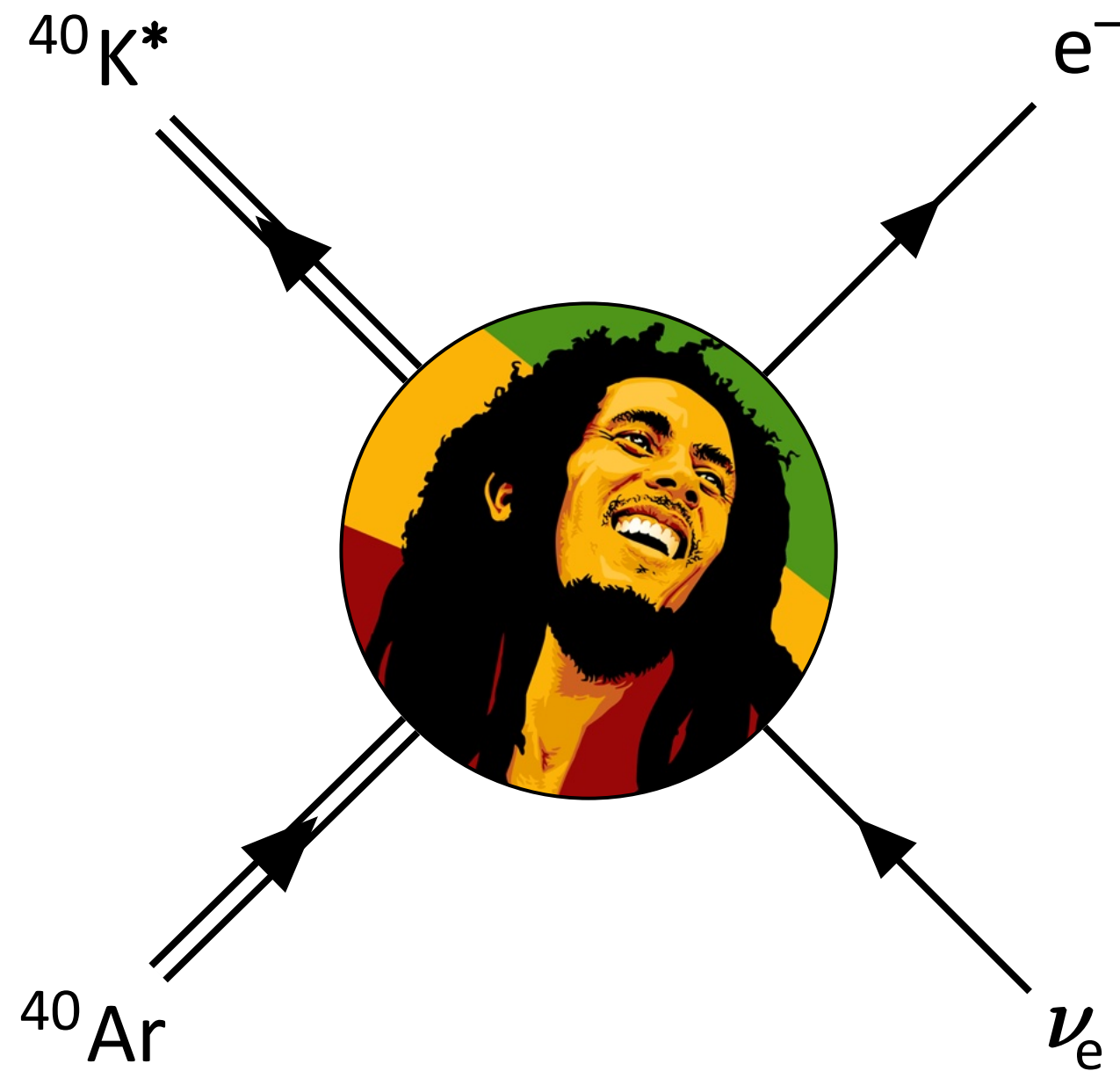
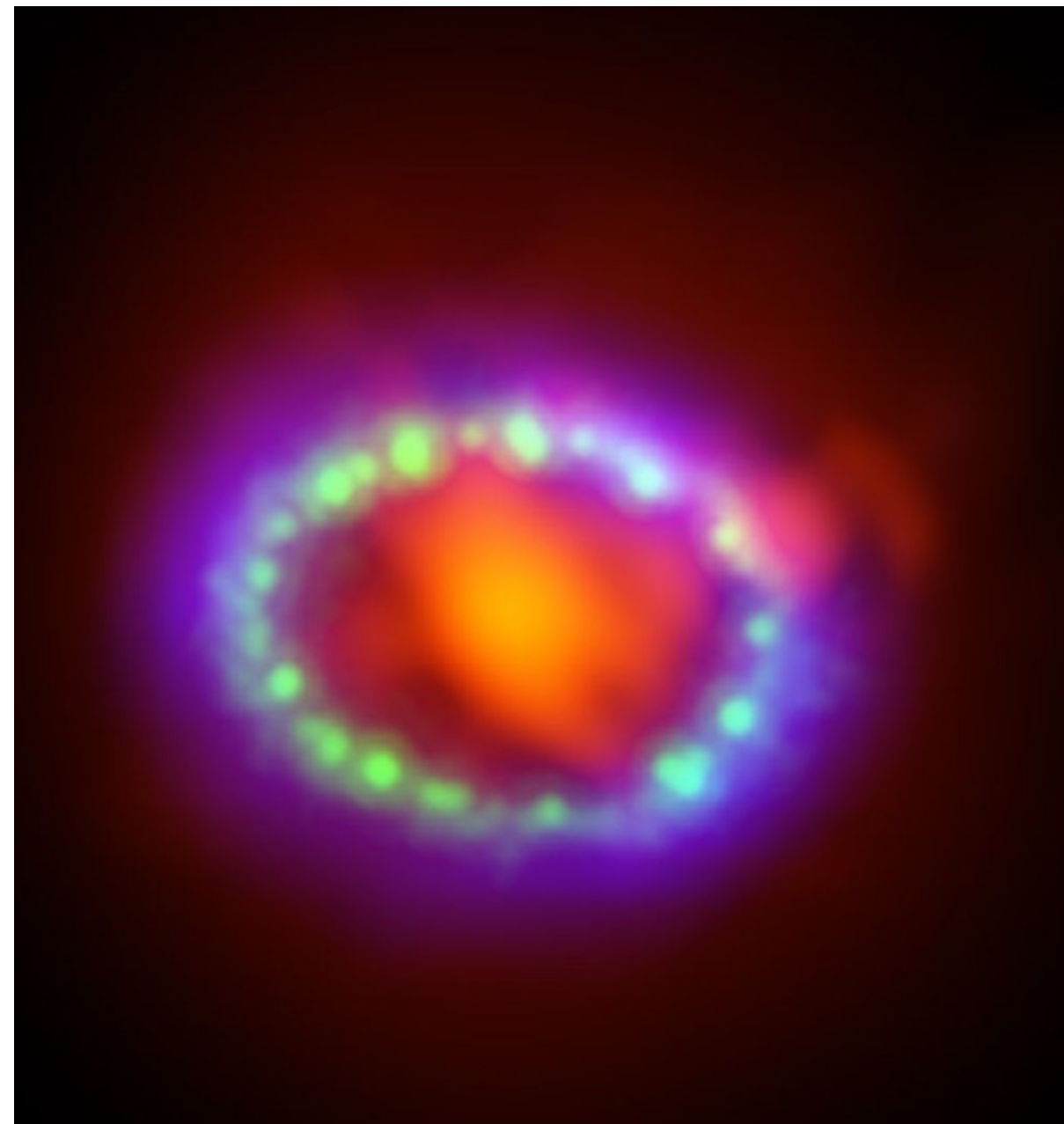


(Prospects for) Uncertainty quantification in MARLEY



Steven Gardiner (gardiner@fnal.gov)

Event Generators Group, Fermilab Physics Simulation Department

Theoretical Physics Uncertainties to Empower Neutrino Experiments (INT-23-86W)

1 November 2023

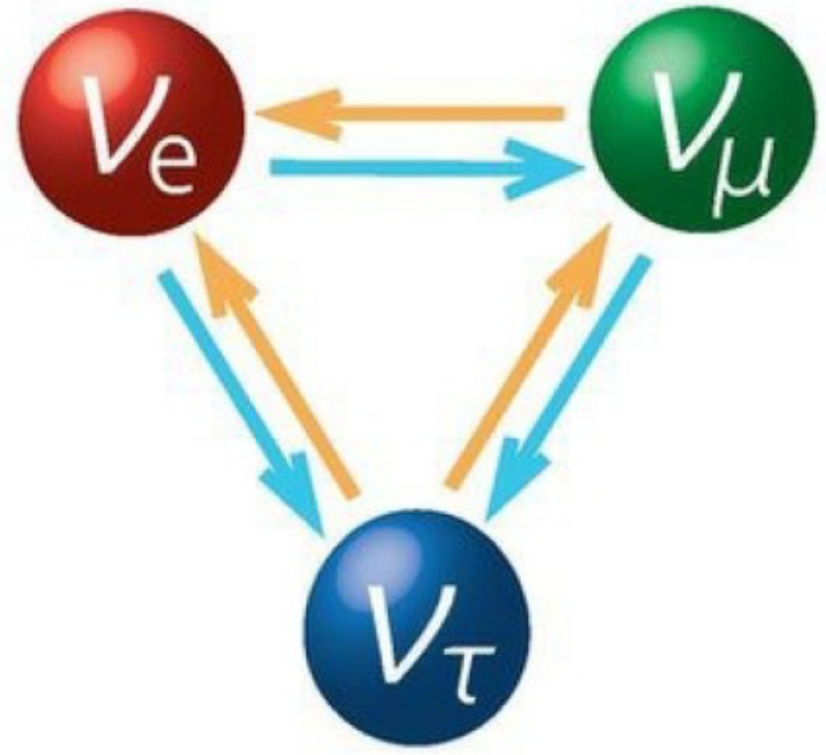
Overview

- Motivation in context of DUNE
- ν -A modeling at $O(10 \text{ MeV})$
 - Compare & contrast to higher energies
- The MARLEY event generator
- Model uncertainties, both easy and hard
 - Brief NuHepMC cameo
- First study for DUNE:
[Phys. Rev. D 107, 112012 \(2023\)](#)



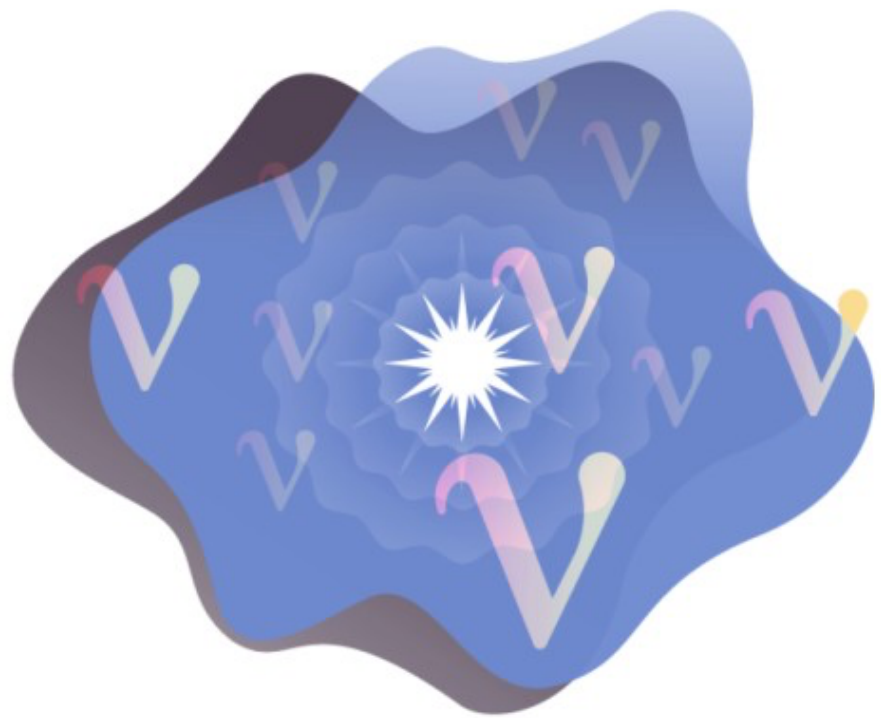
Bob sighting @ Golden Oldies Records, Seattle

Primary science goals of DUNE



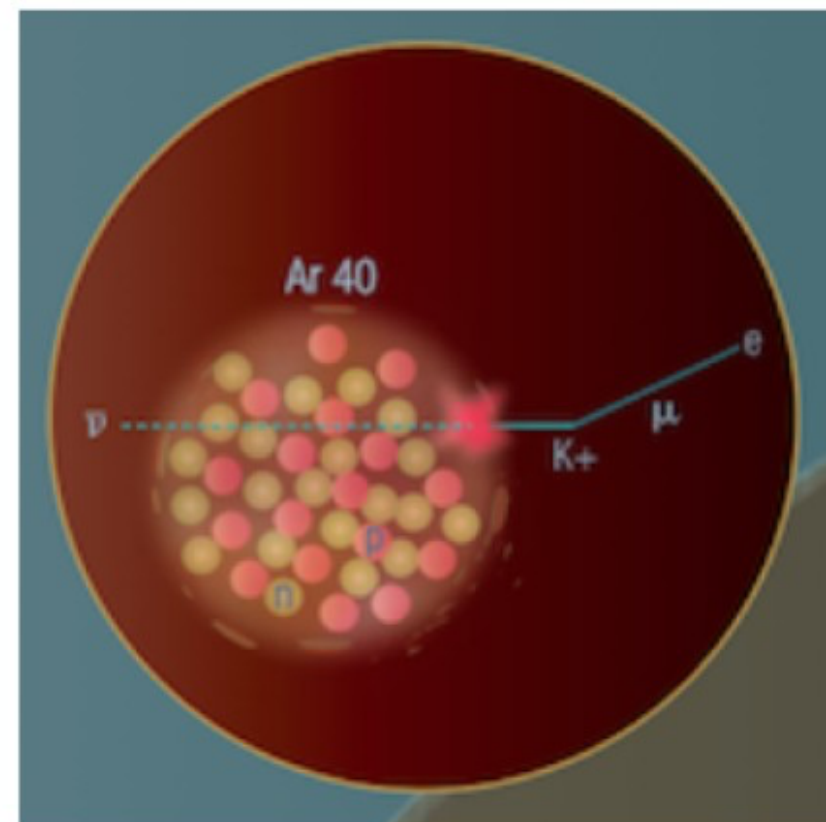
Accelerator neutrino oscillations

- Search for CP violation ($\delta^{\text{CP}} \neq 0, \pi$)
- Neutrino mass ordering
- Precision mixing parameters



Supernova physics

- Measure $O(10 \text{ MeV})$ neutrinos from a galactic supernova
- Unique sensitivity to ν_e component, rich physics potential



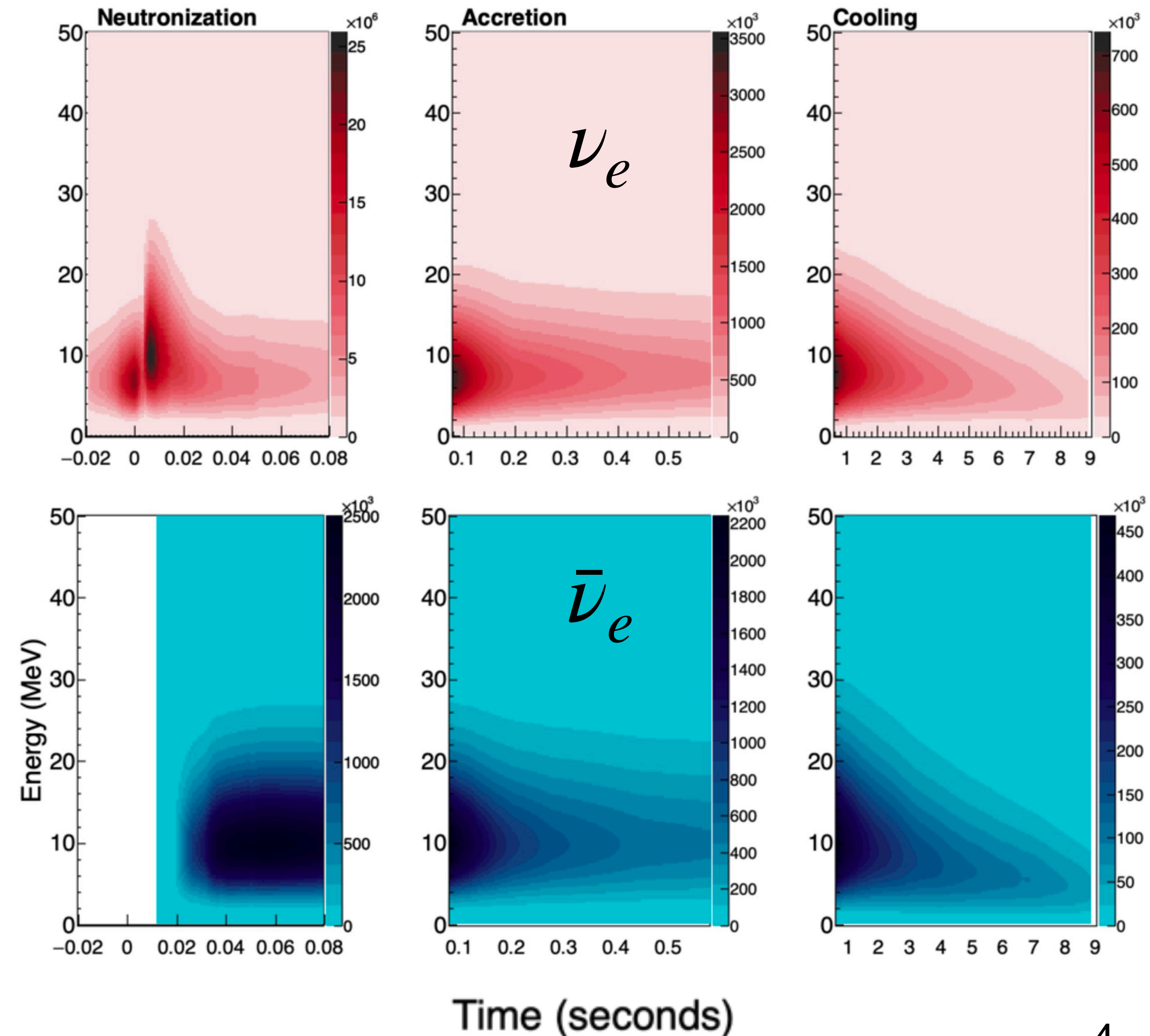
Explore physics beyond the Standard Model

- Proton decay, other baryon number violating processes
- Heavy neutral leptons, boosted dark matter
- Various other exotic physics scenarios

Observables for a supernova neutrino analysis

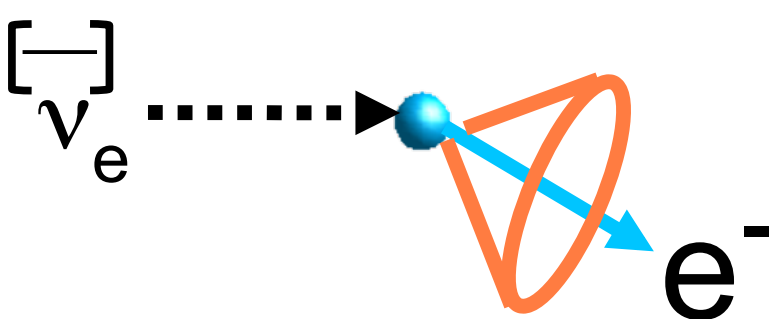
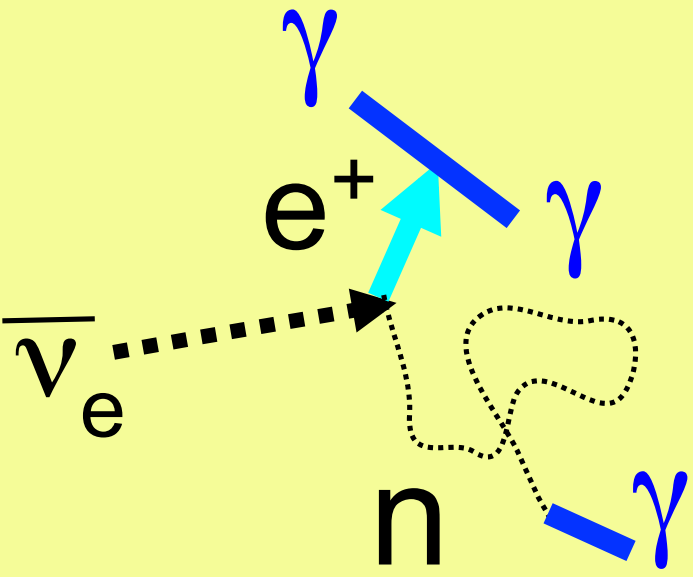
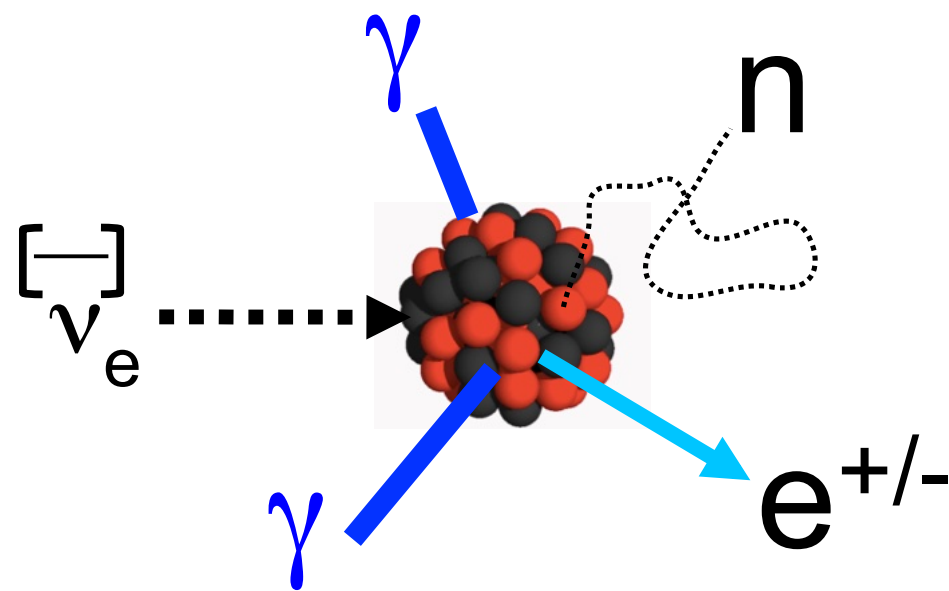
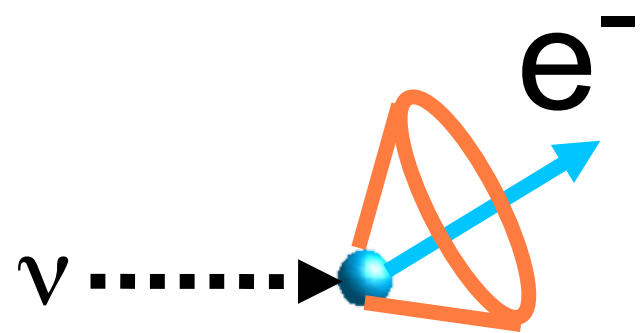
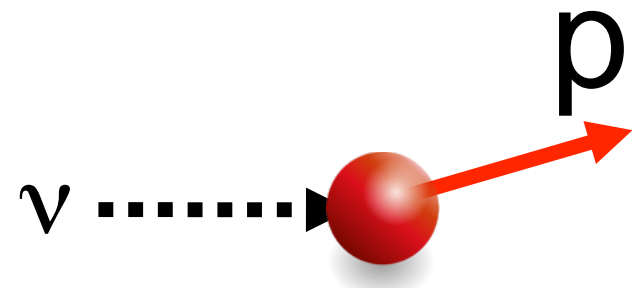
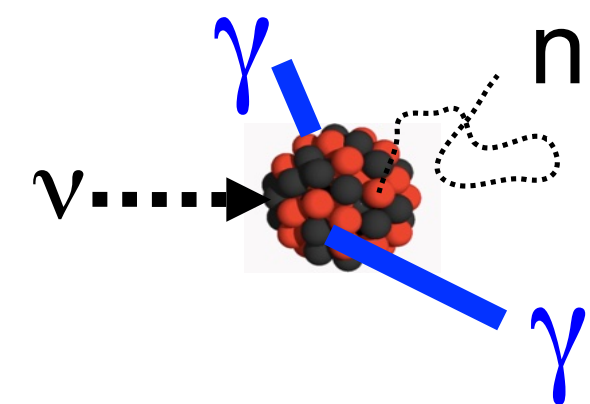
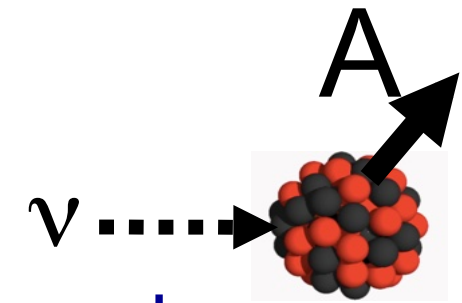
[Eur. Phys. J. C 81, 423 \(2021\)](#)

- Physics signatures imprinted on time-dependent flux
 - Core-collapse dynamics, mass ordering, collective oscillations, BSM, ...
- Measure **energy**, flavor, and time
 - Low **tens-of-MeV** set by supernova temperature
- Distinct information from ν_e , $\bar{\nu}_e$, ν_x
 - Detection of all highly desirable



Supernova-relevant neutrino interactions

K. Scholberg

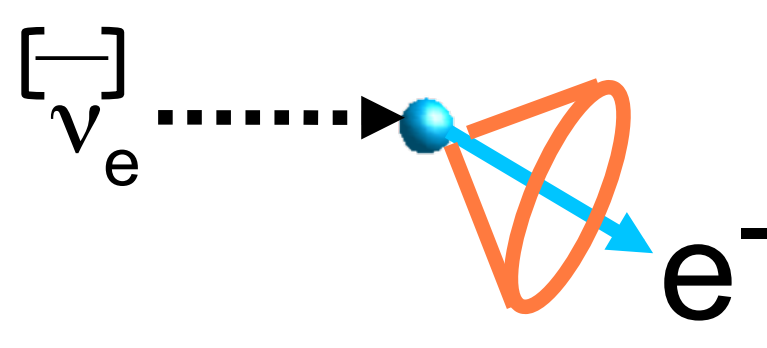
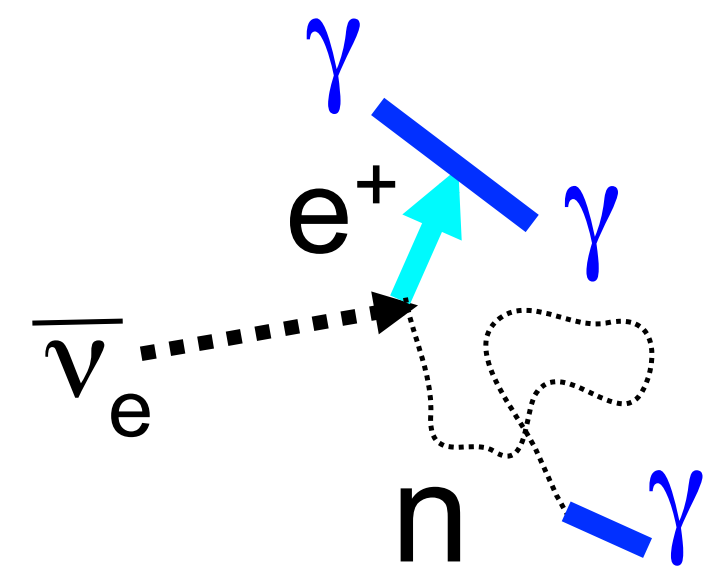
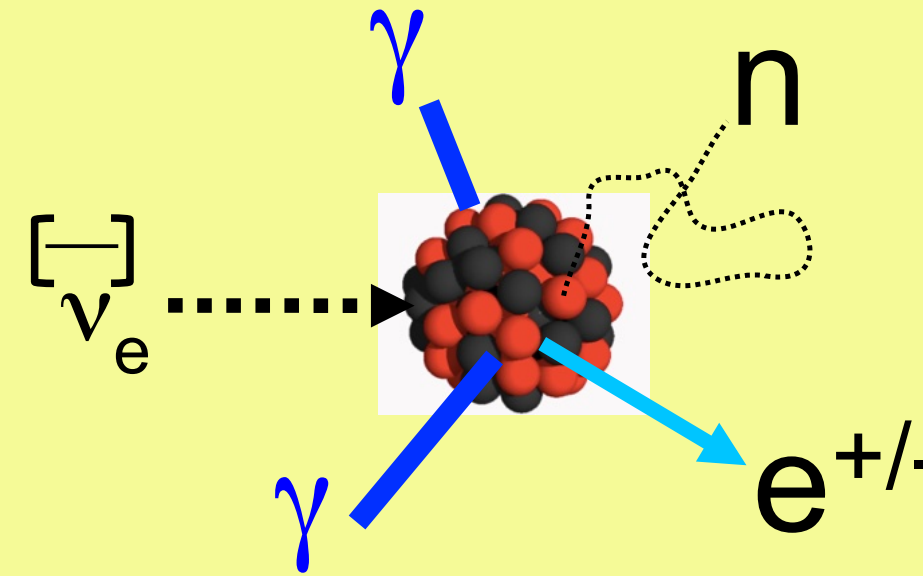
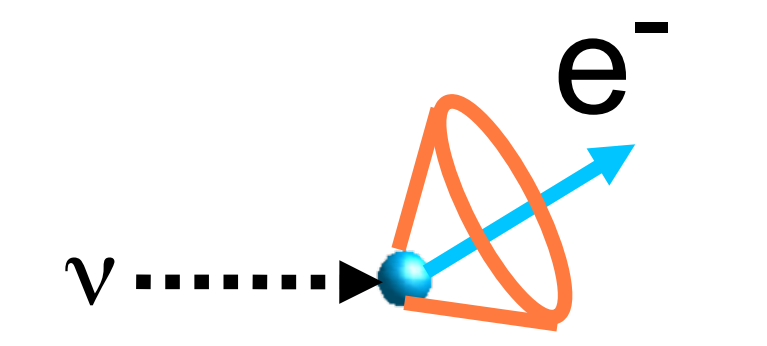
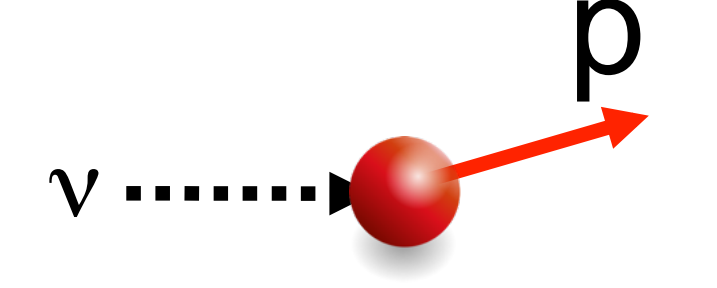
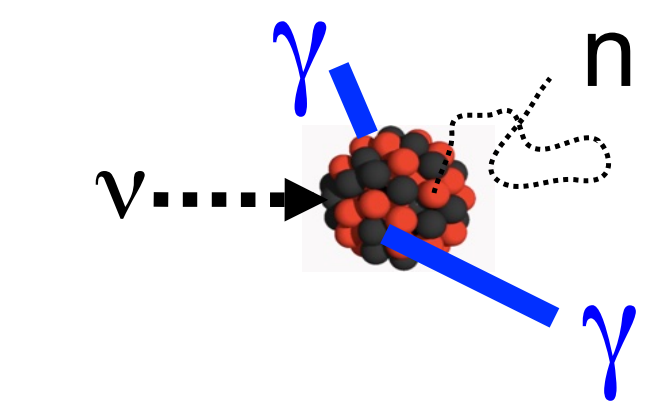
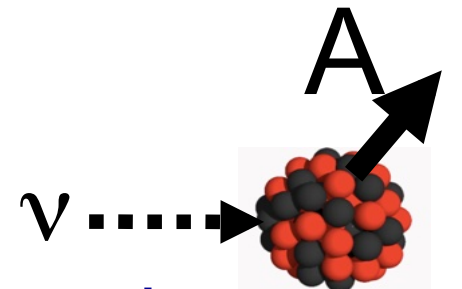
	Electrons	Protons	Nuclei
Charged current	<p>Elastic scattering</p> $\nu + e^- \rightarrow \nu + e^-$ 	<p>Inverse beta decay</p> $\bar{\nu}_e + p \rightarrow e^+ + n$ 	$\nu_e + (N, Z) \rightarrow e^- + (N - 1, Z + 1)$ $\bar{\nu}_e + (N, Z) \rightarrow e^+ + (N + 1, Z - 1)$ 
Neutral current	 <p>Useful for pointing</p>	<p>Elastic scattering</p>  <p>very low energy recoils</p>	$\nu + A \rightarrow \nu + A^*$  <p>Coherent elastic (CEvNS)</p> 

Various possible ejecta and deexcitation products

IBD (electron *antineutrinos*) dominates for current detectors

Supernova-relevant neutrino interactions

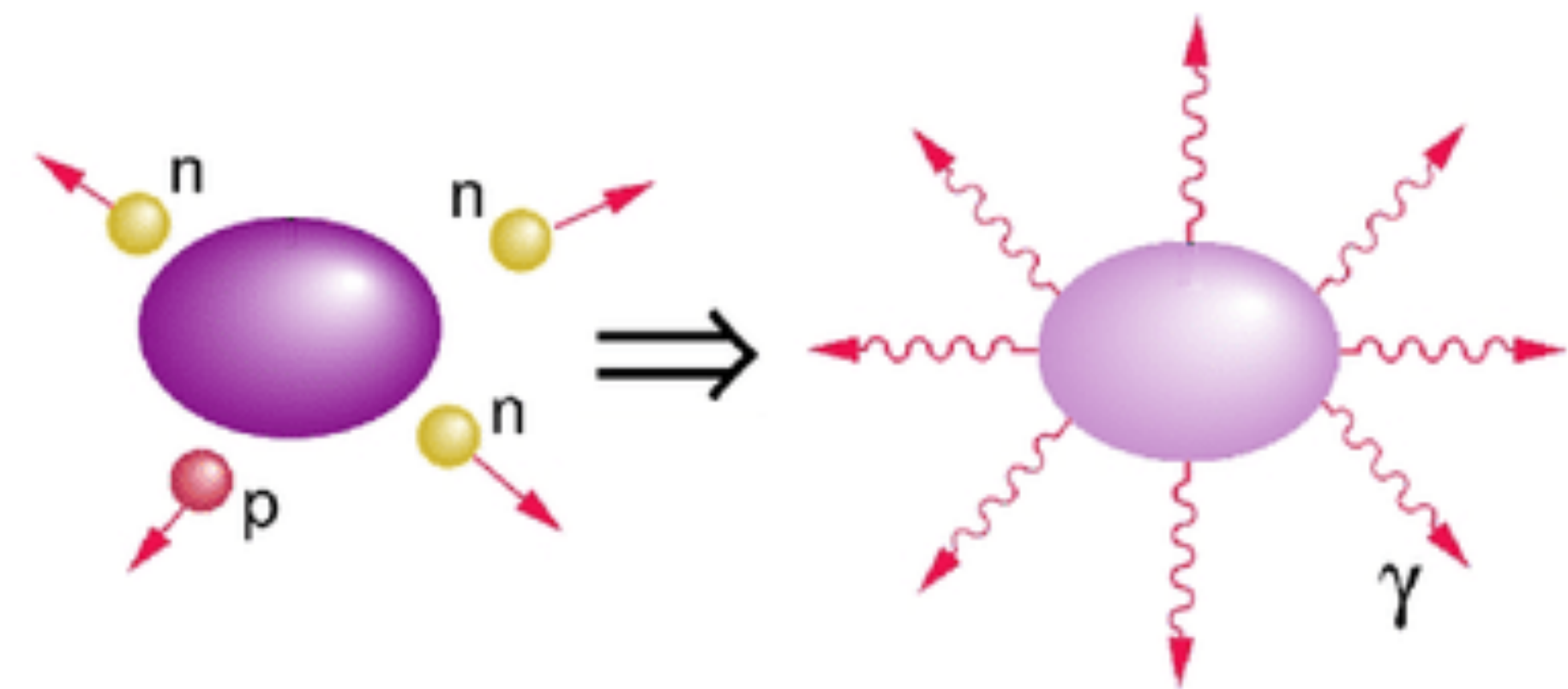
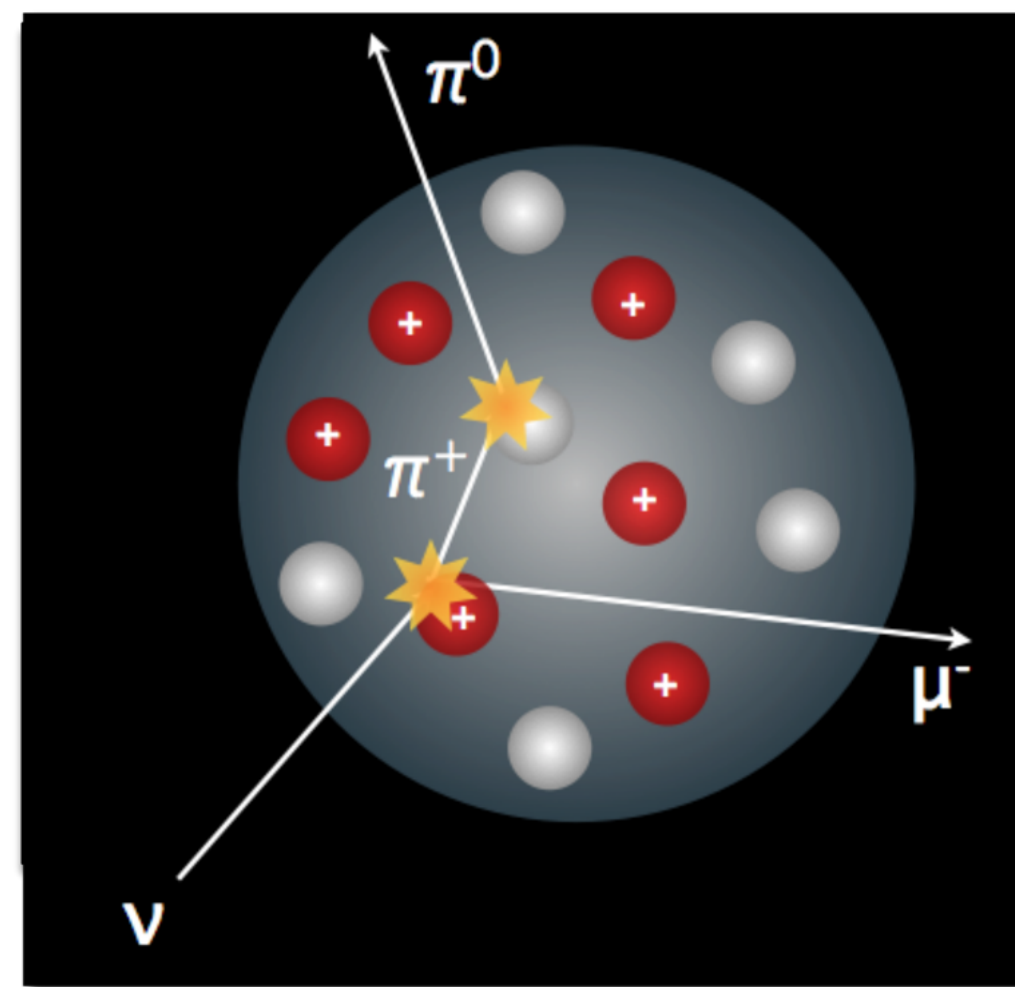
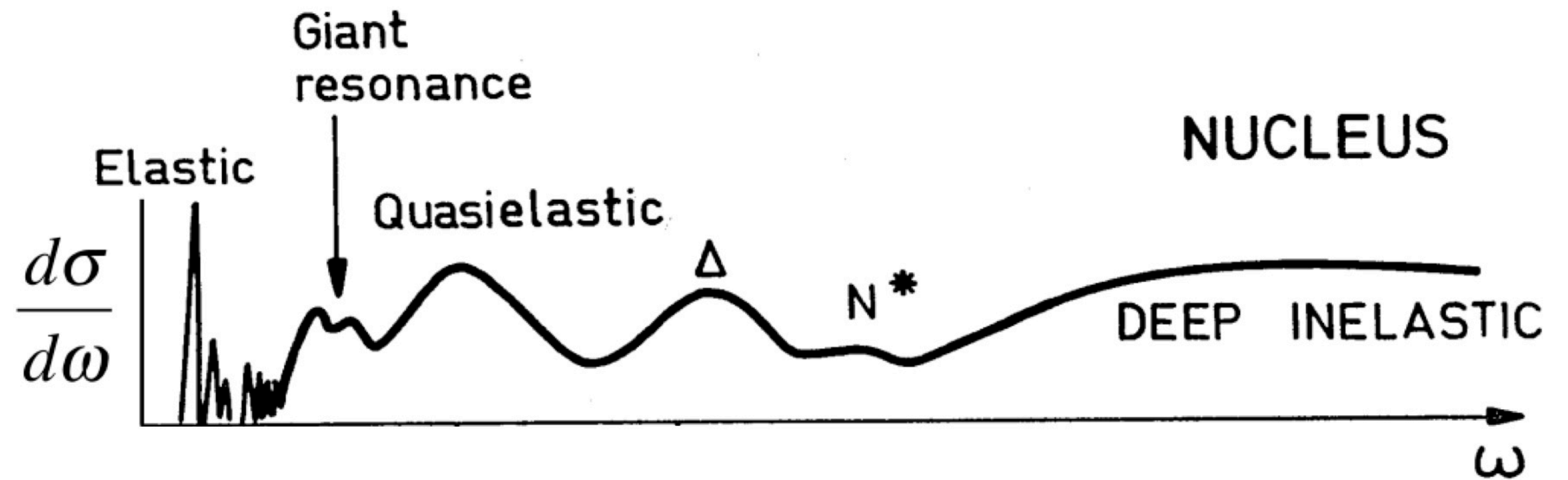
K. Scholberg

	Electrons	Protons	Nuclei
Charged current	<p>Elastic scattering</p> $\nu + e^- \rightarrow \nu + e^-$ 	<p>Inverse beta decay</p> $\bar{\nu}_e + p \rightarrow e^+ + n$ 	$\nu_e + (N, Z) \rightarrow e^- + (N - 1, Z + 1)$ $\bar{\nu}_e + (N, Z) \rightarrow e^+ + (N + 1, Z - 1)$  <div data-bbox="2565 862 2898 1219" style="border: 1px solid black; padding: 5px; width: fit-content;"> <p>Various possible ejecta and deexcitation products</p> </div>
Neutral current	 <p>Useful for pointing</p>	<p>Elastic scattering</p>  <p>very low energy recoils</p>	$\nu + A \rightarrow \nu + A^*$  $\nu + A \rightarrow \nu + A$ <p>Coherent elastic (CEvNS)</p> 

Nuclear target needed to isolate electron neutrino flux!

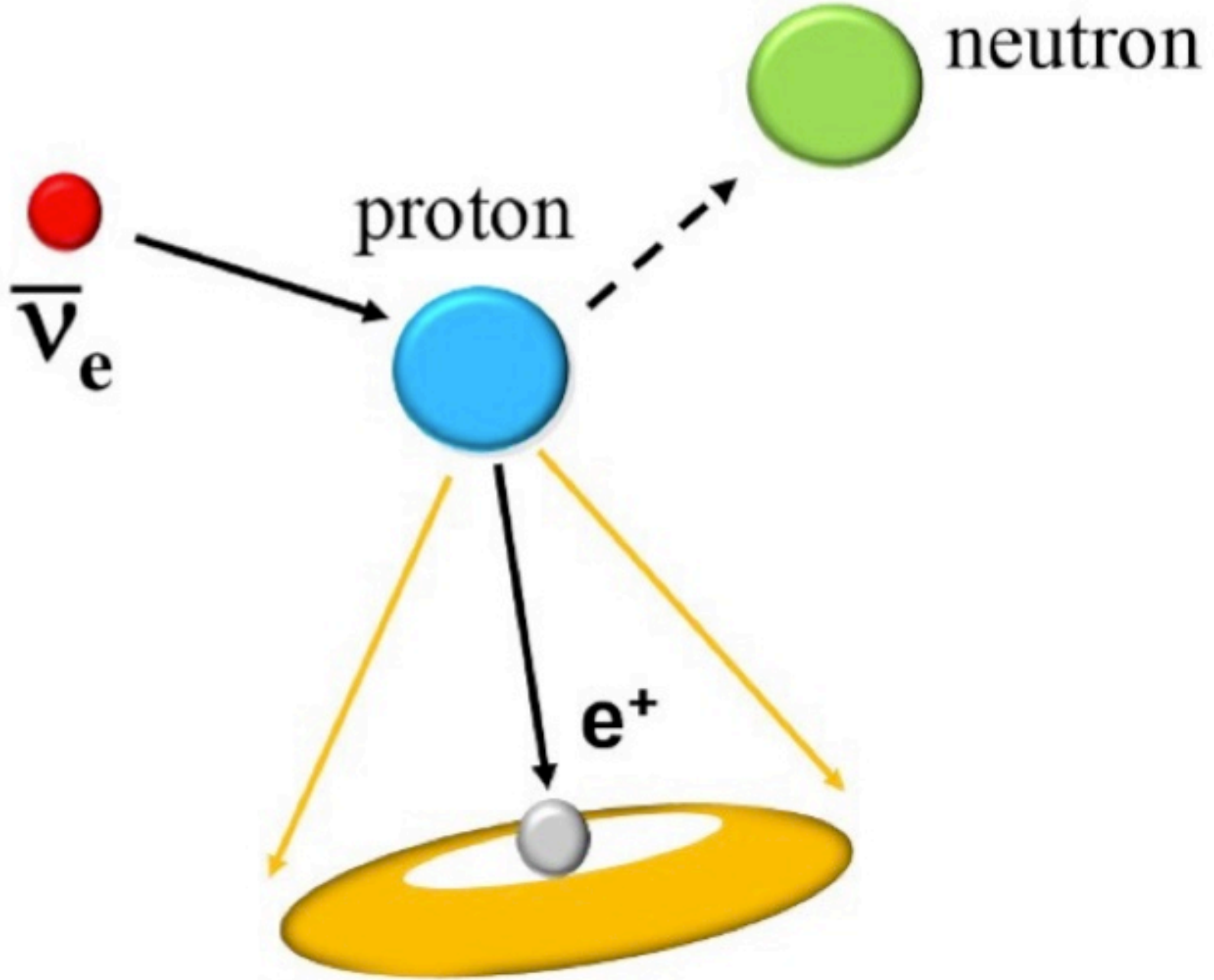
Modeling differences in the low-energy regime

- **Inclusive** cross sections sensitive to nuclear structure details
 - Discrete levels, giant resonances
- **Exclusive** predictions describe hadronic system very differently
- **Direct knockout** picture used at high energies
 - Dynamical models: BUU, INC
- **Compound nucleus** picture used at low energies
 - Statistical models: Hauser-Feshbach, SMM



Neutrino calorimetry still main driver of modeling needs

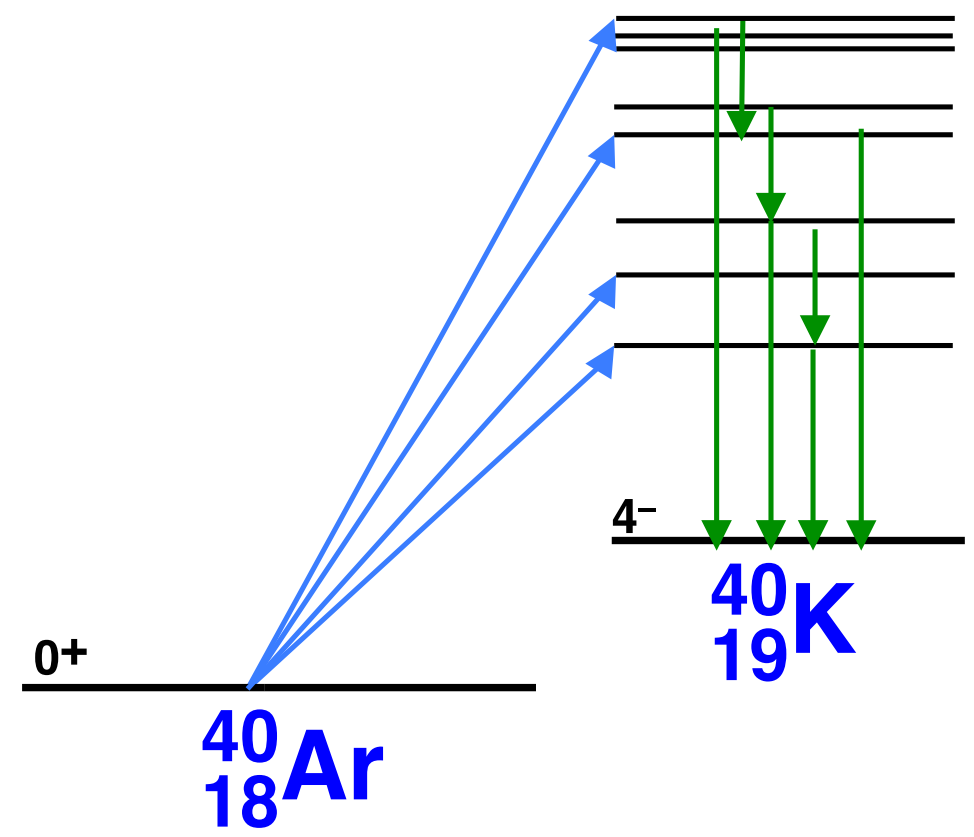
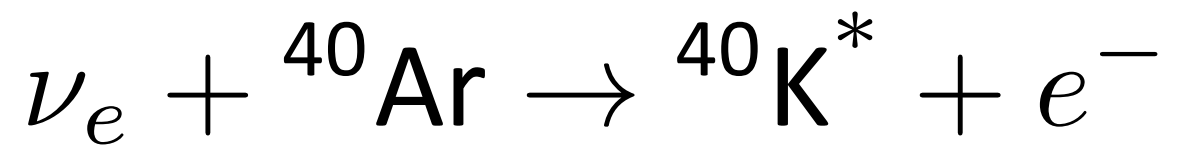
IBD: e^+ sufficient to infer E_ν



inverse beta decay

Outgoing e^+ energy Neutron proton mass difference Recoil energy of neutron (negligible)

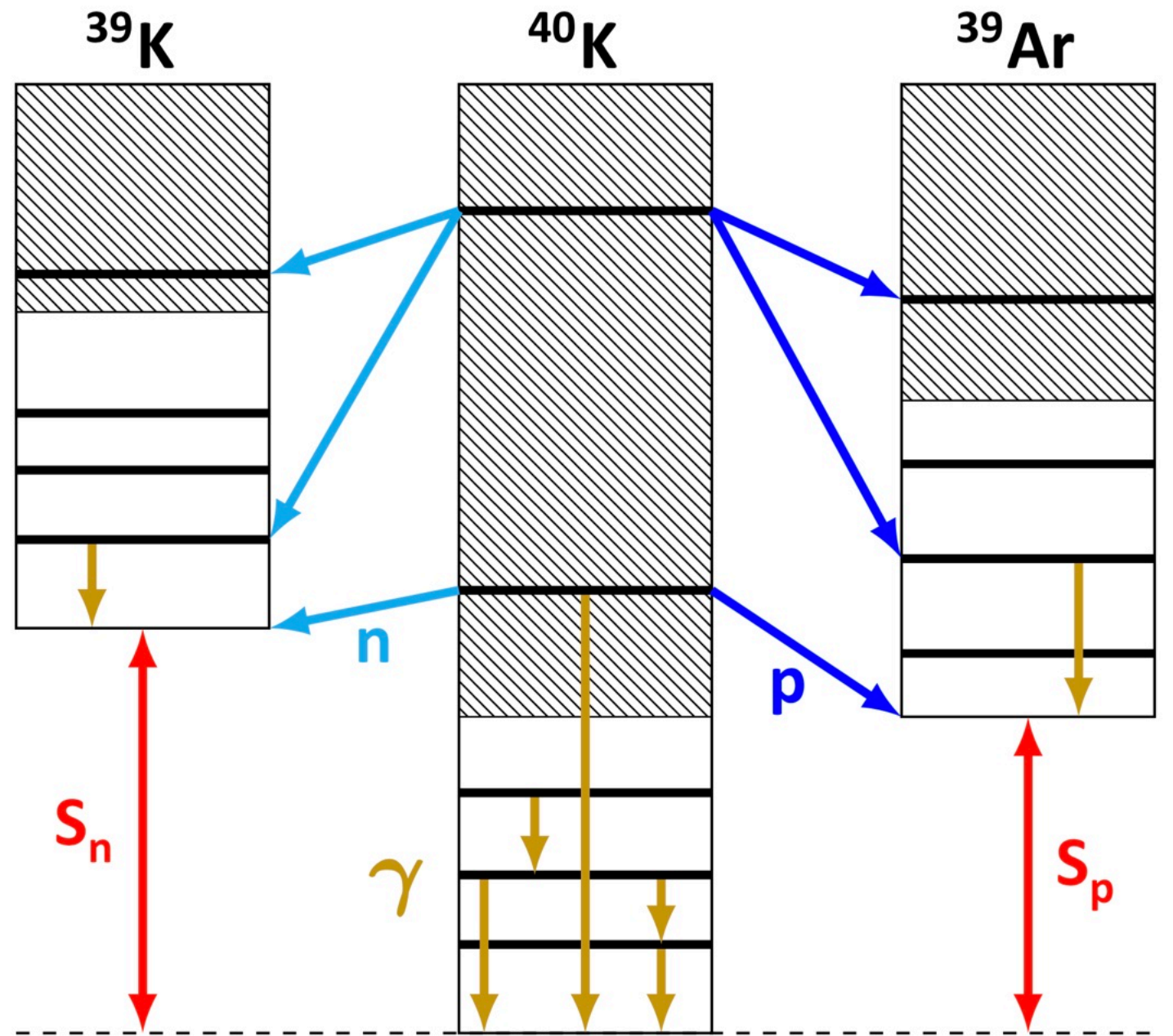
$$E_{\bar{\nu}} = E_e + \Delta + K_{\text{recoil}}$$



ν -A is much more complex

Outgoing e^- Energy Energy donated to transition Recoil Energy of Nucleus (negligible)

$$E_\nu = E_e + Q + K_{\text{recoil}}$$



- Two-step approach**
- 1. Nuclear transitions**
 - 2. De-excitations**

MARLEY overview

- Event generator focused specifically on neutrino energies below ~ 100 MeV
- “Model of Argon Reaction Low Energy Yields”
 - Emphasizes ν_e CC on ^{40}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 ν_e scattering on ^{40}Ar

Steven Gardiner^{1,2,*}

¹Fermi National Accelerator Laboratory, P.O. Box 500, Batavia, Illinois 60510 USA

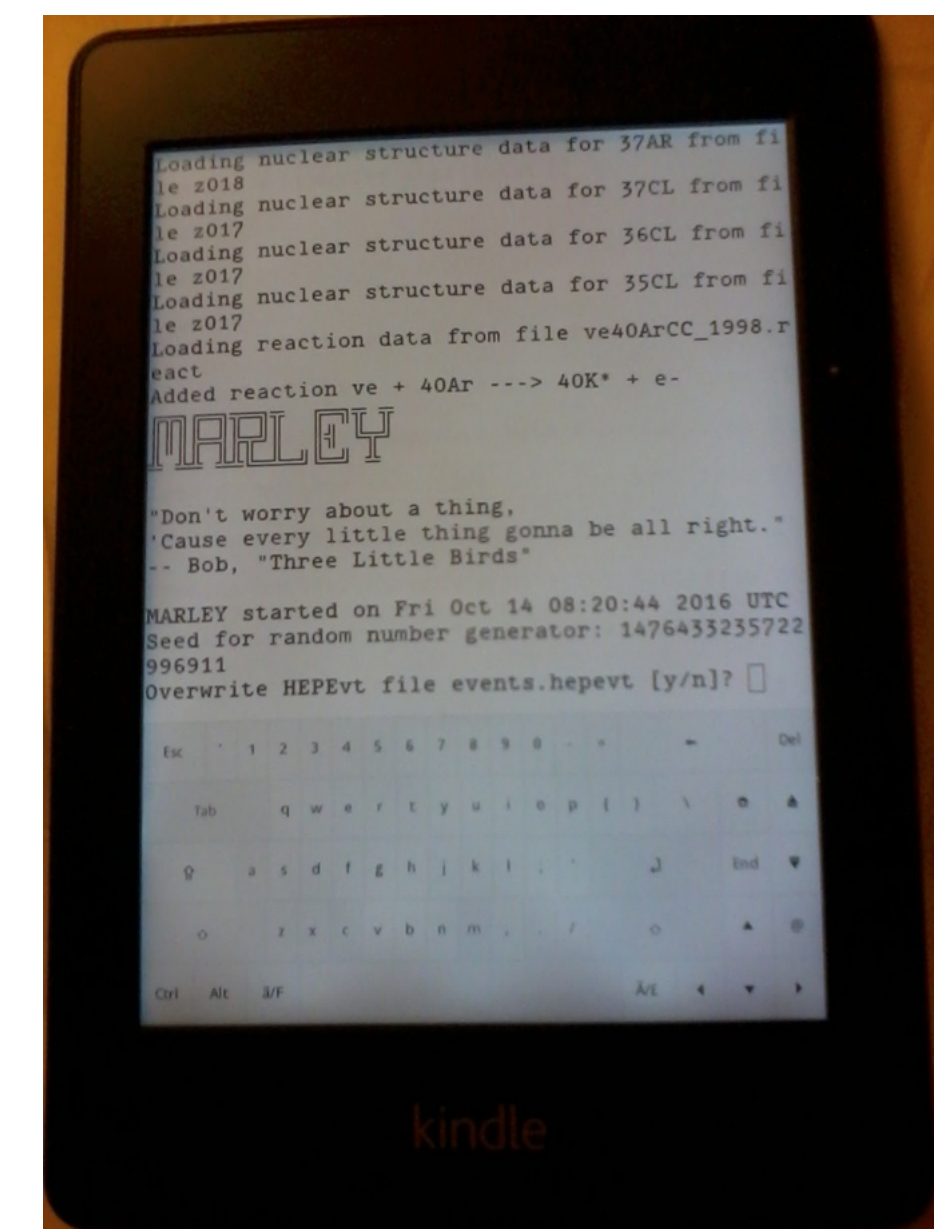
²Department of Physics, University of California, Davis,
One Shields Avenue, Davis, California 95616 USA

(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 (~ 10 MeV) electron neutrinos produced by core-collapse supernovae. Despite their importance for neutrino energy reconstruction, nuclear de-excitations following charged-current ν_e absorption on ^{40}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 γ -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

TABLE OF CONTENTS

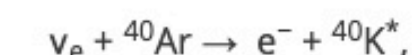
- Copyright and License
- Citing MARLEY
- Getting started
- Interpreting the output
- Bibliography
- GitHub repository
- Developer documentation
- News

[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 γ -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](#).

Inclusive scattering on the nucleus is simulated using this differential cross section:

$$\frac{d\sigma}{d\cos\theta_\ell} = \frac{G_F^2}{2\pi} \mathcal{F}_{CC} \left[\frac{E_i E_f}{s} \right] E_\ell |\mathbf{p}_\ell| \left[(1 + \beta_\ell \cos\theta_\ell) B(F) + \left(1 - \frac{1}{3}\beta_\ell \cos\theta_\ell\right) B(GT) \right]$$

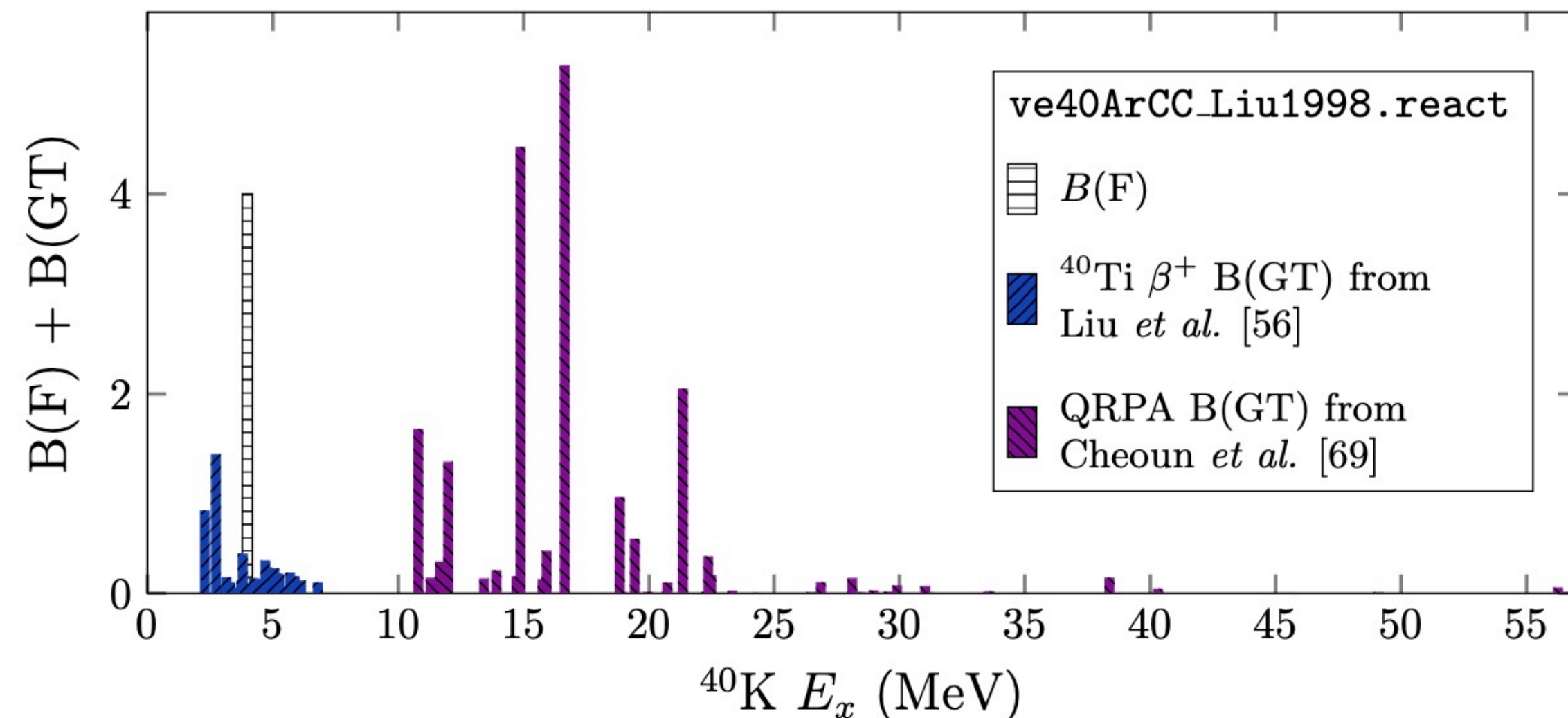
Charged current factor Recoil factor Allowed nuclear matrix elements

Expression above obtained under the impulse approximation and the **allowed approximation**

Long-wavelength limit: $q \rightarrow 0$

Slow nucleon limit: $\frac{|\mathbf{p}_{N_i}|}{m_N} \rightarrow 0$

Nuclear matrix elements must be supplied as input. For ^{40}Ar , they are based on a combination of **indirect measurements** (e.g., mirror β decay) and a **QRPA calculation**



Charged-current factor contains CKM matrix element and a Coulomb correction factor F_C . MARLEY handles Coulomb corrections using a combination of the Fermi function and the Modified Effective Momentum Approximation (MEMA).

$$\mathcal{F}_{CC} \equiv \begin{cases} |V_{ud}|^2 F_C & \text{CC} \\ 1 & \text{NC} \end{cases}$$

See [J. Engel, Phys. Rev. C 57, 2004 \(1998\)](#)

The code can handle **allowed matrix elements** for ν_e CC, $\bar{\nu}_e$ CC, and NC, but only inputs for ν_e CC are currently provided “out of the box”

$$\mathcal{O}_F \equiv \begin{cases} \sum_{n=1}^A t_{\pm}(n) & \text{CC} \\ Q_W/2 & \text{NC} \end{cases}$$

$$B(F) \equiv \frac{g_V^2}{2J_i + 1} \left| \langle J_f \parallel \mathcal{O}_F \parallel J_i \rangle \right|^2$$

$$B(GT) \equiv \frac{g_A^2}{2J_i + 1} \left| \langle J_f \parallel \mathcal{O}_{GT} \parallel J_i \rangle \right|^2$$

$$\mathcal{O}_{GT} \equiv \begin{cases} \sum_{n=1}^A \sigma(n) t_{\pm}(n) & \text{CC} \\ \sum_{n=1}^A \sigma(n) t_3(n) & \text{NC} \end{cases}$$

Hauser-Feshbach Model

W. Hauser and H. Feshbach, Physical Review **87**, 366 (1952)

- Successfully used for many years to describe low-energy nuclear cross sections
- Two key assumptions:
 1. compound nucleus
 2. reciprocity theorem (time-reversal invariance)

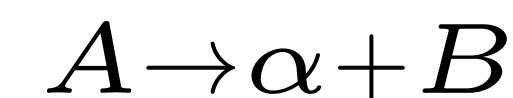
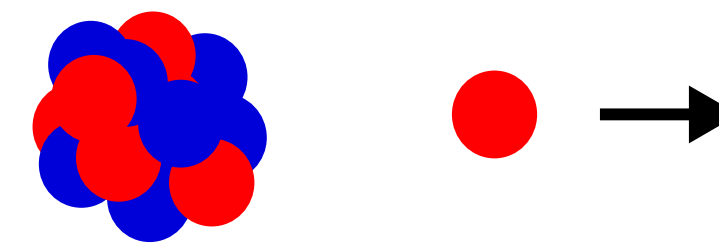
- Transmission coefficient $T_{\ell j}$ = probability for fragment to escape the nucleus

- Compound nucleus + time-reversal symmetry = $T_{\ell j}$ via “reciprocity”

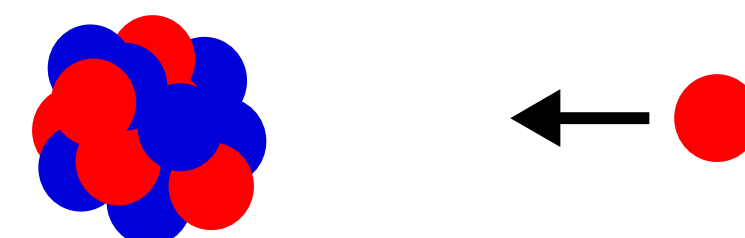
- Optical model is used to compute $T_{\ell j}$ for time-reversed process

- Numerical solution of Schrödinger equation via Numerov’s method

The fragment emission width of a compound nucleus



is related to its formation cross section



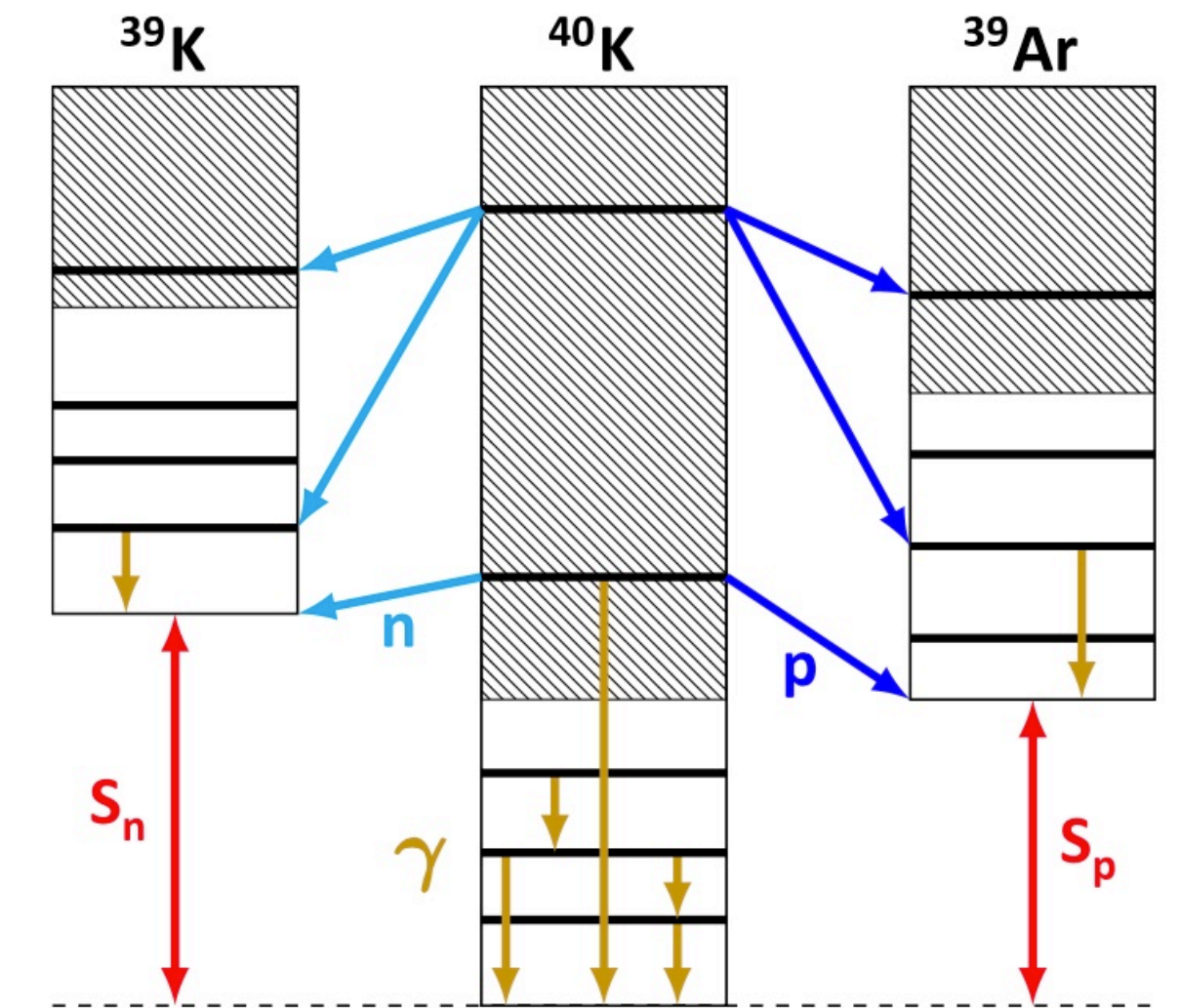
In the second step, the nucleus de-excites via a series of binary decays. Decay widths for **unbound states** are computed according to the Hauser-Feshbach formalism:

Differential decay width for emission of a nuclear fragment α ($A \leq 4$ considered)

$$\frac{d\Gamma_{\alpha}}{dE'_x} = \frac{1}{2\pi \rho_i(E_x, J, \Pi)} \sum_{\ell=0}^{\ell_{\max}} \sum_{j=|\ell-s|}^{\ell+s} \sum_{J'=|J-j|}^{J+j} T_{\ell j}(\varepsilon) \rho_f(E'_x, J', \Pi')$$

Differential decay width for emission of a γ -ray

$$\frac{d\Gamma_{\gamma}}{dE'_x} = \frac{1}{2\pi \rho_i(E_x, J, \Pi)} \sum_{\lambda=1}^{\lambda_{\max}} \sum_{J'=|J-\lambda|}^{J+\lambda} \sum_{\Pi' \in \{-1, 1\}} T_{X\lambda}(E_{\gamma}) \rho_f(E'_x, J', \Pi')$$



Level density model: Back-shifted Fermi gas (RIPL-3), [Nucl. Data Sheets 110, 3107–3214 \(2009\)](#)

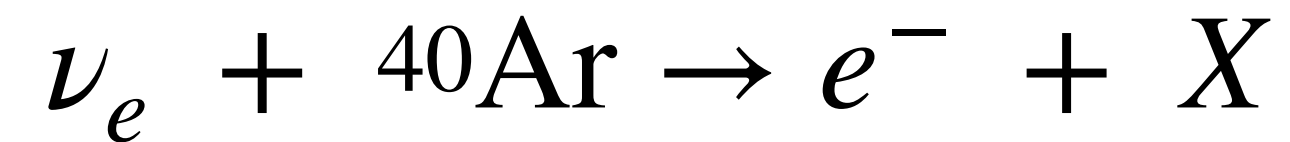
Nuclear optical model: Koning & Delaroche, [Nucl. Phys. A 713, 231–310 \(2003\)](#)

Gamma-ray strength function model: Standard Lorentzian (RIPL-3), [Nucl. Data Sheets 110, 3107–3214 \(2009\)](#)

Supplemented with tabulated discrete levels and γ -rays for **bound states** (taken from TALYS 1.6). Transitions from continuum to all accessible levels are explicitly treated.

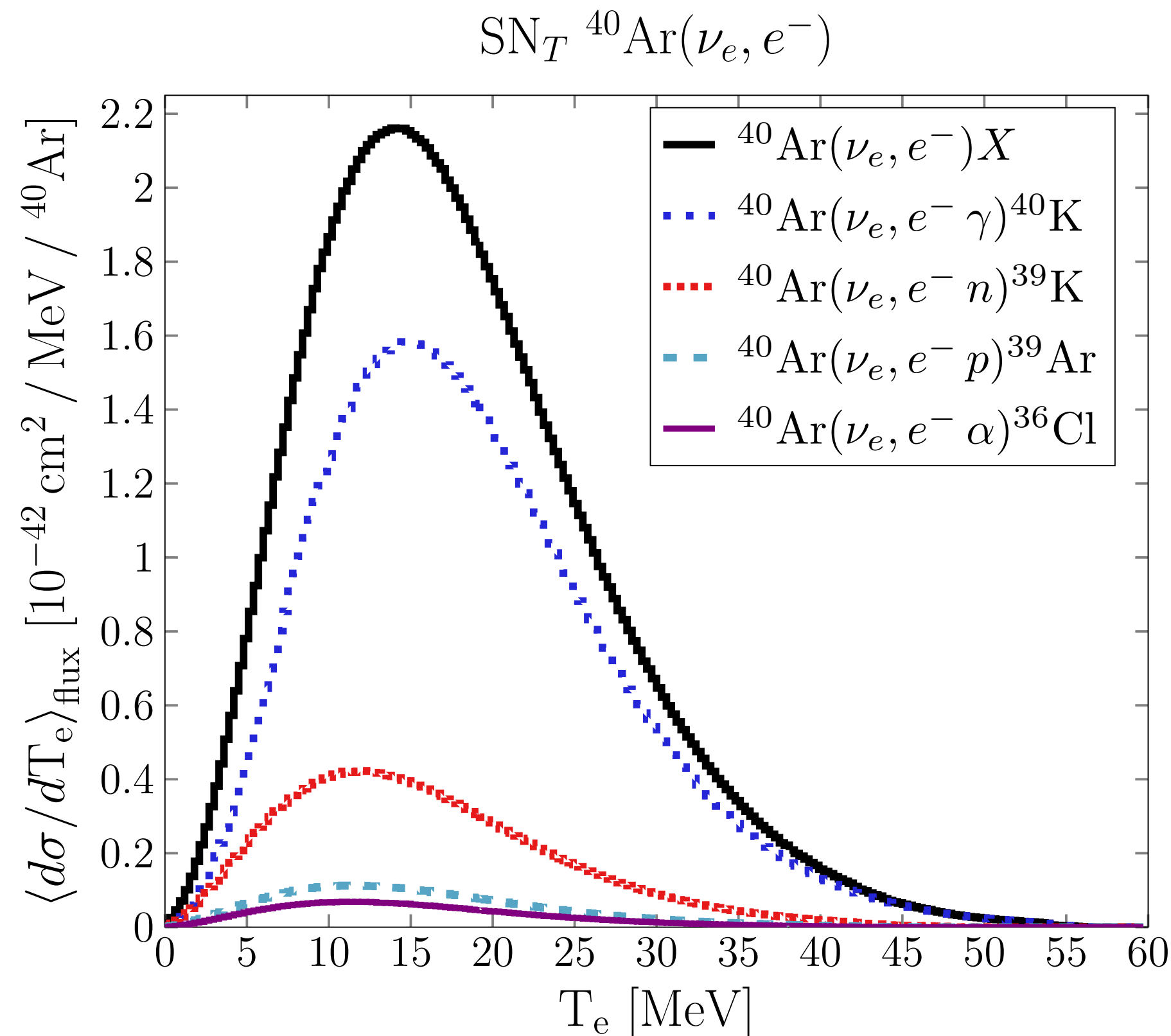
MARLEY v1.2.0 predictions for ^{40}Ar

- First calculation of cross sections for **exclusive final states** of the reaction

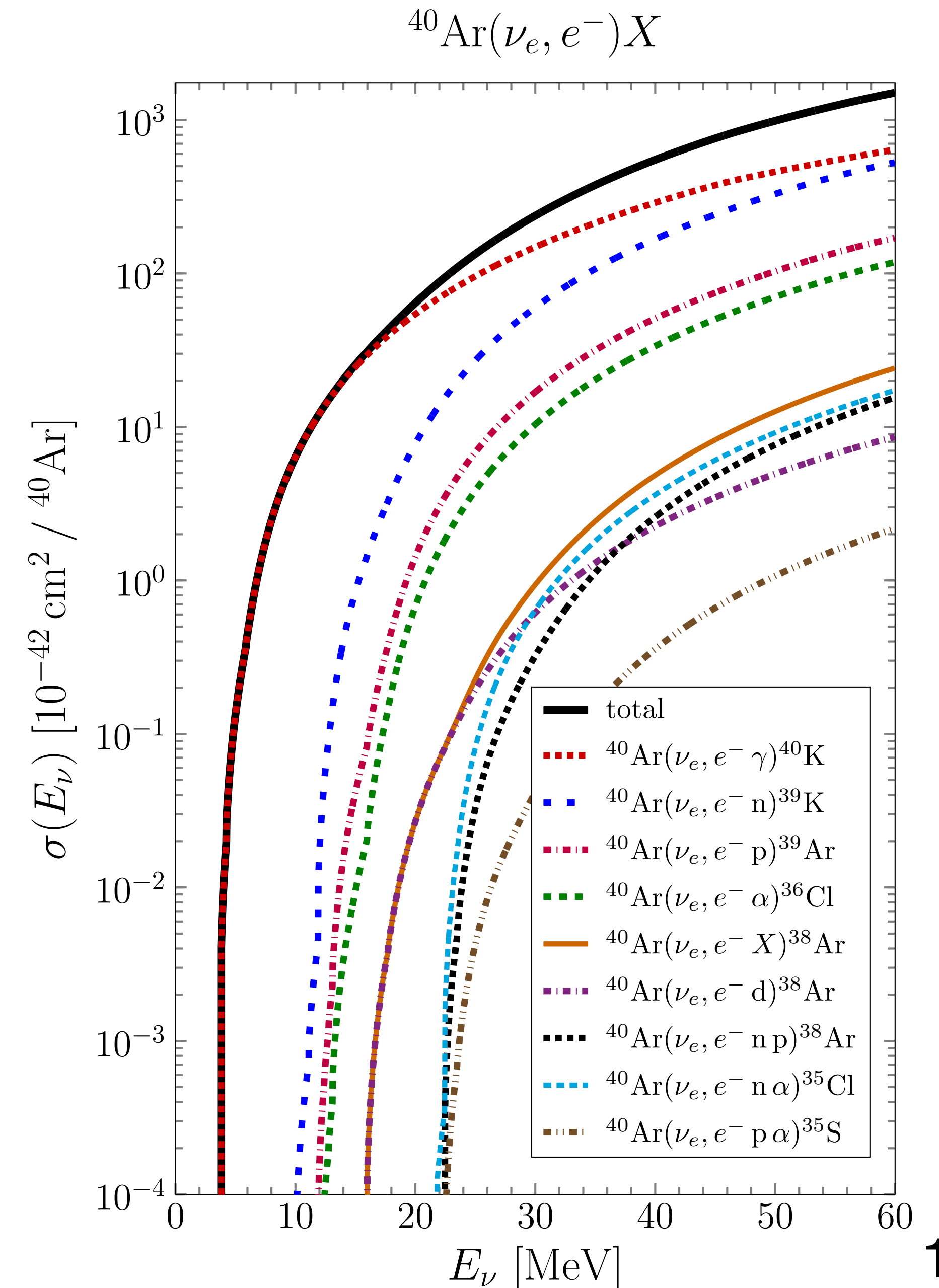


at tens-of-MeV energies.

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



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



Uncertainties overview

- Limited out-of-the-box support
 - Handful of configurable parameters
 - Edits to input data
- **Shortcuts** in model choices biggest concern
 - Easier to quantify on model ingredients
- **Reweighting** is standard approach
 - Will point out where this is tricky
- More attention needed from both theory & experiment

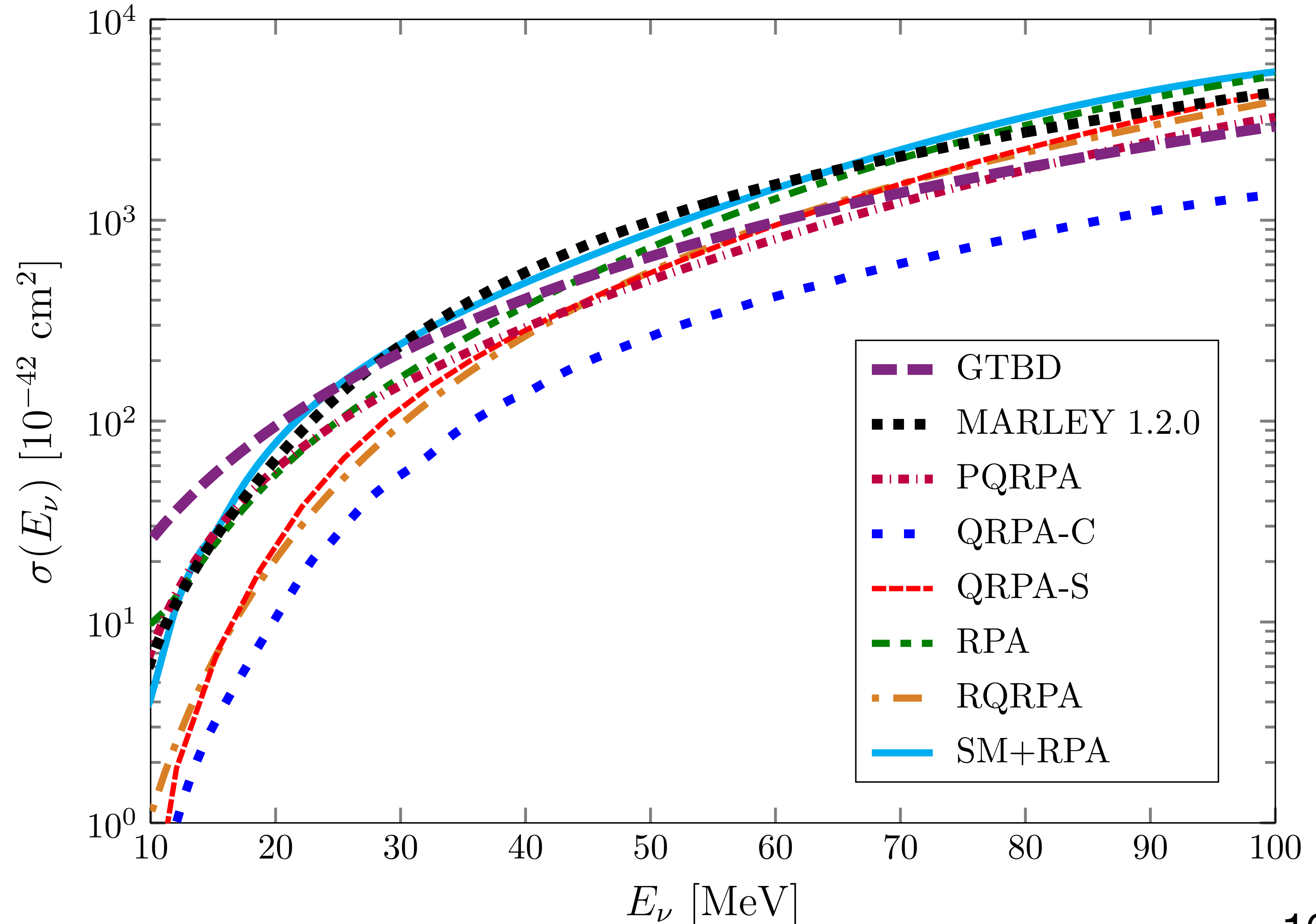


Other perspectives welcome!

Total cross section (1)

- No direct data, calculations benchmarked with other nuclei, beta decay, etc.
- “Spread of models” approach used in first **DUNE toy study**
- Reweightable except below MARLEY threshold

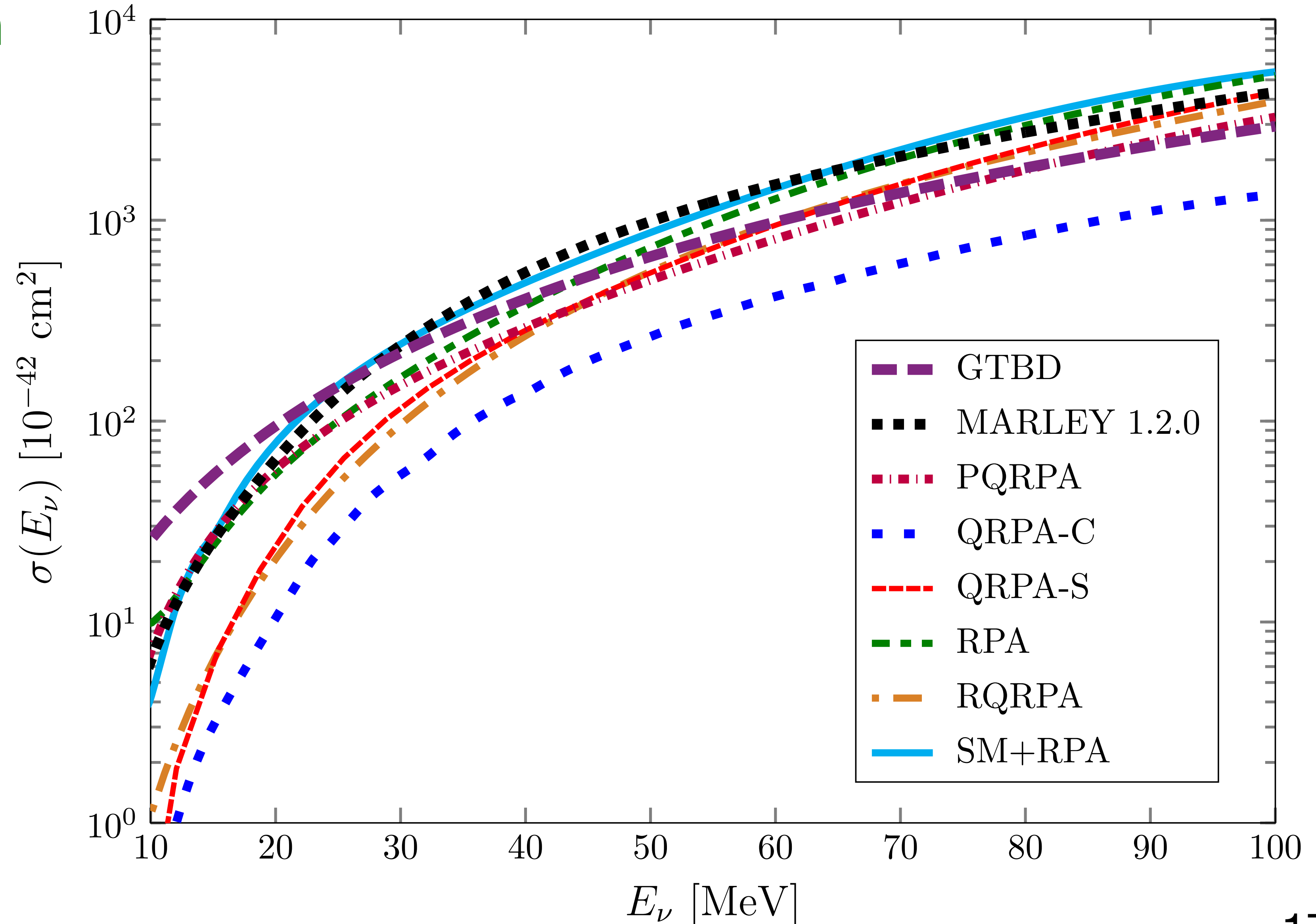
$^{40}\text{Ar}(\nu_e, e^-)X$ total cross section



Total cross section (2)

- **Allowed approximation** (AA) better than it deserves to be
- $j_L(|\mathbf{q}|r)$ dependence in matrix element
 - $L = 0$ survives in AA
- Neglects forbidden but overestimates allowed for $|\mathbf{q}| \neq 0$

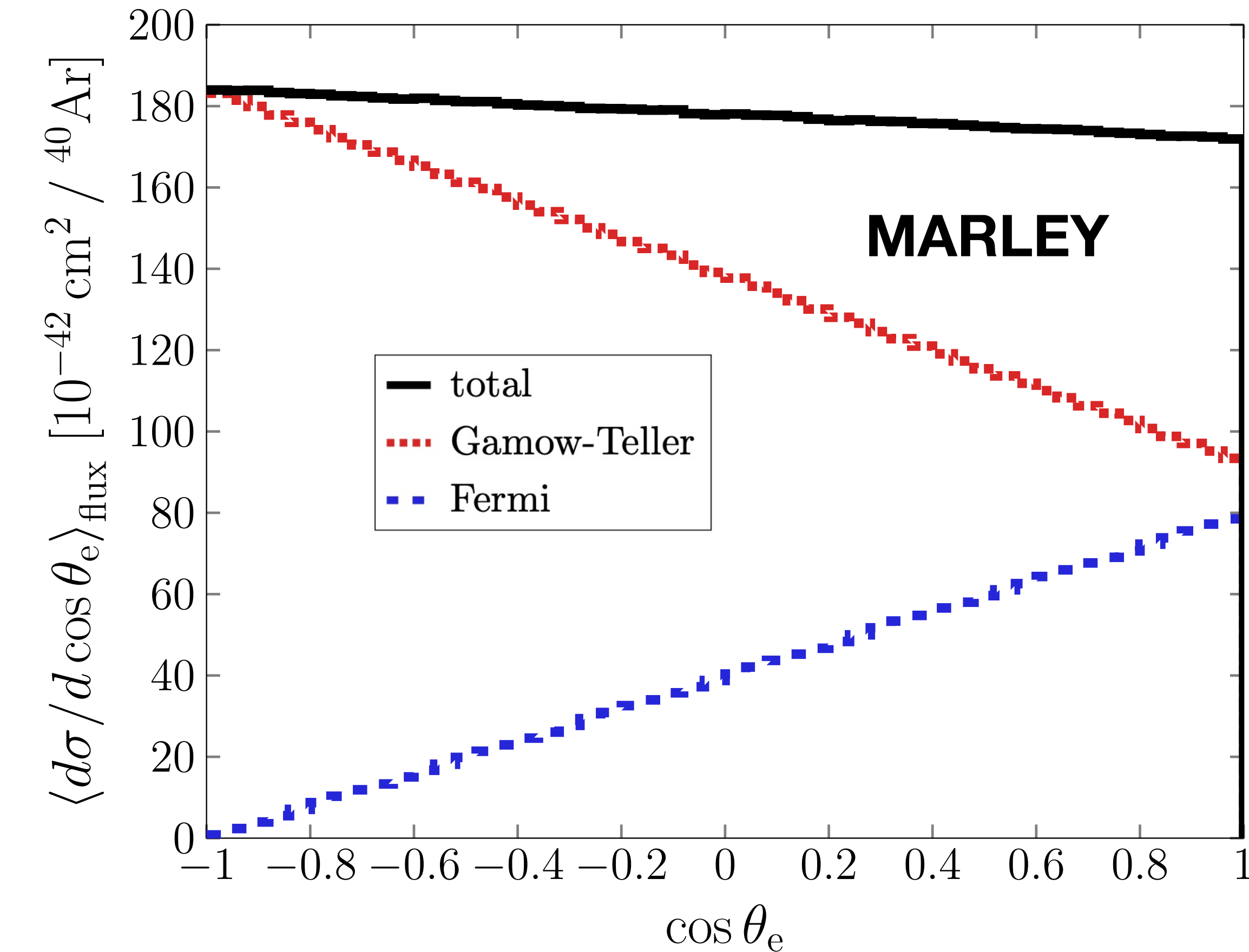
$^{40}\text{Ar}(\nu_e, e^-)X$ total cross section



Inclusive angular distribution

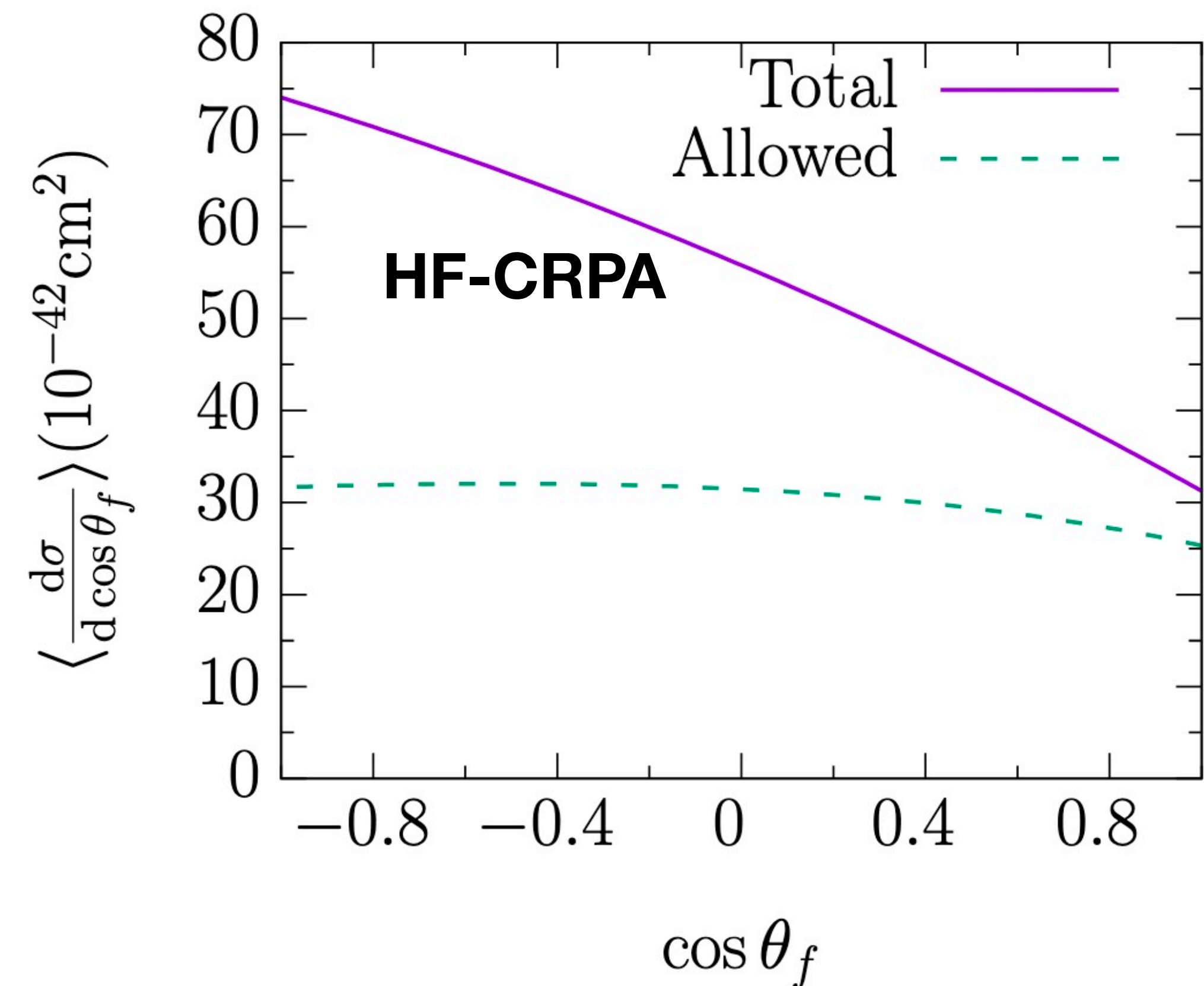
- AA under-predicts backwards strength (interesting for supernova pointing)
- Reweightable, should be done in 2D together with T_f

$\mu\text{DAR } ^{40}\text{Ar}(\nu_e, e^-)X$



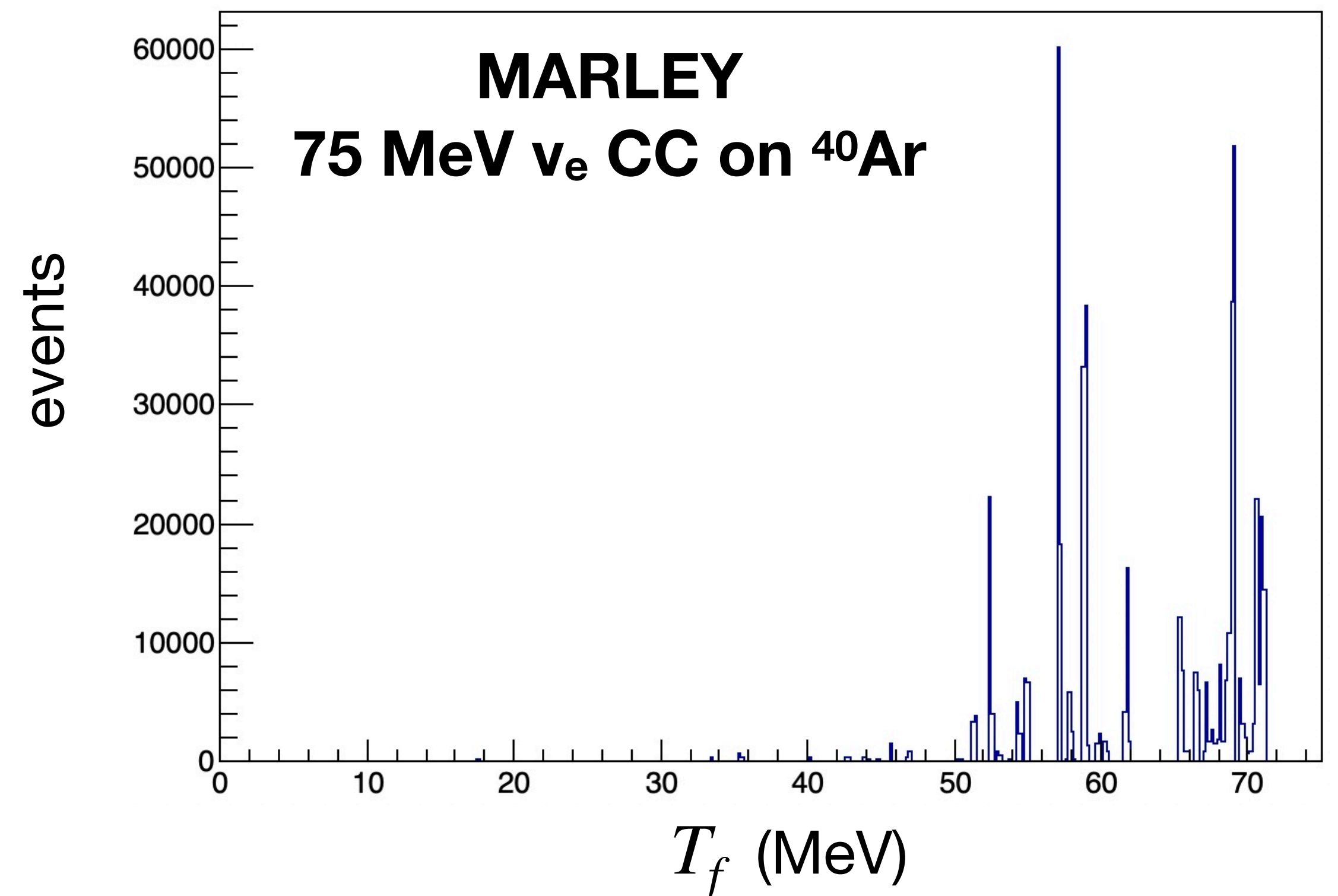
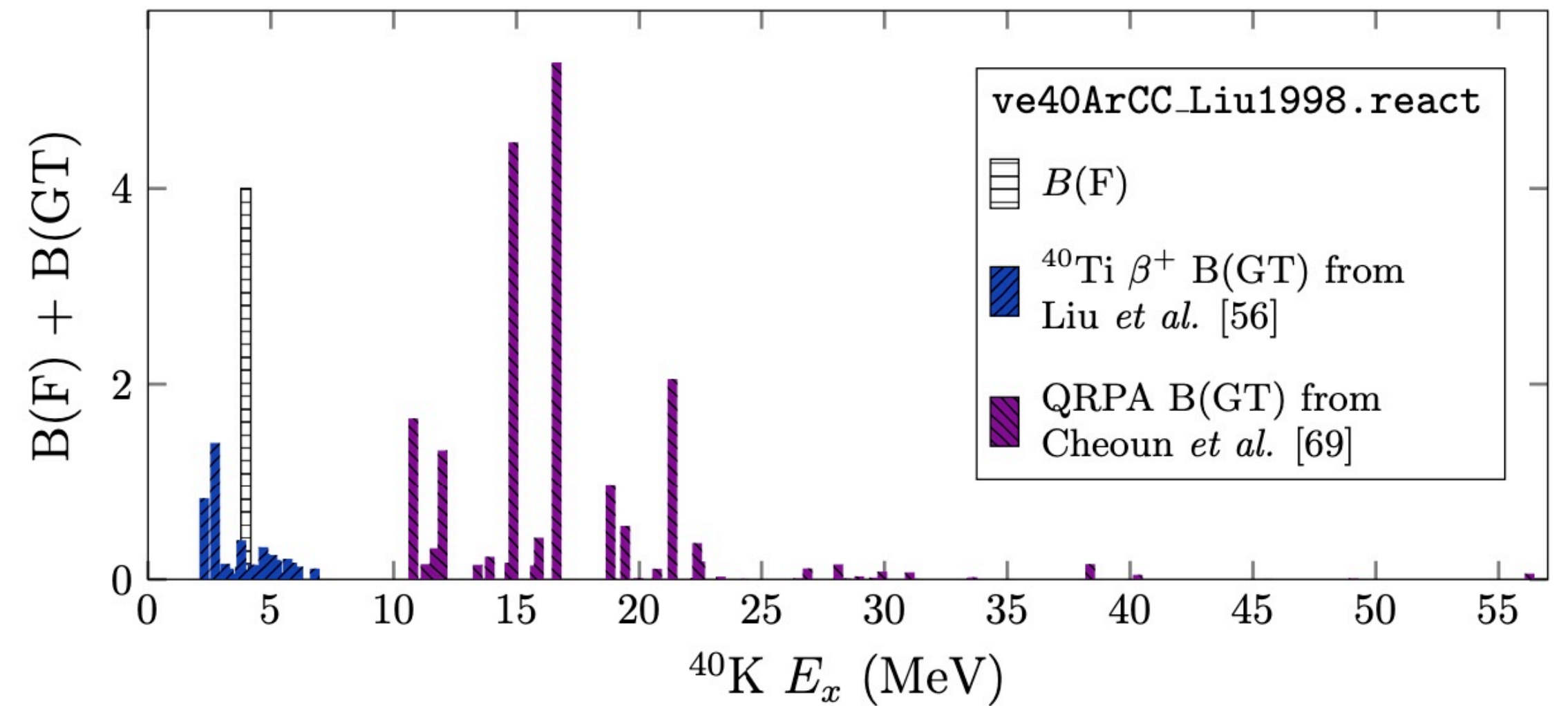
[Phys. Rev. C 101, 045502 \(2020\)](#)

CC ($\nu_e, ^{40}\text{Ar}$)



Final-state lepton energy distribution

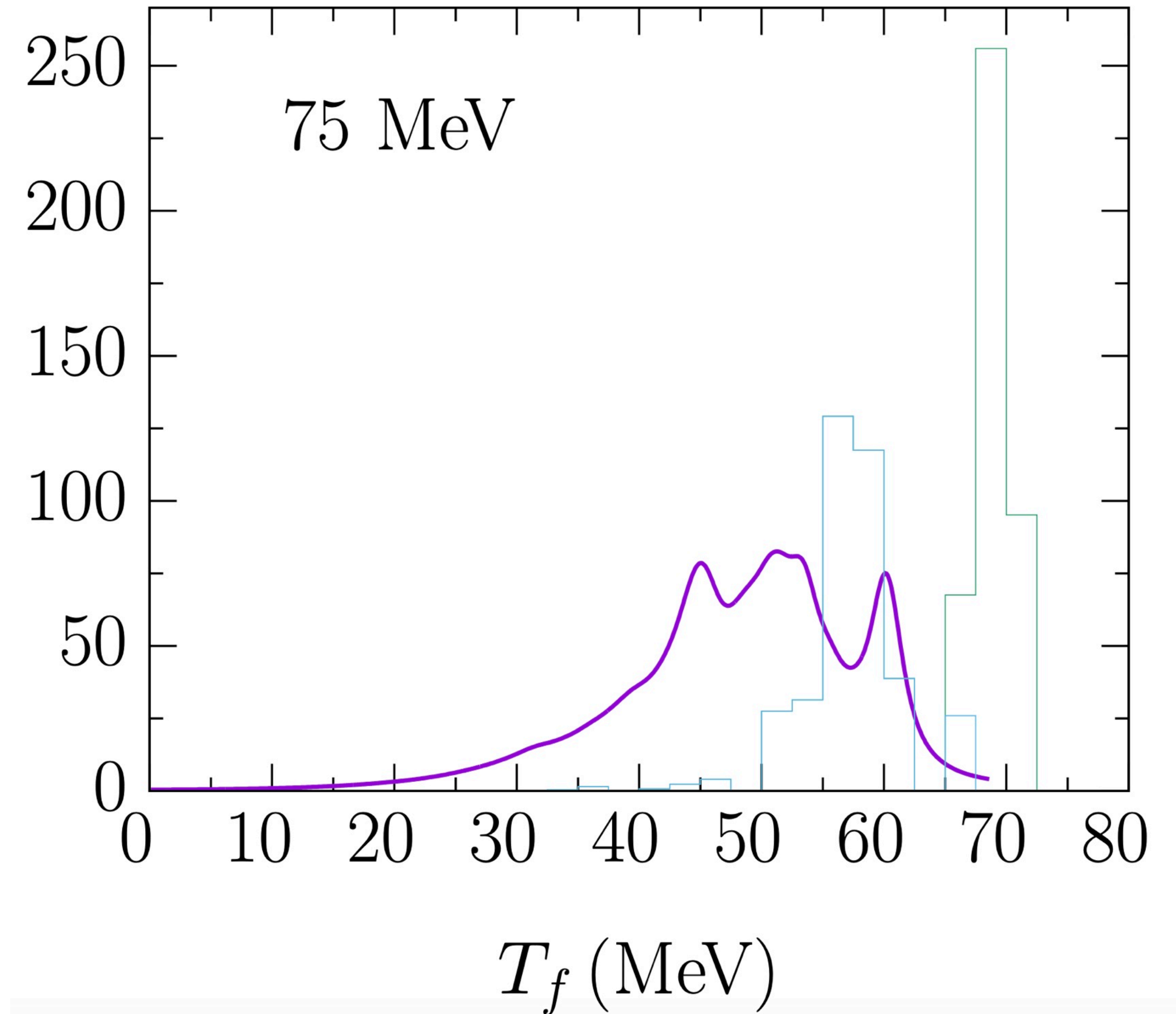
- MARLEY currently takes tabulated matrix elements at face value
 - Discrete E_x values even in the continuum
 - Leads to **lines** in T_f for monoenergetic ν , some not real
- Matched to measured levels in discrete region, no correction in continuum
- Only fully reweightable between models if the nuclear level placement is the same



Final-state lepton energy distribution

- MARLEY currently takes tabulated matrix elements at face value
 - Discrete E_x values even in the continuum
 - Leads to **lines** in T_f for monoenergetic ν , some not real
- Matched to measured levels in discrete region, no correction in continuum
- Only fully reweightable between models if the nuclear level placement is the same

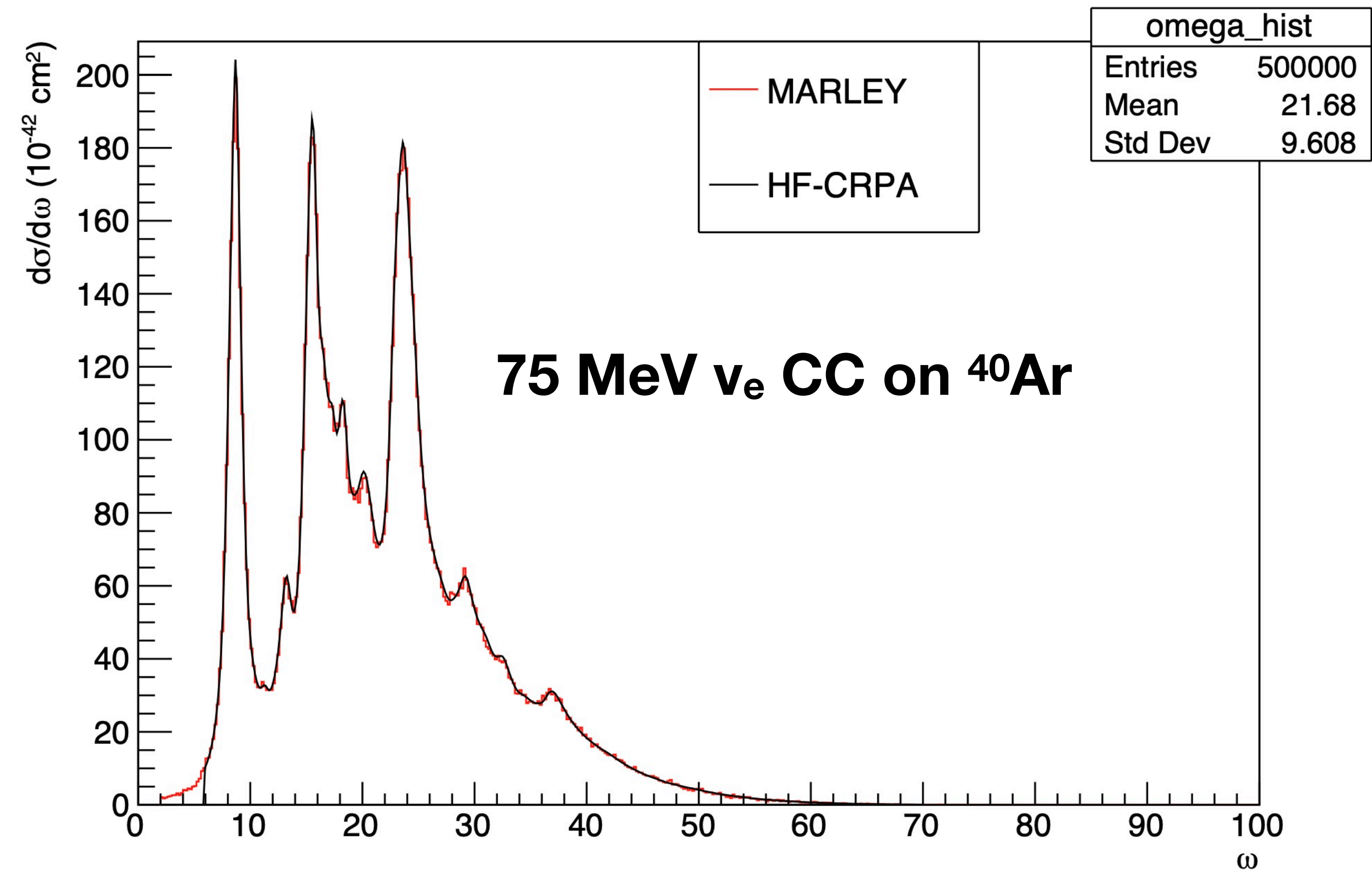
[Phys. Rev. C 101, 045502 \(2020\)](#)



HF-CRPA prediction compared to **MARLEY** (discrete piece in **green**)

HF-CRPA as an improvement

- **New code** reproduces HF-CRPA inclusive cross section
 - Continuum treated as such
 - Includes forbidden transitions
- Will be reweightable to other predictions with proper continuum and discrete level treatments
- Work in progress. Still need
 - Strength to discrete levels
 - Handling of HF-CRPA cross section below measured nucleon separation threshold

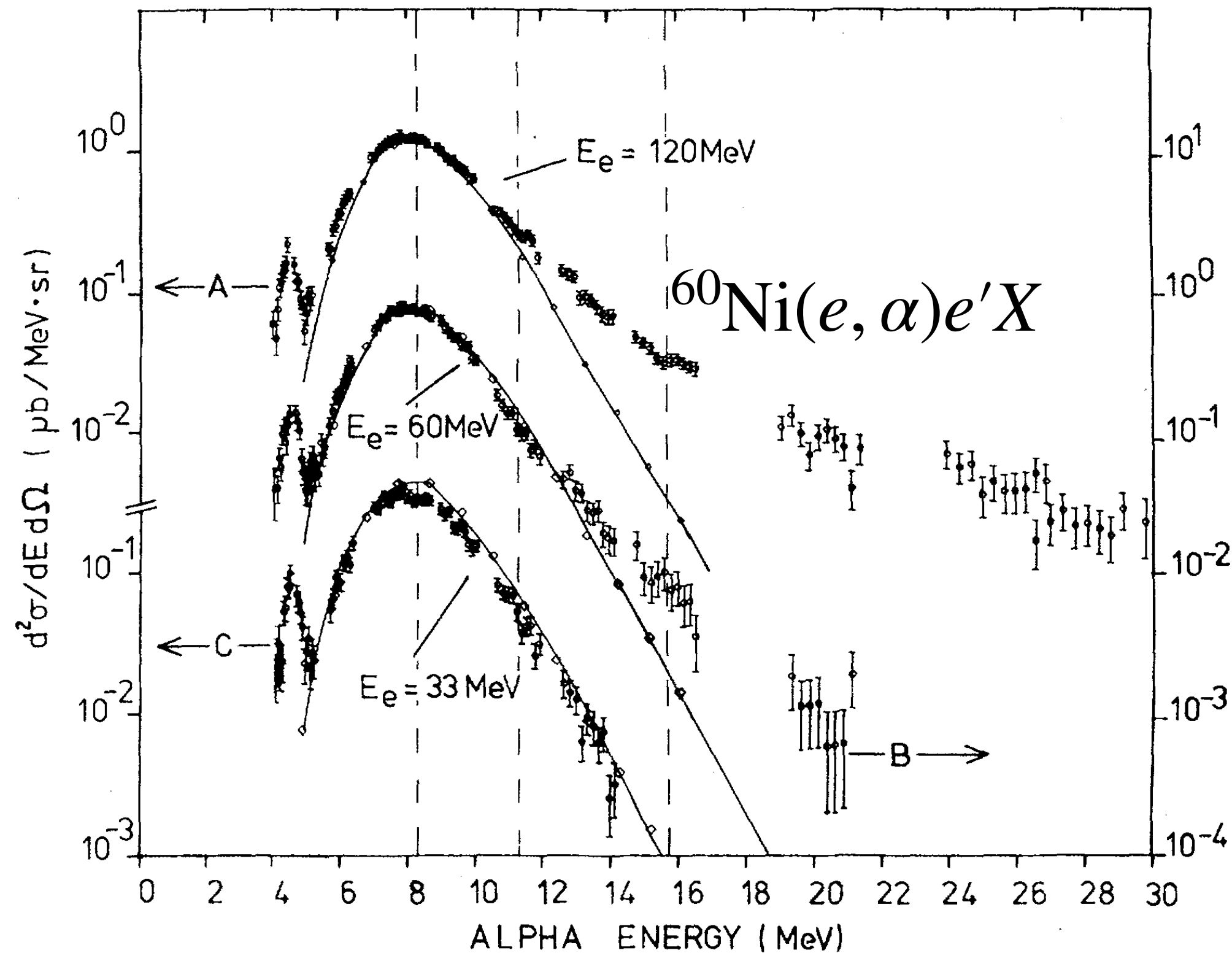


Many thanks to Alexis for providing the nuclear responses and helpful guidance

De-excitation uncertainties

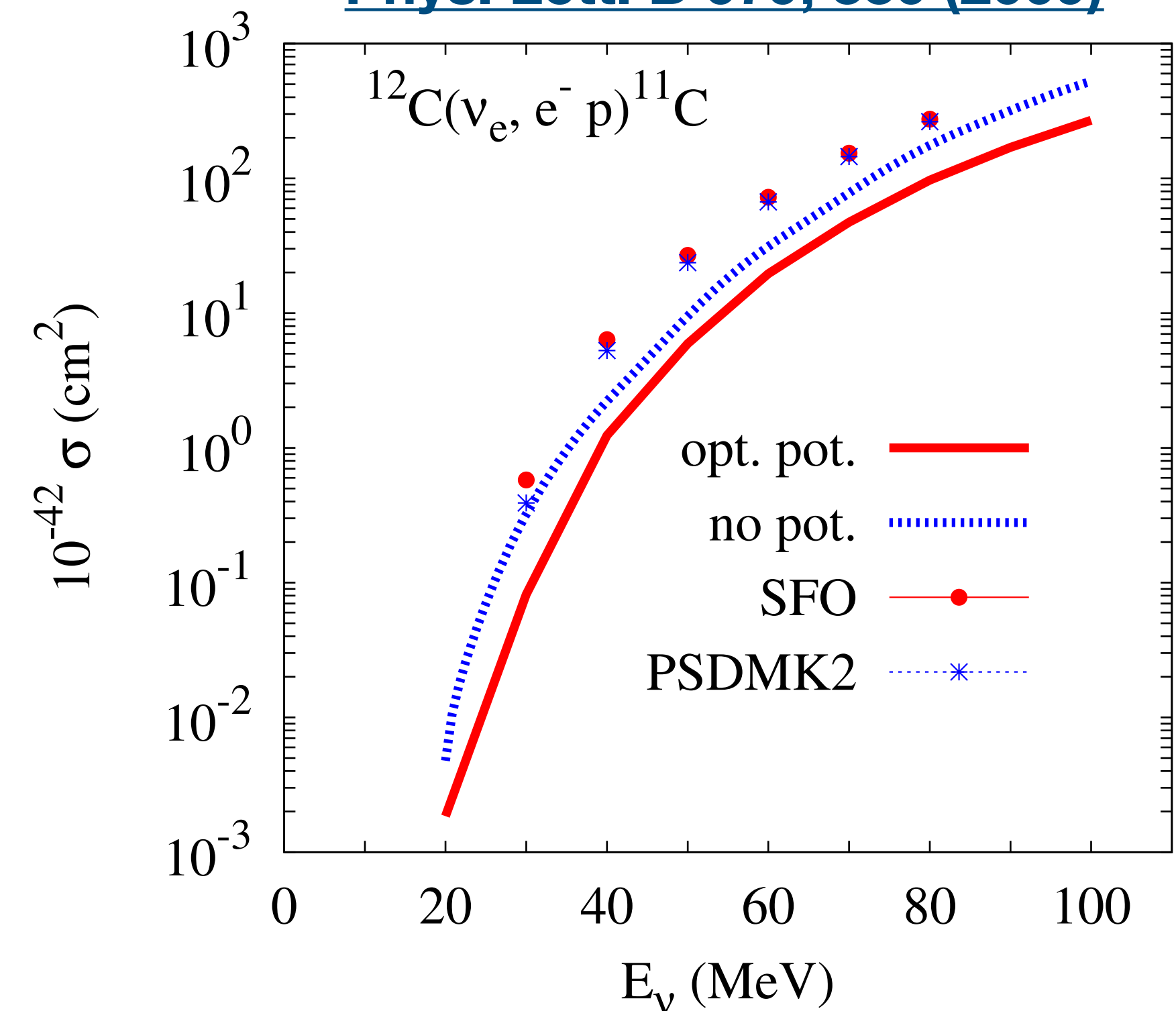
- **Big picture:** compound nucleus assumption is basically universal in O(10 MeV) literature
 - How severe is it as an approximation?
 - This matters: **neutron emission** limits neutrino energy resolution, needs to be well-modeled

[Phys. Rev. Lett. 40, 709 \(1978\)](#)



Compound nucleus calculation shows excellent agreement at $E_e = 33\text{ MeV}$, which worsens as the electron energy increases

[Phys. Lett. B 679, 330 \(2009\)](#)

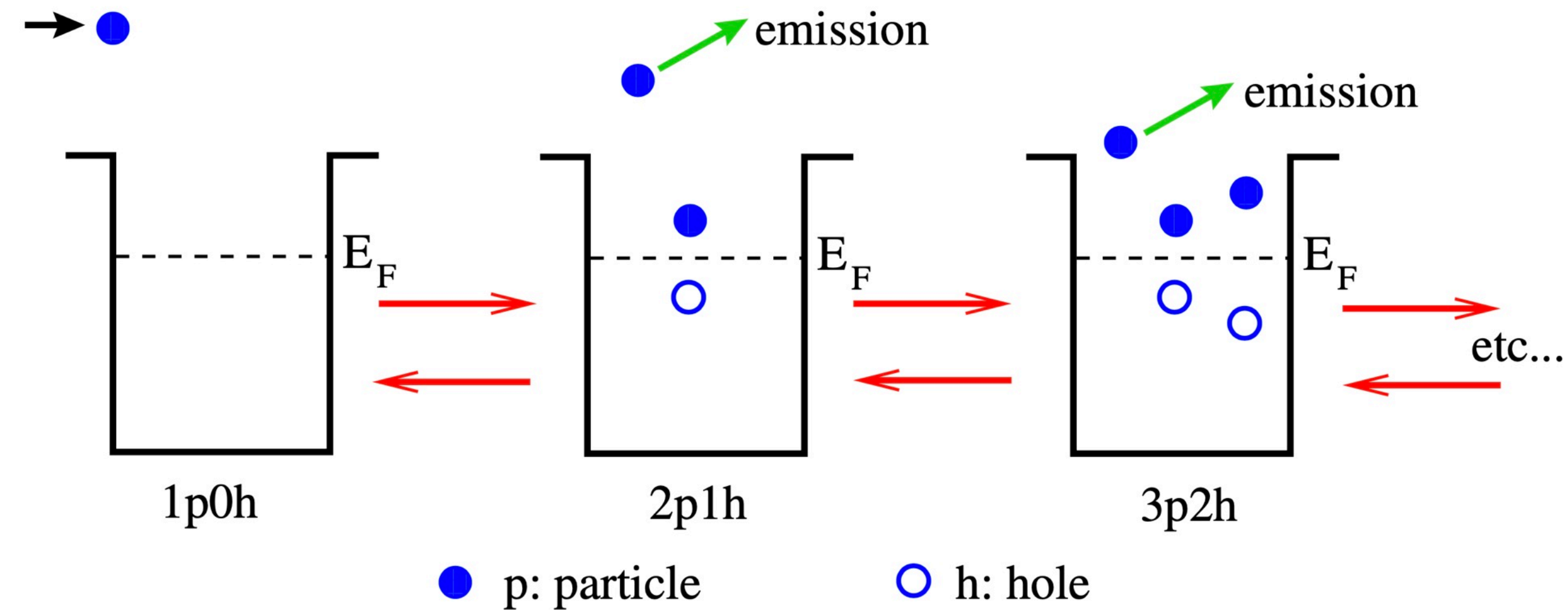


Two-step cross section (points, shell model + compound nucleus) dominates over direct knockout (solid red line).

Turning off FSIs gets closer (dashed blue line).

What other components might be needed?

- **Pre-equilibrium** particle emission
 - Often treated with an **exciton model**
 - Appears unexplored for low-energy v-A
 - Some work on muon capture, e.g., [Phys. Rev. C 107, 054314 \(2023\)](#)
 - MARLEY treatment in early development



- **Direct knockout** contribution
 - Coupled to a de-excitation model in multiple high-energy codes:
GiBUU + SMM
NuWro/GENIE + INCL + ABLA
FLUKA (PEANUT)
 - Implementation could perhaps be added in a similar style

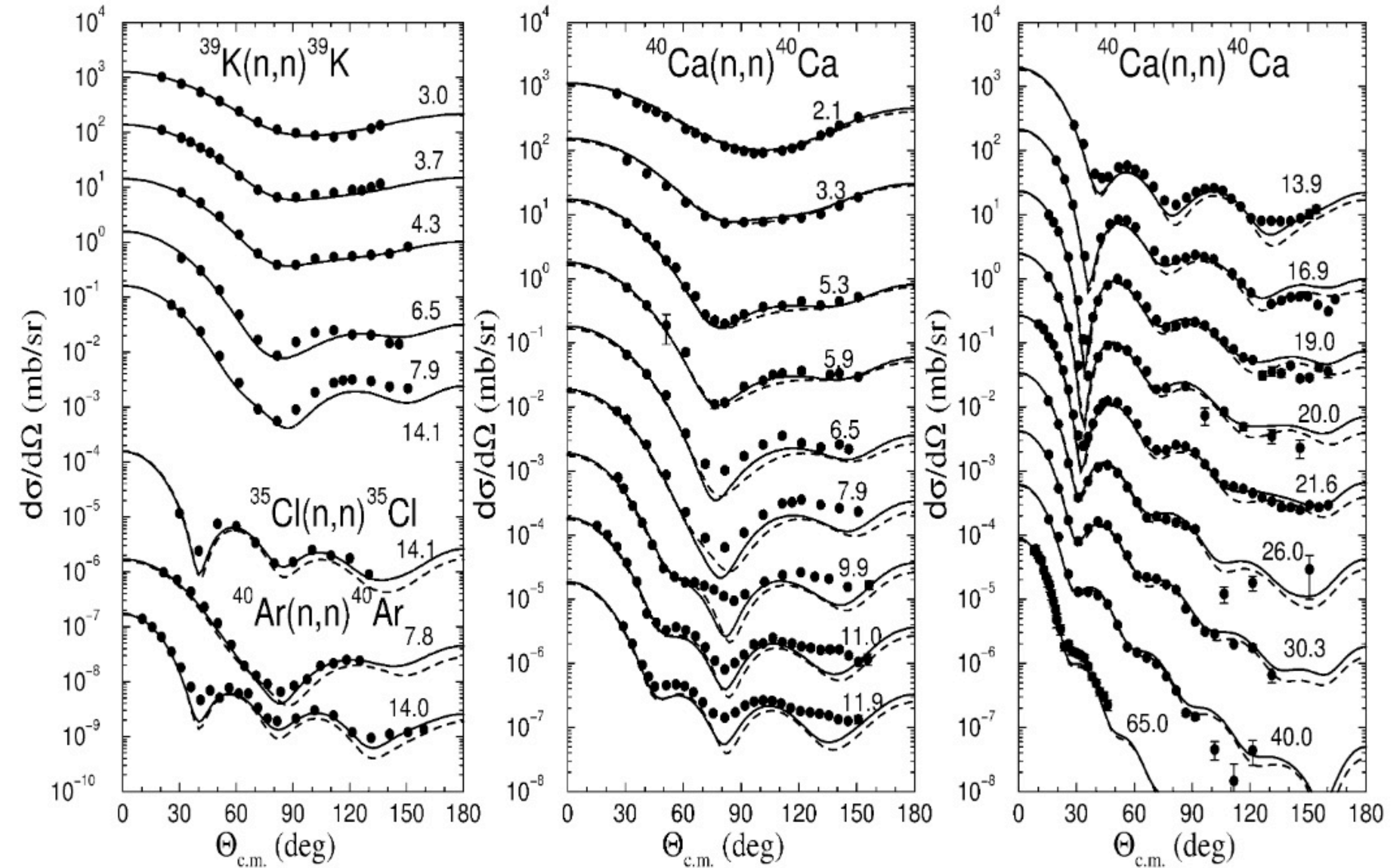
Some exciton model ingredients are shared with compound nucleus (e.g., optical potential)

See recent paper using NuWro + INCL + ABLA
[arXiv:2309.05410](#) (accepted by PRD)

Compound nucleus model ingredients

- MARLEY's nuclear level densities, **optical model**, and γ -ray strength functions are all based on semi-empirical models
 - Global parameter fits across chart of nuclides
 - **No detailed fit uncertainties**
- Alternative parameterizations exist, could be implemented in code framework with some effort
- Redoing fits (just near $A = 40$?) would be very labor-intensive
- **Reweighting mostly straightforward** for relevant parameters

[Nucl. Phys. A 713, 231–310 \(2003\)](#)



Dashed line is the global fit that MARLEY currently uses.
Solid lines are local fits to specific nuclei.

NuHepMC as an “enabling technology”

- Proposed universal event format for neutrino generators
- Lower barriers to entry in experimental production, generator/data comparisons
- Please throw tomatoes so we can improve the standard 🍅🍅
- Full de-excitation history now recorded in MARLEY, step towards reweighting

NuHepMC: A standardized event record format for neutrino event generators

S. Gardiner^a, J. Isaacson^a, L. Pickering^b

^a*Fermi National Accelerator Laboratory, P.O. Box 500, Batavia, IL 60510, USA*

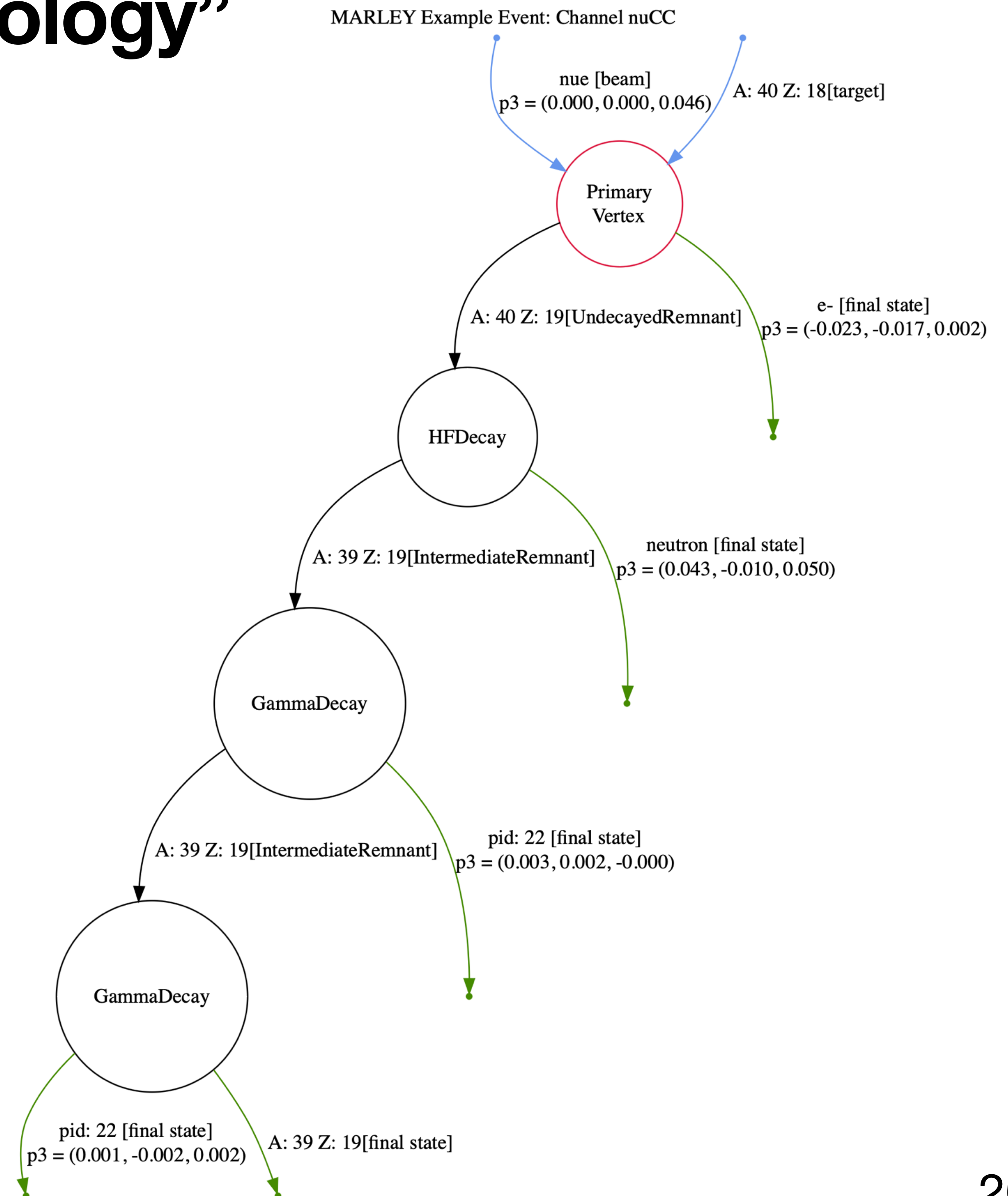
^b*STFC, Rutherford Appleton Laboratory, Harwell Oxford, United Kingdom*

Abstract

Simulations of neutrino interactions are playing an increasingly important role in the pursuit of high-priority measurements for the field of particle physics. A significant technical barrier for efficient development of these simulations is the lack of a standard data format for representing individual neutrino scattering events. We propose and define such a universal format, named NuHepMC, as a common standard for the output of neutrino event generators. The NuHepMC format uses data structures and concepts from the HepMC3 event record library adopted by other subfields of high-energy physics. These are supplemented with an original set of conventions for generically representing neutrino interaction physics within the HepMC3 infrastructure.

NuHepMC as an “enabling technology”

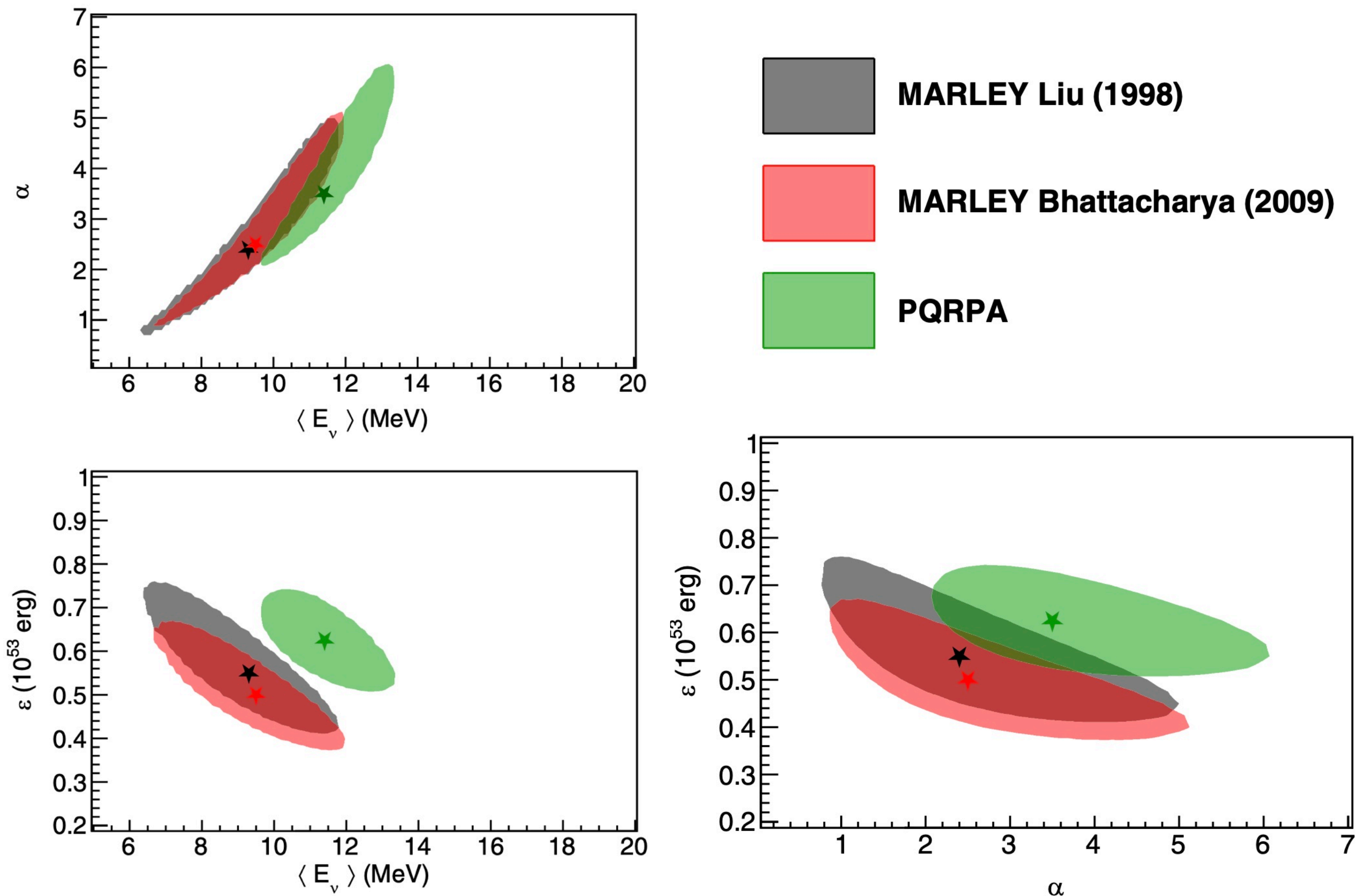
- Proposed universal event format for neutrino generators
- Lower barriers to entry in experimental production, generator/data comparisons
- Please throw tomatoes so we can improve the standard 🍅🍅
- **Full de-excitation history** now recorded in MARLEY, step towards reweighting



Recent study for DUNE: $\sigma(E_\nu)$ uncertainty only

[Phys. Rev. D 107, 112012 \(2023\)](#)

- **Toy analysis** seeks to extract flux parameters from simulated DUNE supernova neutrino data
- \mathcal{E} = energy release (erg)
- $\langle E_\nu \rangle$ = mean neutrino energy (MeV)
- α = shape parameter (dimensionless)



Current understanding of $\sigma(E_\nu)$ is **inadequate**.

Measuring \mathcal{E} (other parameters) to 10% requires 5% (20%) knowledge of the cross section!

Conclusion

- Interaction simulations are critical for supernova neutrino measurements, especially ν_e in DUNE
- More work needed to fully quantify uncertainties, this talk suggests some first steps
- Low-energy neutrino cross-section data and theory work to interpret it both needed

