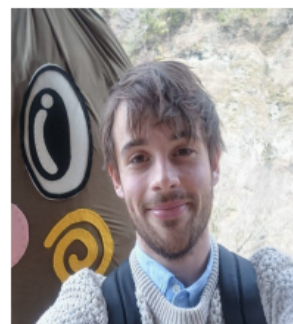




NUISANCE



Patrick Stowell, Luke Pickering, Callum Wilkinson, Clarence Wret



NuSTEC/IPPP Meeting

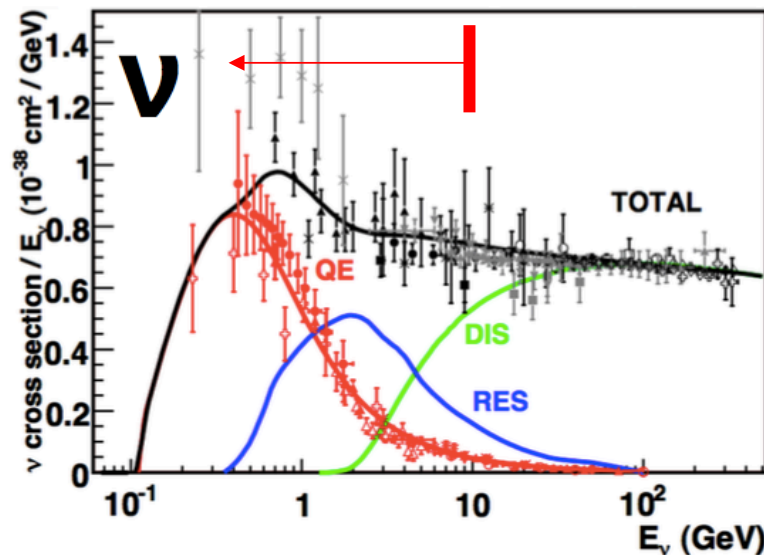
18/04/2017



Comparisons are a snapshot of what is currently in the main neutrino event generators

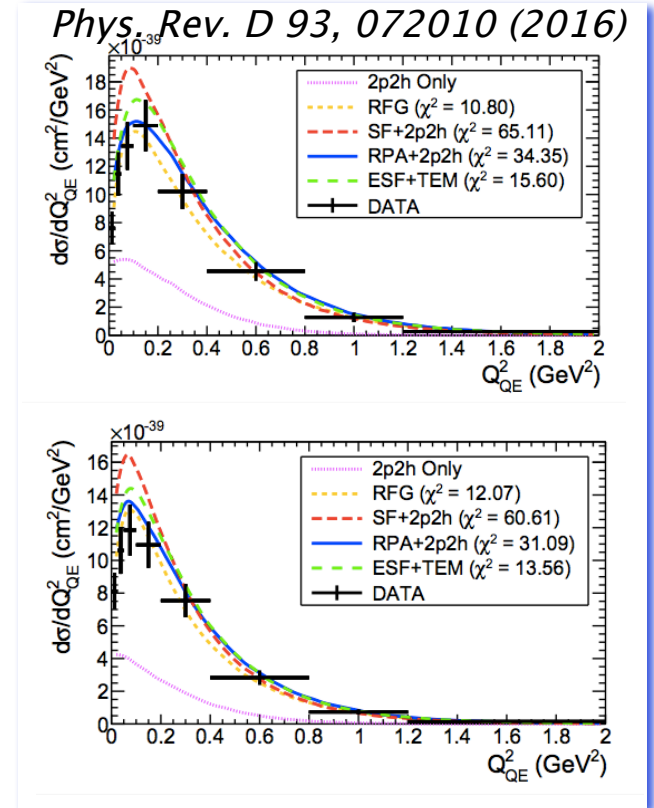
Introduction

- T2K has spent a number of years tuning NEUT to external neutrino scattering data to provide priors for oscillation analyses.
- NUISANCE tuning efforts grew out of this T2K work.
- Current efforts aimed at the 0.1-10.0 GeV range of interest for accelerator Oscillation Analysis (OA) experiments.



MINERvA – MiniBooNE CCQE

- NEUT 5.3.3 had Nieves RPA and 2p2h models added to to relieve ‘large axial mass’ problem in MiniBooNE data.
- NEUT tuned to CCQE data to provide CC0 π constraint for T2K OA:
 - MINERvA 1D- Q^2 $\nu_\mu + \bar{\nu}_\mu$ (correlations)*
 - MiniBooNE 2D- T_μ - $\cos\theta_\mu$ ν_μ*
 - MiniBooNE 2D- T_μ - $\cos\theta_\mu$ $\bar{\nu}_\mu$*

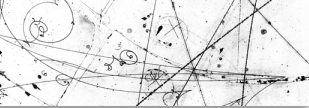


- The quasi-elastic (1p1h) axial mass, and 2p2h total normalisation were tuned as free parameters.

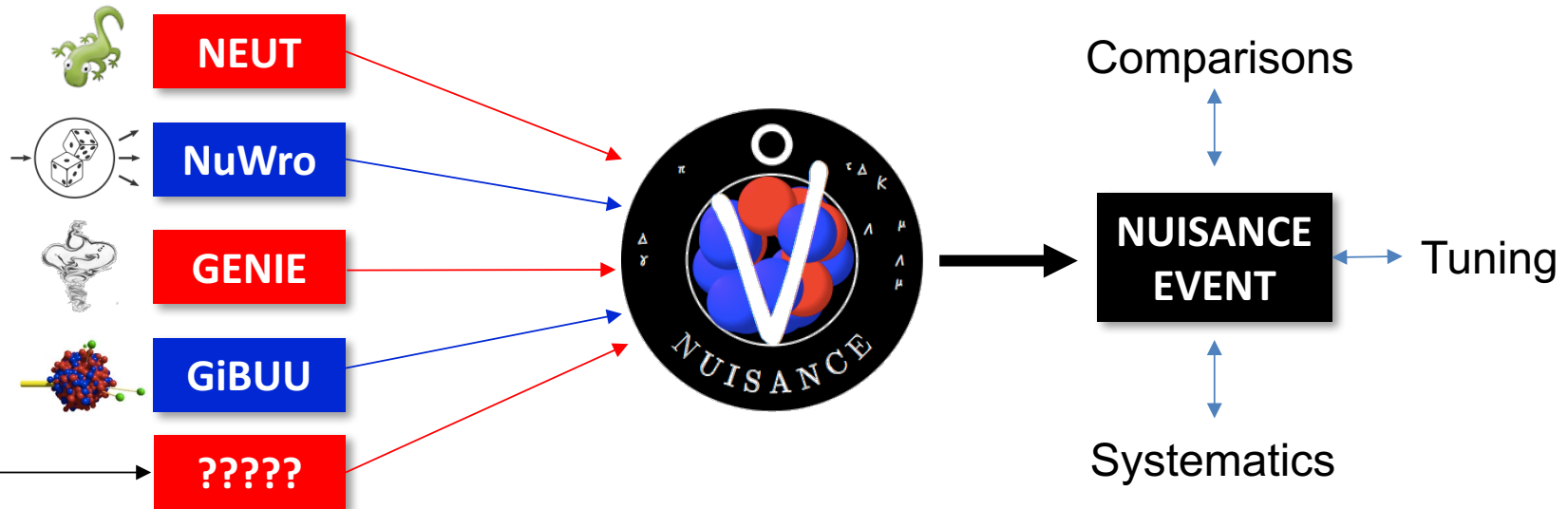
Model	M_A (GeV/c ²)	2p2h Norm (%)	χ^2 /NDOF
NEUT Relativistic Fermi Gas + Nieves-2p2h	1.14 ± 0.03	25.5 ± 12.4	106.25 / 229

- Joint tunings also saw disagreement between datasets:
 - MINERvA preferred a large suppression of 2p2h (-90%)
 - MiniBooNE anti-neutrino preferred a suppression (-100%)
 - MiniBooNE neutrino preferred an enhancement (+50%)
- Several possible issues need to be considered in these tunings:
 1. **RFG+Nieves incorrect, should use LFG+Nieves**
 2. **True CCQE measurements very model dependent**
 3. No shape freedom in RPA or 2p2h model
 4. No correlations between experiments
 5. No proper correlations for MiniBooNE CCQE data

NUISANCE



Insert your
generator
here



- Open source neutrino Monte-Carlo event generator tuning framework
- Easily extendable framework, with a large range of dataset comparisons already included

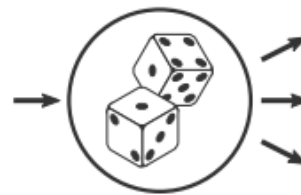


nuisance.hepforge.org

- Plan to create a set of model tunings for the main ‘reweightable’ generators:



NEUT

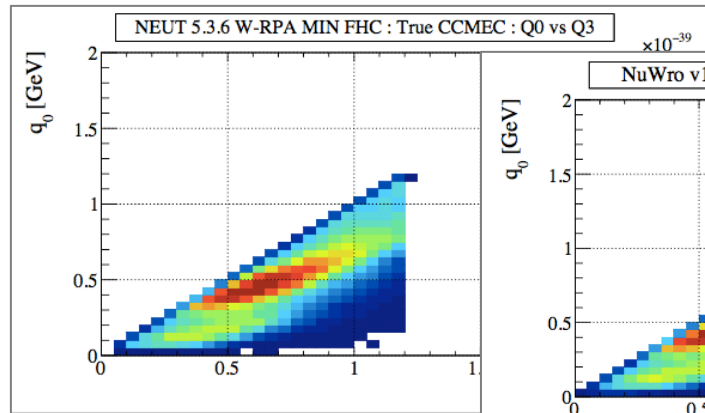
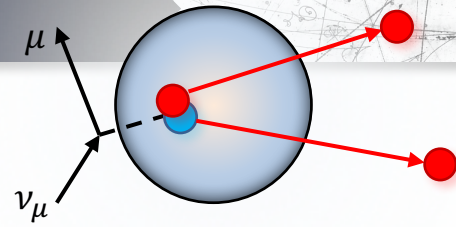


NuWro

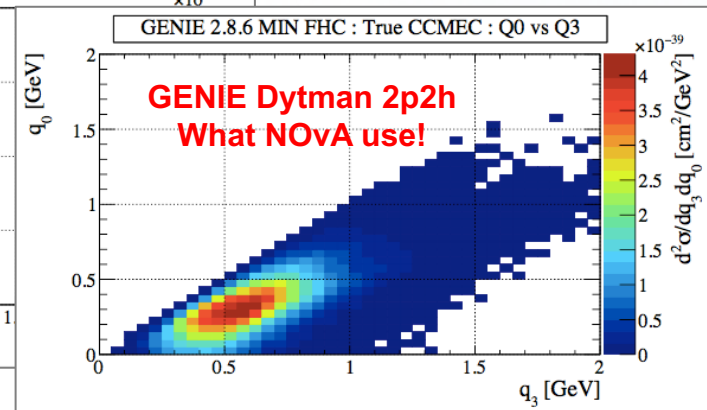
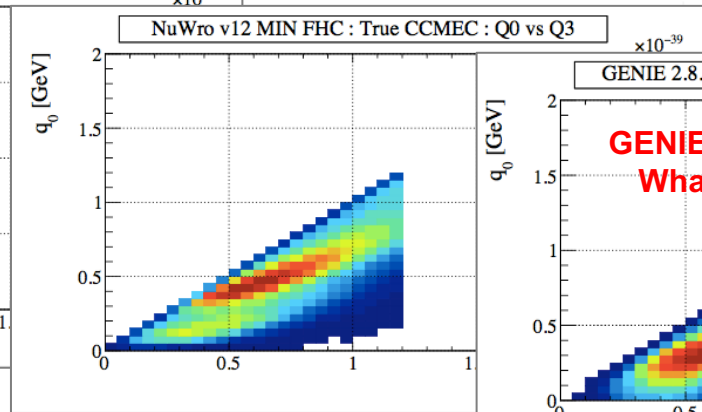


GENIE

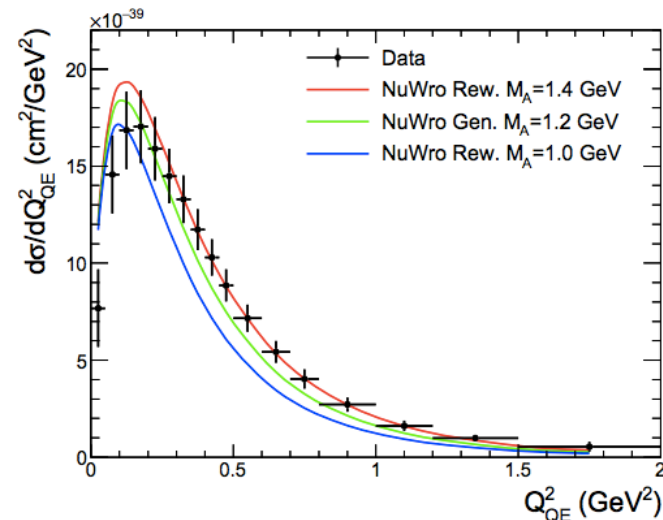
Generator Comparisons



NEUT and NuWro use the
Nieves 2p2h Model



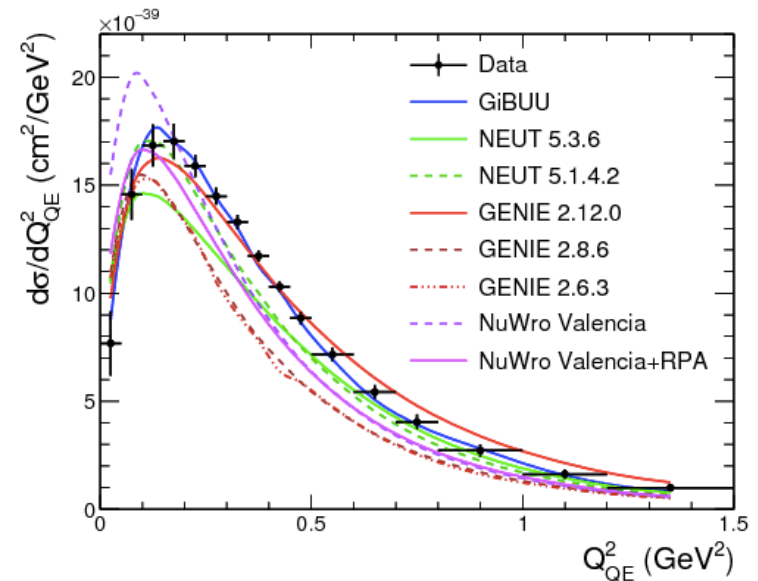
- NUISANCE converts generator events into common format for use by analysis routines
- Can make consistent model comparisons across generators
- Reweight engines allow model predictions to be easily changed



neut_parameter MaCCQE +0.1

Data Comparisons

- To add a comparison you need:
 1. Data distribution
 2. Event signal definition
 3. Binning definition (e.g. Q2QE)
- Support for more complex dataset routines also included:
 - MC True -> Reco Smearing
 - Covariance likelihoods
 - Ratio distributions
 - Arbitrary category MC plots

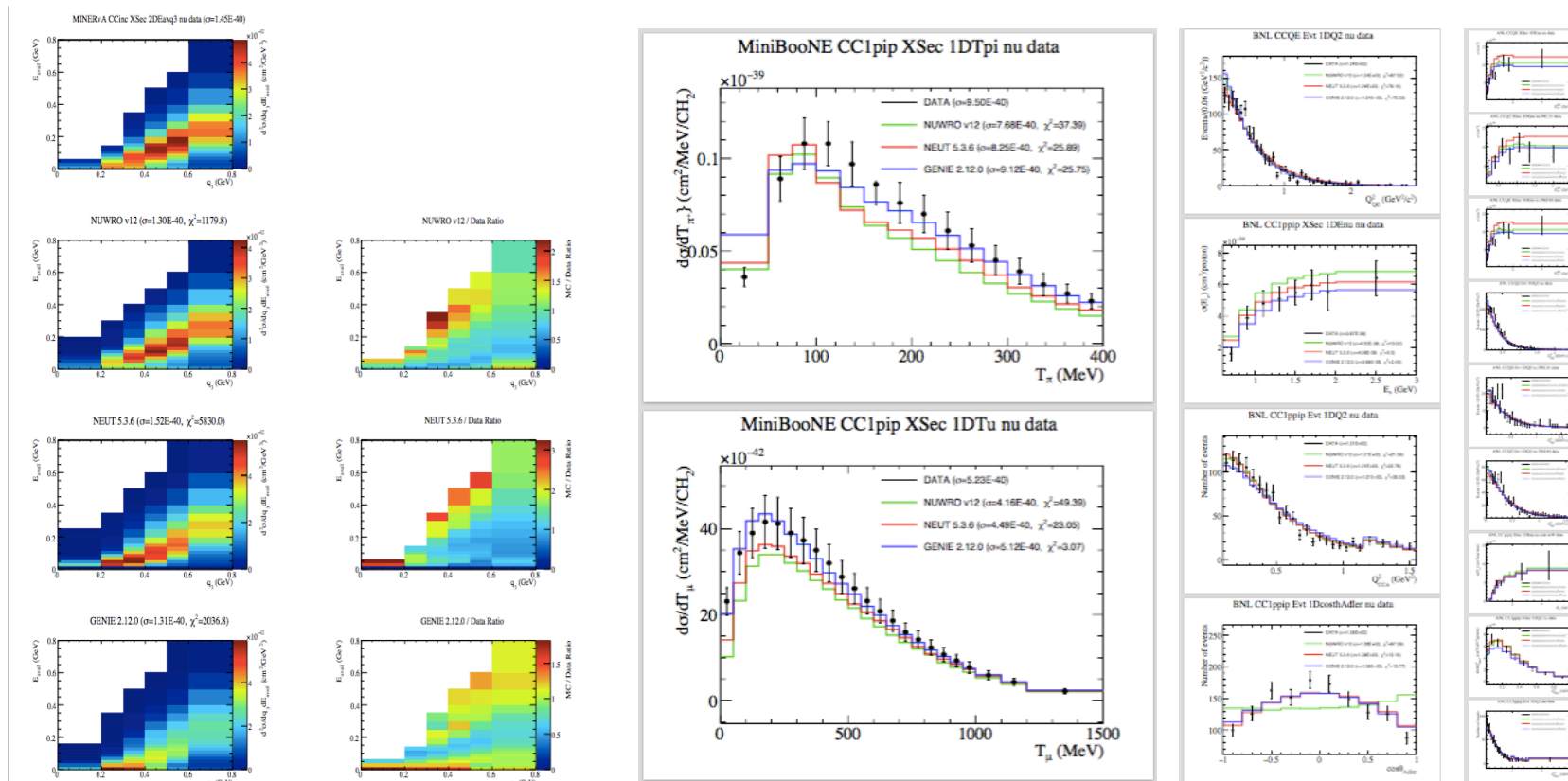


```
//*****  
void MINERvA_CCQE_XSec_1DQ2_nu::FillEventVariables(FitEvent *event) {  
//*****  
  
    if (event->NumFSParticle(13) == 0)  
        return;  
  
    TLorentzVector Pnu = event->GetNeutrinoIn()->fP;  
    TLorentzVector Pmu = event->GetHMFSParticle(13)->fP;  
  
    double ThetaMu = Pnu.Vect().Angle(Pmu.Vect());  
    double q2qe = FitUtils::Q2QErec(Pmu, cos(ThetaMu), 34., true);  
  
    // Set binning variable  
    fXVar = q2qe;  
    return;  
}
```

v1r0 Validation

- Perform NEUT, NuWro, and GENIE comparisons during validation of each version freeze to ensure sample predictions behave as expected.

[NUISANCE Validation Link](http://nuisance.hepforge.org/files/validation/nuisancevalidation_v1r0_280217/nuisance_v1r0_validation_280217.pdf) : Comparison of generators to ~150 different datasets

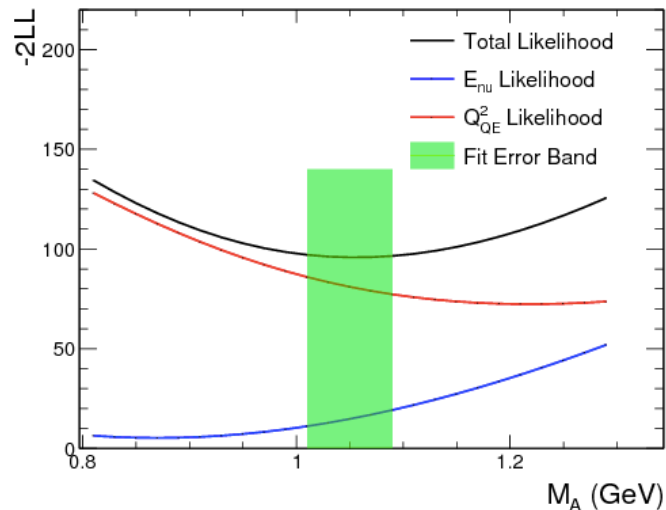


http://nuisance.hepforge.org/files/validation/nuisancevalidation_v1r0_280217/nuisance_v1r0_validation_280217.pdf

host all the MC files used to make these comparisons on our site!

Tuning a model : 'nuismin'

- Likelihoods calculated for each dataset comparison can be used with Minuit to tune model parameters.



`nuisance_tuning.card`

```
neut_parameter MaCCQE 0.0 -3.0 3.0 1.0 FREE
neut_parameter MaNFFRES 0.0 -3.0 3.0 1.0 FREE
```

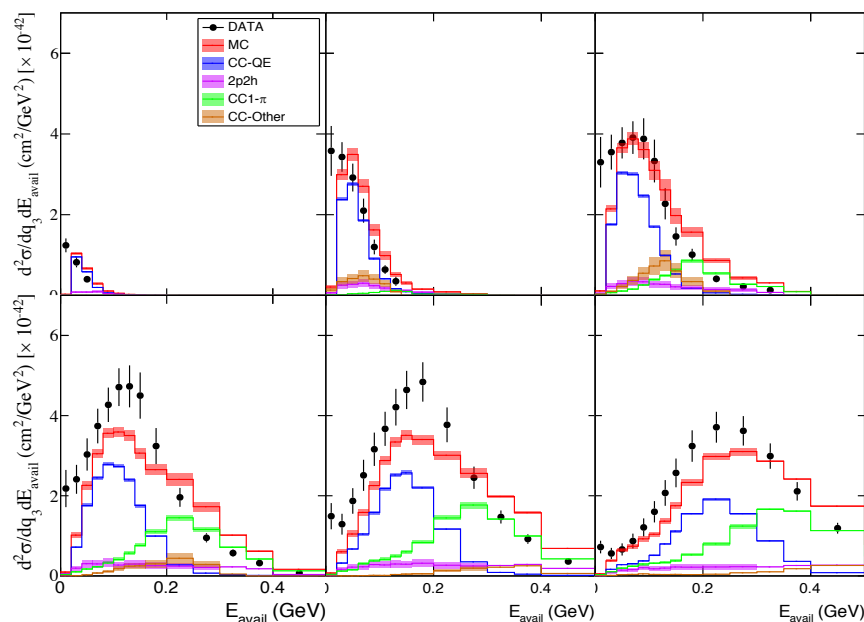
```
$ nuismin -c nuisance_tuning.card
          -o nuisance_tuning.root
```

- Any reweight dial can be specified as a free parameter and tuned to improve the joint likelihood between many datasets.

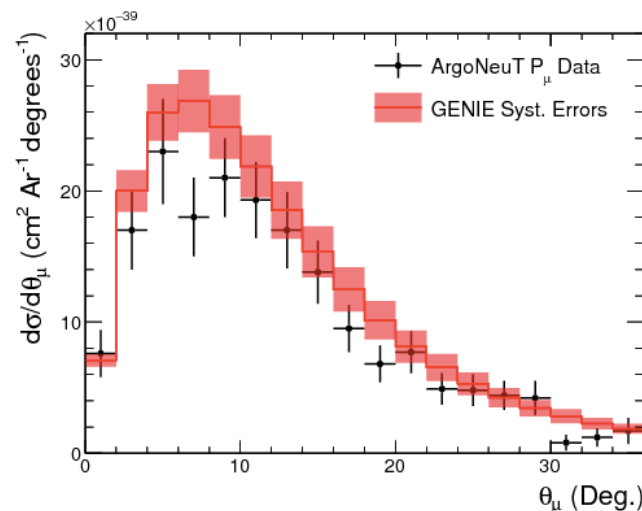
Error Bands

- Included support for systematic error band generation.
- Plan to release an error bands document similar to the NUISANCE v1r0 validation included with every set of model tunings.
- Tuning error bands for every dataset implemented in NUISANCE.

T2K NEUT Uncertainties vs MINERvA Data



GENIE 1-sigma reweight dial throws vs ArgoNeut Data



Downloading NUISANCE

- Code can be checked out from our site, where you can also find build notes, MC files, validation, etc:

nuisance.hepforge.org

**NOW BACK
TO THE SHOW**

Can NuWro LFG save the day?

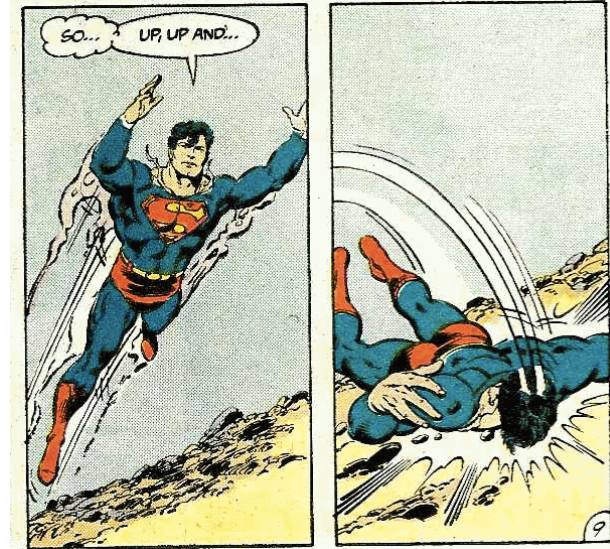
- Very easy in NuWro to generate events with different nuclear spectral functions.
- Using NUISANCE, we can perform **identical model tuning** of NuWro+LFG+Nieves to data.



Model	M_A (GeV/c ²)	2p2h Norm (%)	χ^2 /NDOF
NEUT Relativistic Fermi Gas + Nieves-2p2h	1.14 ± 0.03	25.5 ± 12.4	106.25 / 229

Can NuWro LFG save the day?

- Very easy in NuWro to generate events with different nuclear spectral functions.
- Using NUISANCE, we can perform **identical model tuning** of NuWro+LFG+Nieves to data.
 - ~~1. RFG+Nieves incorrect, should use LFG+Nieves~~
 2. True CCQE measurements very model dependent

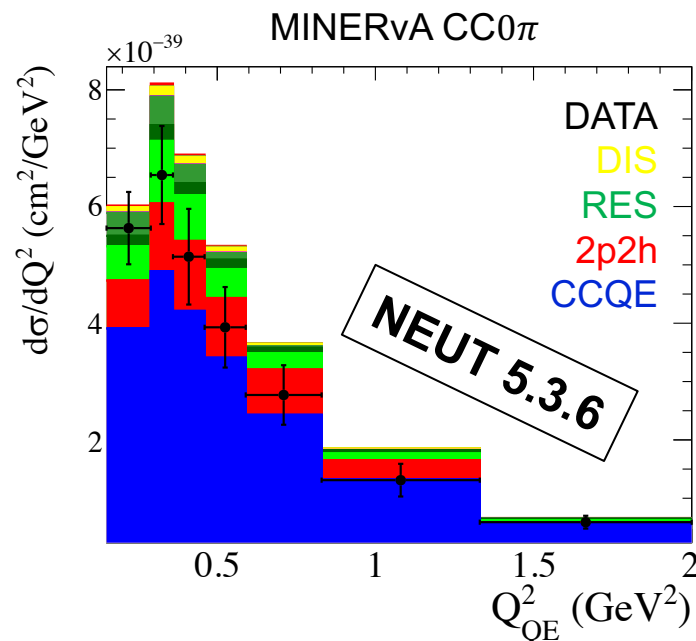
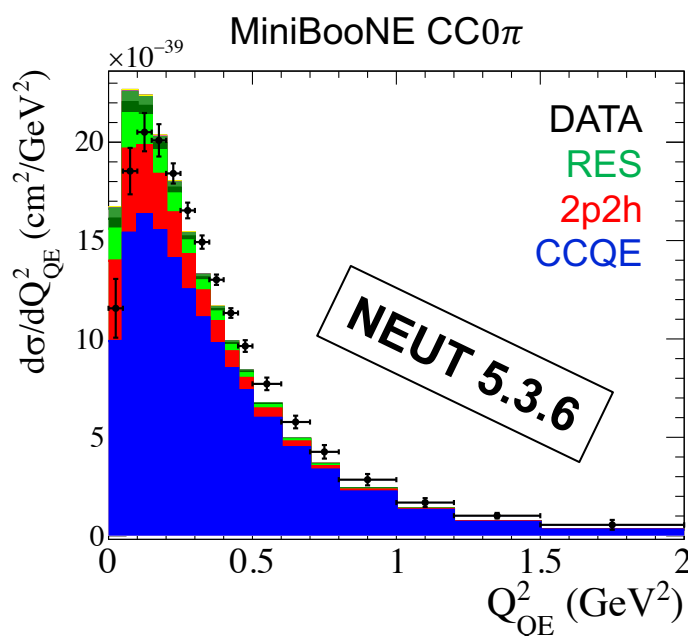


Model	M_A (GeV/c ²)	2p2h Norm (%)	χ^2 /NDOF
NEUT Relativistic Fermi Gas + Nieves-RPA + Nieves-2p2h	1.14 ± 0.03	25.5 ± 12.4	106.25 / 229
NuWro Local Fermi Gas + Nieves-RPA + Nieves-2p2h	1.16 ± 0.03	8.3 ± 11.9	100.74 / 229

T2K CCQE Tuning Results to MiniBooNE/MINERvA Data

Changing Topology

- MiniBooNE released equivalent $\text{CC}0\pi$ data before background selection.
- MINERvA expect to release similar $\text{CC}0\pi$ data in muon kinematics soon.
- **Measured final state topologies have reduced model dependence.**



- Have to include consider contributions from $\text{CC}1\pi$ where the pion is absorbed before it left the nucleus.
- **Adds lots more free parameters to account for!**

NEUT Model Parameters

- What model are we using in NEUT 5.3.6?
- What can we actually vary to improve agreement?

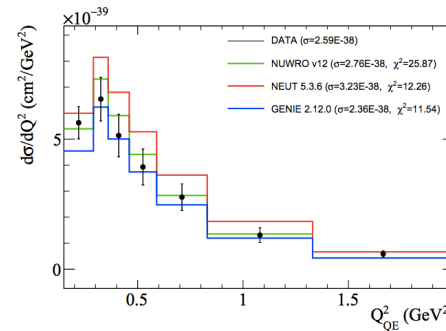
Category	Description	Parameters
CCQE	Llewellyn-Smith	M_A , p_F , E_b , RPA-Shape
2p2h-lepton	Nieves	Δ – Non Δ shape, pn/nn ratios
2p2h-hadron	Sobczyk ejection model	
RES	Rein-Sehgal	M_A^{RES} , C_A^5 , $I_{1/2}$
COH	Berger-Sehgal	Rein-Sehgal alternative option
FSI	Oset Model	Pion/Nucleon FSI Fractions
DIS	PYTHIA 5.7	
Nuclear	RFG	SF alternative option
Other		Channel Norms, $\nu_\mu - \nu_e$ ratio

Unless stated otherwise, comparisons from this point on are from NEUT.
See Marco's Talk for GENIE comparisons

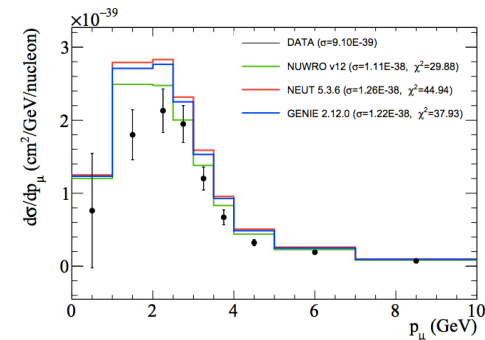
Nuclear Model Building

- Difficult to disentangle where model deficiencies are using nuclear scattering data alone.
- Large degeneracies between free model parameters.

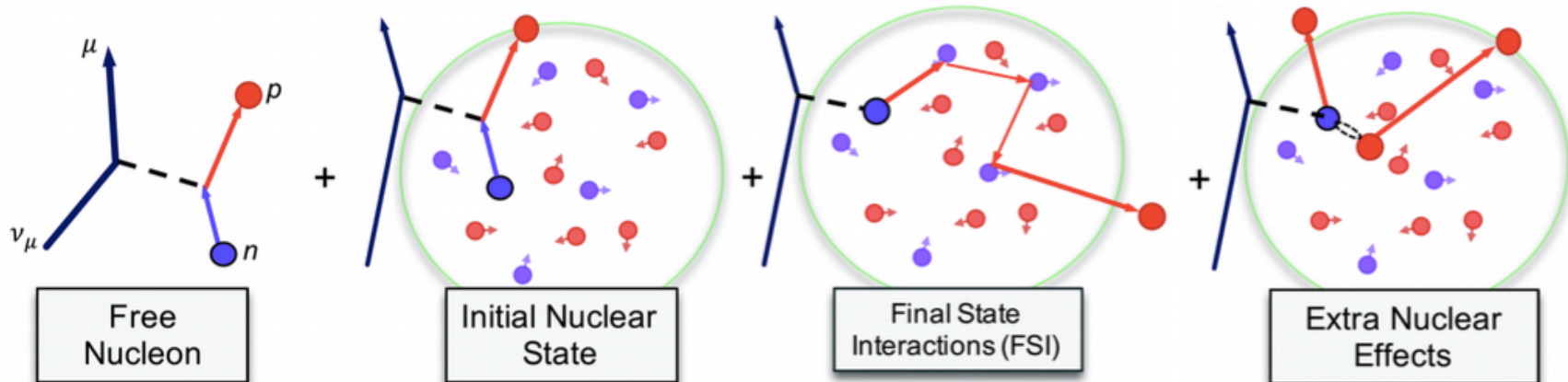
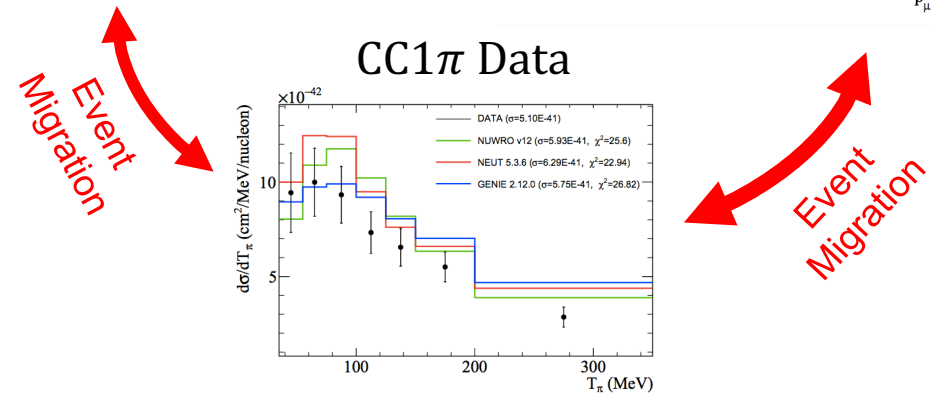
CC0 π Data



CCN π Data

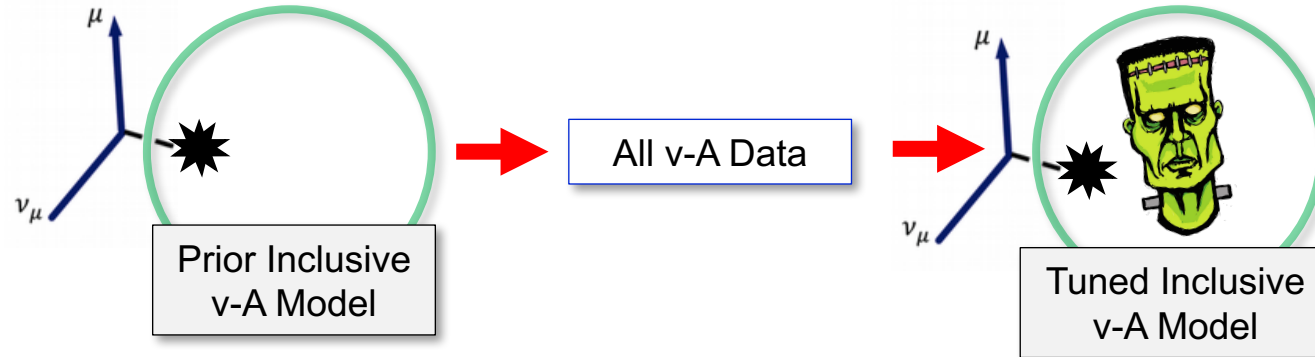


CC1 π Data

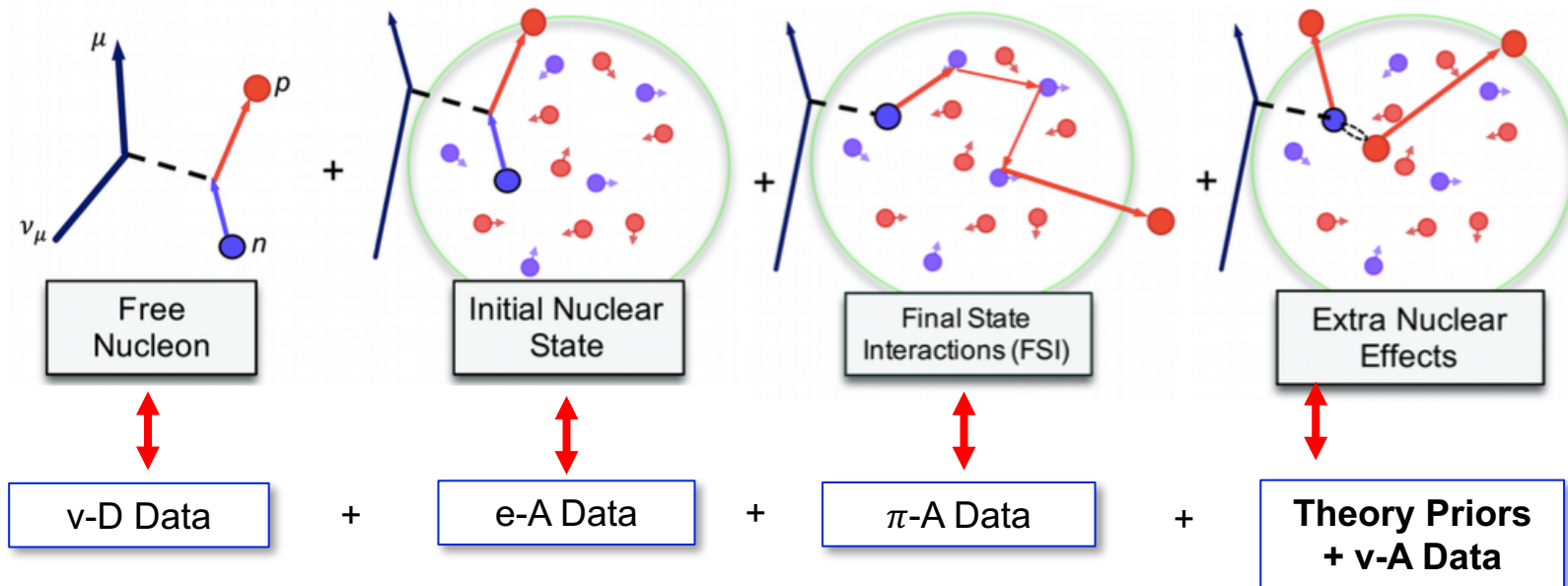


Nuclear Model Building

- **Brute Force Approach:**



- **Modular Approach:**

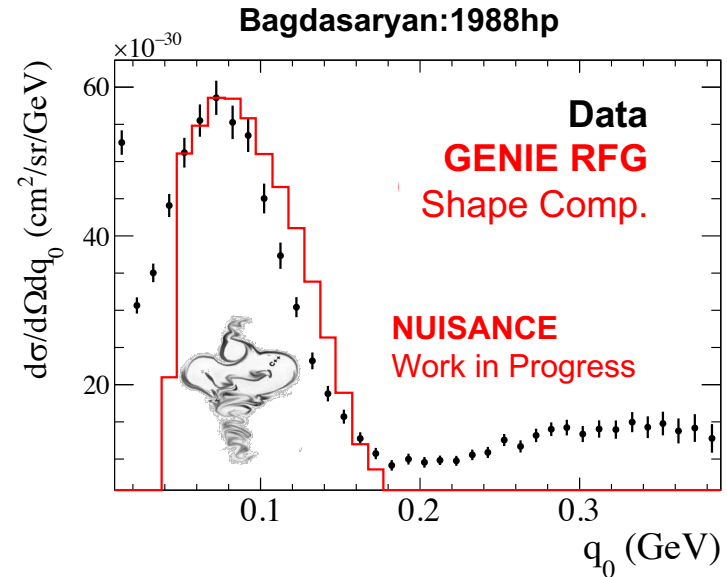
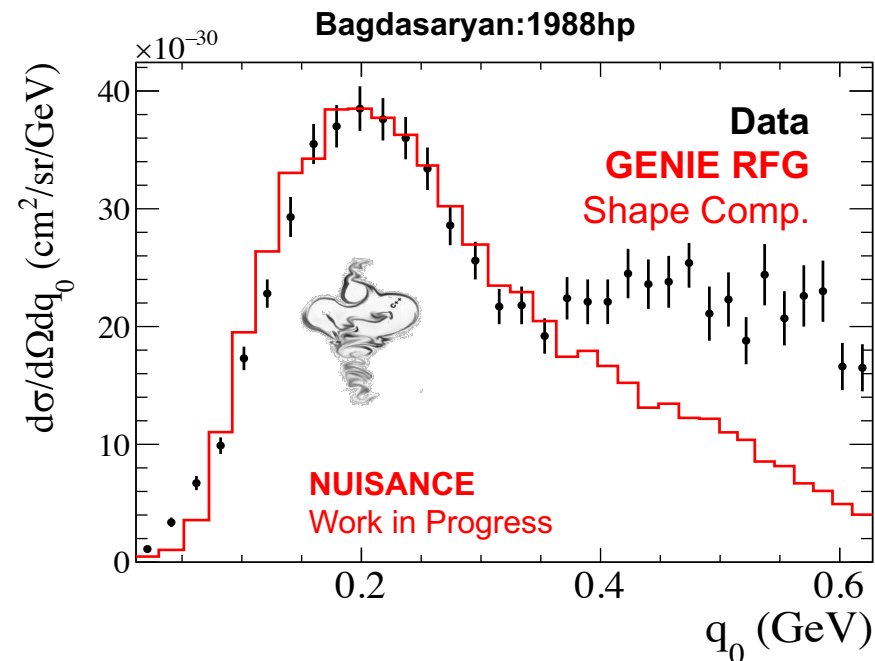




e-A Data

Electron Scattering

- GENIE, and GiBUU both have support for electron scattering (eWro coming soon).
- Want to setup some easy to use standard validation tests using electron scattering.



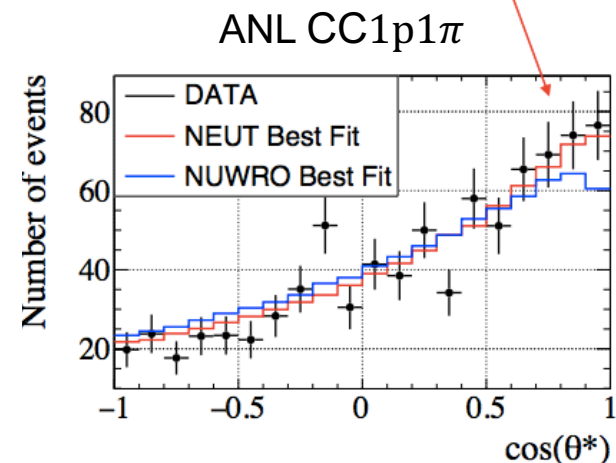
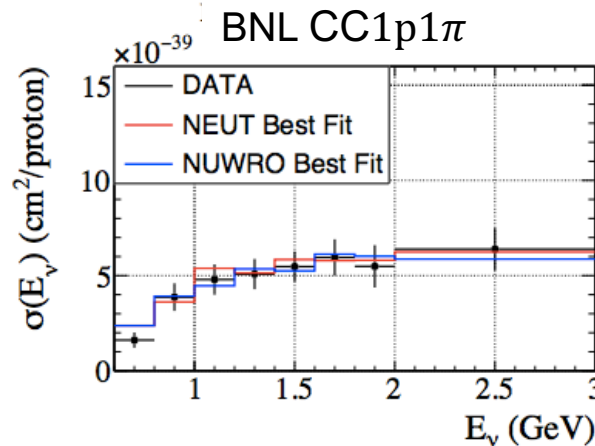
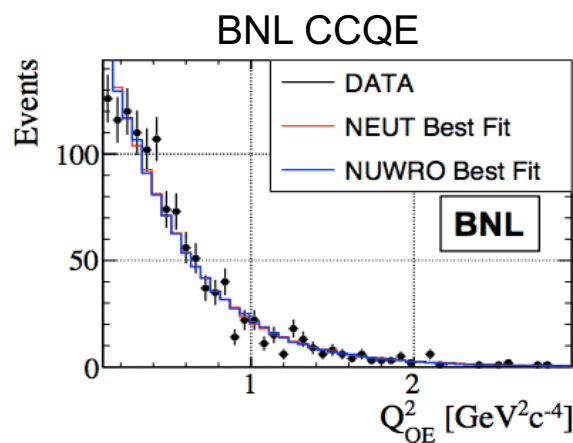
- Early NUISANCE interface with the QE electron scattering archives.
(nucl-ex/0603032) <http://faculty.virginia.edu/qes-archive/>
- Comparisons shown today are just using NEUT's RFG model.
- If interested please come speak to me afterwards!

v-D Data

Bubble Chamber Tuning Results

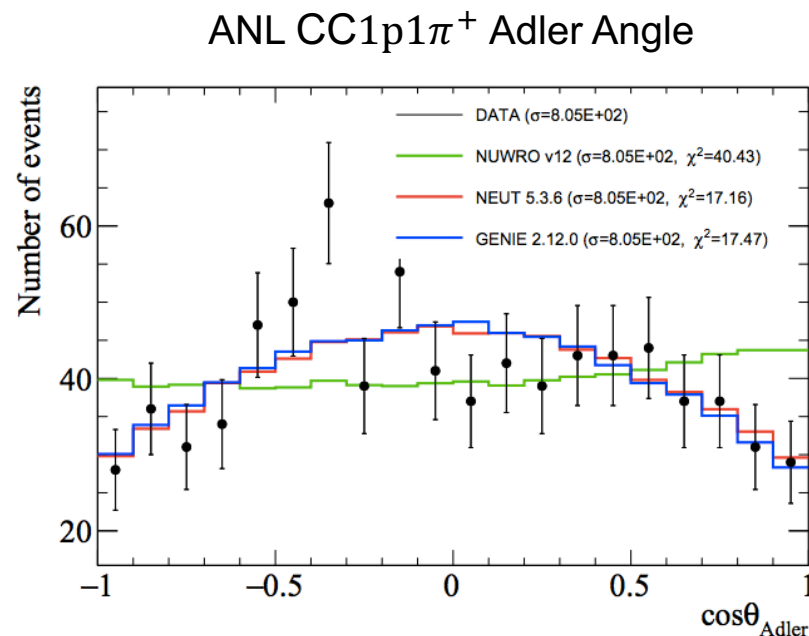
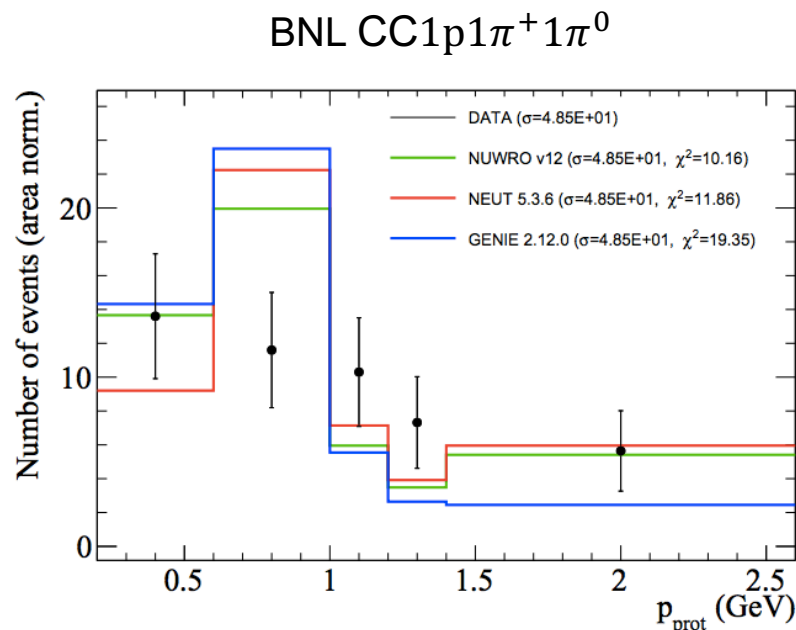
	QE		RES		
Fit Results	M_A [GeV/c ²]	χ^2 /NDOF	M_A^{RES} [GeV/c ²]	C_A^5	χ^2 /NDOF
NEUT (v5.3.6)	1.04 ± 0.03	159.8 / 146	0.89 ± 0.04	1.02 ± 0.05	102.8 / 102
NuWro (v12)	1.03 ± 0.03	154.4 / 146	0.92 ± 0.03	1.04 ± 0.05	111.9 / 102

- Find good agreement in tunings to limited datasets from ANL+BNL CCQE+CC1p1 π ($W < 1.4$ GeV).
- Already begin to see disagreements appearing due to difference in how NEUT and NuWro handle resonances...



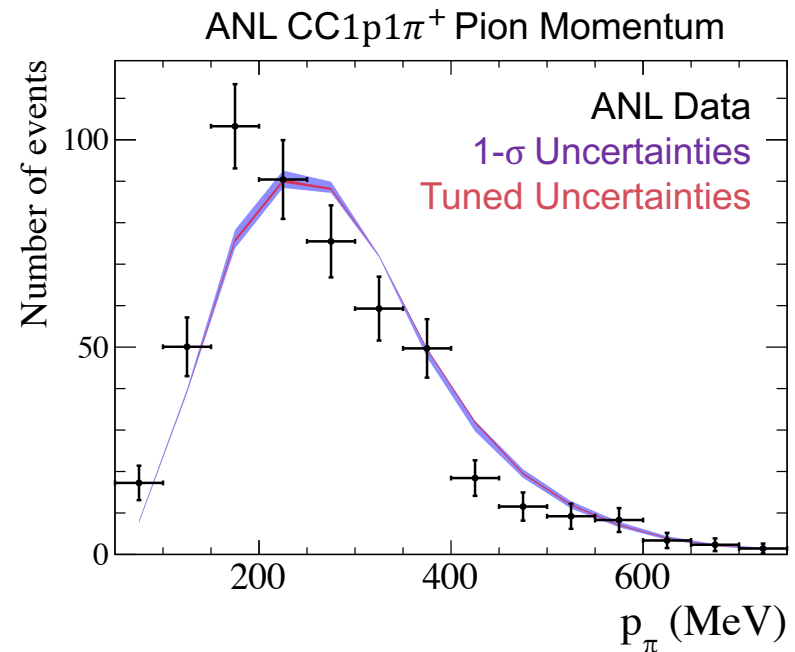
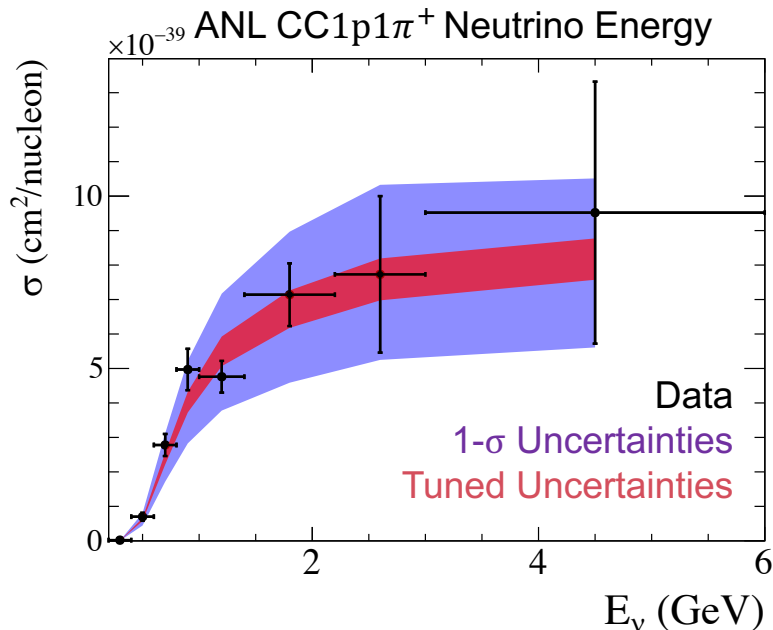
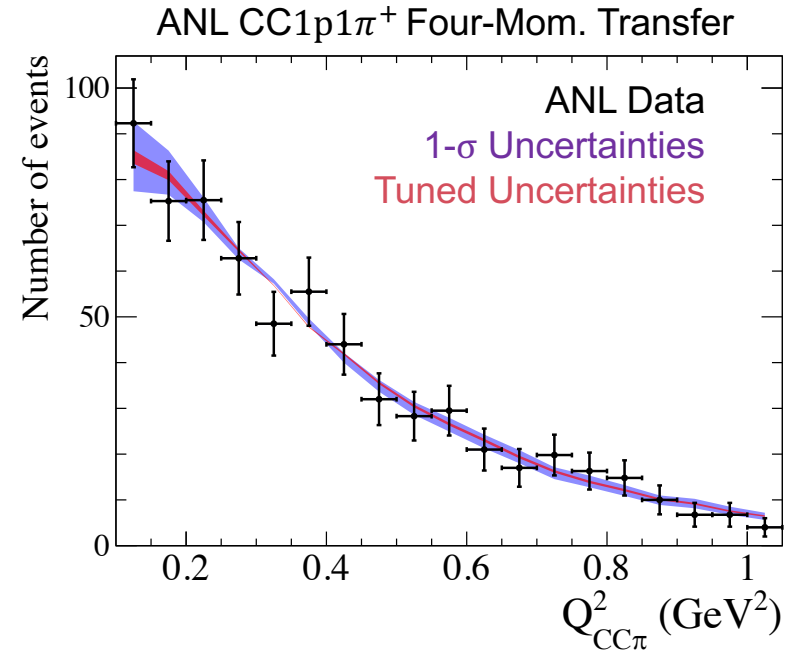
NuWro/NEUT Bubble Chamber

- Expect generator differences to be larger for $W > 1.4$ GeV pion data.
- Larger range of interesting pion bubble chamber measurements already included in NUISANCE.
- Plan to extend these tunings in official NUISANCE tuning results release for NEUT/NuWro/GENIE later this year.



Pion Kinematics

- ANL/BNL Enu Distributions have largest sensitivity to free model parameters.
- Models don't have much freedom to change shape of pion kinematics.



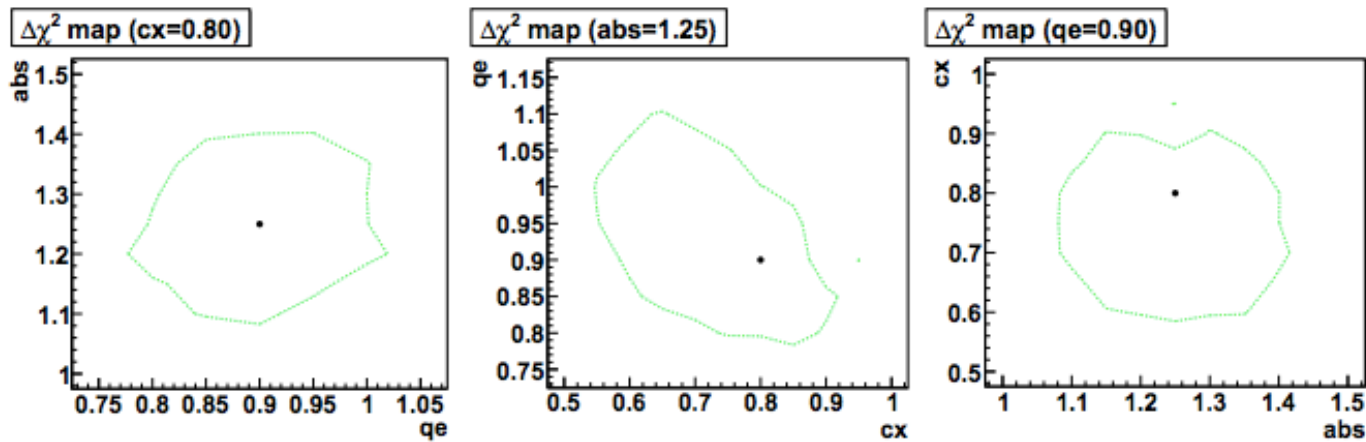


π -A Data (FSI)

FSI Errors on CC0PI

- NEUT's FSI model tuned to π -A scattering data.
- Expect updated tuning on this from T2K FSI group this year.

K. Ieki. Observation of $\nu\mu \rightarrow \nu e$ oscillation in the T2K experiment. 2014



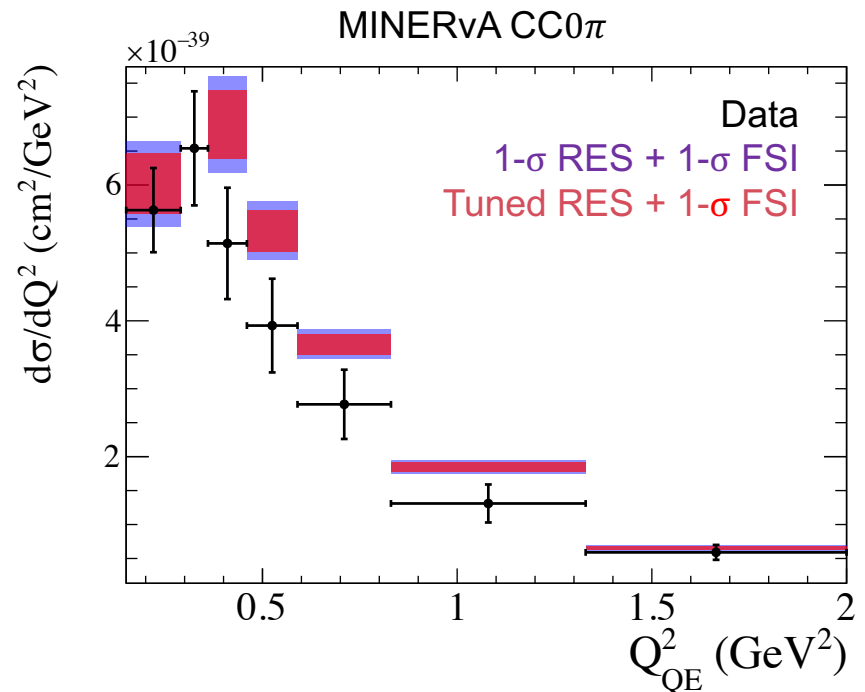
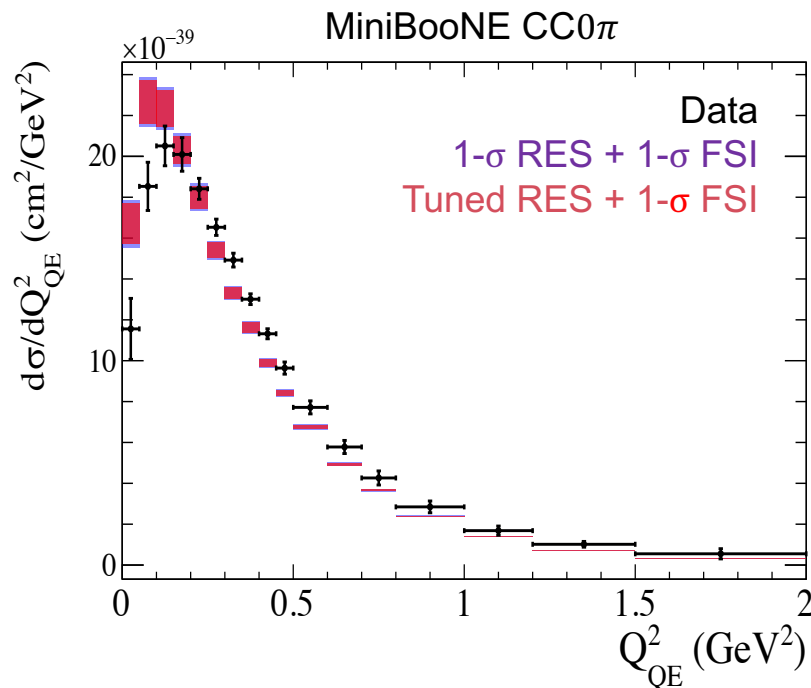
Would also like to include these pion scattering comparisons into NUISANCE to aid future FSI studies in other generators.

Any takers?

v-A Data

FSI+RES Uncertainties

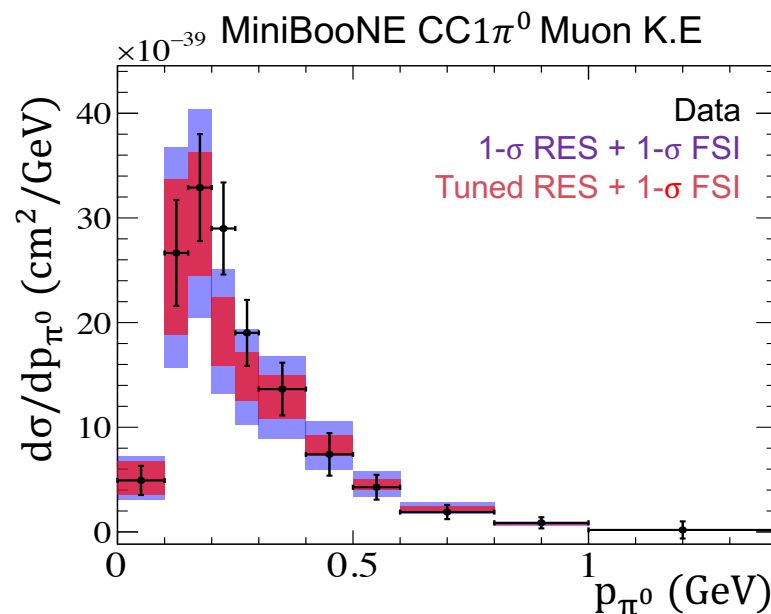
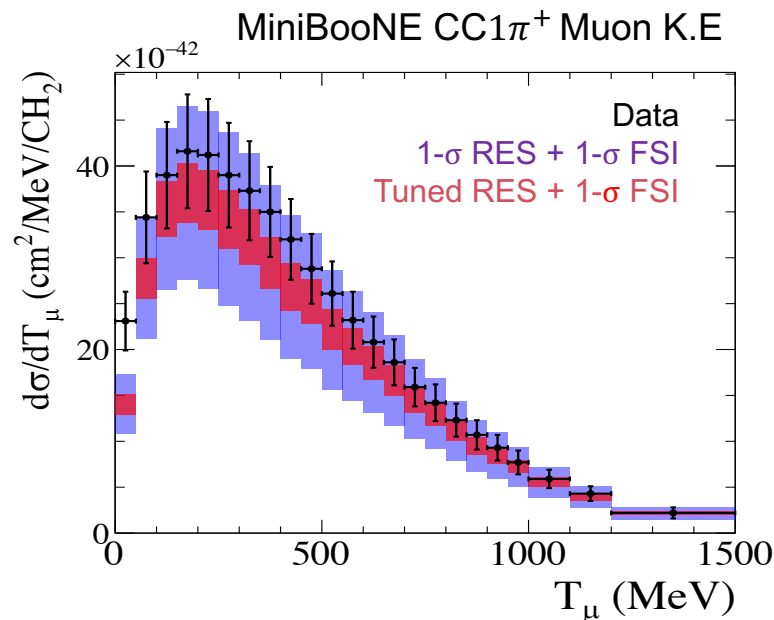
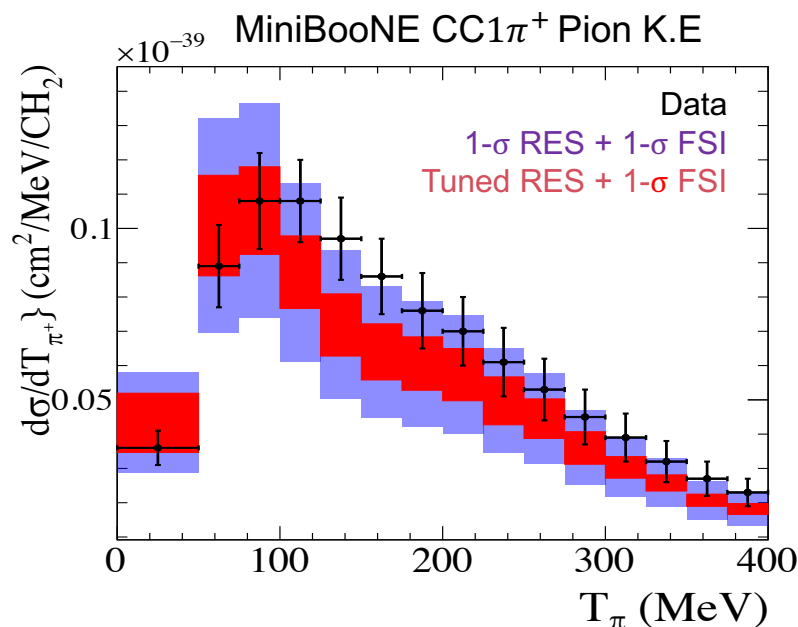
- FSI contributes a lot to uncertainties at low Q^2 on the resonant background in the $CC0\pi$ samples.



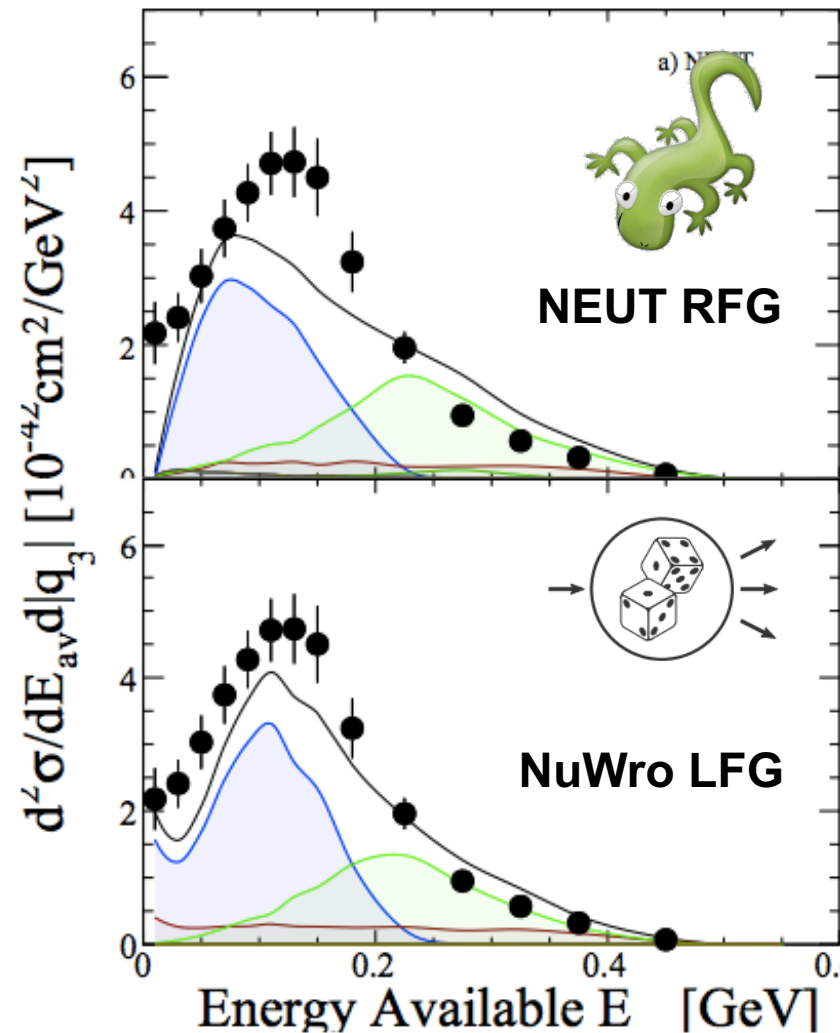
- Expect an updated set of tighter FSI constraints in NEUT later this year.
- Work ongoing to properly marginalize over these sorts of background uncertainties in NUISANCE tunings.

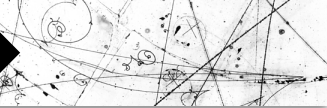
CC1 π Data

- Disagreements between nuclear data and MC uncertainties highlight tensions between bubble chamber and nuclear data in pion kinematics.
- Often attributed to FSI model, but remember our pion kinematic model is also fixed.....

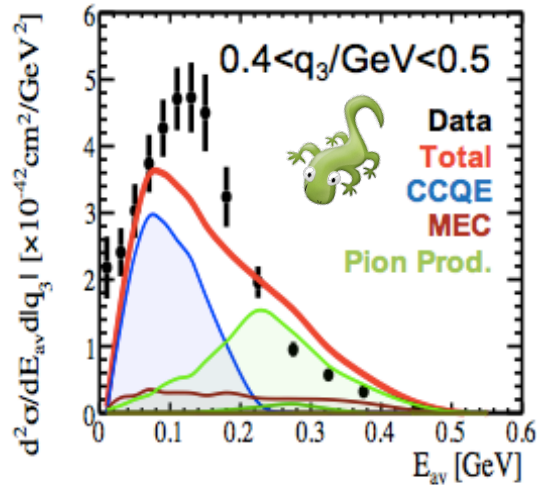


- End goal is to produce an inclusive cross-section model that can also describe exclusive channels well.
- Recent MINERvA data a good example of how difficult this is going to be due to model degeneracies.
- They measure hadronic energy (E_{av}) and three momentum transfer (q_3) for a CC-inclusive signal.
- Evidence of data-MC disagreements in dip region where CCQE, CCRES, CC2p2h all contribute.

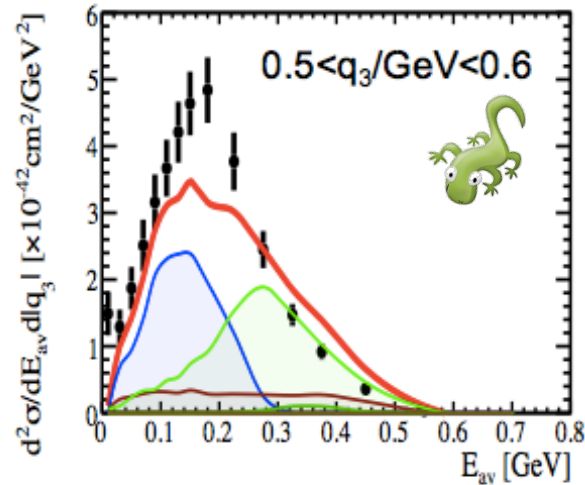




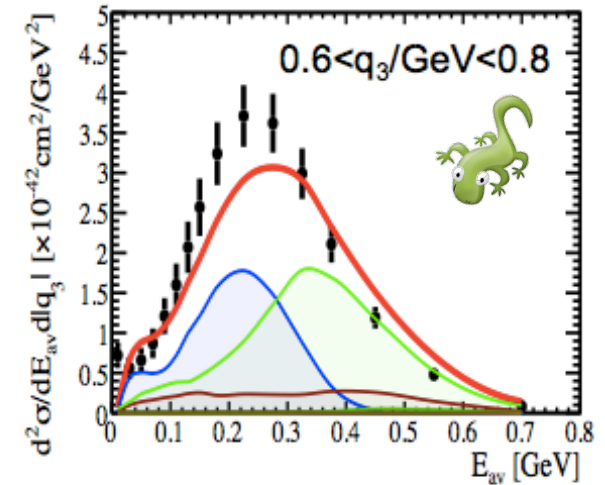
NEUT v5.3.6



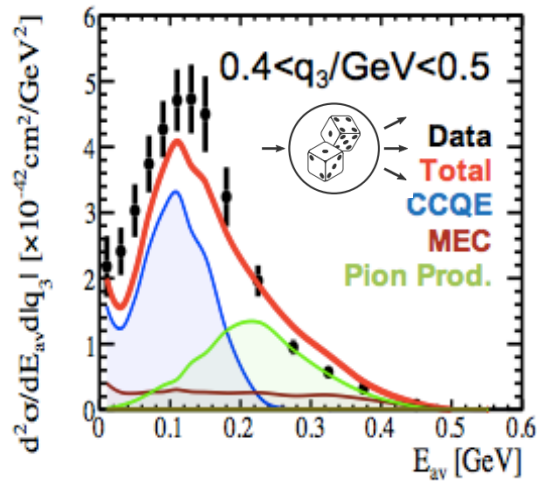
NEUT v5.3.6



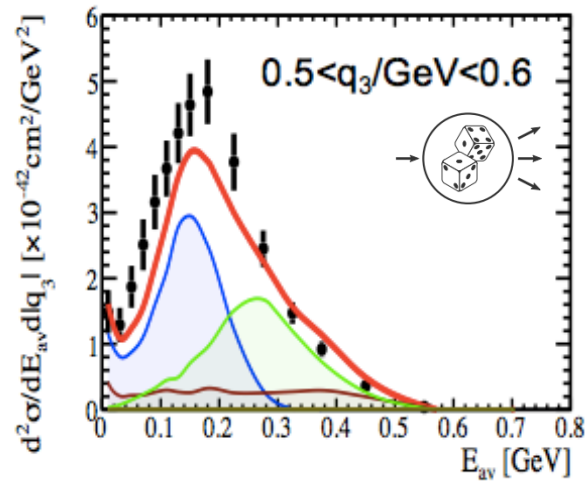
NEUT v5.3.6



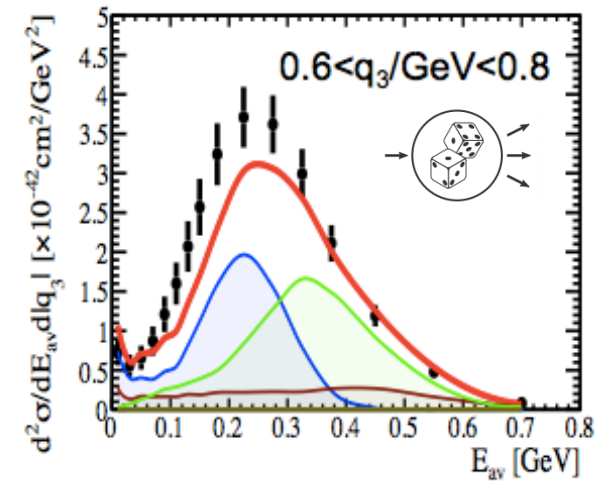
NUWRO v12



NUWRO v12



NUWRO v12



Summary

- Comparisons between generators and data vital tool for model testing.
- Will become even more important as more sophisticated measurements are made (e.g. Transverse Kinematic Measurements)
- Long way to go to have a consistent inclusive model in NEUT.
- Lots of moving parts to think about when running joint fits to v-A data.
- Need much closer collaboration with theorists and generator developers, especially when it comes to data comparisons understanding.



Thanks for listening!

Join NUISANCE!

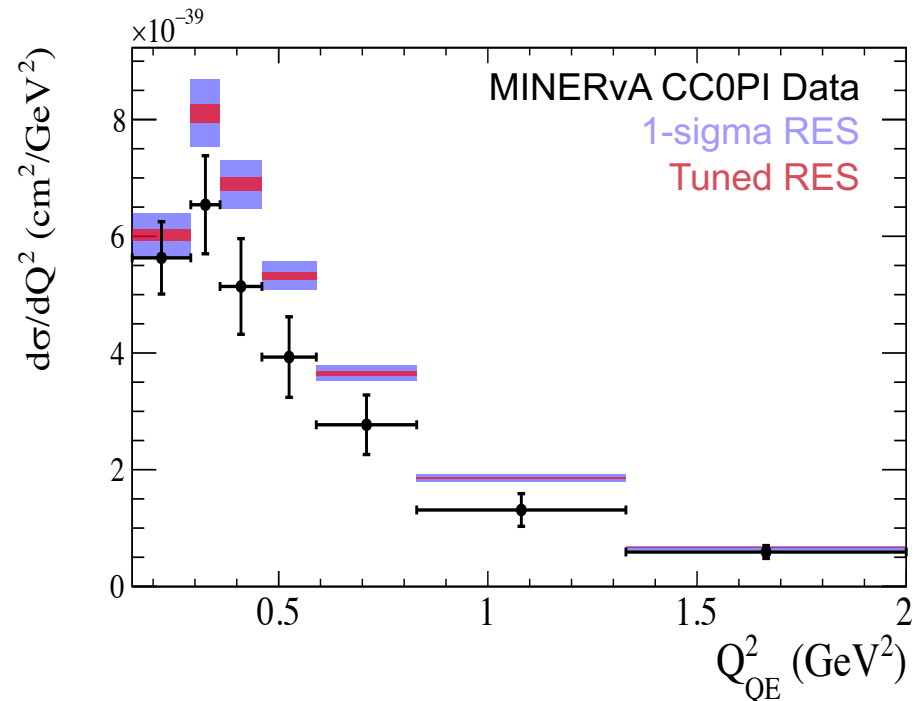
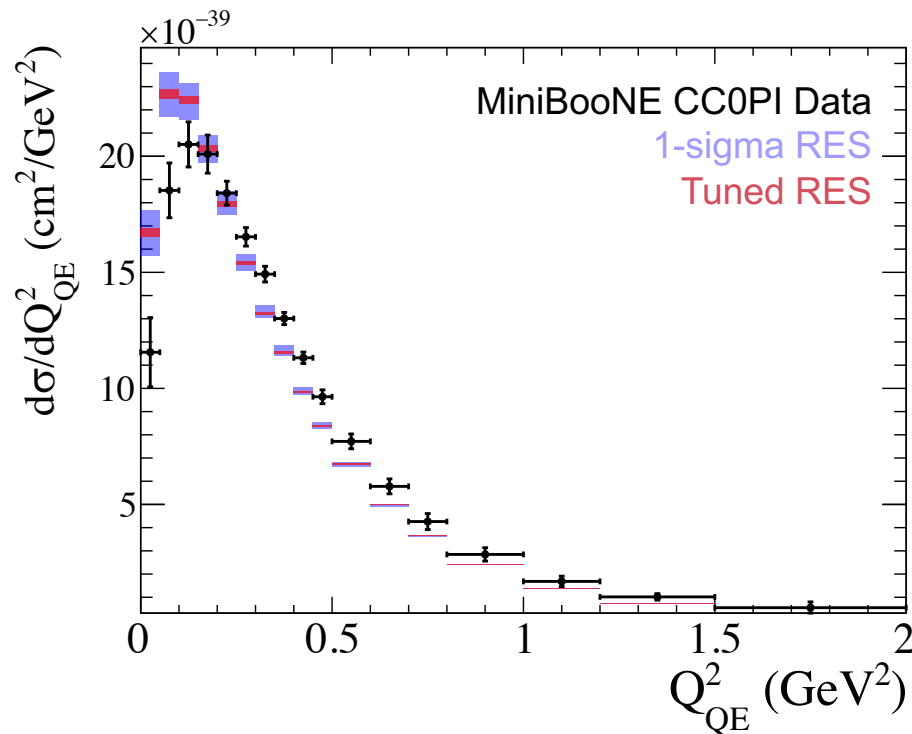
nuisance.hepforge.org



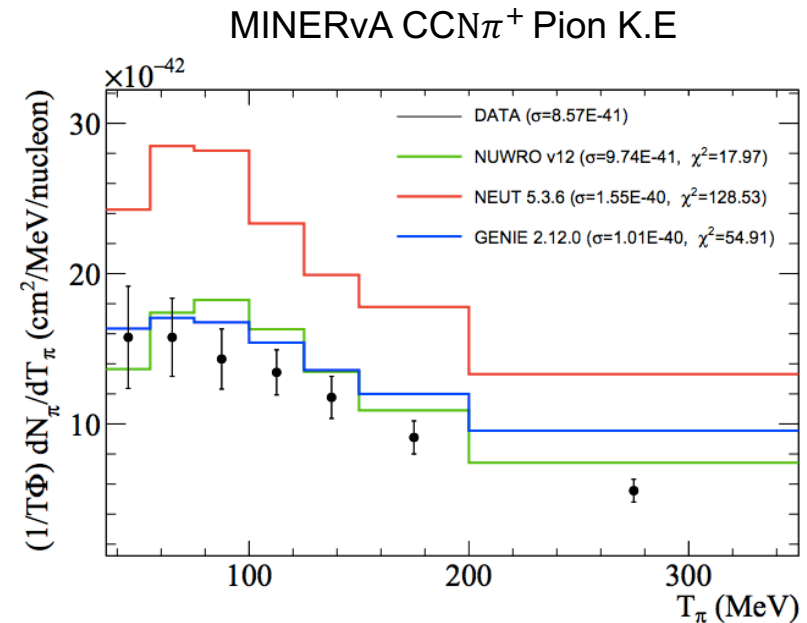
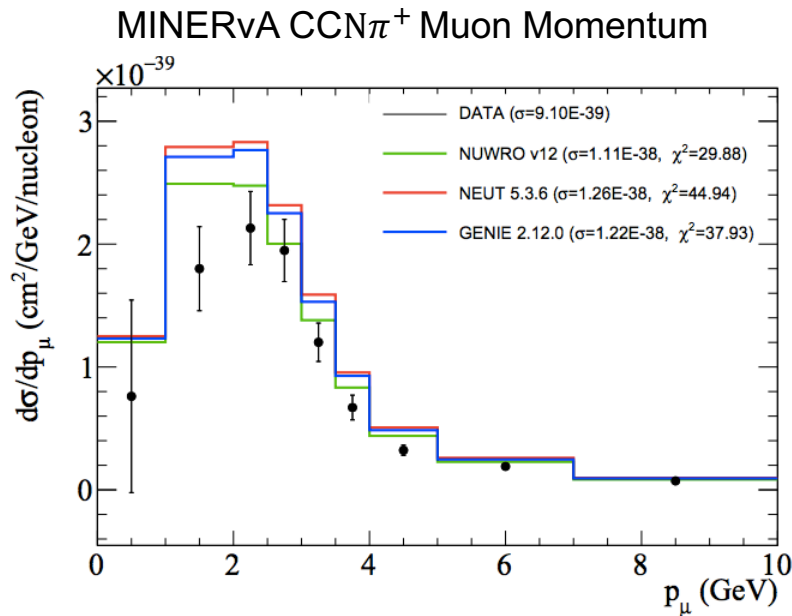
BACKUPS

BC Priors on CC0 π RES

- Initial bubble chamber tunings set a tighter constraint than starting 1-sigma uncertainties as expected.

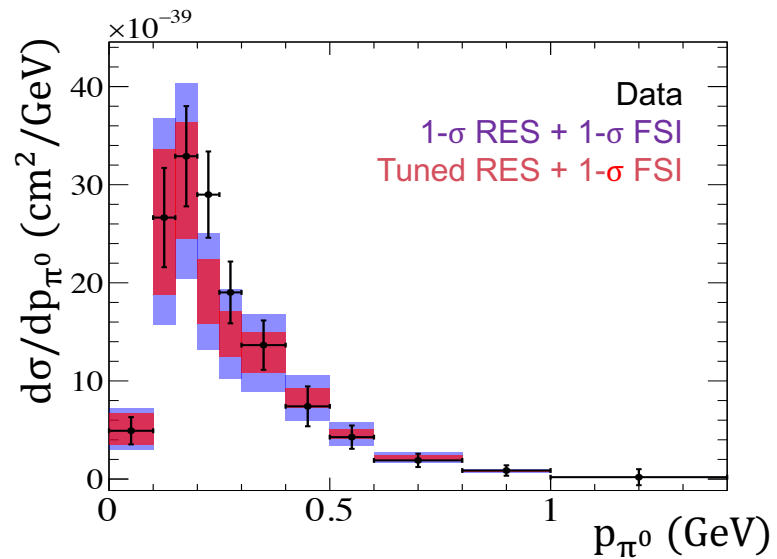
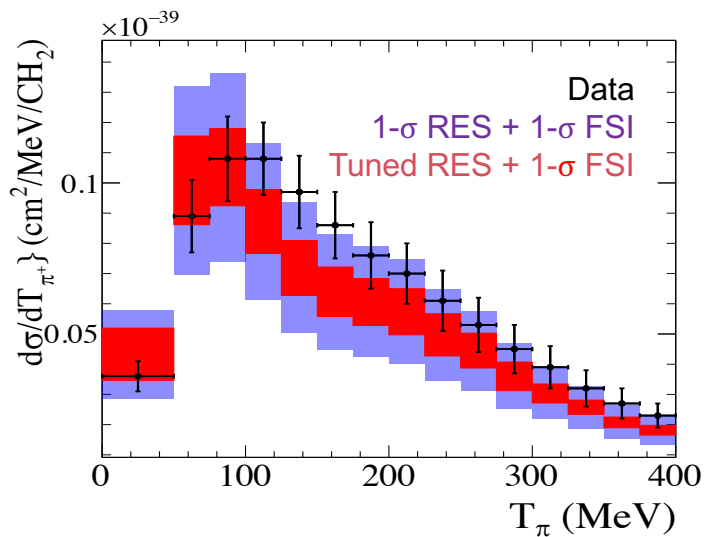
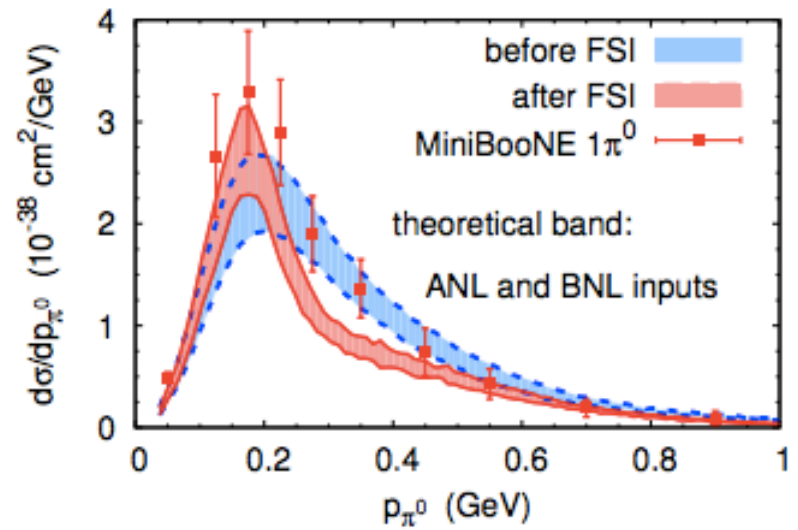
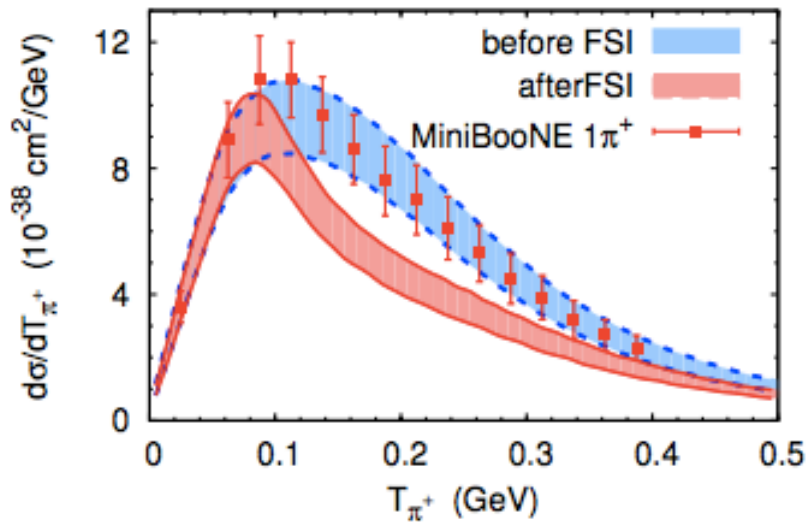
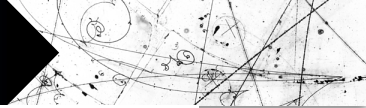


- Comparisons with MINERvA CCN π data has also show that NEUT pion multiplicity is very different to other generators.



- Pion kinematic plots are **filled per pion not per event**, so very sensitive to total pion multiplicity.

NEUT vs GiBUU



GiBUU vs Generators

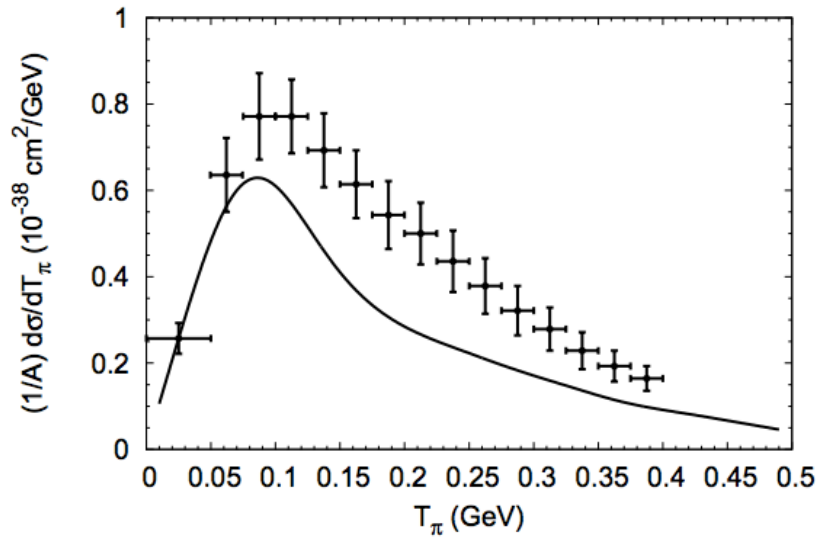
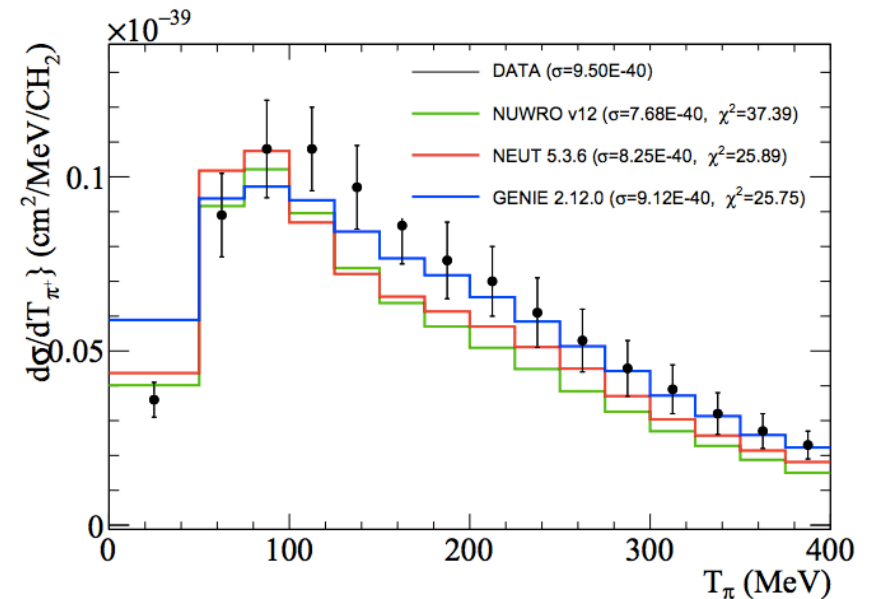


FIG. 1. Kinetic energy spectrum per nucleon of positively charged pions in the MiniBooNE flux for a CH_2 target. Data are from [2].

MiniBooNE CC1pip XSec 1DTpi nu data



GiBUU vs Generators

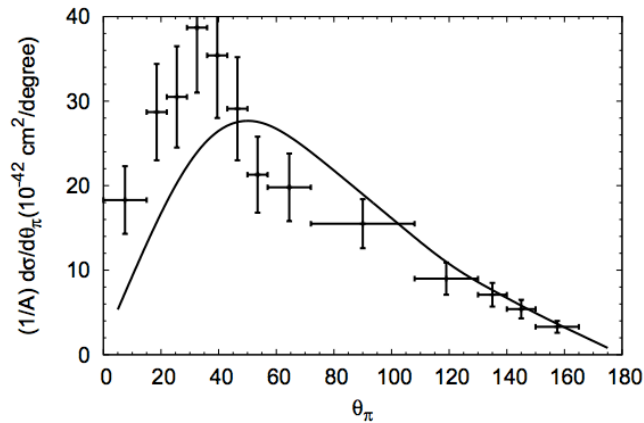
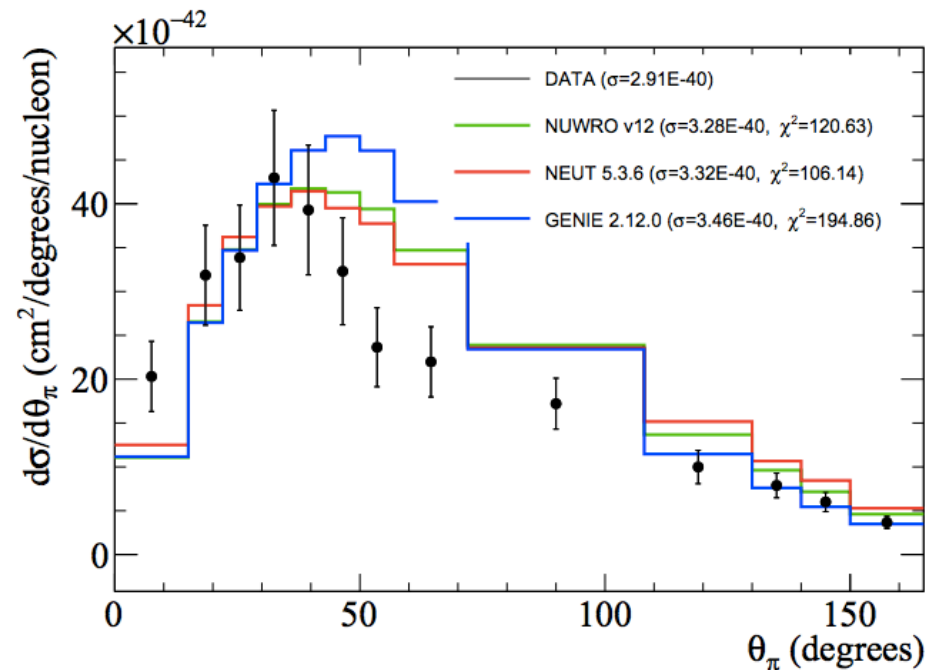


FIG. 7. Angular distribution of single charged pions in the MINERvA flux for a CH target with $W < 1.4$ GeV. Data are from [9].

MINERvA CC1pip XSec 1Dth nu data



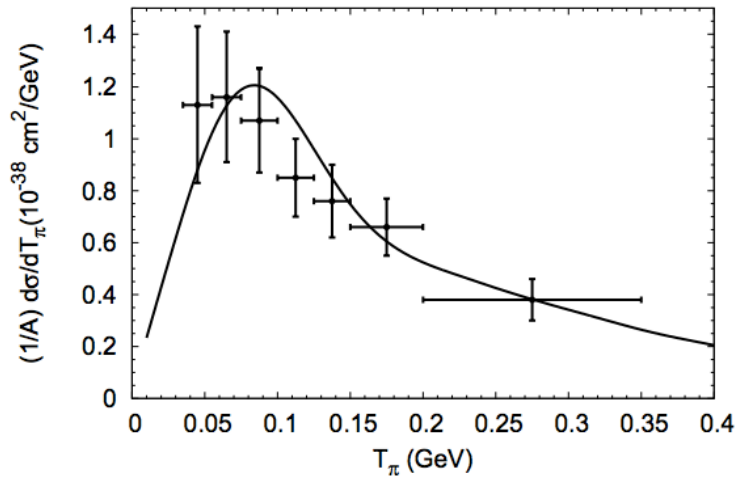
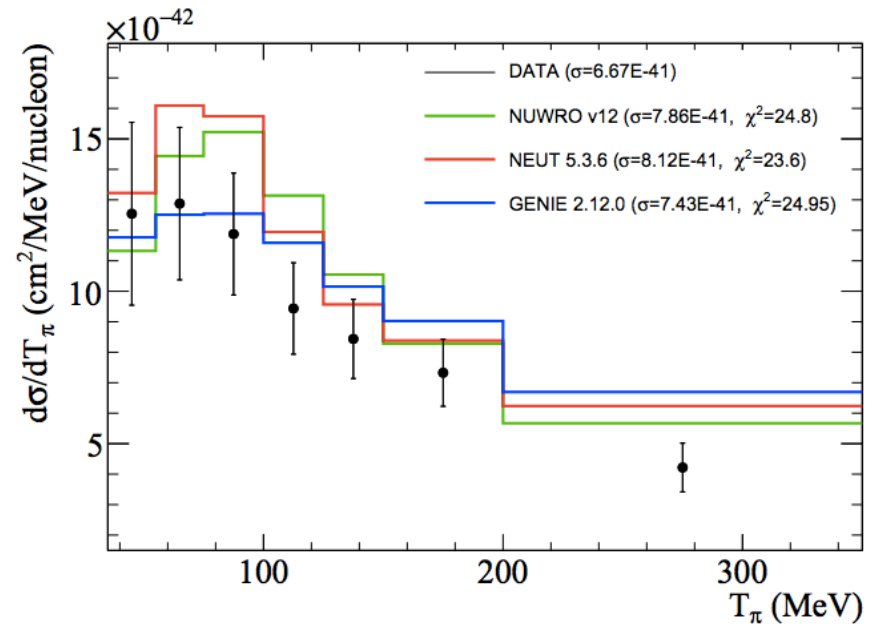


FIG. 6. Kinetic energy spectrum of single charged pions in the MINERvA flux for a CH target with $W < 1.4$ GeV. Data are from [9].

MINERvA CC1pip XSec 1DTpi nu data



GiBUU vs Generators

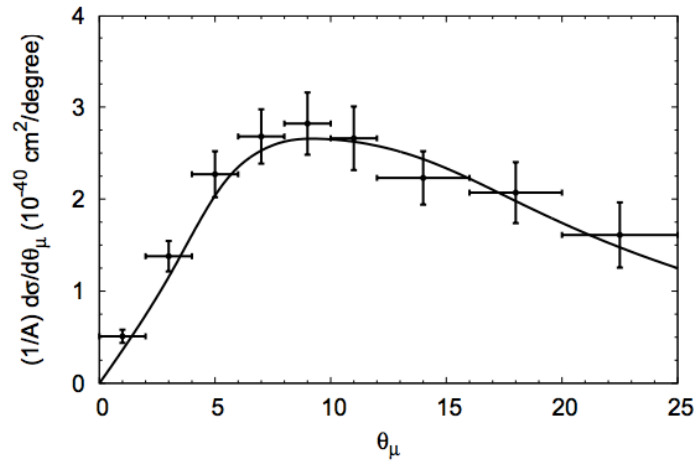
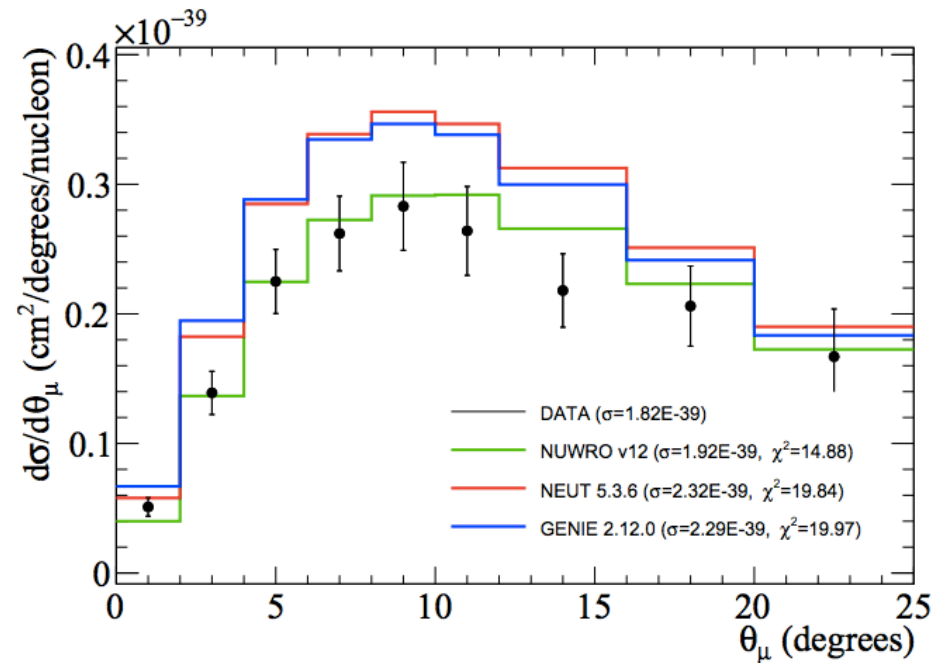


FIG. 11. Angular distribution of outgoing muons for multiple charged pion production in the MINERvA flux for a CH target with $W_{\text{rec}} < 1.8$ GeV. Data are from [10].

MINERvA CCNpip XSec 1Dthmu nu 2016 data



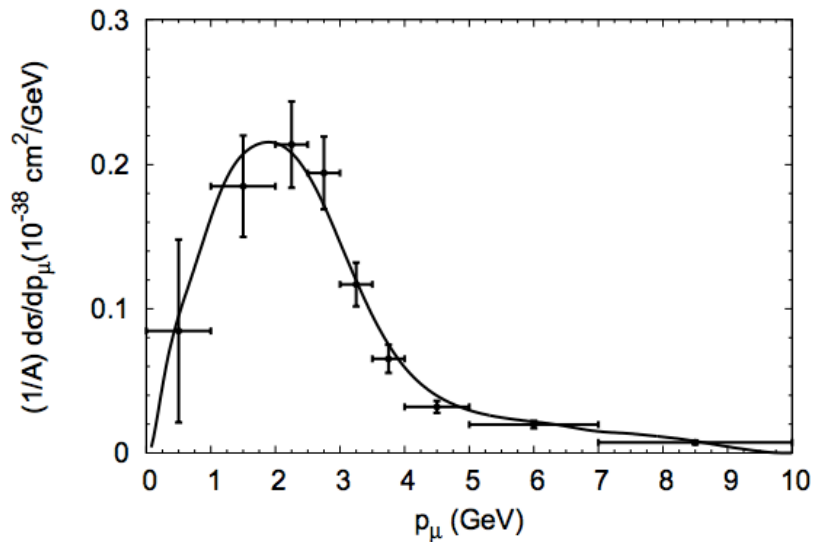
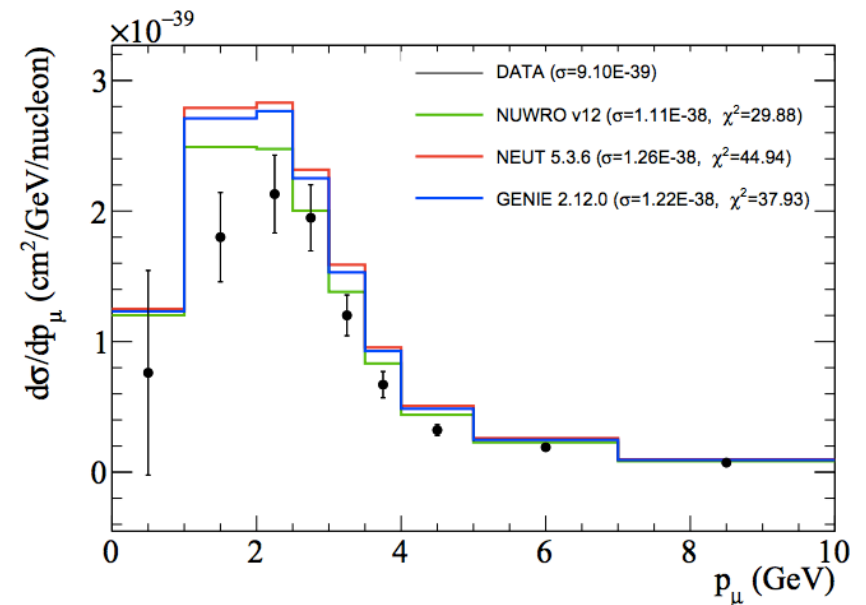


FIG. 10. Momentum distribution of outgoing muons for multiple charged pion production in the MINERvA flux for a CH target with $W_{\text{rec}} < 1.8 \text{ GeV}$. Data are from [10].

MINERvA CCNpip XSec 1Dpμu nu 2016 data



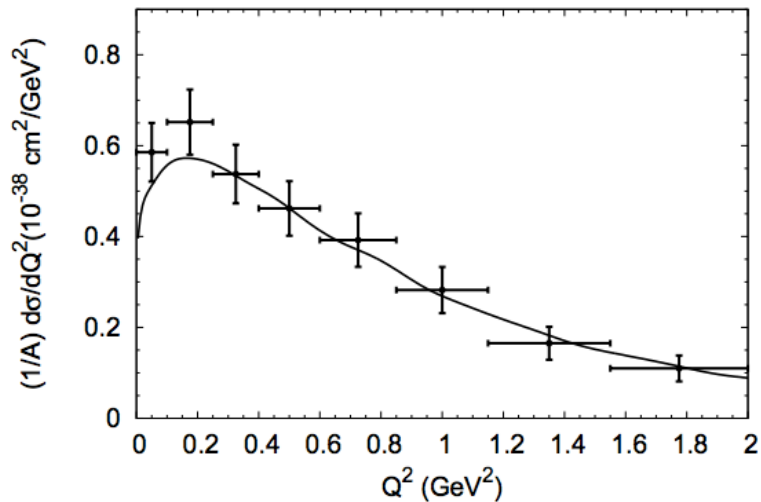


FIG. 12. Q^2 distribution of multiple charged pions in the MINERvA flux for a CH target with $W_{\text{rec}} < 1.8$ GeV. Data are from [10]

MINERvA CCNpip XSec 1DQ2 nu 2016 data

