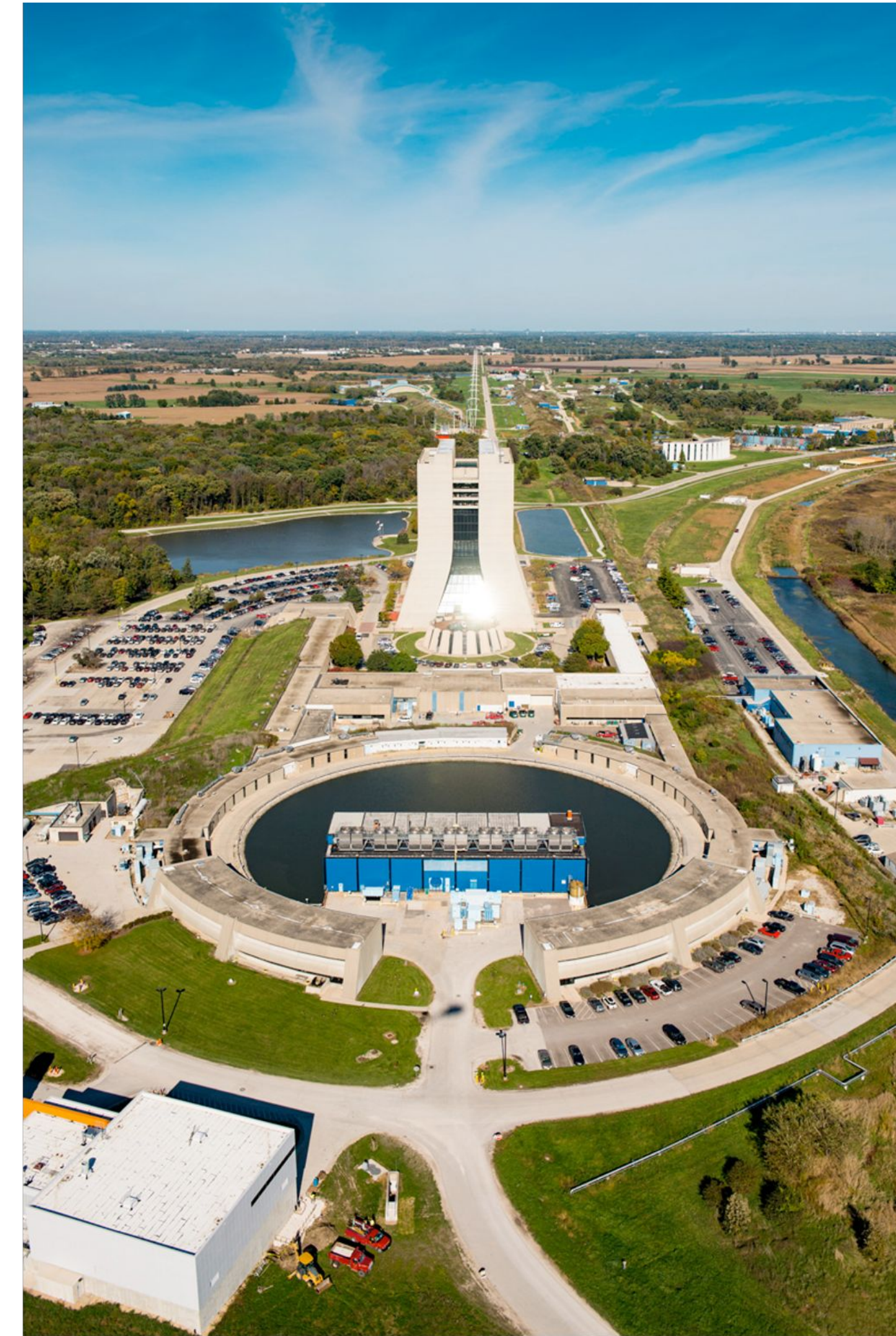
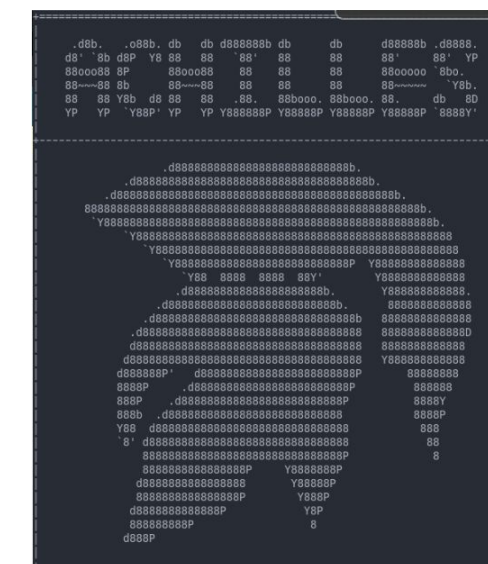
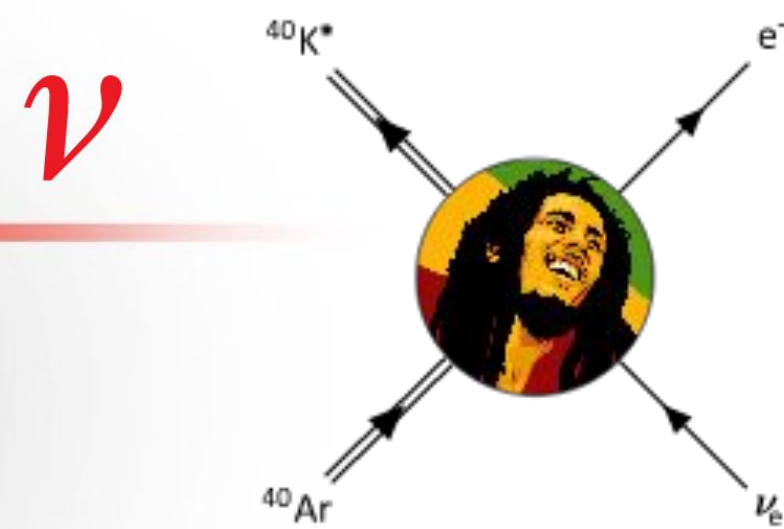
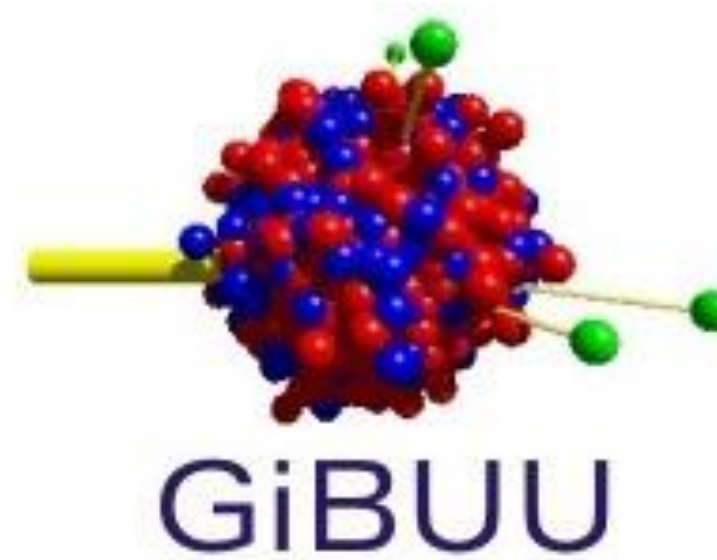
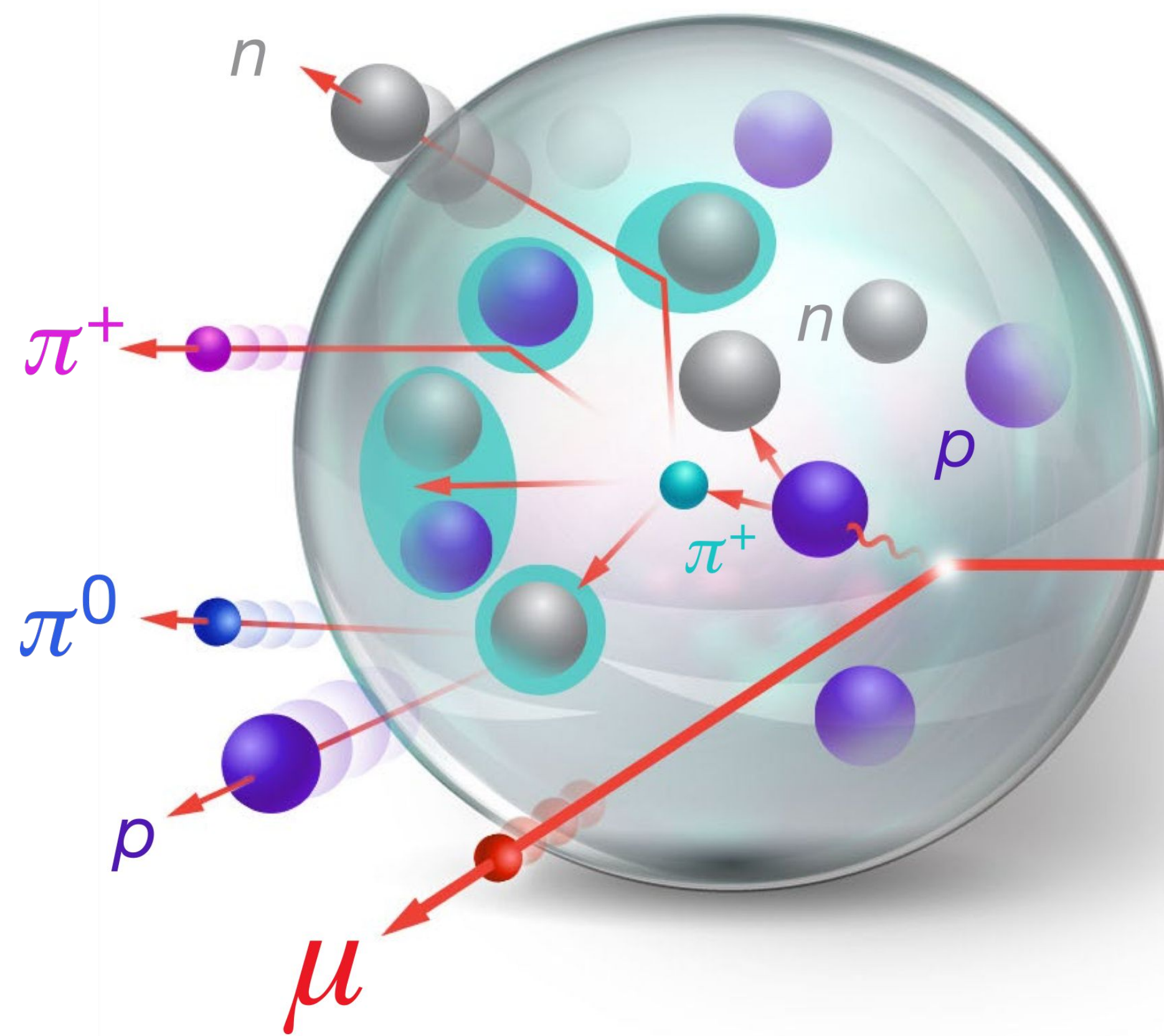


# Introduction to neutrino event generators



Steven Gardiner ([gardiner@fnal.gov](mailto:gardiner@fnal.gov))

Event Generators Group Leader, Fermilab Physics Simulation Department

NuSTEC School & Workshop, São Paulo, 12 April 2024

# Who am I?

- Associate Scientist @ Fermilab
- Liquid argon experiments (MicroBooNE, SBND)
  - Focus on neutrino interaction physics
- Event generator development
  - Author for GENIE and MARLEY
- PhD in 2018, University of California, Davis
  - MARLEY + ANNIE Phase-I analysis
- **Falo português**
  - I'm delighted to be back in Brazil, you have the best beaches!

Praia de Cumbuco, CE, 2008

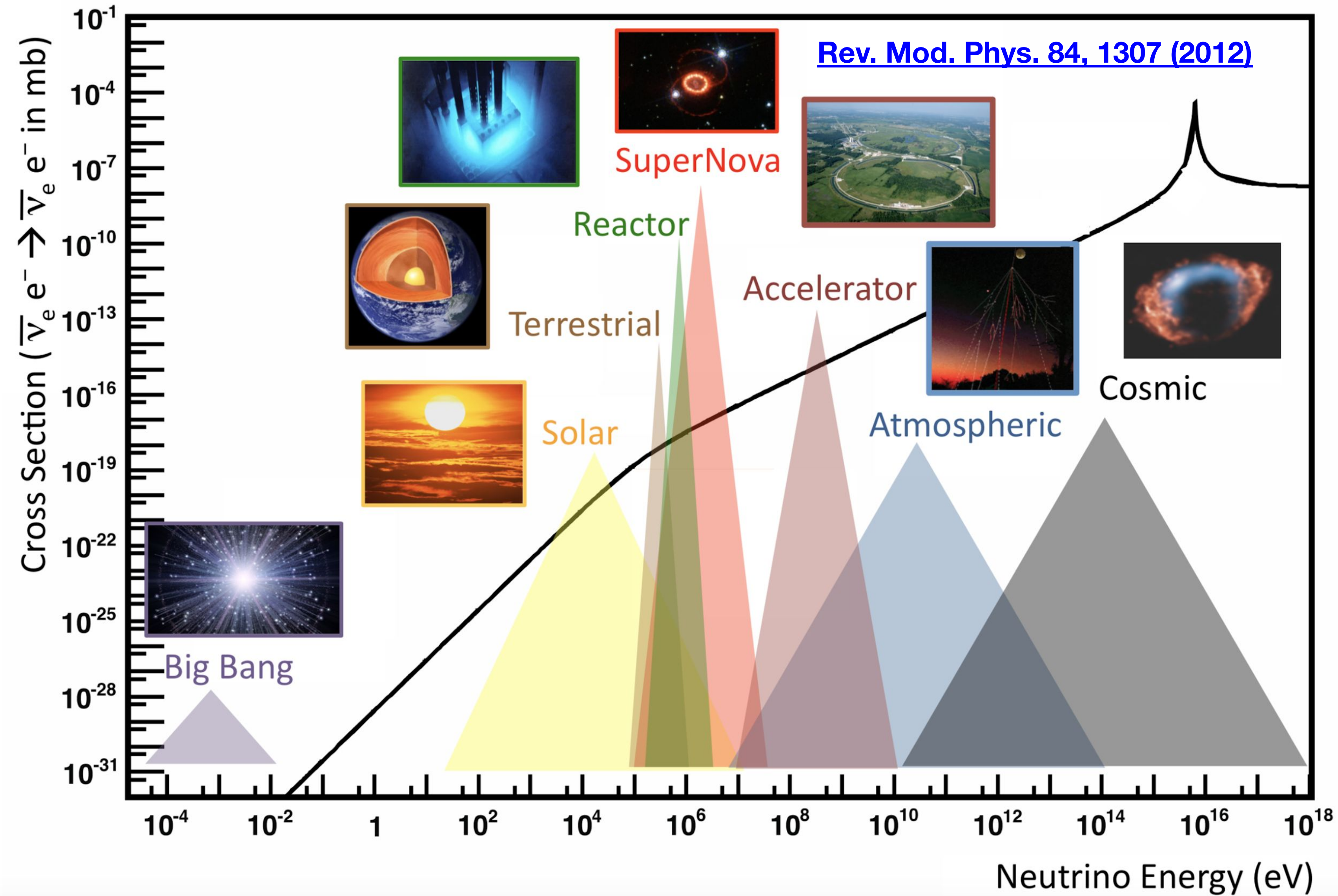


Praia de Ipanema, RJ, 2024





# Neutrino physics across energy scales

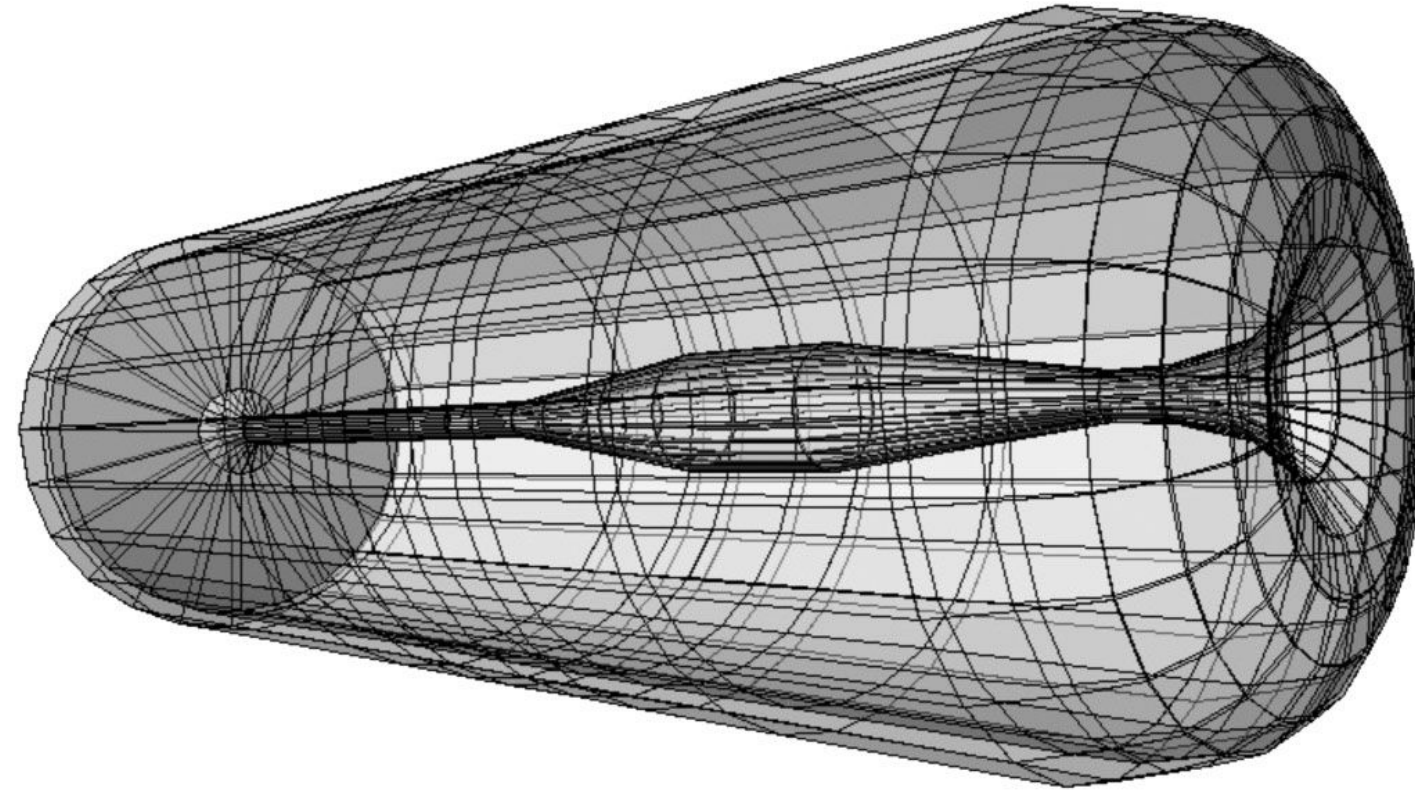


- Many orders of magnitude in energy!
- **Most of NuInt** looks at  $\sim 100$  MeV to  $\sim 10$  GeV region
- I'll **also talk a tiny bit** about  $\sim 1$  MeV to  $\sim 10$  MeV
- Enable new discoveries by better understanding neutrino interactions

# **Part I: Role of event generators for neutrino experiments**

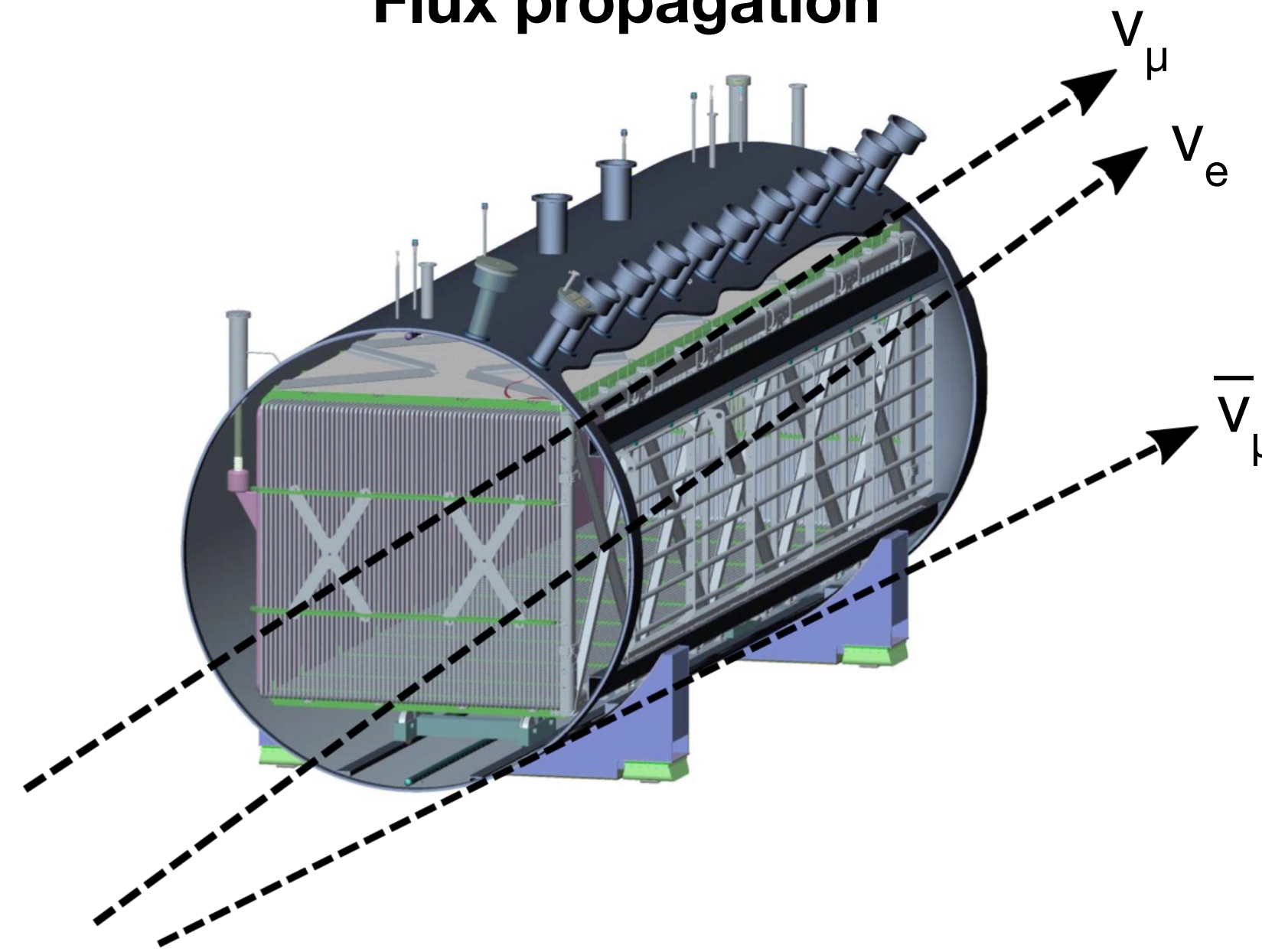
# Neutrino experiments require comprehensive simulations

Beam production

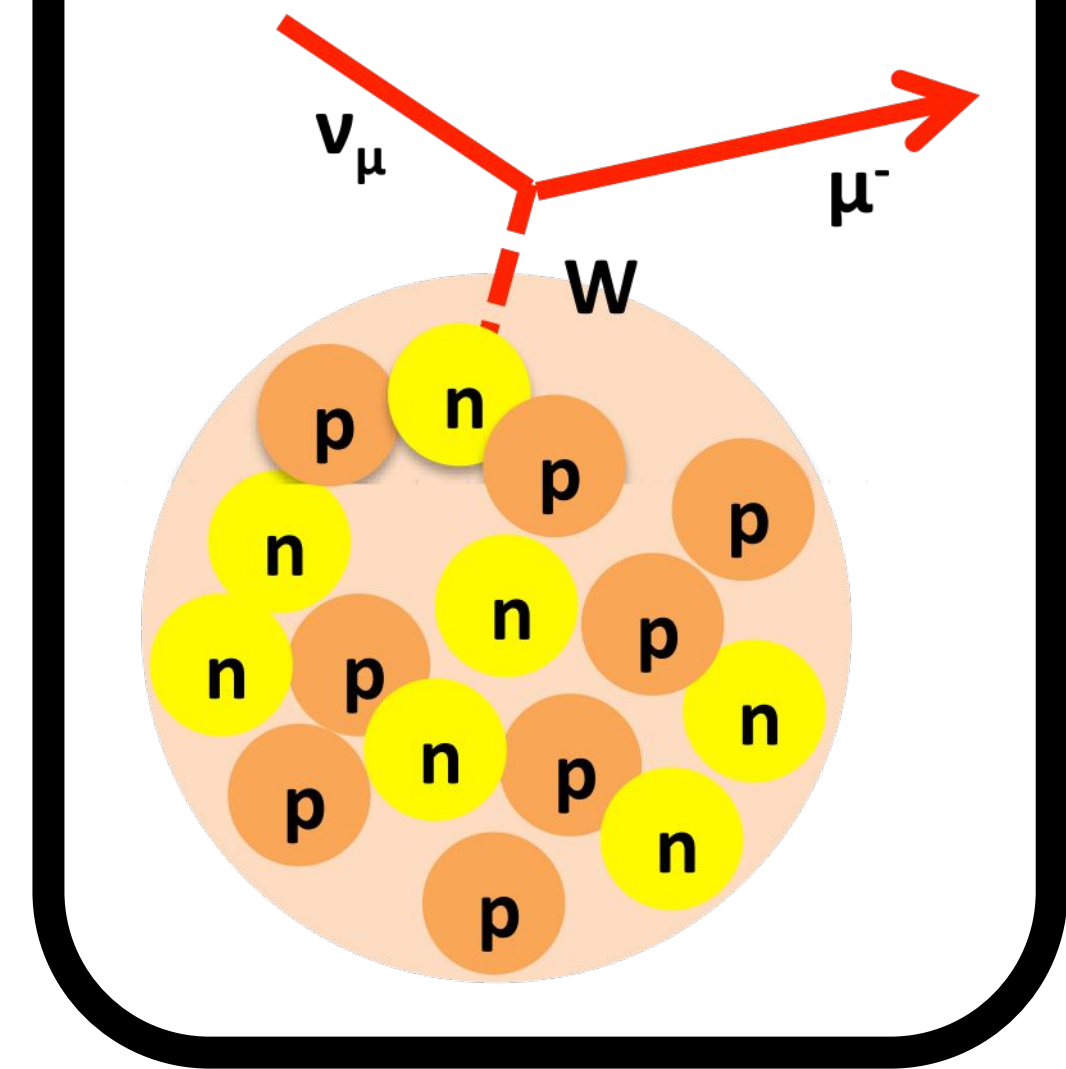


BNB horn geometry from [Phys. Rev. D 79, 072002 \(2009\)](#)

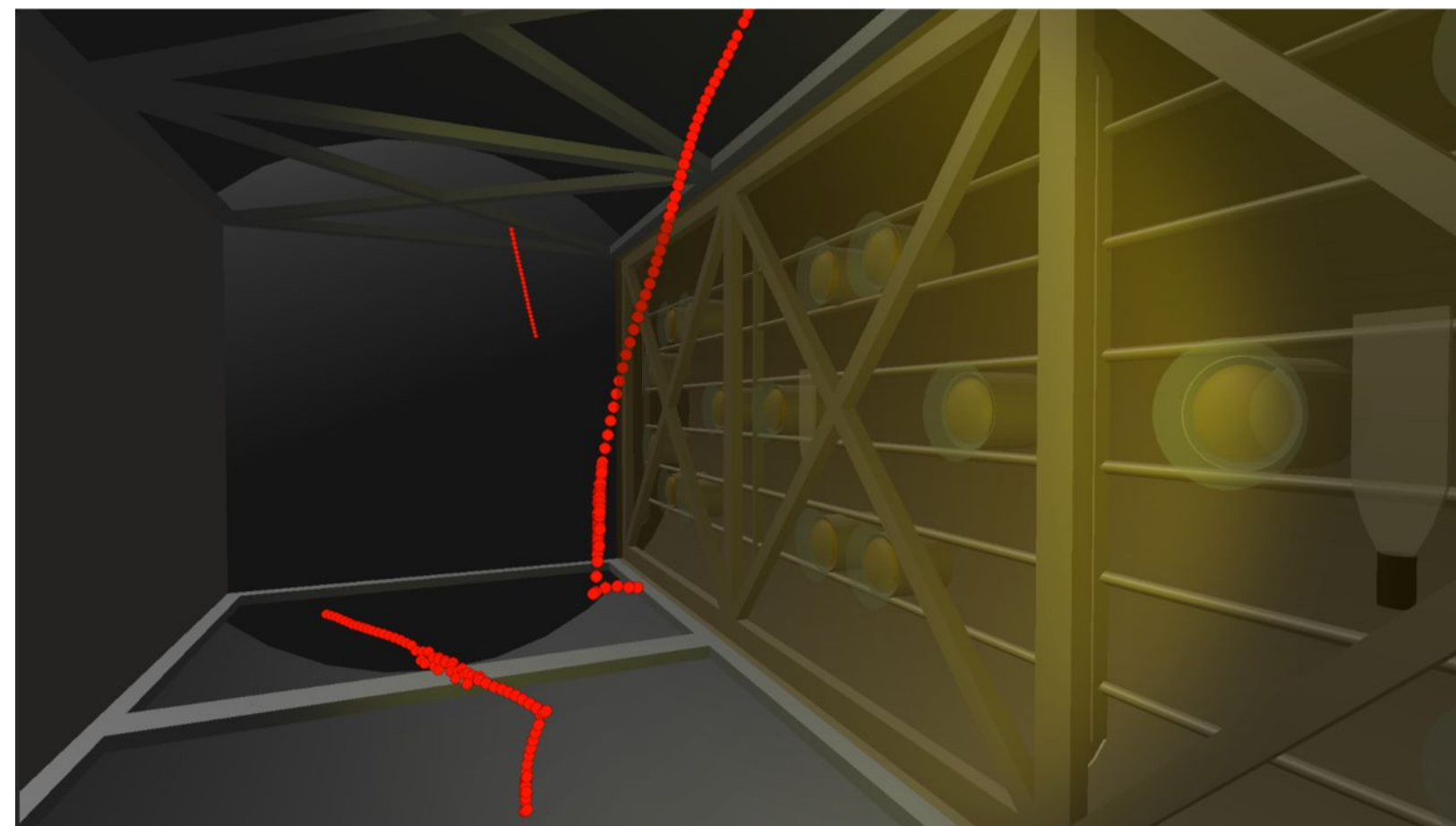
Flux propagation



Neutrino interactions

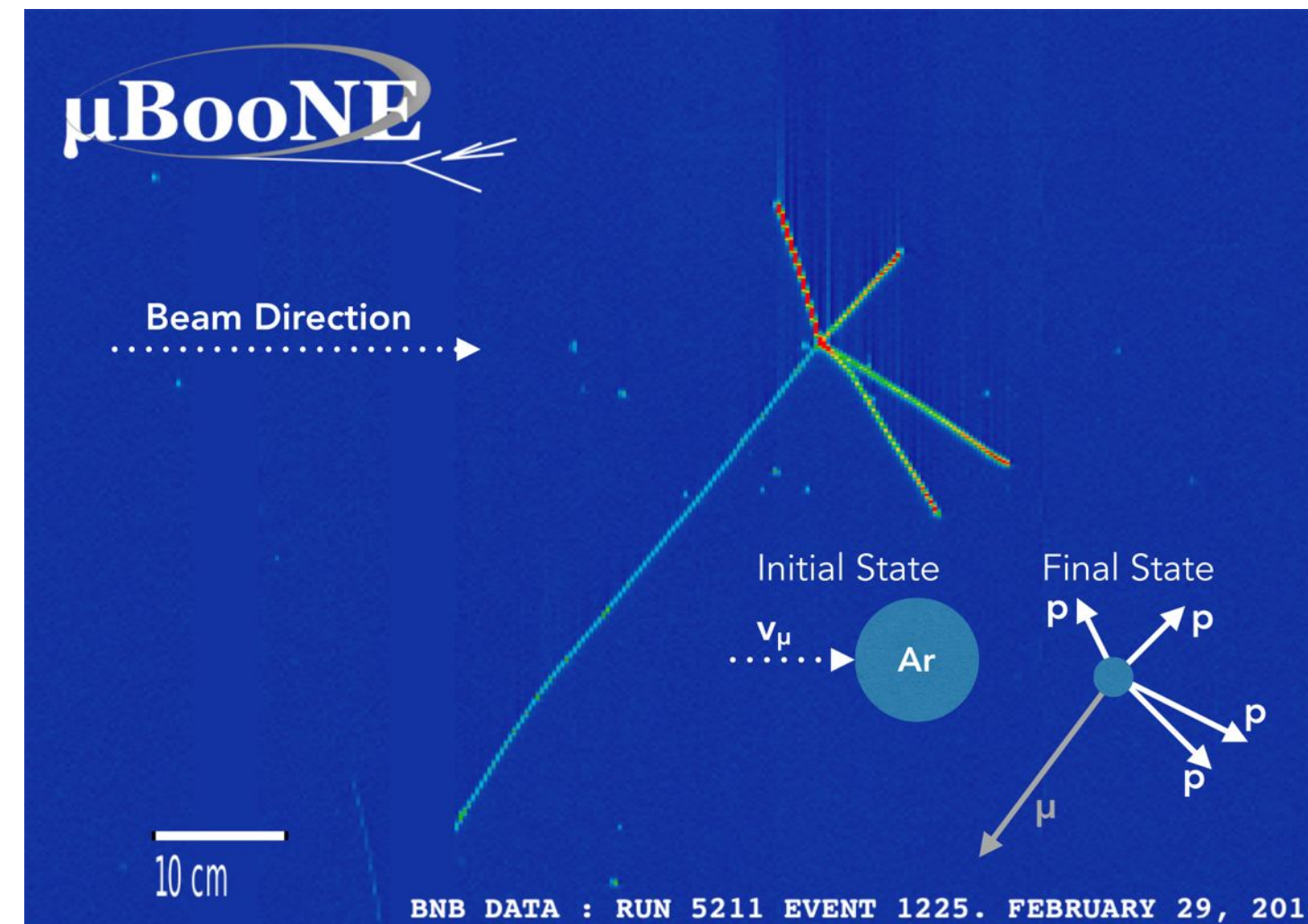


Particle transport



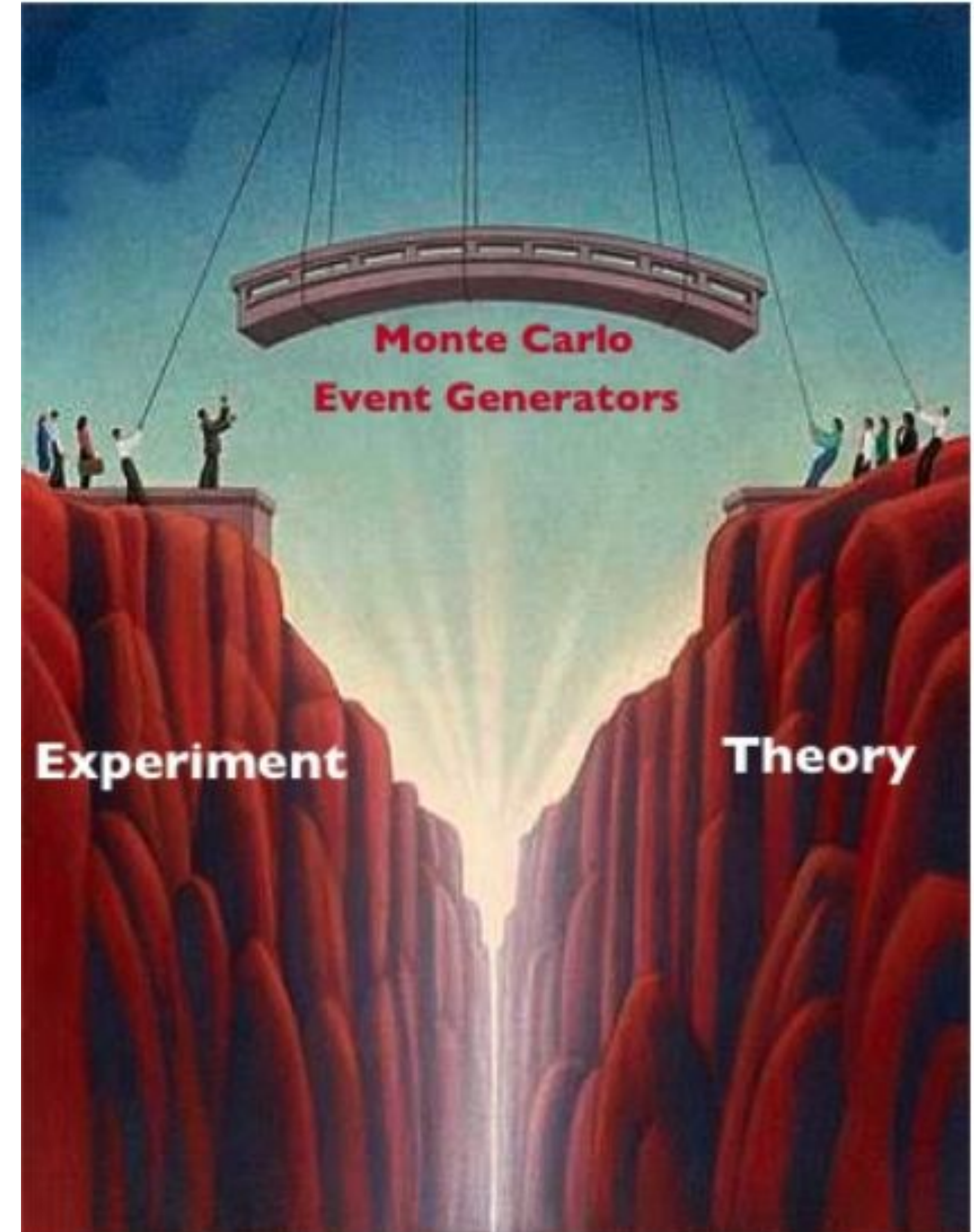
M. Del Tutto, JETP seminar May 2019

Detector response



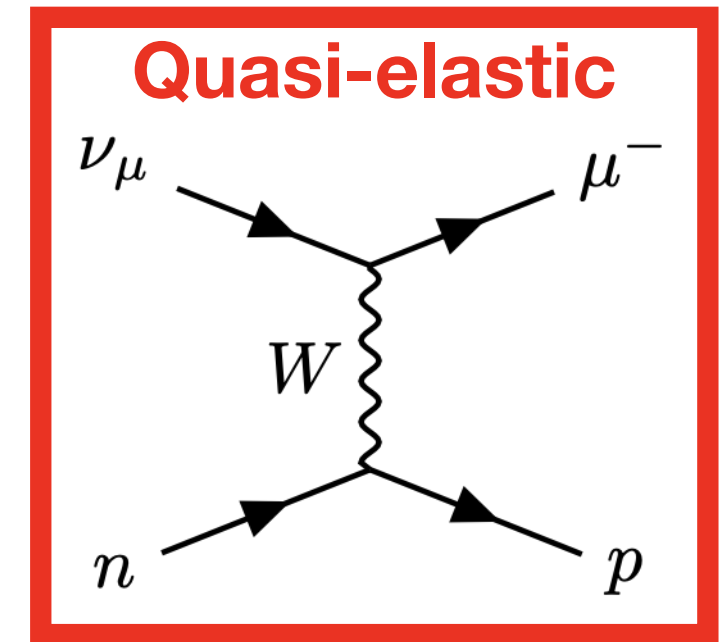
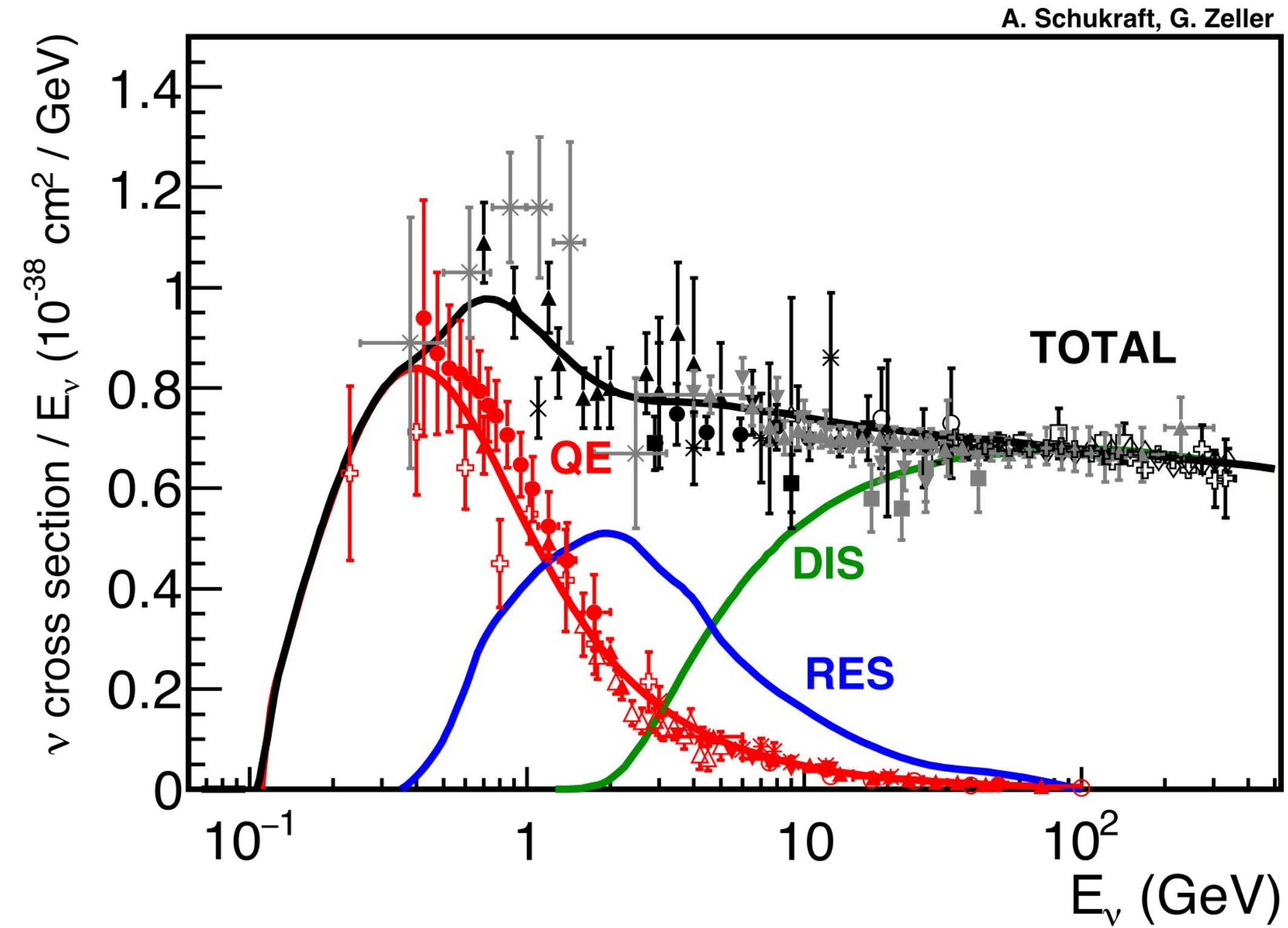
# Role of neutrino event generators

- **“Bridge” between theory and experiment:** model predictions are made easily usable
- Essential for a variety of tasks needed for experimental analyses
  - This has been mentioned repeatedly in previous lectures
  - I'll discuss some specific examples
- Cross section data informs further theory improvements
  - I'll return to this point near the end of the talk

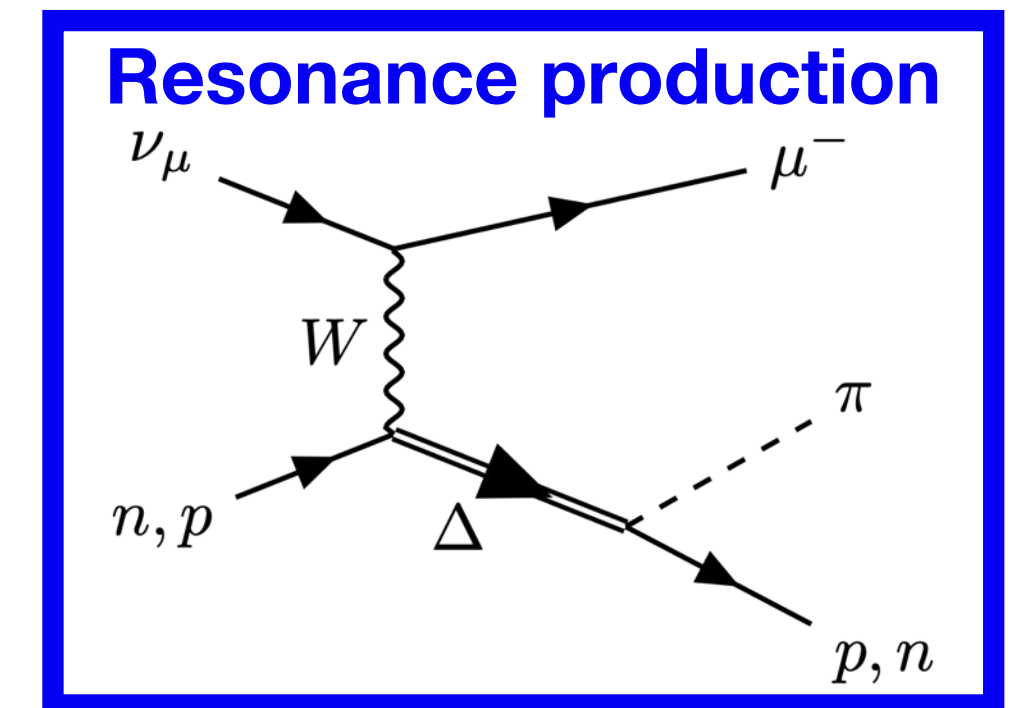


# Modeling requirements

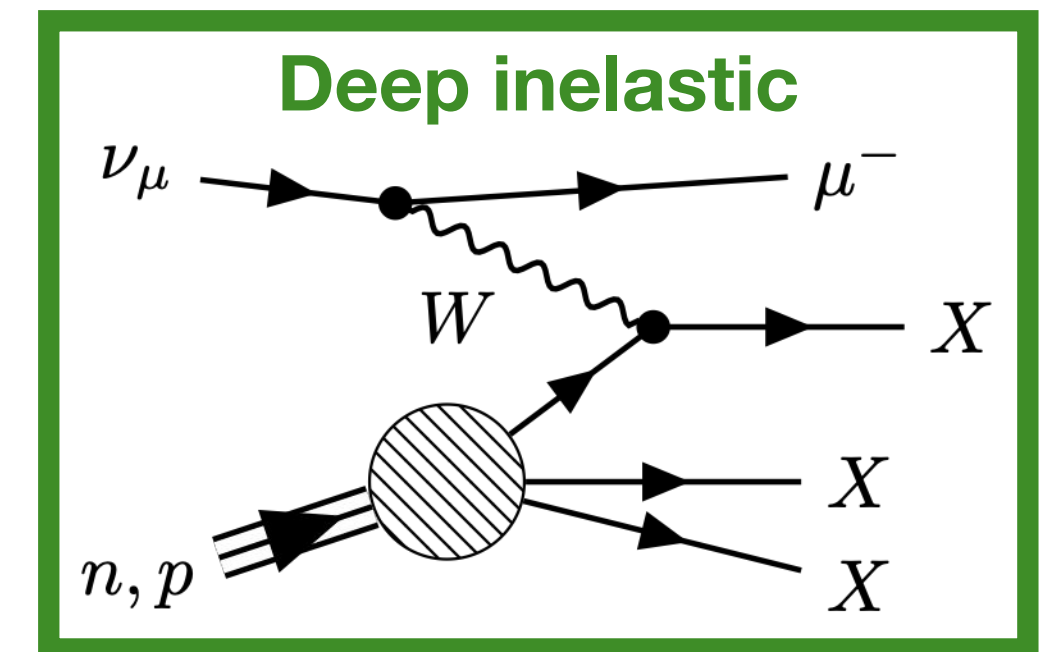
- Experiments need cross section models that predict
  - All final-state observables for
  - All important processes for
  - Many nuclear targets including inactive detector components and the surroundings (“dirt backgrounds”)
  - Over a neutrino energy range spanning orders of magnitude
- Uncertainties must be well controlled for precision measurements



**QE**

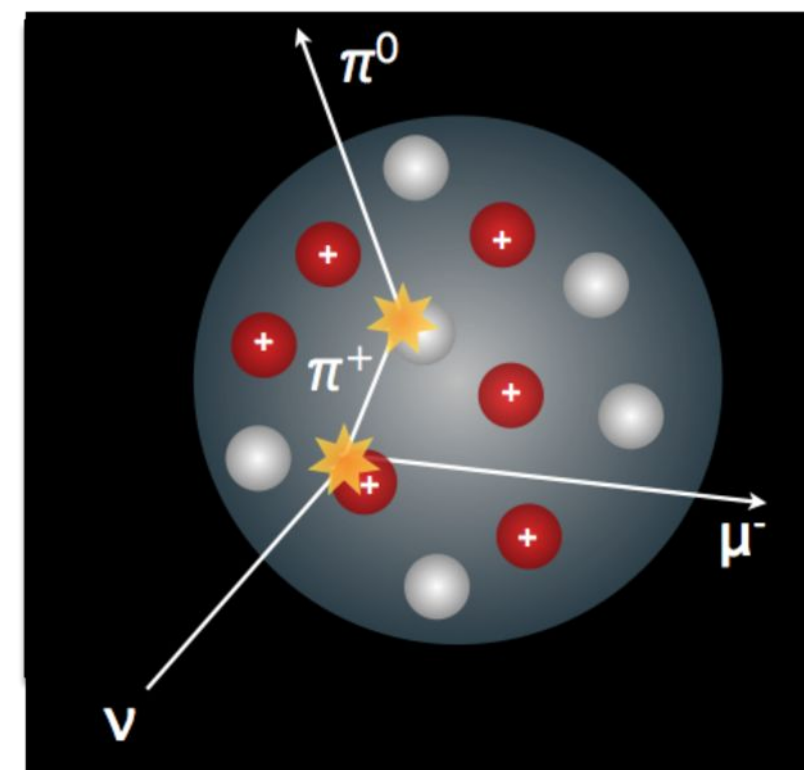


**RES**

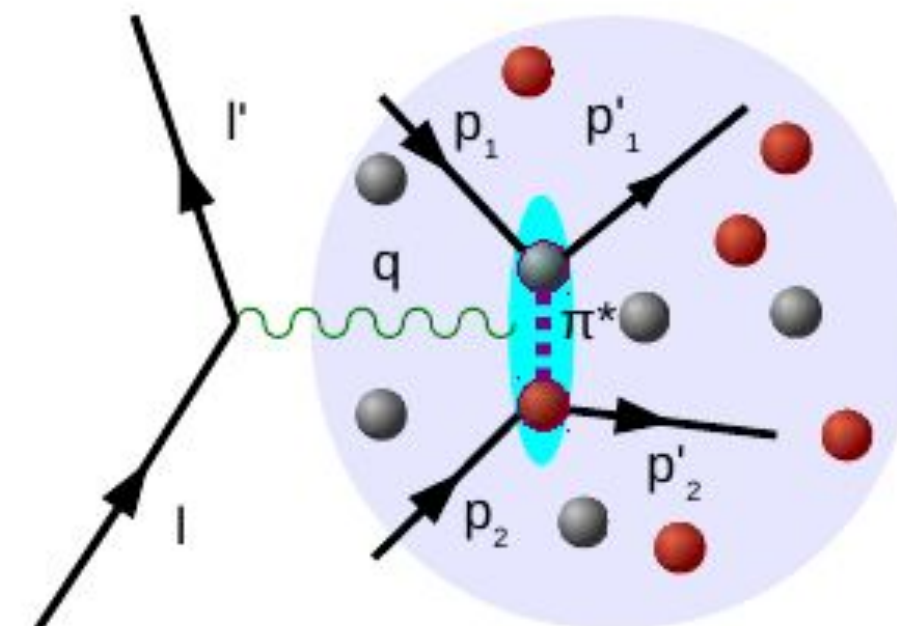


**DIS**

Final-state interactions (FSIs)



Two-particle two-hole (2p2h) interactions



**Nucleon-level processes**

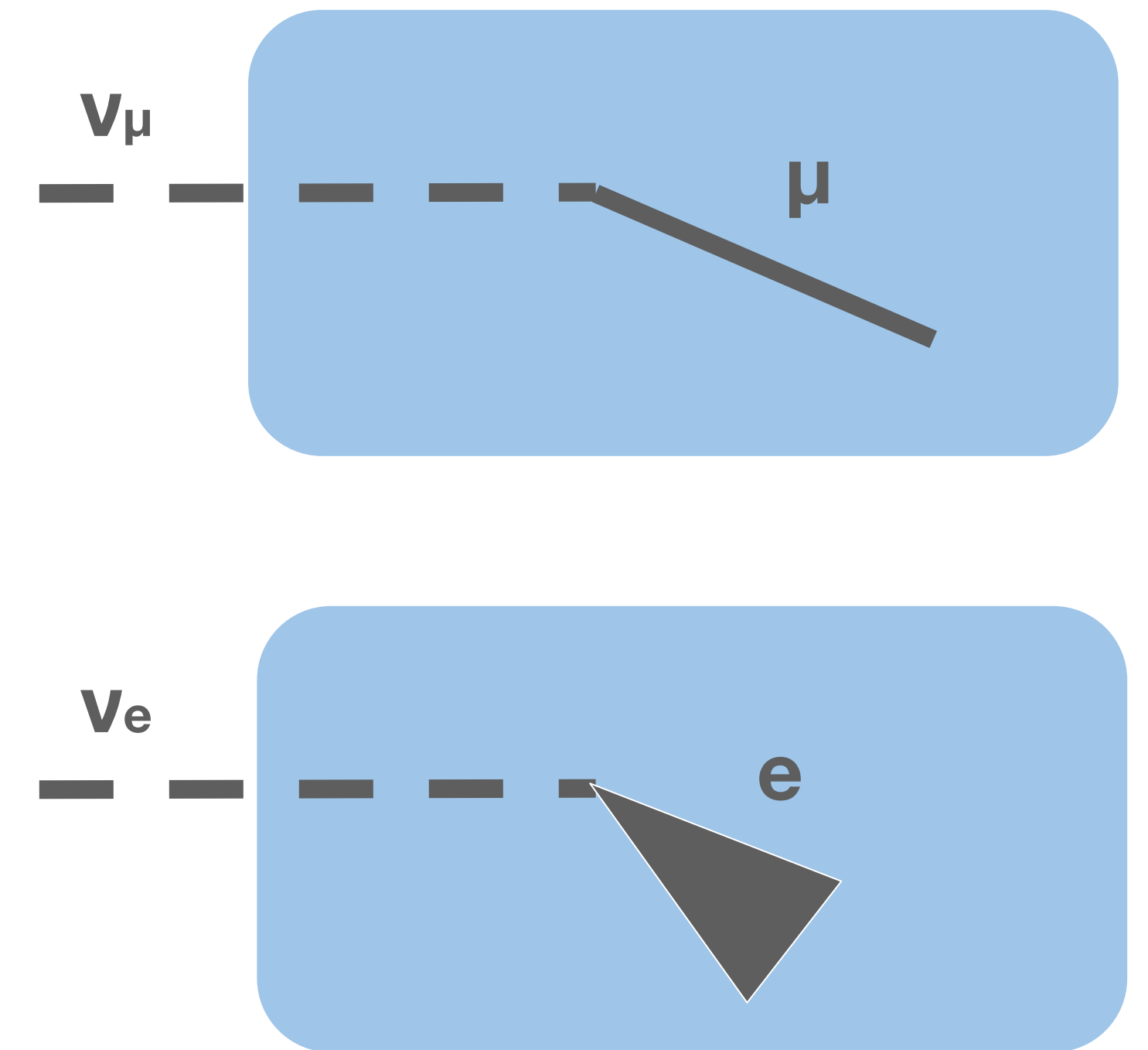
**Nuclear effects**



# Structure of a neutrino oscillation measurement

- Basic task in the analysis
  - Count neutrinos at one or more locations
  - Record the flavor of each neutrino you see (requires a charged-current interaction)
  - Also estimate the neutrino energy each time
- Compare the result to what you expect
  - Vary oscillation parameters until you find the best fit for the data

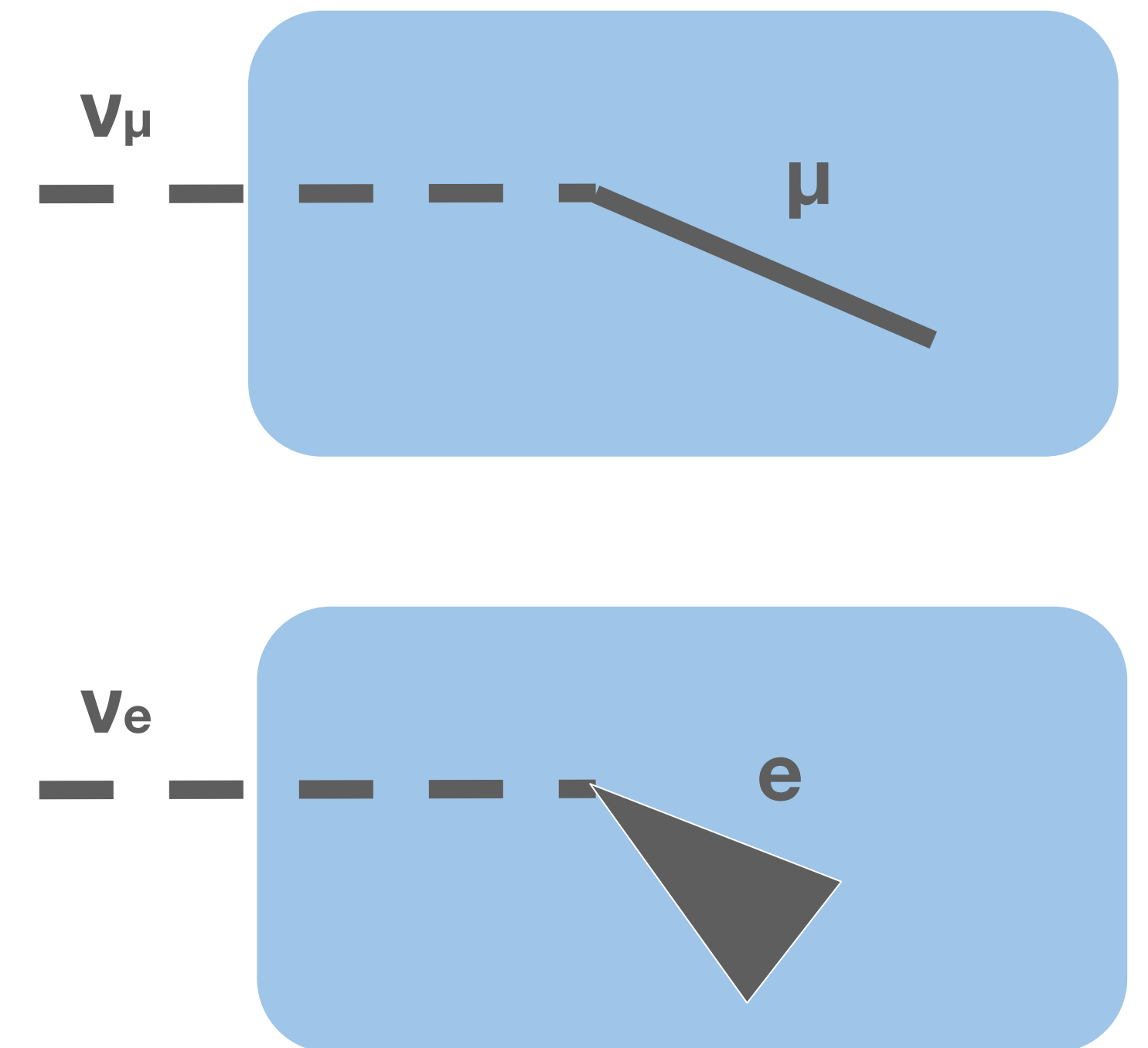
## Cartoon event topologies for a liquid argon neutrino detector



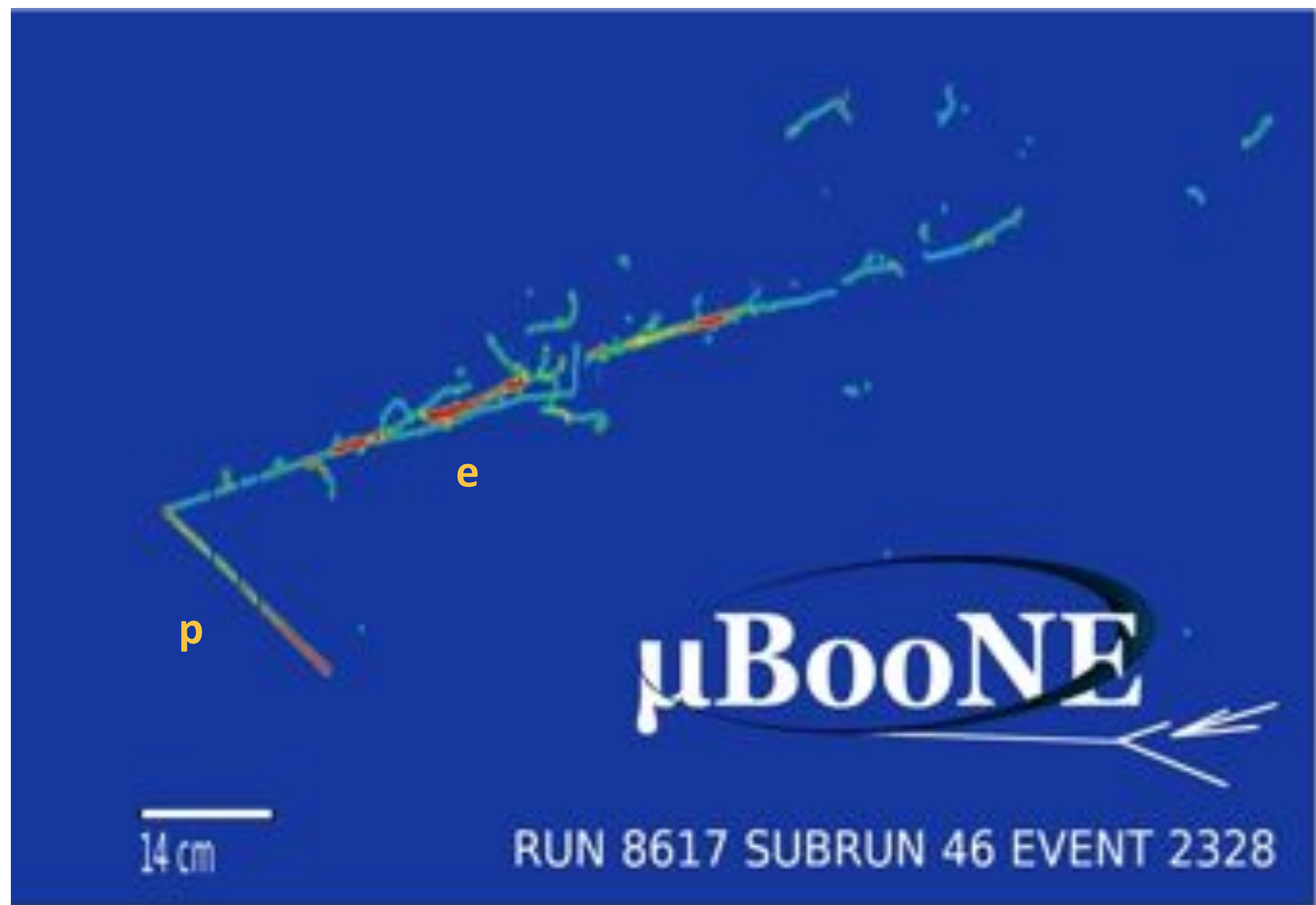
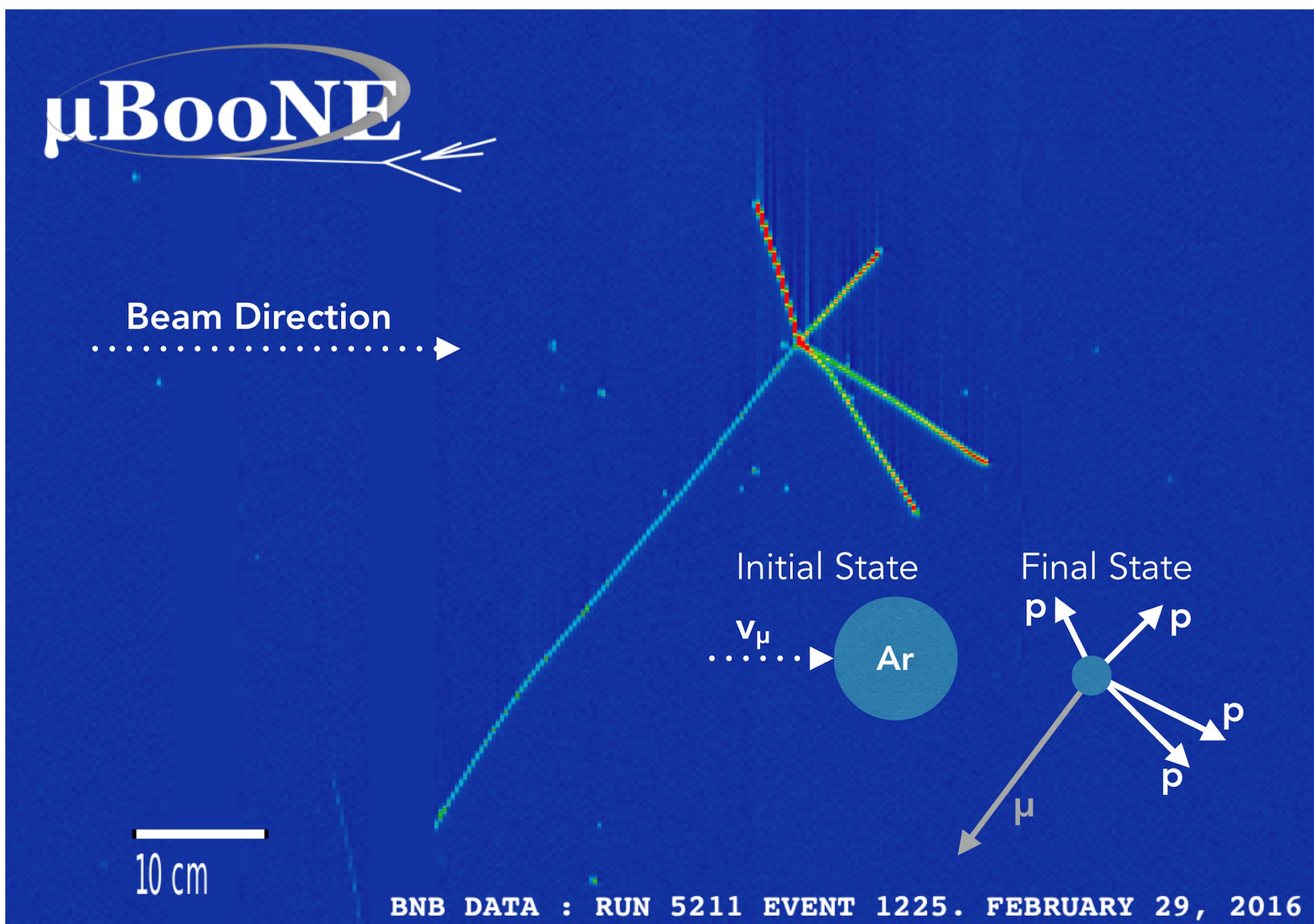
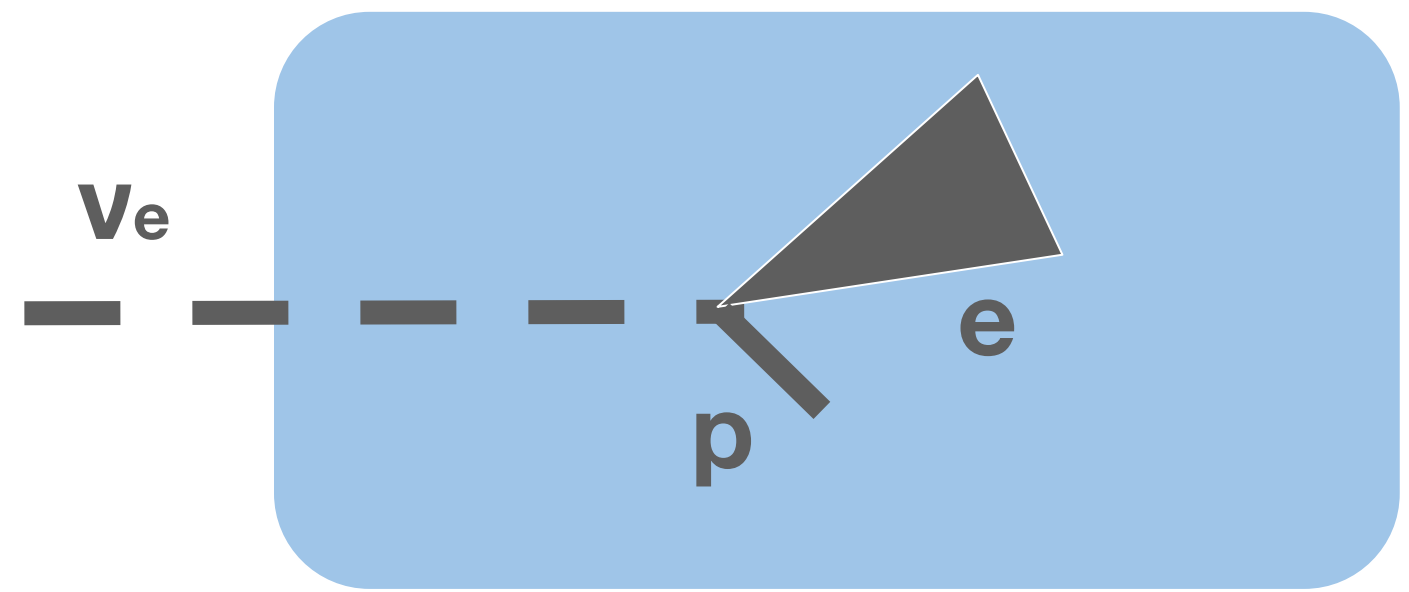
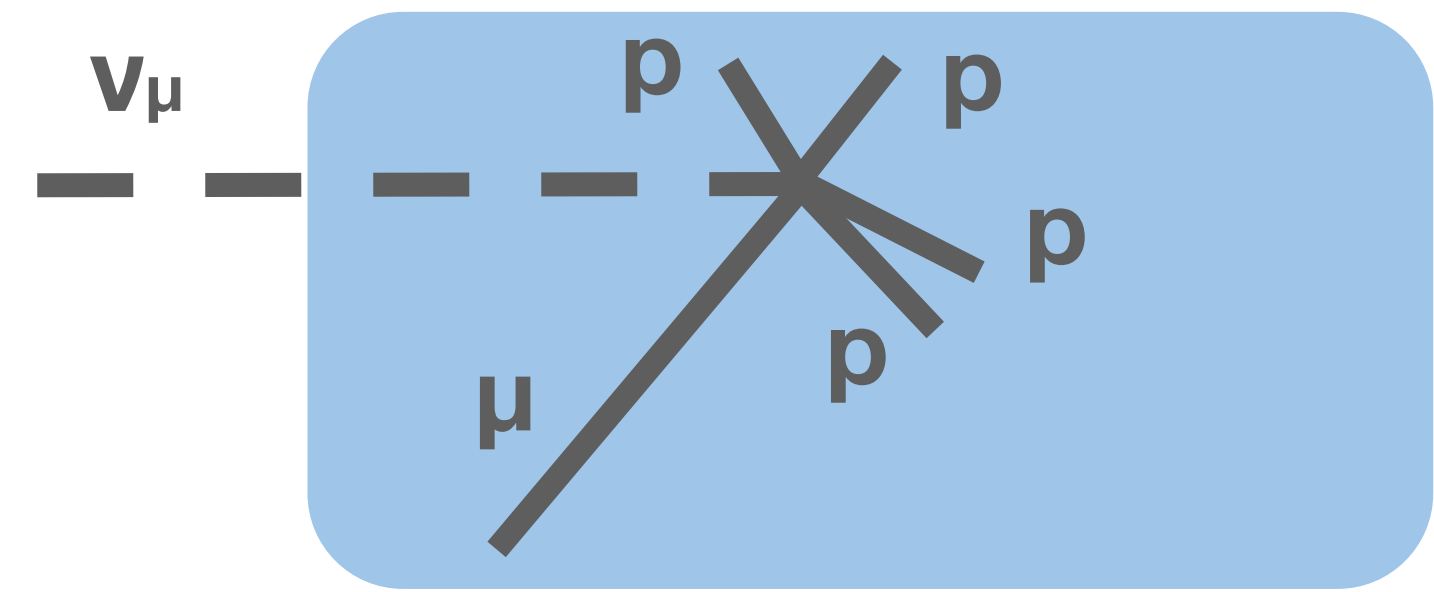
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Cartoon event topologies for a liquid argon neutrino detector

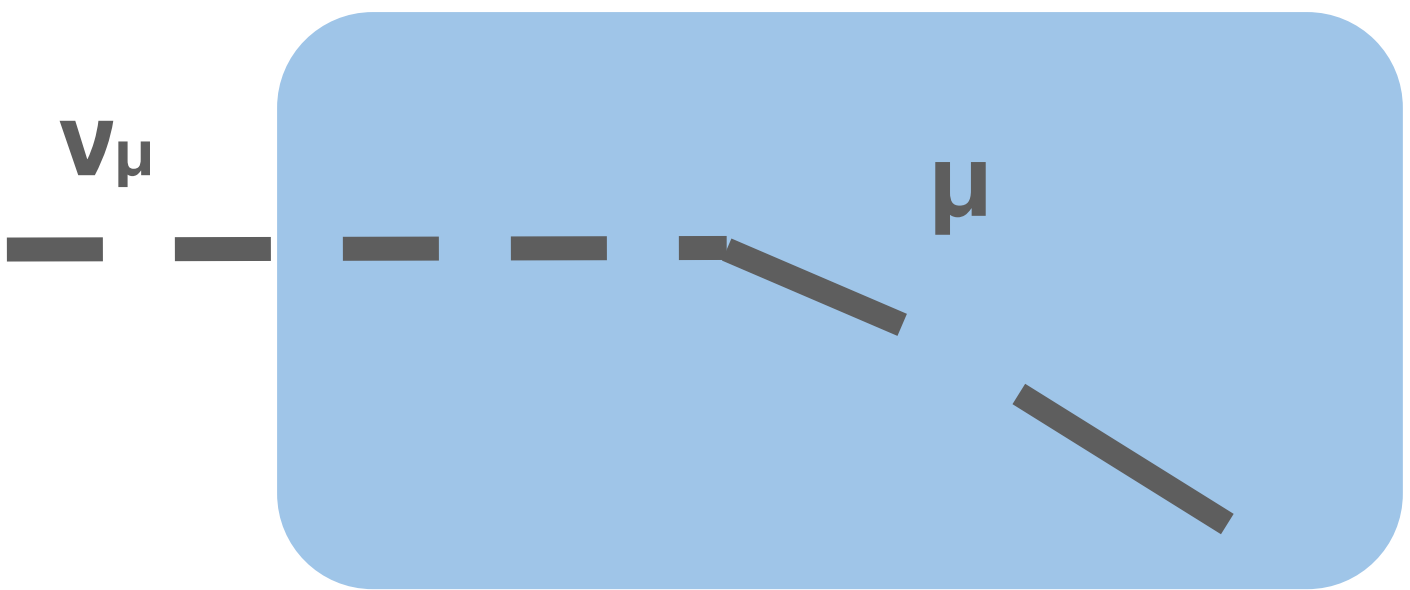


# Example event displays from MicroBooNE

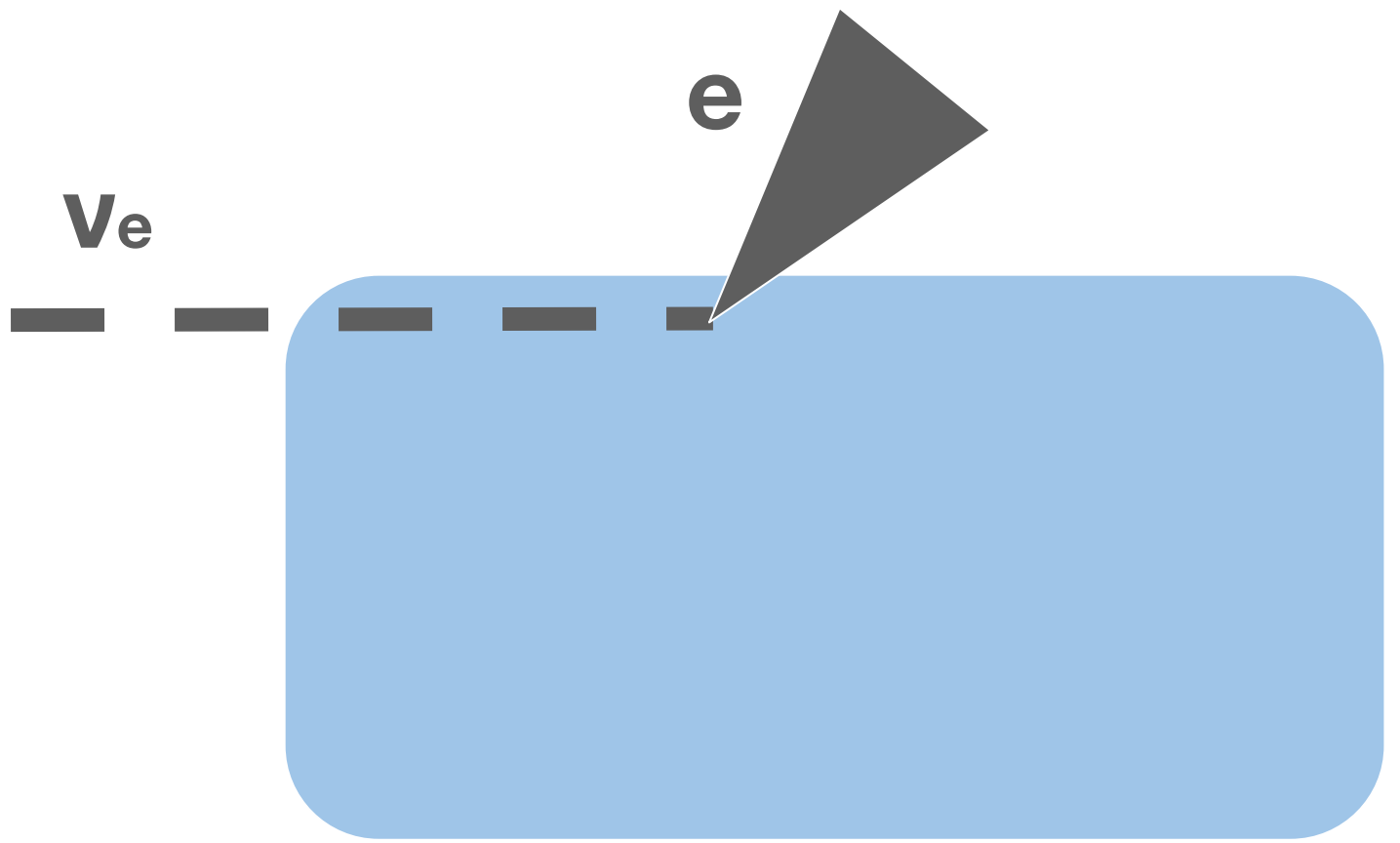


# How often do we miss a neutrino? (inefficiency)

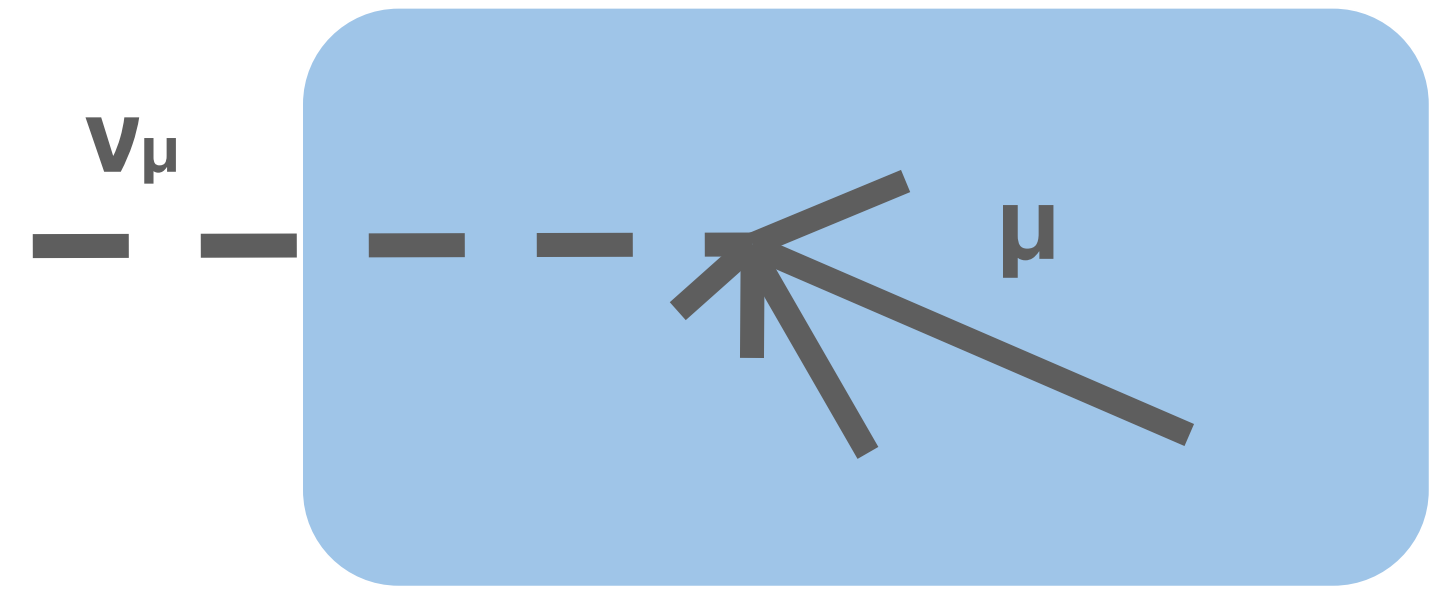
Count neutrinos at one or more locations



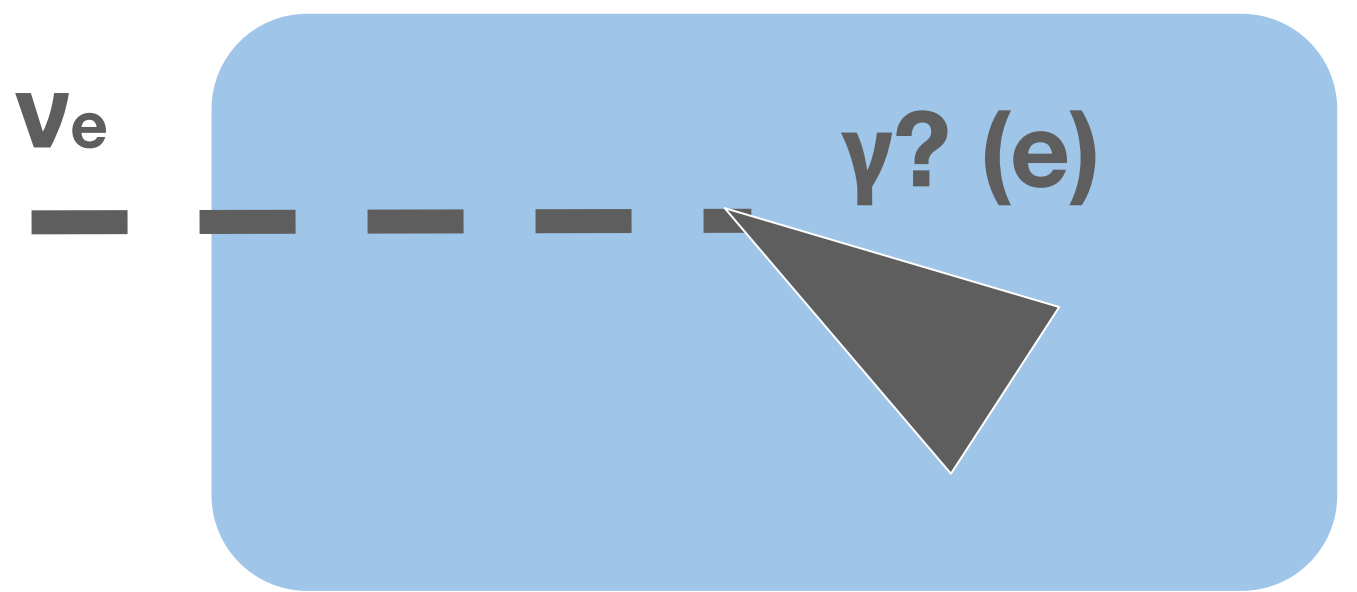
Broken muon track  
(dead wires, bad reconstruction)



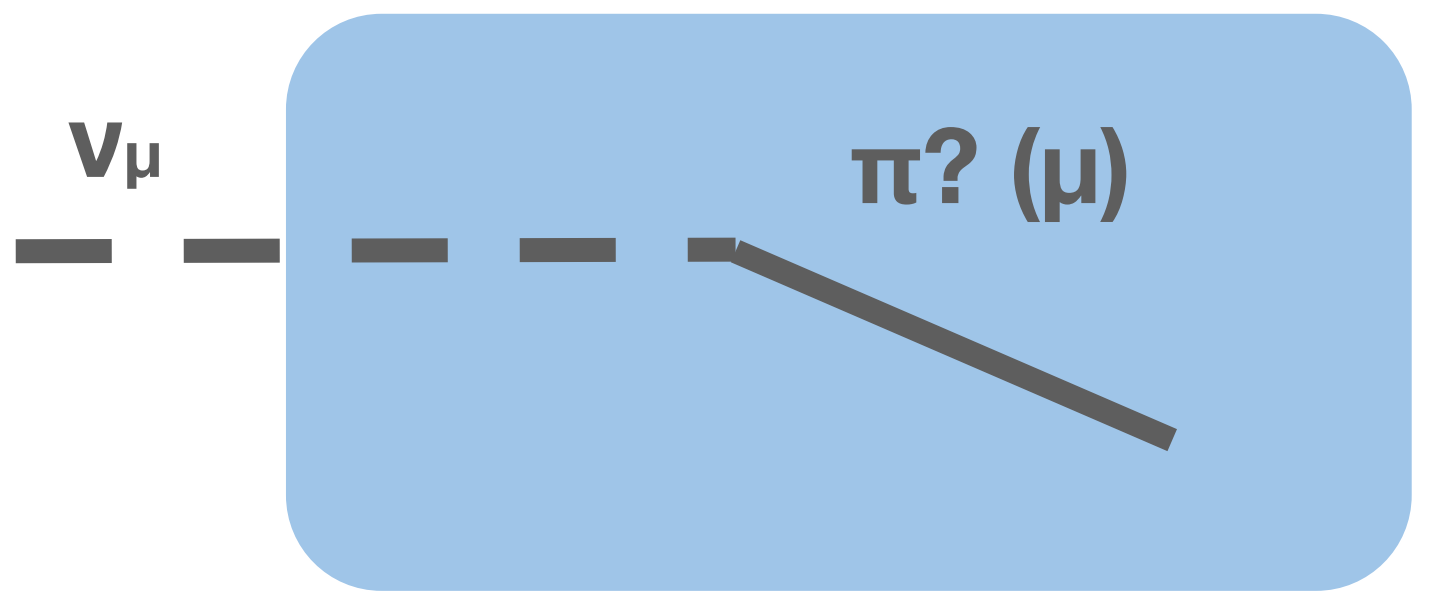
Exiting particles, edge effects



More ways to mis-reconstruct  
at high multiplicities



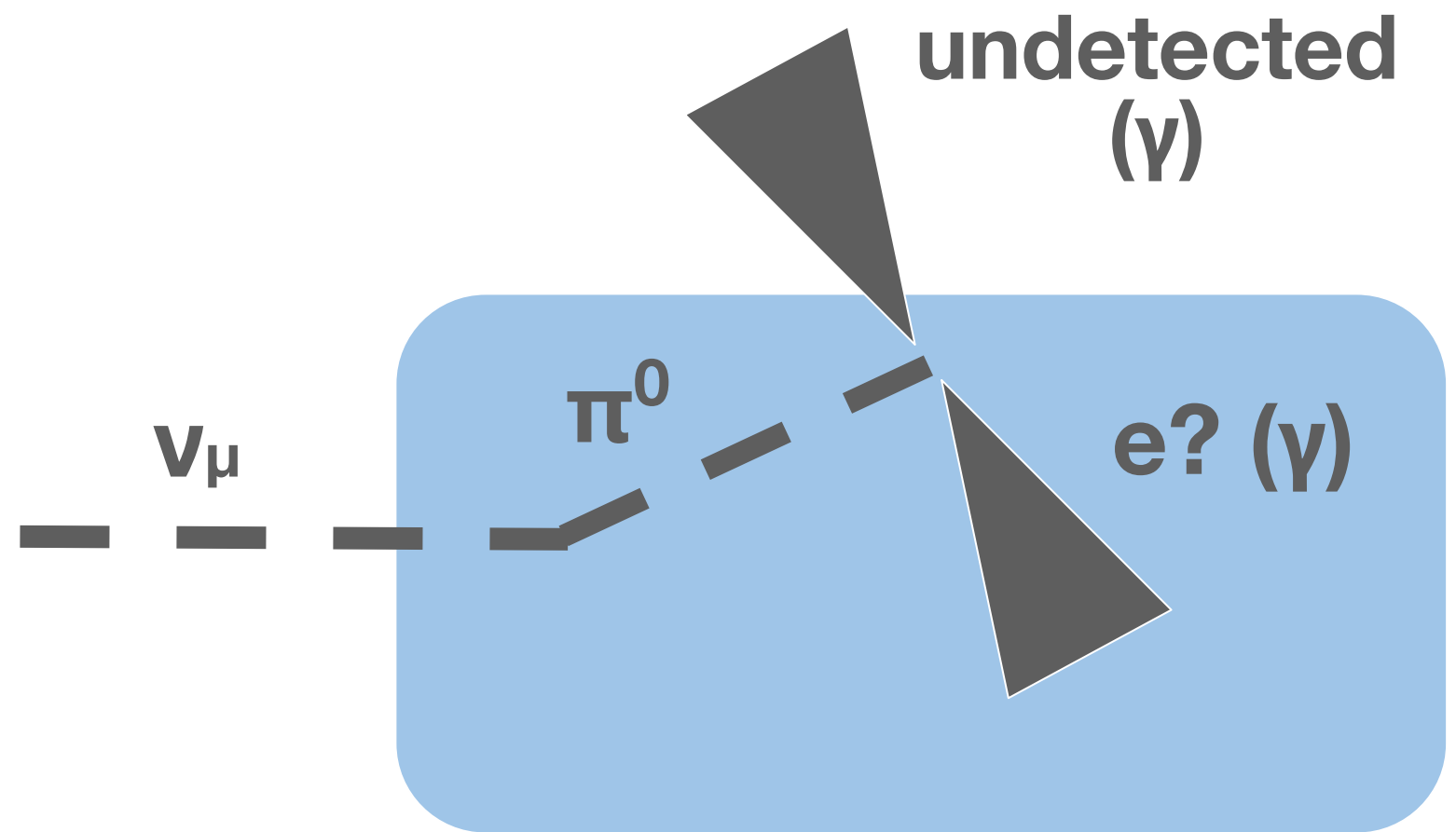
Misidentified particles



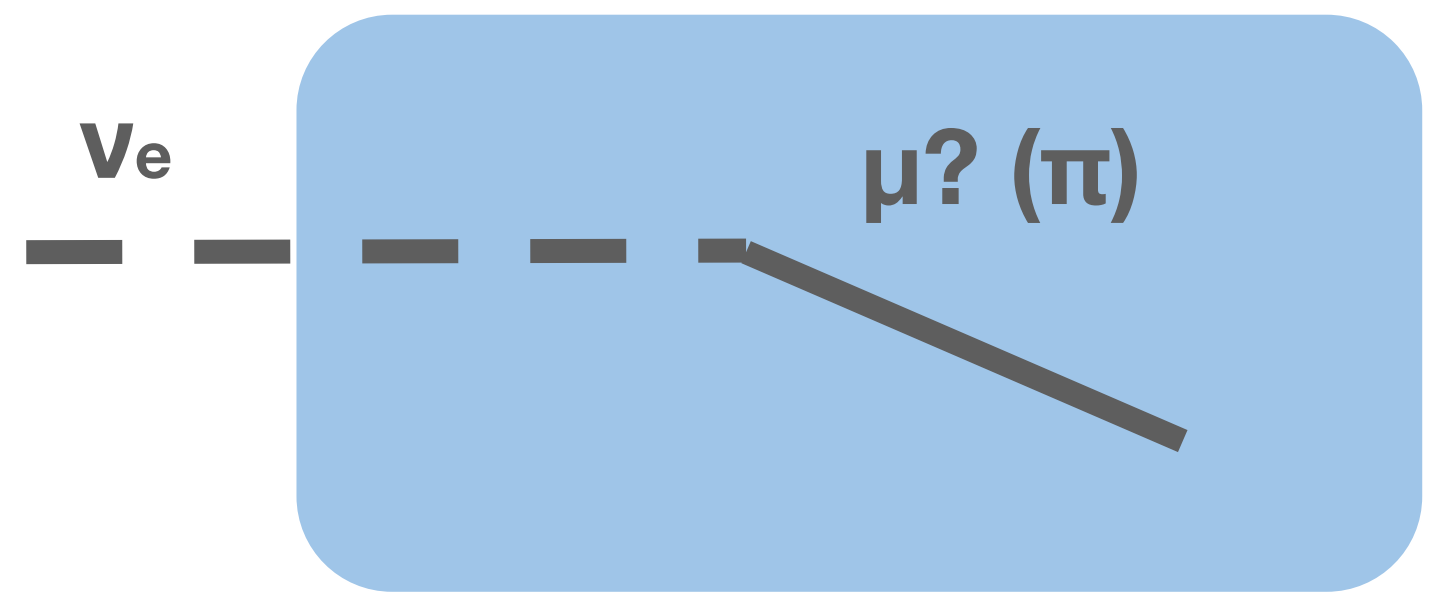
Corrections for problems like these are dependent on the geometry, neutrino energy, and all details of the interaction physics

# How often do we count events that we don't want? (backgrounds)

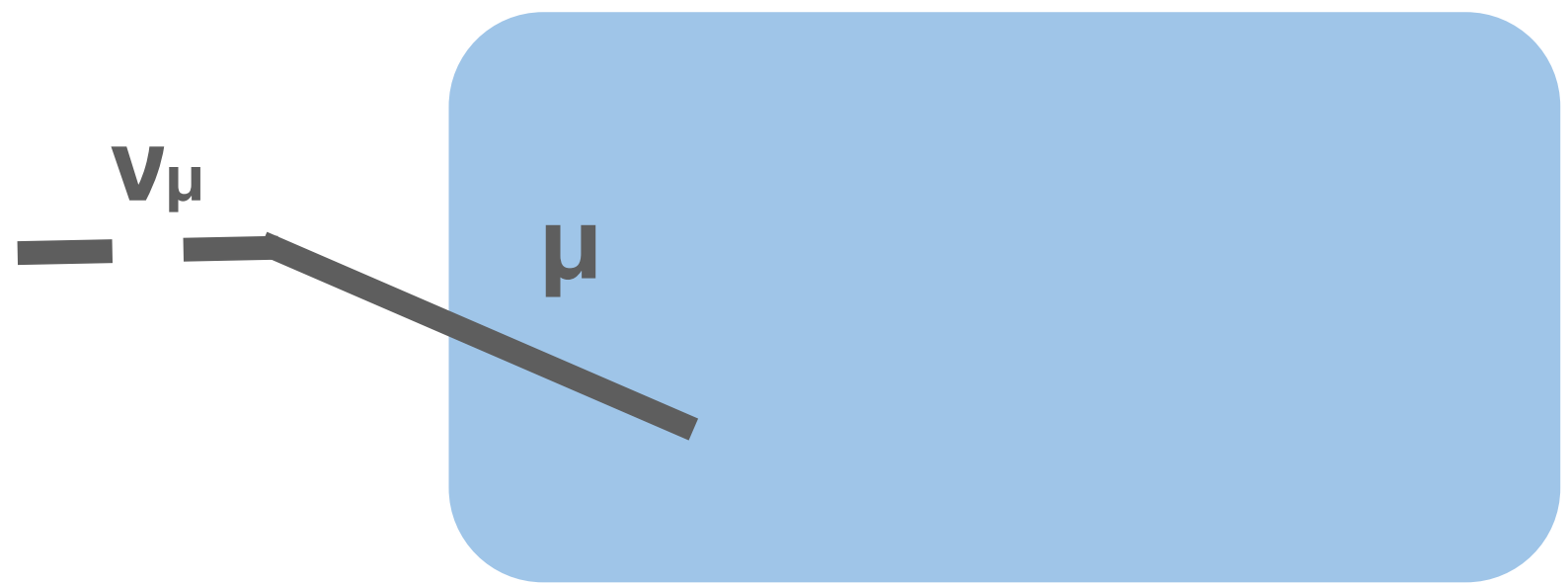
Record the flavor of each neutrino you see



Example background to  $\nu_e$  counting



Example background to  $\nu_\mu$  counting

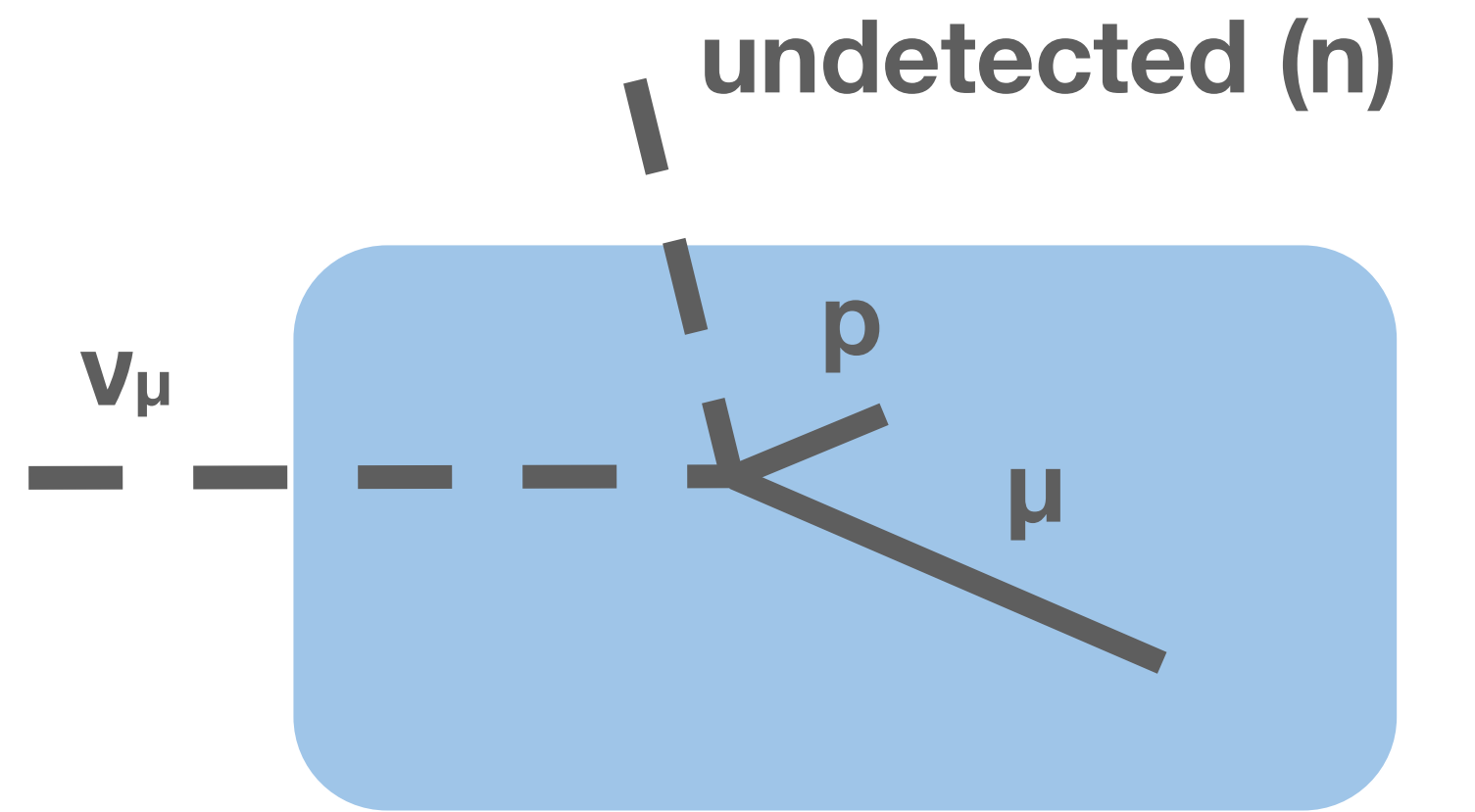


A "dirt" background event

Simulations remain crucial to account for these and other forms of background

# How biased is our neutrino energy estimator? (calorimetry)

**Estimate the neutrino energy** each time



Quasielastic-like  $\nu_\mu$  event

$$E_{QE} = \frac{2M_N \epsilon + 2M_N E_\ell - m_\ell^2}{2(M_N - E_\ell + k_\ell \cos \theta_\ell)}$$

**QE strategy:** Assume quasielastic (wrong for this event  $\rightarrow$  bias), use muon energy ( $E_\ell$ ), angle ( $\theta_\ell$ ), and nucleon removal energy ( $\epsilon$ )

**Calorimetric strategy:** Add up energies of the visible particles (but the neutron is undetected  $\rightarrow$  bias)

Generators are essential to understand missing energy in neutrino events

# What would our data look like under different scenarios?

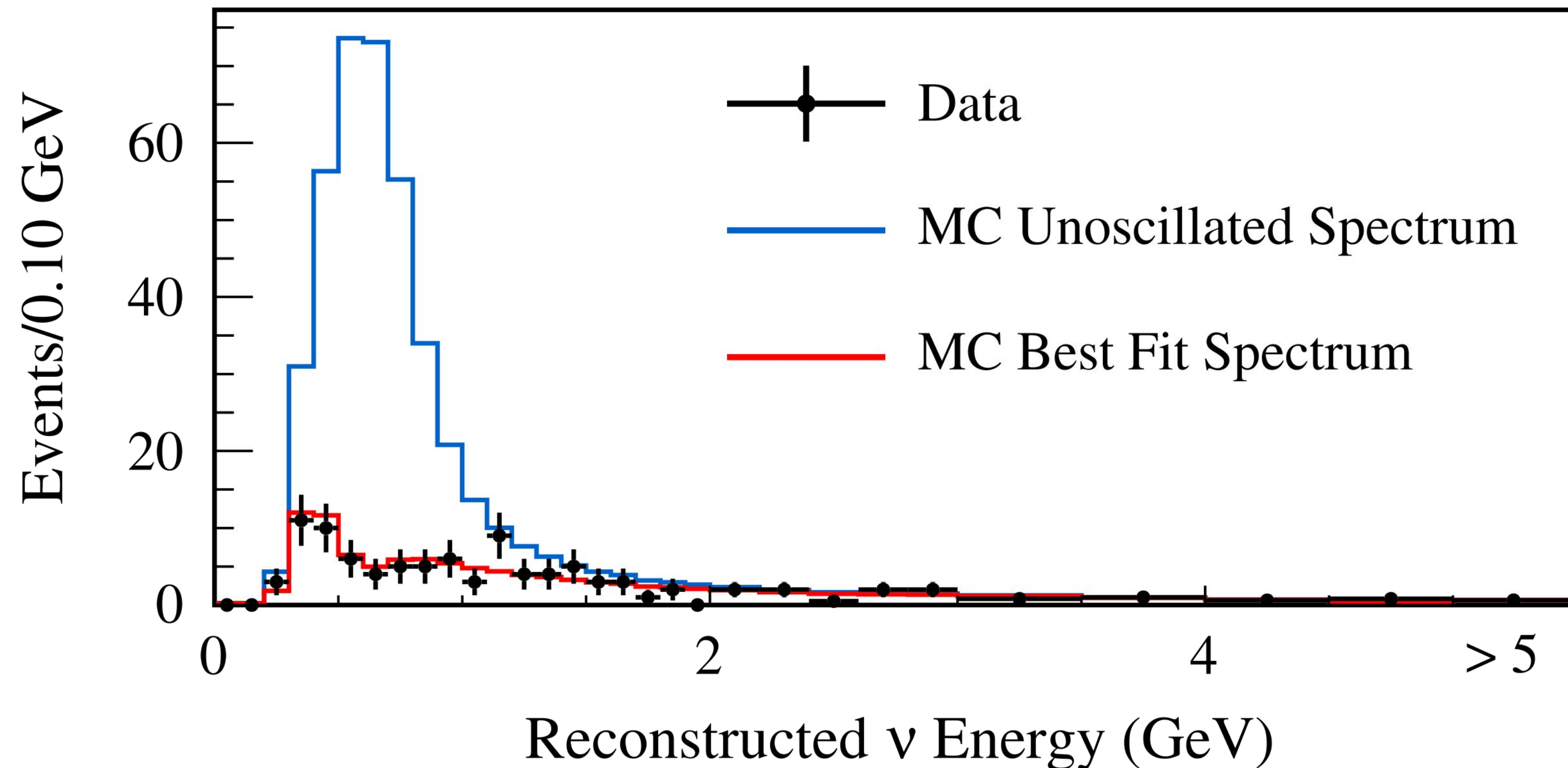
Compare the result to **what you expect**

**Example:**  $\nu_\mu$  disappearance analysis from T2K

Similar games are played for other oscillation studies (e.g.,  $\nu_e$  appearance in a  $\nu_\mu$  beam)

After we have obtained a measurement, we still need a generator to help us understand what it means

T2K Collaboration, [Phys. Rev. D 91, 072010 \(2015\)](#)



1. Count  $\nu_\mu$  as a function of reconstructed energy (**black**)
2. Predict expected result without oscillations (**blue**)
3. Multiply prediction by  $P_{\nu_\mu \rightarrow \nu_\mu}$  and fit oscillation parameters (**red**)

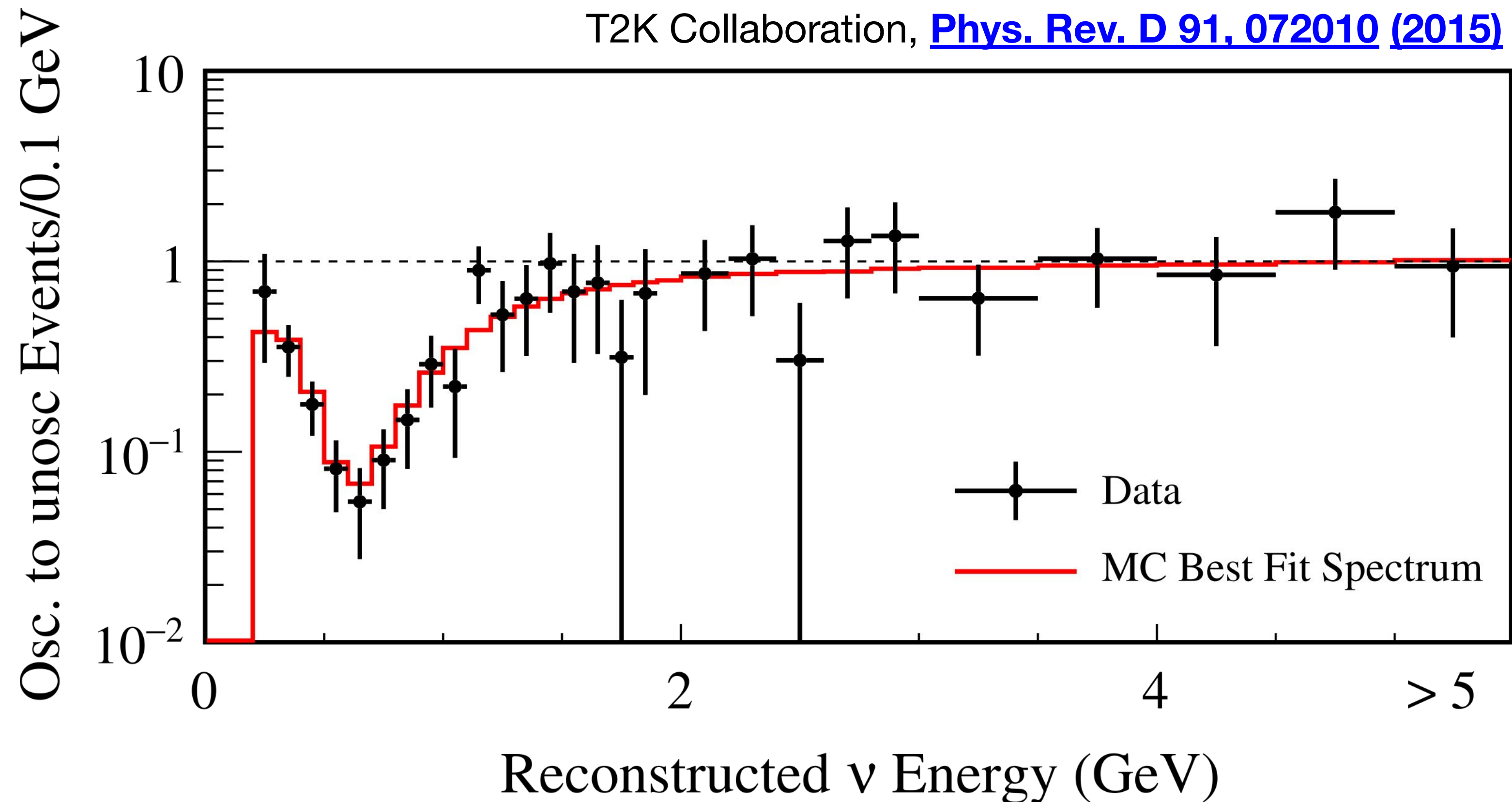
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Similar games are played for other oscillation studies (e.g.,  $\nu_e$  appearance in a  $\nu_\mu$  beam)

After we have obtained a measurement, we still need a generator to help us understand what it means





# Model comparisons also needed when searching for new physics

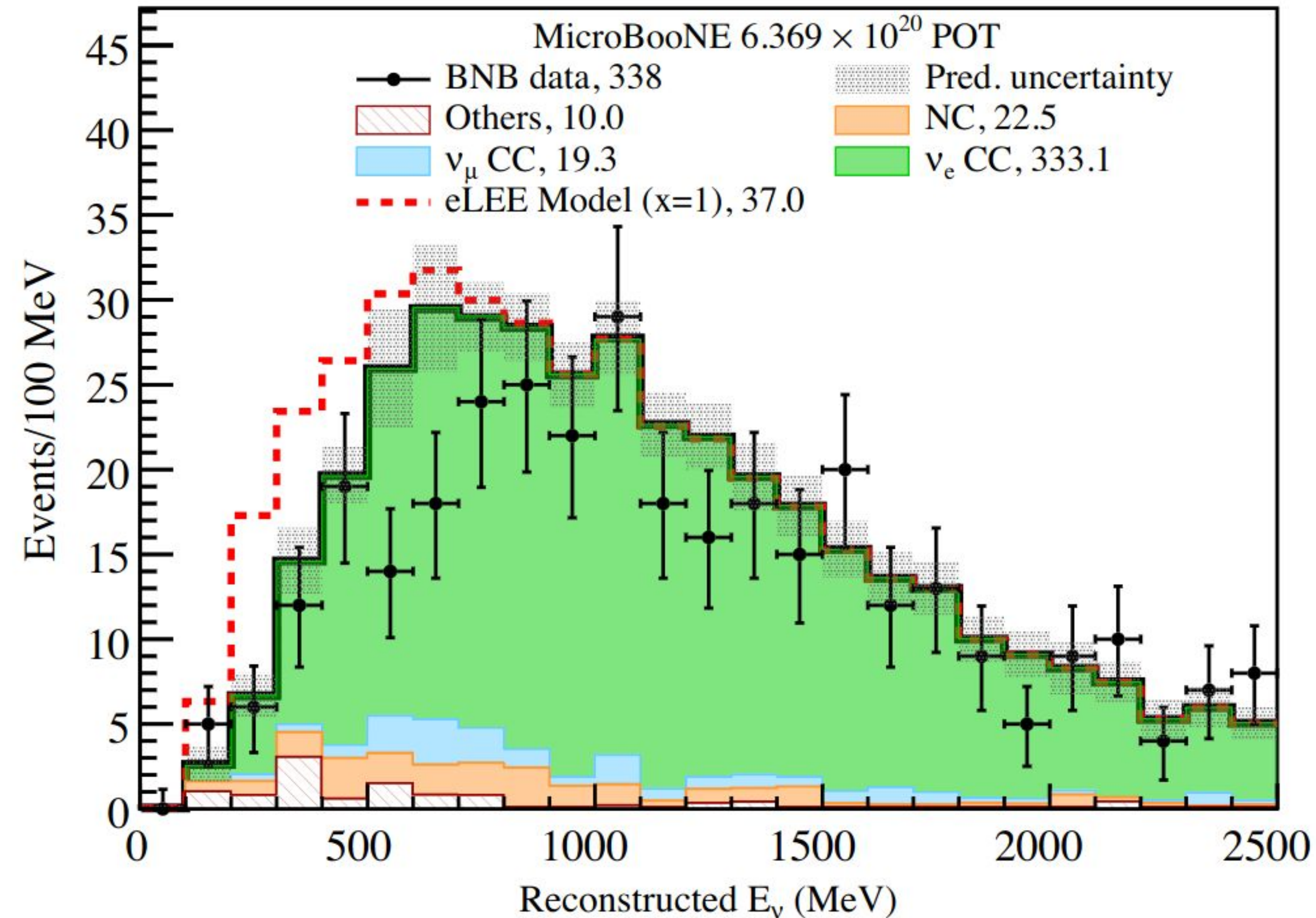
Compare the result to **what you expect**

MicroBooNE looked for an **anomalous excess** of  $\nu_e$ -like events at low energies

Comparison with **GENIE-based prediction** shows no excess (albeit an interesting deficit in a few bins)

After we have obtained a measurement, we still need a generator to help us understand what it means

MicroBooNE Collaboration, [Phys. Rev. Lett. 128, 241801 \(2022\)](#)



# **Part II: Software tour and development highlights**

# Software landscape

Four most popular codes at accelerator energies (~100 MeV to ~20 GeV)

## Experiment-focused generators

Meet the needs of current oscillation experiments

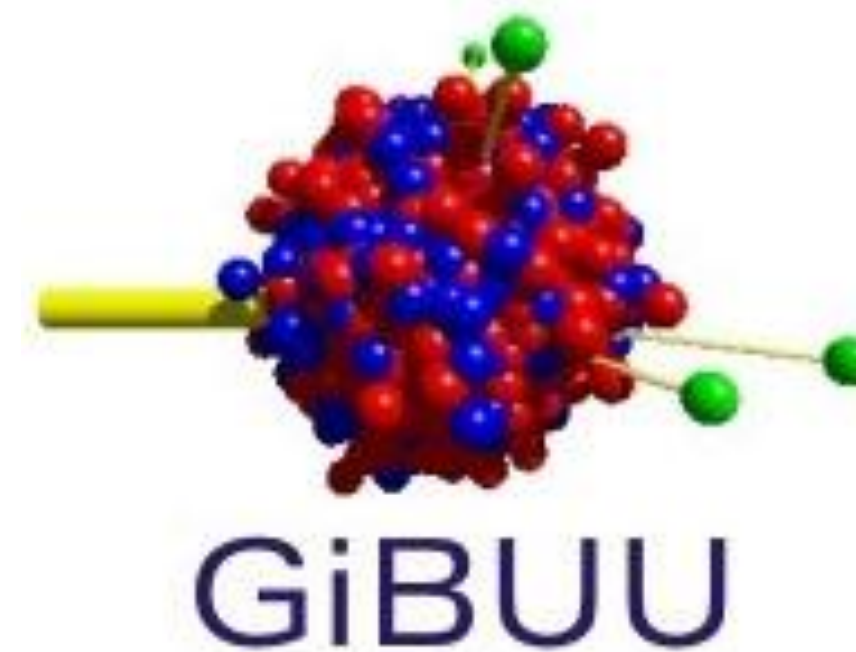


[Eur. Phys. J. Spec. Top. 230, 4449 \(2021\)](#)

C++. Primary generator for Fermilab experiments. Largest group (still just a handful of active developers). Ambitions to be the universal platform.

## Theory-focused generators

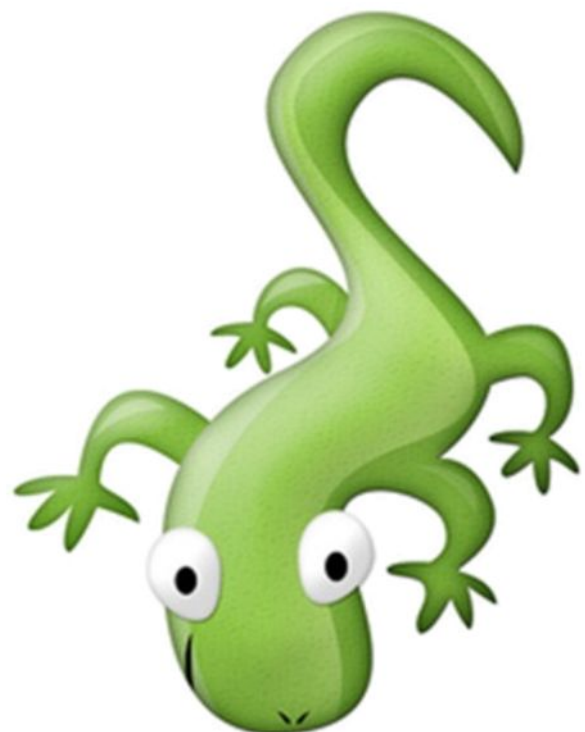
Aid theoretical investigations of neutrino scattering



[J. Phys. G: Nucl. Part. Phys. 46 113001 \(2019\)](#)

Fortran. Supports neutrino projectiles as part of larger framework. Most sophisticated FSI model. Limited infrastructure (no geometry handling, etc.)

NEUT (no official logo)



[Eur. Phys. J. Spec. Top. 230, 4469 \(2021\)](#)

C++/Fortran. Primary generator for J-PARC experiments (T2K, Super-K, Hyper-K). Not yet fully open source.

NuWro



[Nucl. Phys. Proc. Suppl. 229-232, 499 \(2012\)](#)

C++. Many model options, often the first adopter of new theory developments from the literature.

# GENIE's interaction model tuning program

- Developing global analysis of scattering data
  - Model fitting and uncertainty quantification
- **Professor:** tuning software tool from LHC community
  - Efficiently perform brute-force scans of parameter space
  - Applied to neutrinos for the first time by GENIE
- Used together with **GENIE Comparisons**
  - Curated cross-section database
  - Proprietary to GENIE, NUISANCE is open alternative



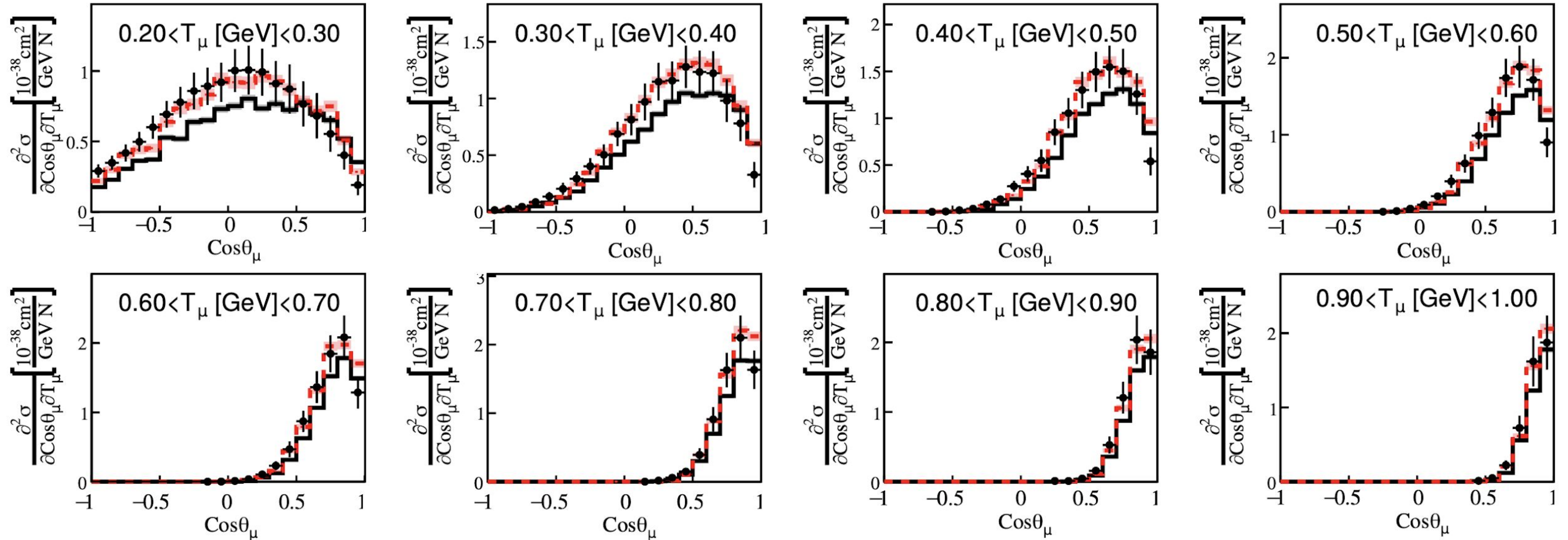
<https://professor.hepforge.org/>

# GENIE tune results for MiniBooNE data

[Phys. Rev. D 106, 112001 \(2022\)](#)

- MiniBooNE  $\nu_\mu$ CC0 $\pi$  data
- G18\_10a\_02\_11b tune
- - - G10a Tune

Modifications to both QE and 2p2h lead to improved normalization and shape agreement

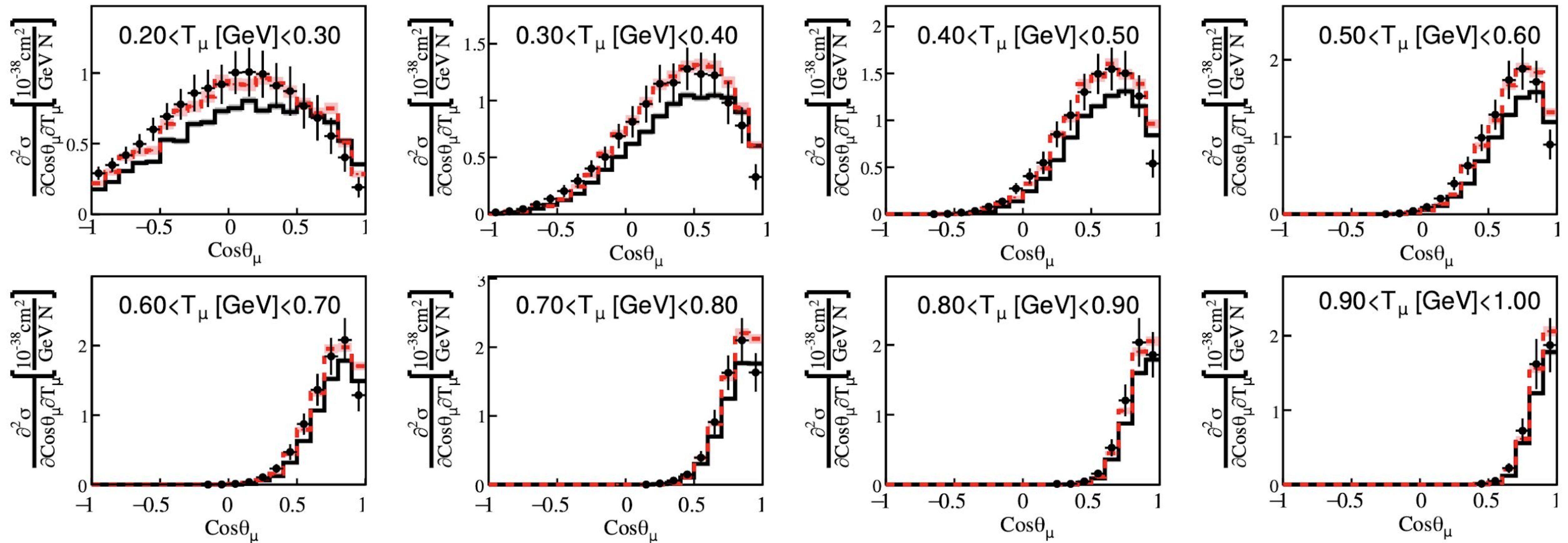


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[Phys. Rev. D 106, 112001 \(2022\)](#)

- MiniBooNE  $\nu_\mu$ CC0 $\pi$  data
- G18\_10a\_02\_11b tune
- - - G10a Tune

**Brand new GENIE tuning results** in Marco Roda's talk  
(Monday afternoon)



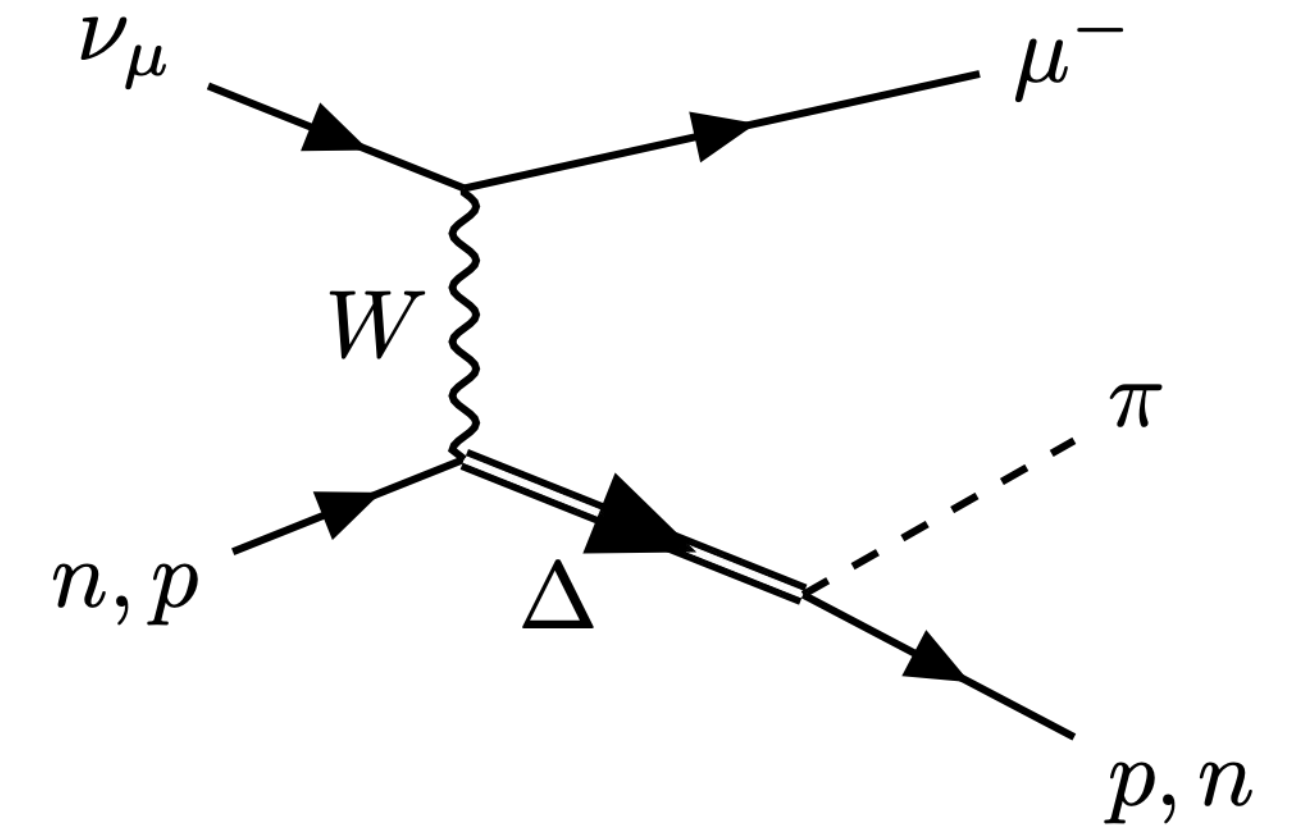
# Single $\pi$ production in NuWro

[Phys. Rev. D 103, 053003 \(2021\)](#)

- New algorithm for event generation

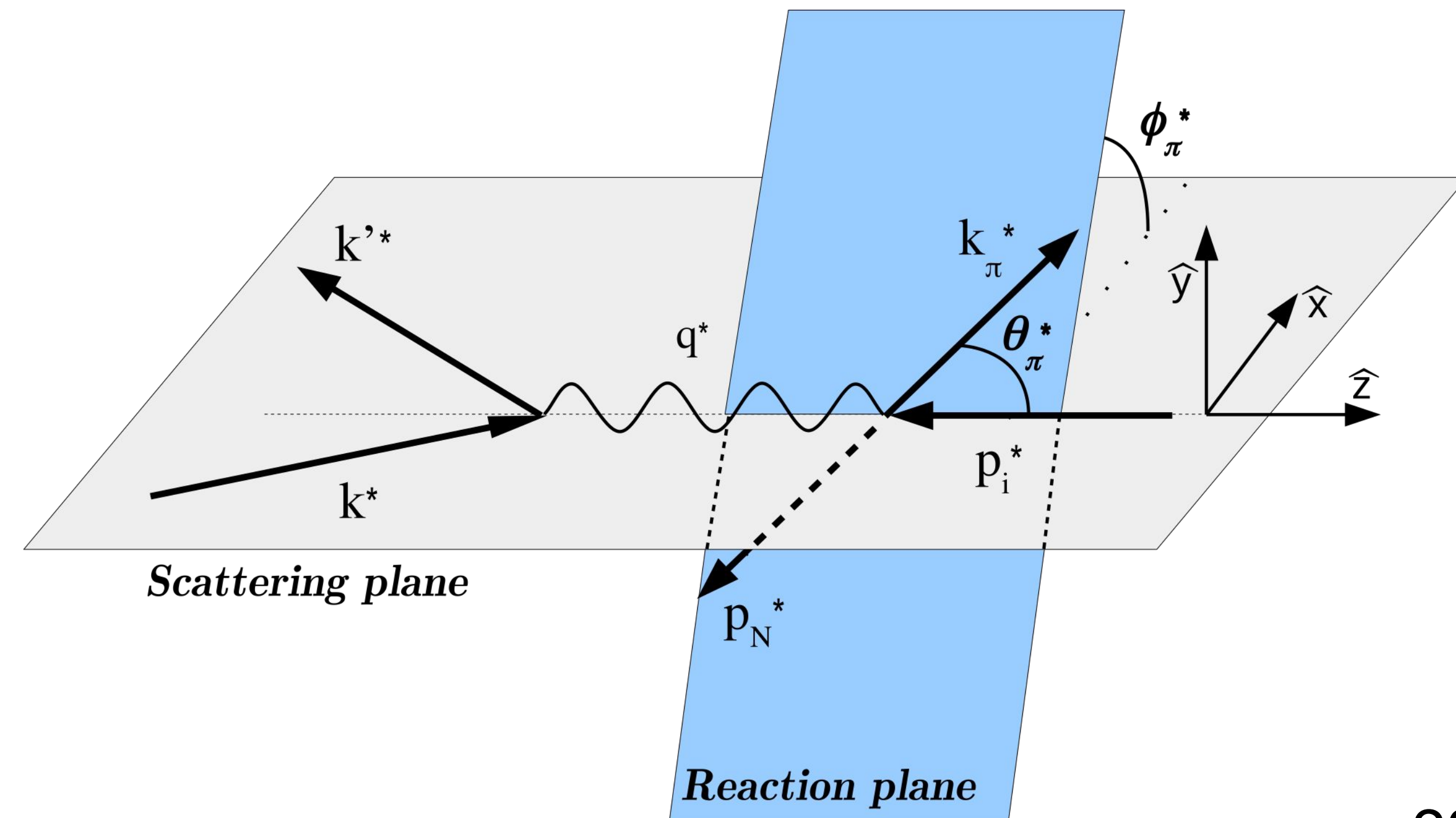
- $W$ ,  $Q^2$ ,  $\theta_\pi^*$ , and  $\phi_\pi^*$

- Can be applied to single  $\pi$  production from any theory prediction

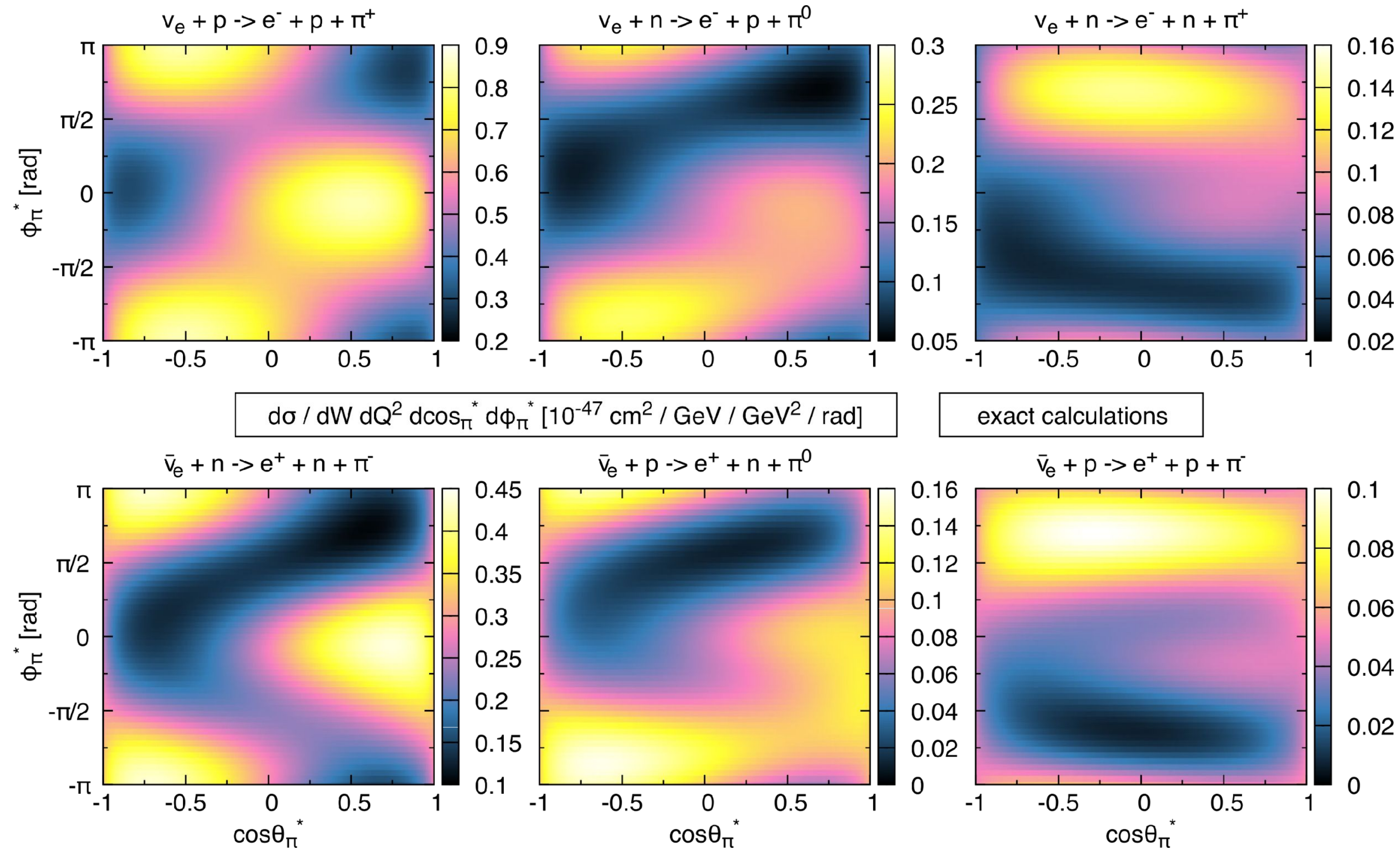


- Used to implement the Ghent low-energy model

- [Phys. Rev. D 95, 113007 \(2017\)](#)

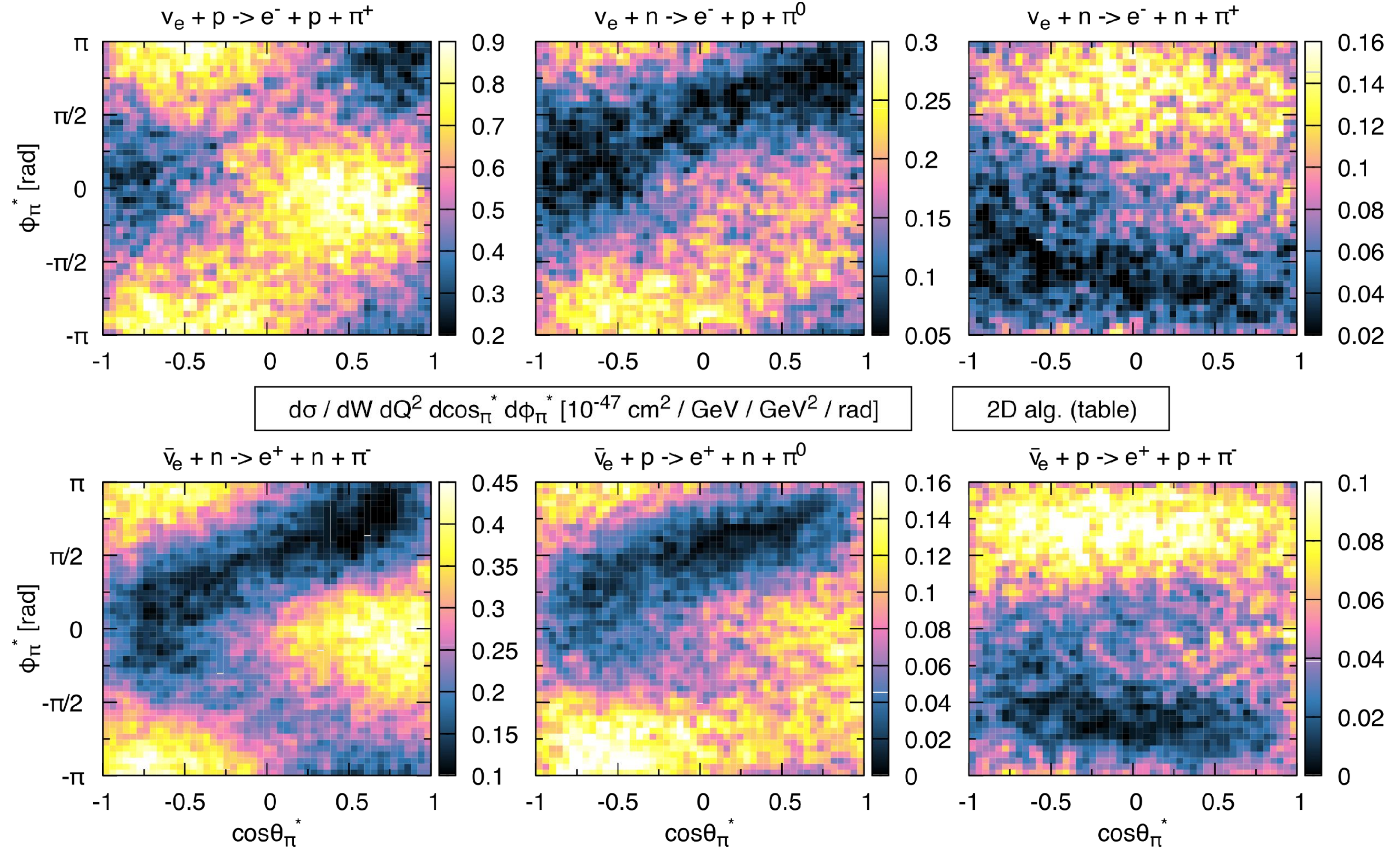


# Ghent low-energy model for single-pion production



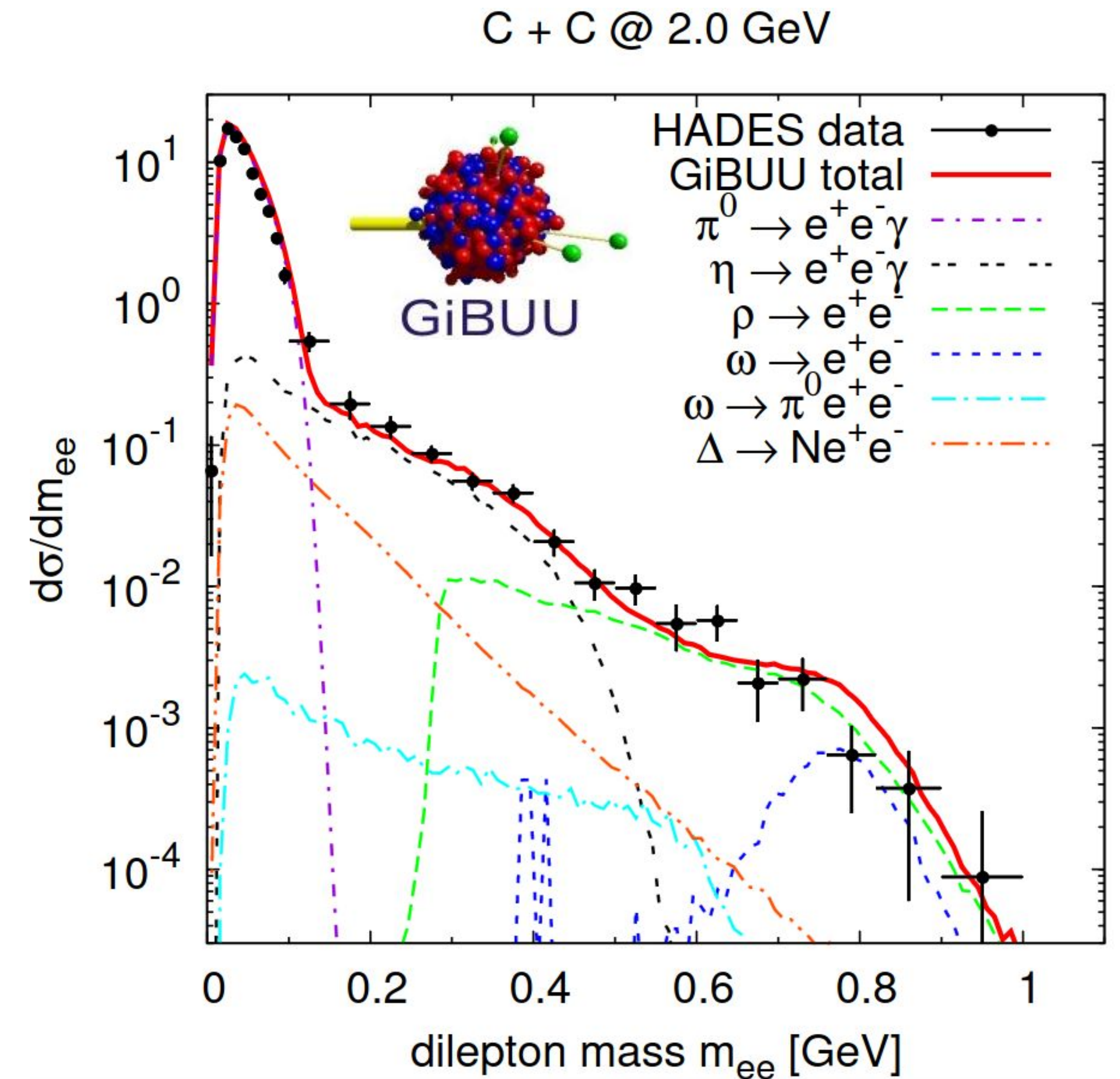


# Ghent low-energy model for single-pion production



# Giessen Boltzmann-Uehling-Uhlenbeck Project (GiBUU)

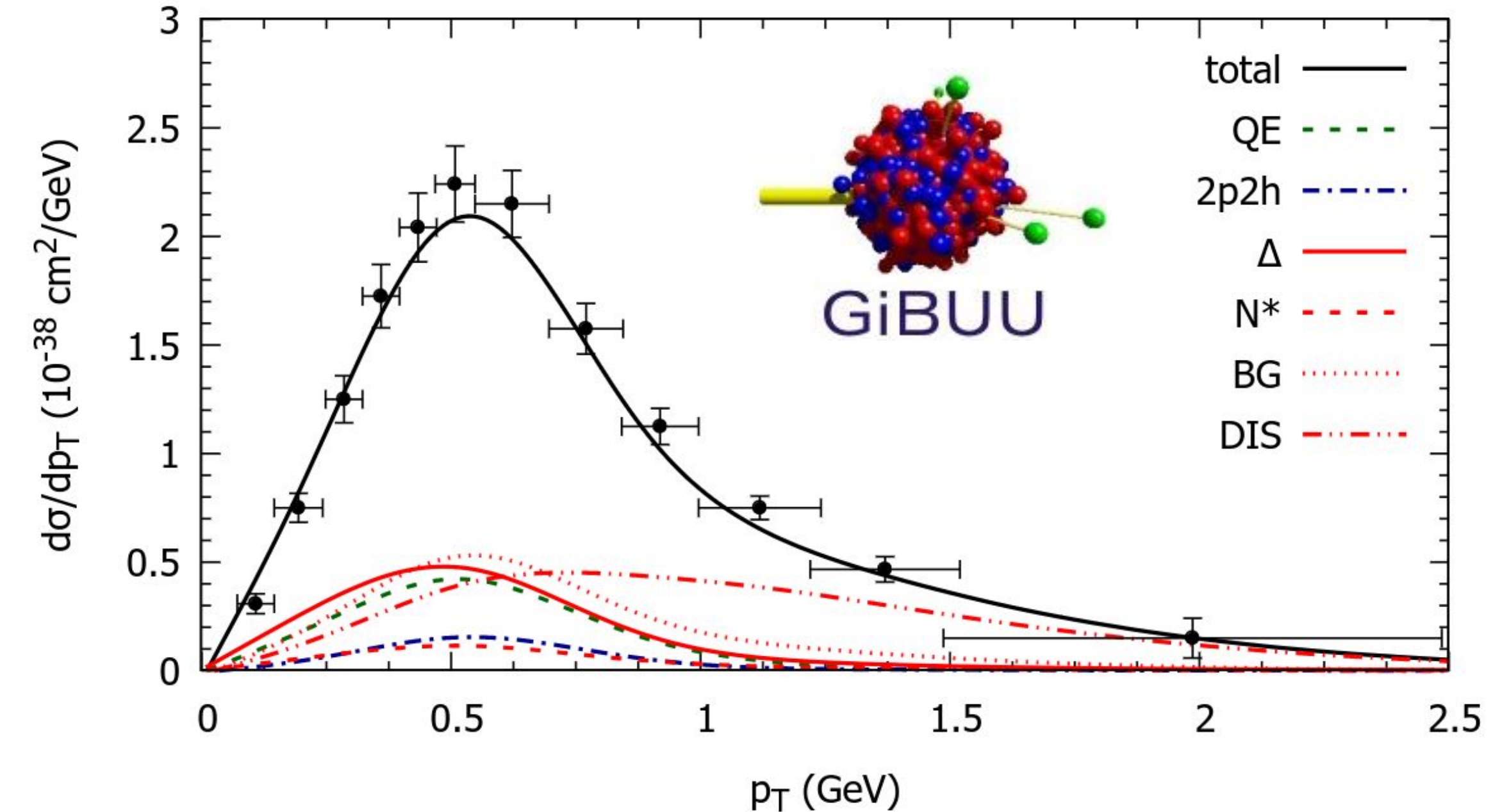
- General nuclear reaction simulation
  - Nuclei and hadron-nucleus (early 90s)
  - $\gamma$ ,  $e$ , and  $\nu$  added later
- Longstanding support for consistent  $e/\nu$  interaction modeling
  - But other generators have been catching up!
- Commonly used as a reference model
  - Not yet a primary generator for experiments
  - Similar situation for NuWro



# Giessen Boltzmann-Uehling-Uhlenbeck Project (GiBUU)

[arXiv:2308.16161](https://arxiv.org/abs/2308.16161)

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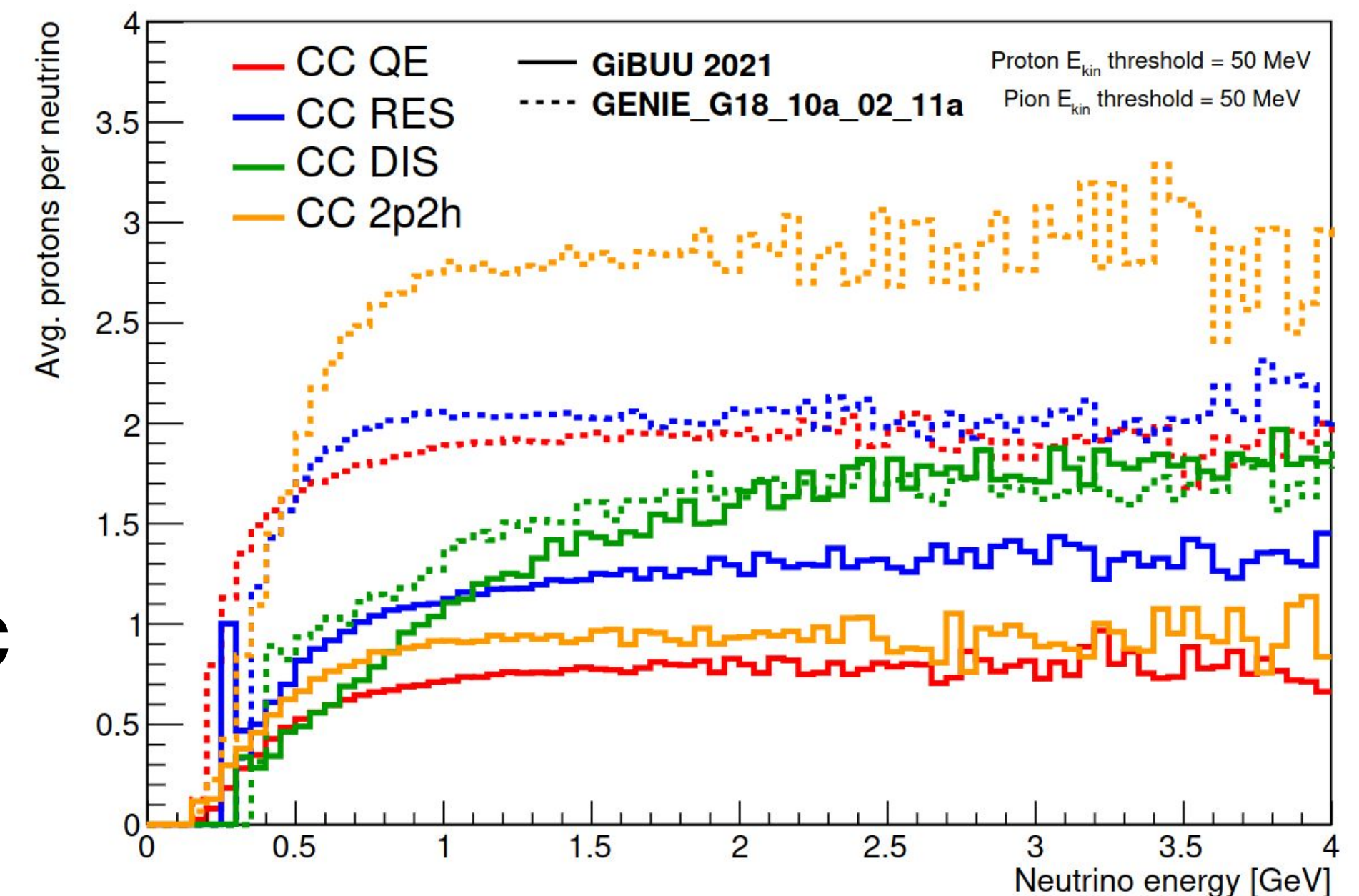
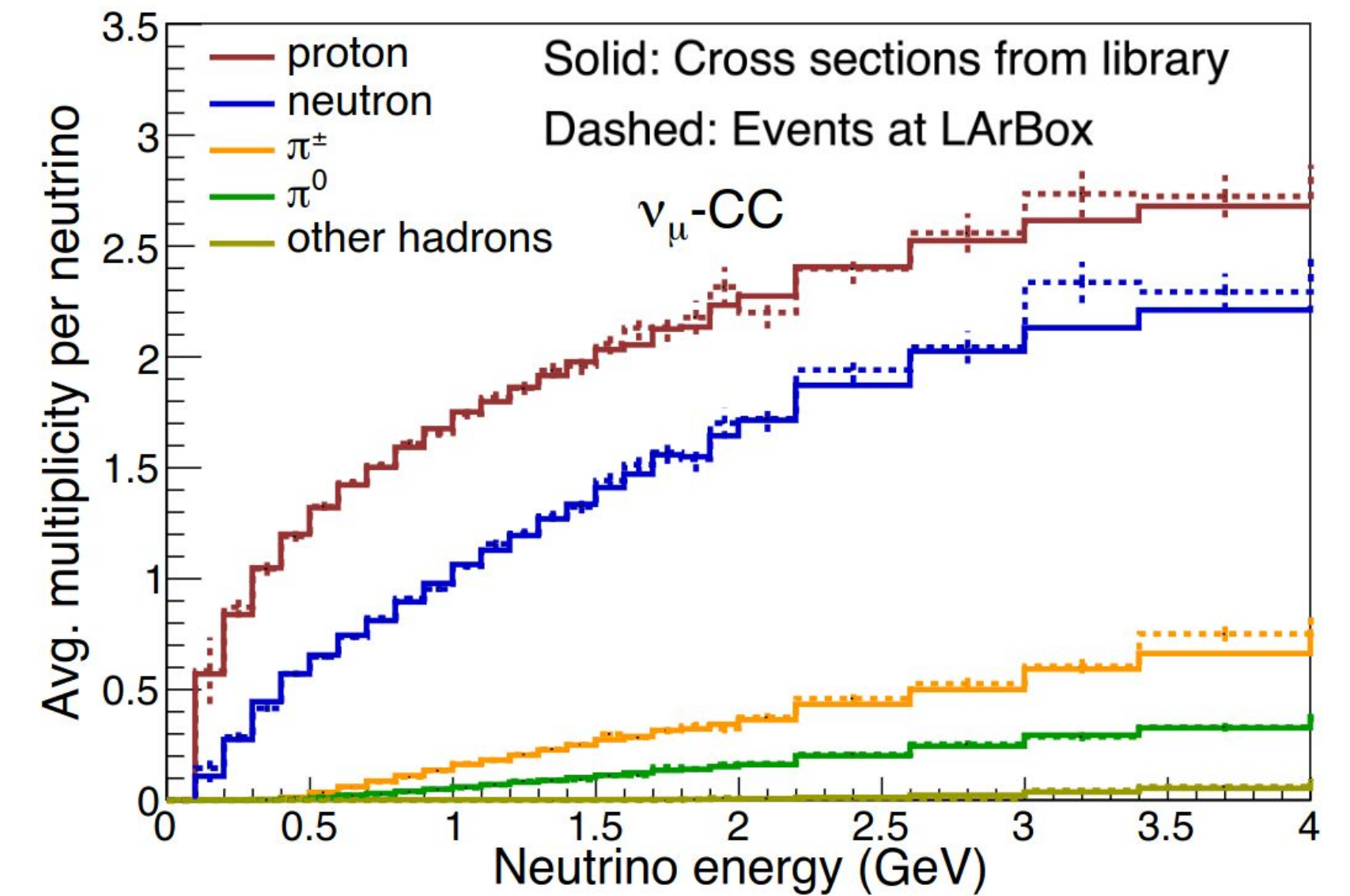


MINERvA inclusive  
charged-current  $\nu_\mu$  data from  
[Phys. Rev. D 101, 112007 \(2020\)](https://doi.org/10.1103/PhysRevD.101.112007)

# GiBUU integration for experimental production

[arXiv:2311.14286](https://arxiv.org/abs/2311.14286)

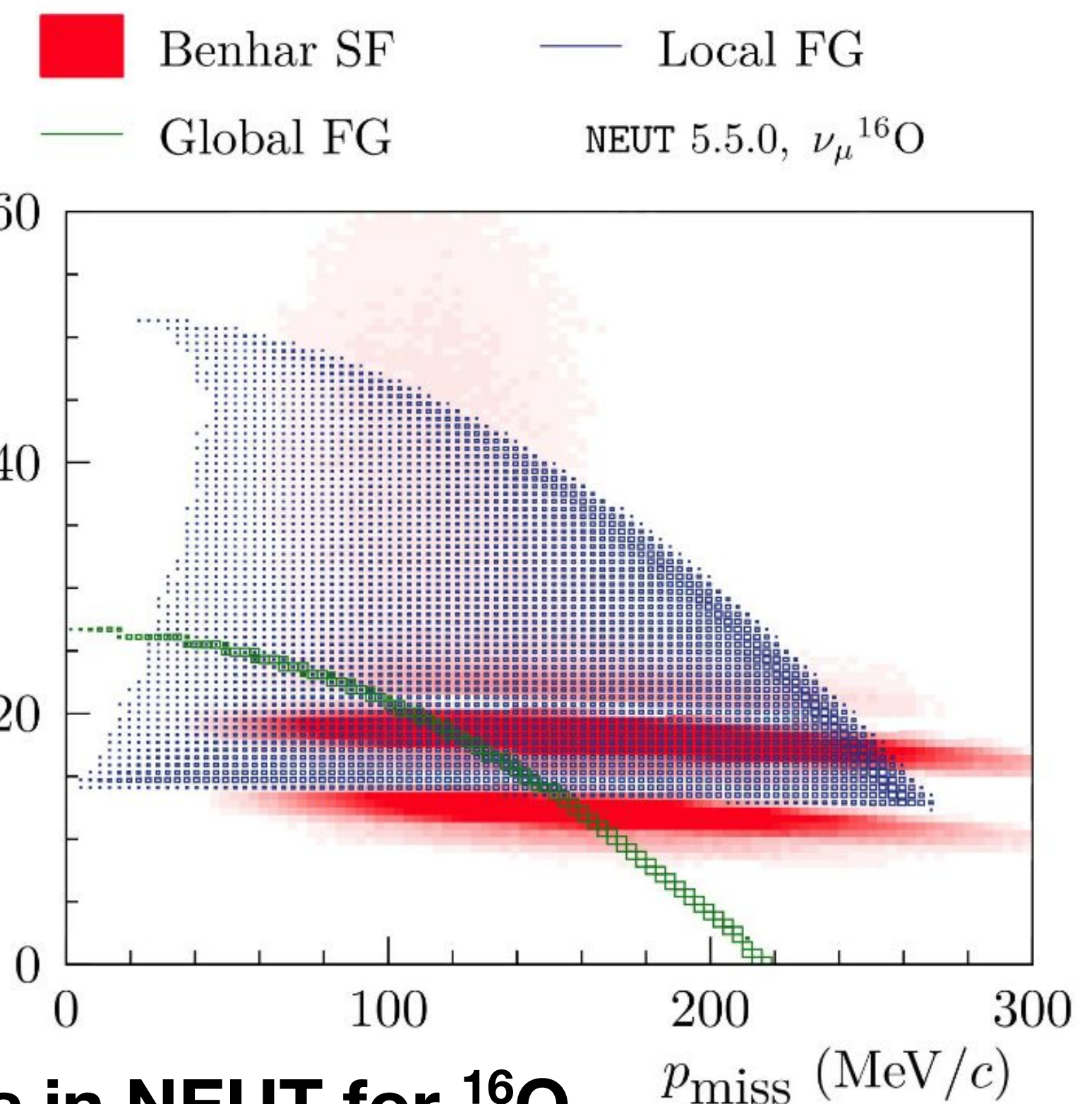
- Ongoing effort by University of Texas at Arlington group
  - First "customer" is SBND
- Pre-generate a large library of GiBUU events
- Inject these into a GENIE-based workflow using the evtLib tool
  - Modifications to evtLib for non-unit weights, GiBUU channel labels, etc.
- Early stages of designing a related systematic uncertainty treatment



# The NEUT event generator

- History stretches back several decades
  - Original application: neutrino backgrounds for nucleon decay in Kamiokande
- Primary generator for T2K & Super-K
  - Plays a similar role for them as GENIE does for Fermilab experiments
- Open-source release planned for upcoming v6
  - Only major generator without an official logo
  - I've opted to use a cartoon of a **newt** (stolen from past talks by other speakers)

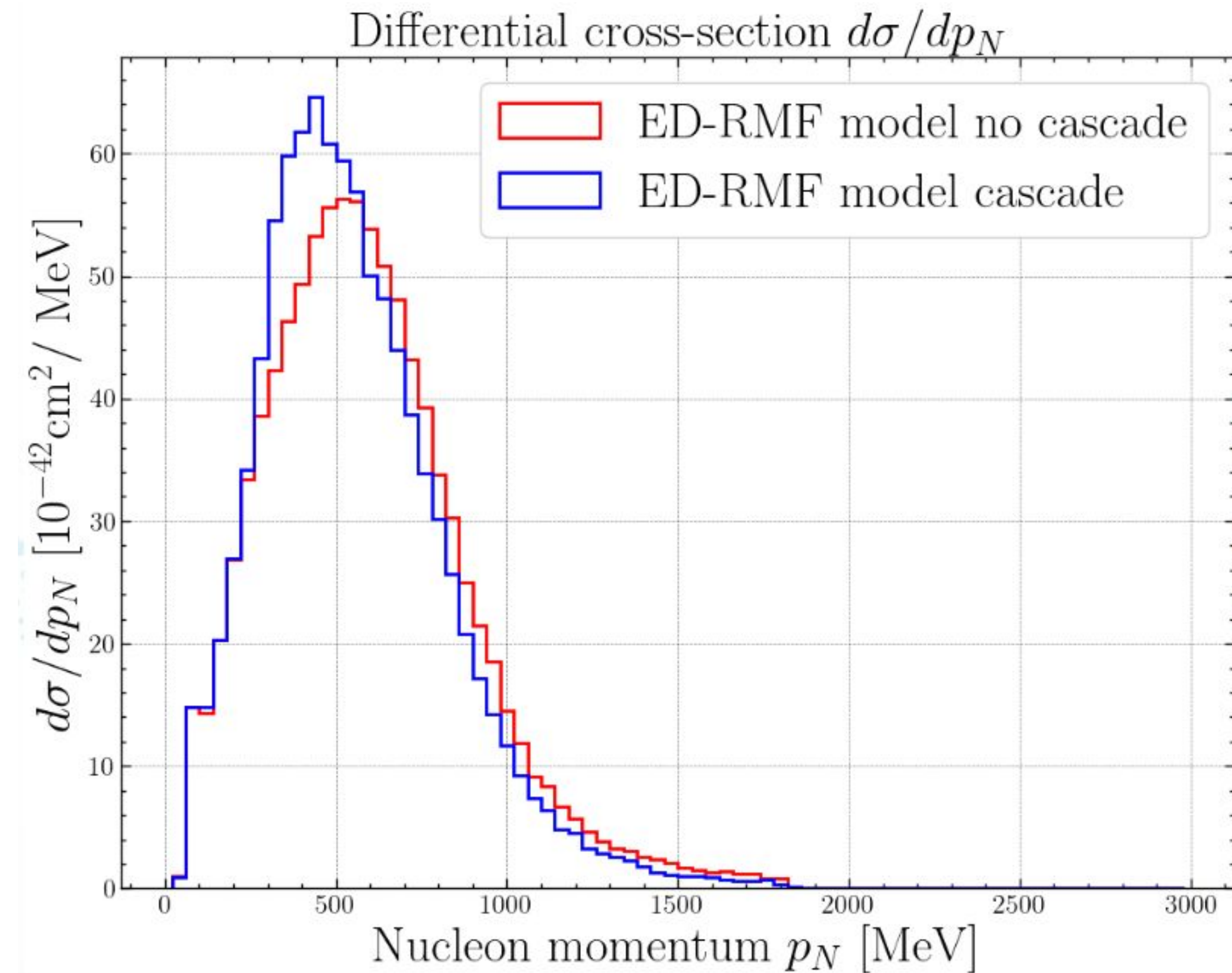
```
1 *****
2 *
3 SUBROUTINE RNAZI(C,S)
4 *
5 *
6 (Purpose)
7 Give cosine and sine of random direction
8 *
9 (Input)
10 NONE
11 *
12 (Output)
13 C : COSINE OF RANDOM DIRECTION
14 S : SINE OF RANDOM DIRECTION
15 *
16 (Creation date and Author)
17 1978.09.08 ; S.Yamada, A.Sato
18 1995.02.02 ; K.KANEYUKI FOR S.K.
19 *
20 RANAZI -> RNAZI
21 *****
```



Nuclear models in NEUT for  $^{16}\text{O}$

# RMF nuclear model in NEUT

- Cooperation between experimentalists & theorists in NEUT development
  - This is one of multiple recent success stories
- Work is ongoing to incorporate a Relativistic Mean Field nuclear model
  - See [recent talk](#) by Jake McKean on progress
- Basic validation done, work ongoing to address double-counting of elastic FSI



CCQE differential cross section  
**with** and **without** FSI cascade

# Towards standardized neutrino community tools

- NEUT developers have played an important role in this area
- No universal way of interfacing generators with beam/detector simulations, no official common format
  - **Technical barrier** for experiments to have the best variety of models
  - LHC solved this problem and continues to reap the benefits
- Proposed **"NuHepMC" standard** co-developed by NEUT developer Luke Pickering

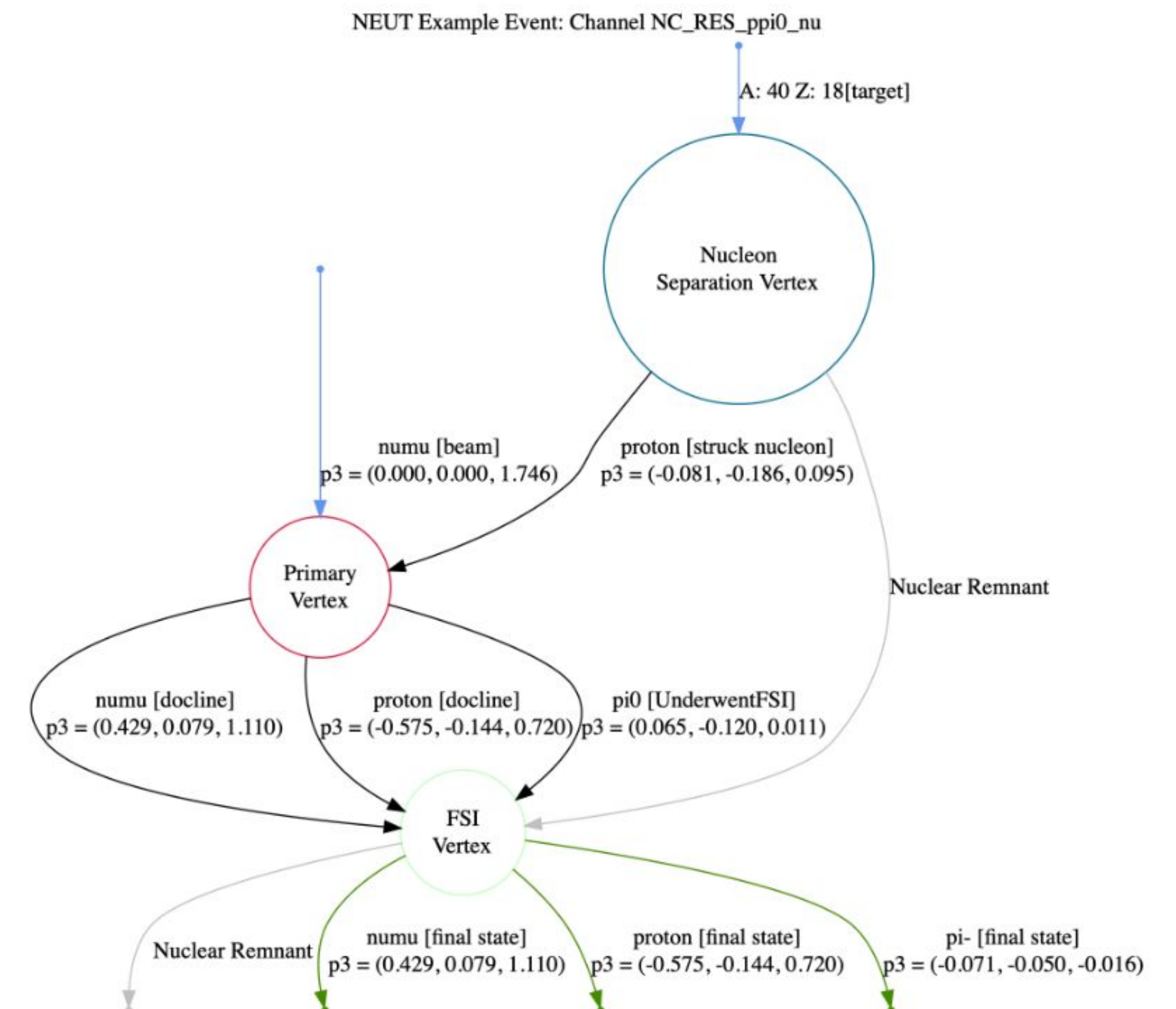
[arXiv:2310.13211](https://arxiv.org/abs/2310.13211)

NuHepMC: A standardized event record format for neutrino event generators

S. Gardiner<sup>a</sup>, J. Isaacson<sup>a</sup>, L. Pickering<sup>b</sup>

<sup>a</sup>Fermi National Accelerator Laboratory, P.O. Box 500, Batavia, IL 60510, USA

<sup>b</sup>STFC, Rutherford Appleton Laboratory, Harwell Oxford, United Kingdom



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[arXiv:2310.13211](https://arxiv.org/abs/2310.13211)

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<sup>b</sup>STFC, Rutherford Appleton Laboratory, Harwell Oxford, United Kingdom

[NuSTEC seminar by Luke](#)

## A Common Neutrino Event Format: NuHepMC

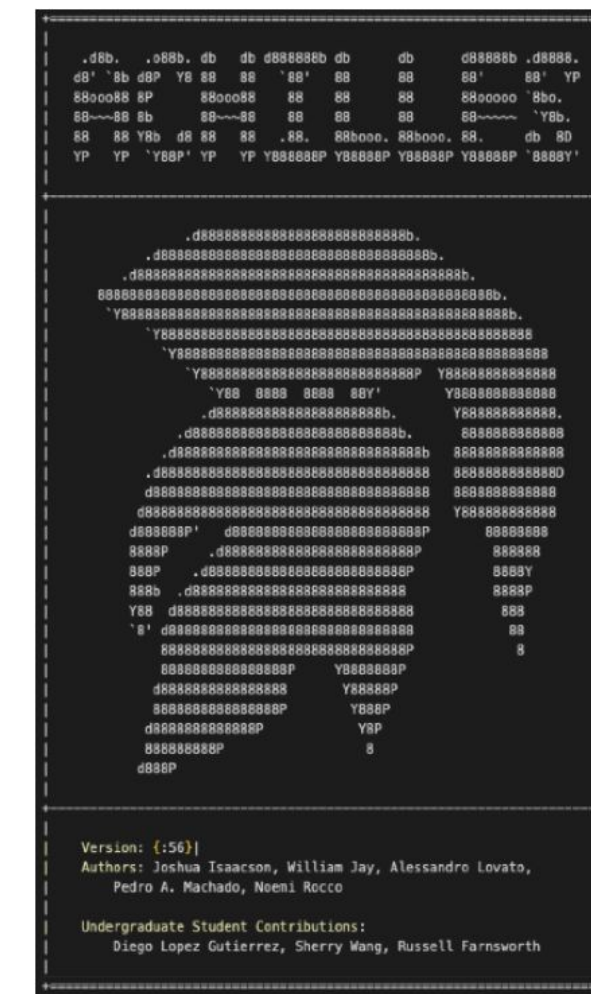
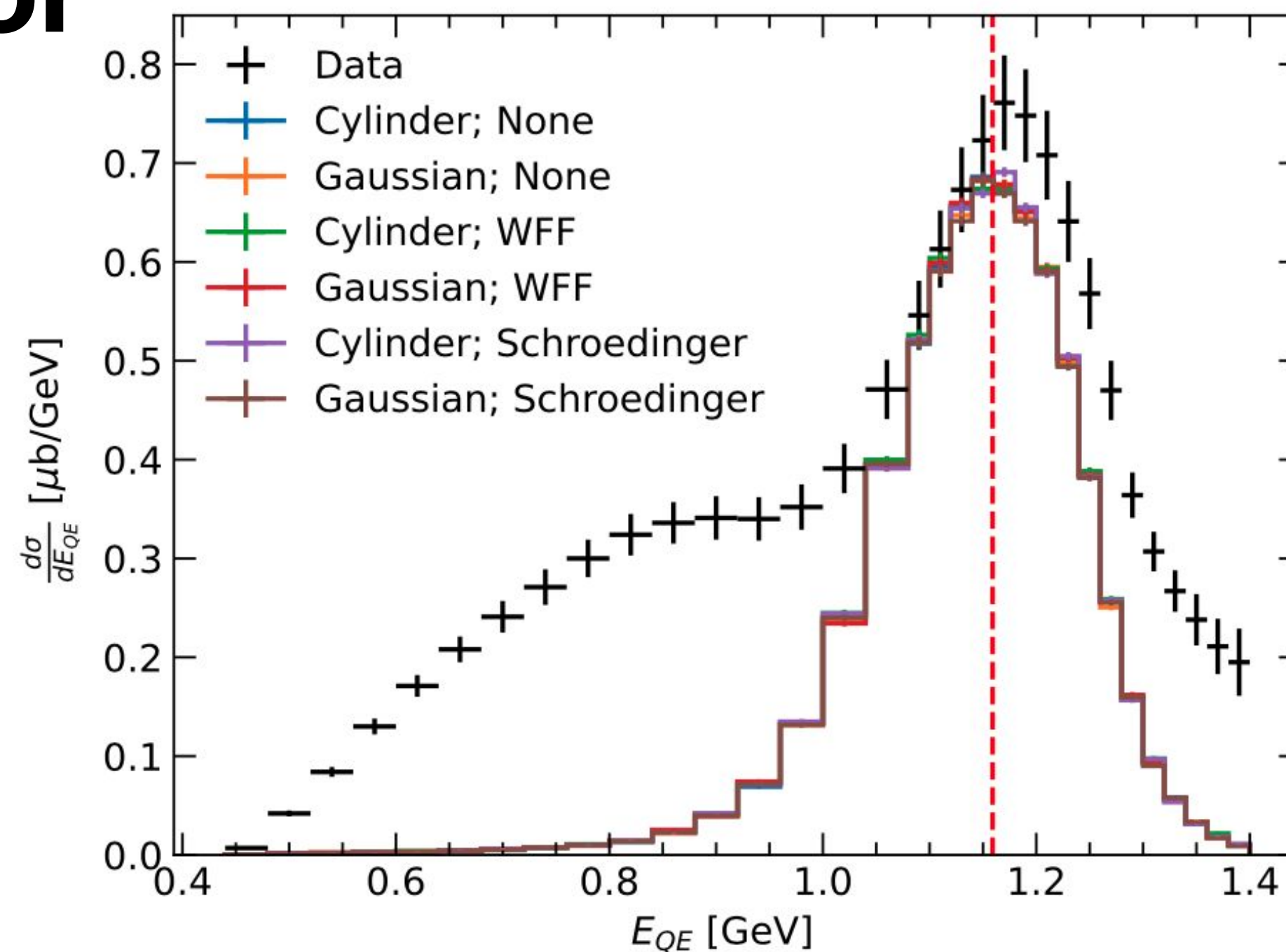
Luke Pickering, S. Gardiner, J. Isaacson  
2024/01/18  
NuSTEC CEWG



# The ACHILLES event generator

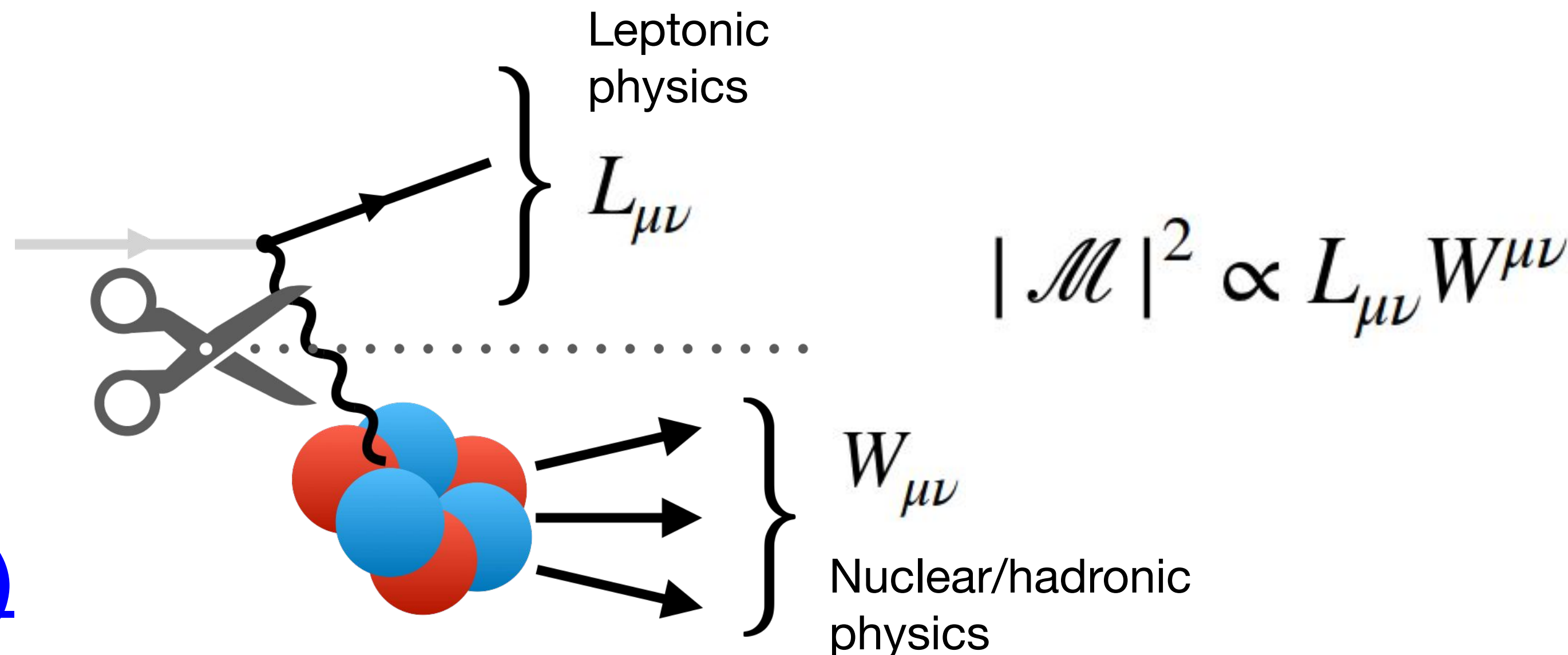
## A CHicagoLand Lepton Event Simulator

- New theory-driven event generator, Fermilab-led
  - Quasielastic-only so far, but development continues

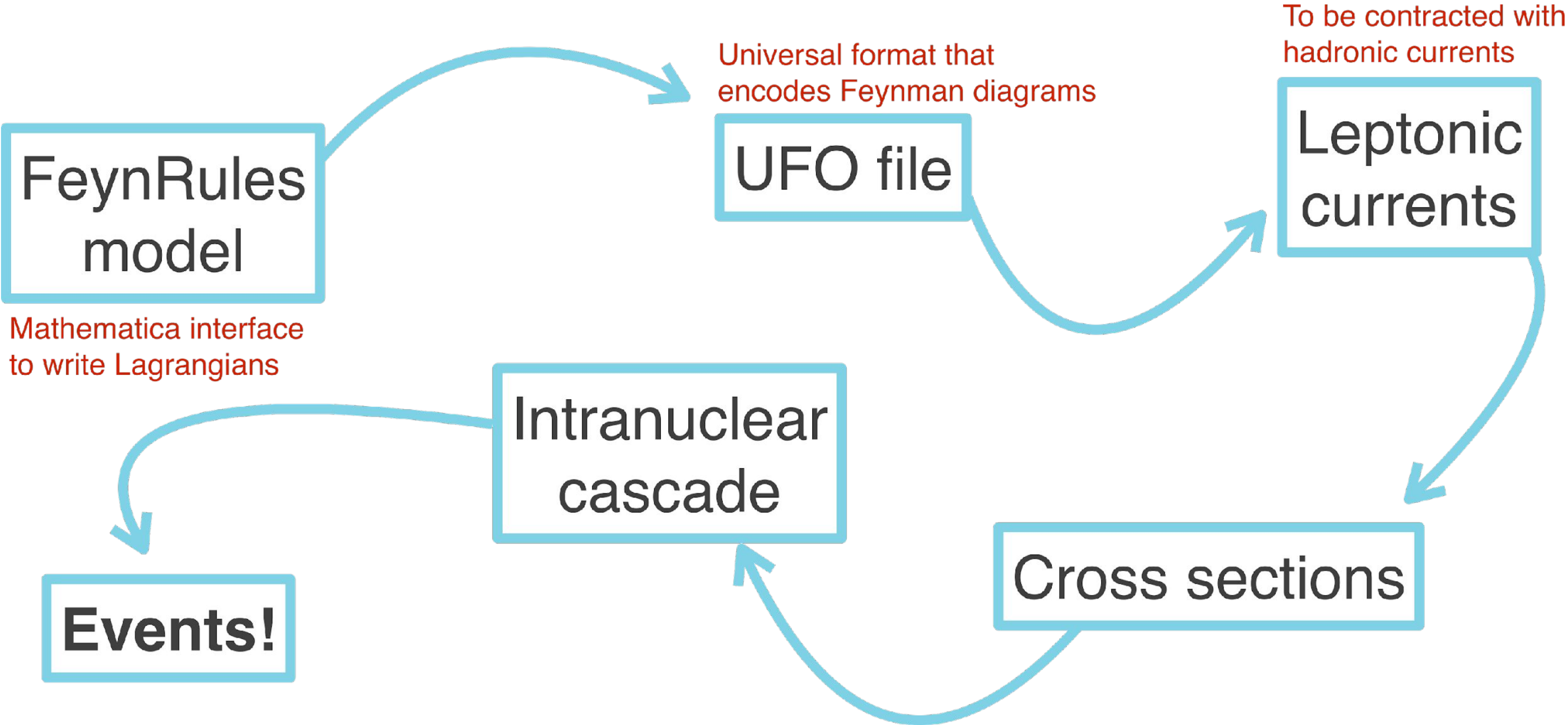


- Innovations

- New approach to FSI: [Phys. Rev. C 103, 015502 \(2021\)](#)
- Automated leptonic tensor: [Phys. Rev. D 105, 096006 \(2022\)](#)



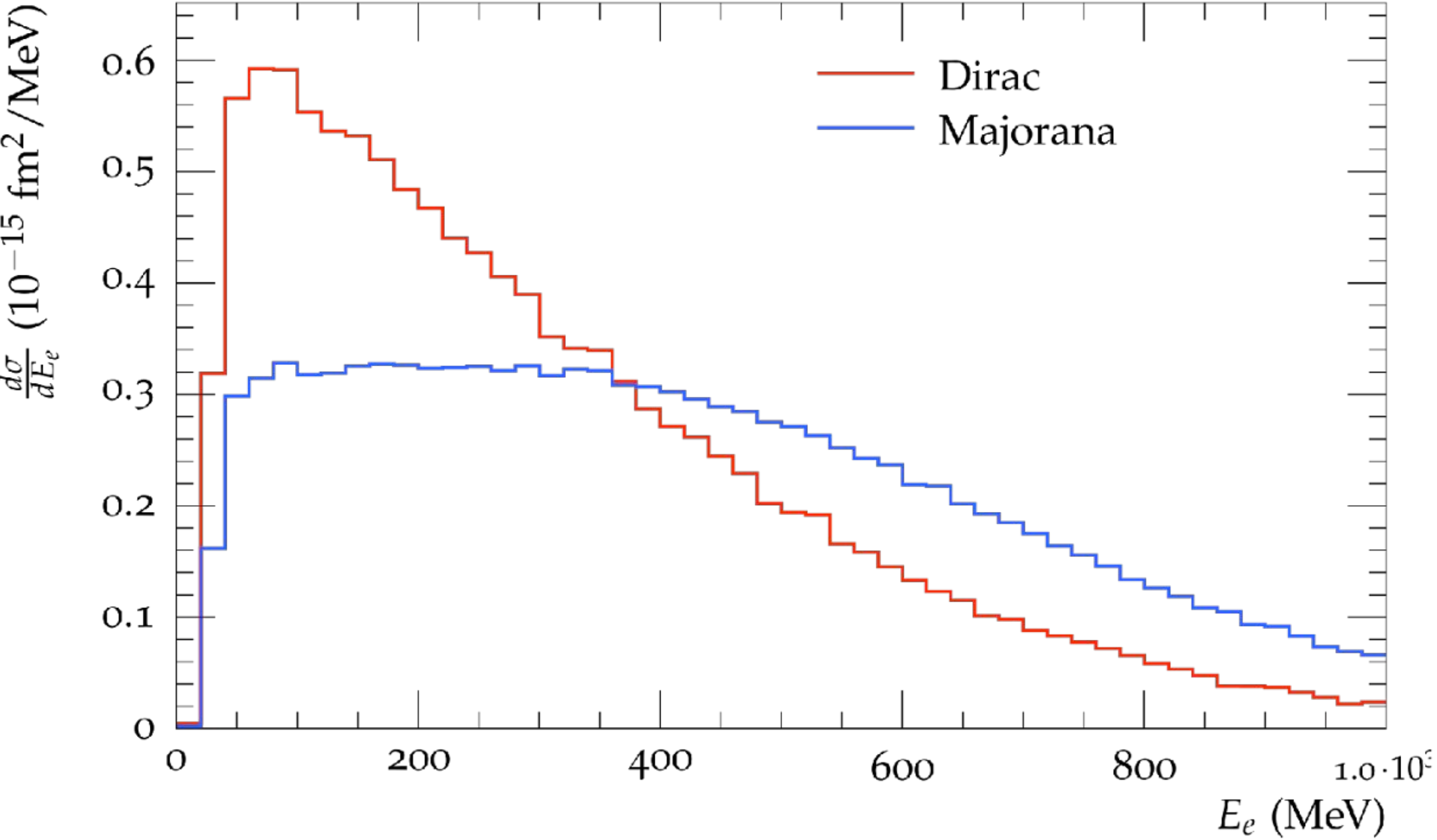
# ACHILLES approach to automating the leptonic tensor



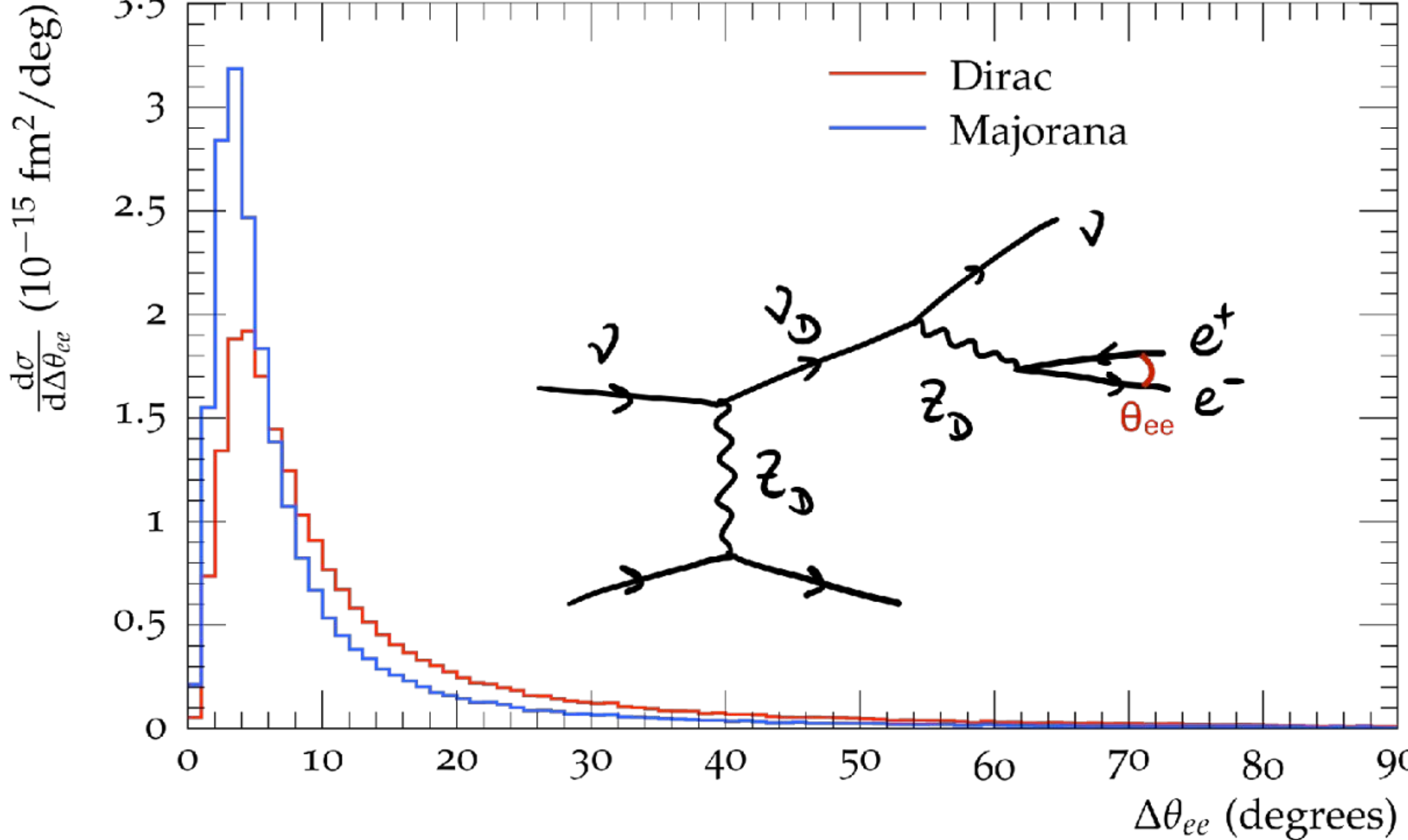
# Example application to exotic physics

Full calculation of scattering amplitude can account for relevant effects, such as spin-correlations, which may end up having an O(1) effect on final state kinematics

Energy of leading lepton (PRELIMINARY)

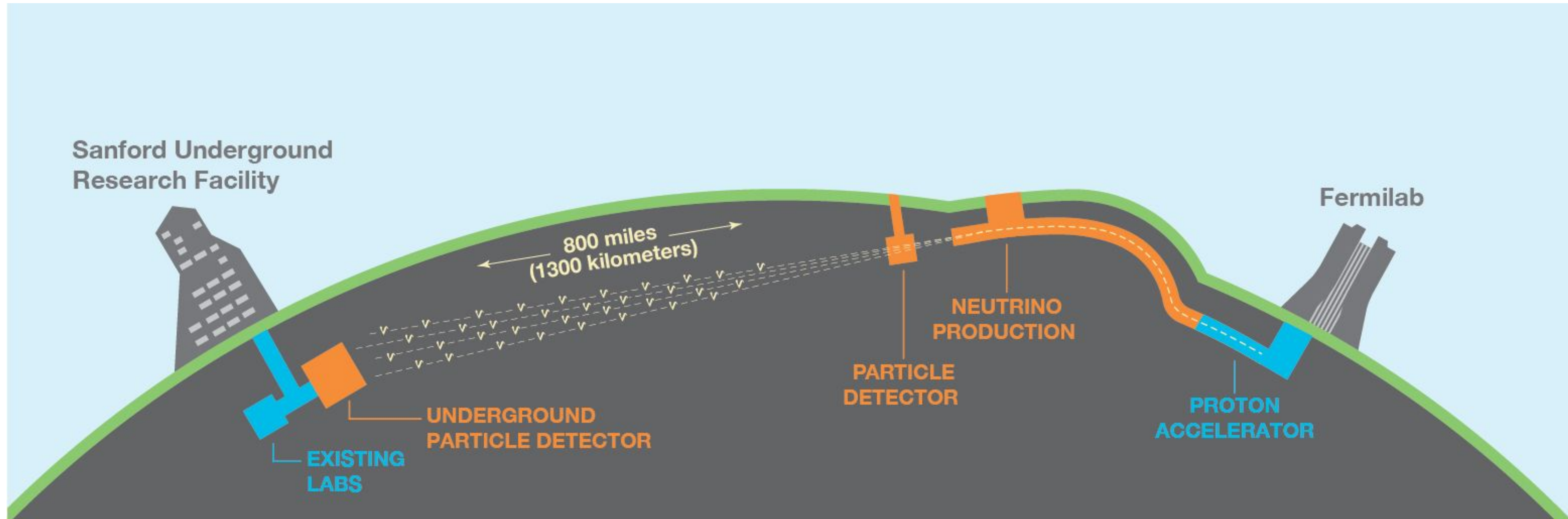


Opening angle between leptons (PRELIMINARY)



Dark neutrino observables folded against MiniBooNE  $\nu_\mu$  flux

# The Deep Underground Neutrino Experiment (DUNE)

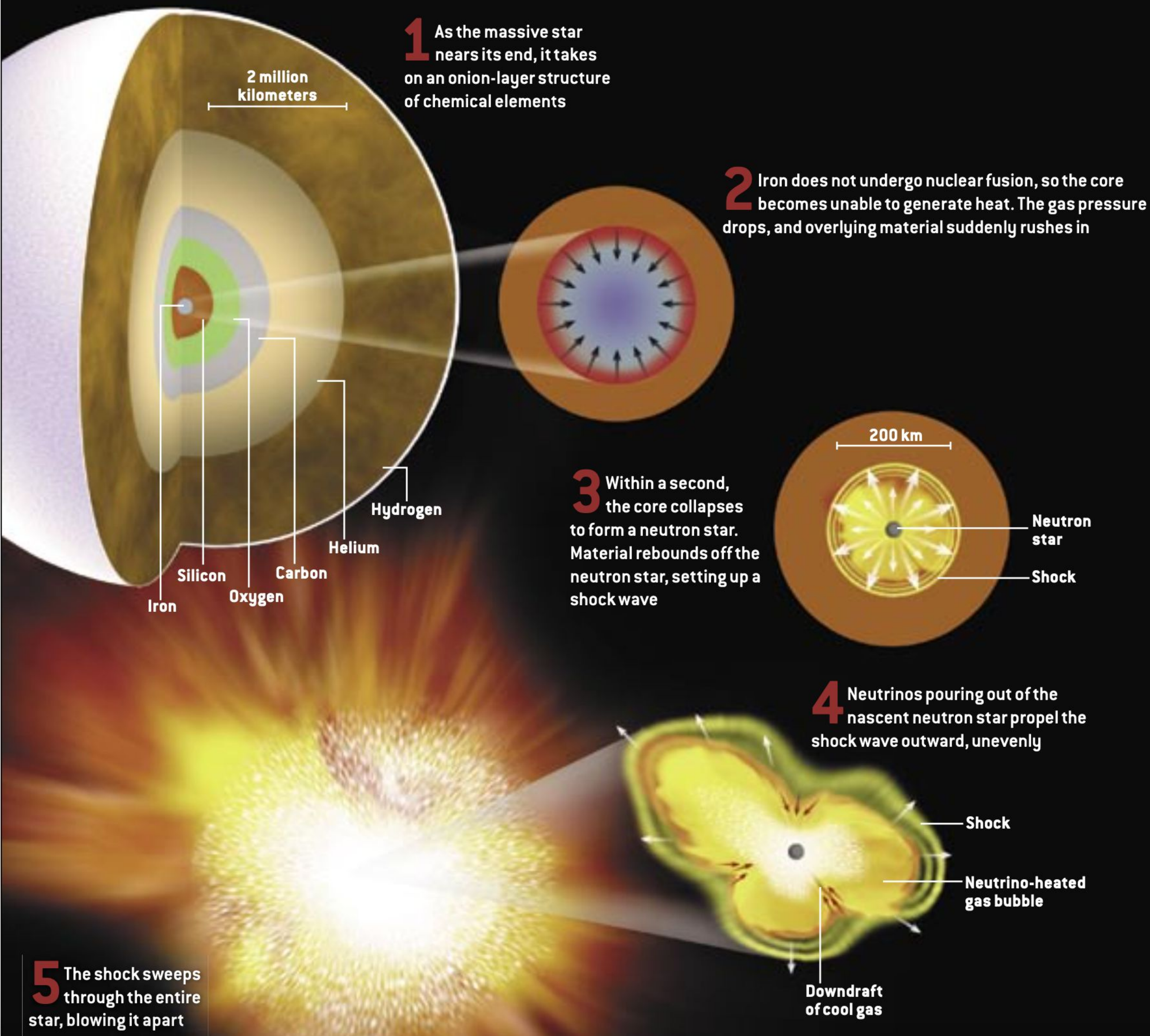


- World's most powerful neutrino beam (1.2 MW+) and two groups of detectors
  - **Far detector:** Initially  $2 \times 10$  kton (active volume) liquid argon detectors
  - **Near detector:** Multi-component (including liquid and gaseous argon)
- Data taking to begin circa 2029

# Core-collapse supernovae: nearly-perfect neutrino bombs

## CORE-COLLAPSE SUPERNOVA

The other class of supernova involves the implosion of a star at least eight times as massive as the sun. This class is designated type Ib, Ic or II, depending on its observed characteristics.



- Deaths of stars  $> 10 M_{\odot}$
- 99% of gravitational binding energy converted to  $\sim 10^{58}$  neutrinos
- Many  $\nu_e$  produced in initial neutronization burst ( $\sim 10$  ms)
- Core cools via all-flavor neutrino radiation in  $\sim 10$  s
- Momentarily outshines visible universe (in neutrinos)

# MARLEY: Model of Argon Reaction Low Energy Yields

- Event generator focused specifically on neutrino energies below  $\sim 100$  MeV
- Emphasizes  $\nu_e$  CC on  $^{40}\text{Ar}$ , extensible to other channels
- Two dedicated publications so far:
  - Physics models: [Phys. Rev. C 103, 044604 \(2021\)](#)
  - Numerical implementation: [Comput. Phys. Commun. 269, 108123 \(2021\)](#)
- Written in C++14, few dependencies

Nuclear de-excitations in low-energy charged-current  $\nu_e$  scattering on  $^{40}\text{Ar}$

Steven Gardiner<sup>1,2,\*</sup>

<sup>1</sup>Fermi National Accelerator Laboratory, P.O. Box 500, Batavia, Illinois 60510 USA

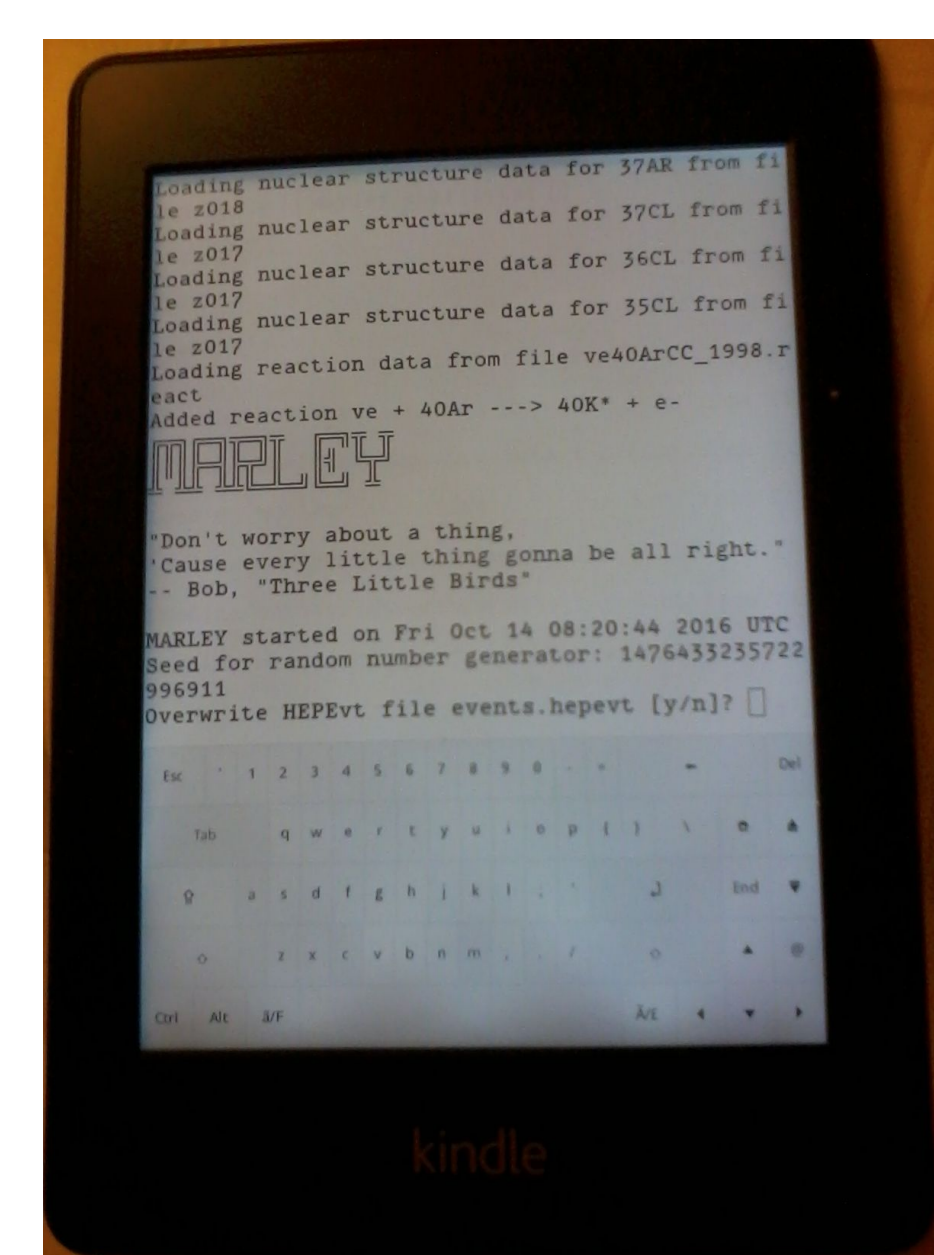
<sup>2</sup>Department of Physics, University of California, Davis,  
One Shields Avenue, Davis, California 95616 USA

(Dated: September 15, 2020)

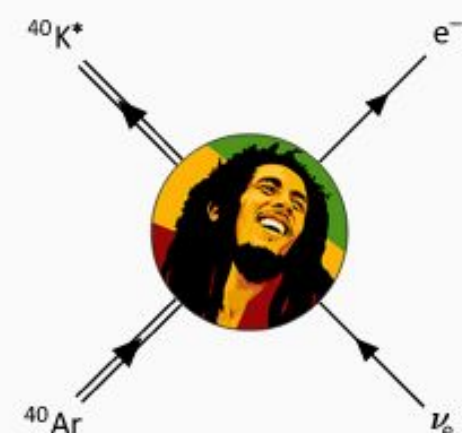
**Background:** Large argon-based neutrino detectors, such as those planned for the Deep Underground Neutrino Experiment (DUNE), have the potential to provide unique sensitivity to low-energy ( $\sim 10$  MeV) electron neutrinos produced by core-collapse supernovae. Despite their importance for neutrino energy reconstruction, nuclear de-excitations following charged-current  $\nu_e$  absorption on  $^{40}\text{Ar}$  have never been studied in detail at supernova energies.

**Purpose:** I develop a model of nuclear de-excitations that occur following the  $^{40}\text{Ar}(\nu_e, e^-)^{40}\text{K}^*$  reaction. This model is applied to the calculation of exclusive cross sections.

**Methods:** A simple expression for the inclusive differential cross section is derived under the allowed approximation. Nuclear de-excitations are described using a combination of measured  $\gamma$ -ray decay schemes and the Hauser-Feshbach statistical model. All calculations are carried out using a novel Monte Carlo event generator called MARLEY (Model of Argon Reaction Low Energy Yields).



**MARLEY User Guide**



**Model of Argon Reaction Low Energy Yields**

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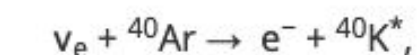
- Copyright and License
- Citing MARLEY
- Getting started
- Interpreting the output
- Bibliography
- GitHub repository
- Developer documentation
- News

[Docs](#) / [Overview](#)

## Overview

**MARLEY** (Model of Argon Reaction Low Energy Yields) is a Monte Carlo event generator for neutrino-nucleus interactions at energies of tens-of-MeV and below. The current version computes inclusive neutrino-nucleus cross sections employing the *allowed approximation*: the nuclear matrix elements are evaluated while neglecting Fermi motion and applying the long-wavelength (zero momentum transfer) limit. De-excitations of the final-state nucleus emerging from the primary interaction are simulated using a combination of tabulated  $\gamma$ -ray decay schemes and an original implementation of the Hauser-Feshbach statistical model.

Input files are provided with the code that are suitable for simulating the charged-current process



coherent elastic neutrino-nucleus scattering (CEvNS) on spin-zero target nuclei, and neutrino-electron elastic scattering on any atomic target. Inclusion of additional reactions and targets is planned for the future.

The material presented here focuses on the practical aspects of MARLEY: installing the code, configuring and running simulations, and analyzing the output events. For more details on the MARLEY physics models, please see the references in the online [bibliography](#).

MARLEY follows an open-source development model and welcomes contributions of new input files and code improvements from the community. A partial list of potential projects for future MARLEY development is available on the developer documentation [webpage](#).

<https://www.marleygen.org>

# MARLEY: Model of Argon Reaction Low Energy Yields

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Garage near Escadaria Selarón, Rio de Janeiro

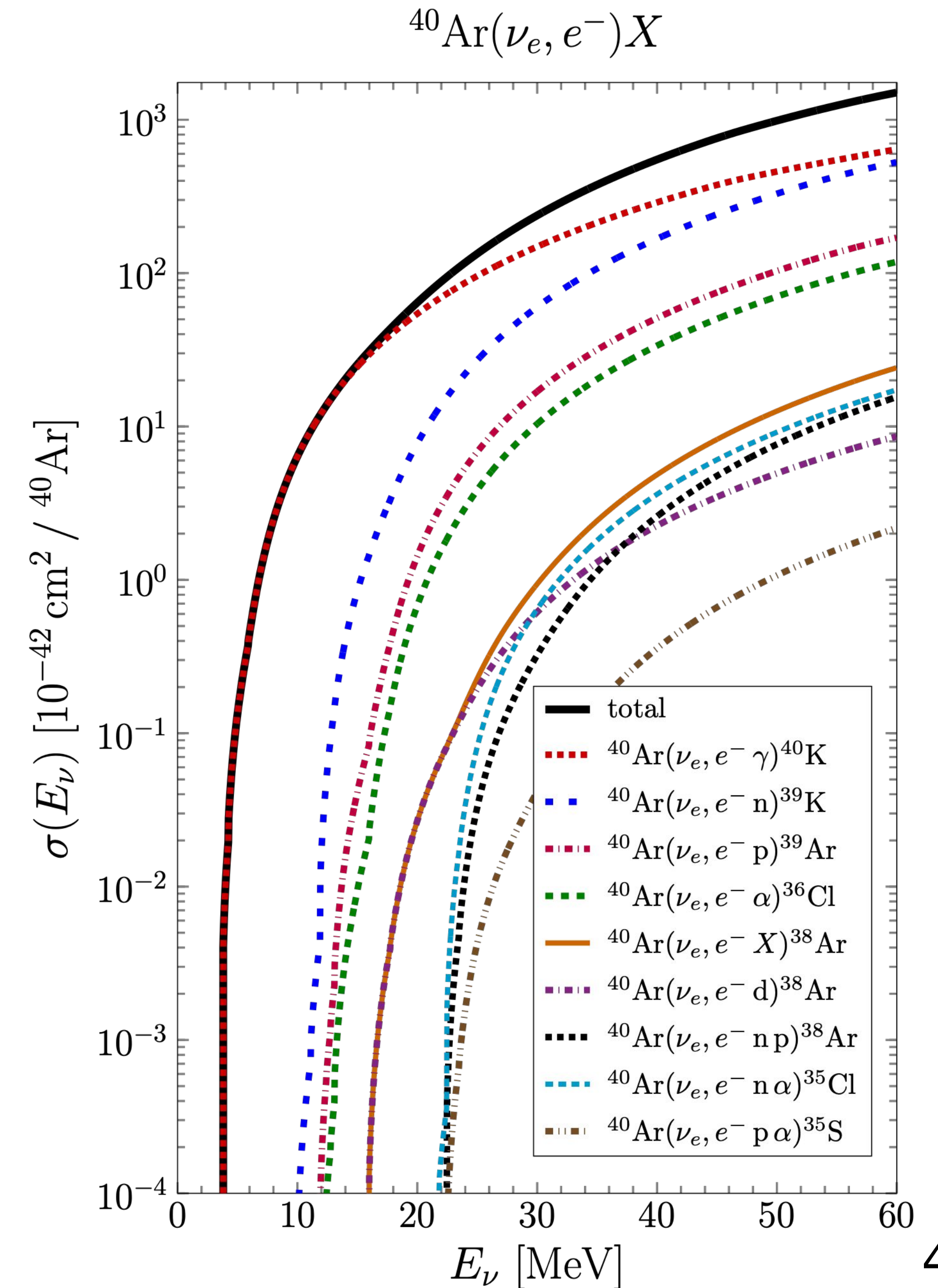
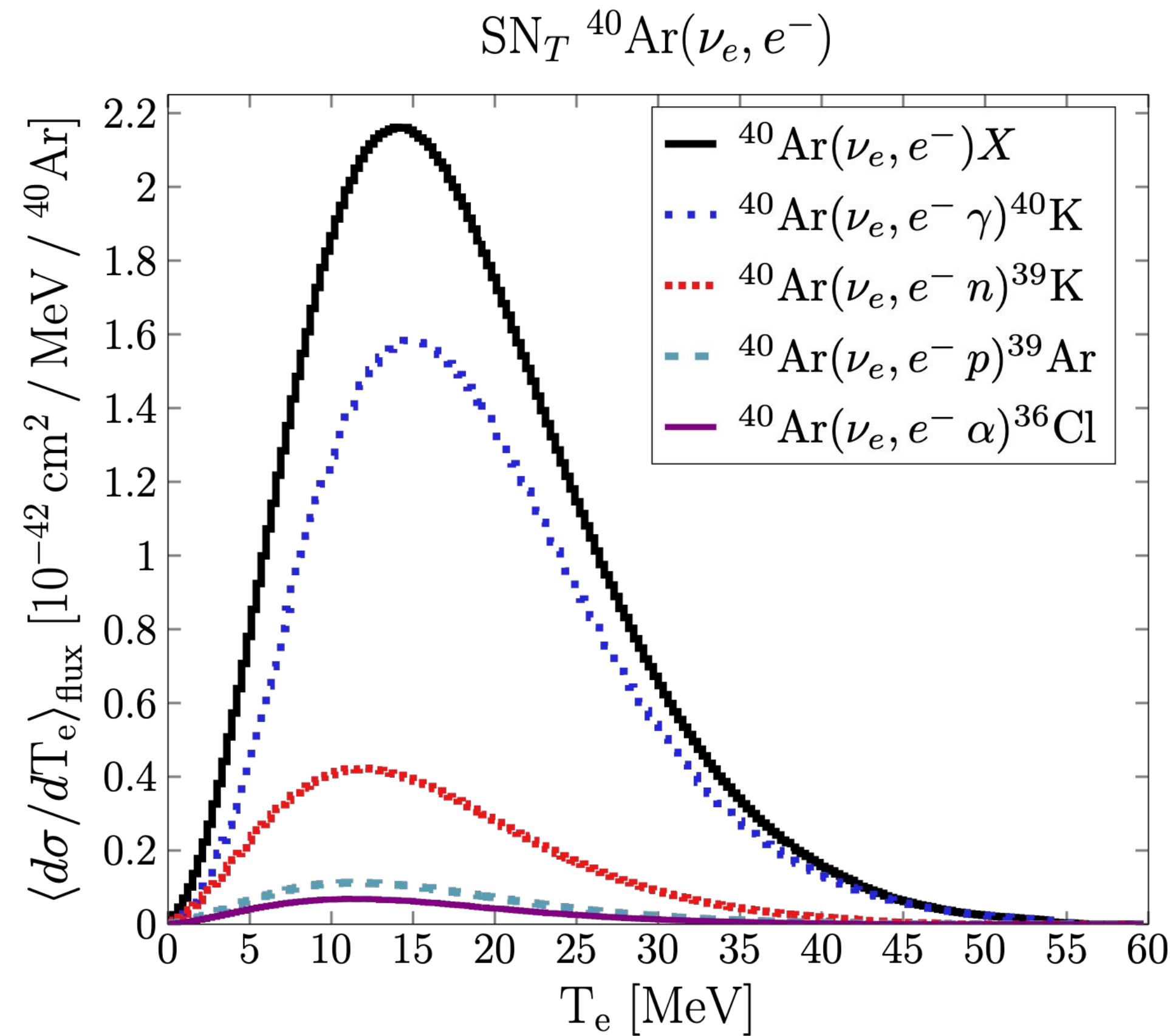


# MARLEY v1.2.0 predictions for $^{40}\text{Ar}$

[Phys. Rev. C 103, 044604 \(2021\)](#)

- First calculation of cross sections for **exclusive final states** of the CC  $\nu_e$  reaction at O(10 MeV)

- Flux-averaged differential cross sections shown here are for the supernova model described in [Phys. Rev. D 97, 023019 \(2018\)](#).

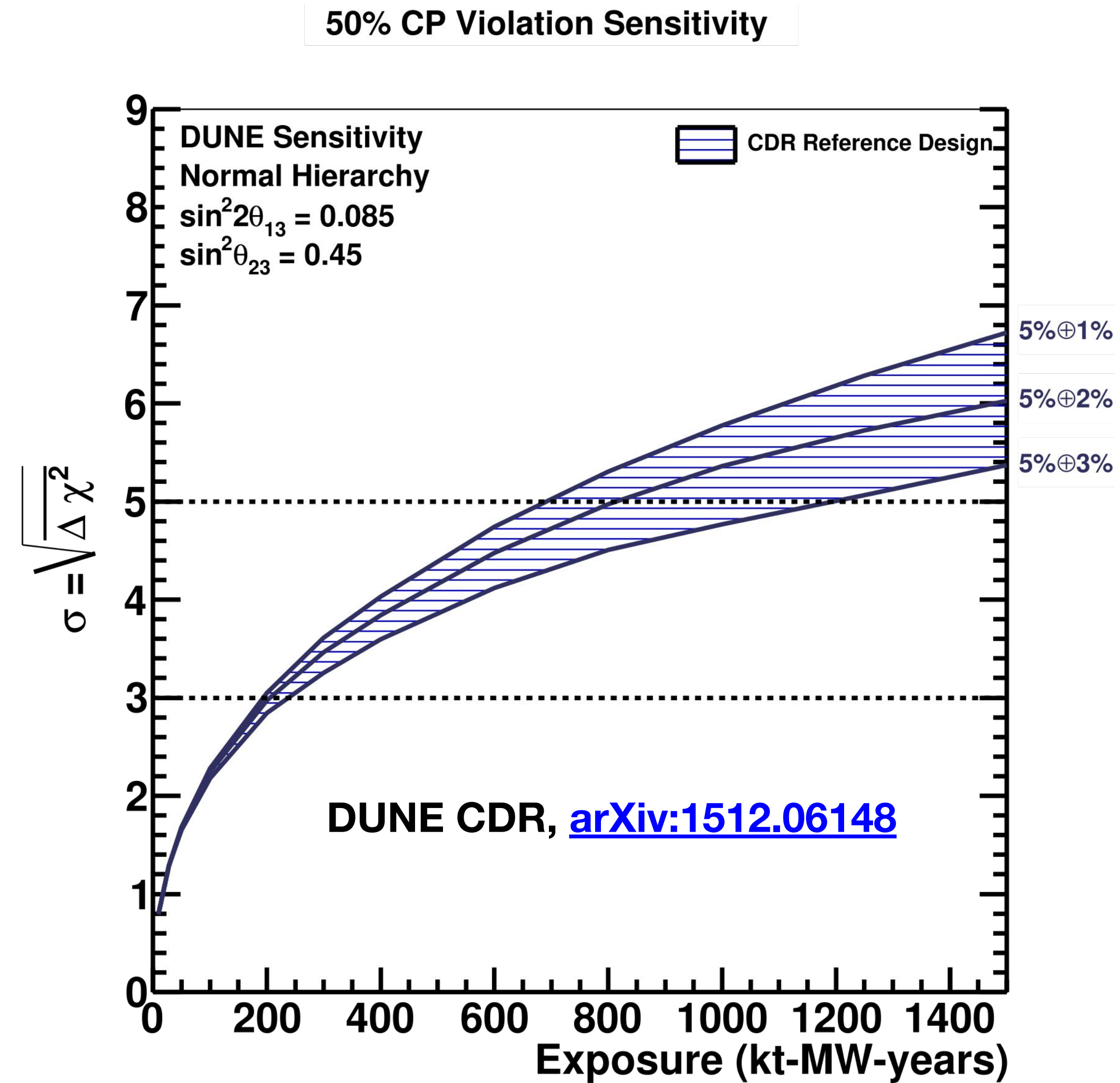
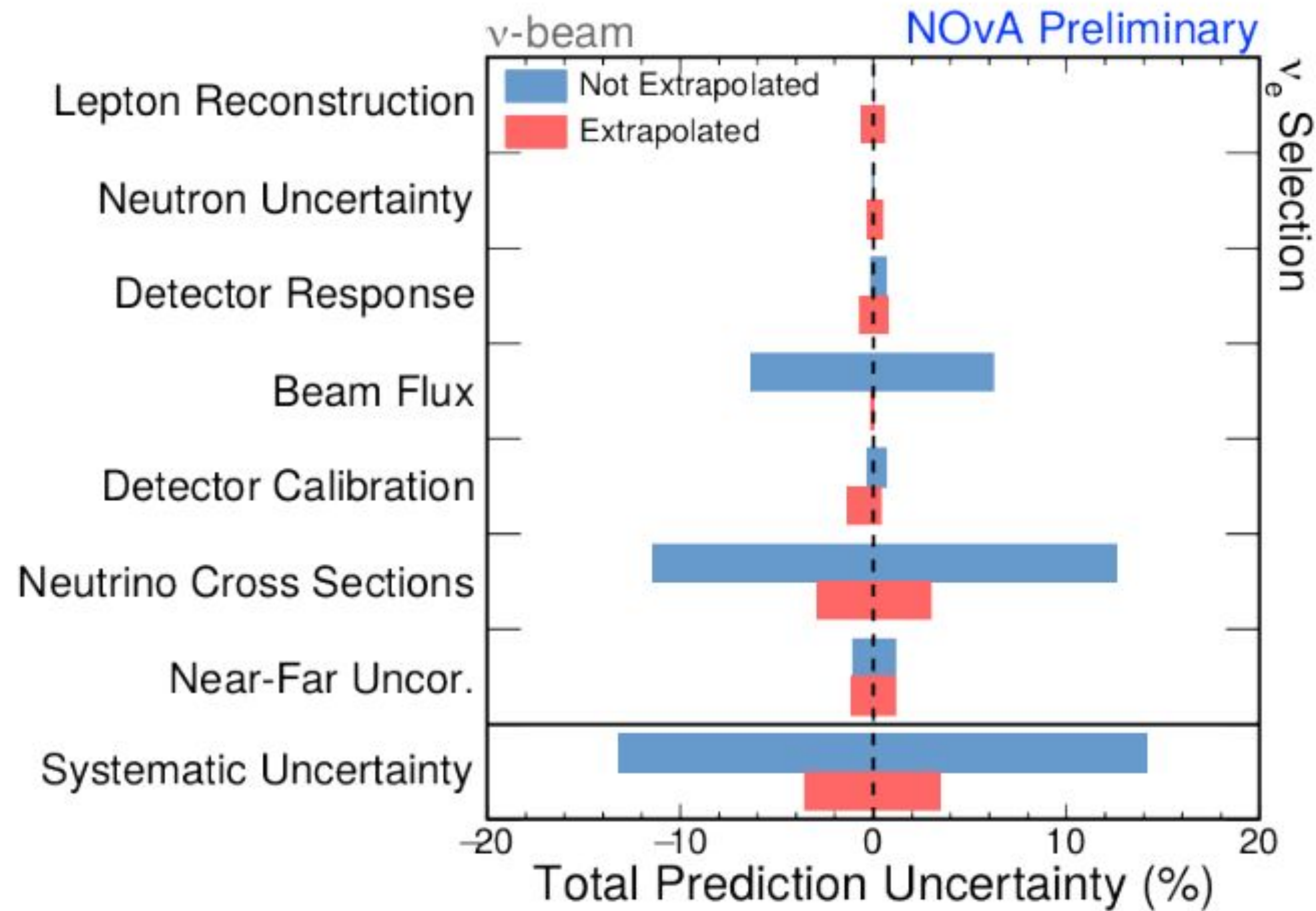




# **Part III: Uncertainties & Interaction Data**

# Need for high-precision simulations

M. Elkins & T. Nosek (for NOvA), [Neutrino 2020 poster](#)

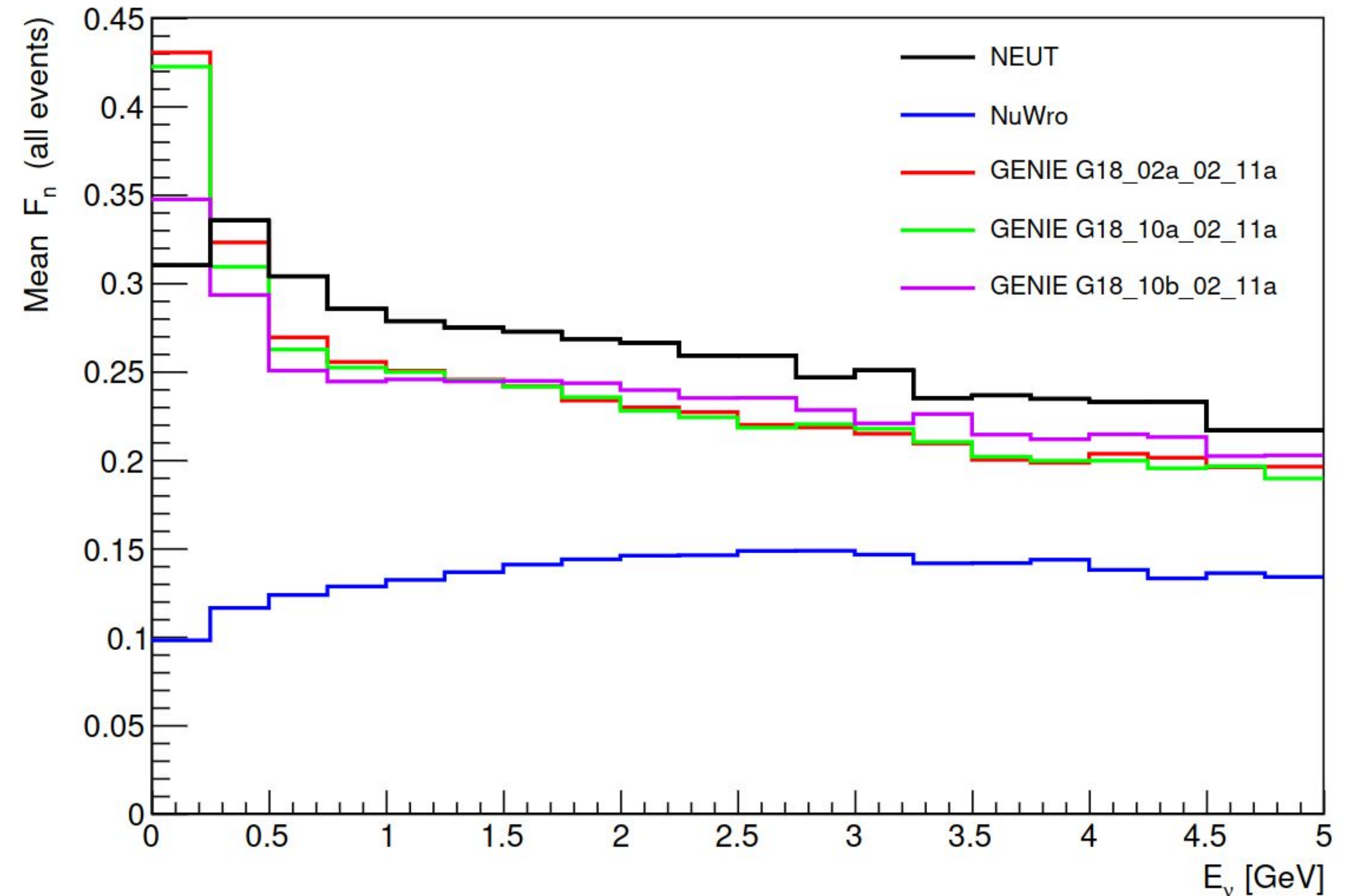


Typically among the leading uncertainties, and percent-level improvements matter!

# Where do the modeling uncertainties come from?

- Many sources, some are easier to quantify than others
- Model ingredients with a standard parameterization
  - "Easy" (nucleon form factors)
- **Competing models, no preference from data**
  - Harder (take the spread between them?)
- Approximations whose impact is hard to quantify
  - Very hard (how wrong is using a cascade for FSI?)
- Observed data/simulation differences
  - Tricky (which part of the model?)

[Phys. Rev. D 105, 092004 \(2022\)](#)

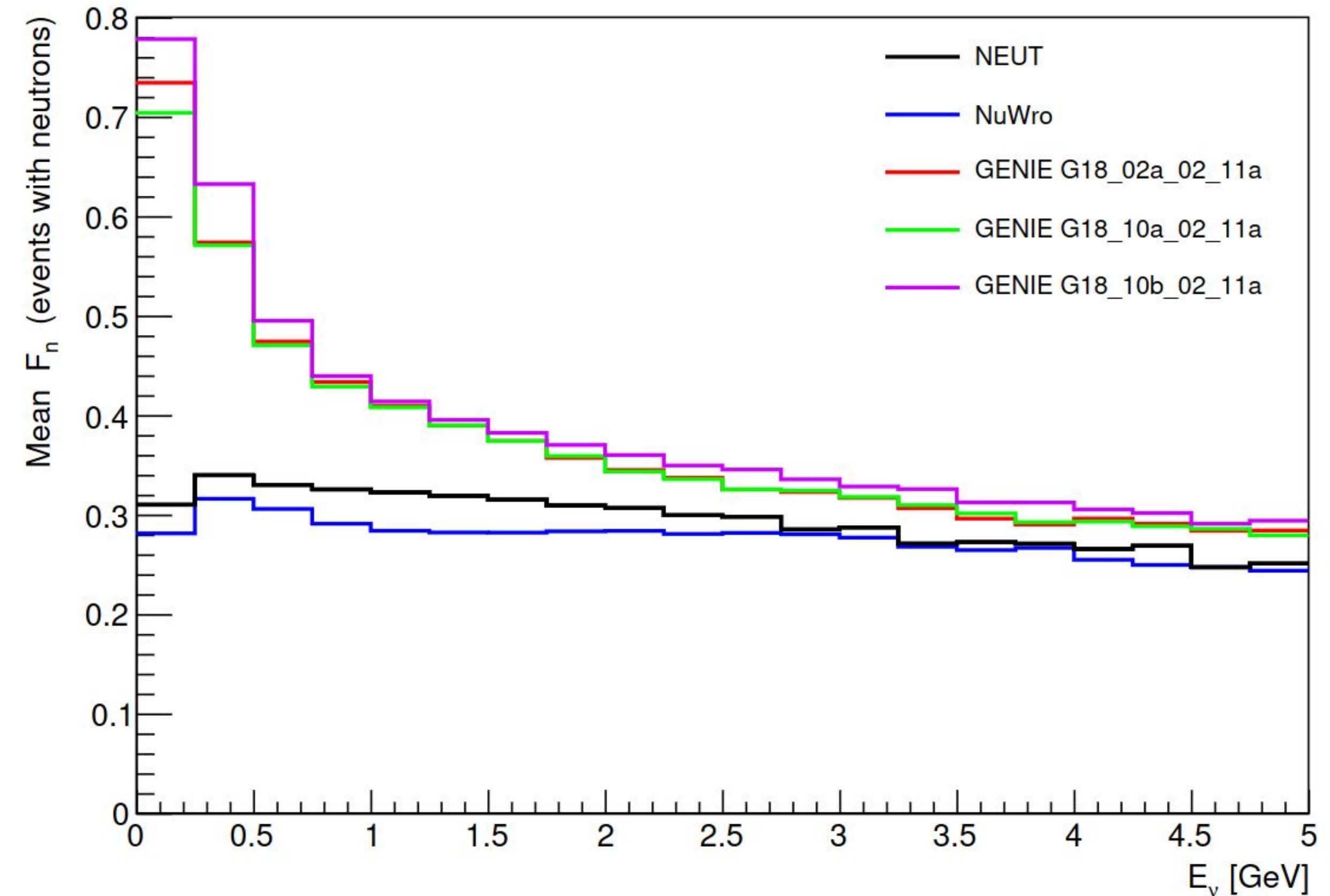


Mean fraction of energy transfer imparted to neutrons (all CC  $\nu_\mu$  events)

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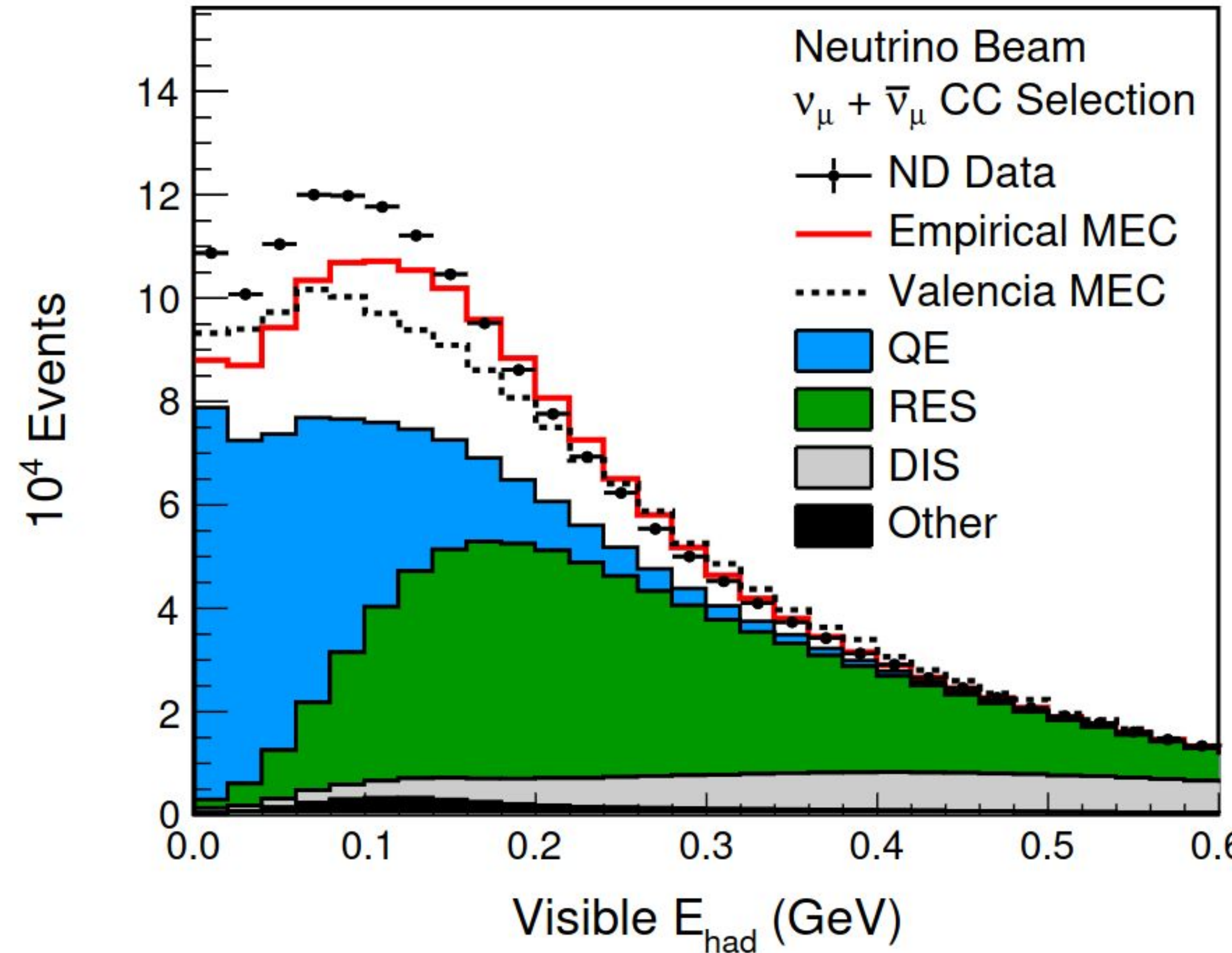


Mean fraction of energy transfer imparted to neutrons (CC  $\nu_\mu$  events with n)

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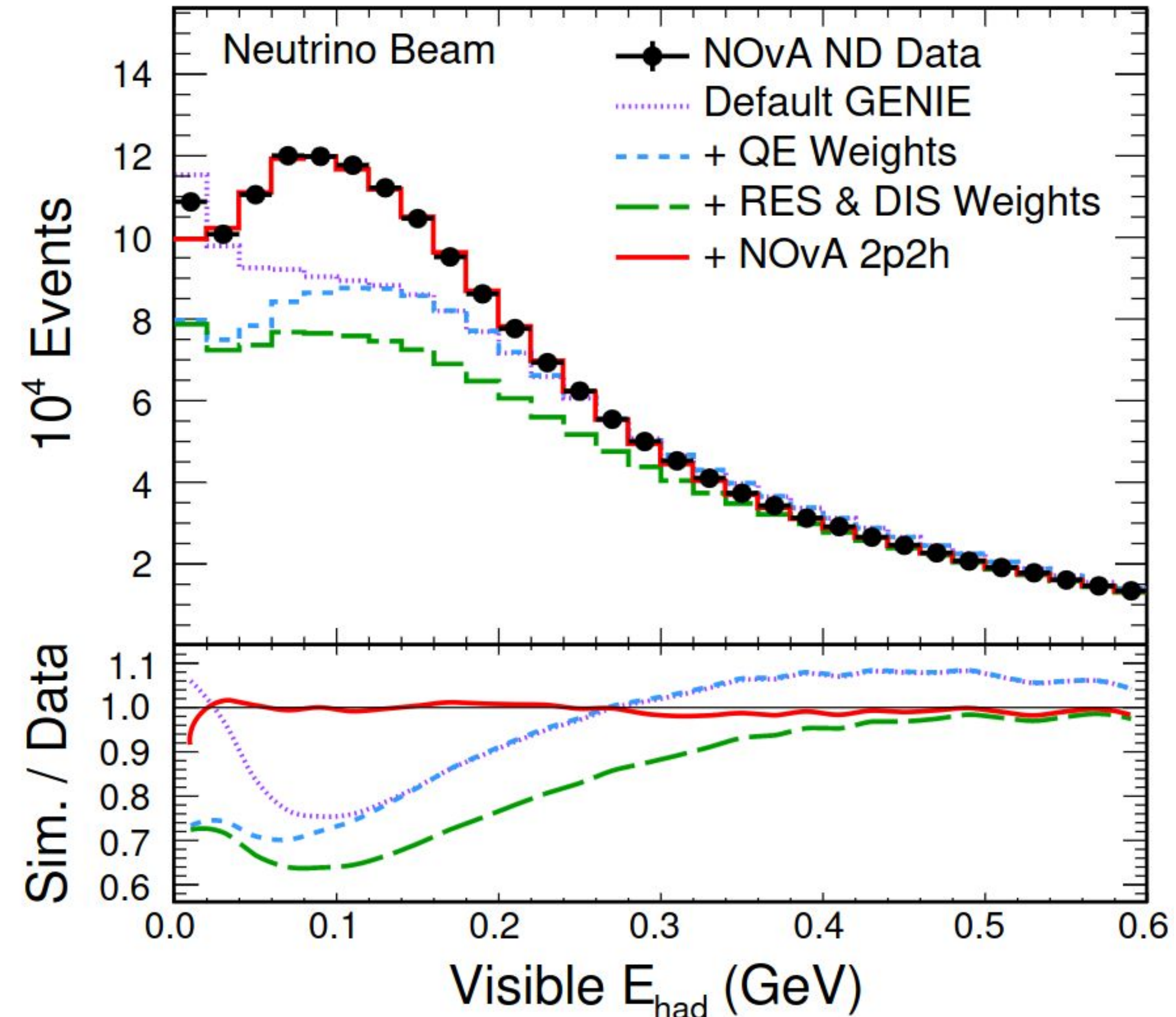
NOvA Collaboration, [Eur. Phys. J. C 80, 1119 \(2020\)](#)



# Where do the modeling uncertainties come from?

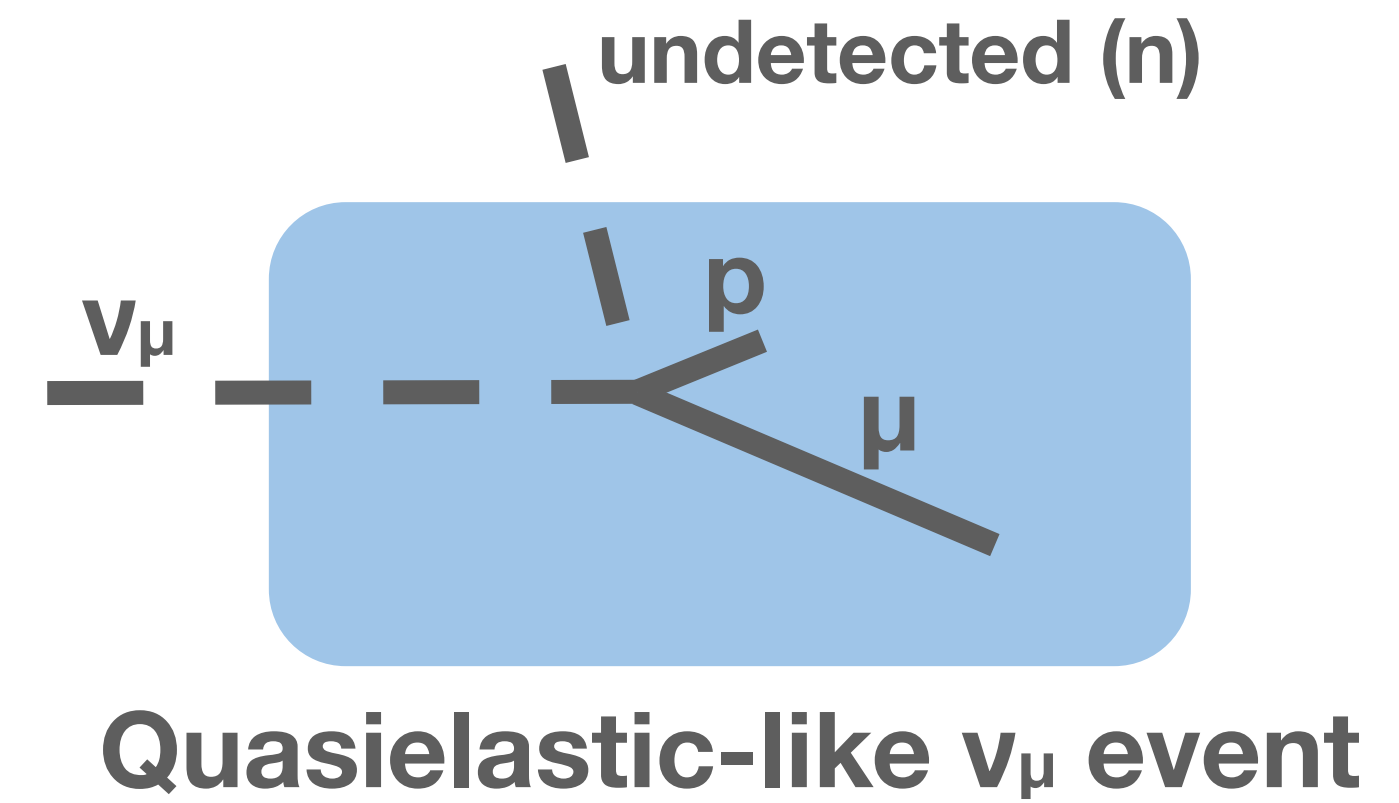
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NOvA Collaboration, [Eur. Phys. J. C 80, 1119 \(2020\)](#)

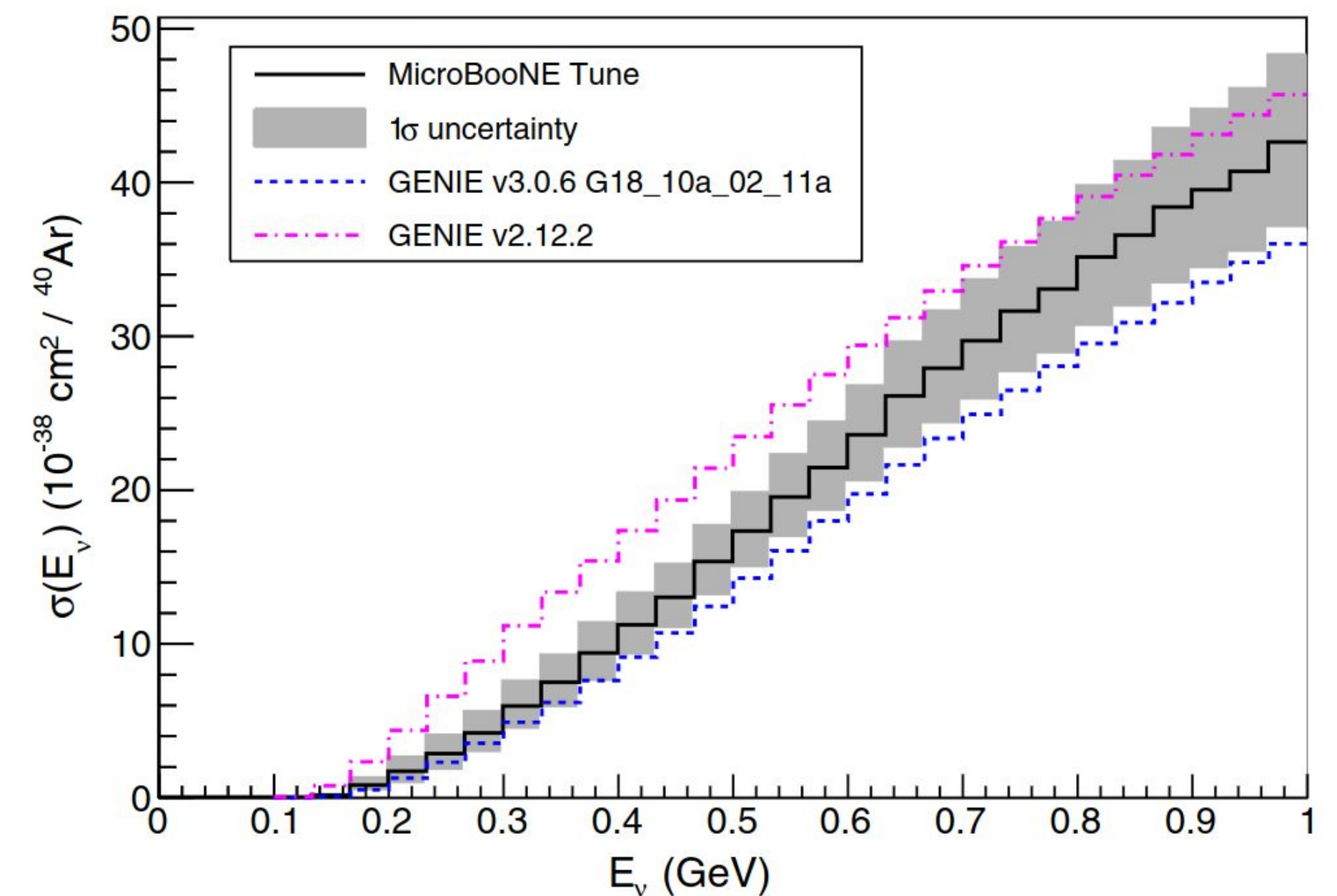


# Uncertainty propagation

- How do uncertainties on the inputs impact quantities we care most about?
  - Efficiencies / purities / energy estimation
  - Cross-section predictions
- For experiments, generators must provide tools for assessing these uncertainties
  - NEUT + GENIE: large toolkits
  - NuWro: some infrastructure
  - Others mentioned in the talk: nothing official yet



$\nu_\mu$  CC inclusive total cross section

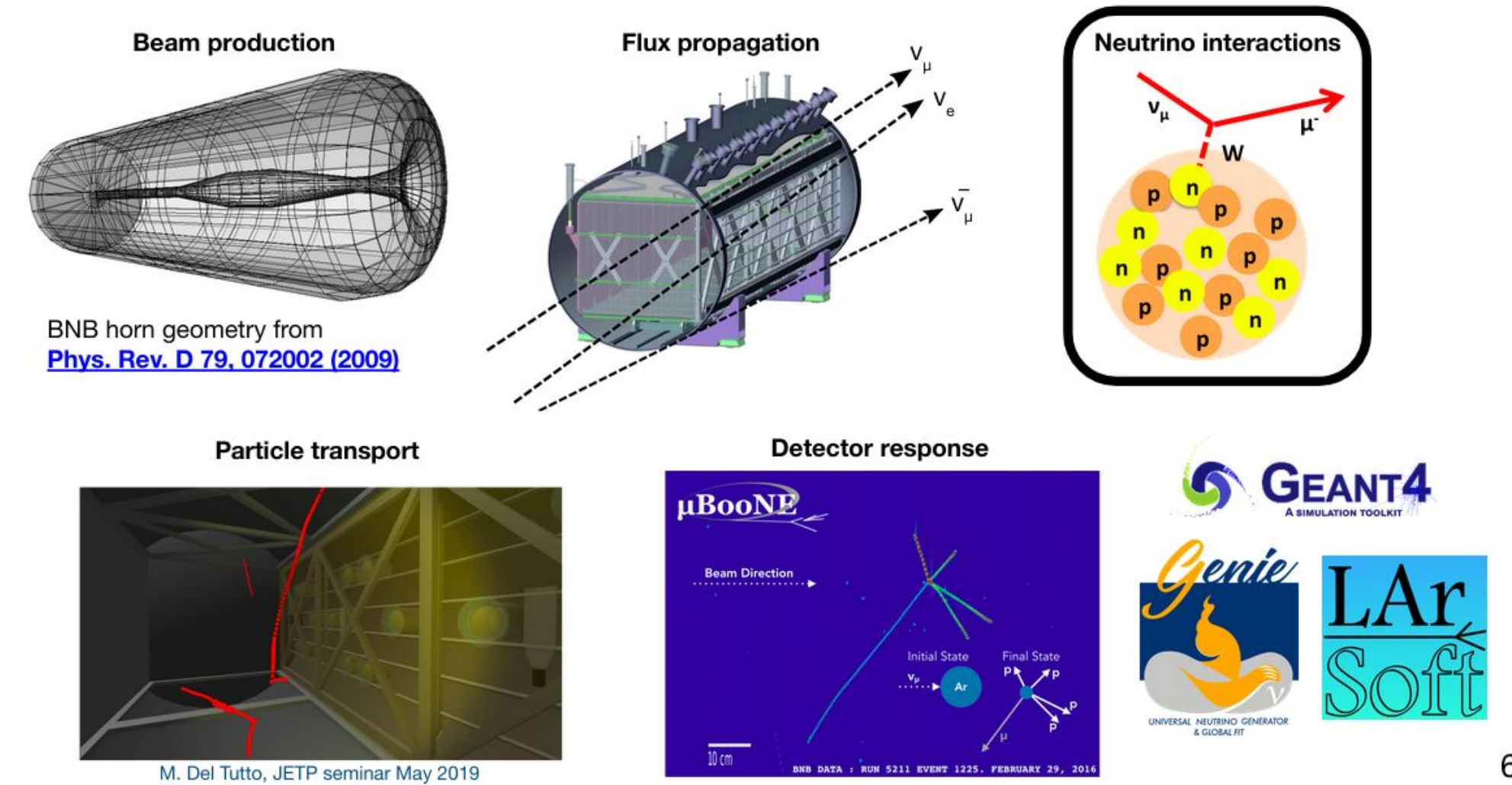


MicroBooNE Collaboration,  
[Phys. Rev. D 105, 092004 \(2022\)](#)

# Reweighting for uncertainty propagation

- Full experimental simulations are computationally very expensive
  - Change a form factor, and rerun everything? (nope, takes too long 😞)
  - Brute force is the only way to handle some uncertainties
- Where possible, experiments use **reweighting**
  - Use the *same* events, assign them statistical weights based on model adjustments
  - **Likelihood ratio** approach

## Neutrino experiments require comprehensive simulations



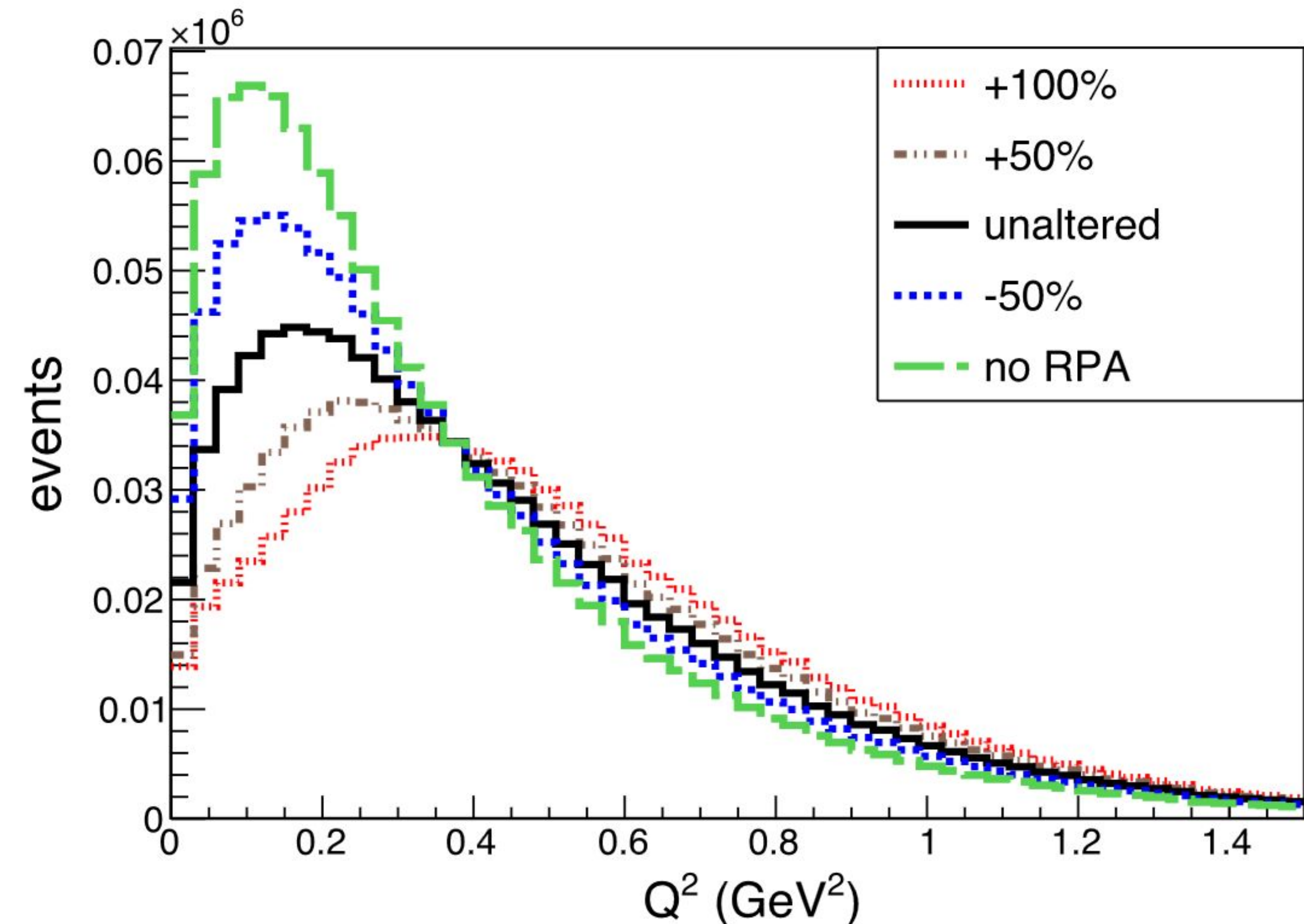
$$w = \frac{P(\text{event}|\mathbf{p}')}{P(\text{event}|\mathbf{p})}$$



# Reweighting for uncertainty propagation

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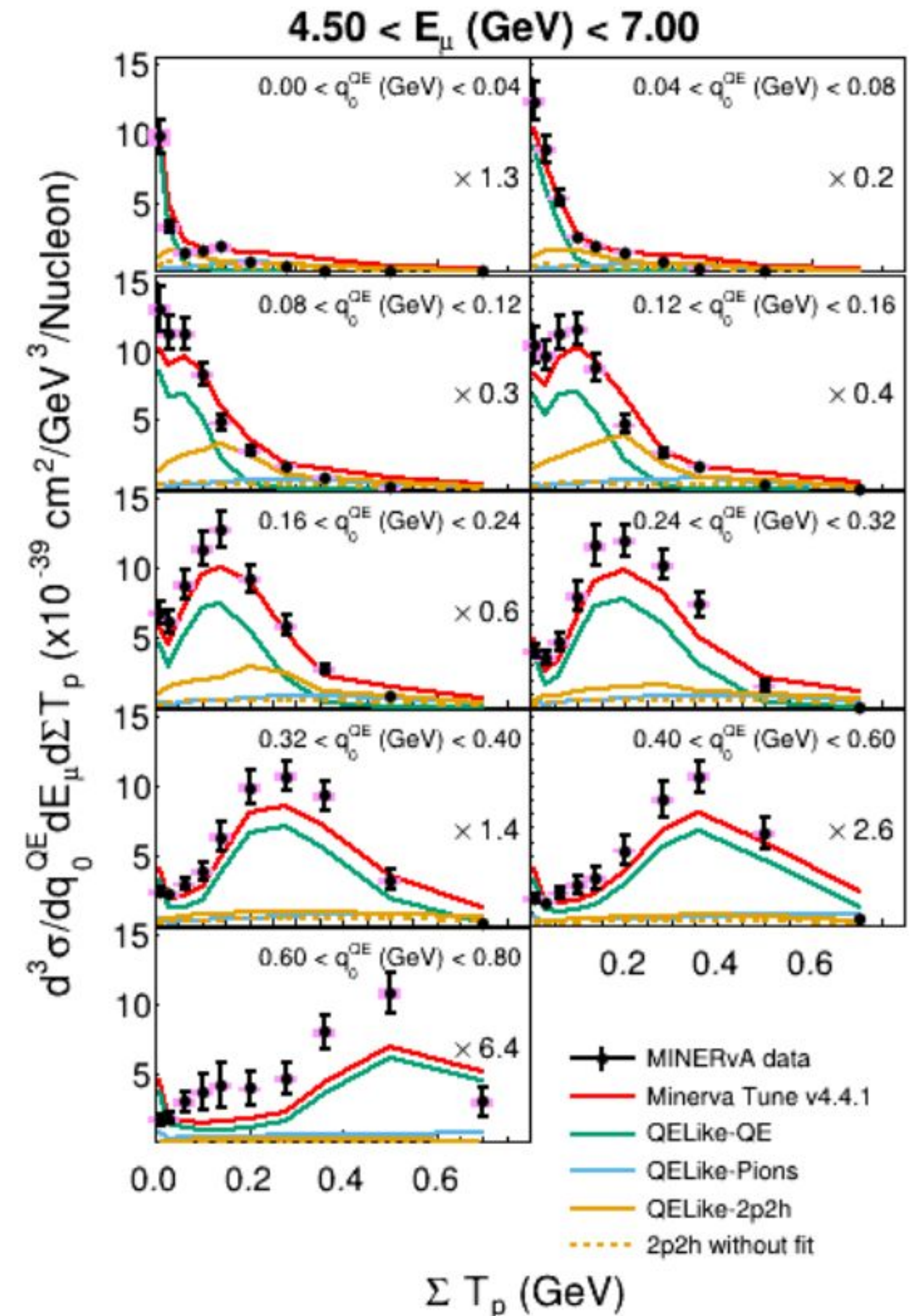
MicroBooNE Collaboration,  
[Phys. Rev. D 105, 092004 \(2022\)](#)



CCQE variations of RPA effect  
implemented via reweighting

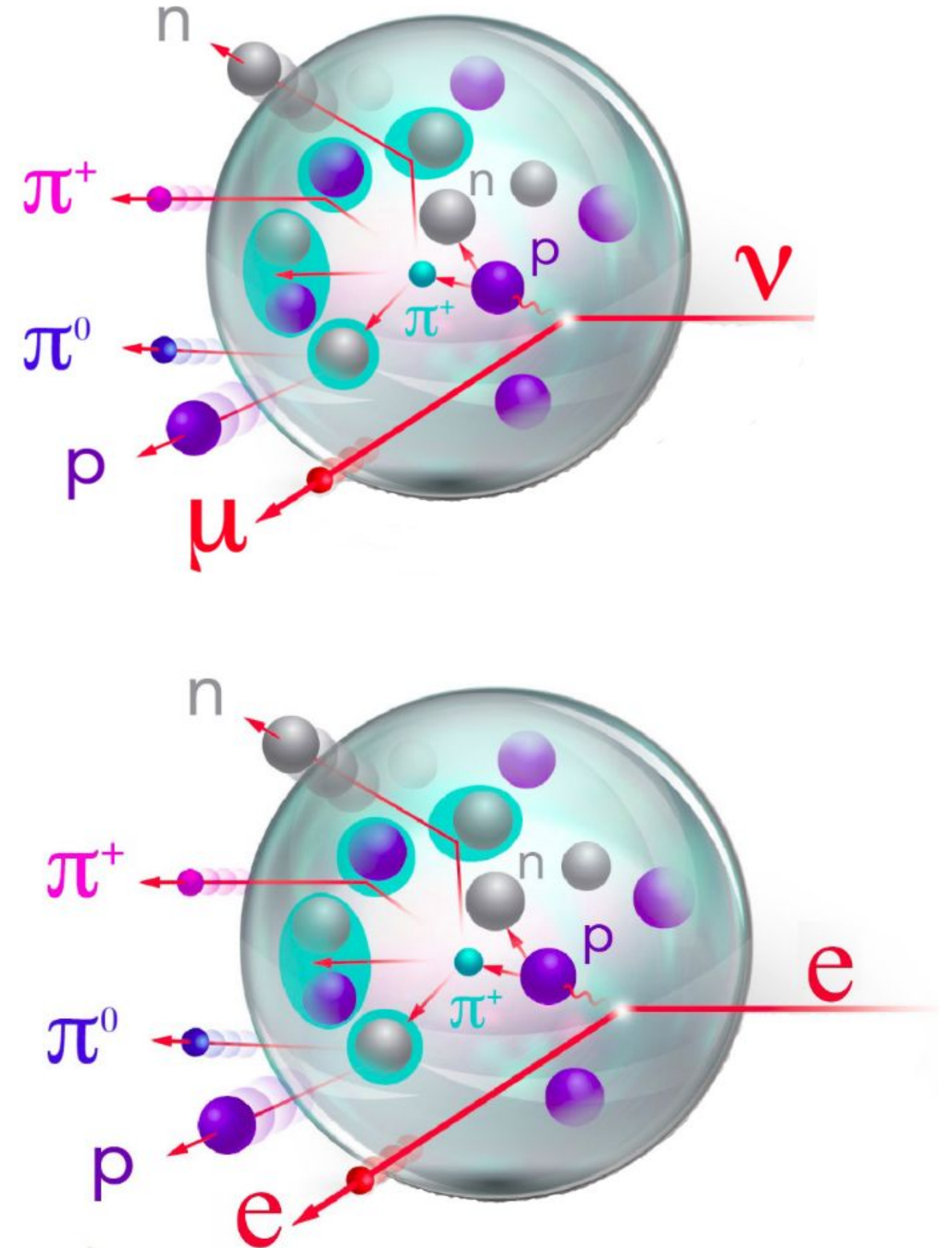
# Strengths and limitations of neutrino data

- Neutrino cross-section data are essential to benchmark generators
  - Weak probe of the nucleus, some unique features (e.g., axial-vector coupling)
- **Growing library** from many experiments
  - Introduction tomorrow by Dan, many talks next week
- There are nevertheless **drawbacks**
  - *Weak* interaction: relatively low statistics
  - Results are typically *flux-averaged*: isolating energy-dependent effects difficult!



# Complementary use of electron beam data

- **Valuable resource** already mentioned in theory talks yesterday
- Much higher cross section = drastically larger statistics
- Monoenergetic beam = negligible uncertainty on incident energy
- These advantages offer a powerful constraint on shared modeling ingredients
  - Vector part of primary interaction
  - Many nuclear effects
- But you need a **consistent simulation!**
  - Not necessarily true in generators



# Checking neutrino energy reconstruction with electrons

- Apply neutrino energy estimation methods to electron-nucleus data

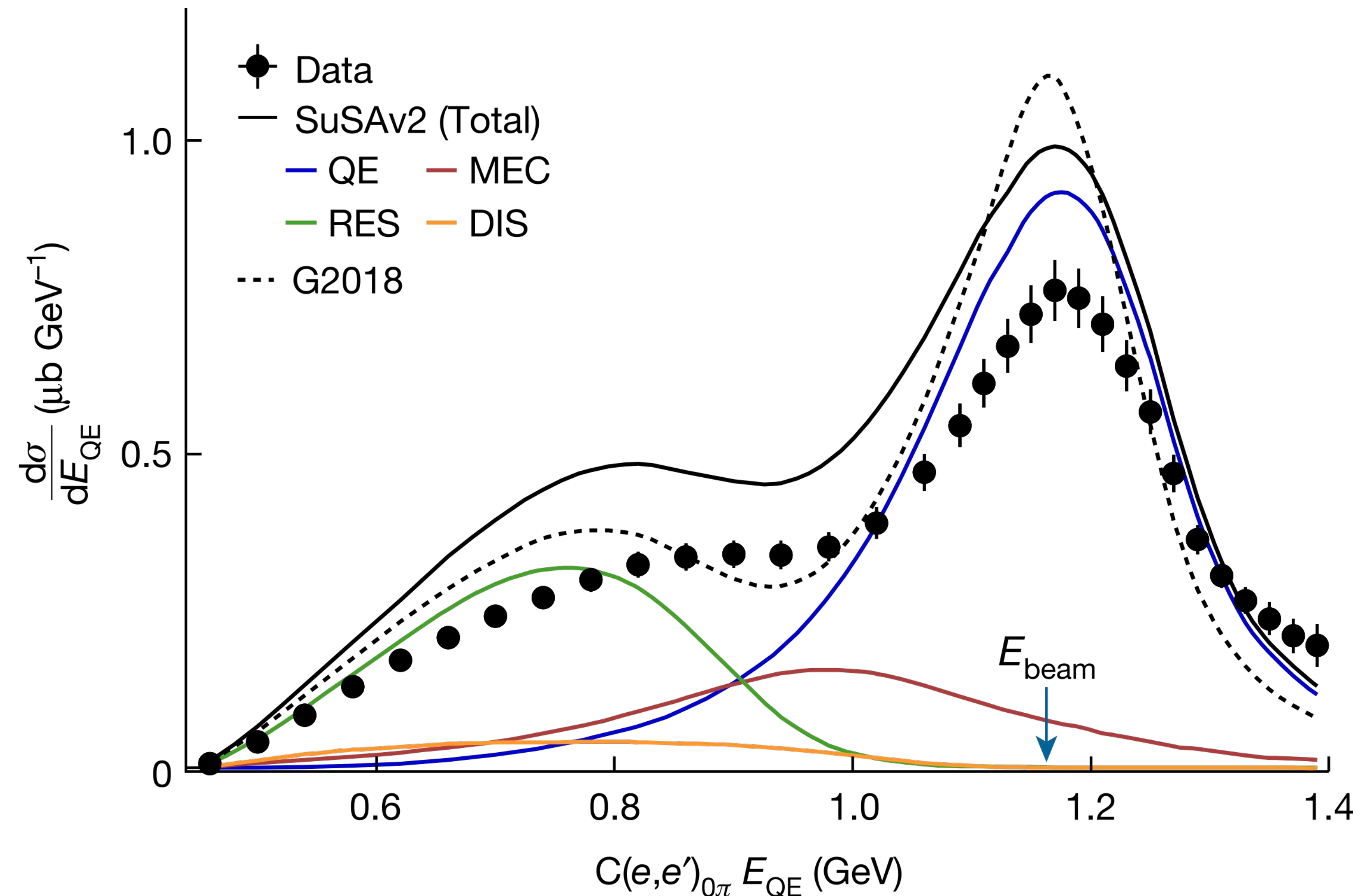
- Monoenergetic beam
- “Simple”  $0\pi$  case

- Large fraction of events are misreconstructed

- Current GENIE-based models describe the bias poorly

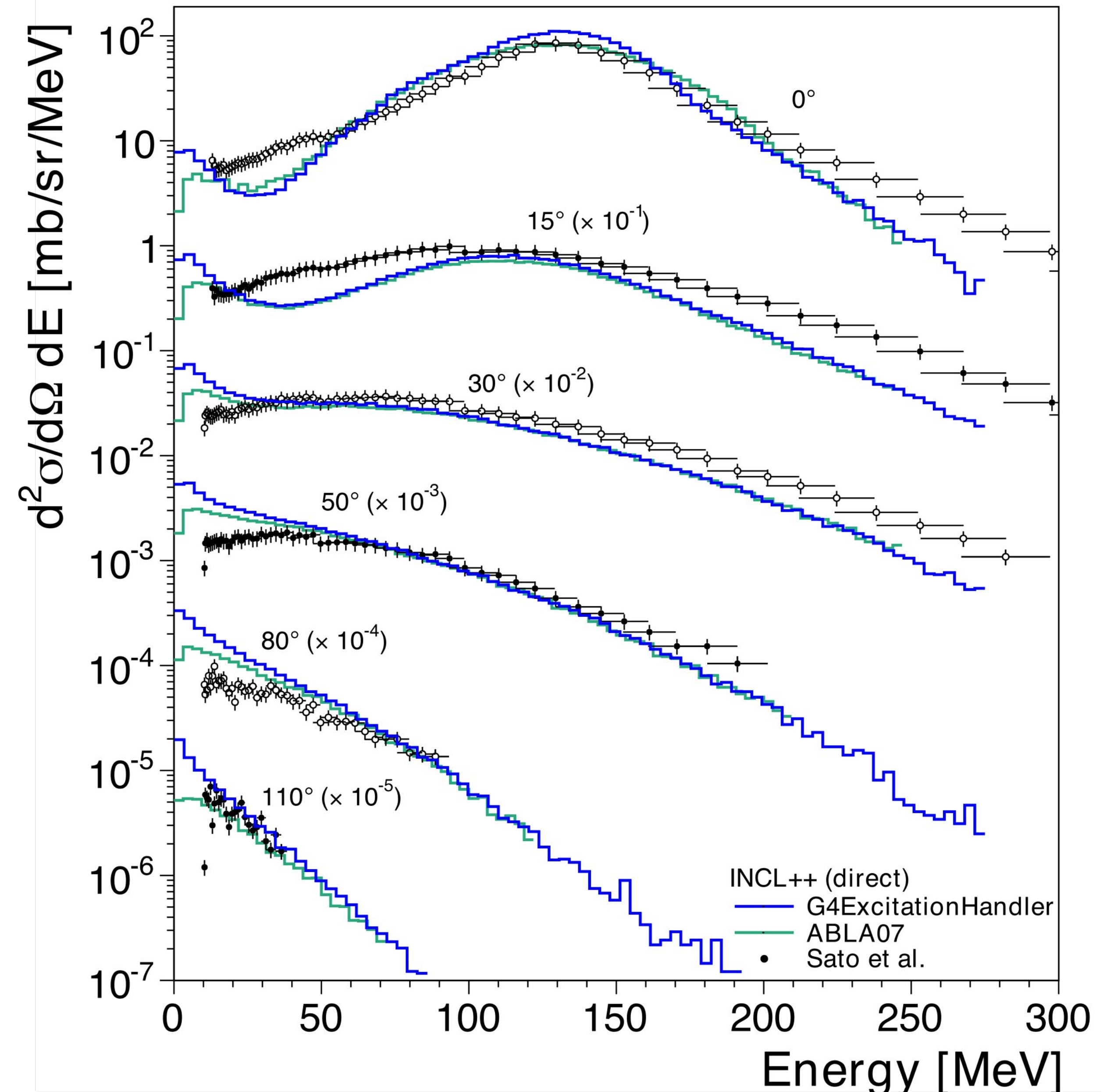
- Clear need (and path) for improvements!

CLAS & e4v Collaborations, [Nature 599, 565 \(2021\)](#)



# Hadron scattering data

- Also highly useful for FSI in neutrino generators
  - Still need measurements of hadronic final state for neutrinos
  - How well can we apply hadronic projectile case to our own?
- Liège Intranuclear Cascade model (INCL++) now available for FSI in NuWro, GENIE
  - Widely used for calculations of hadronic cross sections
- **Plot:** double-differential neutron production in  $^{12}\text{C} + ^{12}\text{C}$  @ 135 MeV/nucleon



**And finally, an invitation**

# Fermi National Accelerator Laboratory (“Fermilab”)

- Main lab in USA for particle physics research
  - Worldwide collaboration, including with CERN
- Other focus areas:
  - Accelerator engineering
  - Astrophysics & cosmology
  - Quantum computing

**Opportunities for visiting students, please get in touch if you are interested**

