

# DUNE-PRISM: Data-driven Wrong Sign Background prediction

Ioana Caracas

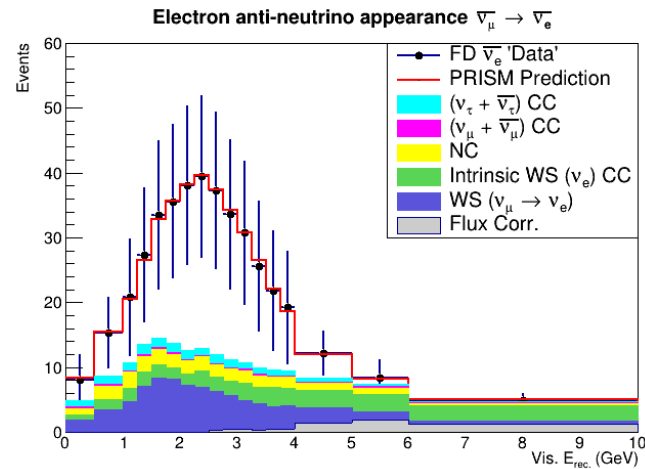
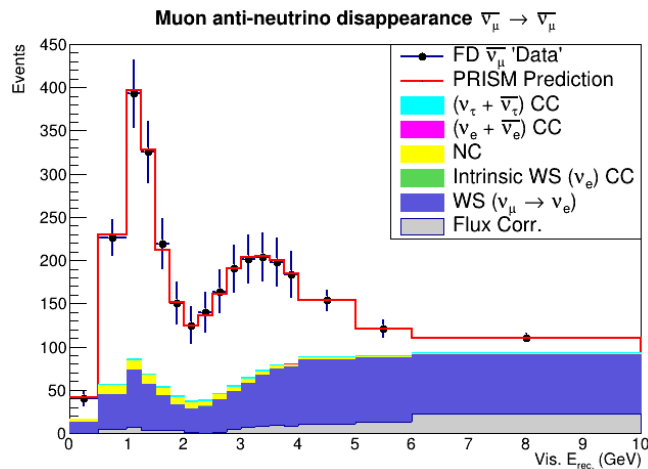
*on behalf of DUNE – PRISM working group*

LBL Meeting

07.08.2023

# DUNE-PRISM

- DUNE-PRISM aims to be robust to cross section modeling → data-driven prediction of the FD oscillated spectrum
- Main cross section systematics enter the analysis via:
  - Efficiency correction (work in progress – see Wei’s talk)
  - **FD background** (obtained from MC):
    - miss-identified  $\bar{\nu}_\tau + \nu_\tau$
    - wrong lepton (i.e mu for appearance and e for disappearance channel)
    - neutral current
    - **intrinsic  $\bar{\nu}_e + \nu_e$**  → right sign intrinsic  $\nu_e$  predicted on a data-driven approach (Wei)
    - **wrong sign background**



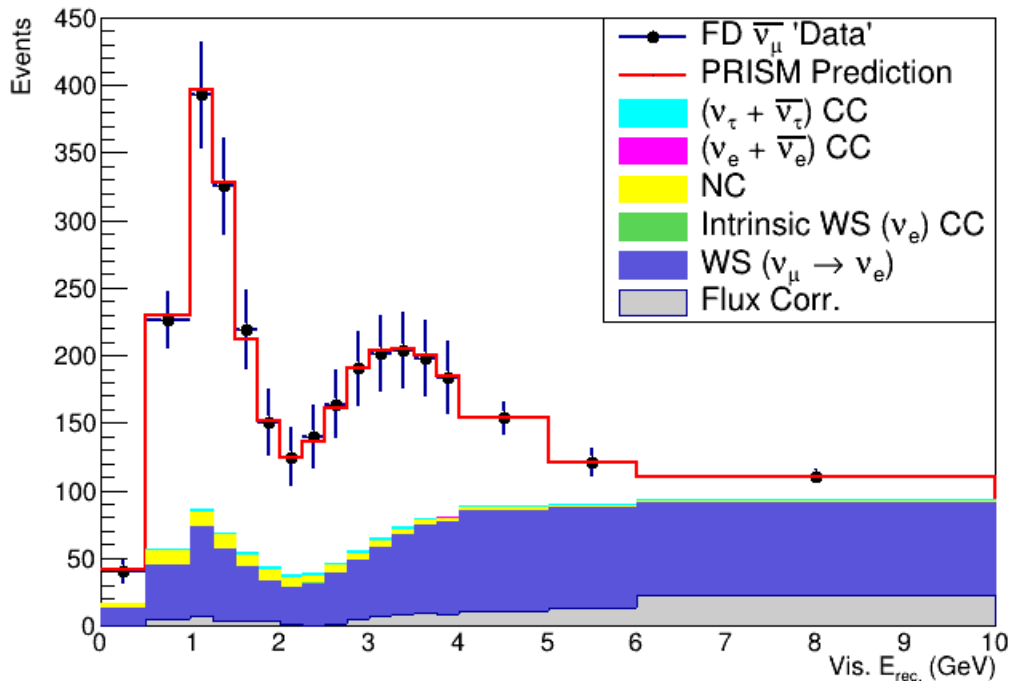
- **Wrong Sign (WS)** and **intrinsic WS** background dominate the background  
→ predict these components on a data-driven approach → reduce cross section modeling dependency

# PRISM Prediction – Wrong Sign Background (WSB) data driven approach

- Total WSB (intrinsic + WS from beam contamination) can be predicted on a data driven approach

example for  $\bar{\nu}_\mu \rightarrow \bar{\nu}_\mu$  channel: WSB = intrinsic  $\nu_e \rightarrow \nu_\mu + \nu_\mu \rightarrow \nu_\mu$

Muon anti-neutrino disappearance  $\bar{\nu}_\mu \rightarrow \bar{\nu}_\mu$



- use the FHC ( $\nu_\mu$  mode) ND data to predict the RHC ( $\bar{\nu}_\mu$  mode) FD wrong sign background

$$\text{ND\_FHC Fluxes} \times C_{\text{WSB}} = \text{FD}_{\text{WSB\_RHC}} \text{ flux}$$

WSB coefficients as a function of the off-axis position

PRISM Prediction for the wrong sign background (WSB)

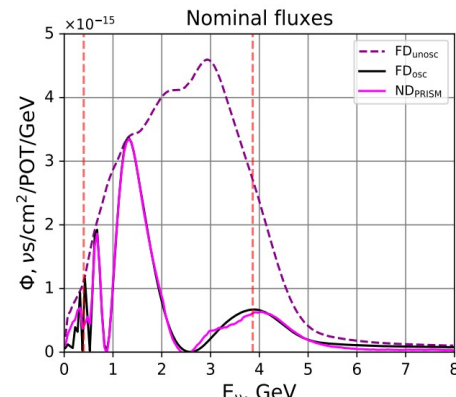
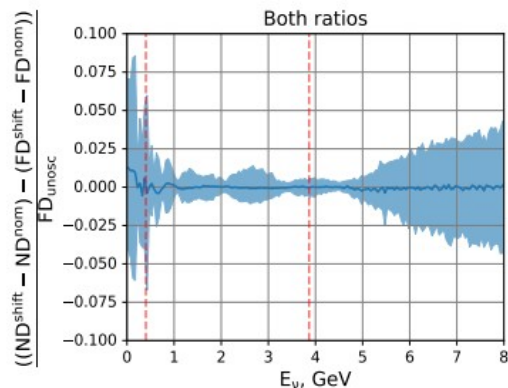
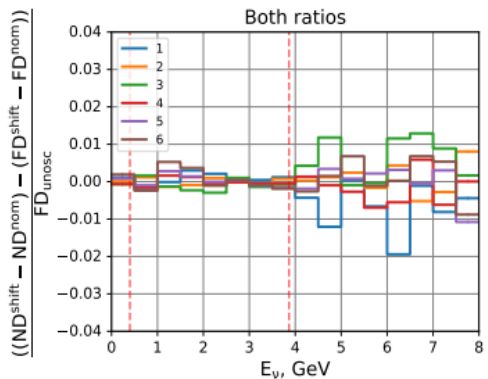
- PRISM Prediction WSB is then added to the FD background instead of the MC WS spectra

# Wrong Sign Background (WSB) data driven – flux uncertainties

- Use the ND data from the opposite channel (**FHC** –  $\nu_\mu$  mode ) to match the target FD WSB (intrinsic WS  $\nu_e$  + WS  $\nu_\mu$ ) flux (**RHC** –  $\nu_\mu$  mode)
- Main concern: flux uncertainties (graphs and study by Anna Stepanova)

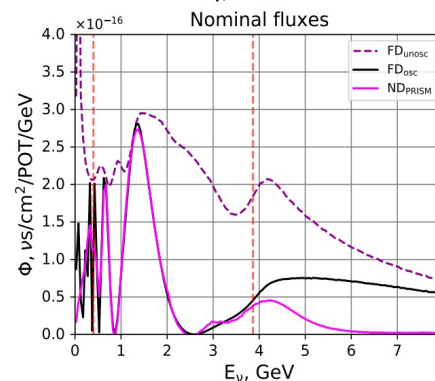
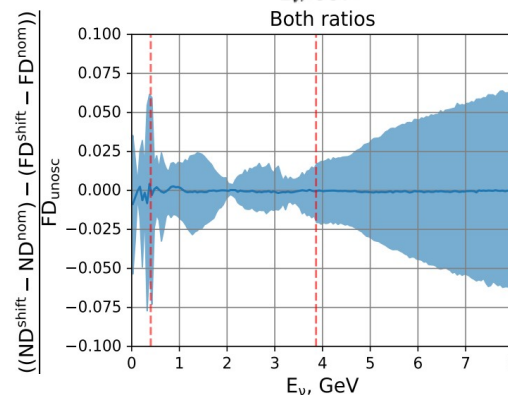
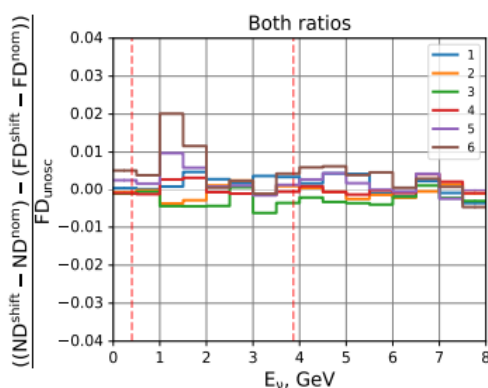
## Standard Target

(ND FHC → FD FHC)



## WS Target

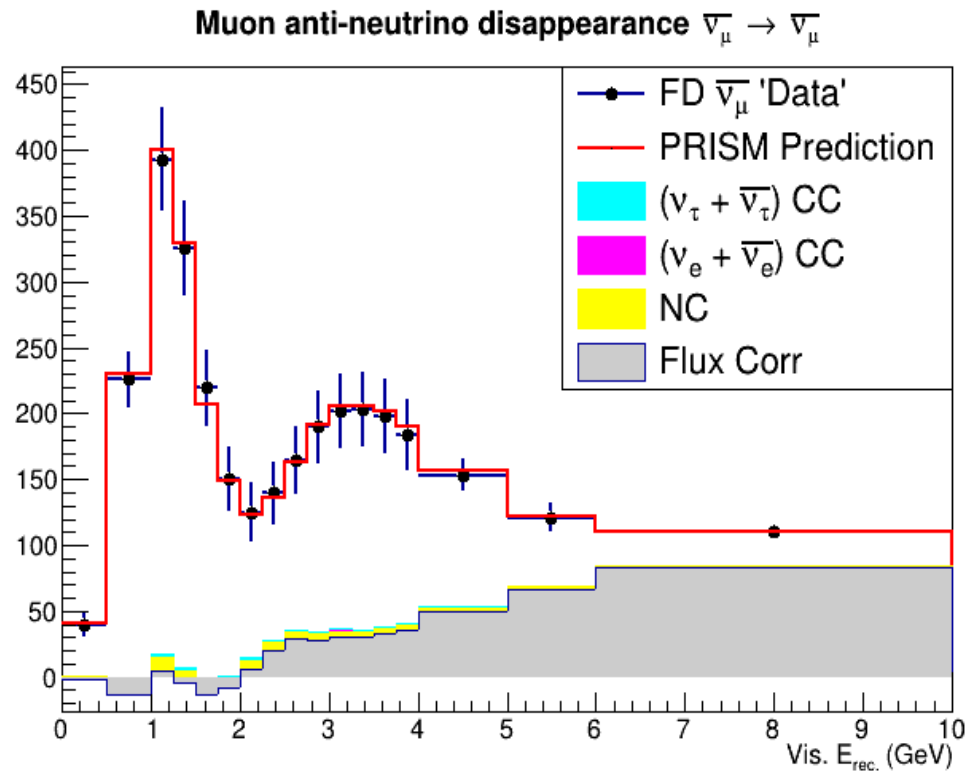
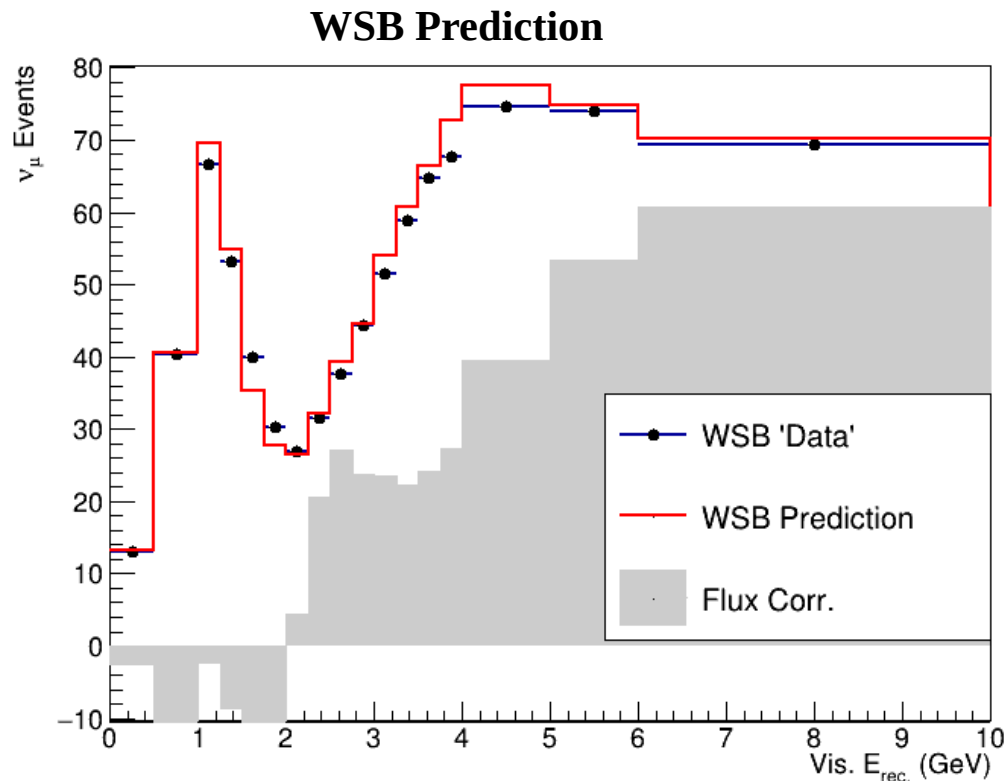
(ND RHC → FD FHC)



- Flux uncertainties less than 3% in the fitting area → similar to the standard case

# Wrong Sign Background (WSB) data driven – Disappearance anti-neutrino channel

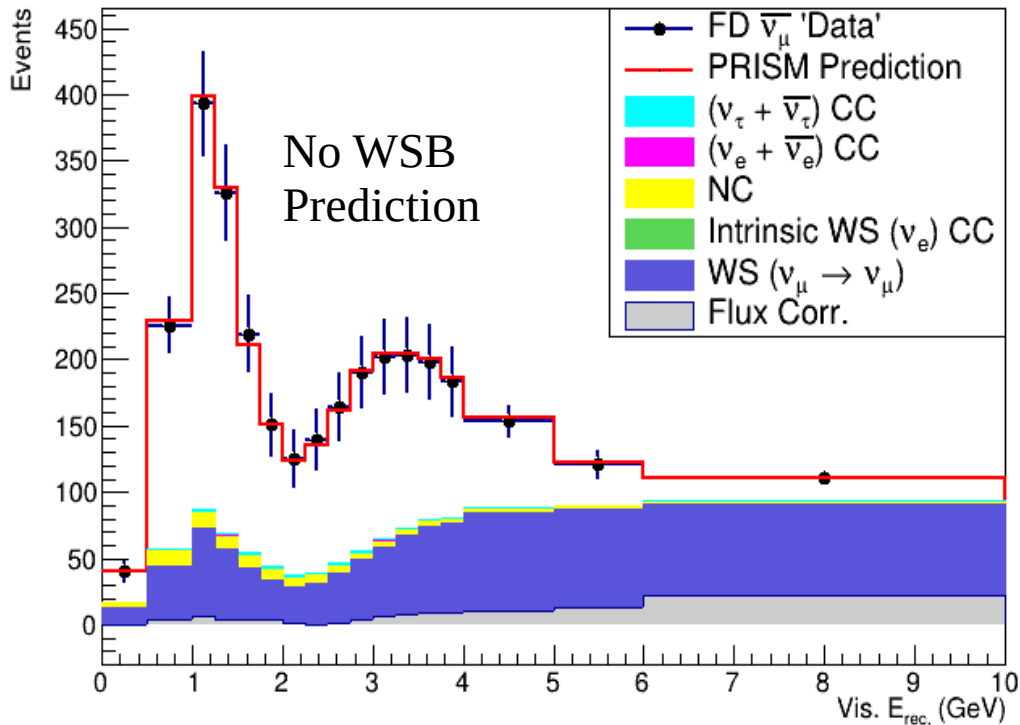
- WSB Prediction =  $\nu_\mu \rightarrow \nu_\mu$  from beam contamination + intrinsic  $\nu_e \rightarrow \nu_\mu$  beam contamination



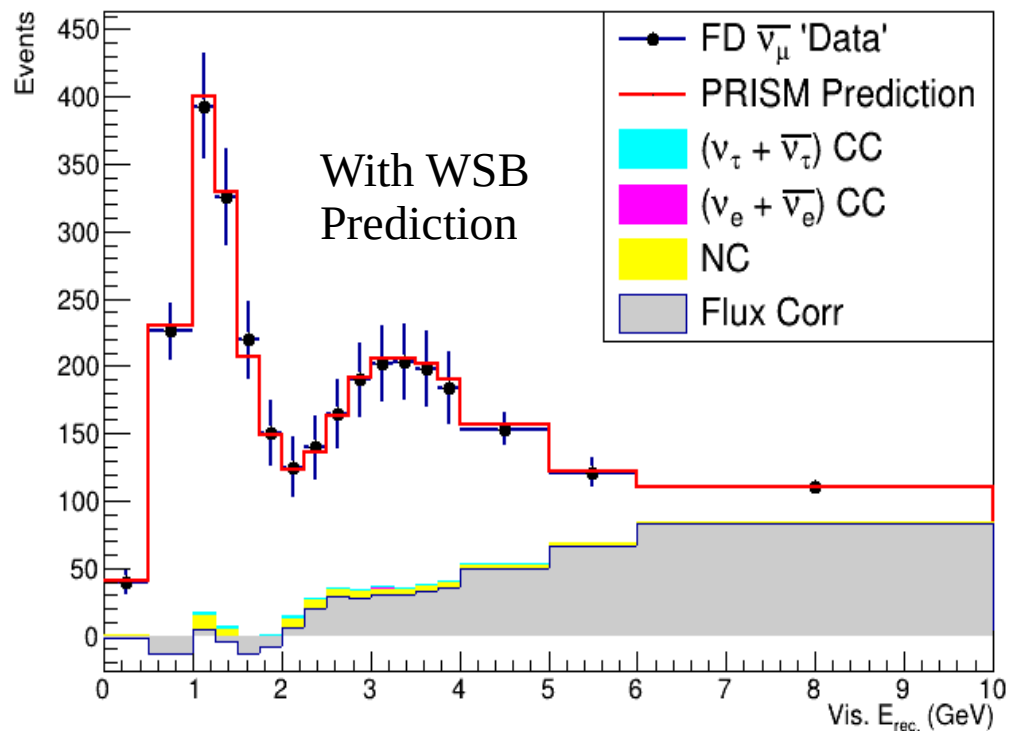
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Muon anti-neutrino disappearance  $\bar{\nu}_\mu \rightarrow \bar{\nu}_\mu$



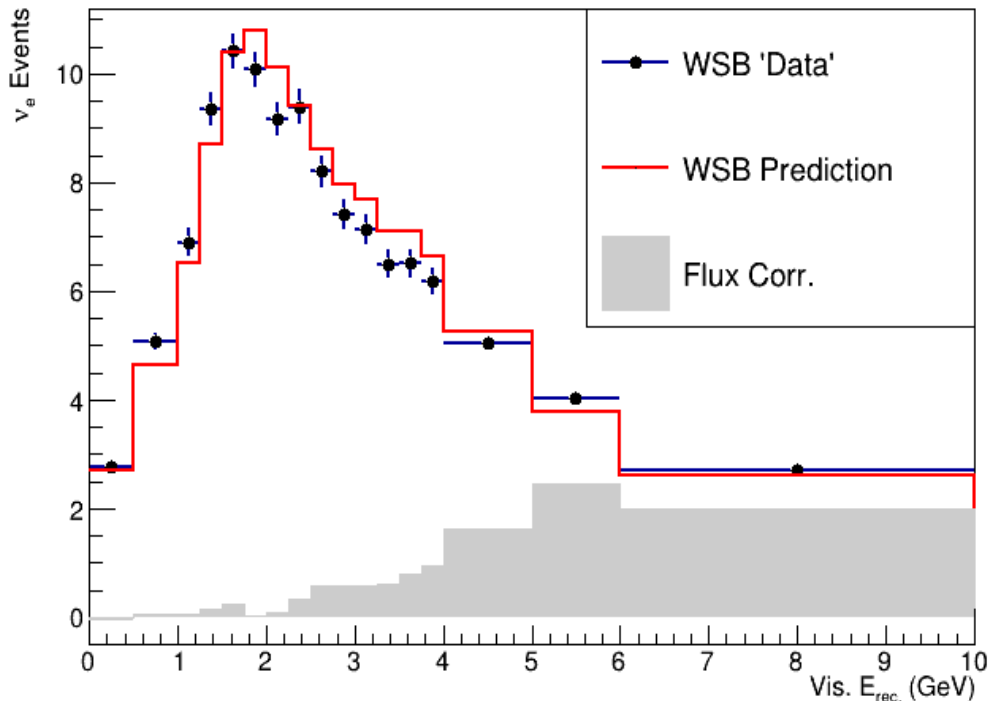
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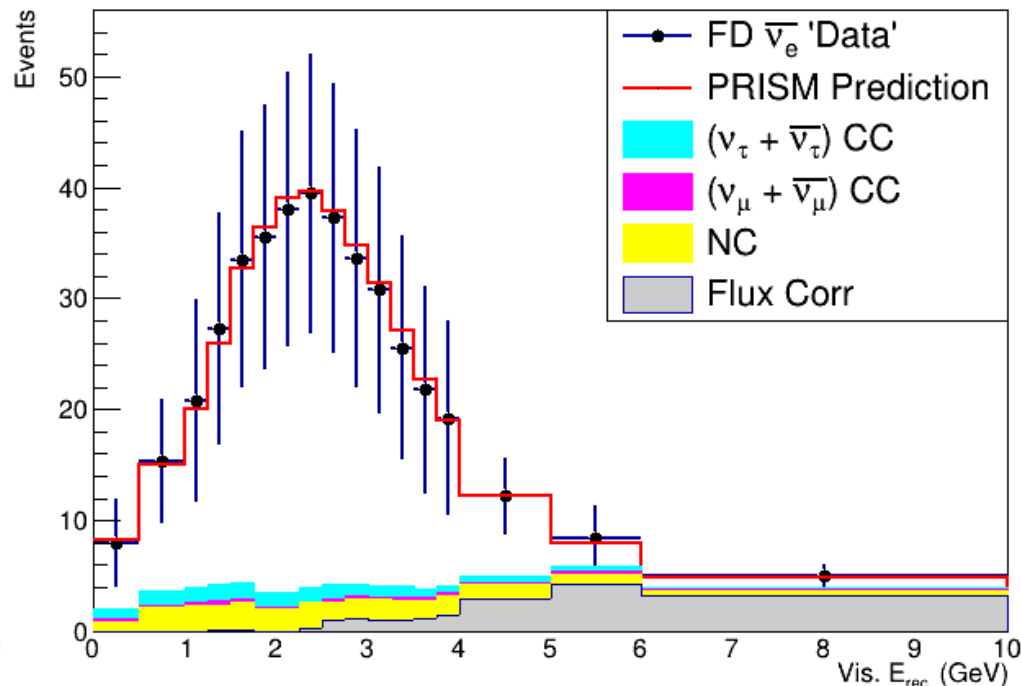
# Wrong Sign Background (WSB) data driven – Appearance anti-neutrino channel

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## WSB Prediction

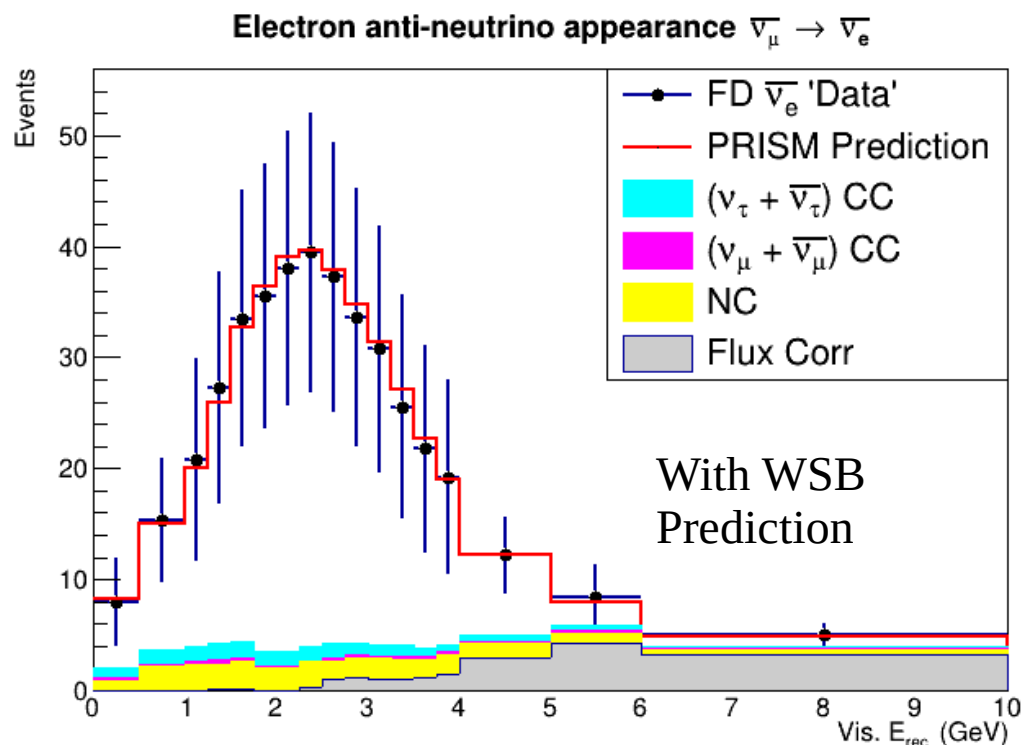
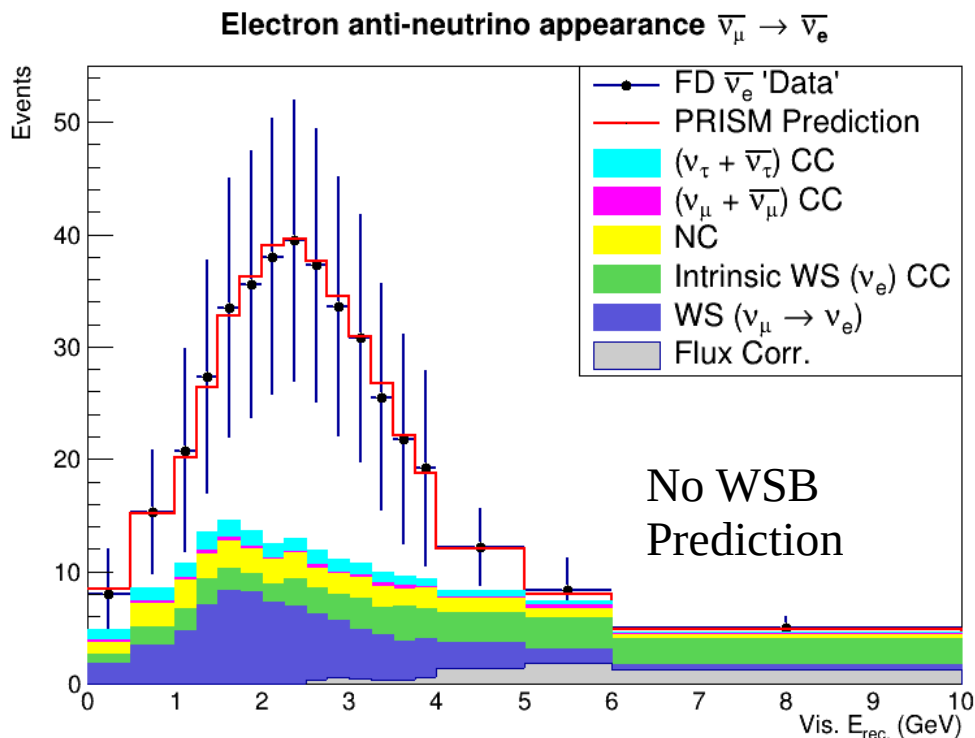


## Electron anti-neutrino appearance $\bar{\nu}_\mu \rightarrow \bar{\nu}_e$



# Wrong Sign Background (WSB) data driven – Appearance anti-neutrino channel

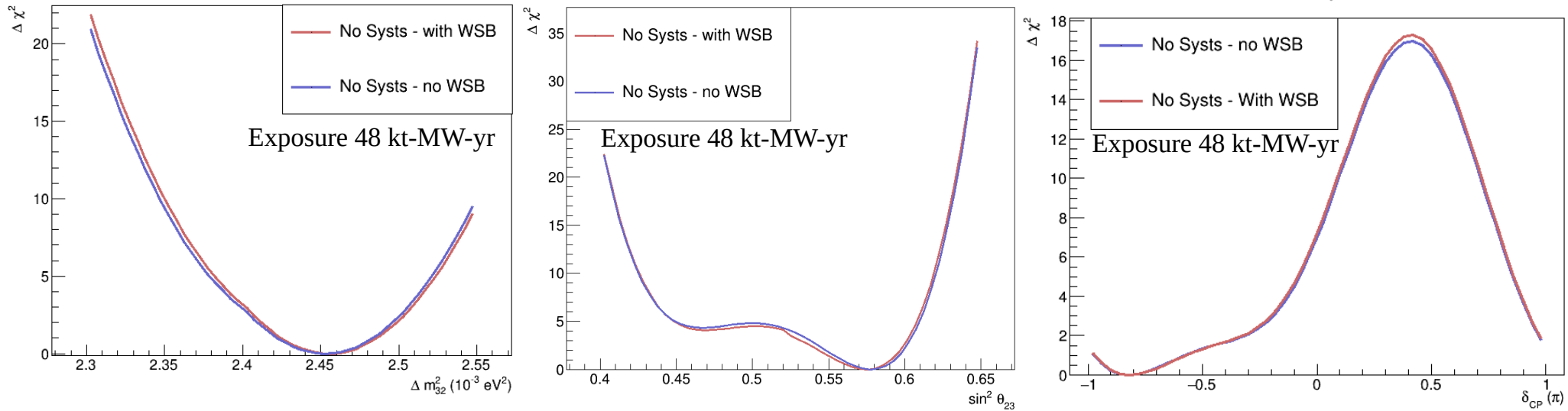
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# Wrong Sign Background (WSB) data driven – Oscillation fits

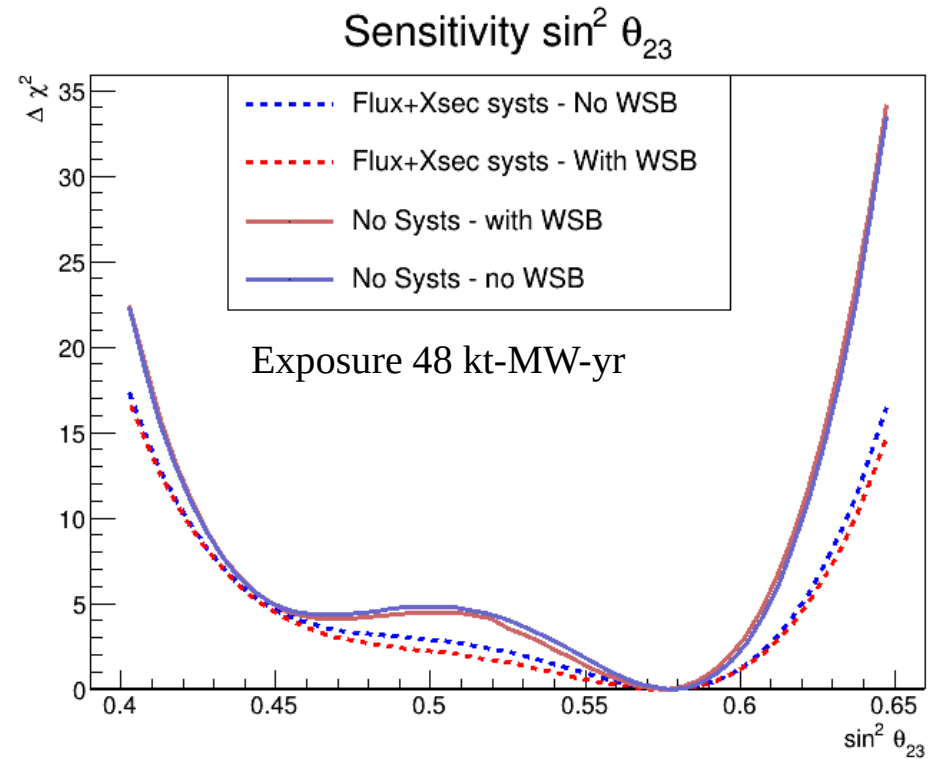
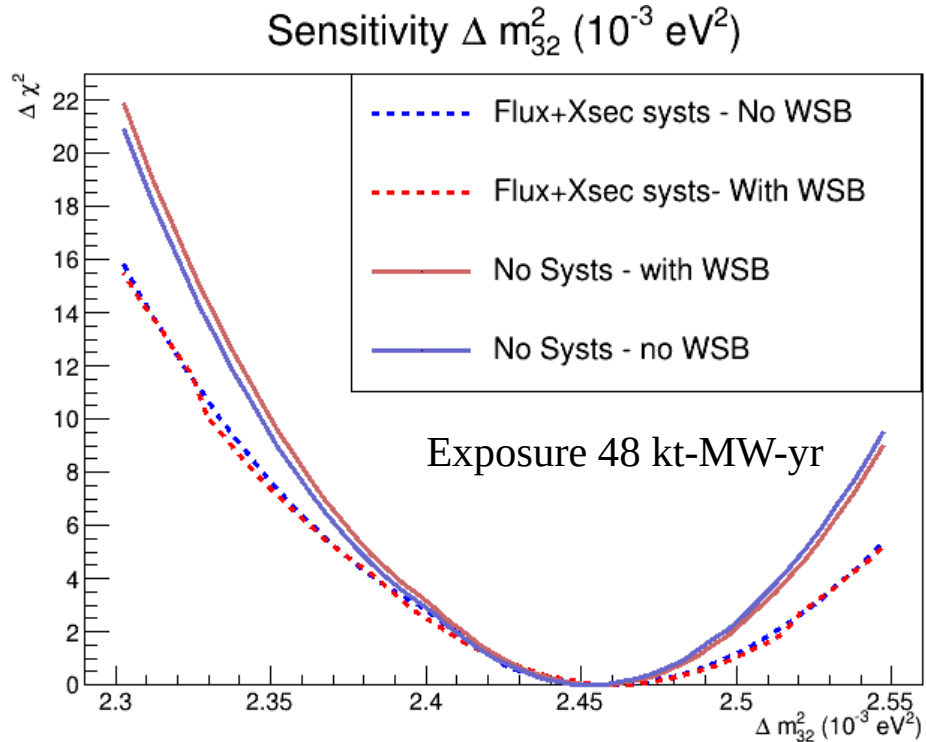
- Nominal – stats only
- 4 Flavours:  $\nu_\mu + \nu_e + \bar{\nu}_\mu + \bar{\nu}_e$



- No significant shift in the nominal case between the two different scenarios  
→ no additional bias included

# Wrong Sign Background (WSB) data driven – Oscillation fits

- Systematics included: flux + Xsec
- 4 Flavours:  $\nu_\mu + \nu_e + \bar{\nu}_\mu + \bar{\nu}_e$

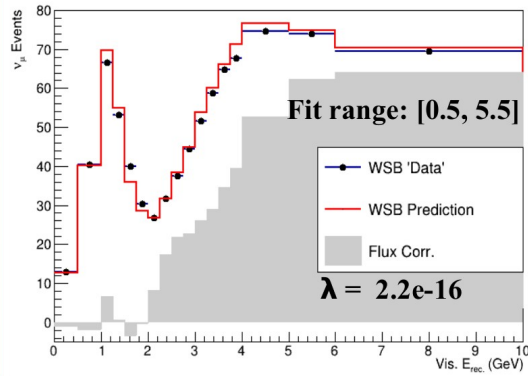
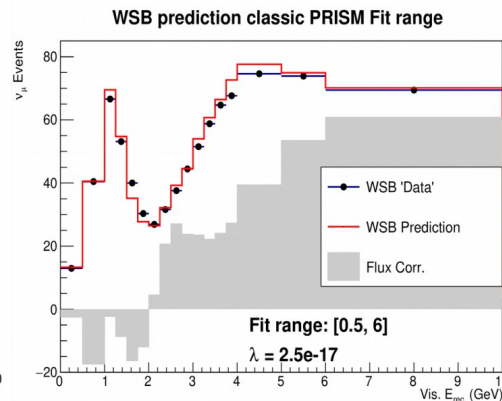
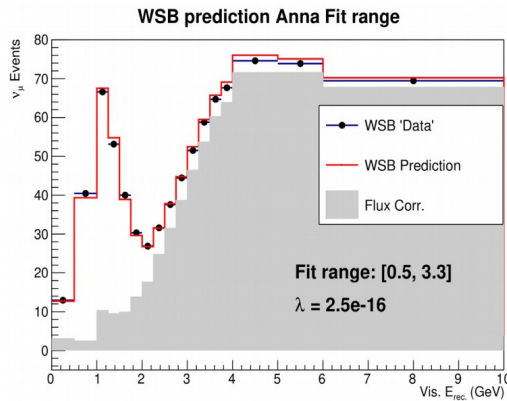
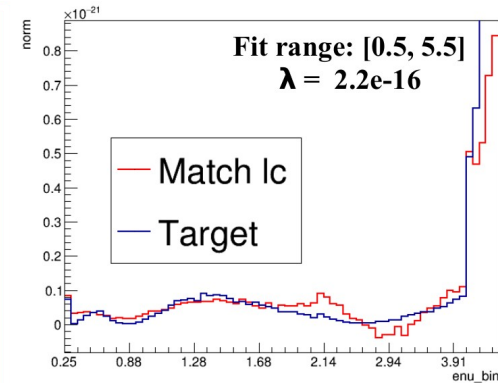
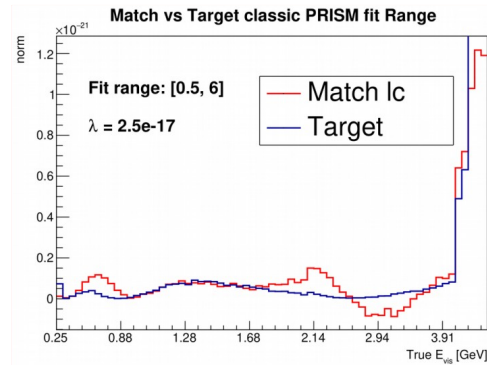
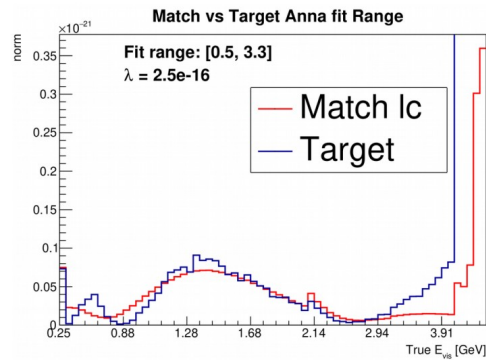


- **No significant improvement in Xsec systs when WSB is predicted on a data-driven approach**

# PRISM WSB Prediction – Flux correction

- Different fitting ranges and regularization parameters have a direct influence in the flux correction (MC component)  
→ could this influence the oscillation fit.?

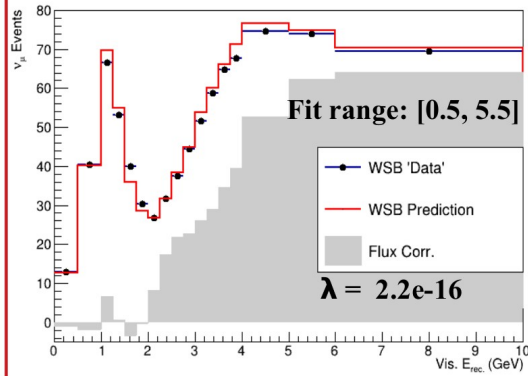
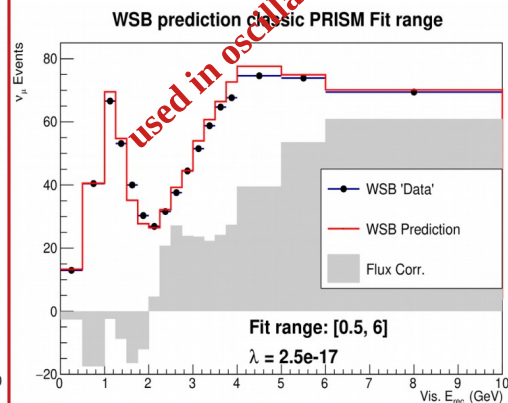
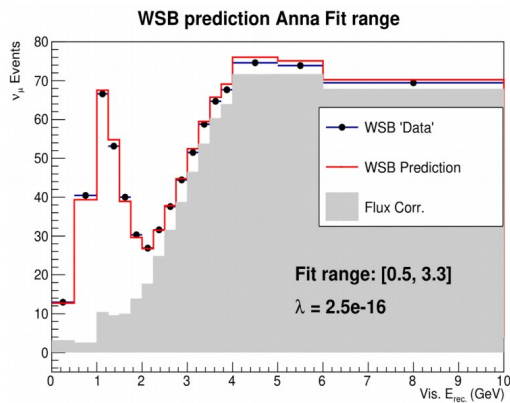
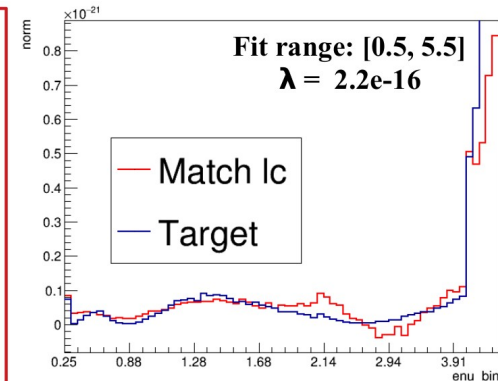
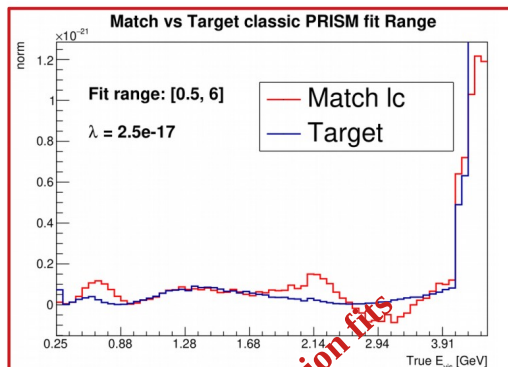
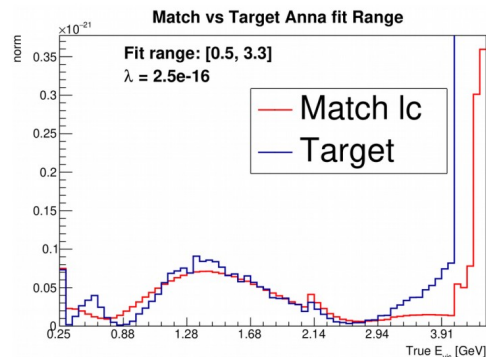
Anti muon neutrino disappearance channel ( $\bar{\nu}_\mu \rightarrow \bar{\nu}_\mu$ )



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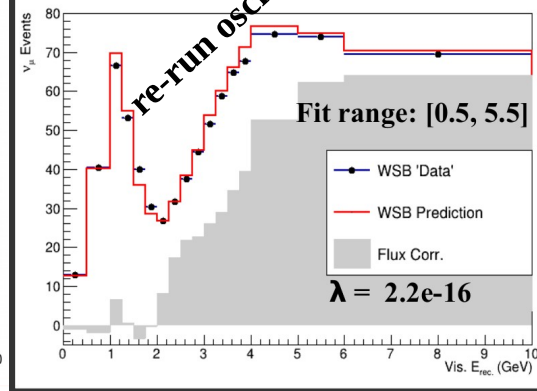
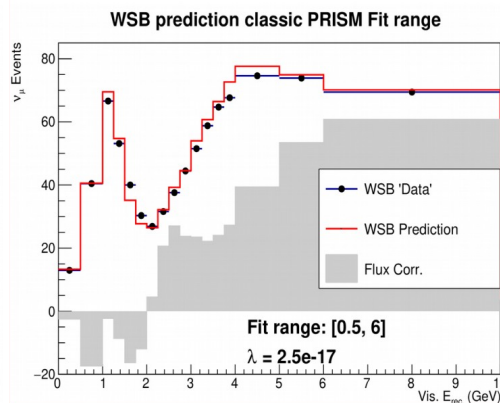
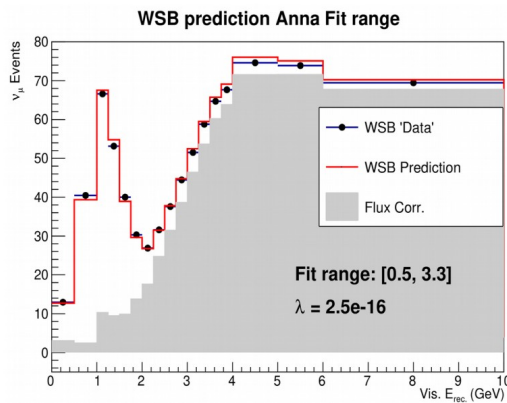
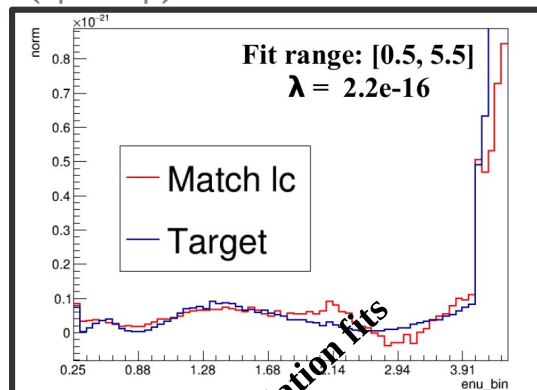
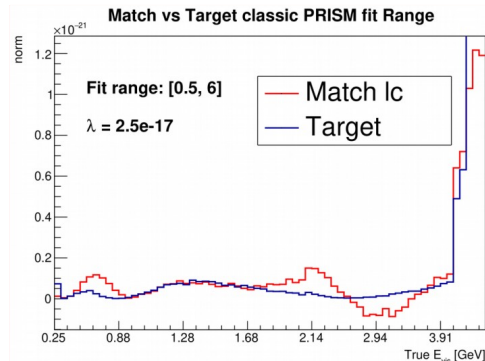
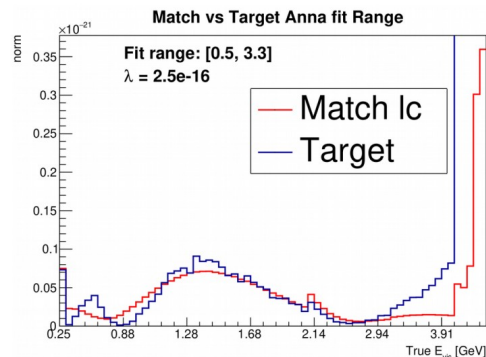
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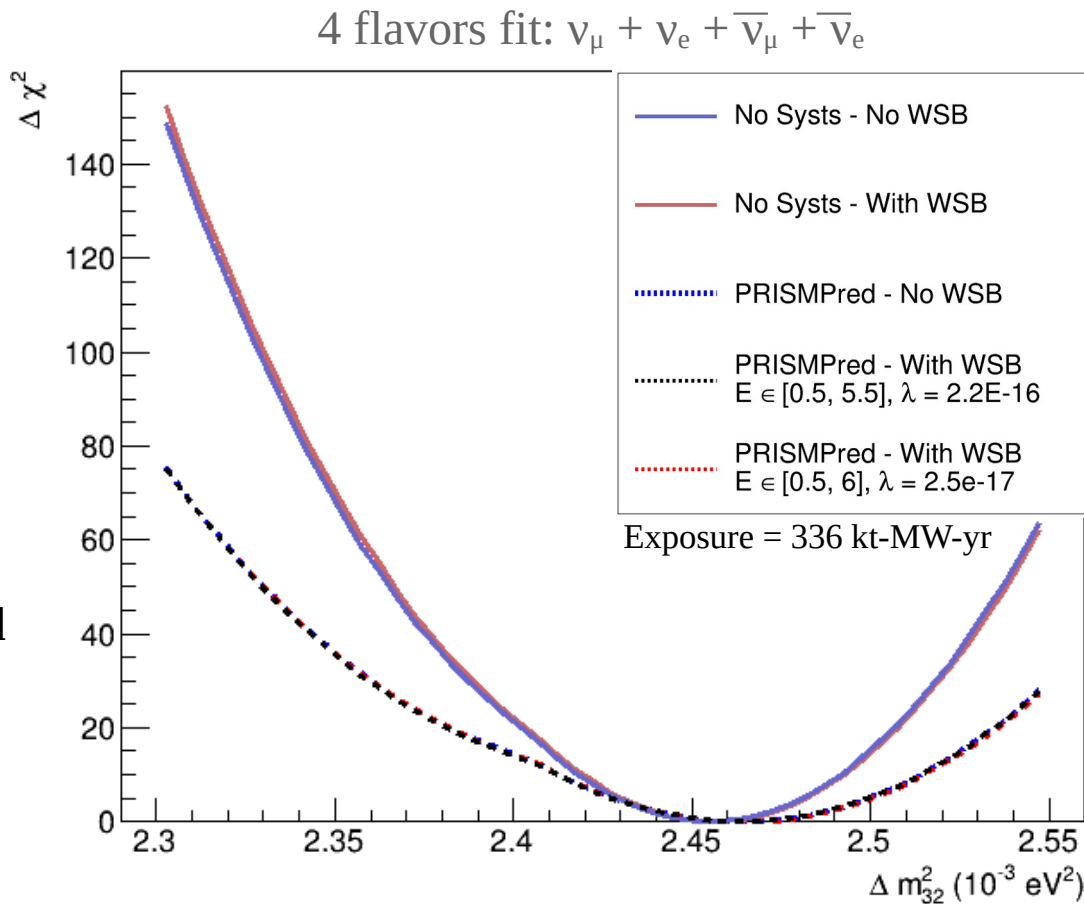
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# Oscillation fits with/without WSB – Xsec systematics

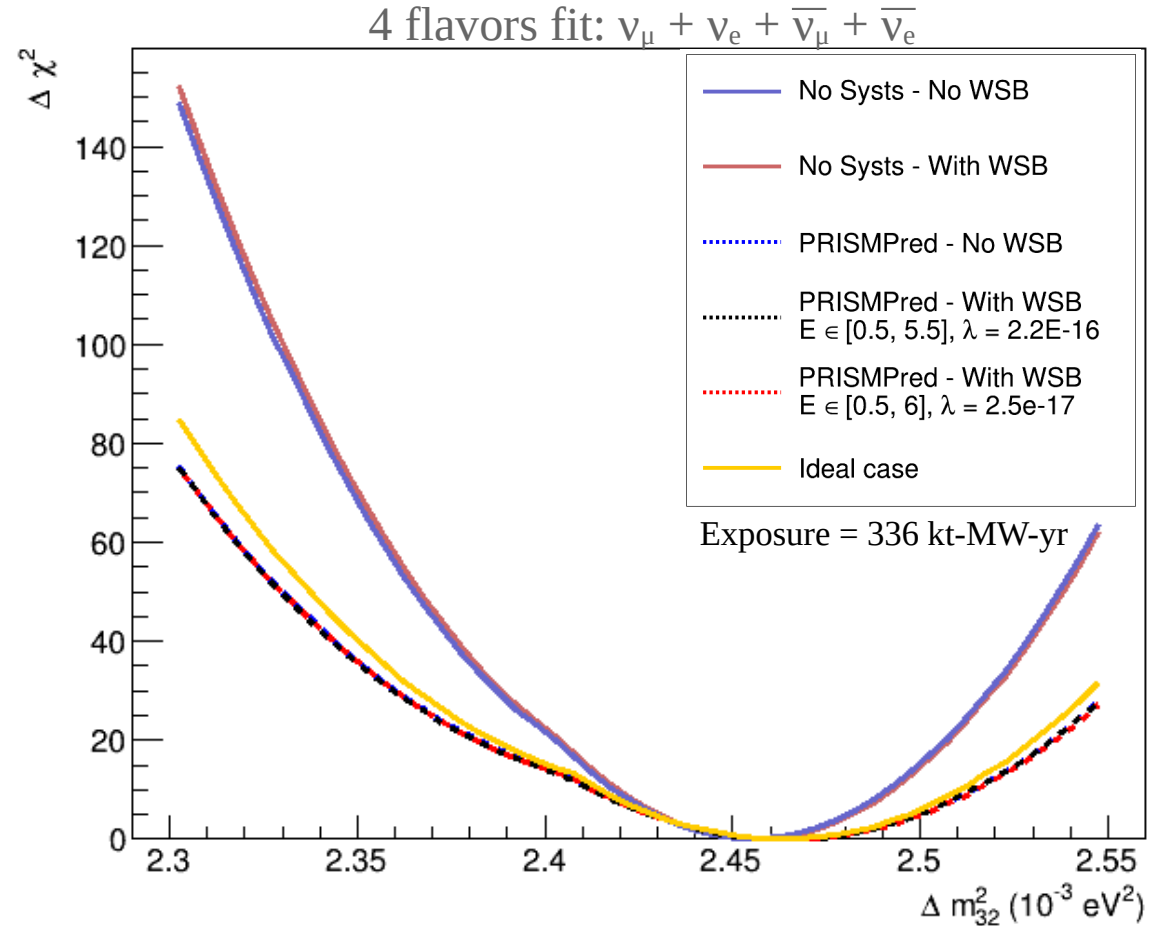
- **PRISM no WSB** prediction: WSB from MC with the corresponding systematic shift
- **PRISM with WSB**: WSB from data-driven approach (different fit ranges)

→ **no significant difference when different flux corrections are used**



# Oscillation fits with/without WSB – Xsec systematics

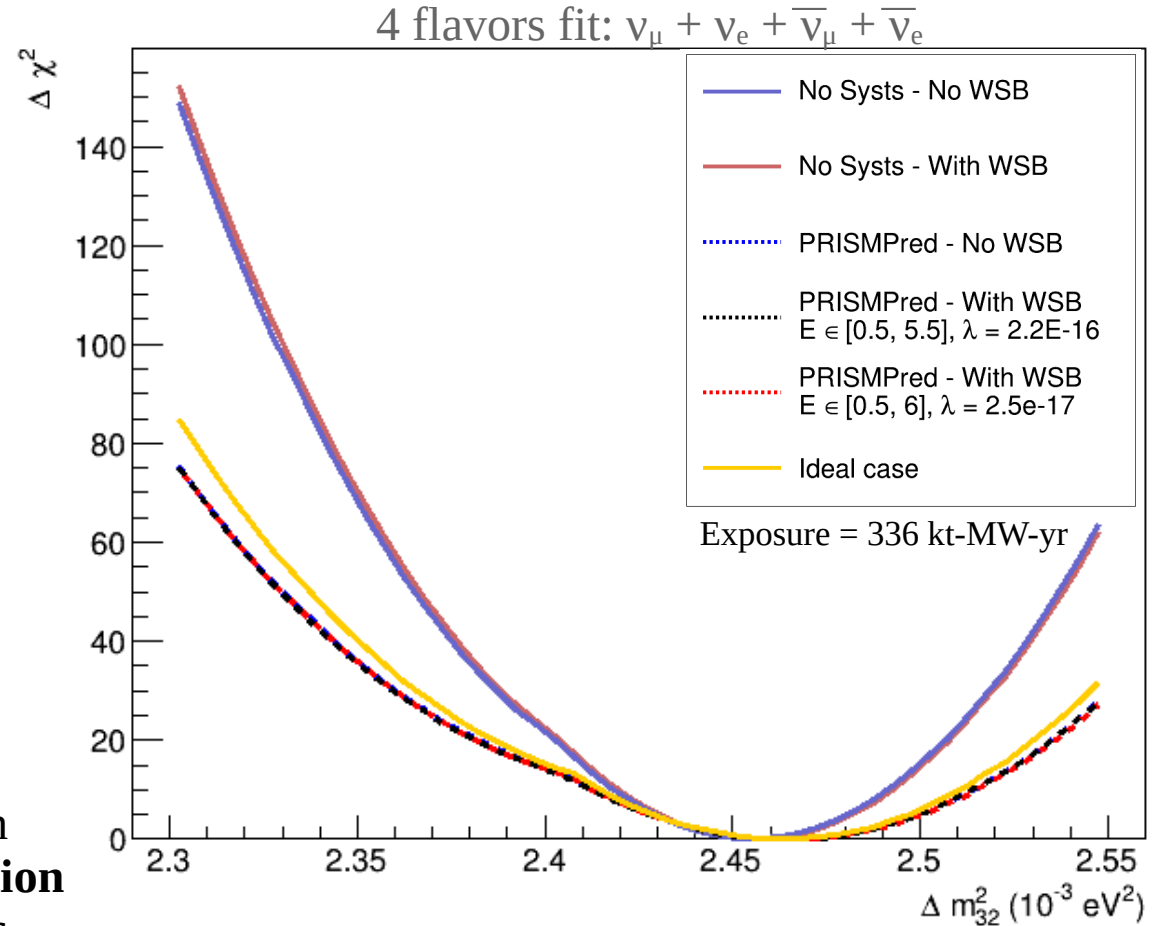
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No significant difference between the resulting fits (with/without WSB) with Xsec systs → **maybe the flux correction is not the main source of systematics..**

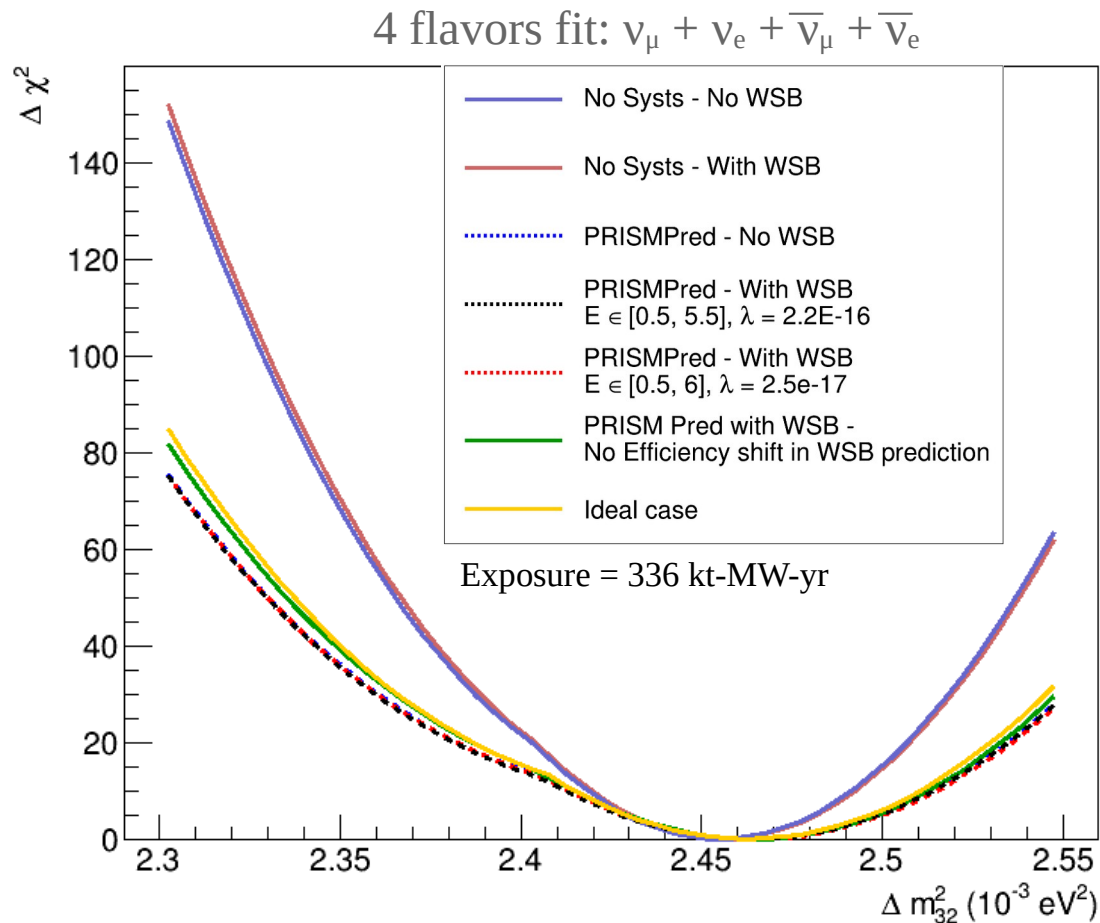




# Oscillation fits with/without WSB – Xsec systematics

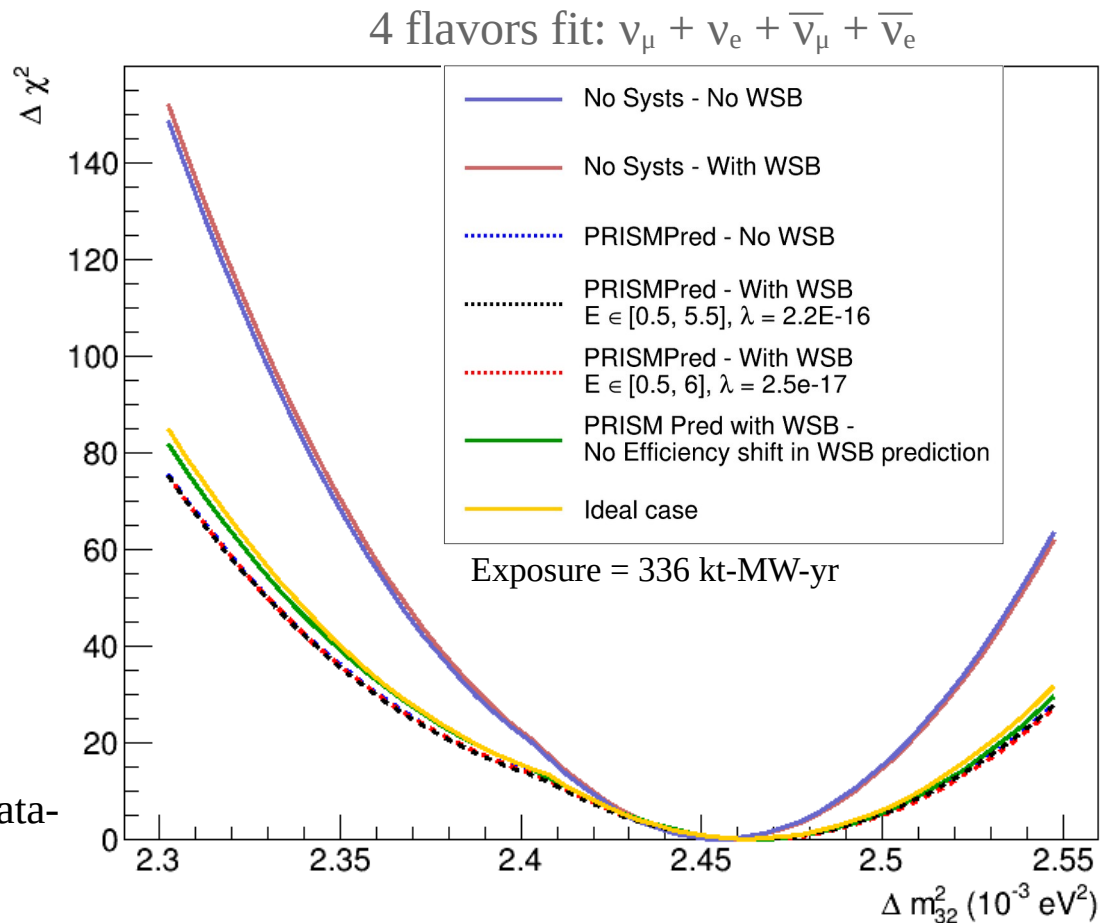
→ Turn off the syst shift in the ND efficiency correction used for the WSB prediction on a data-driven approach

- **PRISM no WSB** prediction: WSB from MC with the corresponding systematic shift
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- **PRISM with WSB no syst shift in WSB ND efficiency calculation**: WSB from data-driven approach no shift in ND efficiency



# Oscillation fits with/without WSB – Xsec systematics

- **The main source of systematics comes from the efficiency calculation:** for the WSB prediction the efficiency calculation enters the analysis individually (I.e we use the efficiency calculation two times: once for the classic PRISM prediction of the oscillated spectrum + once for the WSB prediction)
  - **the improvement in using the WSB prediction is canceled by the additional Xsec dependence introduced via the efficiency calculation**
- This should not be a problem once the ND efficiency correction is implemented on a data-driven approach (work in progress by Wei)



# PRISM Prediction with a WSB data-driven approach: Conclusions

- The WSB prediction on a data-driven approach is fully implemented (code has been pushed on github some time ago) and works as desired
- Once the efficiency correction (data-driven) is implemented, **the improvement obtained in the oscillation fits is very close to the ideal case of a “no-syst” WSB**
- The data-driven wrong sign background plays a **crucial role in the fake data PRISM analysis** and bias reduction (see Ciaran’s talk next week)
  - a separate individual study (extreme case of lower/higher cross sections by 1 order of magnitude) has been performed and shows how significantly lower biases are obtained when the WSB is obtained in a data-driven way

# PRISM Prediction with a WSB data-driven approach: Conclusions

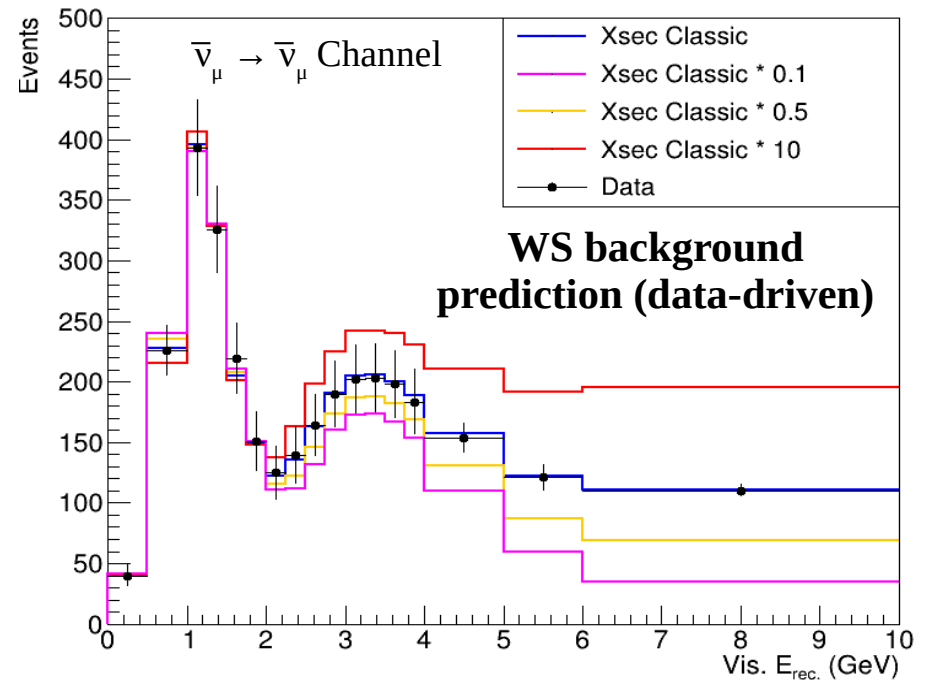
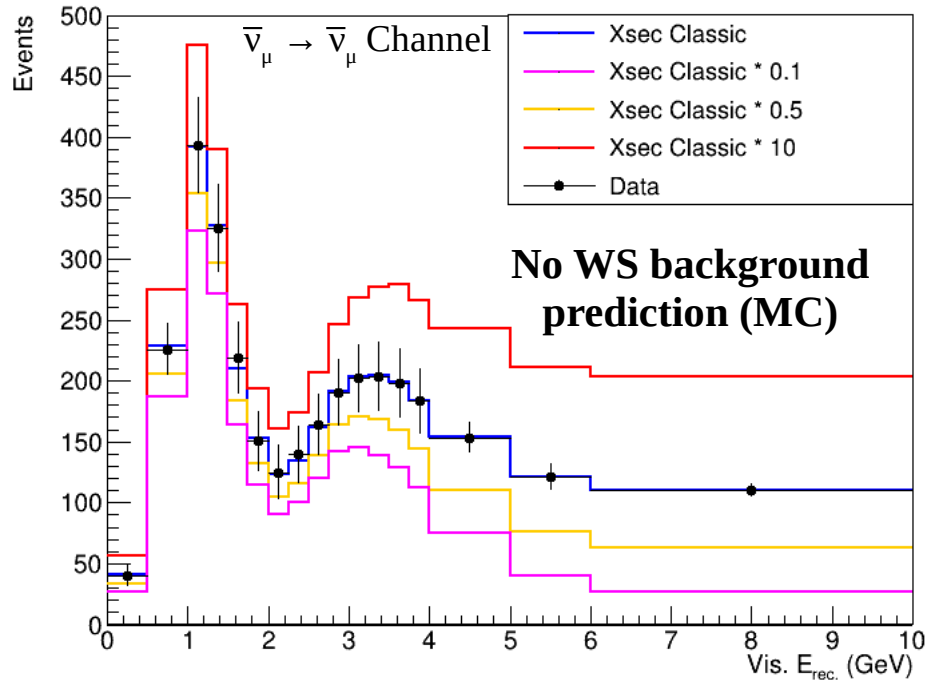
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**Thank you!**

# BACKUP

# Wrong Sign Background (WSB) data driven – Study case

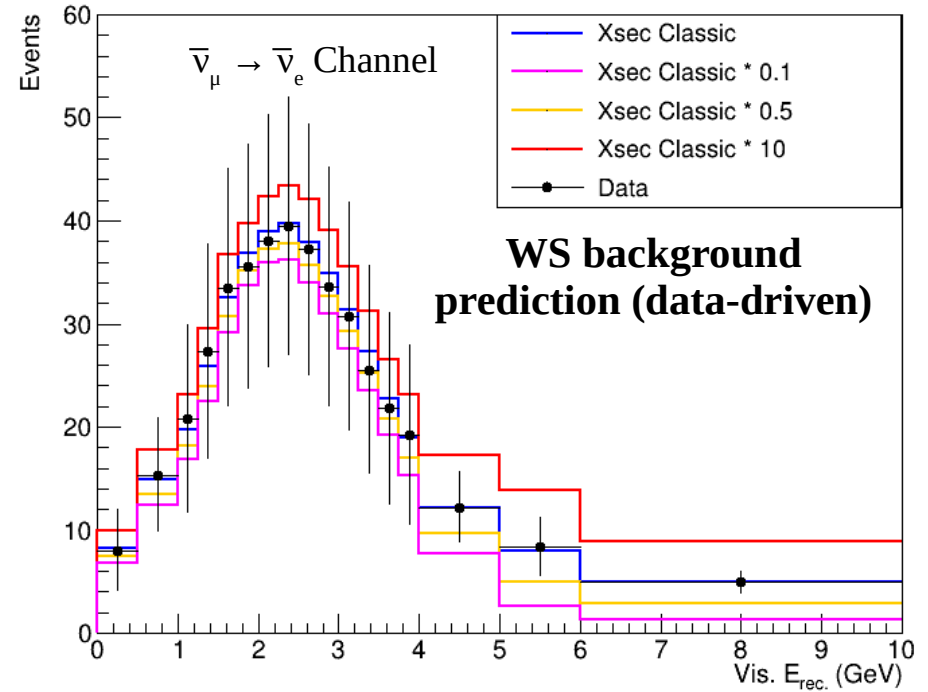
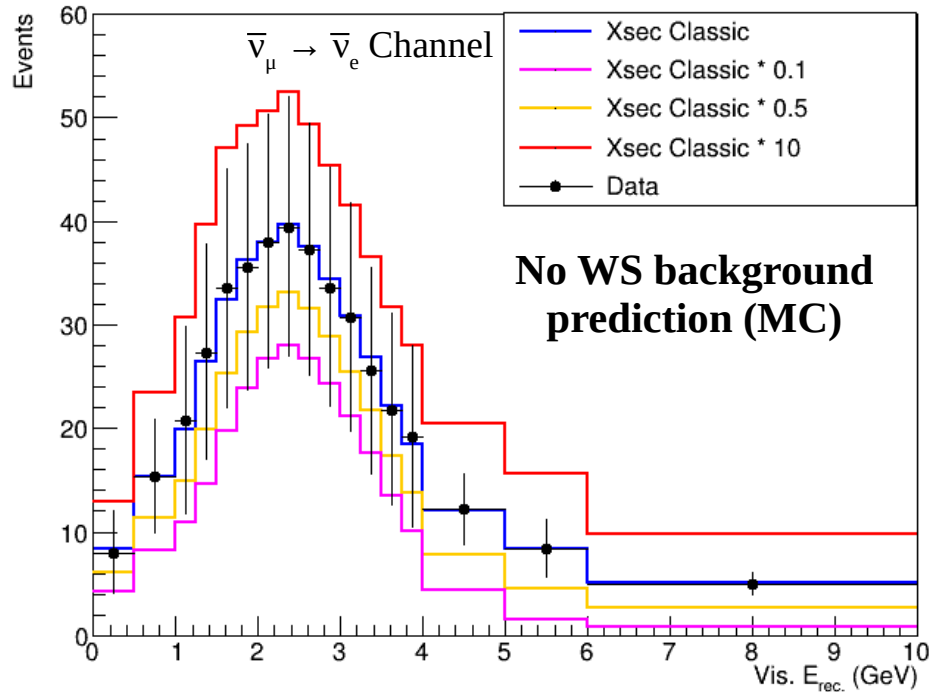
- Shift the cross section (FrInelPi) by a given weight  $\rightarrow$  see how does this influence the PRISM prediction and oscillation fits within the two scenarios: WSB from MC vs WSB data-driven
- Include only FrInelPi cross section systematics and apply  $+1 \sigma$  shift



$\rightarrow$  **Significantly smaller shifts when the WS background is predicted on a data-driven approach**

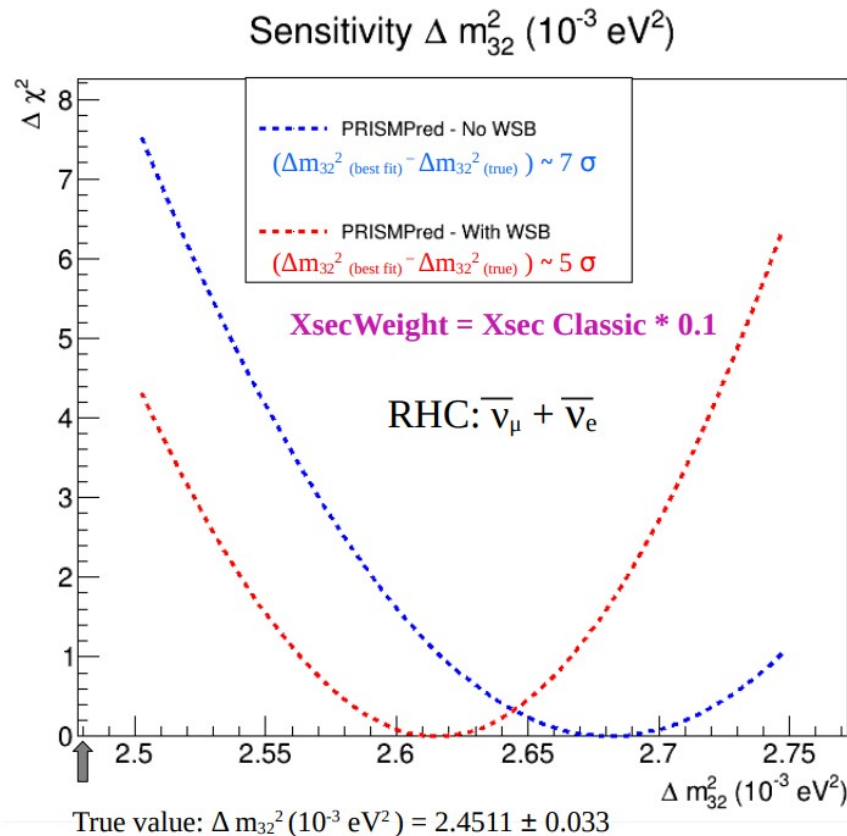
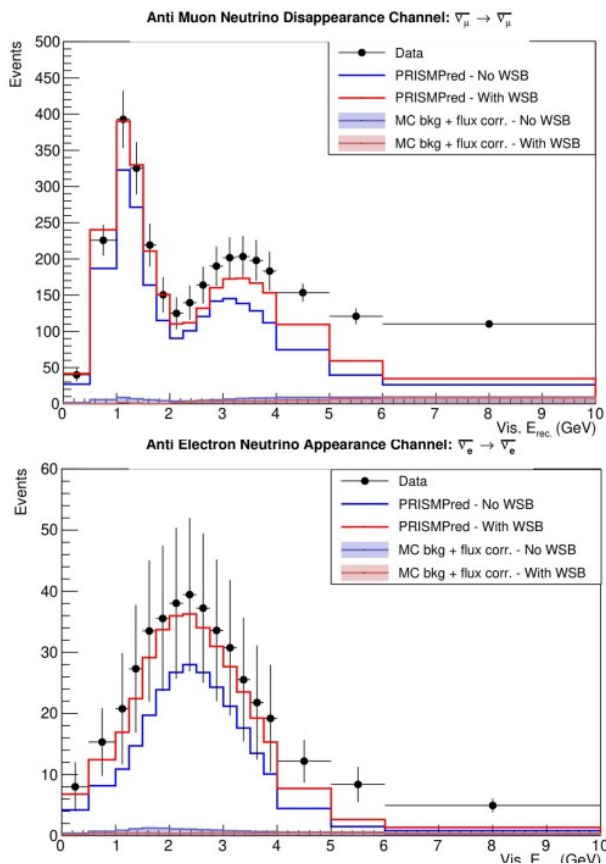
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$\rightarrow$  **Significantly smaller shifts when the WS background is predicted on a data-driven approach**

# Wrong Sign Background (WSB) data driven – Study case Oscillation fits



→ Much better agreement ( $2 \sigma$ ) of the resulted  $\Delta m_{32}^2$  with the true value in the case of WSB obtained from a data-driven approach

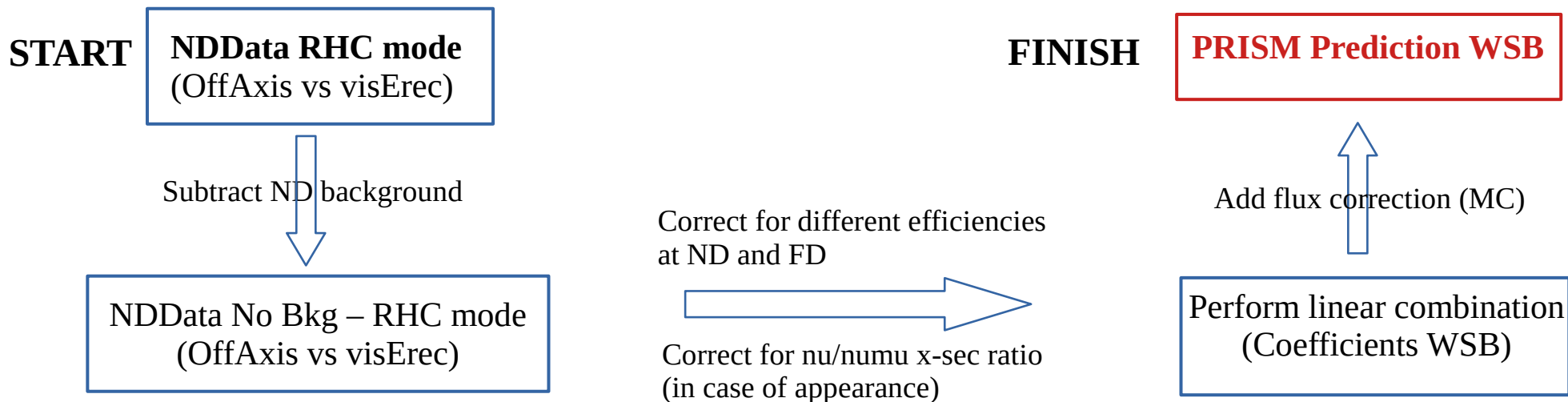


# PRISM Prediction – Wrong Sign Background (WSB) data driven approach

- Total WSB (intrinsic + WS from beam contamination) can be predicted on a data driven approach
  - example for  $\bar{\nu}_\mu \rightarrow \bar{\nu}_\mu$  channel: WSB = intrinsic  $\nu_e \rightarrow \nu_\mu + \nu_\mu \rightarrow \nu_\mu$
- **use the ND data from the opposite channel (RHC –  $\bar{\nu}_\mu$  mode ) to match the target FD WSB (intrinsic WS  $\nu_e + \text{WS } \nu_\mu$ ) flux (FHC –  $\nu_\mu$  mode)**

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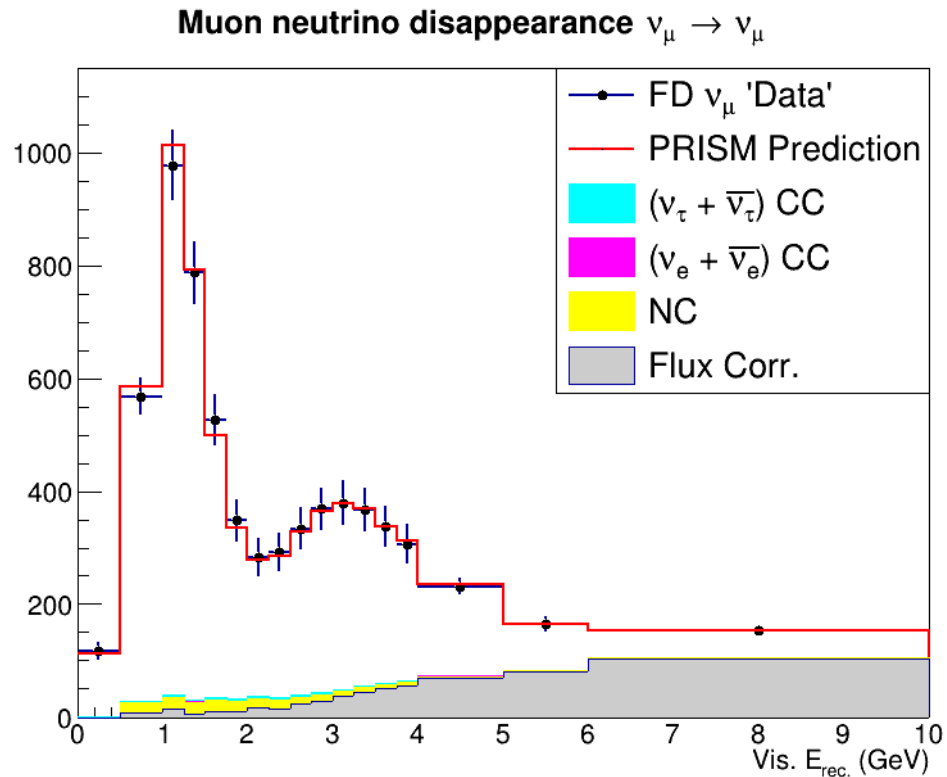
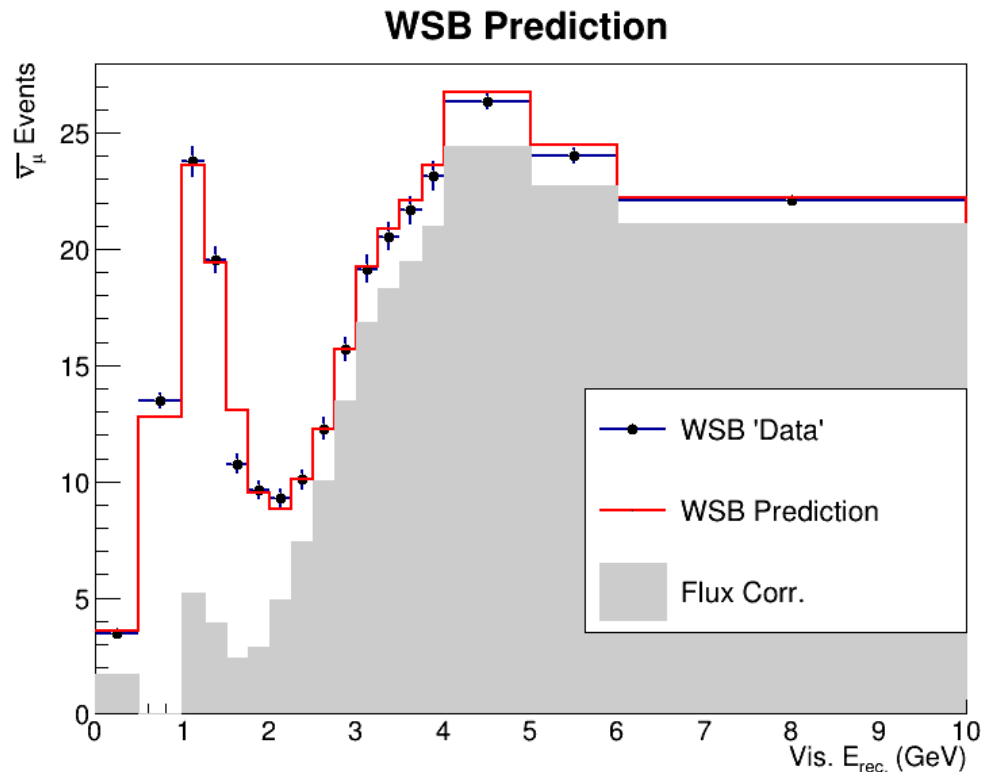
WSB coefficients as a function of the off-axis position



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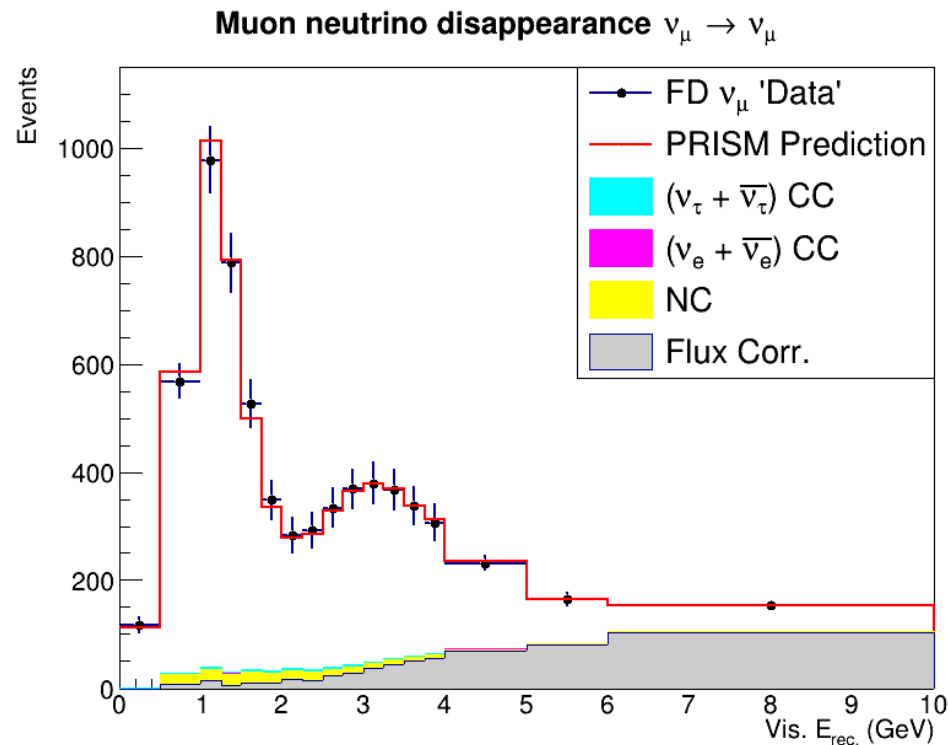
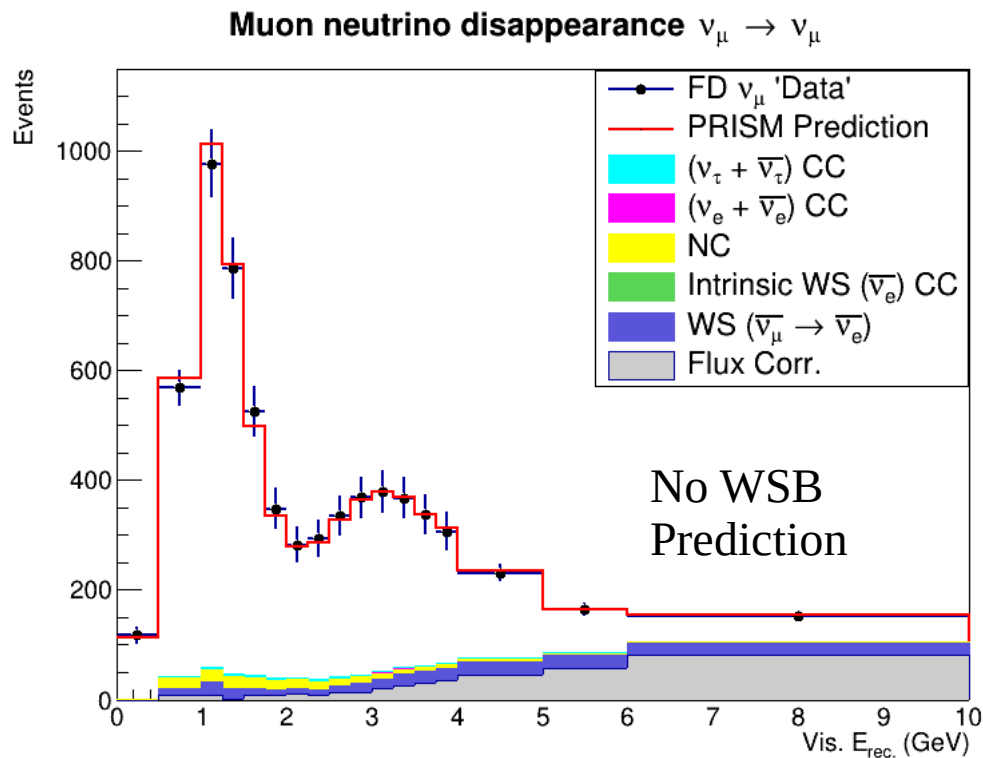
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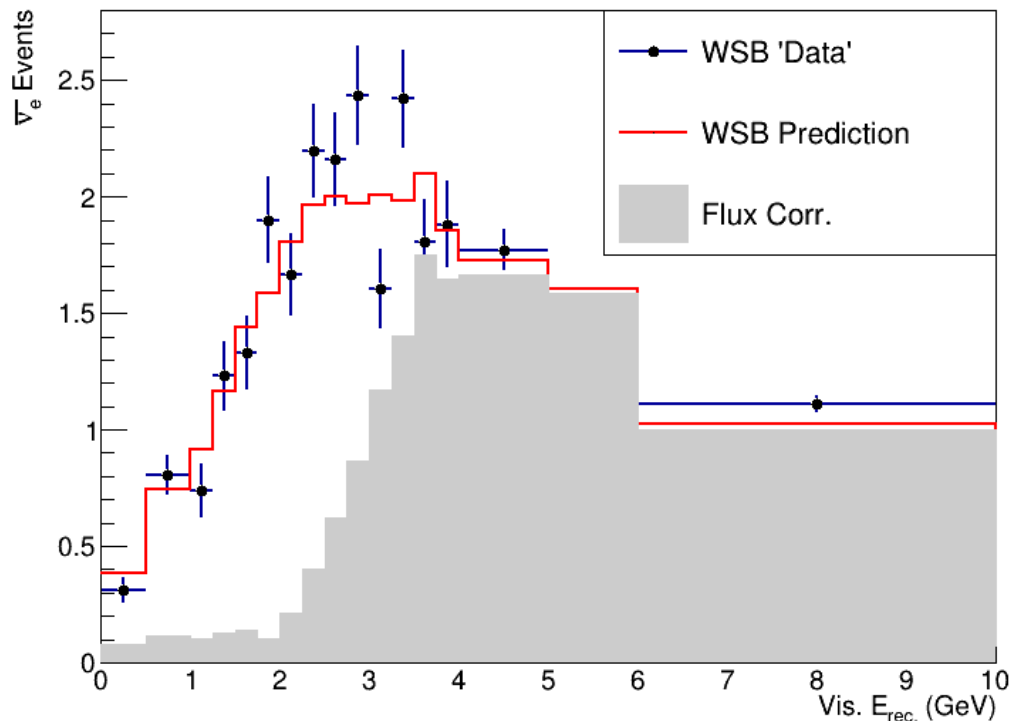
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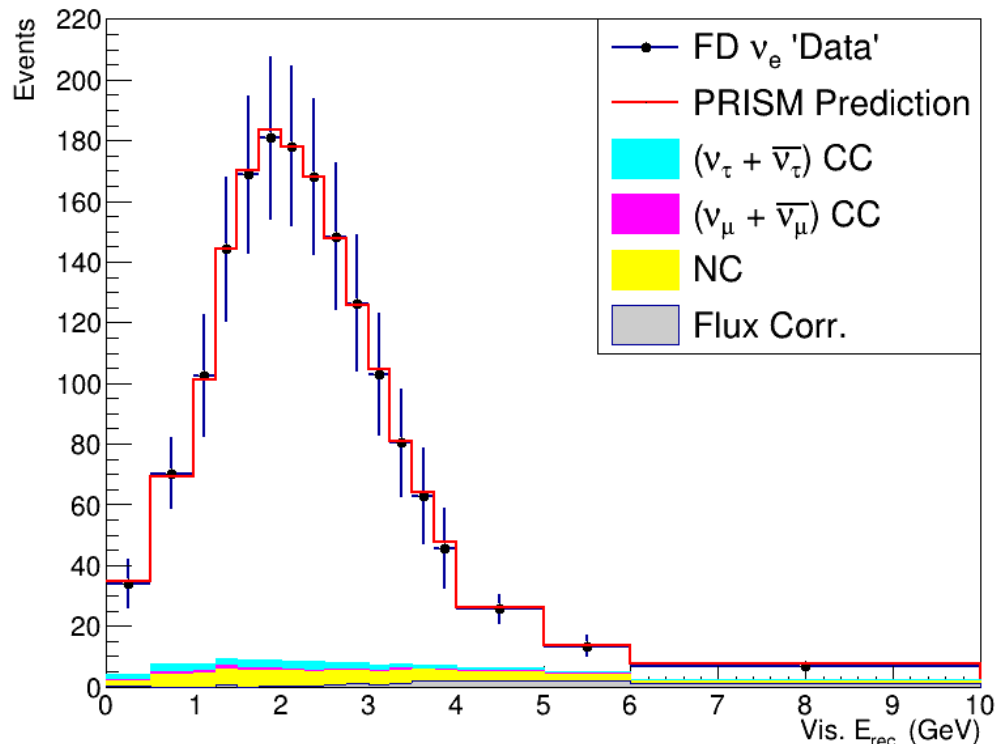
# Wrong Sign Background (WSB) data driven – Appearance neutrino channel

- WSB Prediction =  $\bar{\nu}_\mu \rightarrow \bar{\nu}_e$  from beam contamination + intrinsic  $\bar{\nu}_e$  beam contamination

## WSB Prediction



## Electron neutrino appearance $\nu_\mu \rightarrow \nu_e$



# Wrong Sign Background (WSB) data driven – Disappearance neutrino channel

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