

# How well do we need to know detector parameters for supernova neutrinos?

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DUNE Calibration Task Force Meeting

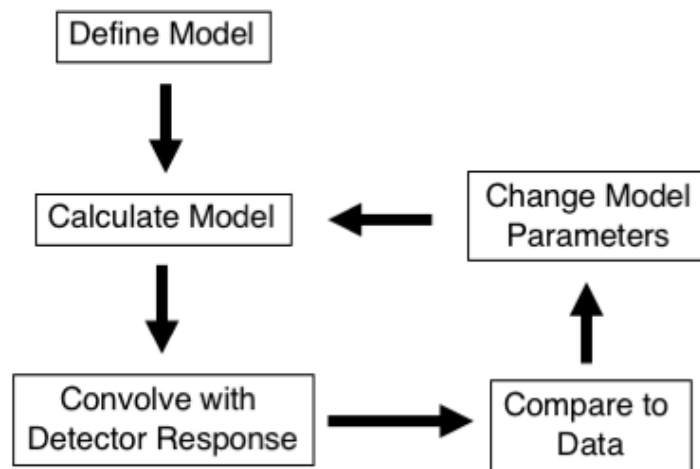
October 30, 2018

# Outline

- Introduction
  - Forward fitting
  - Supernova flux model
- Forward fitting studies
  - Energy resolution
  - Energy scale
  - Energy shift
  - Cross section
- Takeaways + Next Steps

# Forward Fitting: Introduction

- Goal: provide information about DUNE's ability to constrain pinched-thermal model parameters
- For the purposes of this study:
  - Model: pinched-thermal flux
  - Detector response: Gaussian smearing
  - Data: SNOwGLoBES smeared event rates



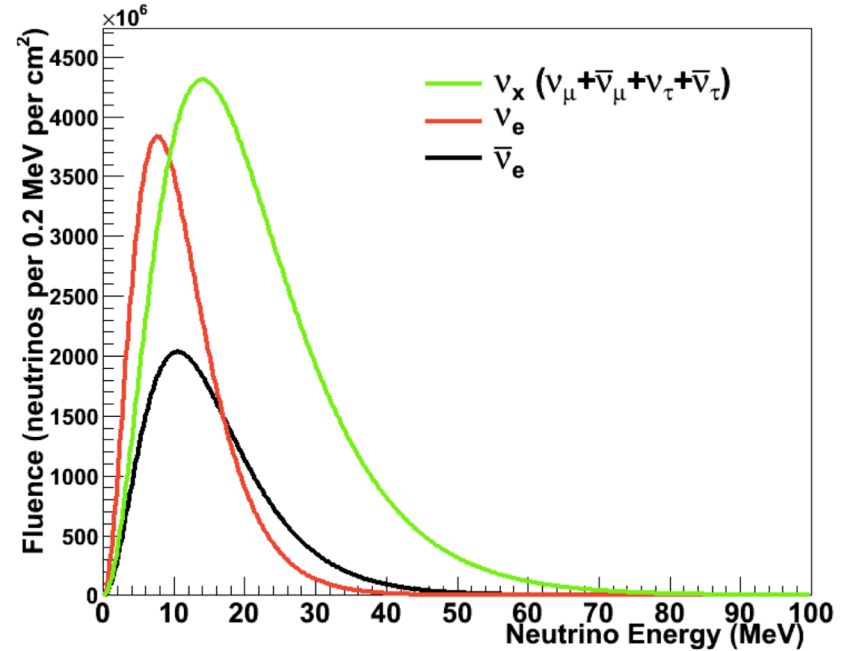
Forward Fitting Schematic

# Supernova Flux Model

- Supernova neutrino spectrum AKA “pinched-thermal form”:

$$\phi(E_\nu) = \mathcal{N} \left( \frac{E_\nu}{\langle E_\nu \rangle} \right)^\alpha \exp \left[ -(\alpha + 1) \frac{E_\nu}{\langle E_\nu \rangle} \right]$$

- $E_\nu$ : Neutrino energy
- $\mathcal{N}$ : Normalization constant (related to luminosity,  $\epsilon$ )
- $\langle E_\nu \rangle$ : Mean neutrino energy
- $\alpha$ : Pinching parameter; large  $\alpha$  corresponds to more pinched spectrum
- Parameters of interest:  $\epsilon$ ,  $\langle E_\nu \rangle$ ,  $\alpha$
- Supernova neutrinos expected to contain information about parameters

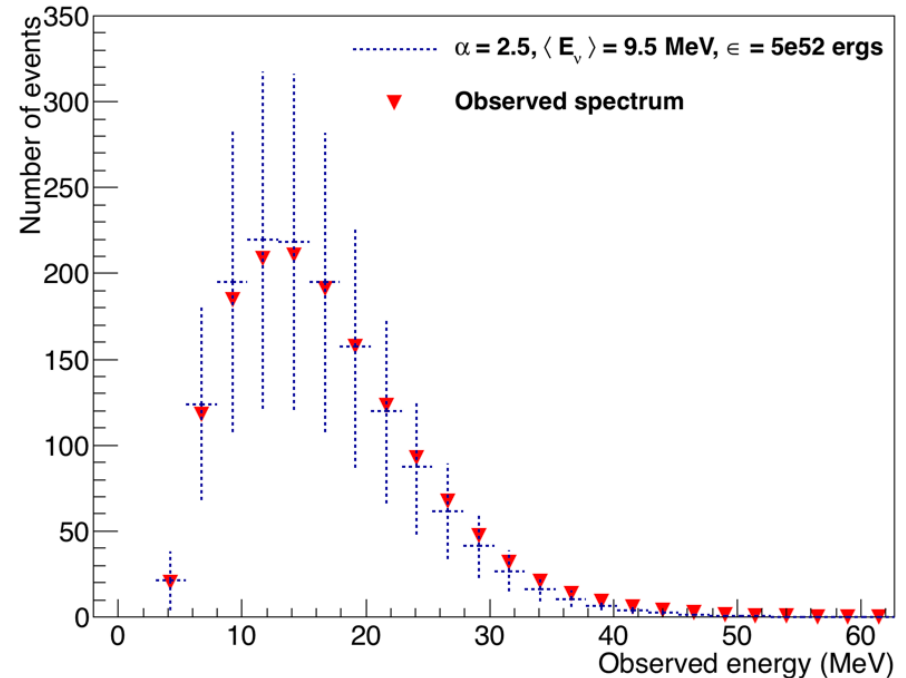


Energy spectra for a SN 10kpc from Earth (K. Scholberg)  
Note: Fluence refers to a time-integrated flux.

# Forwarding Fitting Tools

- $\chi^2$  minimization for supernova energy spectra – how well do we know the parameters?
- Study uses the following tools:
  - “Test spectra” corresponding to supernova event rates in DUNE detector with given set of pinching parameters  $(\alpha^0, \langle E_\nu \rangle^0, \varepsilon^0)$
  - Grid of test spectra containing combinations of  $(\alpha, \langle E_\nu \rangle, \varepsilon)$

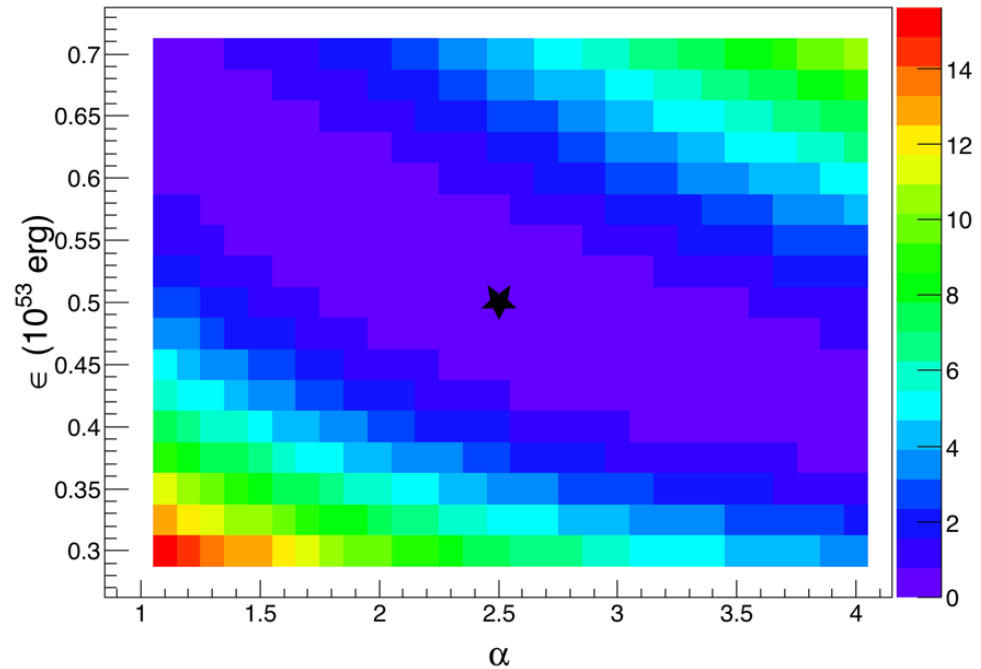
Example Fake Supernova Spectrum



# Forward Fitting: “Sensitivity”

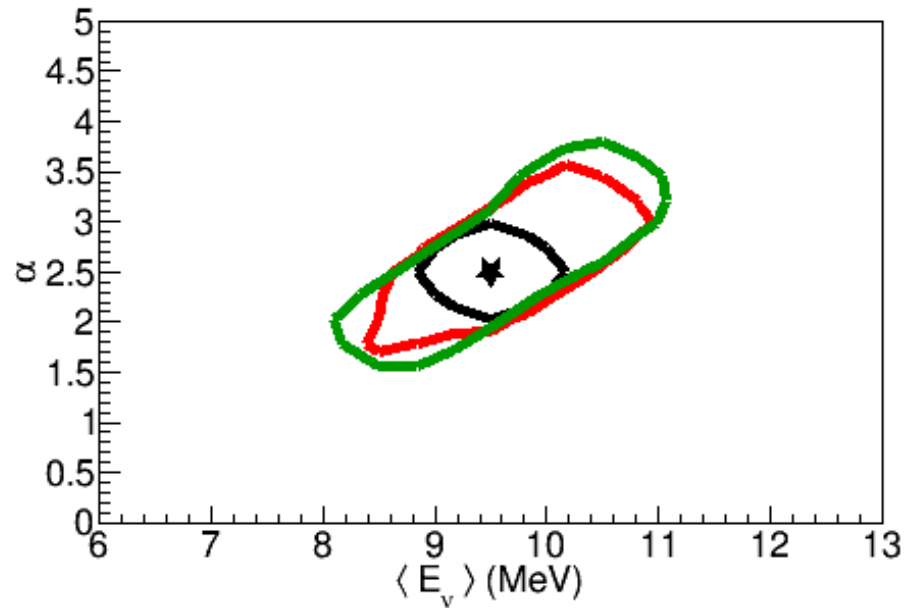
- Use SNOwGLoBES to generate binned energy spectra for a given set of pinched-thermal parameters  $(\alpha^0, \langle E_\nu \rangle^0, \varepsilon^0) \rightarrow$  “test spectra”
- Determine  $\chi^2$  values for all elements in grid containing combinations of  $(\alpha, \langle E_\nu \rangle, \varepsilon)$
- Minimize  $\chi^2$  while profiling over 1 or 2 model parameters

Example  $\chi^2$  Map for 12.80 cm<sup>2</sup> Effective Area



# Figures of Merit

- Overall summary “figure of merit”: area of 90% regions
  - Quantification on how well DUNE constrains spectral parameters
- Another figure of merit: best-fit parameter fractional difference from truth
- 2D plots of effective area vs. distance; put different figures of merit on z-axis

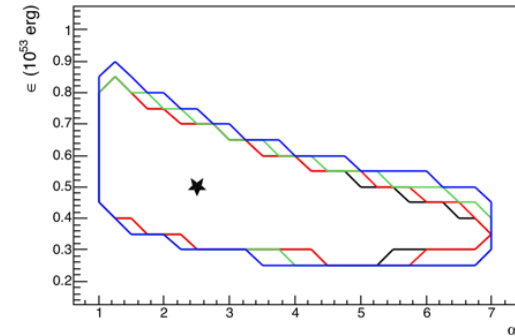
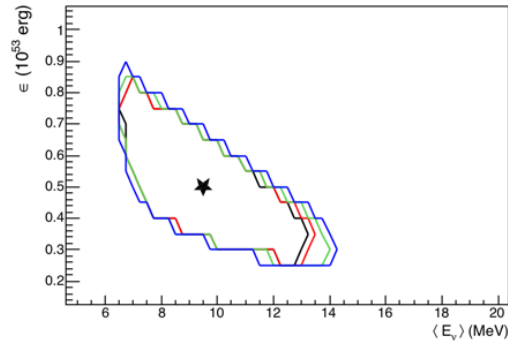
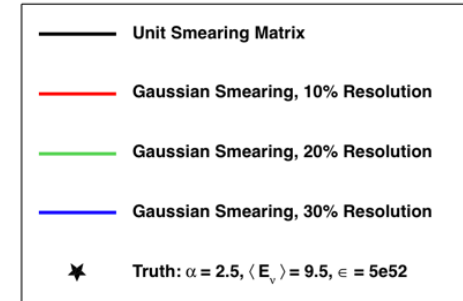
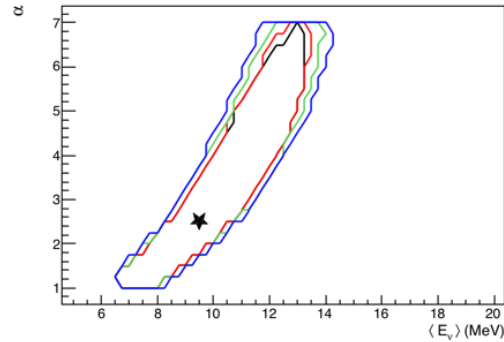


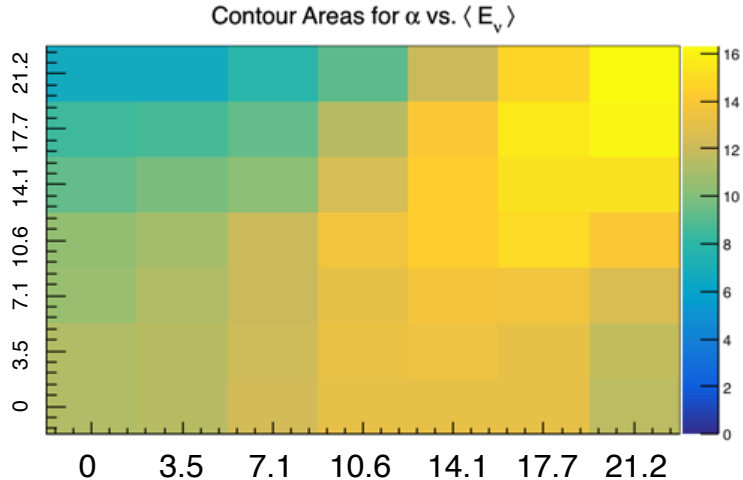
How well do we have to know the energy resolution?



# Energy Resolution: Introduction

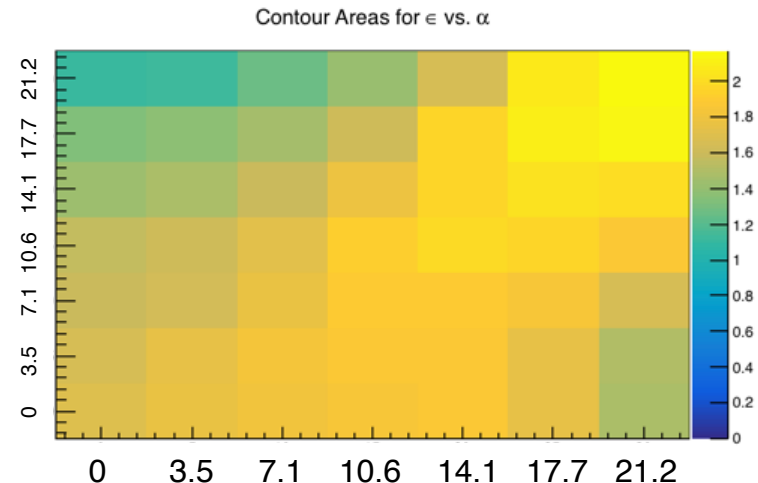
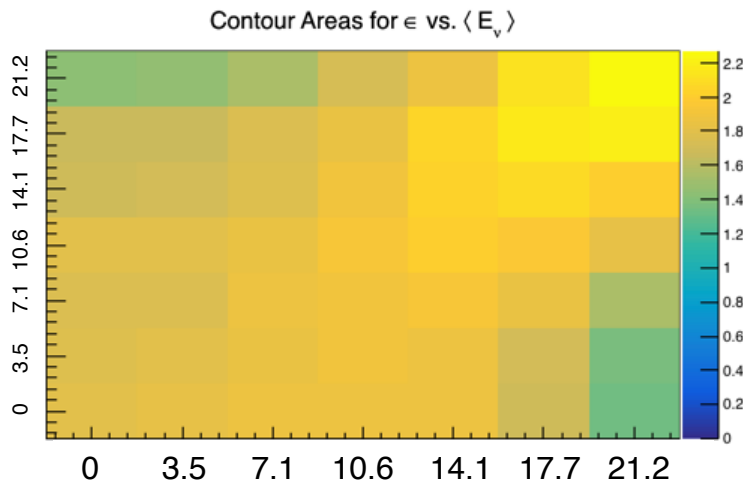
- Initiated study to determine how smearing affects forward fitting – what if our resolution assumptions are incorrect?
- Performed sensitivity study for every combination of Gaussian resolution in grid, test spectra
- Note: due to bug, resolutions off by factor of  $\sqrt{2}$  (hence the strange resolution values)



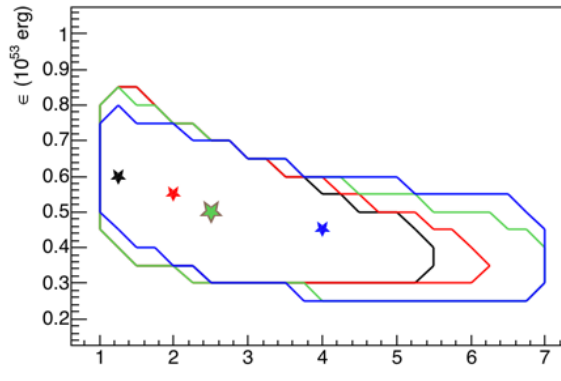
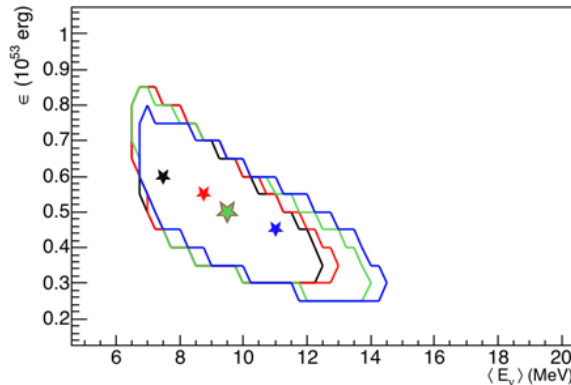
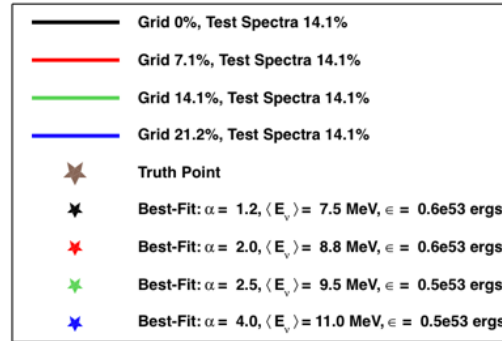
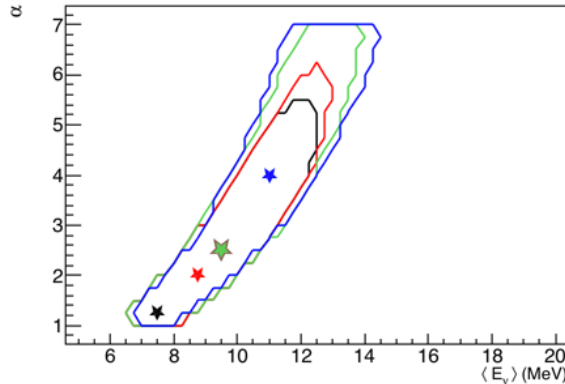


## 2D Contour Area Plot

- X-axis: Grid resolution
- Y-axis: Test spectra resolution
- Areas get larger as resolution increases (expected)
- Areas get smaller in extreme “corners” where test spectra’s resolution is at one extreme and the smearing is at the other extreme



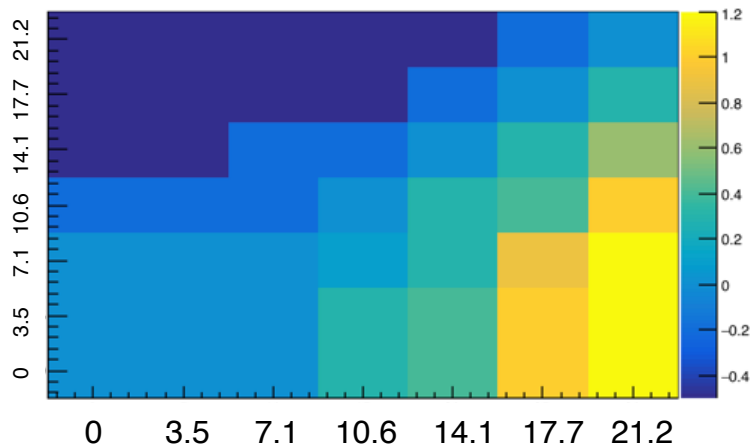
# Sensitivity Regions Example



## Notes:

- Here we see superimposed sensitivity regions + best-fit parameters for one test spectra as input into different grids
- We can see both how the areas change, but also how the bias in our predictions change!

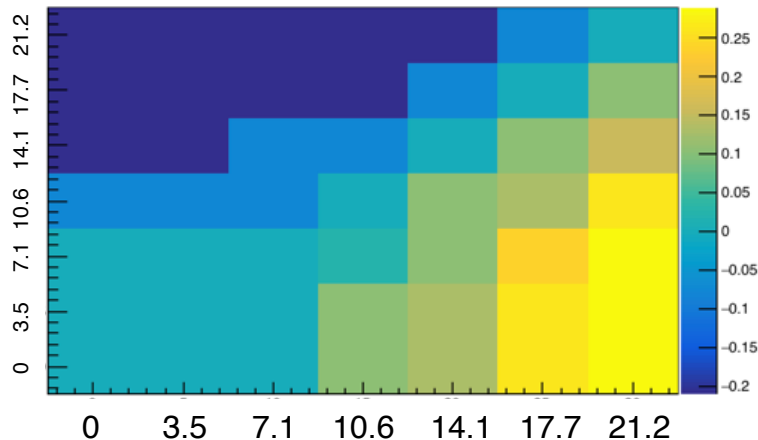
Fractional difference from truth for  $\alpha$



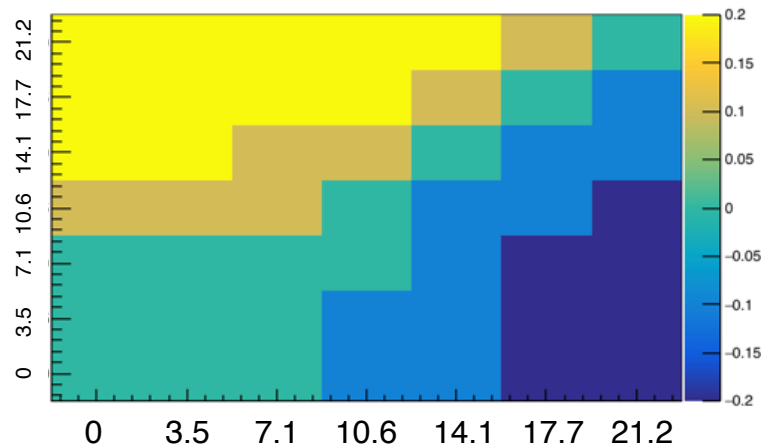
## 2D Fractional Difference Plot

- X-axis: Grid resolution
- Y-axis: Test spectra resolution
- We see how our predictions are biased if we have incorrect assumptions about energy resolution

Fractional difference from truth for  $\langle E_\nu \rangle$



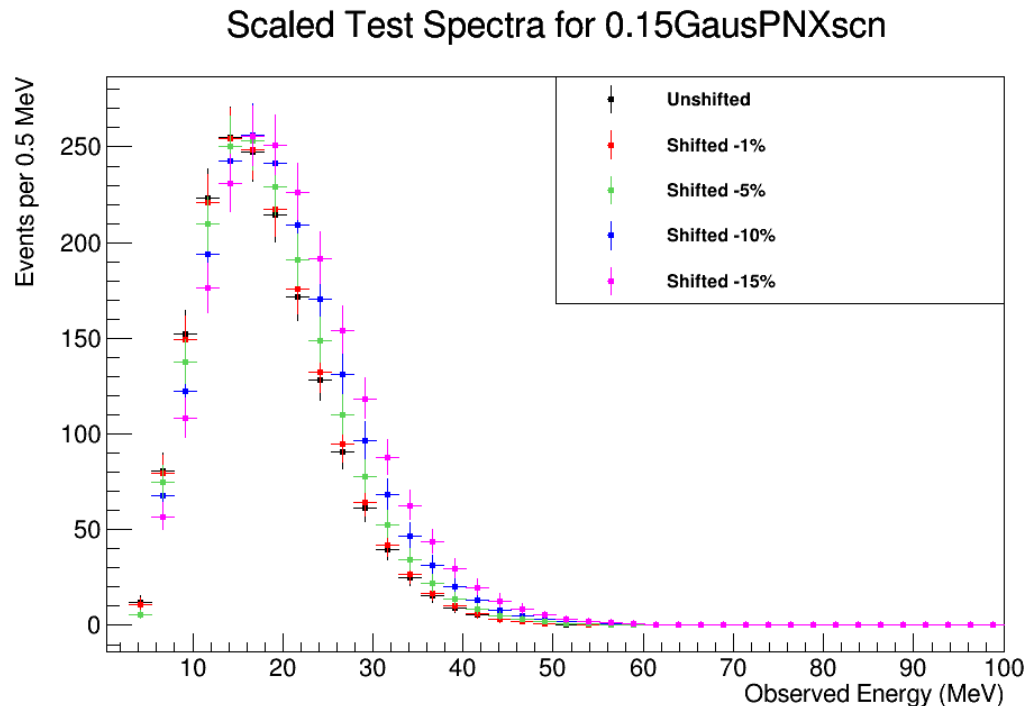
Fractional difference from truth for  $\epsilon$



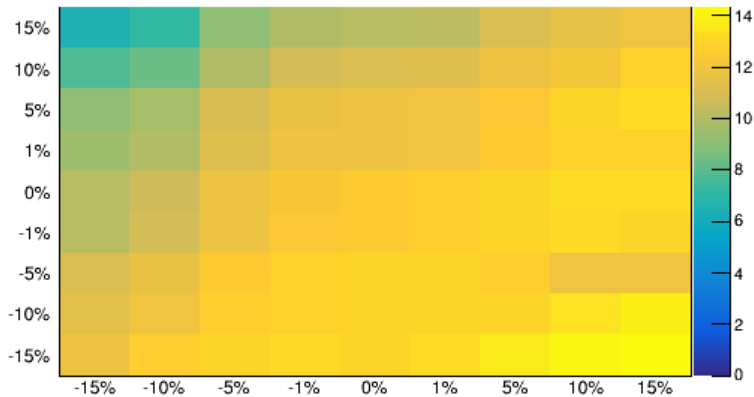
How well do we need to know our energy scale?

# Energy Scaling: Introduction

- Goal: quantify how uncertainties in energy spectra affect DUNE's ability to predict SN flux model parameters
- Scale the energy spectra by  $\pm 1\%$ ,  $5\%$ ,  $10\%$ ,  $15\%$
- Take every combination of scaled spectra for grid, test spectra
  - Determine the sensitivity regions, best-fit parameters  $\rightarrow$  81 total combinations



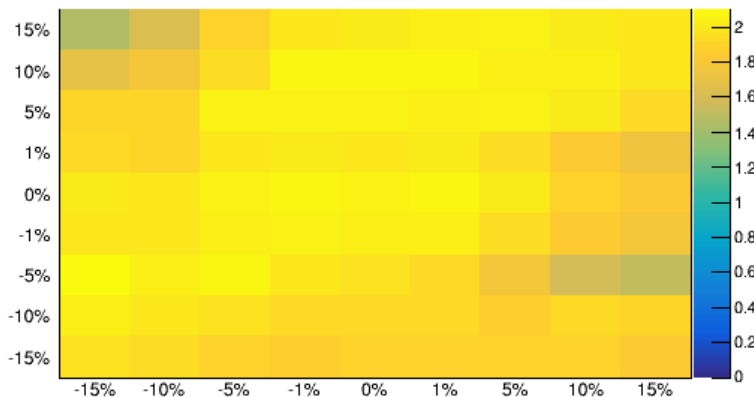
Contour Areas for  $\alpha$  vs.  $\langle E_V \rangle$



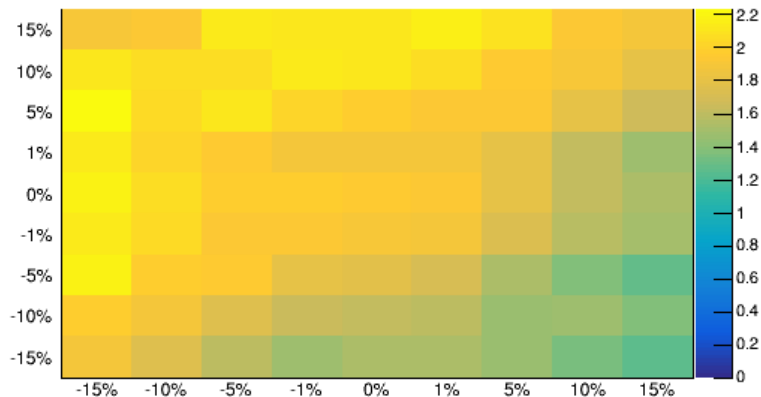
## 2D Contour Area Plot:

- Color scale indicates the contour area
- Some of the more drastic differences in contour area might be due to grid boundaries – see sensitivity regions in backup

Contour Areas for  $\epsilon$  vs.  $\langle E_V \rangle$

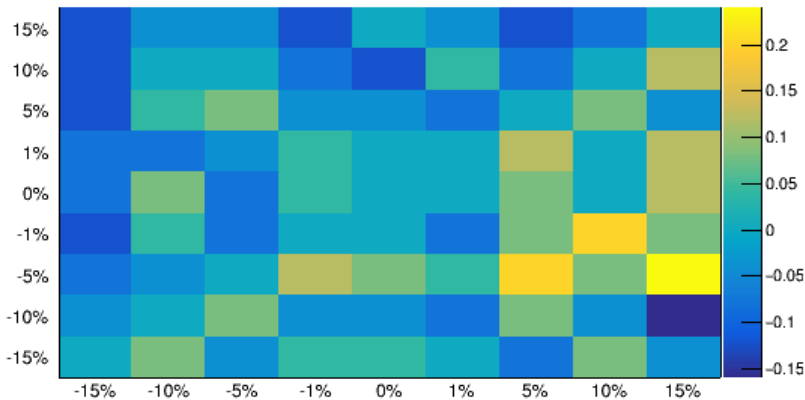


Contour Areas for  $\epsilon$  vs.  $\alpha$



Grid Energy Spectra Scaling

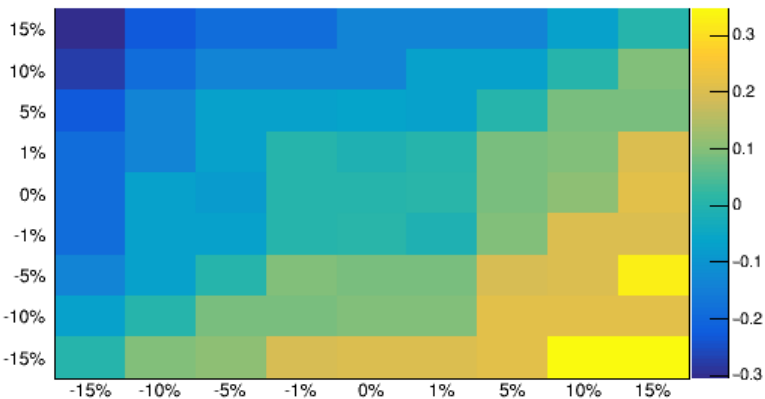
Fractional difference from truth for  $\alpha$



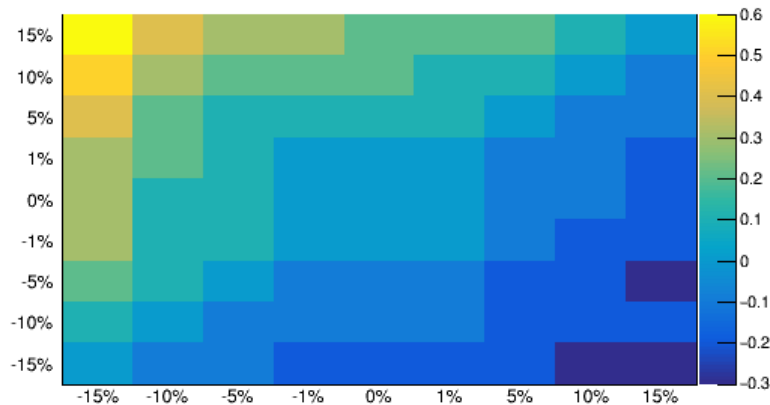
## 2D Fractional Difference Plot:

- Color scale indicates the fractional difference from truth for the best-fit parameters
- We see that  $\varepsilon$  is most affected by incorrect energy scaling assumptions

Fractional difference from truth for  $\langle E_v \rangle$



Fractional difference from truth for  $\varepsilon$



Grid Energy Spectra Scaling

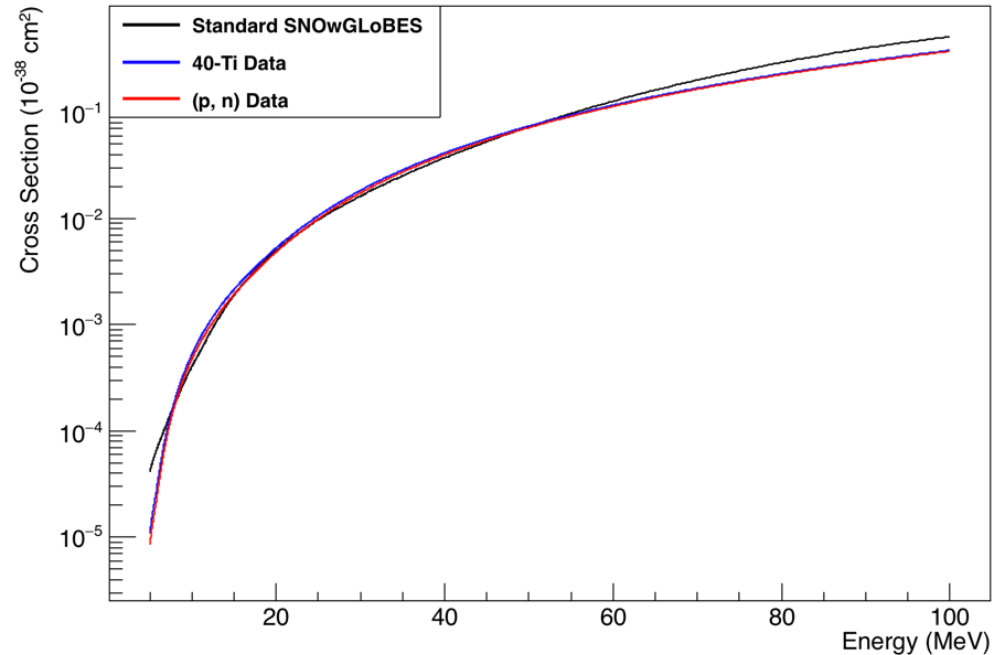


How well do we have to know the cross section?

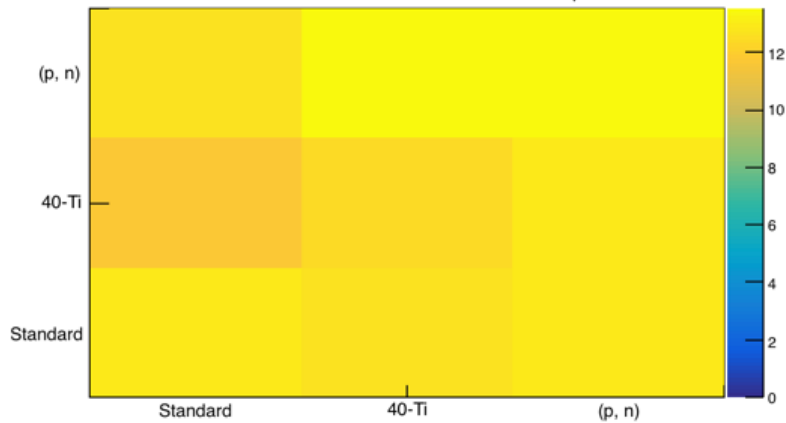
# Cross Section: Introduction

- Initiated study to determine how cross section affects forward fitting – what if our cross section model assumptions are incorrect?
- Change cross section among three models:
  - Standard SNOwGLoBES
  - Two MARLEY cross sections:
    - $^{40}\text{Ti}$
    - (p, n)

Cross Section vs. Energy from Different Sources



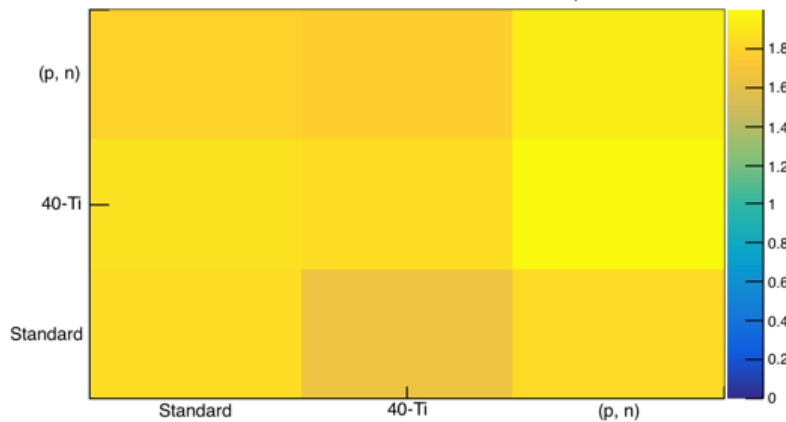
Contour Areas for  $\alpha$  vs.  $\langle E_v \rangle$



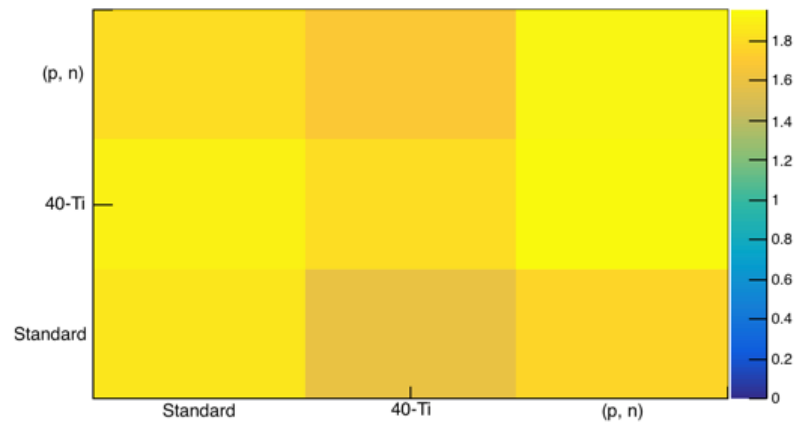
## 2D Contour Area Plot:

- X-axis: cross section used to generate grid
- Y-axis: cross section used to generate test spectra
- No big differences in contour areas – indicates that uncertainties in cross sections has small effect on sensitivity regions

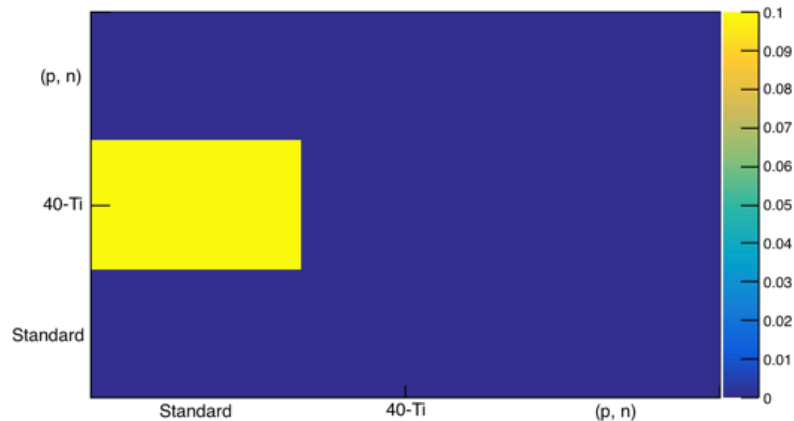
Contour Areas for  $\epsilon$  vs.  $\langle E_v \rangle$



Contour Areas for  $\epsilon$  vs.  $\alpha$



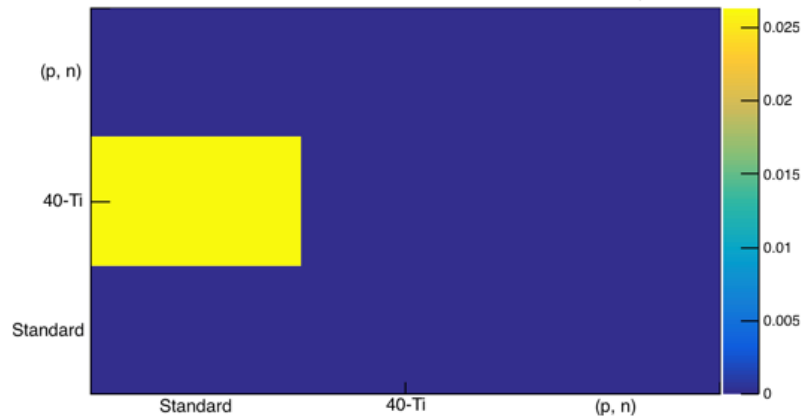
Fractional difference from truth for  $\alpha$



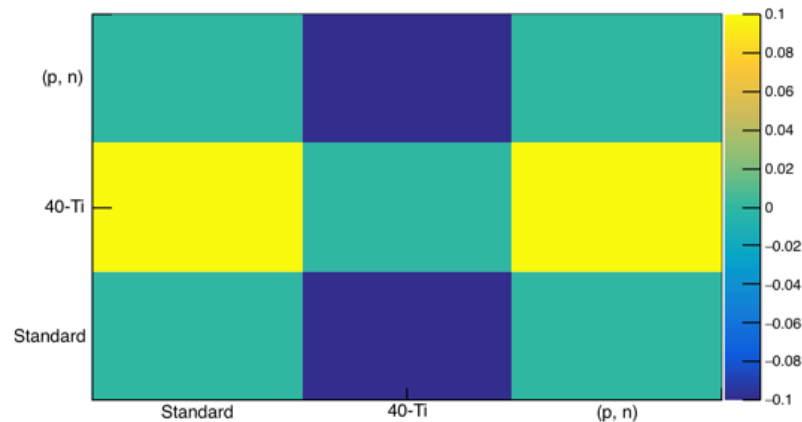
## 2D Fractional Difference Plot:

- X-axis: cross section used to generate grid
- Y-axis: cross section used to generate test spectra

Fractional difference from truth for  $\langle E_v \rangle$

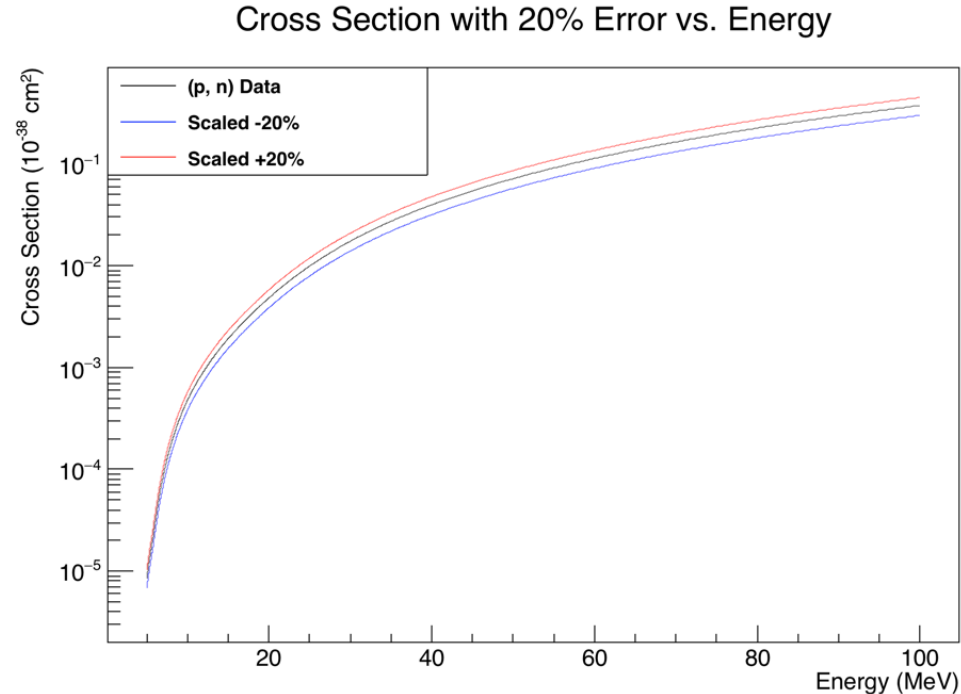


Fractional difference from truth for  $\epsilon$

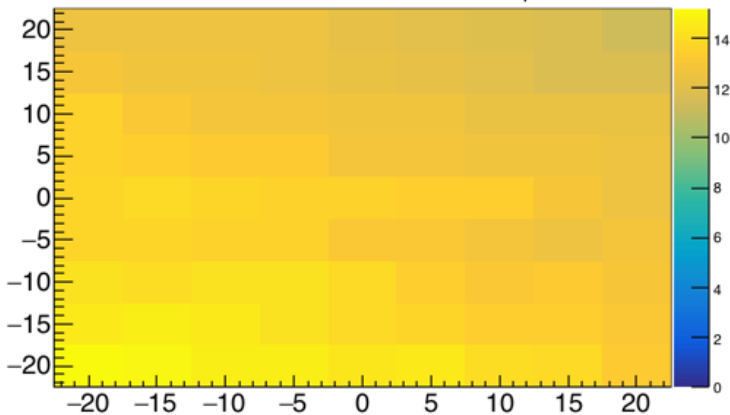


# Cross Section Uncertainty: Introduction

- Goal: quantify how uncertainties in the  $\nu_e - \text{Ar40}$  cross section affect DUNE's ability to predict SN flux model parameters
- Scale the cross section by  $\pm 5\%$ ,  $10\%$ ,  $15\%$ ,  $20\%$   $\rightarrow$  9 different cross section “models”
  - Take every combination of test spectra + grid and determine the sensitivity regions, best-fit parameters  $\rightarrow$  81 total combinations



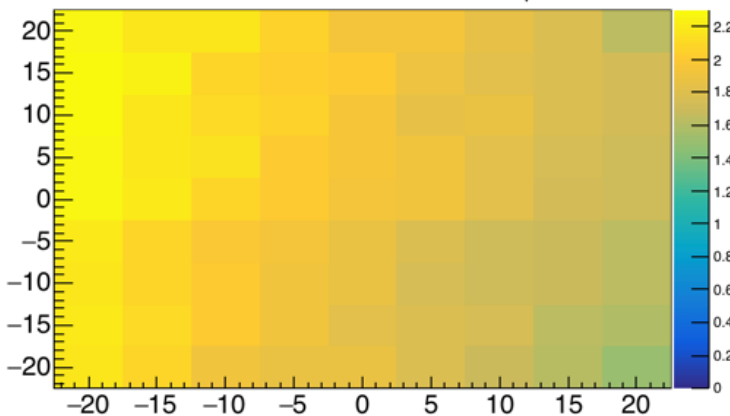
Contour Areas for  $\alpha$  vs.  $\langle E_v \rangle$



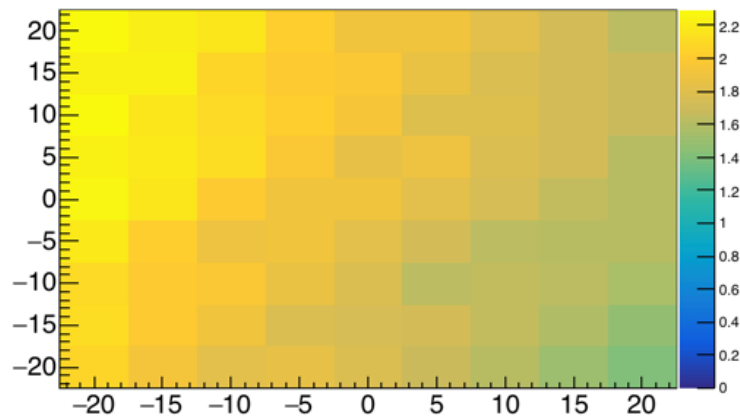
## 2D Contour Area Plot:

- Color scale indicates the contour area
- We see relatively small differences in the contour area  $\rightarrow$  sensitivity regions remain about the same size for all combinations

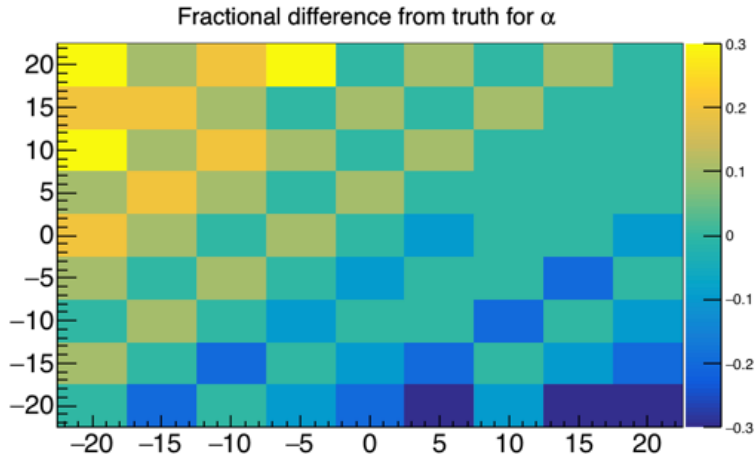
Contour Areas for  $\epsilon$  vs.  $\langle E_v \rangle$



Contour Areas for  $\epsilon$  vs.  $\alpha$

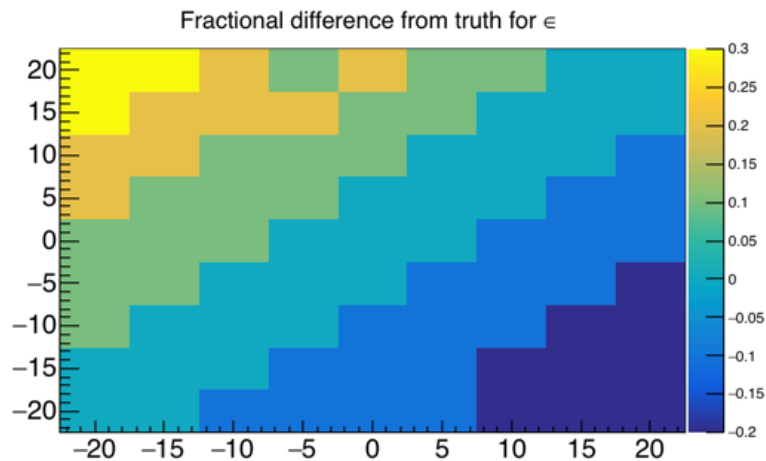
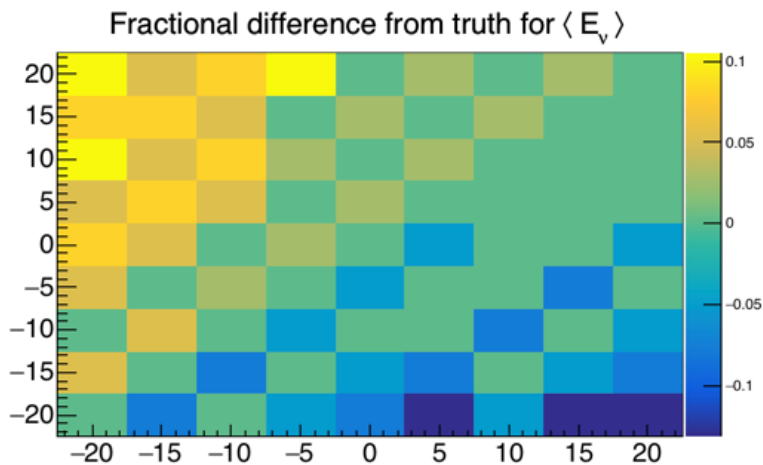


Grid Cross Section Scaling



## 2D Fractional Difference Plot:

- Color scale indicates the fractional difference from truth for the best-fit parameters
- Weird oscillation behavior might be caused by grid spacing; see superimposed sensitivity regions in backup



Grid Cross Section Scaling

# Takeaways + Next Steps

- Forward fitting studies help show DUNE's ability to constrain SN flux parameters for various detector parameter assumptions
  - The 2D contour area and fractional difference plots show how DUNE's predictions change for incorrect assumptions
- These studies also quantifies bias in spectral parameter predictions under incorrect assumptions; for example, consider  $\varepsilon$ :
  - Energy resolution: 21.2% resolution yields -20% to +20% bias on  $\varepsilon$
  - Energy scaling: +15% scaling yields -30% to +60% bias on  $\varepsilon$
  - Cross section: 20% uncertainty yields -20% to +30% bias on  $\varepsilon$
- Some next steps:
  - Update grids for some studies
  - Cross section shape systematics study
  - Fake supernovae method for all studies

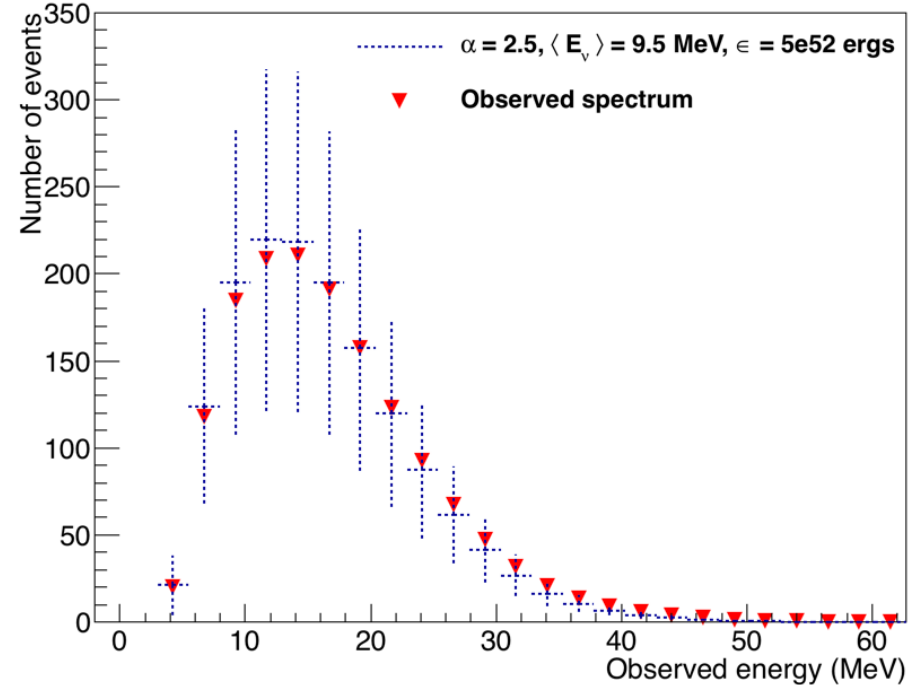


# Backup Slides

# Forward Fitting: Fake Supernova Sample

- Take  $\nu_e$  flux parameters from [Rosso et al.](#):  $(\alpha, \langle E_\nu \rangle, \varepsilon) = (2.5, 9.5, 0.5 \times 10^{53})$
- Use SNOwGLoBES to make smeared energy spectra using this flux + smearing matrix
- Sample randomly from this spectra to generate “fake supernovae” test spectra
- Many fake supernovae  $\rightarrow$  distribution of best-fit parameters based on  $\chi^2$  minimization

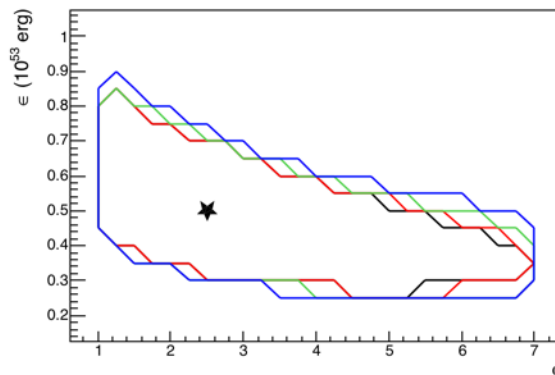
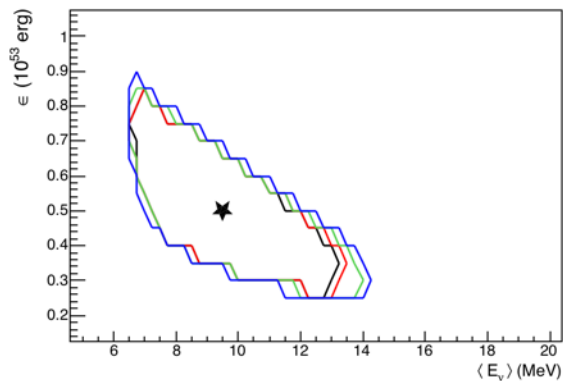
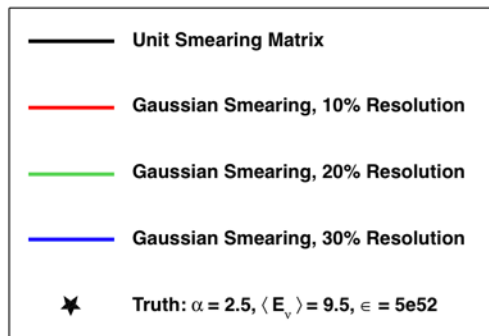
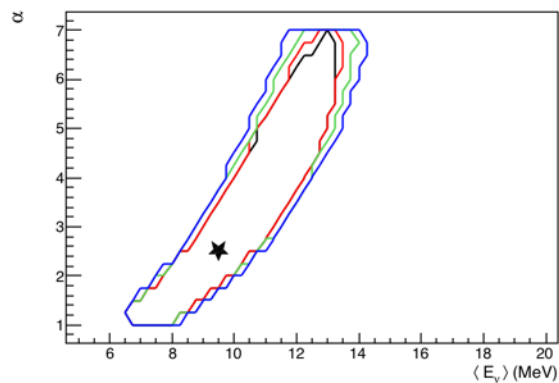
Example Fake Supernova Spectrum



Backup Slides

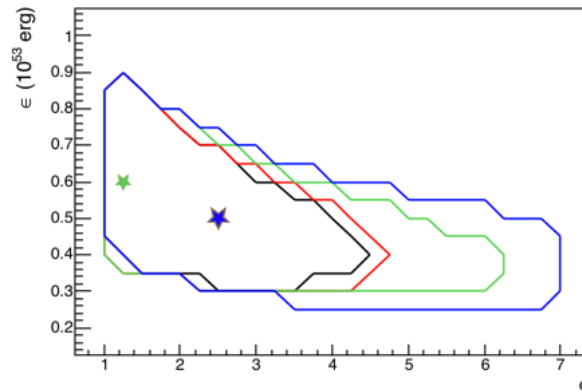
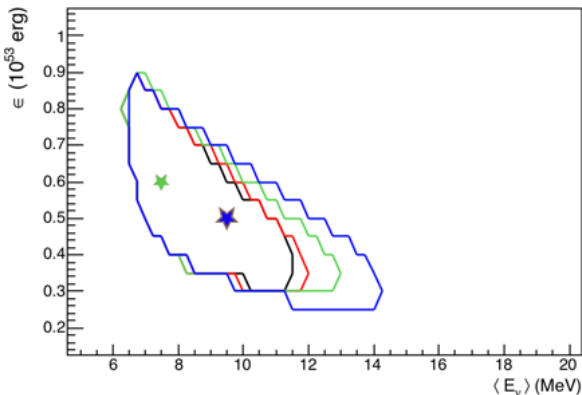
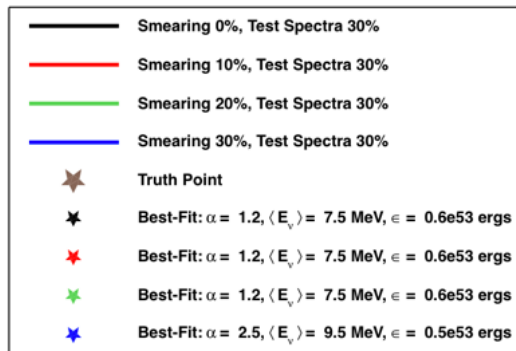
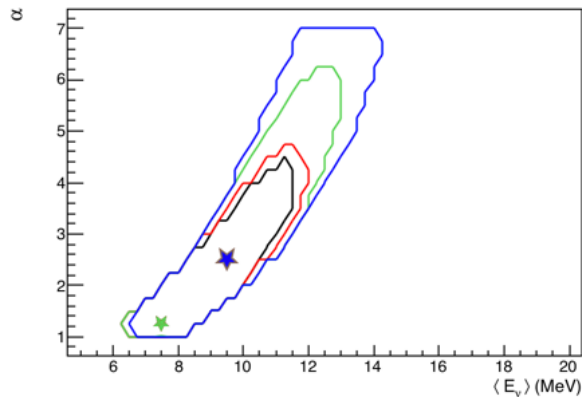
**ENERGY RESOLUTION STUDY**

# Contours from the Diagonal



Note: these set of contours were produced before I included finer bins

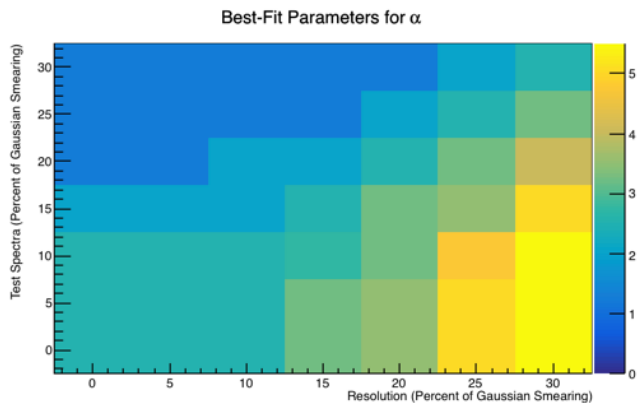
# Contours with Best-Fit Points: “Top Row”



Notes:

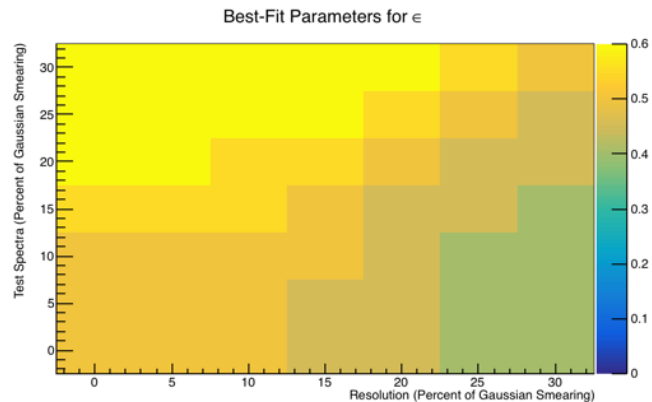
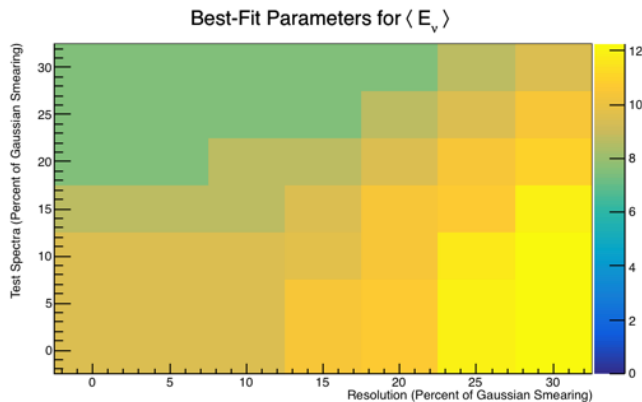
- These set of contours were produced before I included finer bins
- “Top row” refers to the combinations of grid/test spectra resolutions in the top row of the 2D contour area plot

# Best-Fit Values

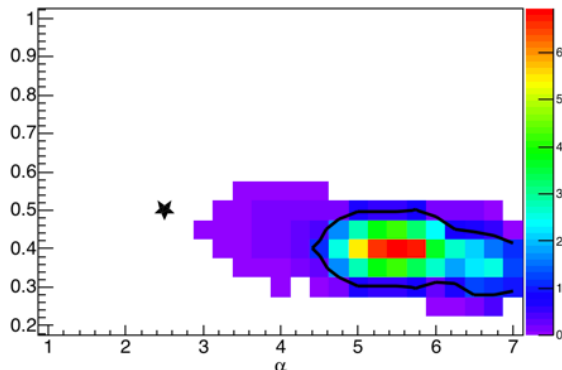
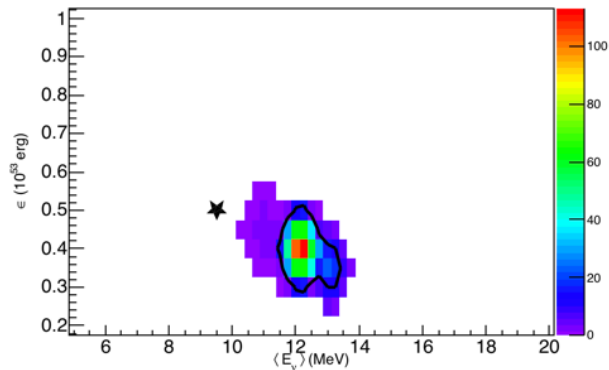
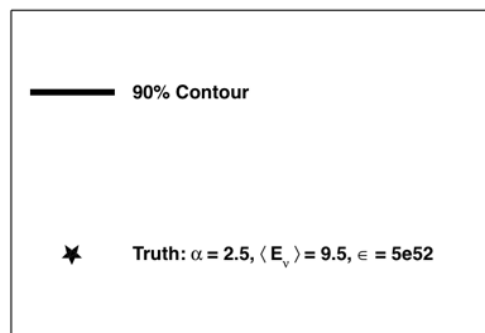
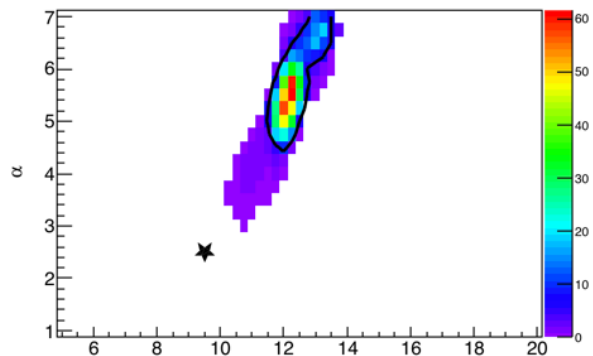


Notes:

- The diagonal, lower quadrant of [0, 10] (resolution) best-fit back to truth
- If our smearing assumptions are lower than reality: Test spectra with true 20-30% smearing predict lower values of  $\alpha$ ,  $E_0$ ; higher values of luminosity
- If our smearing assumptions are higher than reality: Test spectra with true 0-10% smearing predict higher values of  $\alpha$ ,  $E_0$ ; lower values of luminosity



# Fake Supernova Spectra Example



Notes:

- This example uses a grid with 30% resolution + test spectra with 10% resolution
- 1000 randomly generated supernovae spectra at 10kpc from Earth
- Here we see the bias in DUNE's predictions from an incorrect resolution assumption
- The bias is more significant than I expected...need to look into it more

Backup Slides

**ENERGY SHIFT STUDY**



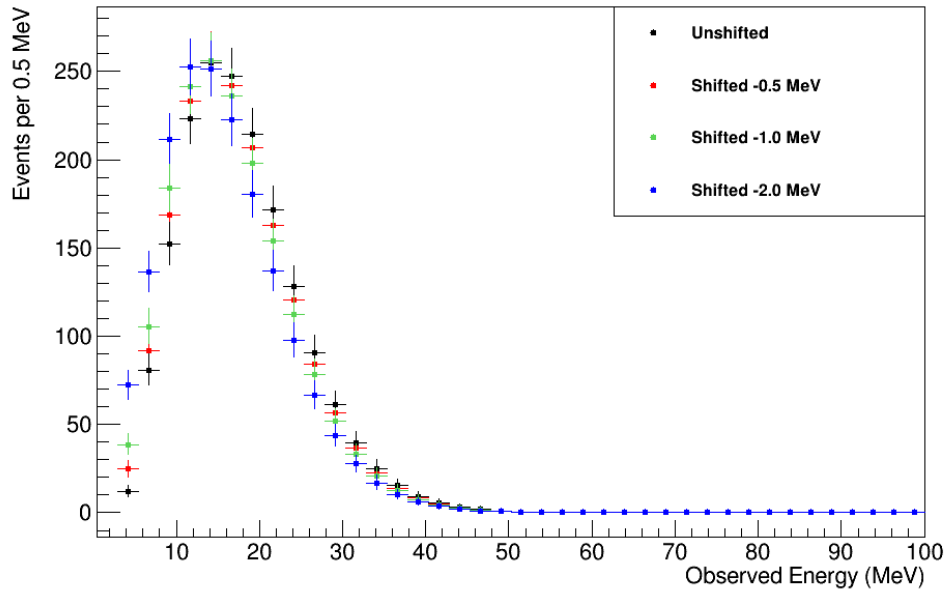
# Introduction

- Goal: determine how shifting the “test” energy spectra changes the forward fitting results
  - Context: direct unfolding dramatically affected by shifting the energy scale
- Initial studies: Gaussian smearing with 15% resolution
  - MARLEY (p, n) cross section; 100% above threshold efficiency; no oscillations
  - Shifted that test spectrum by  $\pm 0.5, 1, 2$  MeV
- Then did forward fit using sensitivity/Asimov method for 10kpc SN:
  - Grid: unshifted 15% resolution
  - Changed the test spectra’s shift

# Test Spectra + Shifts

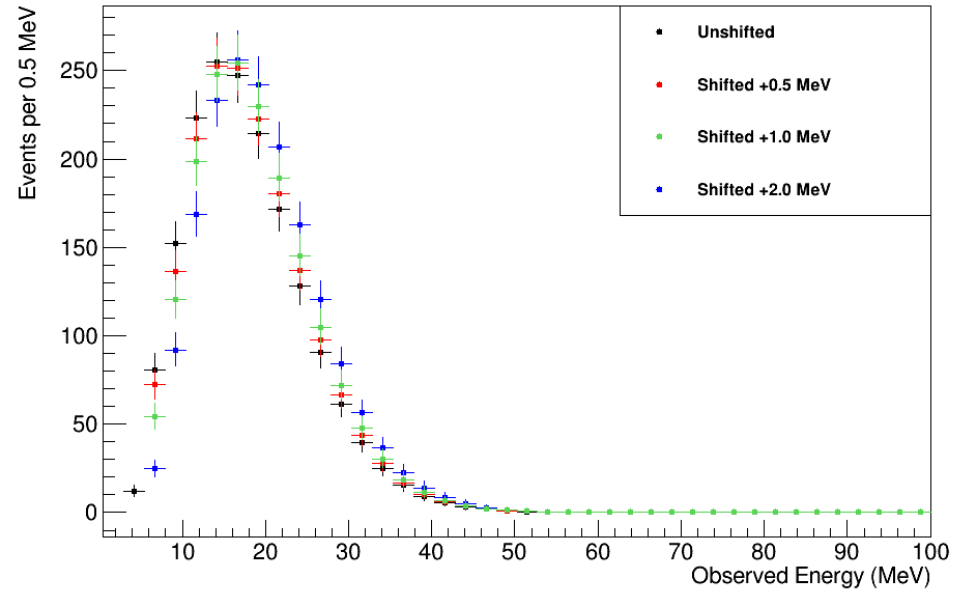
## Left-ward/Negative Shifts

Shifted Test Spectra for 0.15GausPNXscn



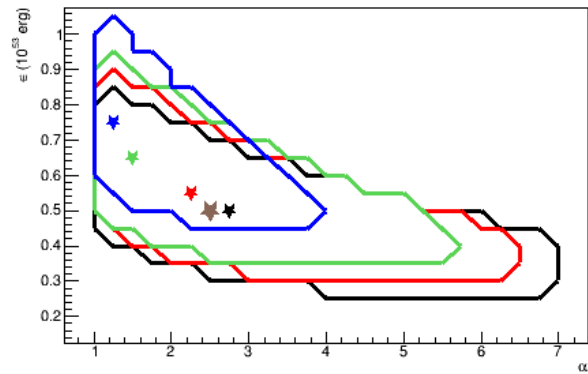
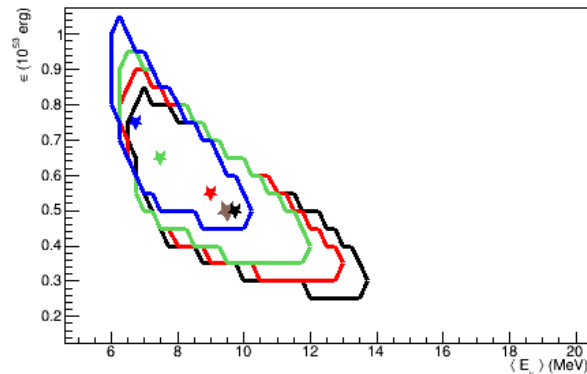
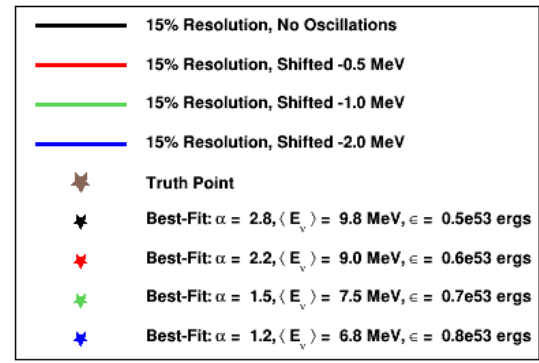
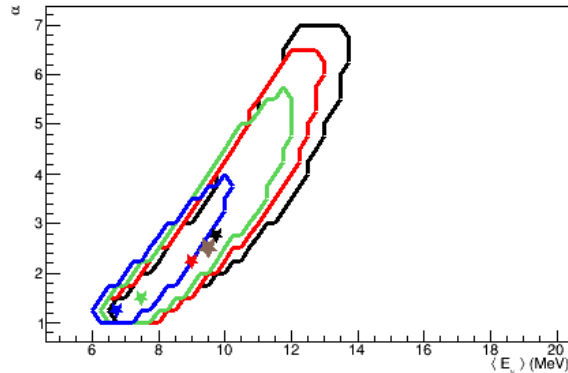
## Right-ward/Positive Shifts

Shifted Test Spectra for 0.15GausPNXscn



Sanity check that the shifts are working as expected!

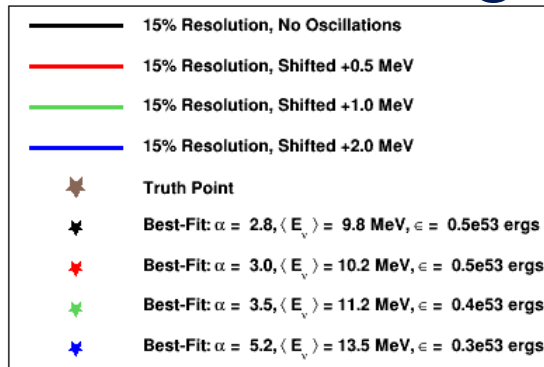
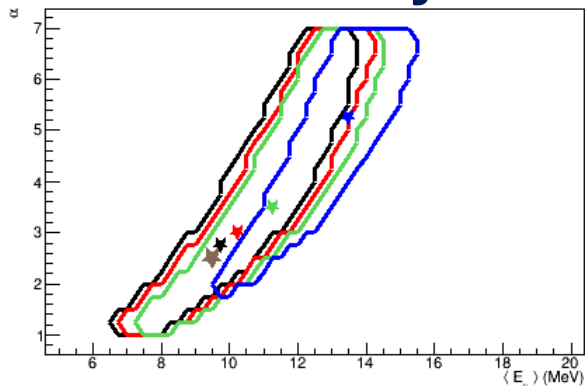
# Sensitivity Method: Negative/Left Shift



## Notes:

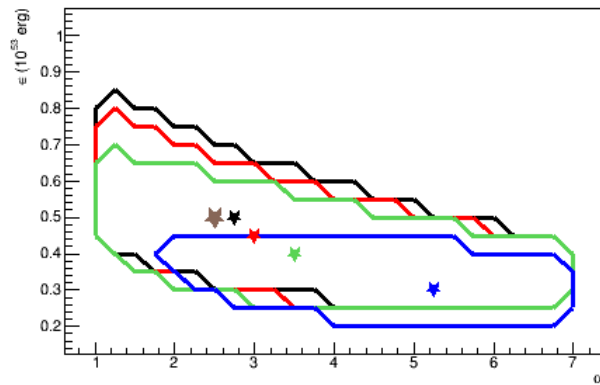
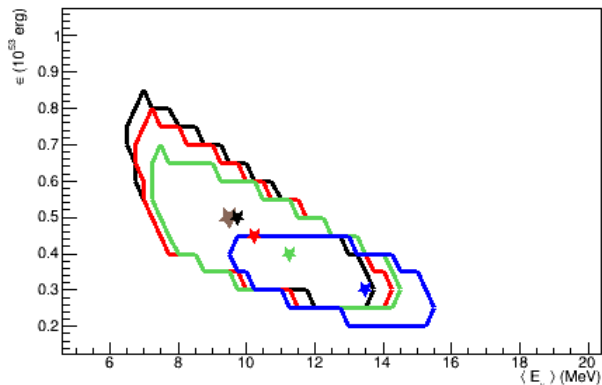
- The contours + best-fit points show how the predictions are biased if we incorrectly assume the energy scale
- The contours probably extend beyond the grid boundaries

# Sensitivity Method: Positive/Right Shift



Notes:

- The contours + best-fit points show how the predictions are biased if we incorrectly assume the energy scale
- We also see that the bias is different compared to the other shift!

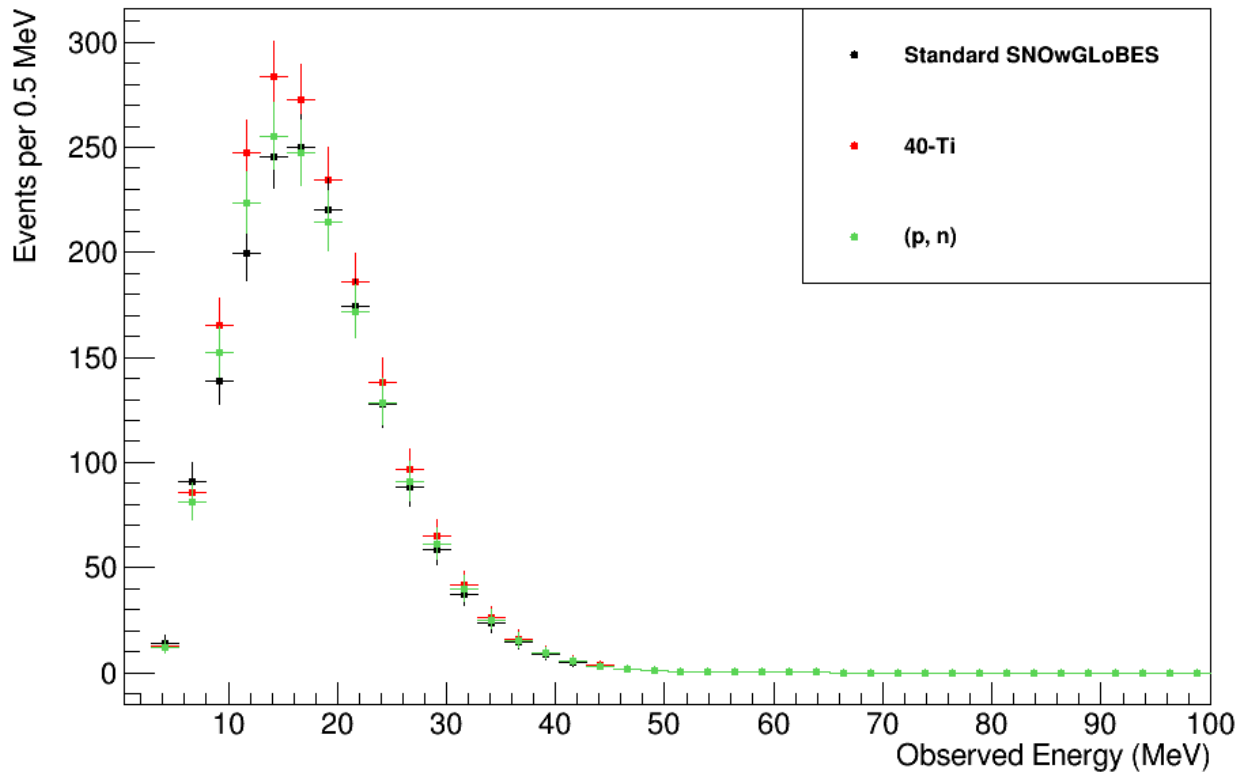


Backup Slides

**CROSS SECTION STUDY**

# Comparing the Test Spectra

Test Spectra: 15% Resolution + Different Cross Sections



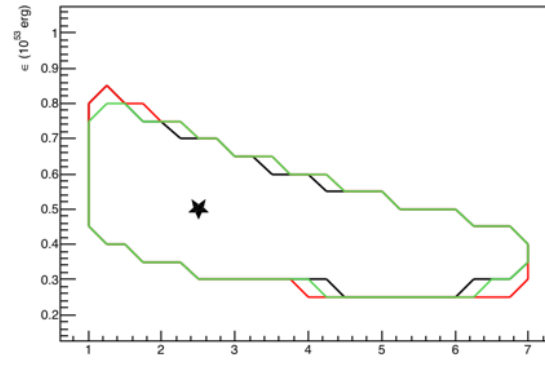
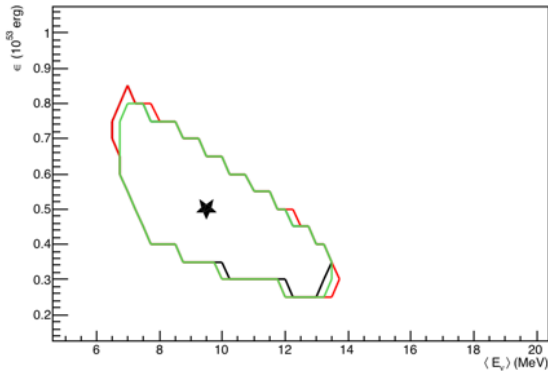
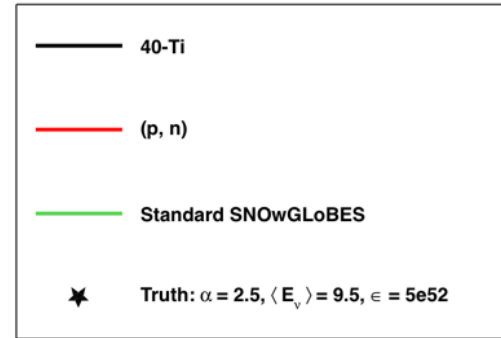
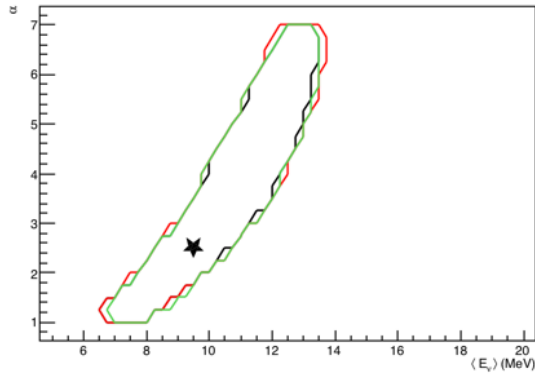
Total number of events:

- Standard  
SNOwGLoBES: 1702.94
- 40-Ti: 1894
- (p,n): 1740.35

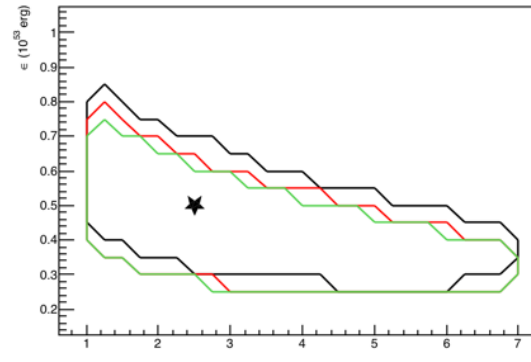
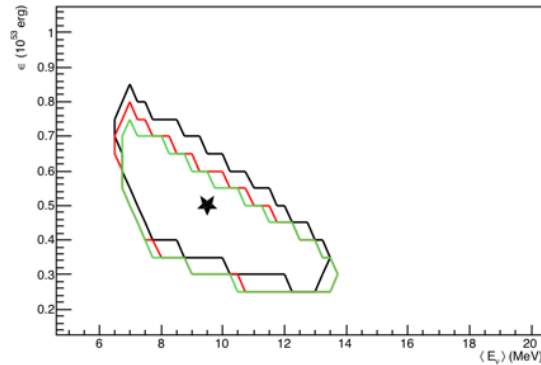
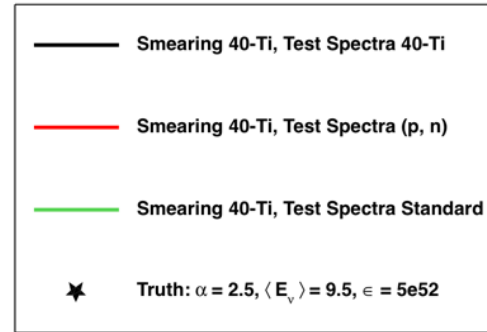
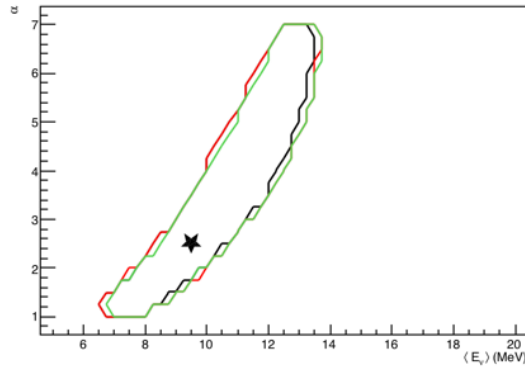
Notes:

- Error bars are statistical
- Since  $\varepsilon$  related to statistics, naively expect biggest tension(s) in  $\varepsilon$  best-fit between standard, 40-Ti

# Contours from the Diagonal



# Contours from Middle Column

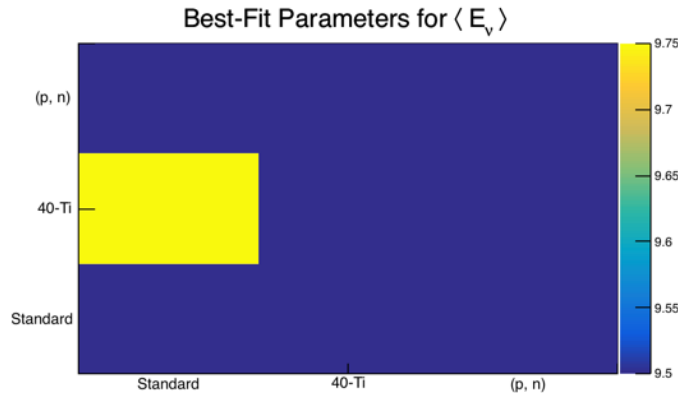
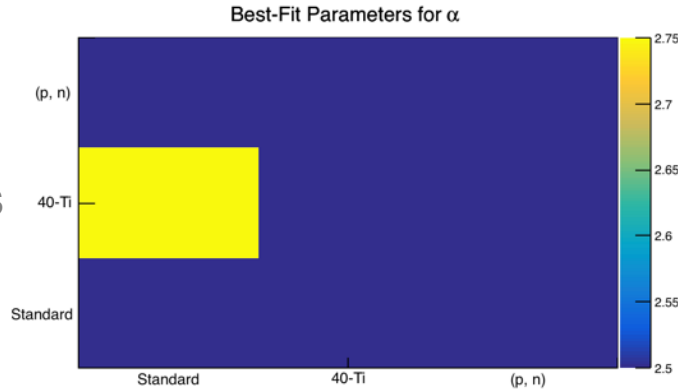




# 2D Best-Fit Parameter Plot: Cross Section Study

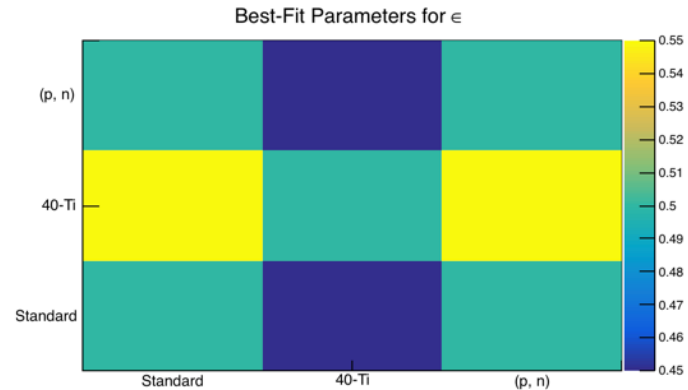
X-axis: cross section used to generate grid

Y-axis: cross section used to generate test spectra

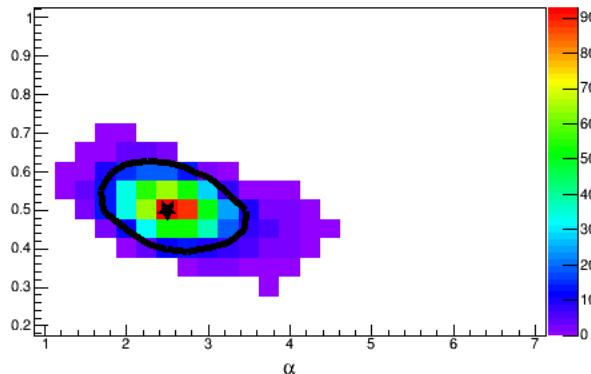
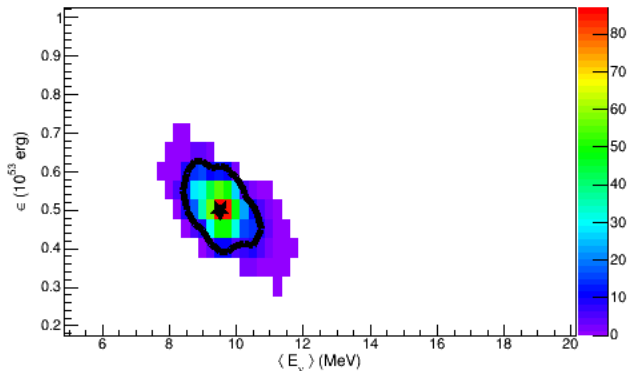
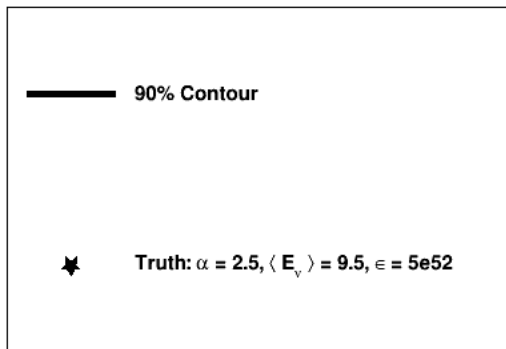
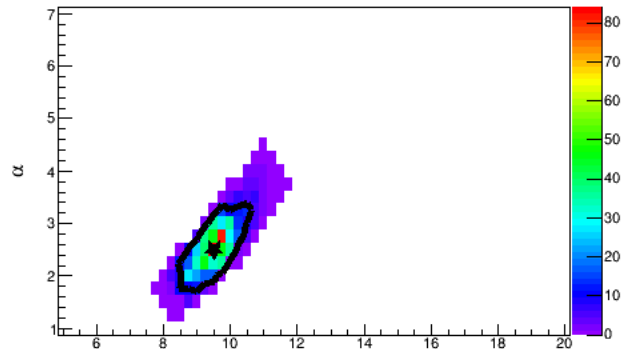


Notes:

- The z-scale is not zero suppressed! This was done on purpose to better differentiate the elements
- We see relatively light tension for  $\alpha$ ,  $\langle E_\nu \rangle$ ; more tension for  $\epsilon$
- We see biggest tensions in  $\epsilon$  between standard SNOwGLoBES cross section, 40-Ti cross section (expected from looking at test spectra)



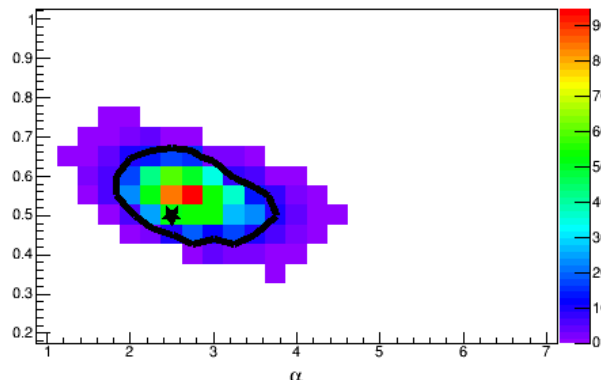
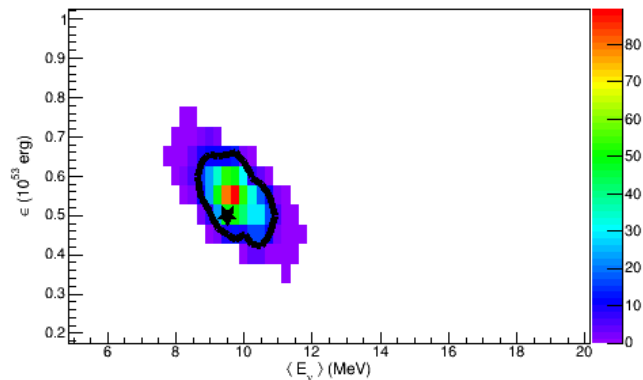
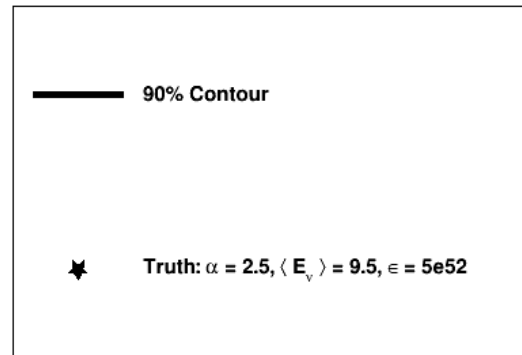
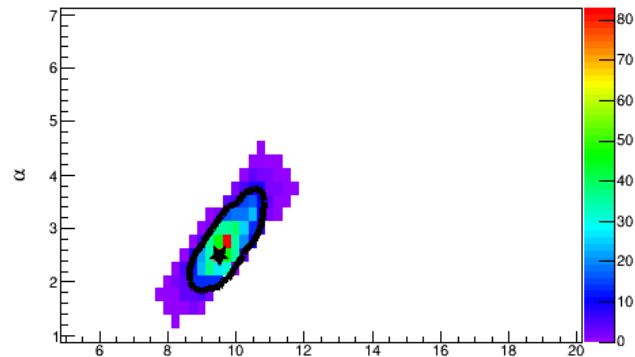
# Fake Supernovae Spectra: Standard vs. (p,n)



Notes:

- Used grid with standard SNOWGLoBES cross section + test spectra with (p, n) cross section
- We see good agreement between the truth + randomly generated supernovae spectra!
- Indicates that cross section uncertainties have less impact on DUNE's best-fit ability versus resolution

# Fake Supernovae Spectra: Standard vs. 40-Ti



## Notes:

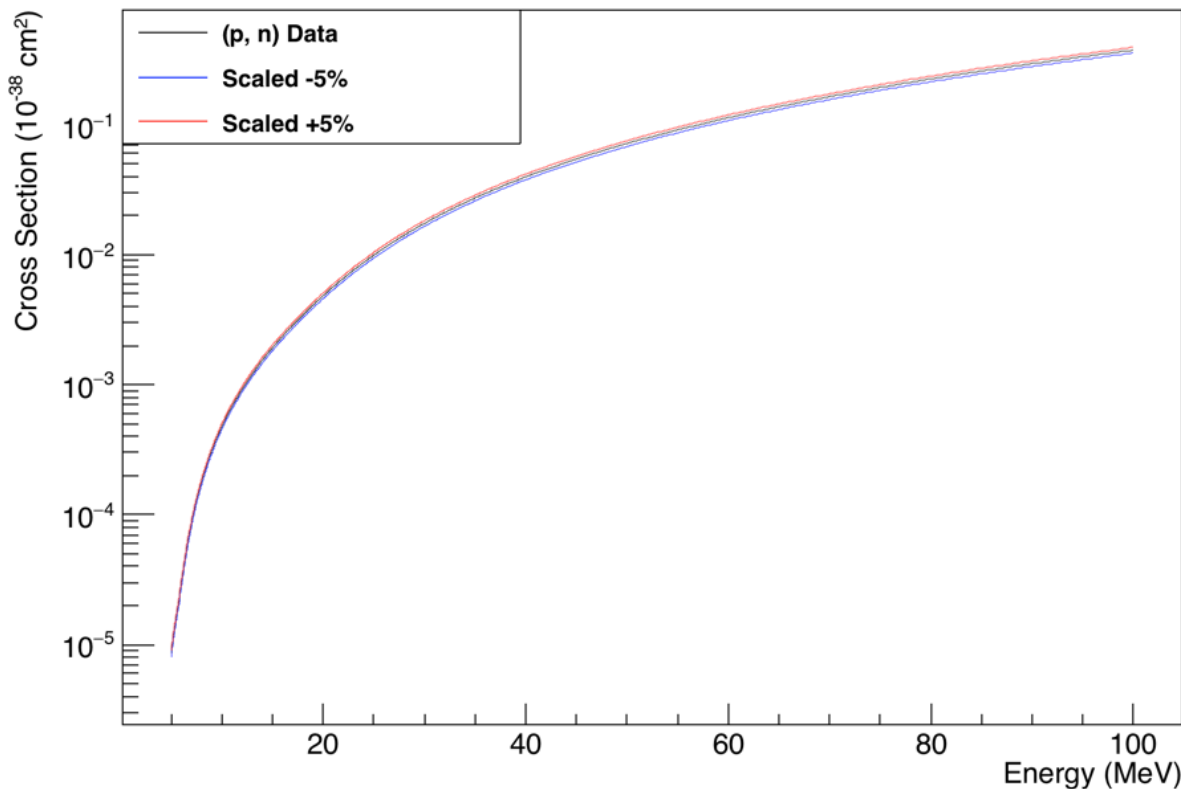
- Used grid with standard SNOwGLoBES cross section + test spectra with 40-Ti cross section
- We see a bias in the results; not as bad as the smearing studies
- Indicates that cross section uncertainties have less impact on DUNE's best-fit ability versus resolution, but there's still an impact.

Backup Slides

**CROSS SECTION UNCERTAINTY STUDY**

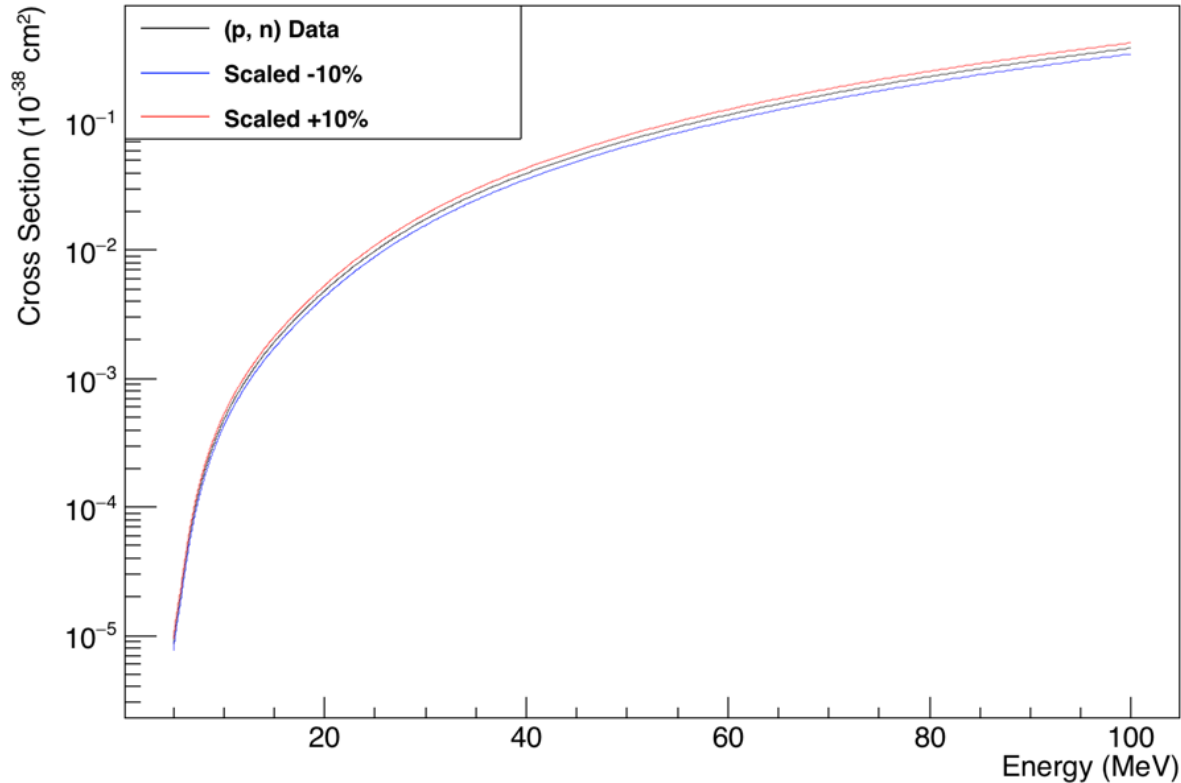
# Cross Section Vs. Energy: 5% Scaling

Cross Section with 5% Error vs. Energy



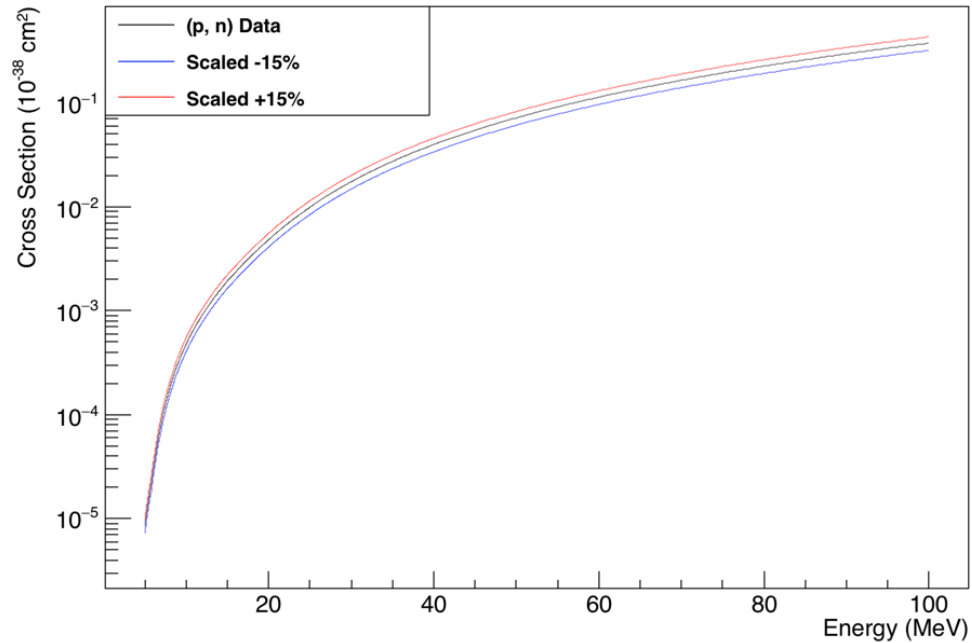
# Cross Section Vs. Energy: 10% Scaling

Cross Section with 10% Error vs. Energy



# Cross Section Vs. Energy: 15% Scaling

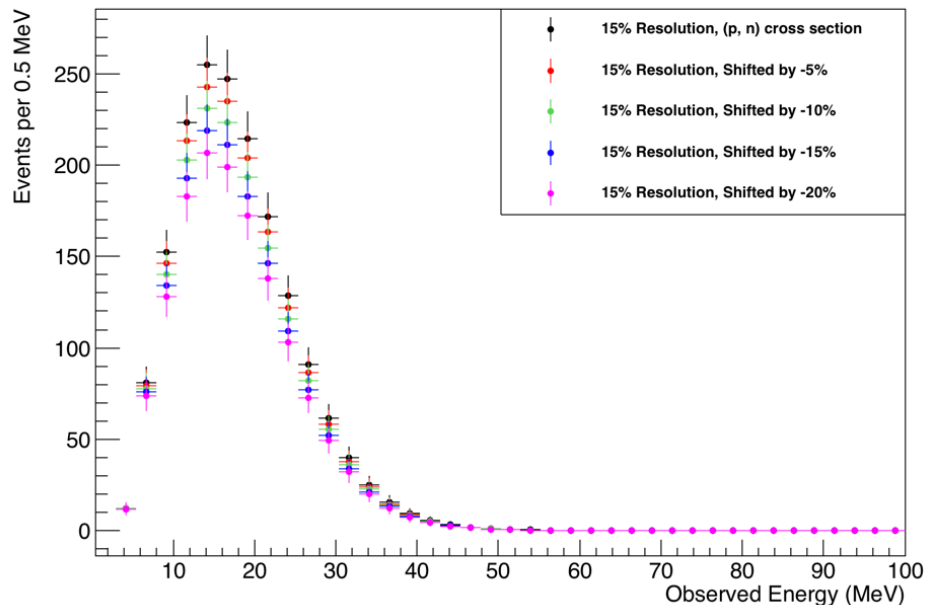
Cross Section with 15% Error vs. Energy



# Comparing the Test Spectra

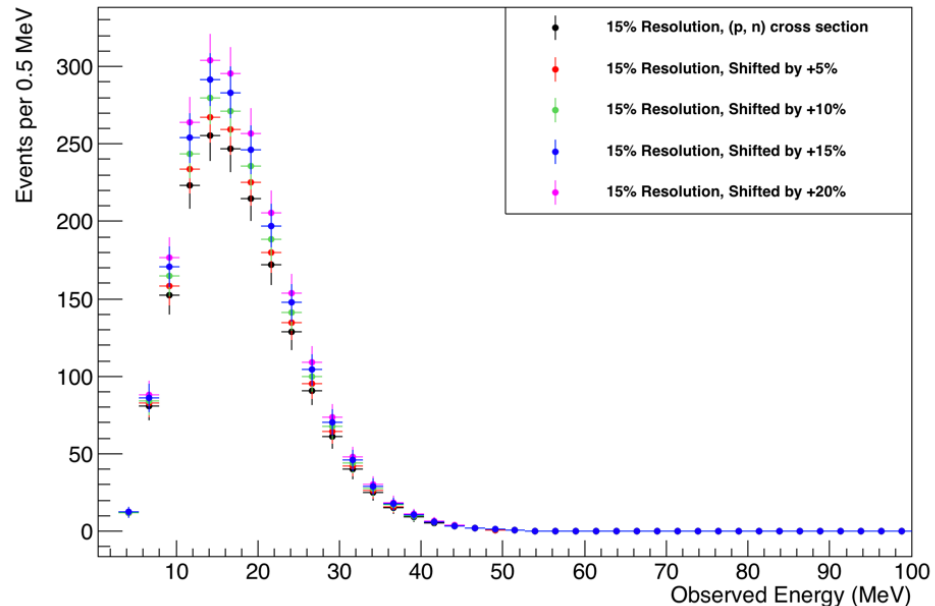
## Negative Scaling

Test Spectra: 15% Resolution + Different Cross Section Uncertainties



## Positive Scaling

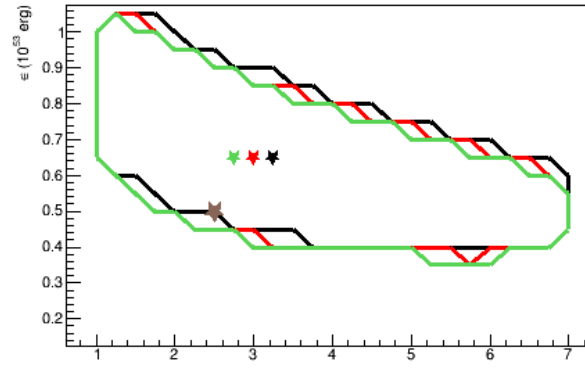
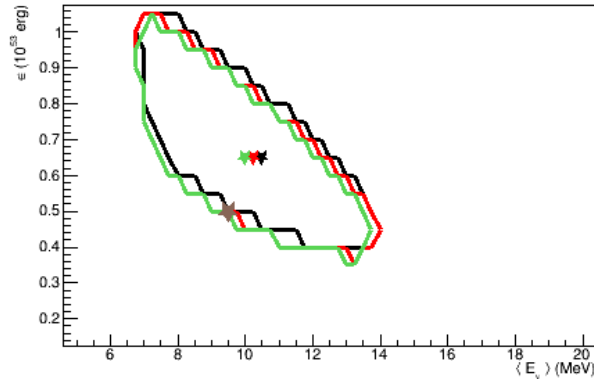
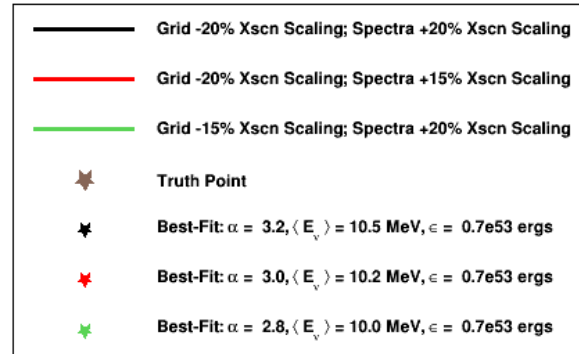
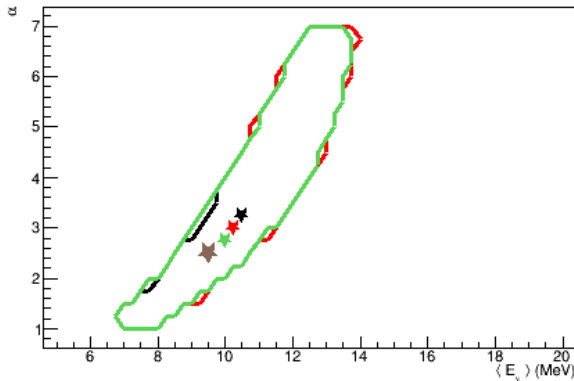
Test Spectra: 15% Resolution + Different Cross Section Uncertainties



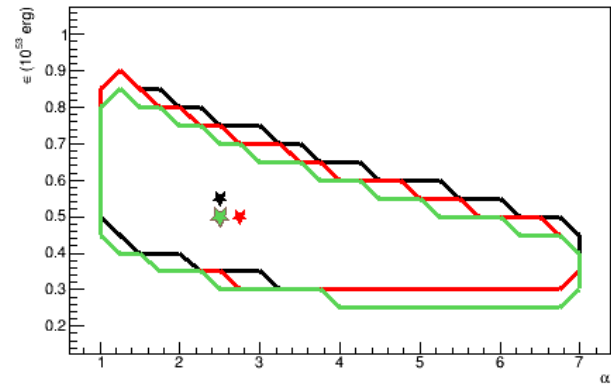
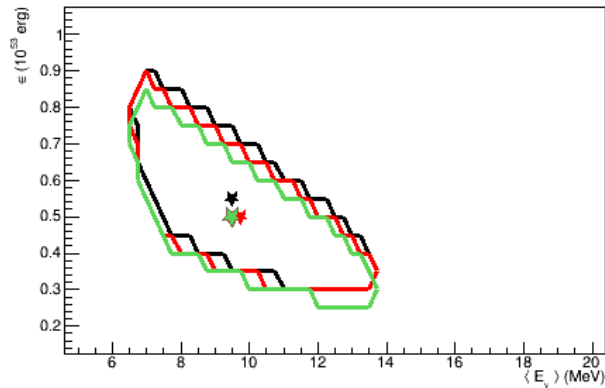
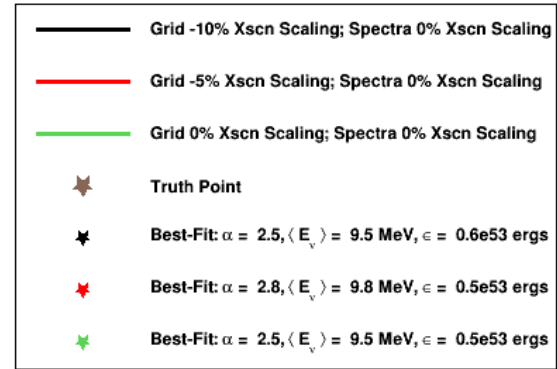
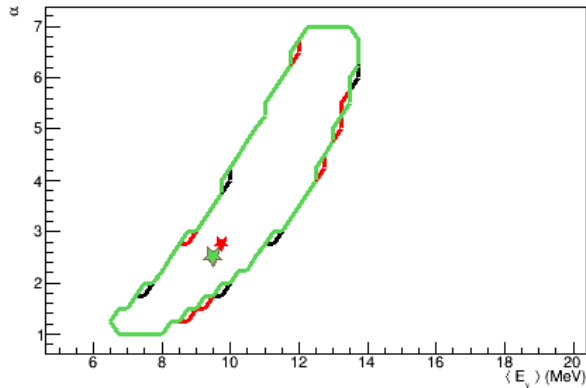
Expect  $\varepsilon$  to experience the most significant bias



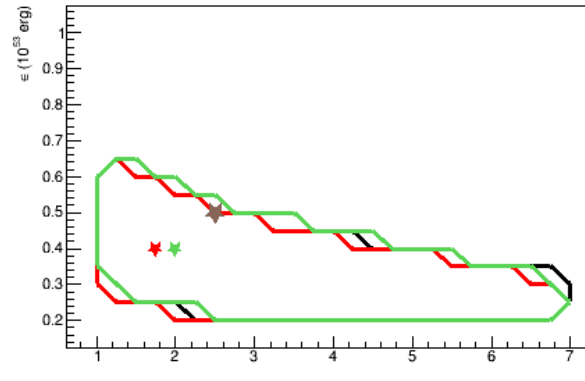
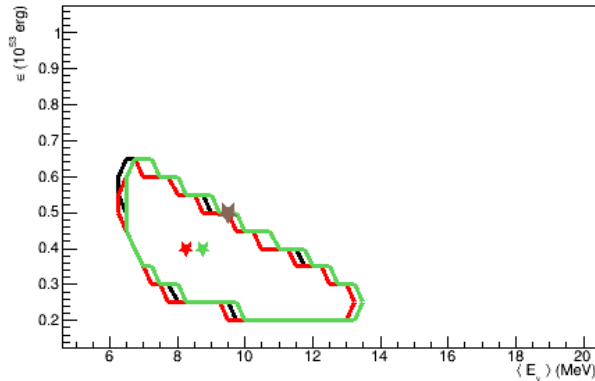
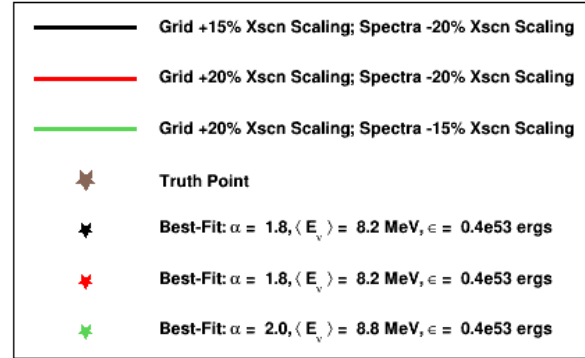
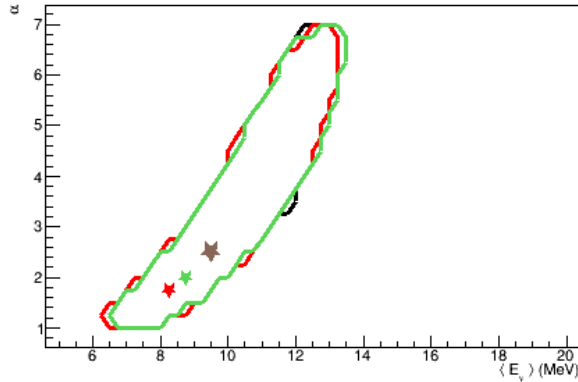
# Contours: Upper Left Corner



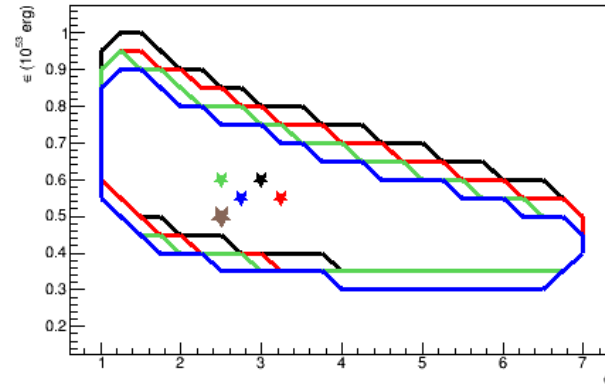
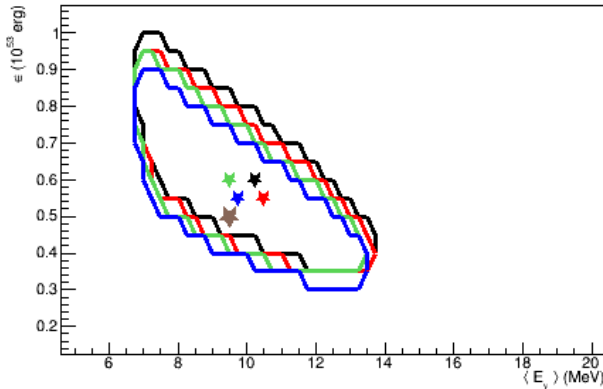
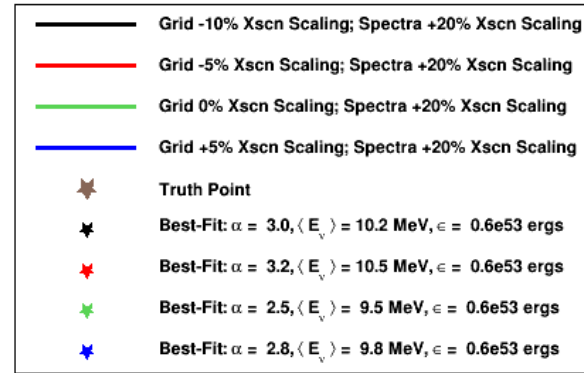
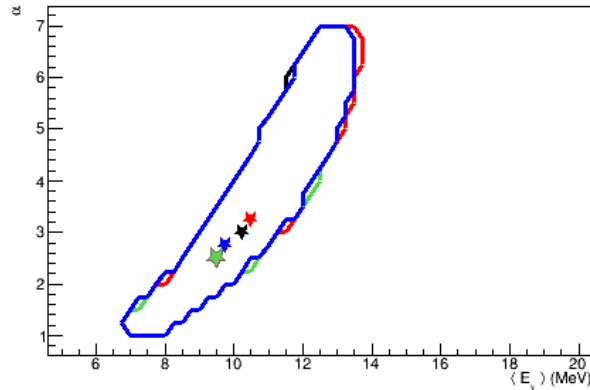
# Contours: Center



# Contours: Bottom Right Corner



# Contours: Top Row Elements

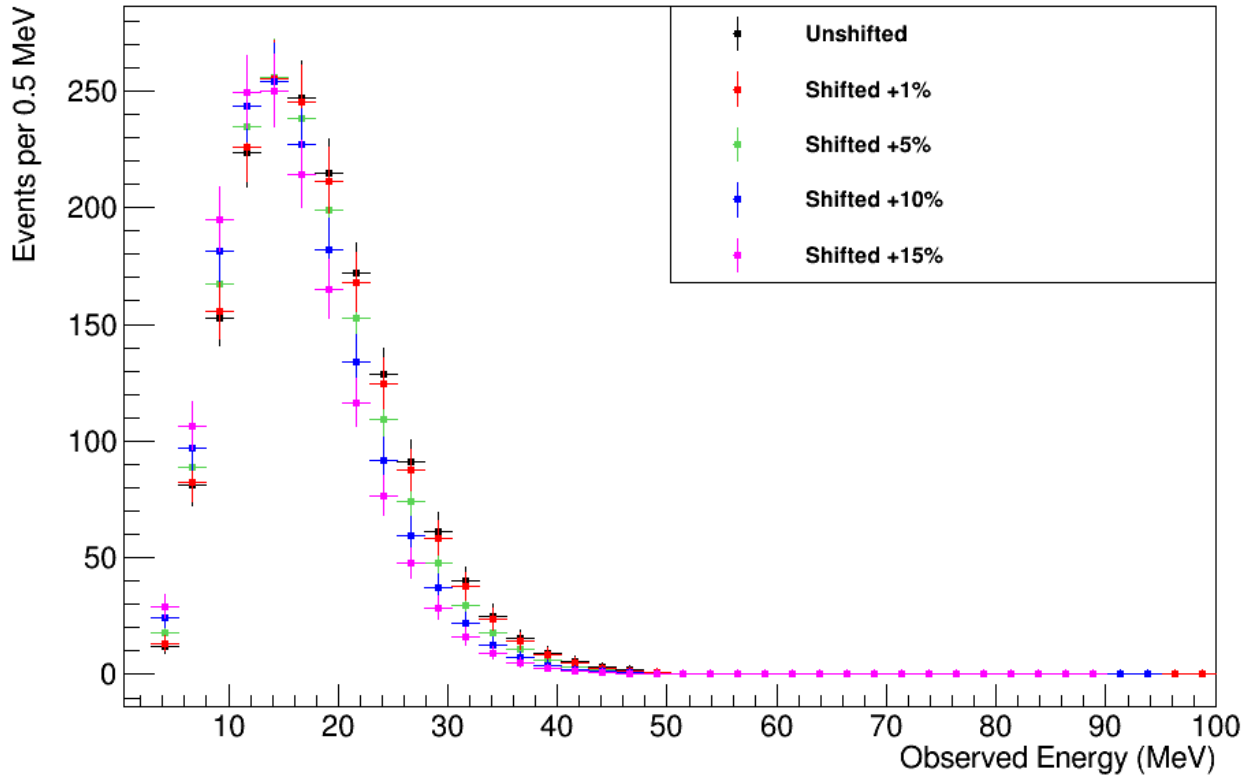


Backup Slides

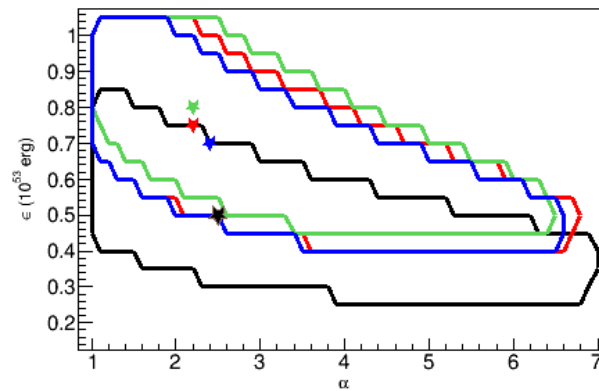
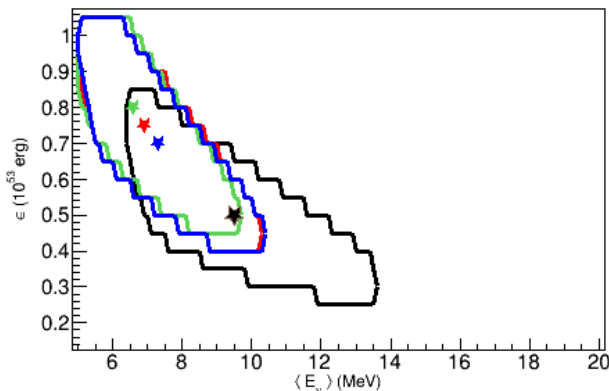
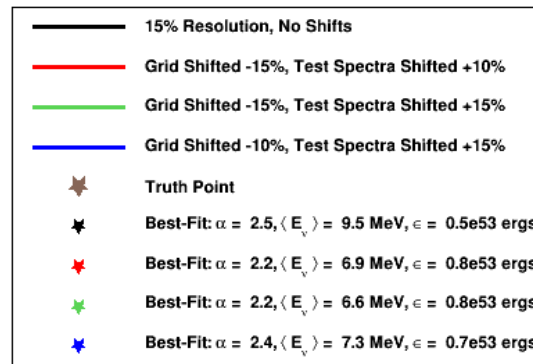
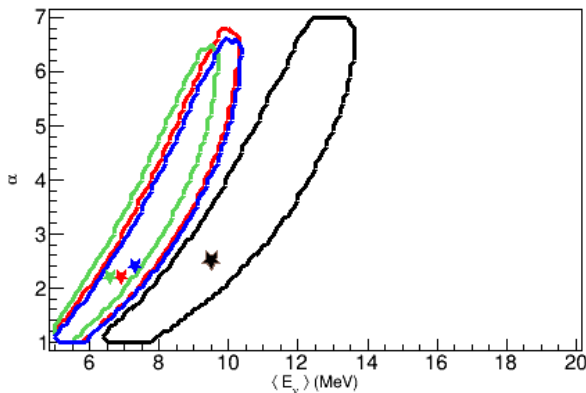
**ENERGY SCALING STUDY**

# Scaled by Energy Fraction: Test Spectra

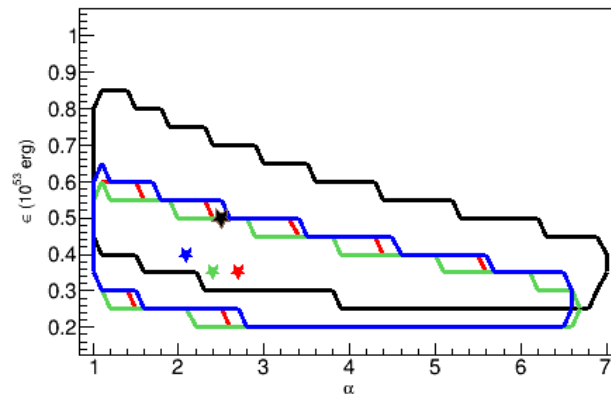
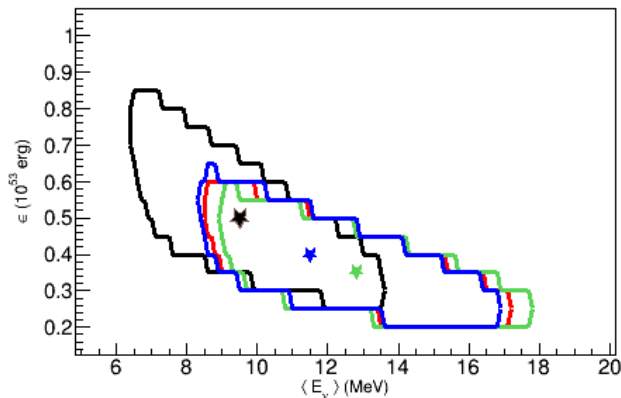
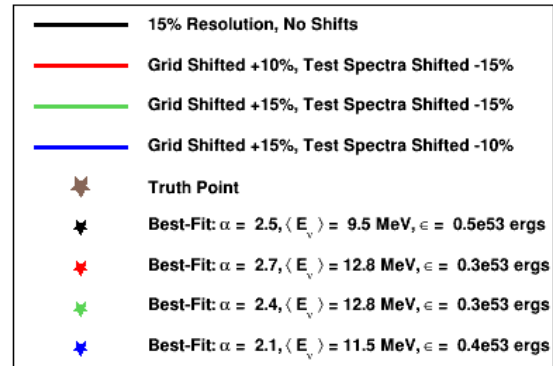
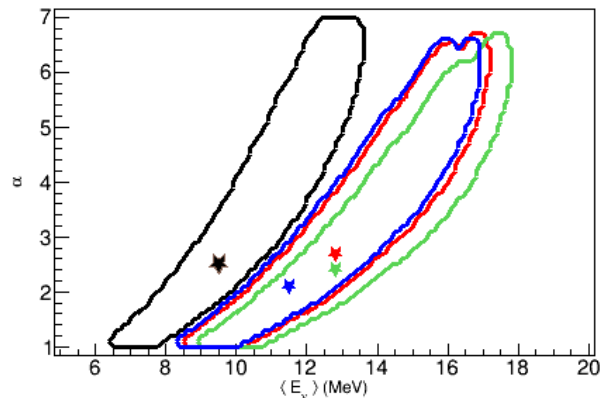
Scaled Test Spectra for 0.15GausPNXscn



# Contours: Upper Left Corner

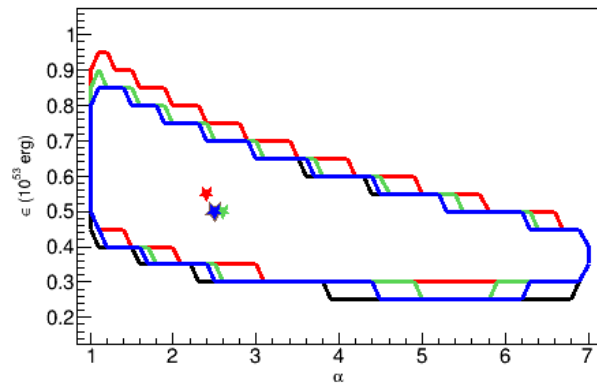
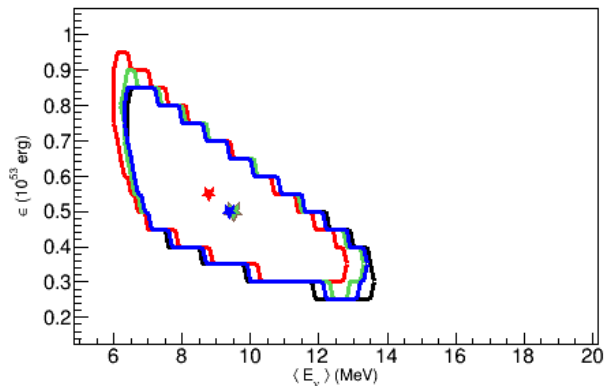
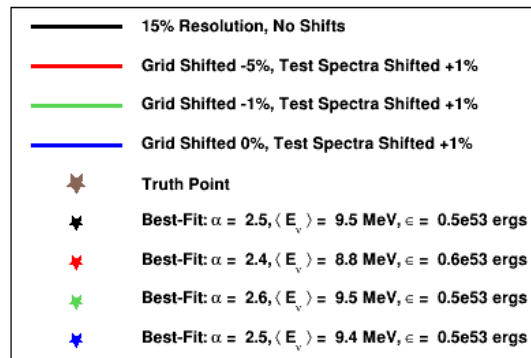
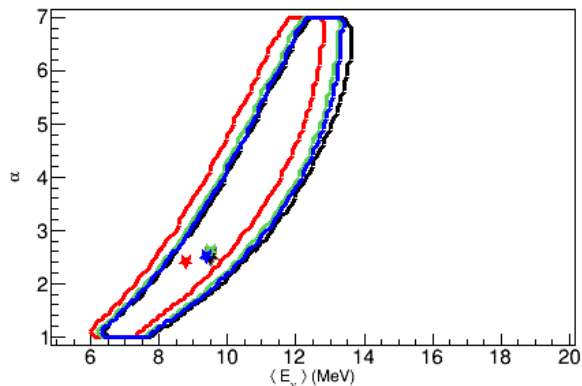


# Contours: Lower Right Corner

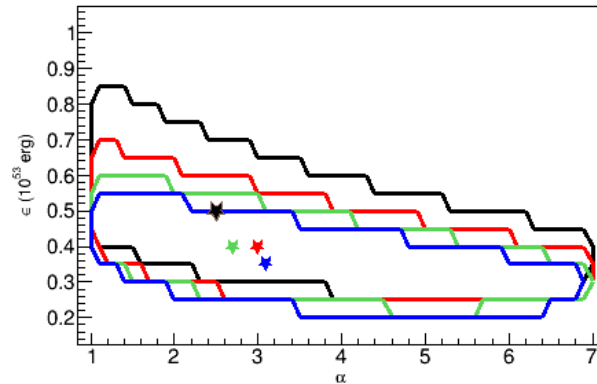
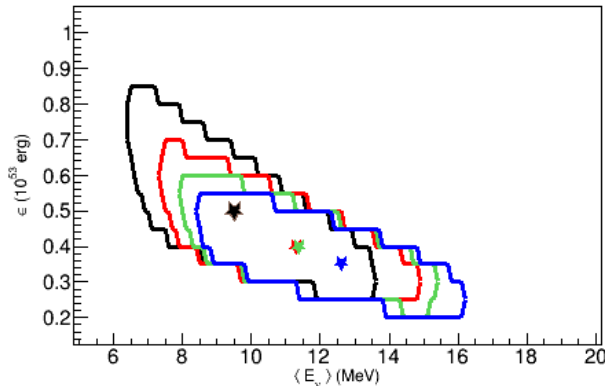
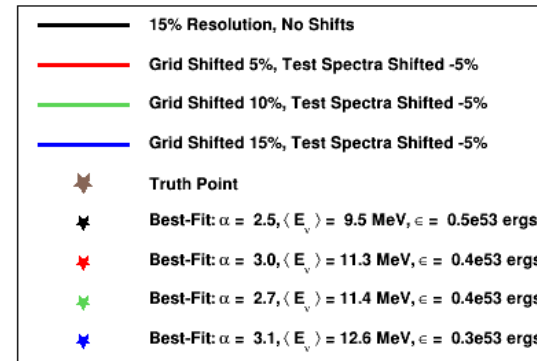
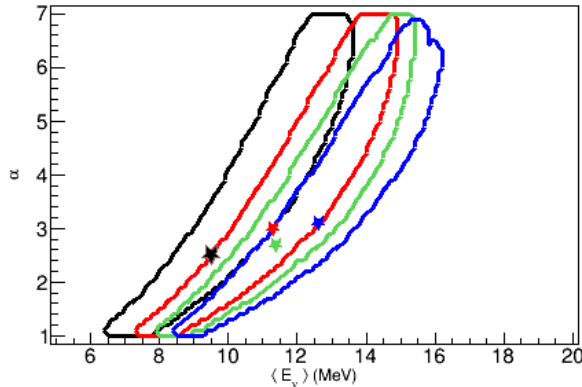




# Contours: Test Spectrum Shifted +1%



# Contours: Test Spectrum Shifted -5%



# Contours: Grid Spectra Shifted +15%

