

# **NOvA central value tuning & uncertainties for the hN FSI model in GENIE 3**

Michael Dolce

New Perspectives — July 21, 2020

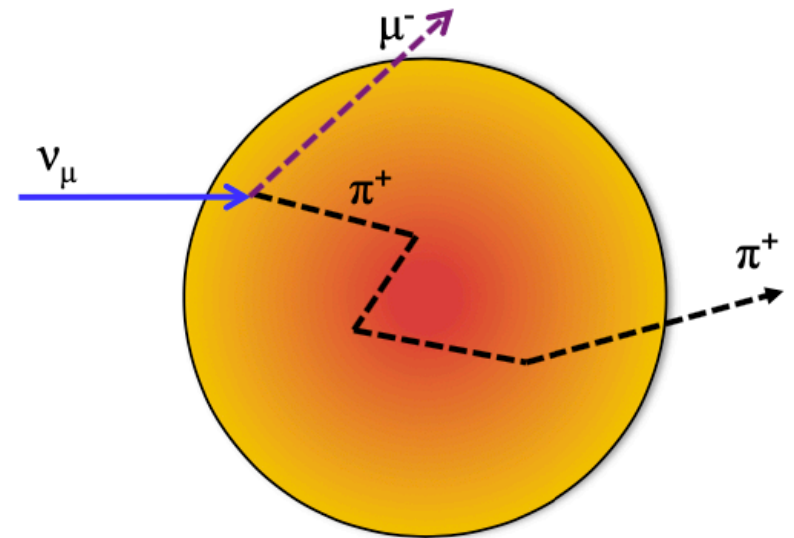


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# Final State Interactions

## What is FSI and why is it important?

- In a neutrino interaction, hadrons are produced inside the nucleus.
- While traversing the nucleus, hadrons can re-interact, known as Final State Interactions (FSI).
- FSI's impact on neutrino scattering is significant:

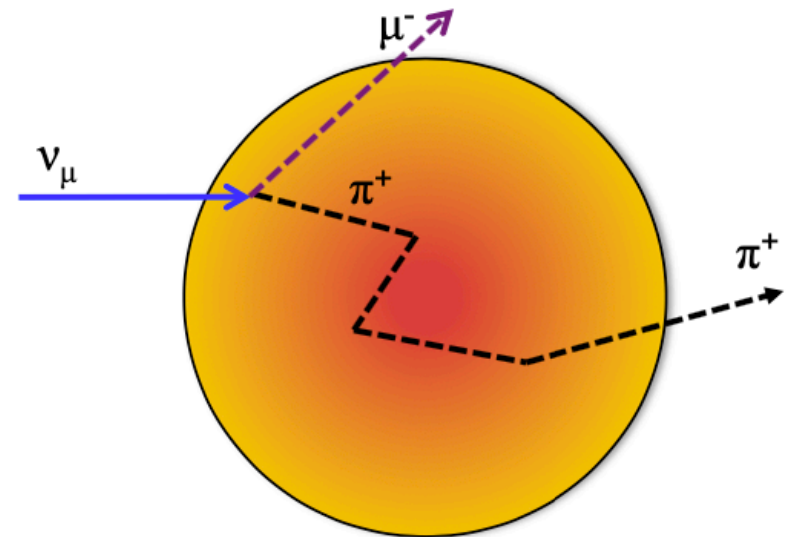


Ref [3]

# Final State Interactions

## What is FSI and why is it important?

- In a neutrino interaction, hadrons are produced inside the nucleus.
- While traversing the nucleus, hadrons can re-interact, known as Final State Interactions (FSI).
- FSI's impact on neutrino scattering is significant:
  - Observed final state products may not have been what was created in the neutrino interaction.
  - For example, a pion produced might have experienced multiple scatters, **where it could gain or lose significant energy**, before it ultimately exists the nucleus.
  - Effects like these can impact your neutrino energy reconstruction!



Ref [3]

# Final State Interactions

## What are the FSI models?

- The NOvA collaboration uses the neutrino generator GENIE [1].
- In the latest GENIE version, 3.0.6, there are two FSI models.

### “Effective” cascade model, hA:

- Predictions are derived directly from hadron scattering data.
  - No attempt is made to differentiate between free hadron scattering and intranuclear interactions.
- This is the historical FSI model in GENIE.

### Semi-classical cascade model, hN:

- Probability of hadronic interaction is calculated in discrete steps through a nuclear density model.
  - An interaction can occur at any of these steps.
- Interactions are predicted from a model [2] that relates pion scattering data to intranuclear amplitudes.

# Final State Interactions

## Understanding the context for our study

- **NOvA selects the hN model** for two reasons:
  1. More theoretically grounded approach.
  2. A level of synergy for the joint NOvA-T2K analysis (T2K uses an analogous hN model).
- hN uses an explicit model [2] to translate an intrauclear pion to an amplitude from pion scattering data.
  - By generating  $\pi^+ - {}^{12}\text{C}$  in GENIE, we can **make comparisons to available data to demonstrate the accuracy of the hN FSI model.**

# Comparing Pion Scattering Simulation & Data

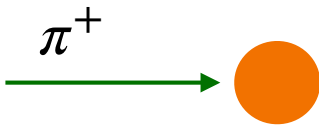
# Pion Scattering Simulation & Data

## Categorizing pion scattering data

- Generally, external pion scattering data is categorized into three topological channels:

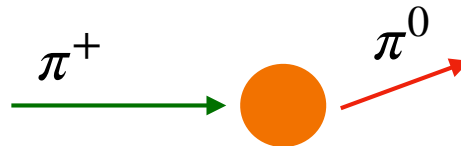
### Absorption (ABS)

No pions are observed in the final state.



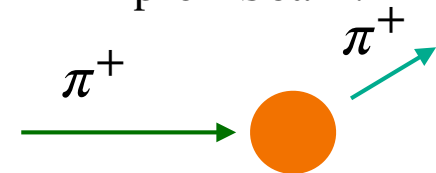
### Charge Exchange (CX)

a single  $\pi^0$  is observed in the final state.



### Quasi-Elastic (QE)

Single pion is observed, with same sign as initial pion beam.



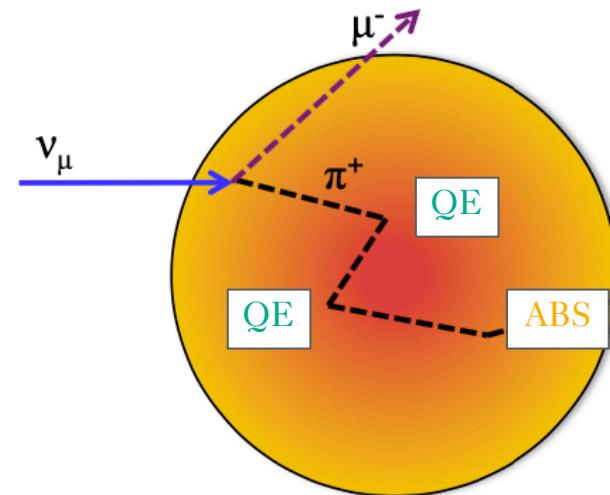
- We can sum these channels together,  $\text{REAC} = \text{ABS} + \text{CX} + \text{QE} + (\text{other processes})$ .
  - This is the total “reactive” cross section.
  - We will utilize **REAC** for our tuning needs too.

# Pion Scattering Simulation & Data

## How to use pion scattering sim. & data for FSI

- In FSI, truth processes can occur at each step of propagation.
- A pion might **QE** scatter first, and then later experience **ABS** (right).
  - In our study, we classify this as “Multiple processes”, (in this case under topological **ABS**).
- The result is truth channels do not correspond “1-1” to the topological processes.

- From GENIE, we include these “Multiple processes” and **categorize all simulation into the data-driven topological channels (ABS, CX, QE)** to evaluate the hN model.

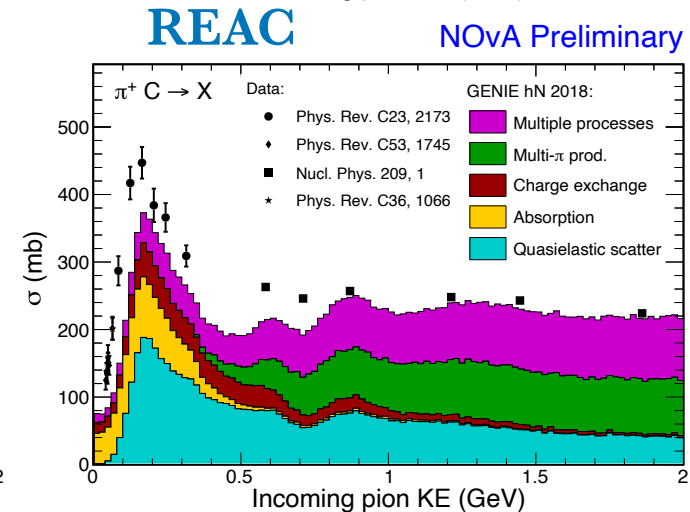
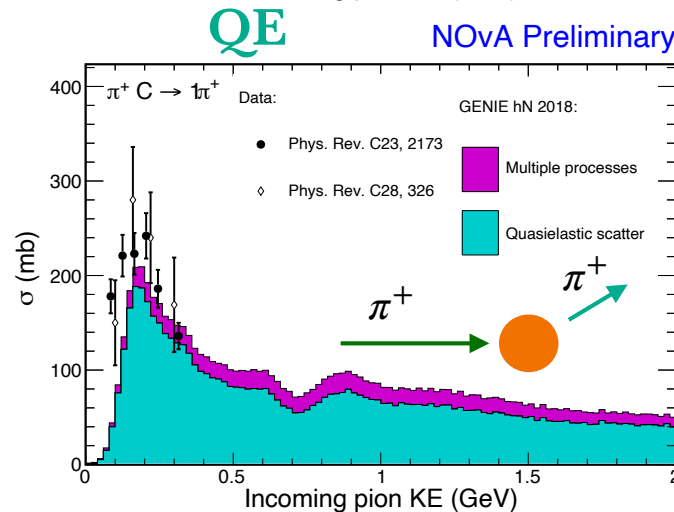
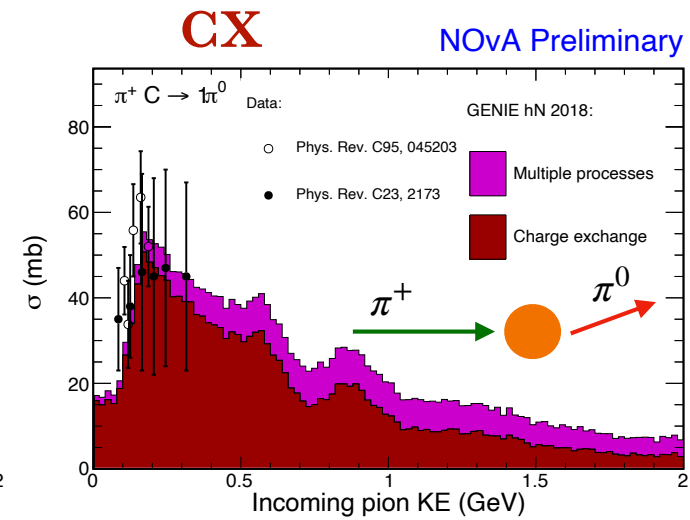
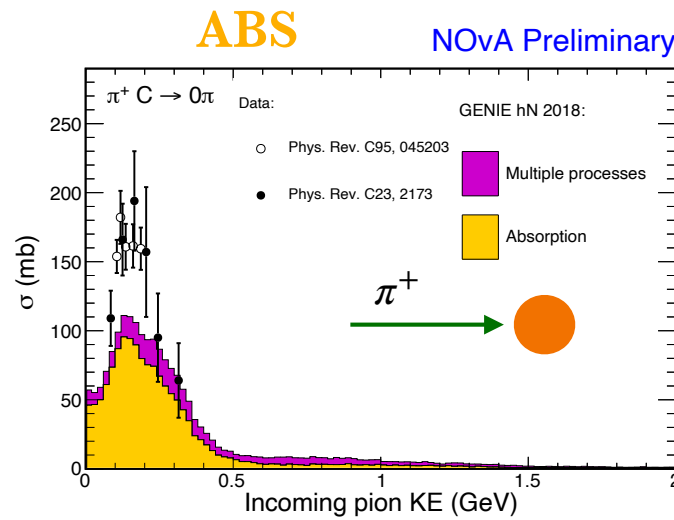


Adapted from [3]



# Pion Scattering Simulation & Data

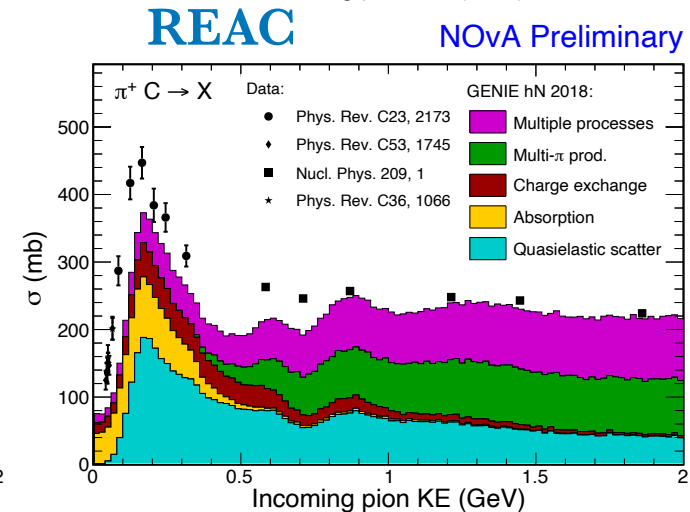
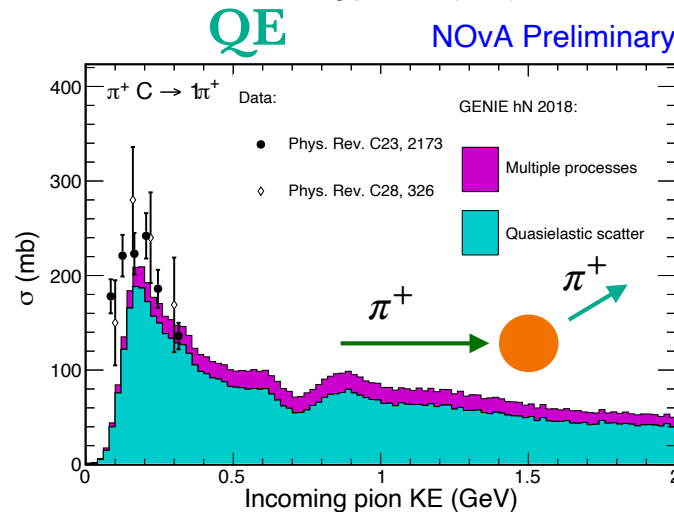
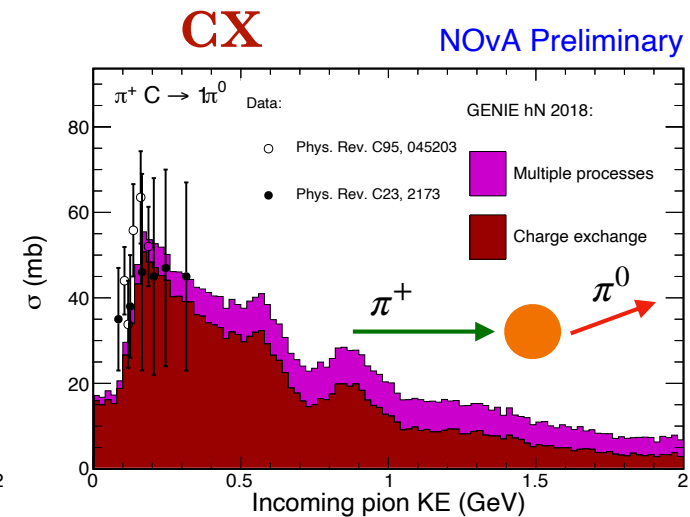
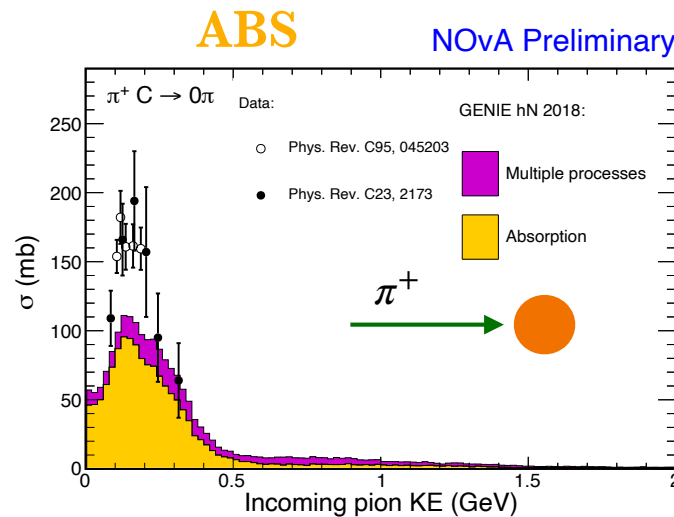
How does nominal hN compare to pion data?



# Pion Scattering Simulation & Data

## How does nominal hN compare to pion data?

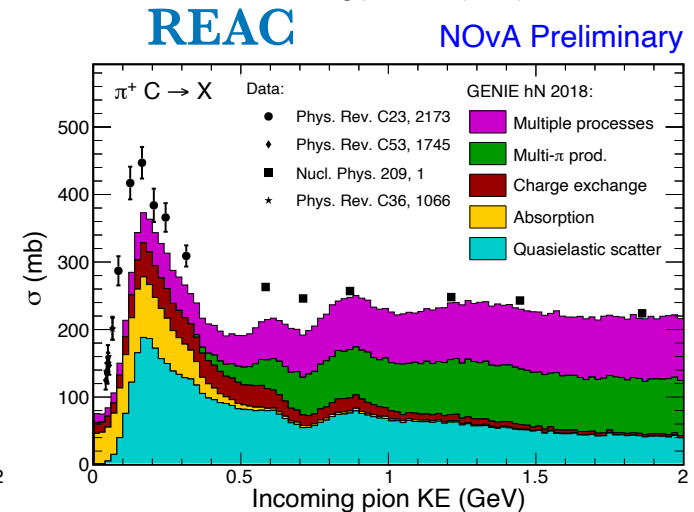
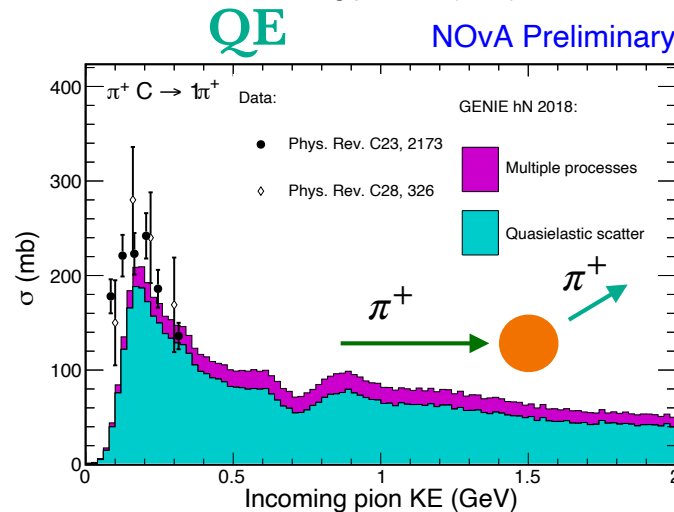
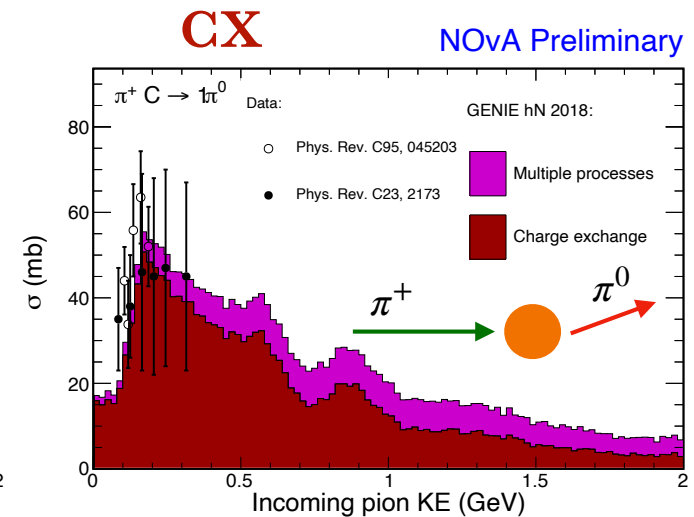
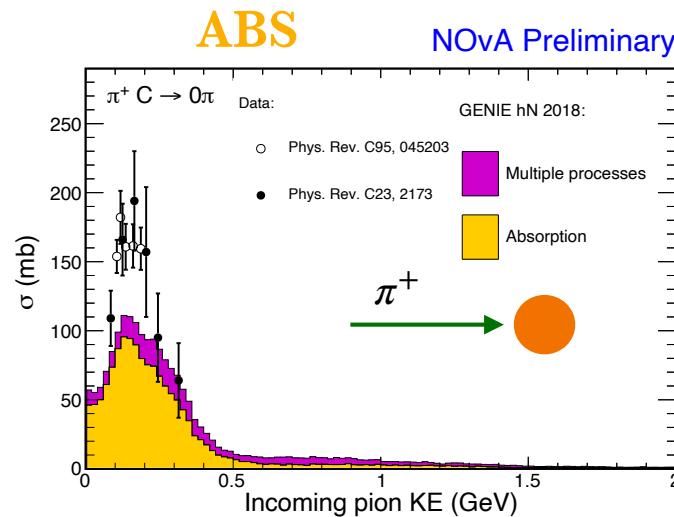
- hN tuning is required — agreement to data is poor in **ABS** and **REAC** channels.



# Pion Scattering Simulation & Data

## How does nominal hN compare to pion data?

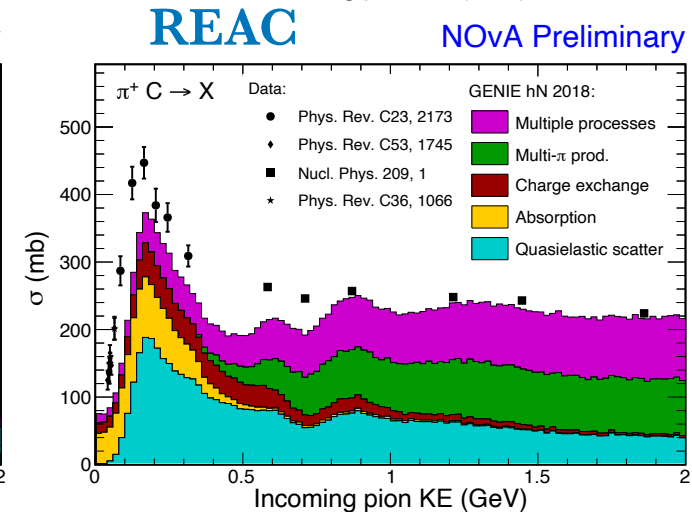
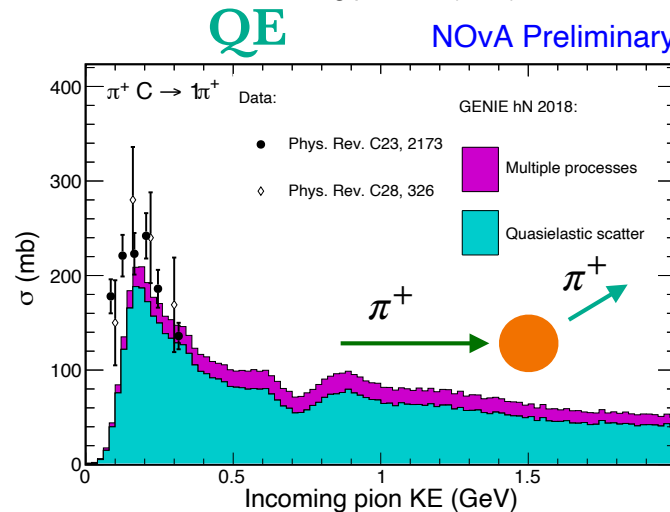
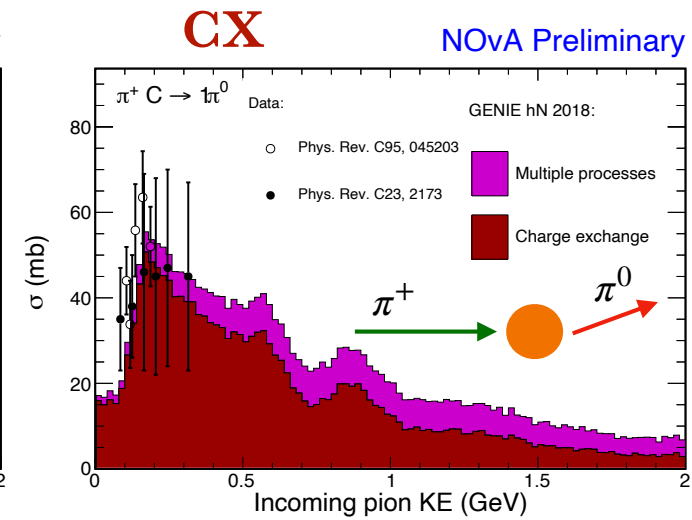
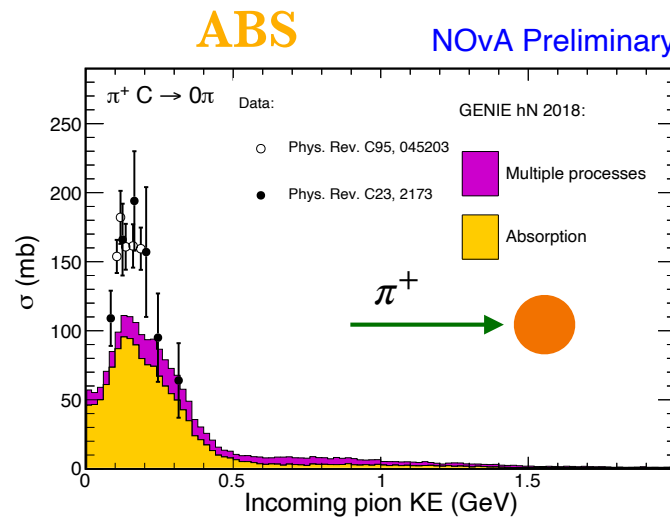
- hN tuning is required — agreement to data is poor in **ABS** and **REAC** channels.
- For **REAC**, tuning of the total reactive cross section is required.



# Pion Scattering Simulation & Data

## How does nominal hN compare to pion data?

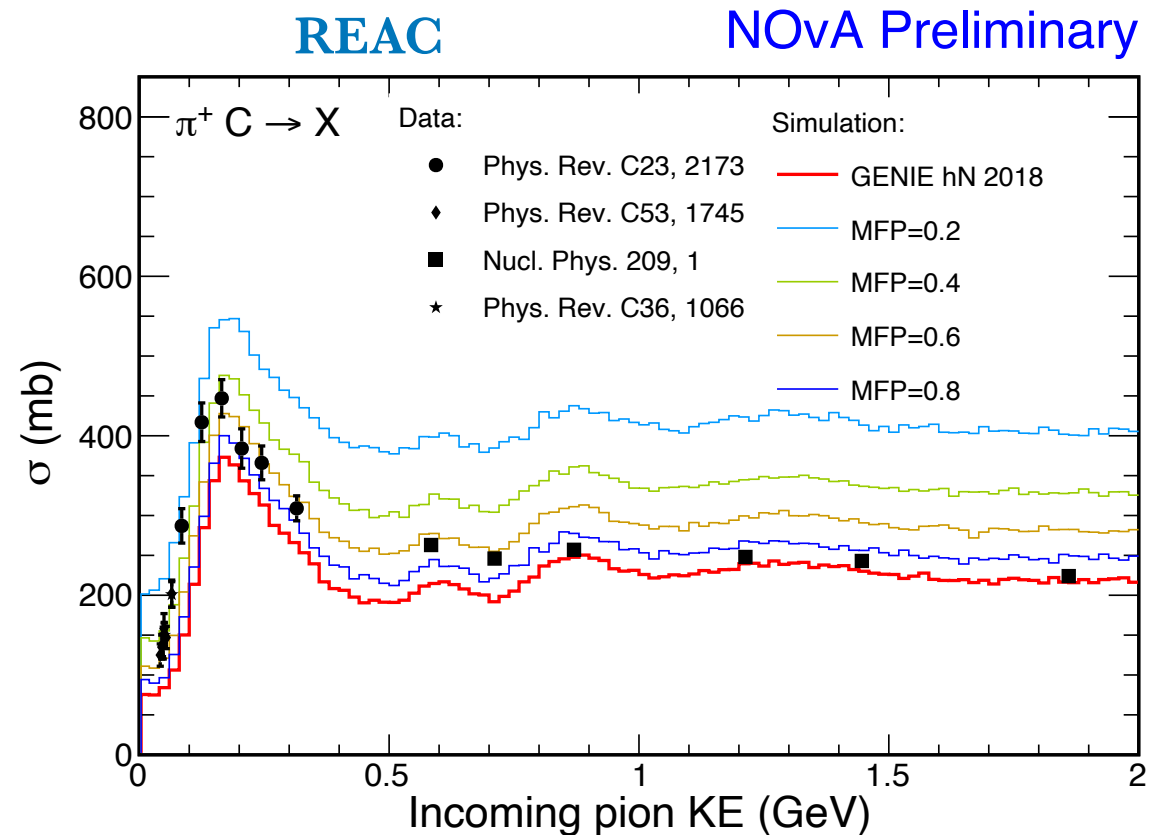
- hN tuning is required — agreement to data is poor in **ABS** and **REAC** channels.
- For **REAC**, tuning of the total reactive cross section is required.
- For the topological channels, we tune the relative probability for each truth process (**fABS**, **fCX**, **fQE**).



# Central Value Tuning

## Tuning the reactive cross section

- We start with **REAC** (i.e., the total “reactive” cross section).
- We reduce the Mean Free Path (**MFP**), which scales inversely with cross section.
- We scan **MFP** values and select 60% the nominal value.
  - This provides the best agreement in the  $KE_{\pi} < 500$  MeV region.
- **Note:** **MFP** reduction will increase the cross section for **ABS**, **CX**, & **QE** as well.

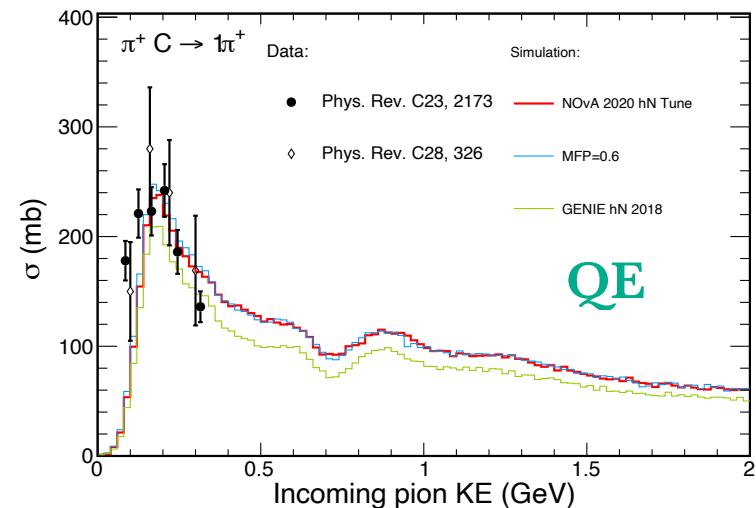
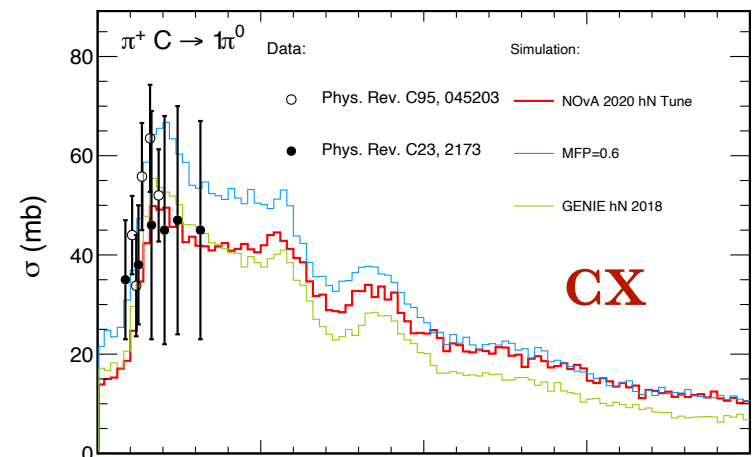
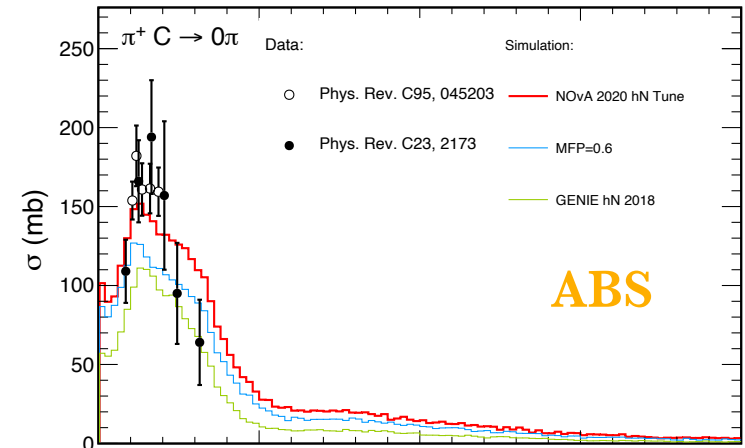


# Central Value Tuning

## Tuning the truth processes

- Next we tune the GENIE truth channels.
- Again, note the increase in cross section for each channel from **MFP** reduction.
- We tune the relative probabilities while conserving the total probability:
  - We increase **fABS** by 40% and reduce **fQE** and **fCX** to maintain total probability.
  - We see improved agreement in **ABS**.
  - The **CX** prediction is reduced.

NOvA Preliminary



# Central Value Tuning

## Our CV

- The following is the result of our tuning procedure:
  - 40% increase in **fABS**.
  - 30% reduction in **fCX**.
  - 10% reduction in **fQE**.
  - 40% reduction in **MFP**.
- This is our Central Value (CV).
- Next, is to build uncertainties...

| Process         | Parameter | Value |
|-----------------|-----------|-------|
| Absorption      | fABS      | 1.4   |
| Charge Exchange | fCX       | 0.7   |
| Quasi-Elastic   | fQE       | 0.9   |
| REAC            | MFP       | 0.6   |

# Constructing Uncertainties

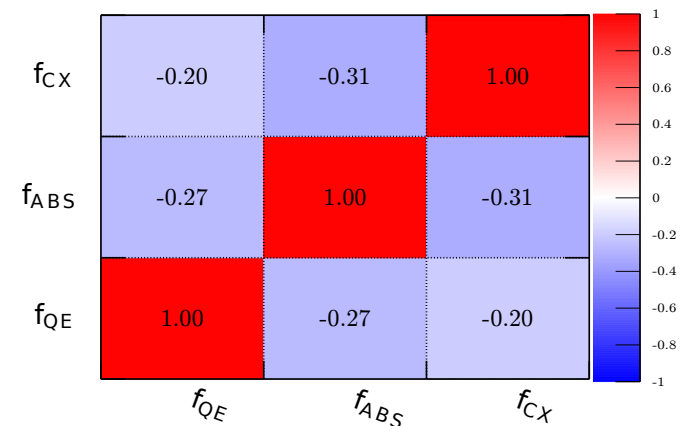


# Constructing Uncertainties

## Creating uncorrelated errors

- We would like to create uncorrelated uncertainties so to treat each one as an independent knob for our oscillation fit.
- T2K has performed a similar study with an analogous hN model.
- As we use similar models, our CV parameters ( $f_{ABS}$ ,  $f_{CX}$ ,  $f_{QE}$ ) are also similar.
  - Allows us to adapt T2K's correlation matrix (right) for our CV parameters.

- We construct a covariance matrix, diagonalize it, and obtain eigenvalues and eigenvectors.
  - Provides three sets of uncorrelated error variations for our three parameters.



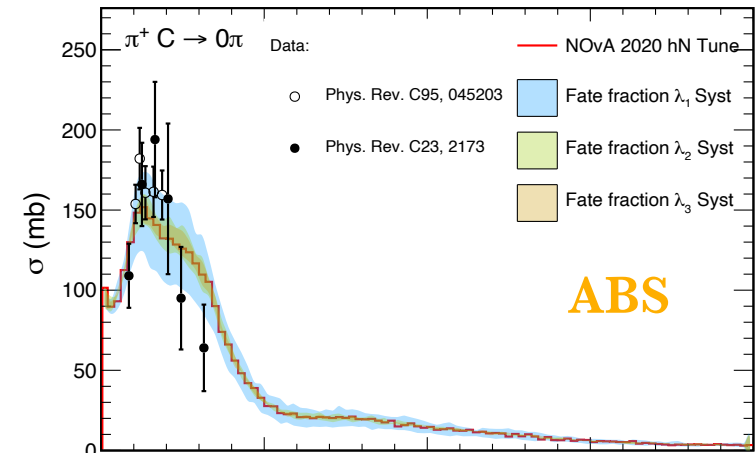
Adapted from [3]

# Constructing Uncertainties

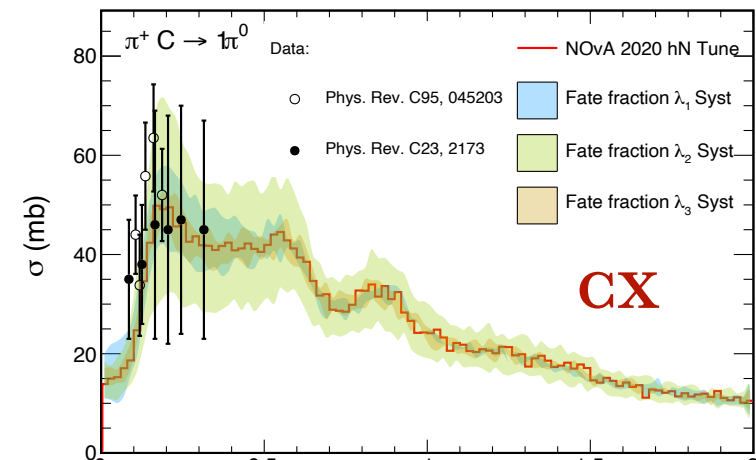
## Error variations for truth processes

- Each colored error band is one set of uncorrelated uncertainties.
- For our neutrino analysis, each colored-band will be treated as an independent knob for our oscillation fit.

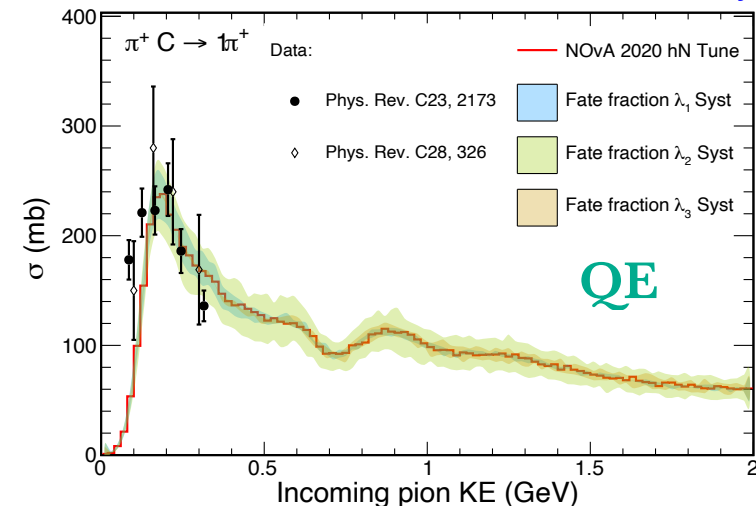
NOvA Preliminary



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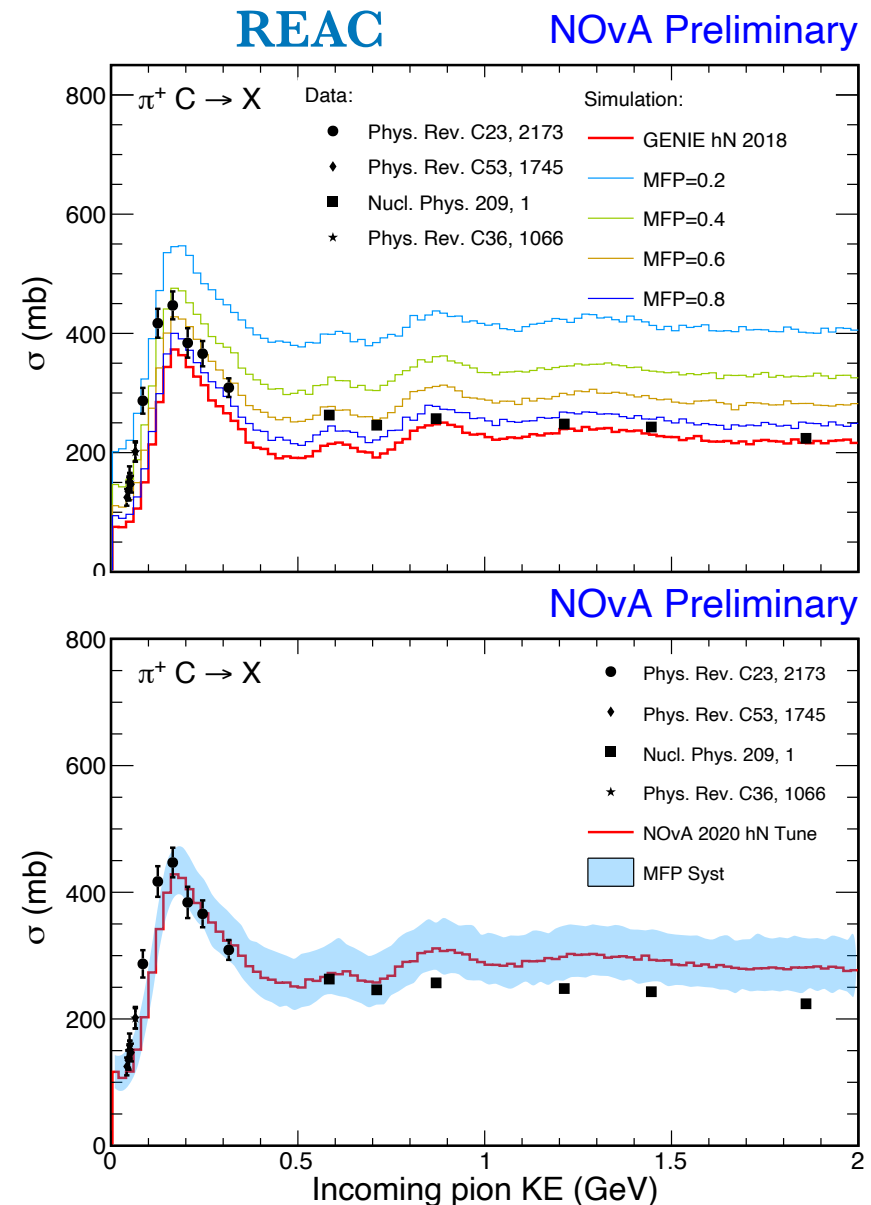
NOvA Preliminary



# Constructing Uncertainties

## Error variation for the MFP

- To select an uncertainty for the **MFP**, we bracket the external data — in particular for the low KE region.
  - Our choice of values for **MFP** is 0.4 and 0.8.
- Note:** We studied the correlations between the **MFP** and **fABS**, **fCX**, **fQE**.
  - Conclude the variations in the **MFP** are **uncorrelated** to the truth channel parameters.

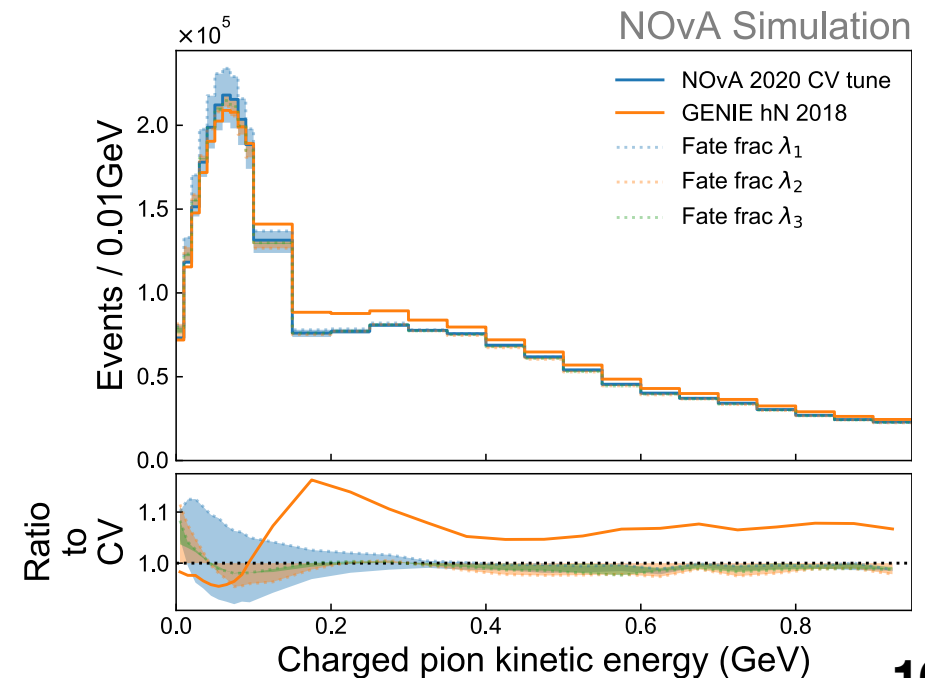
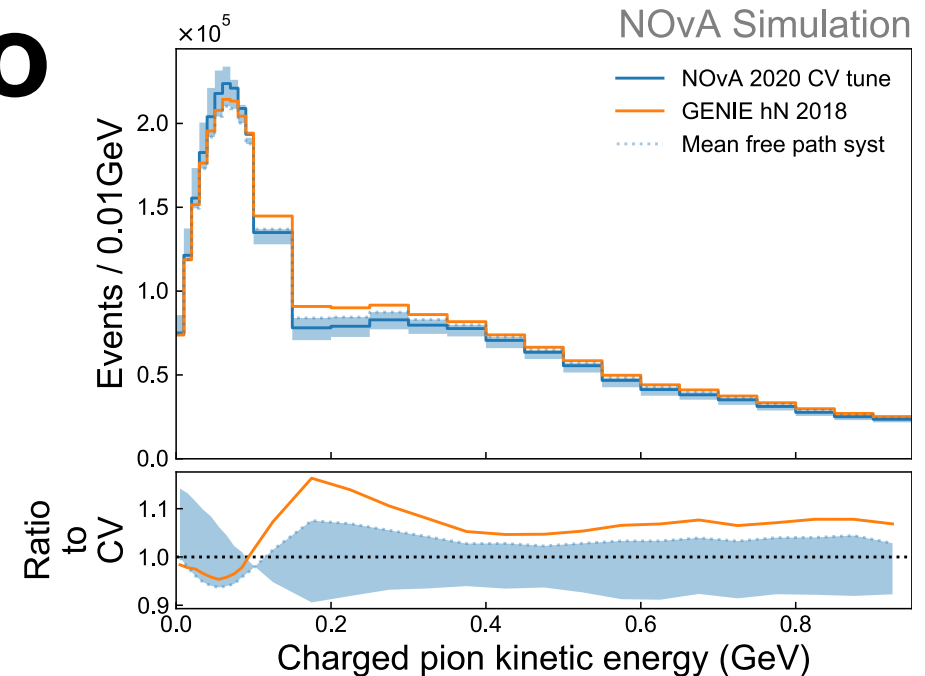


# Impact on Neutrino Predictions

# Impact on Neutrino Predictions

## $\nu_\mu$ CC RES & DIS in NOvA

- Here we show charged pion KE distributions and our uncertainties.
  - Uncertainties indicate a 5-10% variation on pion observables in our simulated neutrino samples.
- The blue error band (bottom) is the largest uncertainty.
  - Band is less than 0.1% uncertainty on NOvA oscillation measurements.



# Summary

## Quick review

1. Examine the hN model against pion scattering data, **tuning the model to agree** with the data.
2. **Construct uncorrelated errors** that can be treated independently, where none existed before.
3. These error variations create a **5-10% uncertainty on pion spectra**, relevant for cross section analyses.

# Thank You

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Department of Energy Office of Science  
Grant DE-SC0019032

# Back up



# References

SLIDES-20-070-LBNF

1. C. Andreopoulos *et al.* *Nucl. Instrum. Meth.* A614: 87 (2010).
2. L. L. Salcedo *et al.* *Nucl. Phys.* A484: 557 (1988).
3. E.S. Pinzon Guerra *et al.* *Phys Rev.* D99: 052007 (2019).
4. A. Rogozhnikov. *J. Phys. Conf. Ser.* 762: 012036 (2016).

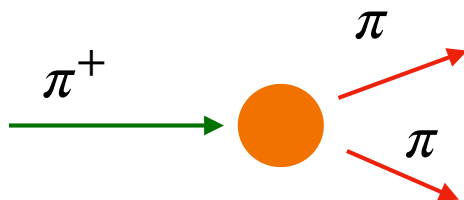
# Pion Scattering Simulation & Data

## Additional topological processes

- In addition to **ABS**, **CX**, & **QE**, there are two additional topological categories:

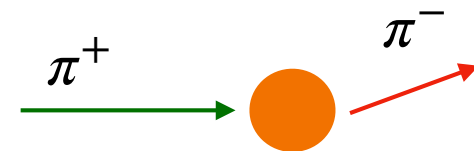
### Hadron Production (HP)

At least two pions are observed in the final state.



### Double Charge Exchange (DCX)

A single  $\pi^-$  is observed in the final state.



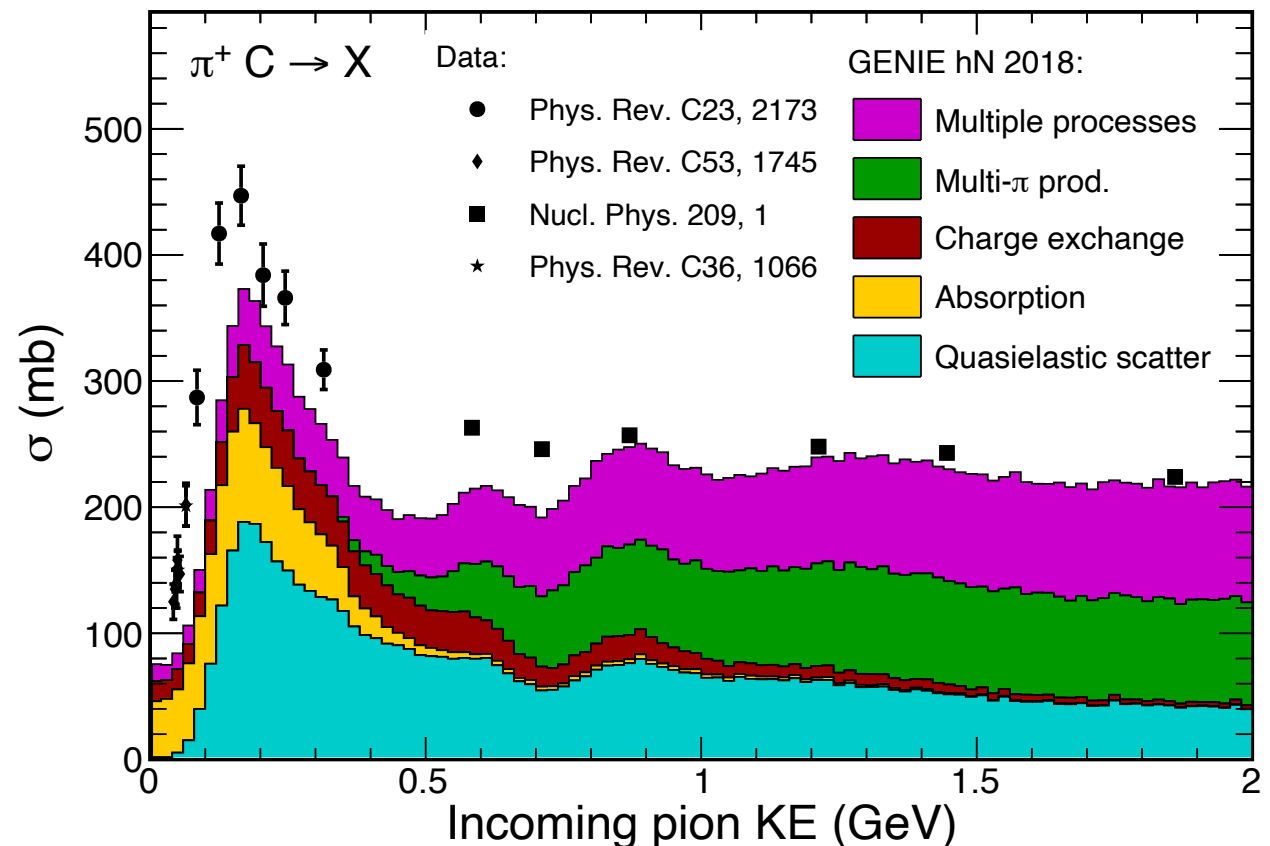
- These are not dominant processes and also occur at  $\text{KE}_\pi > 500 \text{ MeV/c}$ , which is an unlikely kinematic region for FSI in NOvA.

# Pion Scattering Simulation & Data

## Additional topological processes

NOvA Preliminary

- **HP** and **DCX** are not dominant processes.
- They also occur at  $KE_{\pi} > 500$  MeV, which is an unlikely kinematic region for FSI in NOvA.



# Complete List of CV and Uncertainties

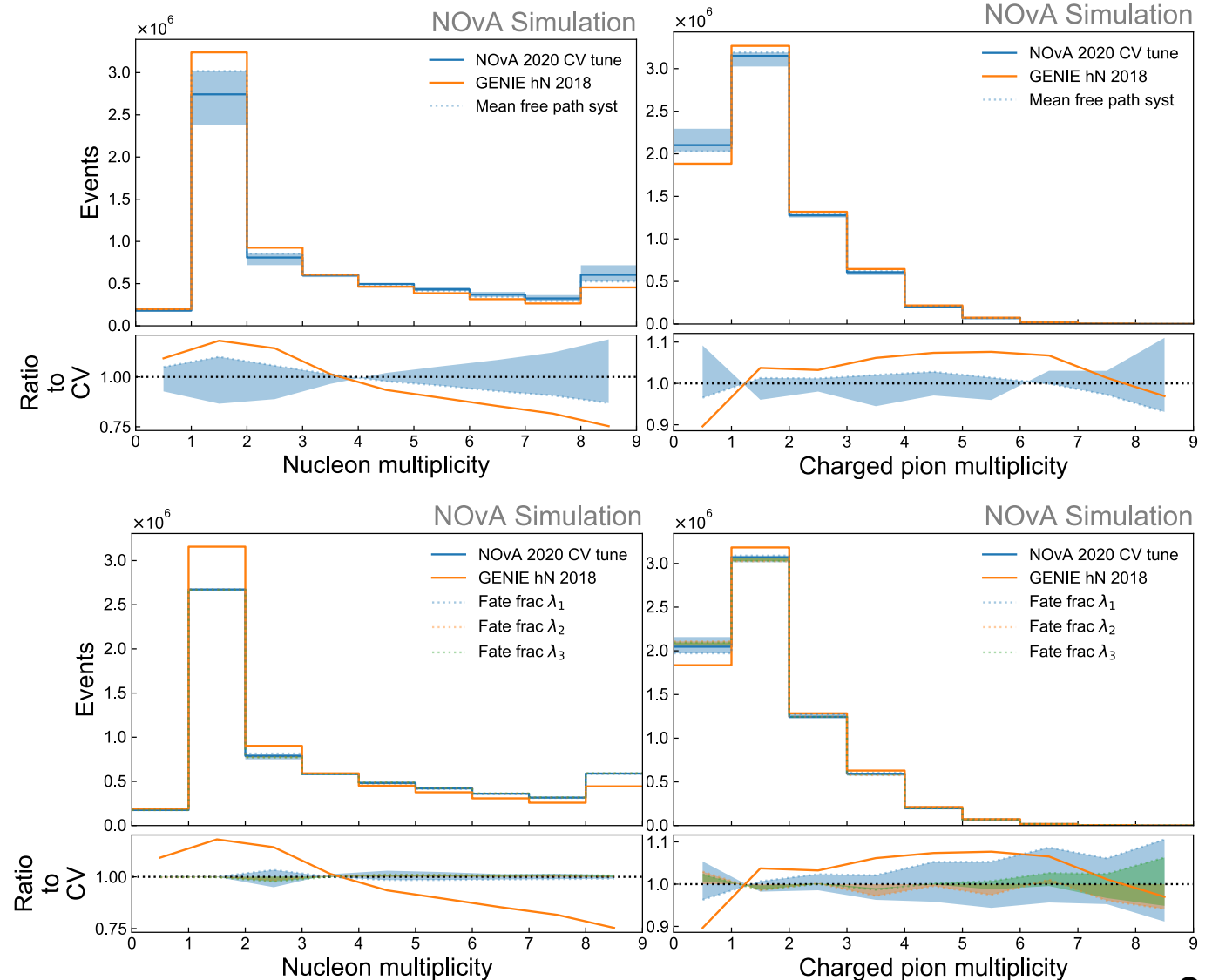
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| Quasi-Elastic   | fQE       | 0.9   |
| REAC            | MFP       | 0.6   |

| Knob | Shift ( $1\sigma$ ) | fMFP | fABS | fCX | fQE |
|------|---------------------|------|------|-----|-----|
| # 1  | plus                | 0.6  | 0.9  | 0.8 | 1.0 |
|      | minus               | 0.6  | 1.8  | 0.6 | 0.8 |
| # 2  | plus                | 0.6  | 1.4  | 0.9 | 0.7 |
|      | minus               | 0.6  | 1.4  | 0.5 | 1.2 |
| # 3  | plus                | 0.6  | 1.3  | 0.5 | 0.8 |
|      | minus               | 0.6  | 1.4  | 0.8 | 1.0 |
| MFP  | plus                | 0.4  | 1.4  | 0.7 | 0.9 |
|      | minus               | 0.8  | 1.4  | 0.7 | 0.9 |

# Impact on Neutrino Predictions

## $\nu_\mu$ CC RES & DIS in NOvA

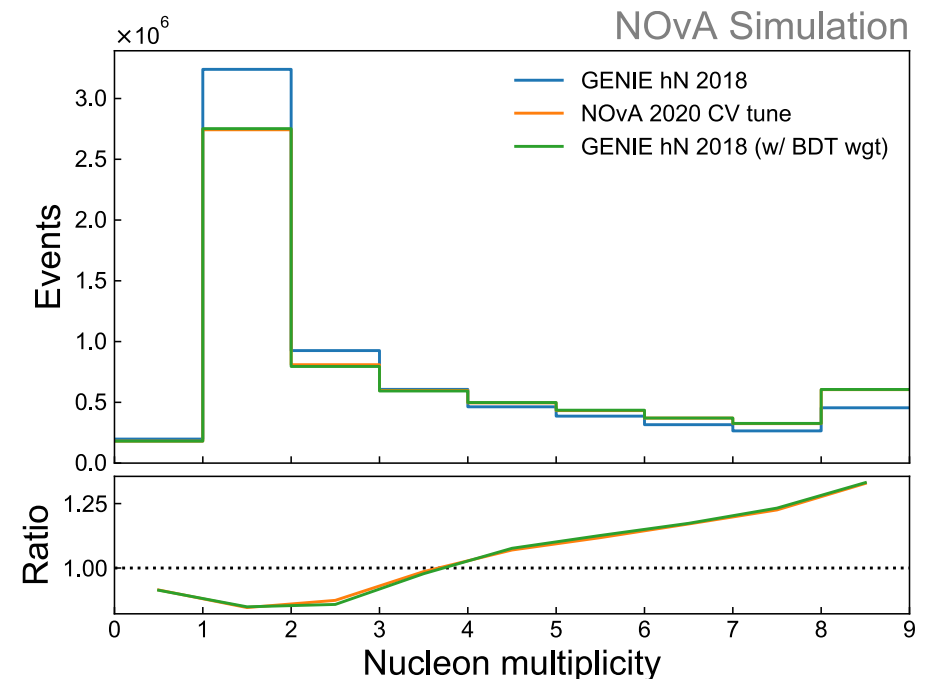
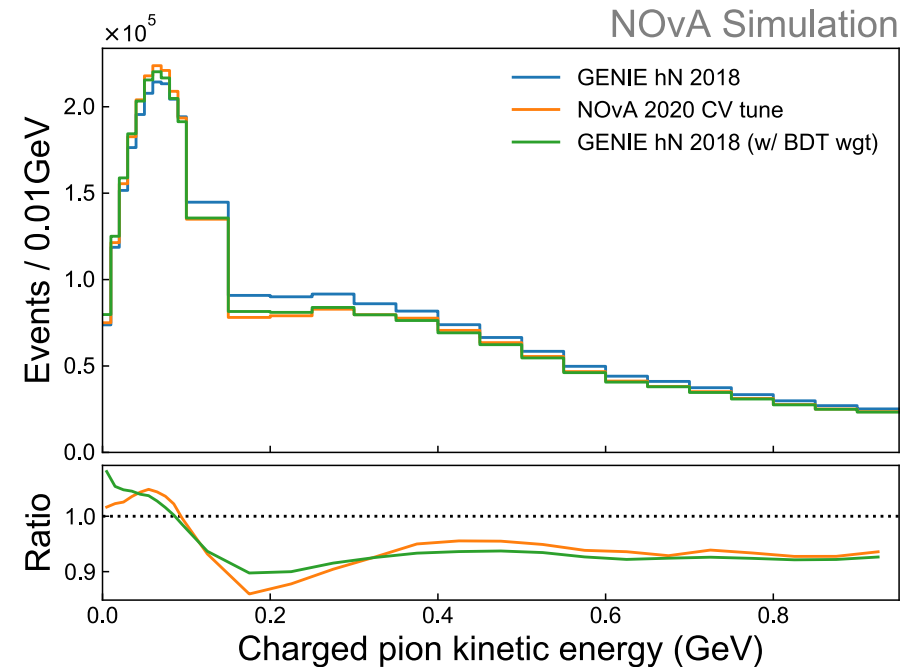
- Additional plots of our generated neutrino sample.
- Plotted with our uncorrelated error bands are multiplicities of:
  - nucleons.
  - charged pions.



# Boosted Decision Trees

## How can we reweight simulation that's already made?

- Our nominal 2020 simulation has already been produced.
- Our solution is to utilize Boost Decision Trees (BDT) to **reweight our existing simulation**, with nominal hN, to our hN CV-tuned values [4].
- We can see the **nominal production reweighted by the BDT in green** are well replicated to our **CV tune in orange**.



# Boosted Decision Trees

## Closure test for our BDT

- Additionally, we want to ensure we do not reweight other, non-FSI useful truth variables.
- We show the  $Q^2$  distribution demonstrating our BDT **only reweights the variables we desire.**

