has not been predicted

b) Other new physics: neutrinos in the bulk, neutrino decay....



MiniBooNE rules out a two neutrino  
interpretation of LSND

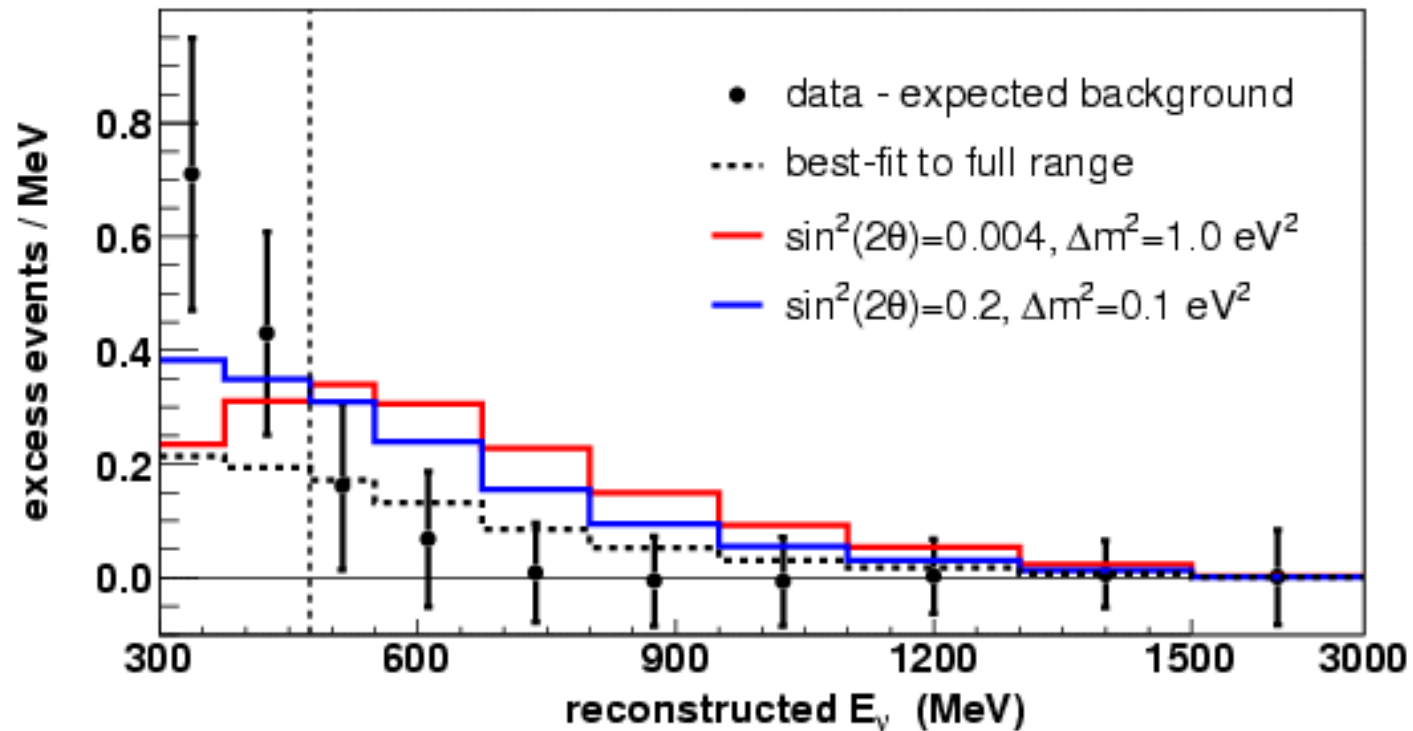
Discrepancy at low energy is  
under study



Fit to the  $> 300$  MeV range:

Best Fit (dashed):  $(\sin^2 2\theta, \Delta m^2) = (1.0, 0.03 \text{ eV}^2)$

$\chi^2$  Probability: 18%

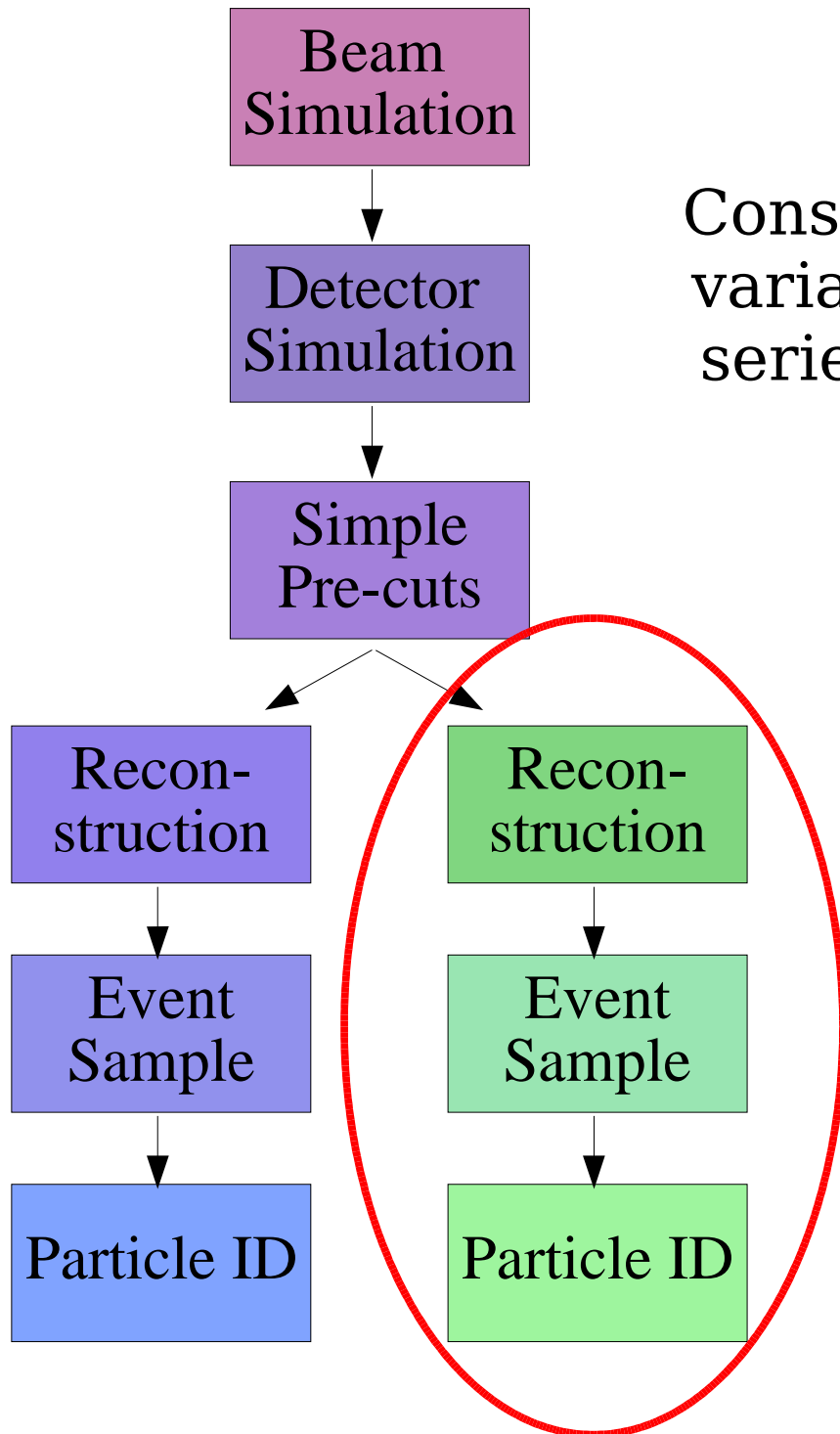


## Boosted Decision Trees

Construct a set of low-level analysis variables which are used to make a series of cuts to classify the events.

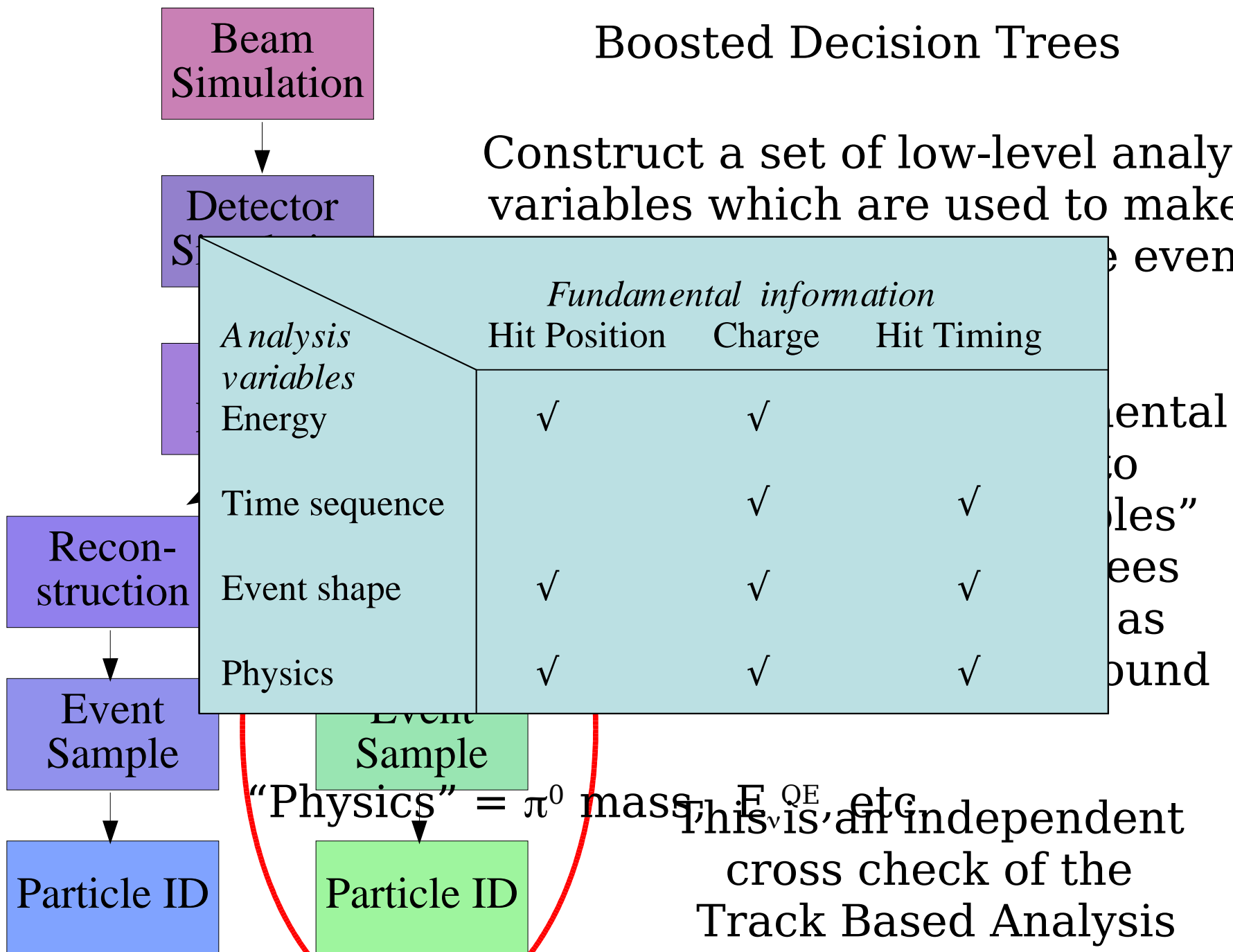
Convert “Fundamental Variables” into “Analysis Variables” then develop trees to score events as signal or background

This is an independent cross check of the Track Based Analysis



# Boosted Decision Trees

Construct a set of low-level analysis variables which are used to make a decision on the events.

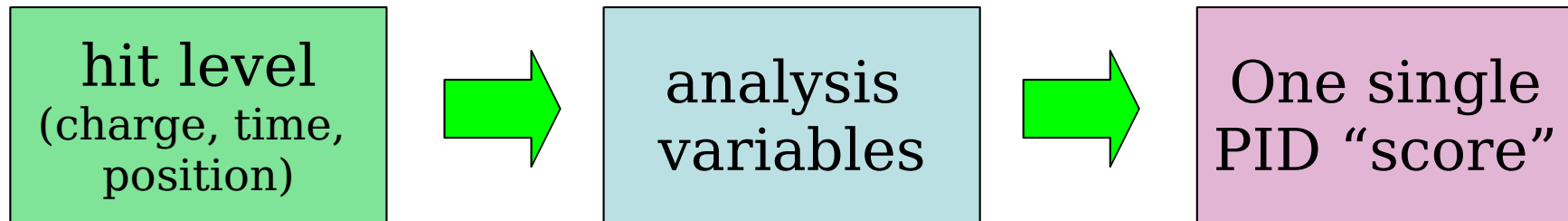


# Reduce Analysis Variables to a Single PID Variable

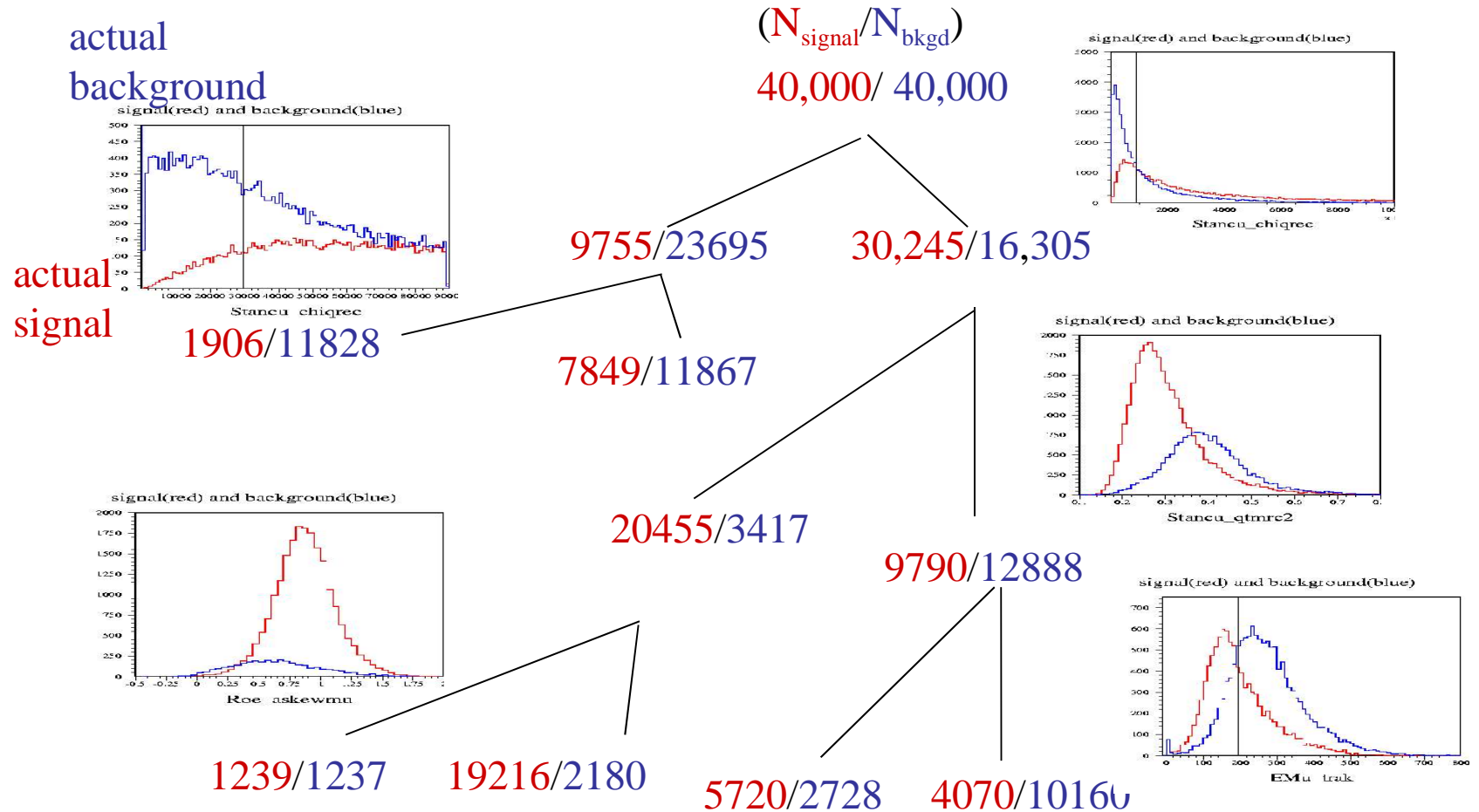
## Boosted Decision Trees

**“A procedure that combines many weak classifiers to form a powerful committee”**

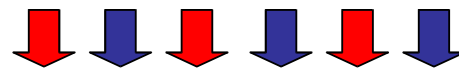
Byron P. Roe, et al.,  
NIM A543 (2005) 577.



# Boosting uses Decision Trees (sequential series of cuts)



Continue decision tree until each “leaf”  
is either very pure or statistically small.



Combine output of many trees → Boosting

## Boosted Decisions Trees

A set of decision trees is created using Monte Carlo

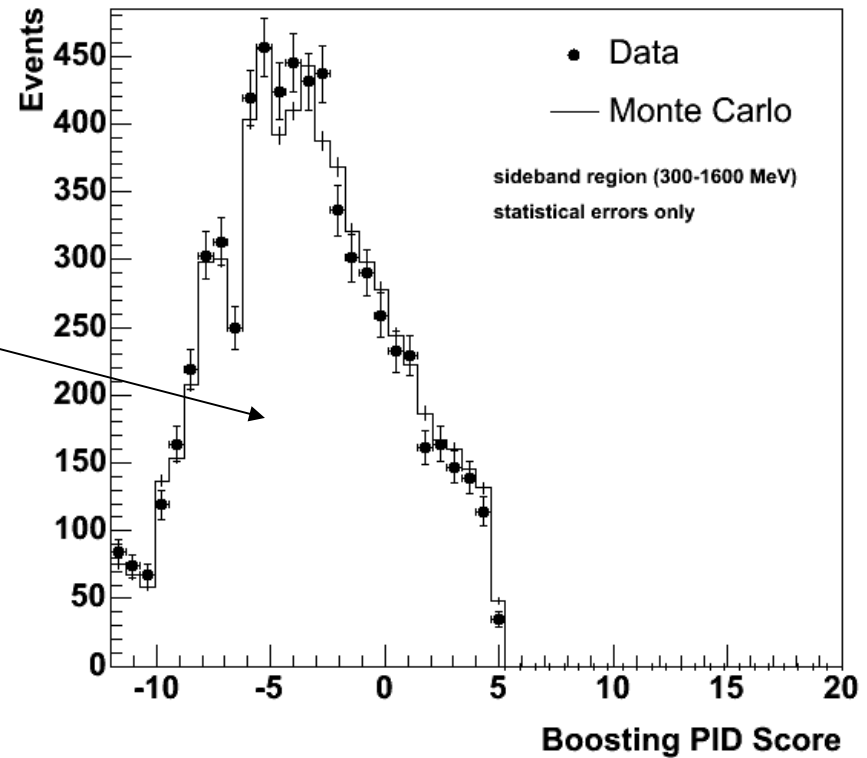
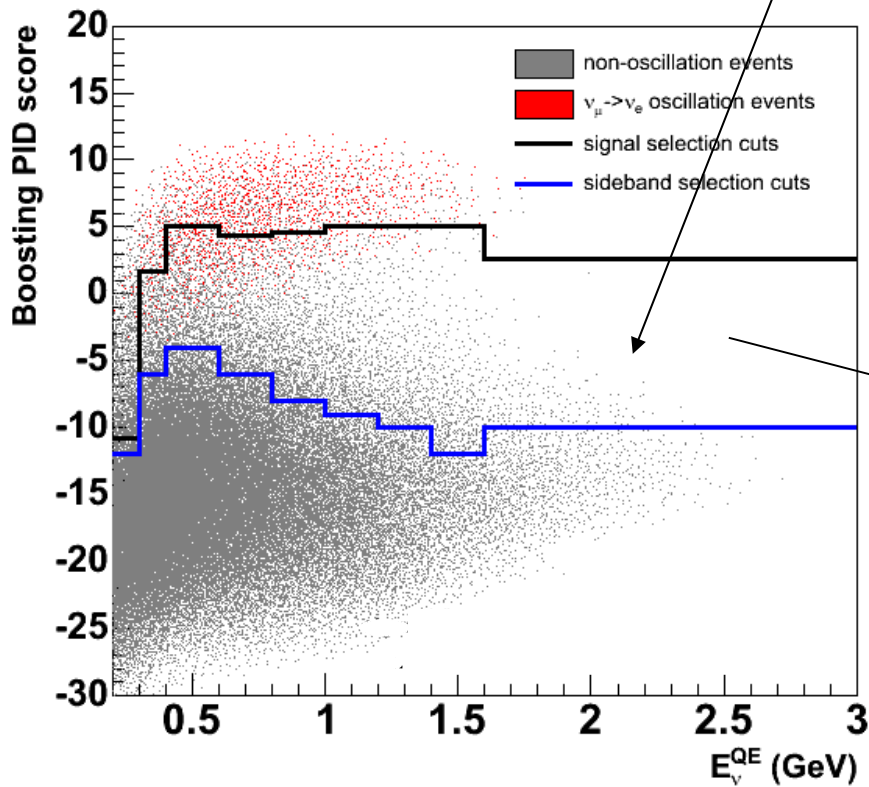
For each tree, the data event is assigned  
**+1** if it is identified as **signal**,  
**-1** if it is identified as **background**.

The total for all trees is then combined.

The resulting “score” for the event  
can be thought of as a probability that it is signal.



BDT cuts on PID score as a function of energy.  
We can define a “sideband” just outside of the **signal region**



# MiniBooNE data constrains uncertainties!

Source of Uncertainty On $\nu_e$ background	TB/BDT error in %	Checked or Constrained by MB data	Further reduced by tying $\nu_e$ to $\nu_\mu$
Flux from $\pi^+/\mu^+$ decay	6.2 / 4.3	✓	✓
Flux from $K^+$ decay	3.3 / 1.0	✓	✓
Flux from $K^0$ decay	1.5 / 0.4	✓	✓
Target and beam models	2.8 / 1.3	✓	
$\nu$ -cross section	12.3 / 10.5	✓	✓
NC $\pi^0$ yield	1.8 / 1.5	✓	
External ints. ("Dirt")	0.8 / 3.4	✓	
Optical model	6.1 / 10.5	✓	✓
DAQ electronics model	7.5 / 10.8	✓	

Different analyses are sensitive to different uncertainties