

# An overview of nuclear Quantum Monte Carlo

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**Università degli Studi Roma 3**

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Alessandro Lovato

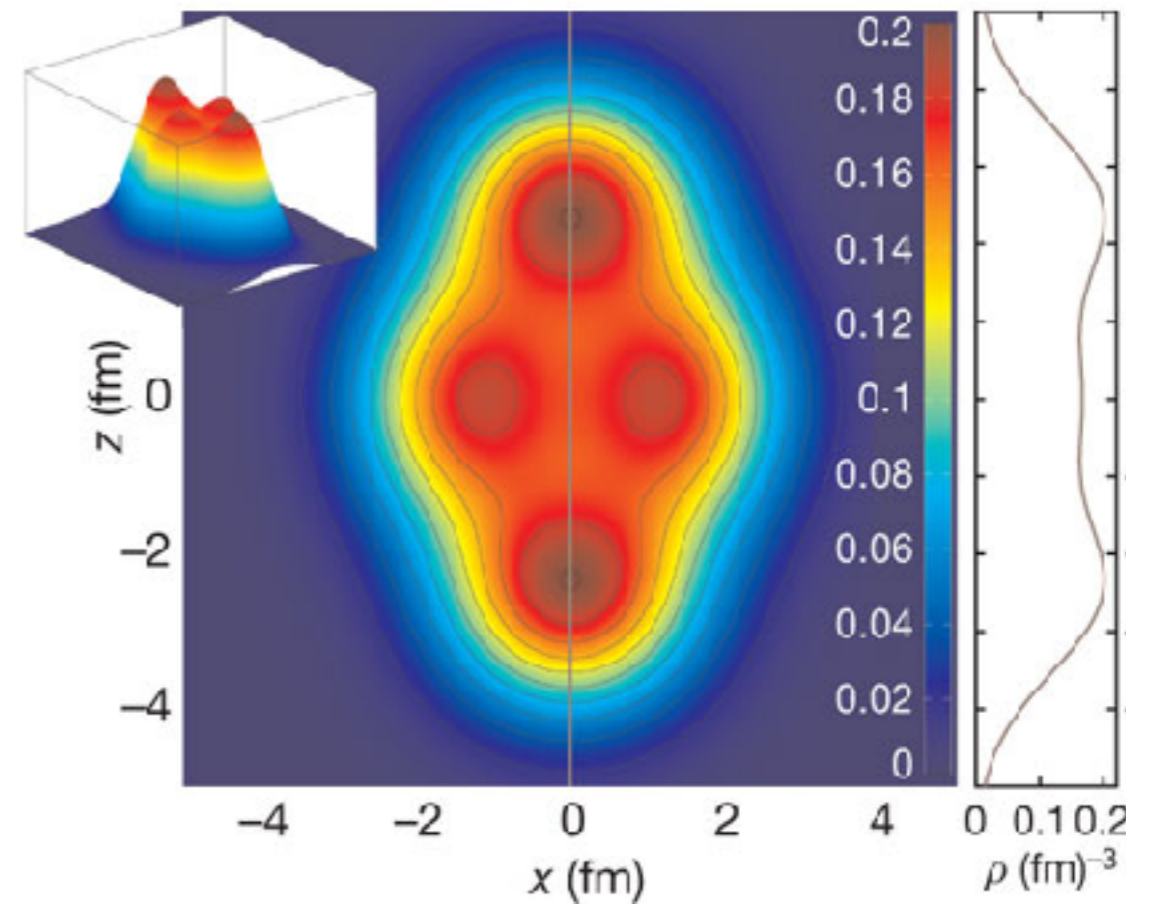
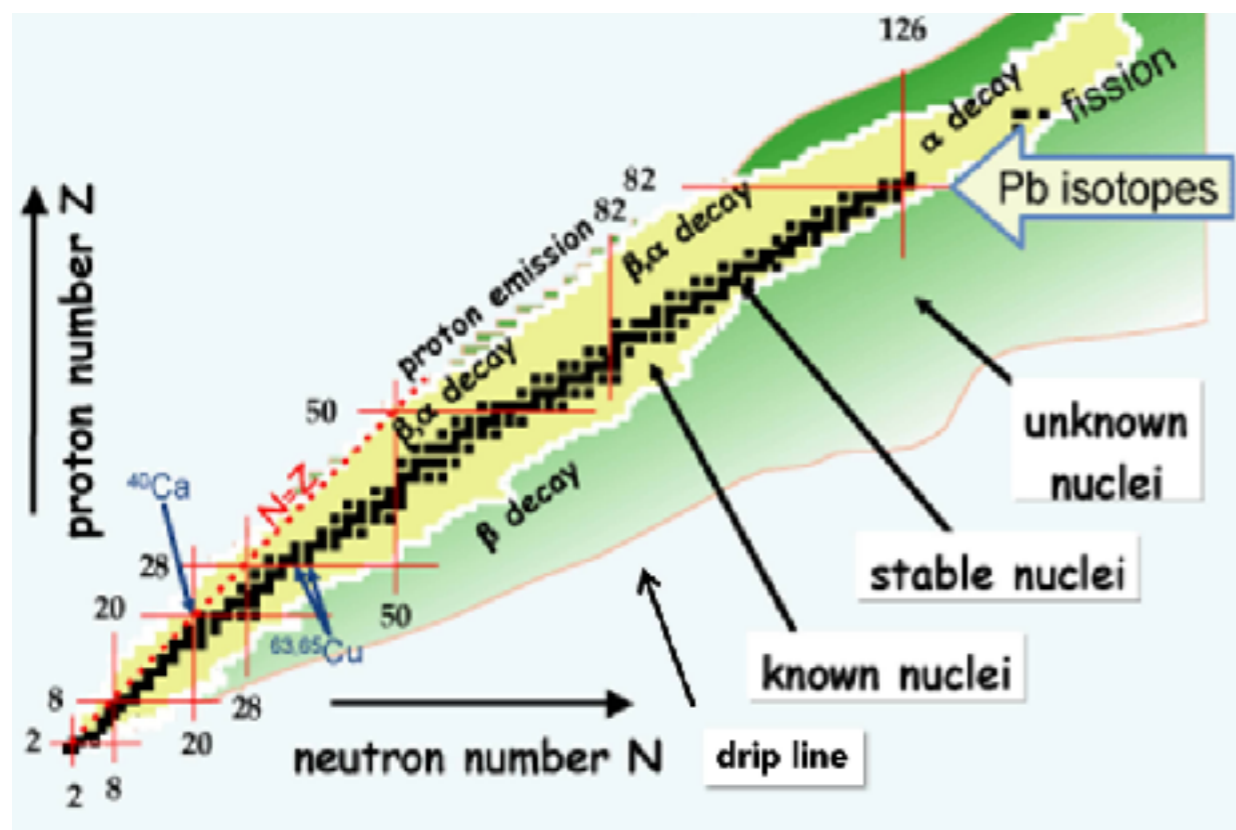


In collaboration with:

O. Benhar, J. Carlson, S. Gandolfi, N. Rocco, and R. Schiavilla

# Introduction

Atomic nuclei are **strongly interacting many-body systems** exhibiting fascinating properties including: shell structure, pairing and superfluidity, deformation, and self-emerging clustering.

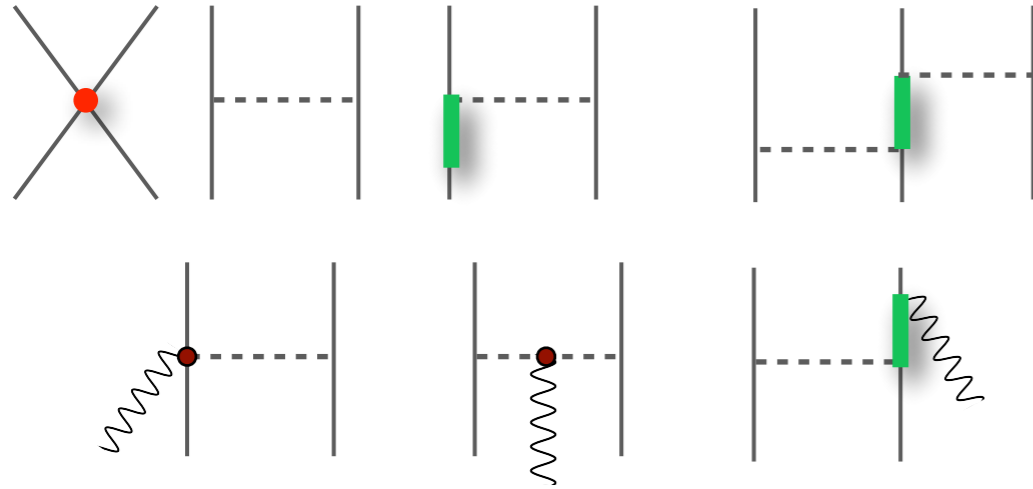


Understanding their **structure, reactions, and electroweak properties** within a unified framework well-rooted in quantum chromodynamics has been a long-standing goal of nuclear physics.



# The microscopic model of nuclear theory

Effective Hamiltonians and consistent currents

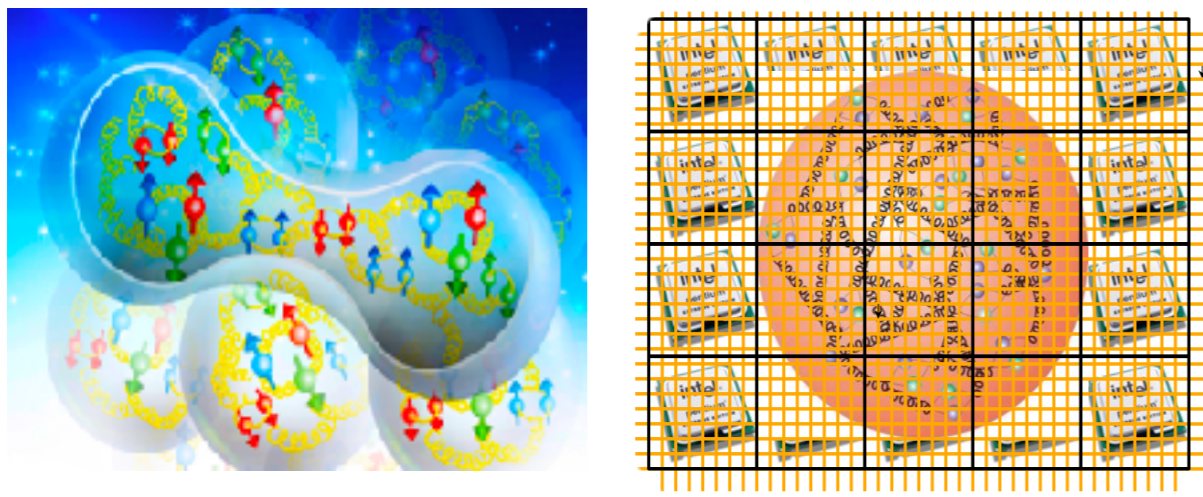


Accurate nuclear many-body methods

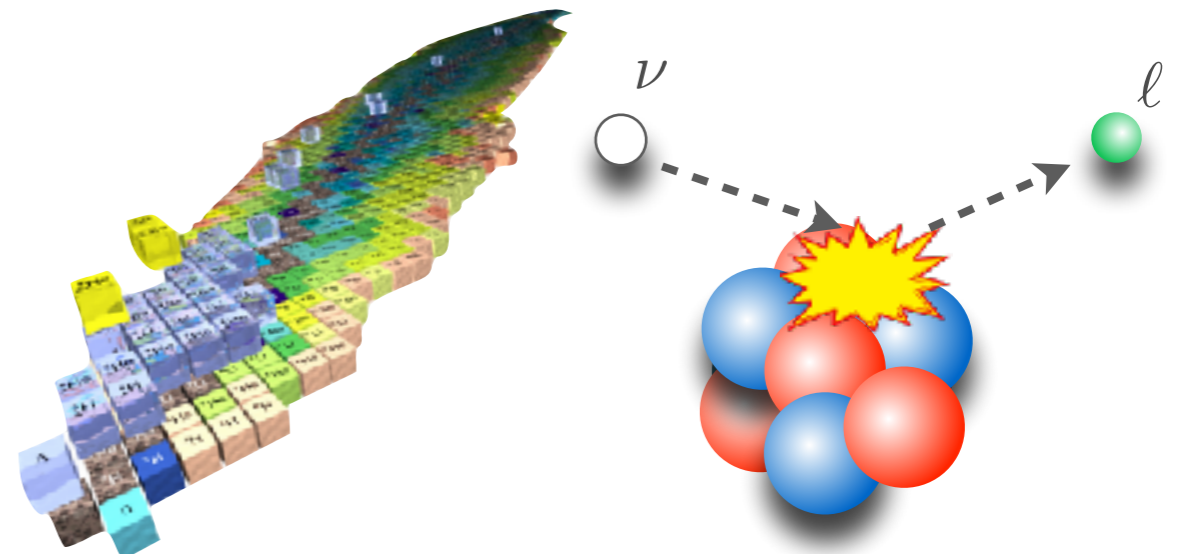


$$H|\Psi_n\rangle = E_n|\Psi_n\rangle$$
$$J_{mn} = \langle\Psi_m|J|\Psi_n\rangle$$

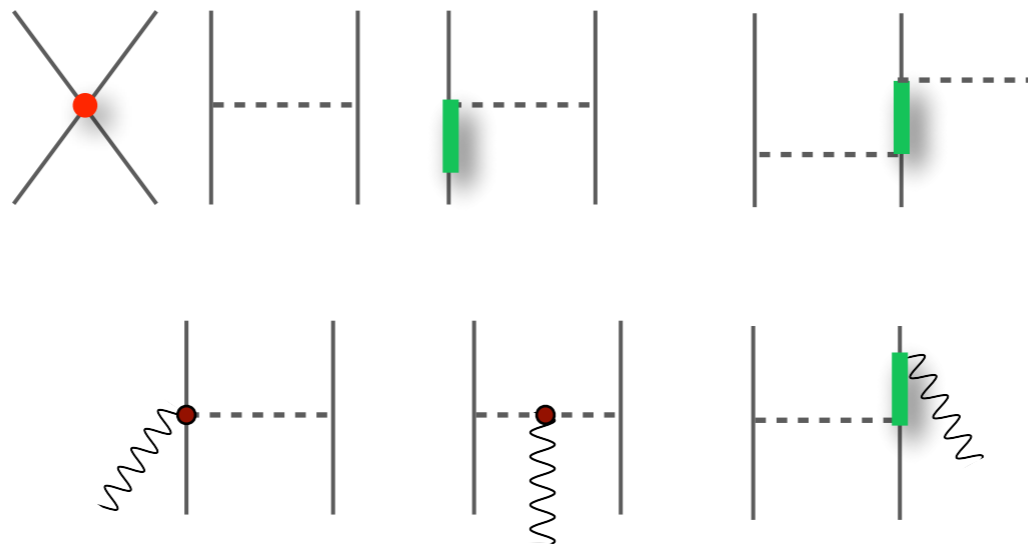
Quantum Chromodynamcs



Atomic nuclei and neutrino scattering



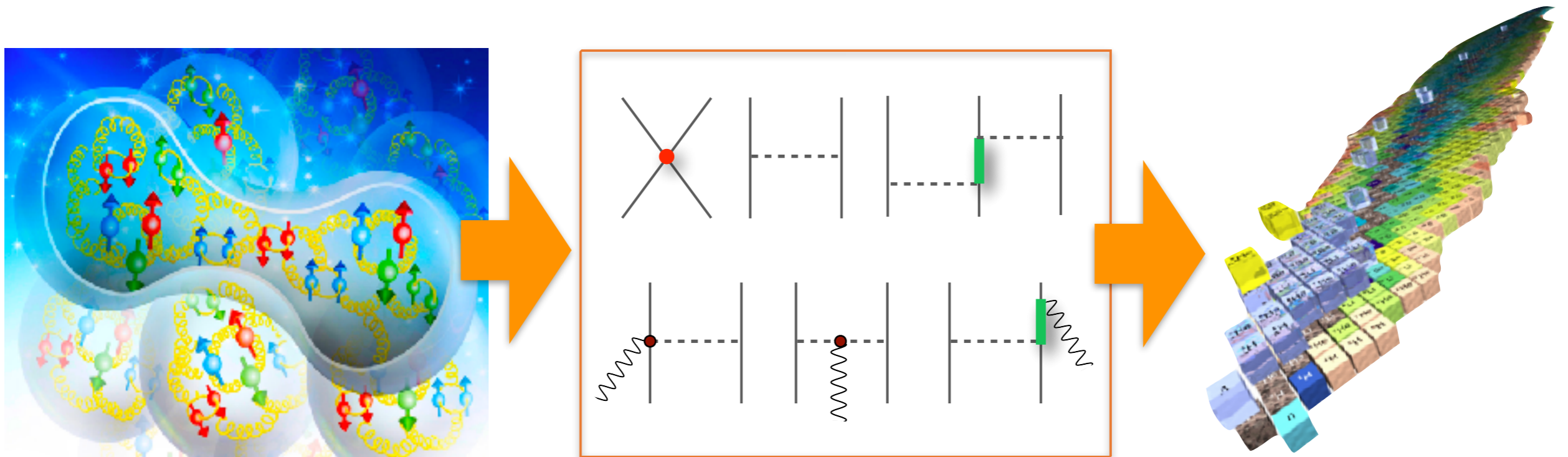
# Hamiltonian and electroweak currents



# The microscopic model of nuclear theory

In the low-energy regime, **quark and gluons are confined within hadrons** and the relevant degrees of freedom are protons, neutrons, and pions

**Effective field theories** are the link between QCD and nuclear observables. They exploit the separation between the “hard” ( $M \sim$  nucleon mass) and “soft” ( $Q \sim$  exchanged momentum) scales



Nucleons can be treated as point-like particles interacting through the Hamiltonian

$$H = \sum_i \frac{\mathbf{p}_i^2}{2m} + \sum_{i < j} v_{ij} + \sum_{i < j < k} V_{ijk} + \dots$$

# Two-body (phenomenological) potential

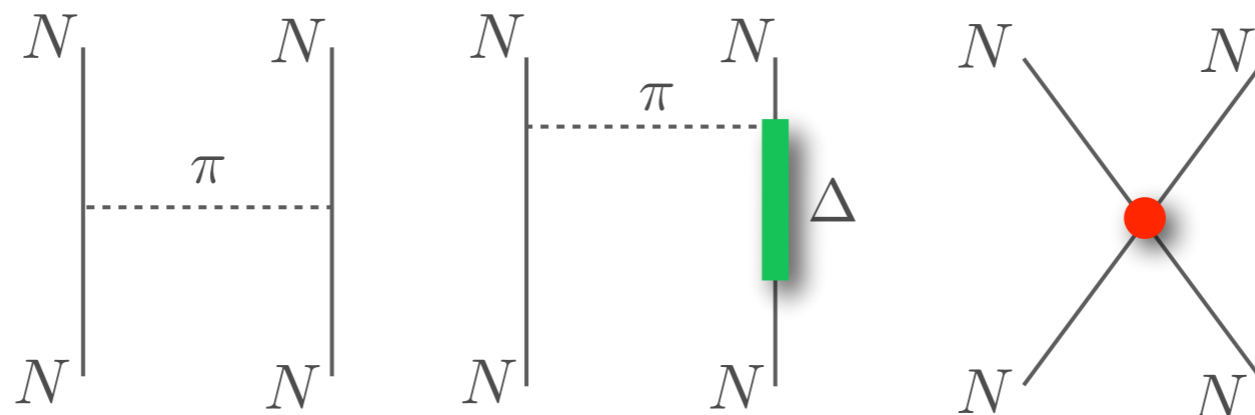
Realistic local, configuration-space potential are controlled by **thousands np and pp scattering data** below 350 MeV of the Nijmegen and Granada databases

Nuclear potentials are strongly spin-isospin dependent. **Argonne v<sub>18</sub>** can be written as

$$v_{18}(r_{ij}) = v_{ij}^{\gamma} + v_{ij}^{\pi} + v_{ij}^I + v_{ij}^S = \sum_{p=1}^{18} v^p(r_{ij}) O_{ij}^p$$

- Static part  $O_{ij}^{p=1-6} = (1, \sigma_{ij}, S_{ij}) \otimes (1, \tau_{ij})$
- Spin-orbit  $O_{ij}^{p=7-8} = \mathbf{L}_{ij} \cdot \mathbf{S}_{ij} \otimes (1, \tau_{ij})$

Some of the Feynman diagrams effectively included in the Argonne potential



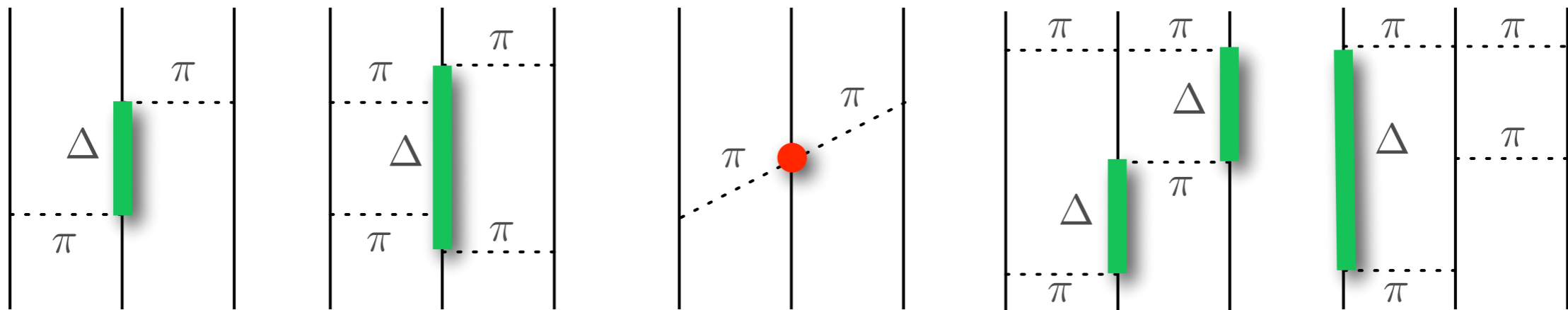
# Three-body (phenomenological) potentials

An Hamiltonian which only includes Argonne  $v_{18}$  does not provide enough binding in the light nuclei and overestimates the equilibrium density of symmetric nuclear matter.

**Nuclear three-body interactions** are analogous to tidal forces: the gravitational force on the Earth is not just the sum of Earth-Moon and Earth-Sun forces

**Illinois 7** contains: a two-pion exchange interaction, a phenomenological repulsive term, a two-pion S-wave contribution, and three-pion exchange diagrams.

$$V_{ijk} = V_{ijk}^{2\pi,P} + V_{ijk}^{2\pi,S} + V_{ijk}^{3\pi,\Delta R} + V_{ijk}^R$$



S. Pieper et al., PRC **64**, 014001 (2001)

The parameters of the hamiltonian are fit to properties of **exactly solvable light nuclear systems**.



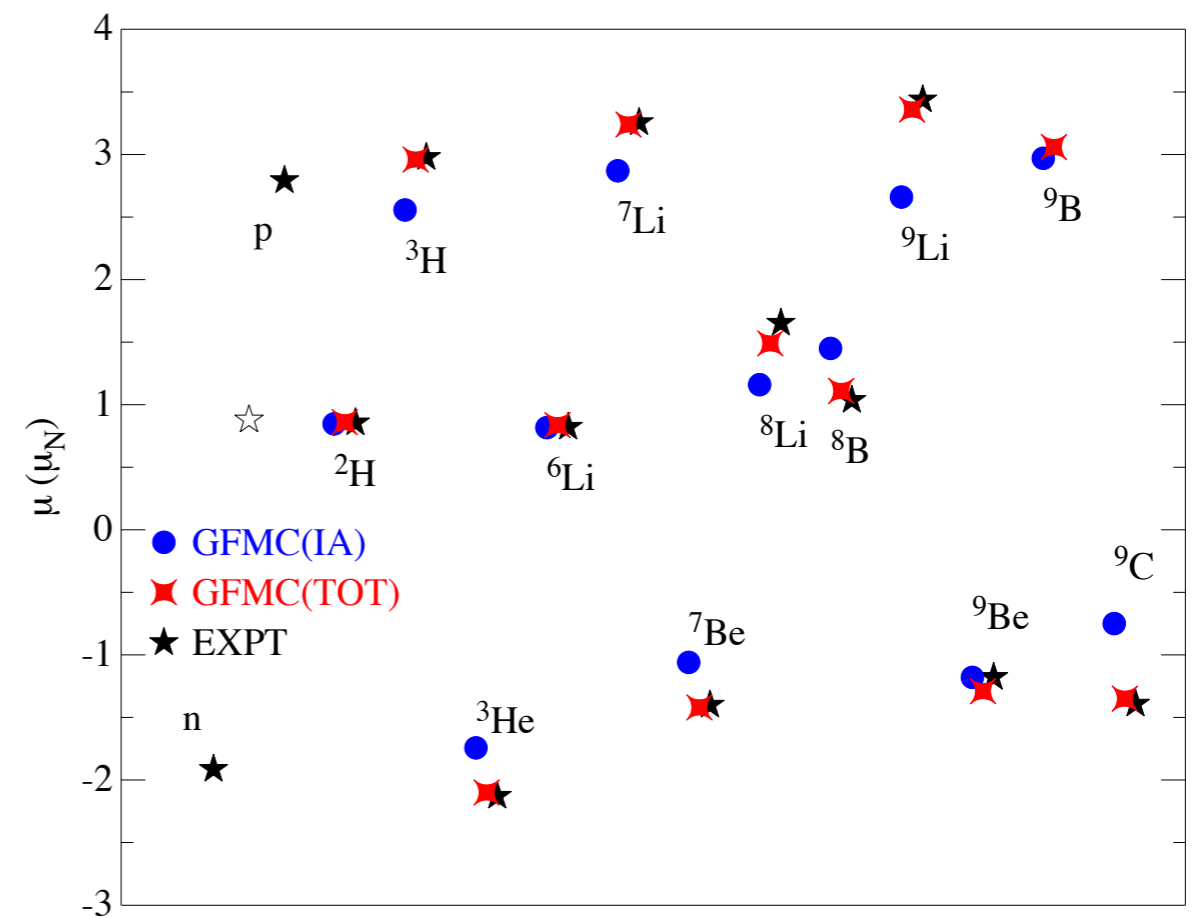
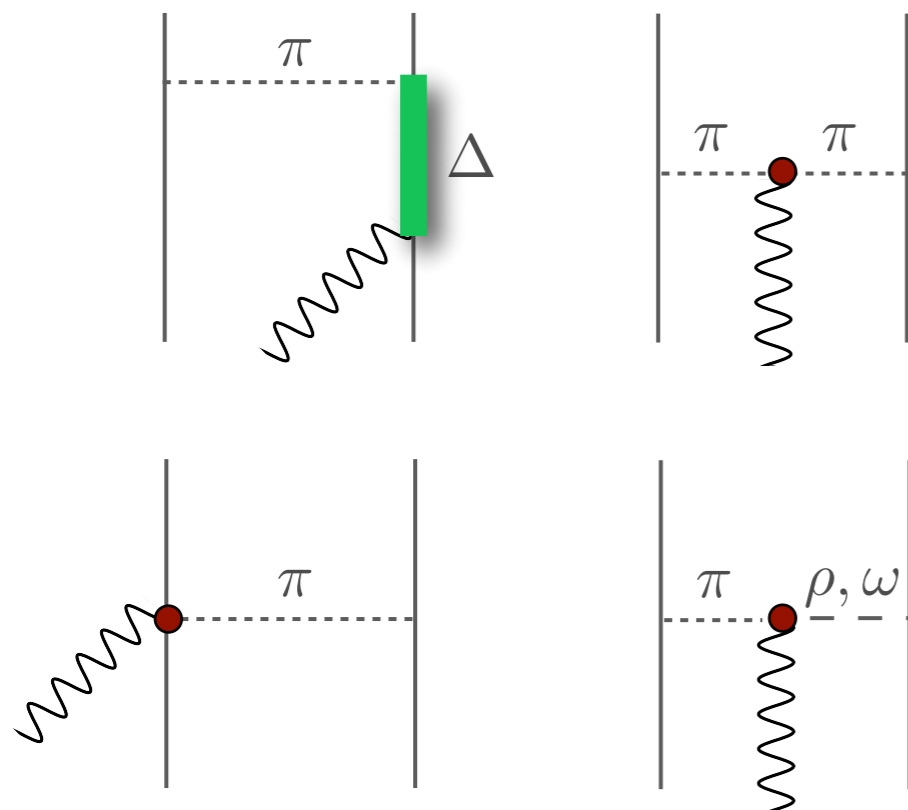
# Electroweak currents

The electromagnetic current is constrained by the Hamiltonian through the **continuity equation**

$$\nabla \cdot \mathbf{J}_{\text{EM}} + i[H, J_{\text{EM}}^0] = 0$$

- The above equation implies that  $\mathbf{J}_{\text{EM}}$  involves two-nucleon contributions.

- They are essential for low-momentum and low-energy transfer transitions.



R. Schiavilla et al., PRC **45**, 2628 (1992)

L. Marcucci et al., PRC **72**, 014001 (2005)

S. Pastore et al., PRC **87**, 035503 (2013)

# Axial form factor

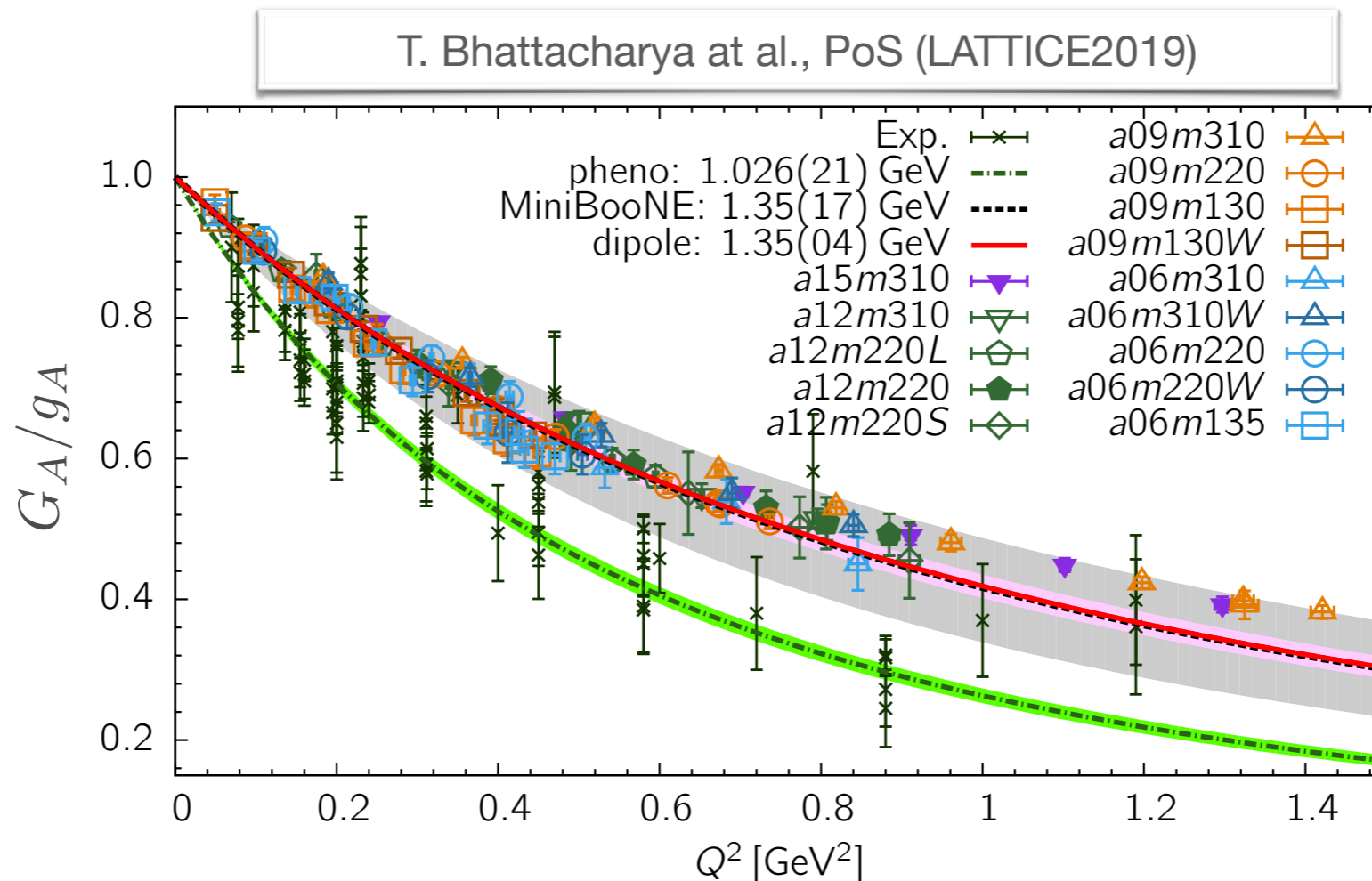
The axial one- and two-body currents are proportional to the **nucleon axial form factor**

A dipole ansatz fits the available deuteron-scattering data

$$G_A(Q^2) = \frac{g_A}{(1 + Q^2/M_A^2)^2}$$

More flexible parameterizations, based on the “z-expansion” have been recently proposed

Lattice-QCD calculations started becoming available.



# Accurate nuclear many-body methods



$$H|\Psi_n\rangle = E_n|\Psi_n\rangle$$

$$J_{mn} = \langle\Psi_m|J|\Psi_n\rangle$$

# Variational Monte Carlo

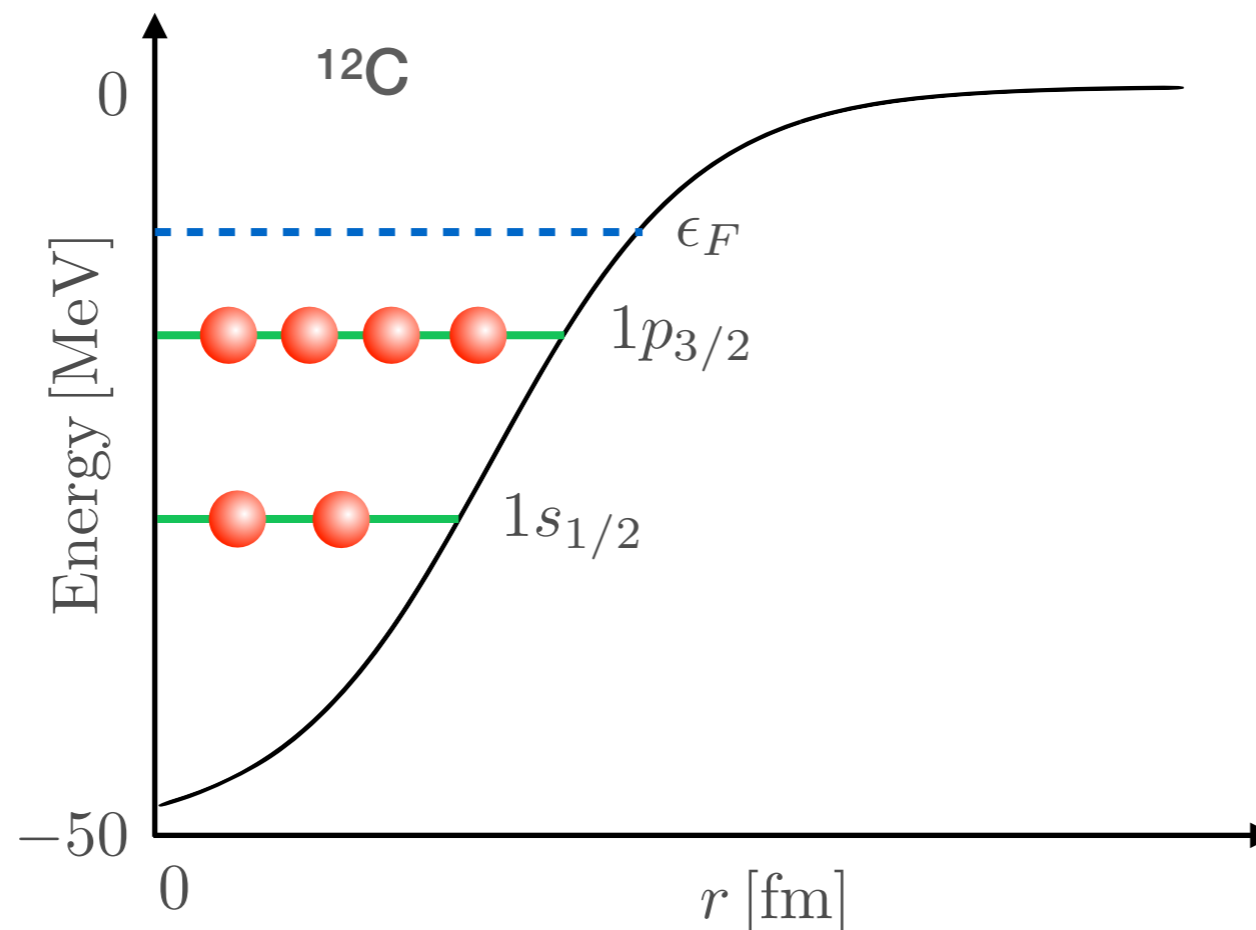
In variational Monte Carlo, one **assumes a suitable form for the trial wave function**

$$\Psi_T = \left( 1 + \sum_{i < j < k} F_{ijk} \right) \left( \mathcal{S} \prod_{i < j} F_{ij} \right) \Phi_A(J, M, T_z)$$

The best variational parameters are found by **optimizing the variational energy**

$$E_T = \langle \Psi_T | H | \Psi_T \rangle \geq E_0$$

The long-range antisymmetric  $\Phi_A$  is typically a Slater determinant of single-particle orbitals



# Variational Monte Carlo

In variational Monte Carlo, one **assumes a suitable form for the trial wave function**

$$\Psi_T = \left( 1 + \sum_{i < j < k} F_{ijk} \right) \left( \mathcal{S} \prod_{i < j} F_{ij} \right) \Phi_A(J, M, T_z)$$

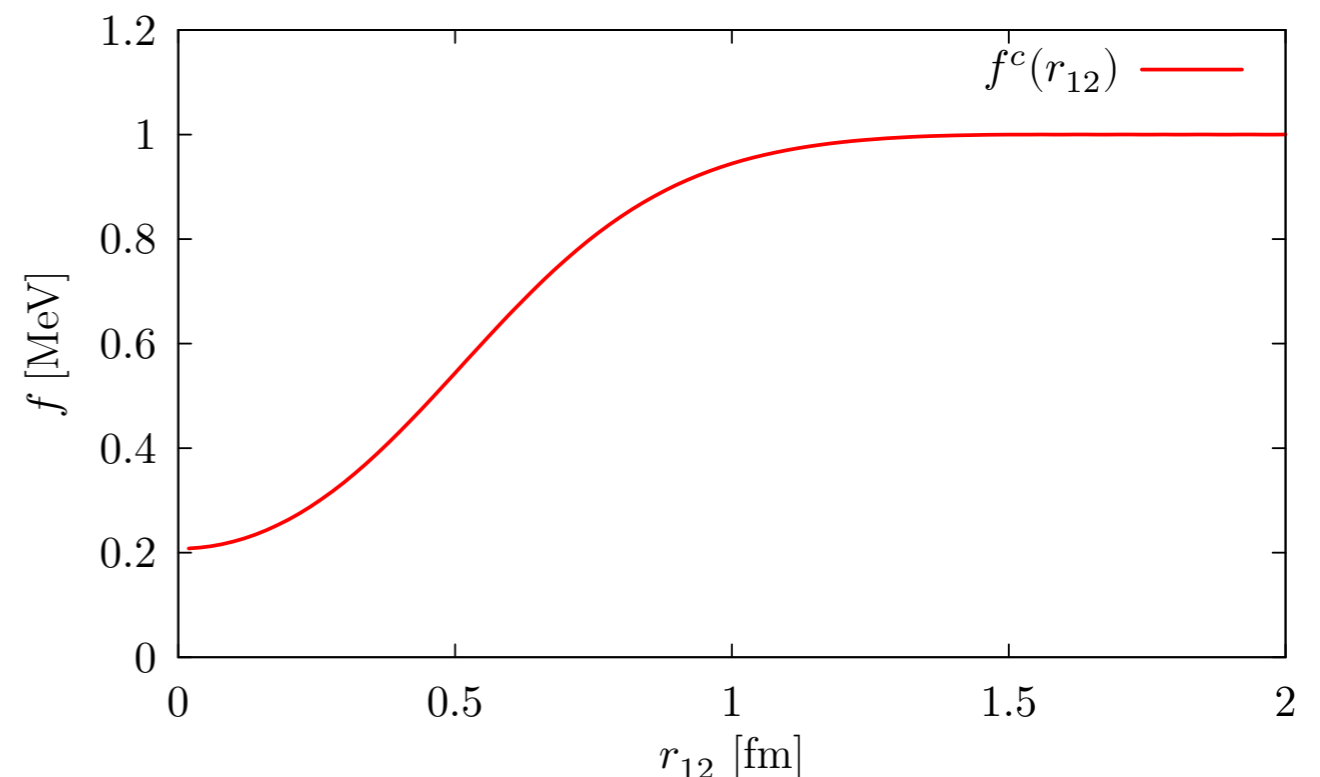
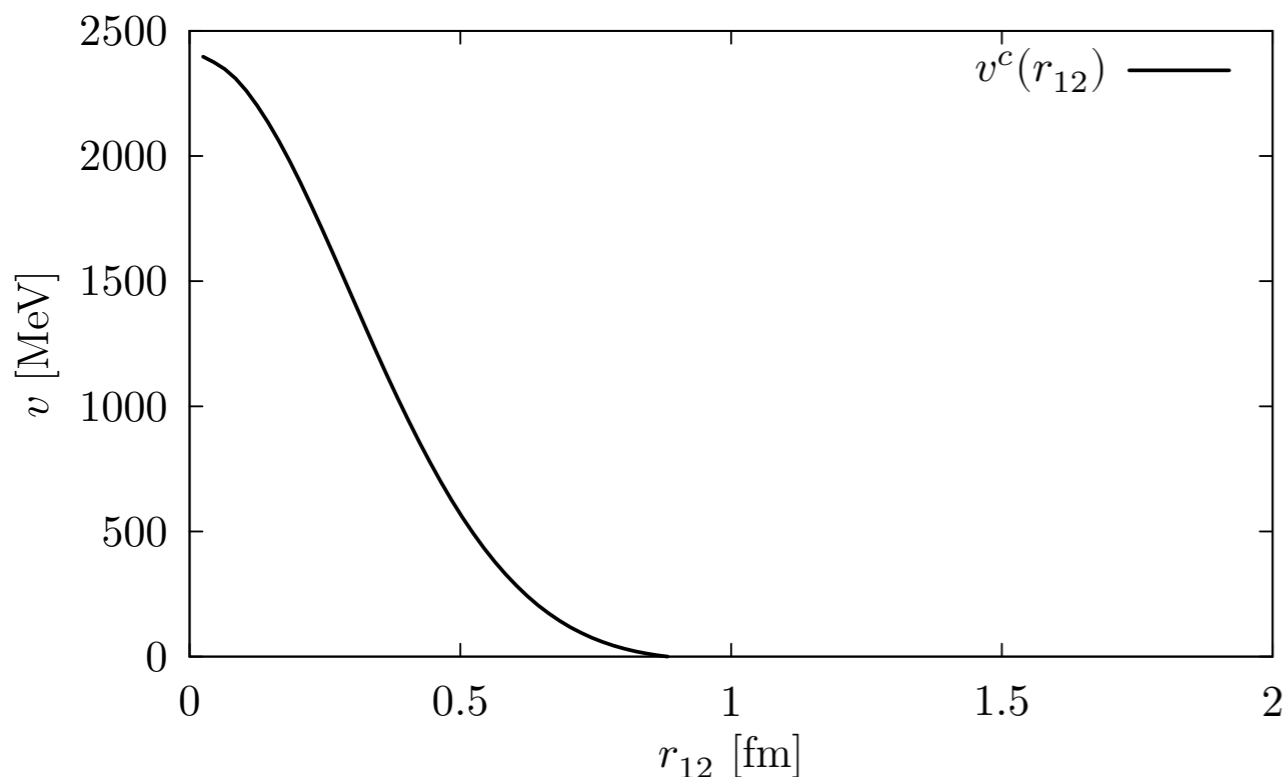
The best variational parameters are found by **optimizing the variational energy**

$$E_T = \langle \Psi_T | H | \Psi_T \rangle \geq E_0$$

The correlation operator reflects the spin-isospin dependence of the nuclear interaction

$$F_{ij} \simeq \sum_p f^p(r_{ij}) O_{ij}^p$$

$$F_{ijk} = \sum_x \epsilon_x V_{ijk}^x(\tilde{r}_{ij}, \tilde{r}_{ik}, \tilde{r}_{jk})$$





# Green's function Monte Carlo

GFMC **overcomes the limitations of the variational wave-function** by using an imaginary-time projection technique

Any trial wave function can be expanded in the complete set of eigenstates of the the Hamiltonian according to

$$|\Psi_T\rangle = \sum_n c_n |\Psi_n\rangle$$

$$H|\Psi_n\rangle = E_n|\Psi_n\rangle$$

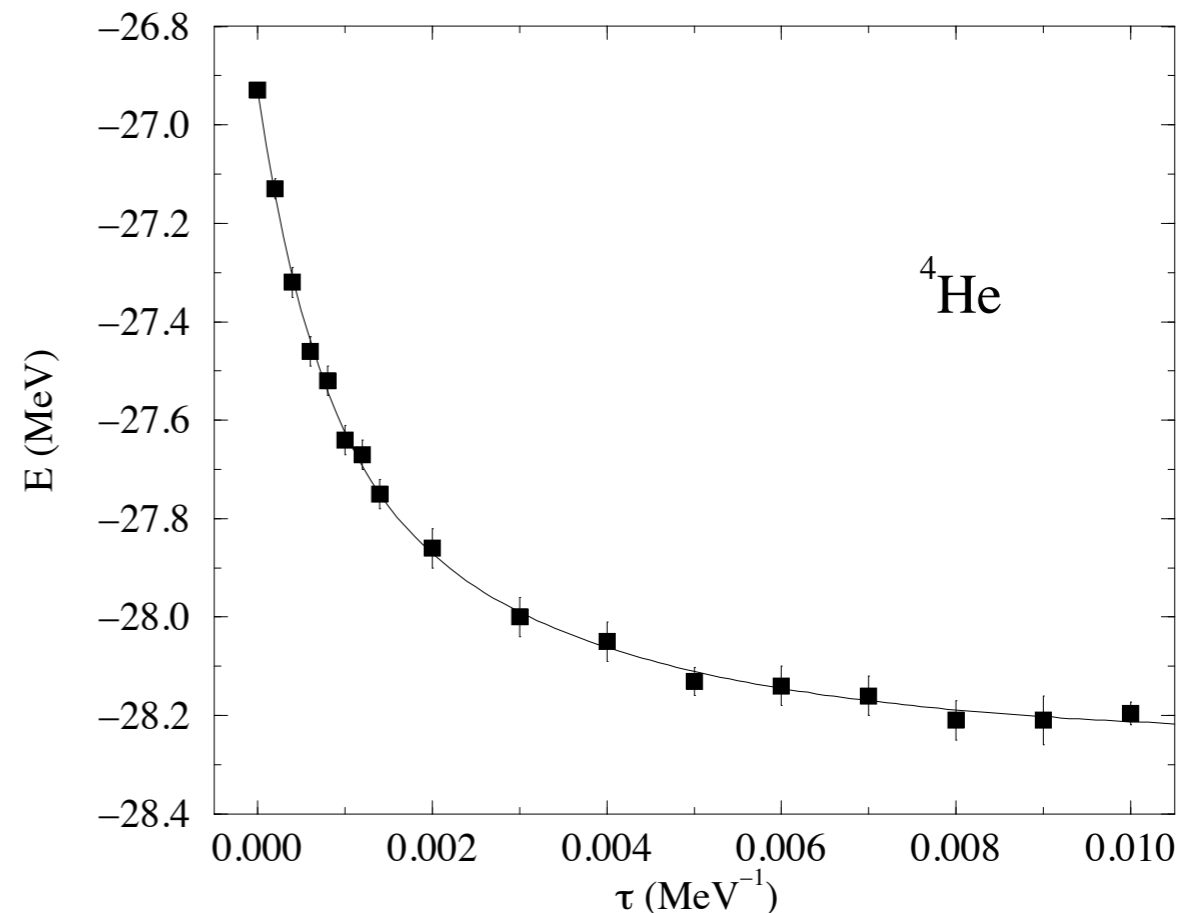
GFMC **projects out the exact lowest-energy state**, provided the trial wave function it is not orthogonal to the ground state.

$$\lim_{\tau \rightarrow \infty} e^{-(H-E_0)\tau} |\Psi_T\rangle =$$

$$\lim_{\tau \rightarrow \infty} \sum_n c_n e^{-(E_n-E_0)\tau} |\Psi_n\rangle = c_0 |\Psi_0\rangle$$



B. Pudliner et al., PRC **56**, 1720 (1997)



# Green's function Monte Carlo

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The imaginary-time evolution is broken into N small imaginary-time steps

$$\langle X_N | \Psi(\tau) \rangle = \prod_{I=1}^{N-1} \int dX_i \langle X_N | e^{-(H-E_0)\delta\tau} | X_{N-1} \rangle \dots \langle X_2 | e^{-(H-E_0)\delta\tau} | X_1 \rangle \langle X_1 | \Psi_T \rangle$$

The generalized coordinate denotes both positions and spin-isospin of the nucleons

$$|X\rangle \longleftrightarrow |R, S\rangle$$

The **short-time propagator** factorizes as

$$\langle X' | e^{-(H-E_0)\delta\tau} | X \rangle \simeq \langle X' | e^{-T\delta\tau} e^{-(V-E_0)\delta\tau} | X \rangle$$

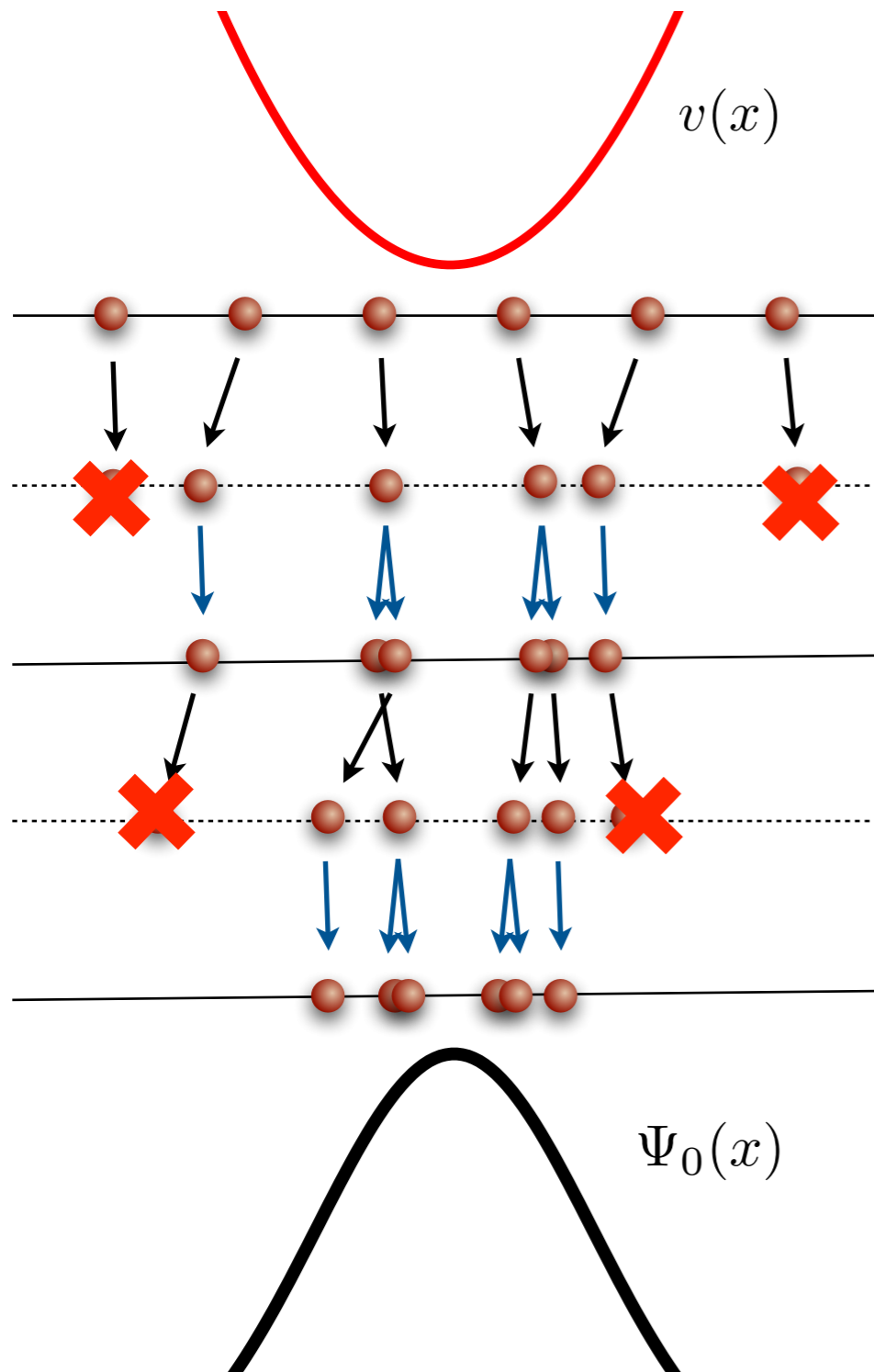
The kinetic energy describes the **Brownian diffusion** of A particles

$$\langle X | e^{-T\delta\tau} | X' \rangle = \left( \frac{m}{2\pi\delta\tau} \right)^{\frac{3A}{2}} e^{-\frac{m(R-R')^2}{2\delta\tau}} \delta(S - S')$$

Putting aside its spin-dependent components the potential is included in the weight of the configuration

$$\langle X' | e^{-(V-E_0)\delta\tau} | X \rangle = e^{-[V(X)-E_0]\delta\tau} \delta(X - X')$$

# Green's function Monte Carlo



- A set of walkers is sampled from the trial wave function

- Gaussian drift for the kinetic energy

$$\left( \frac{m}{2\pi\hbar^2\Delta\tau} \right)^{\frac{1}{2}} e^{-\frac{m}{2\hbar^2\Delta\tau}(x_i - x_{i+1})^2}$$

- Branching and killing of the walkers induced by the potential weight

$$w(x_{i+1}) = e^{-[V(x_{i+1}) - E_0]\Delta\tau}$$

- Ground-state expectation values are estimated during the diffusion

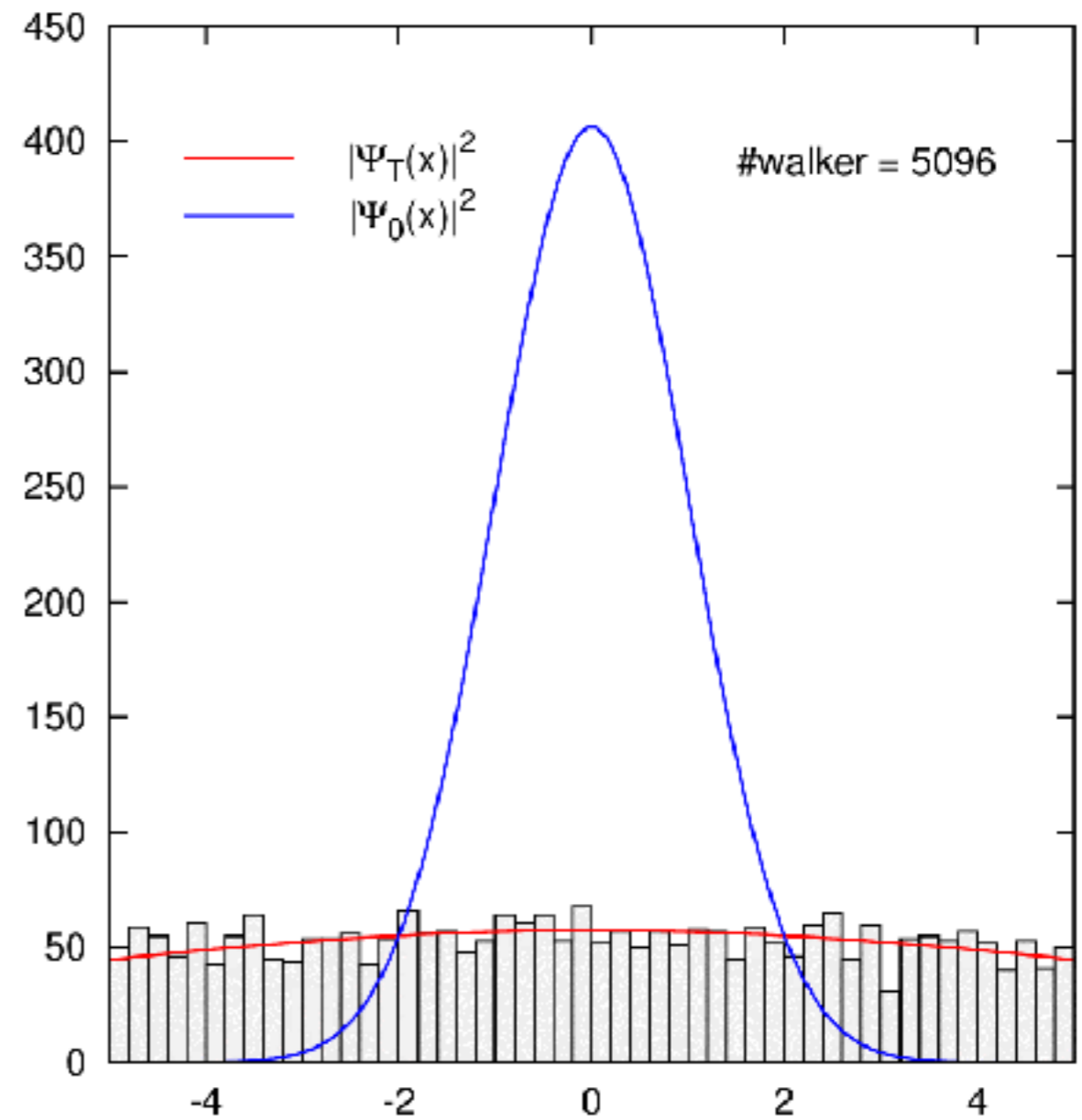
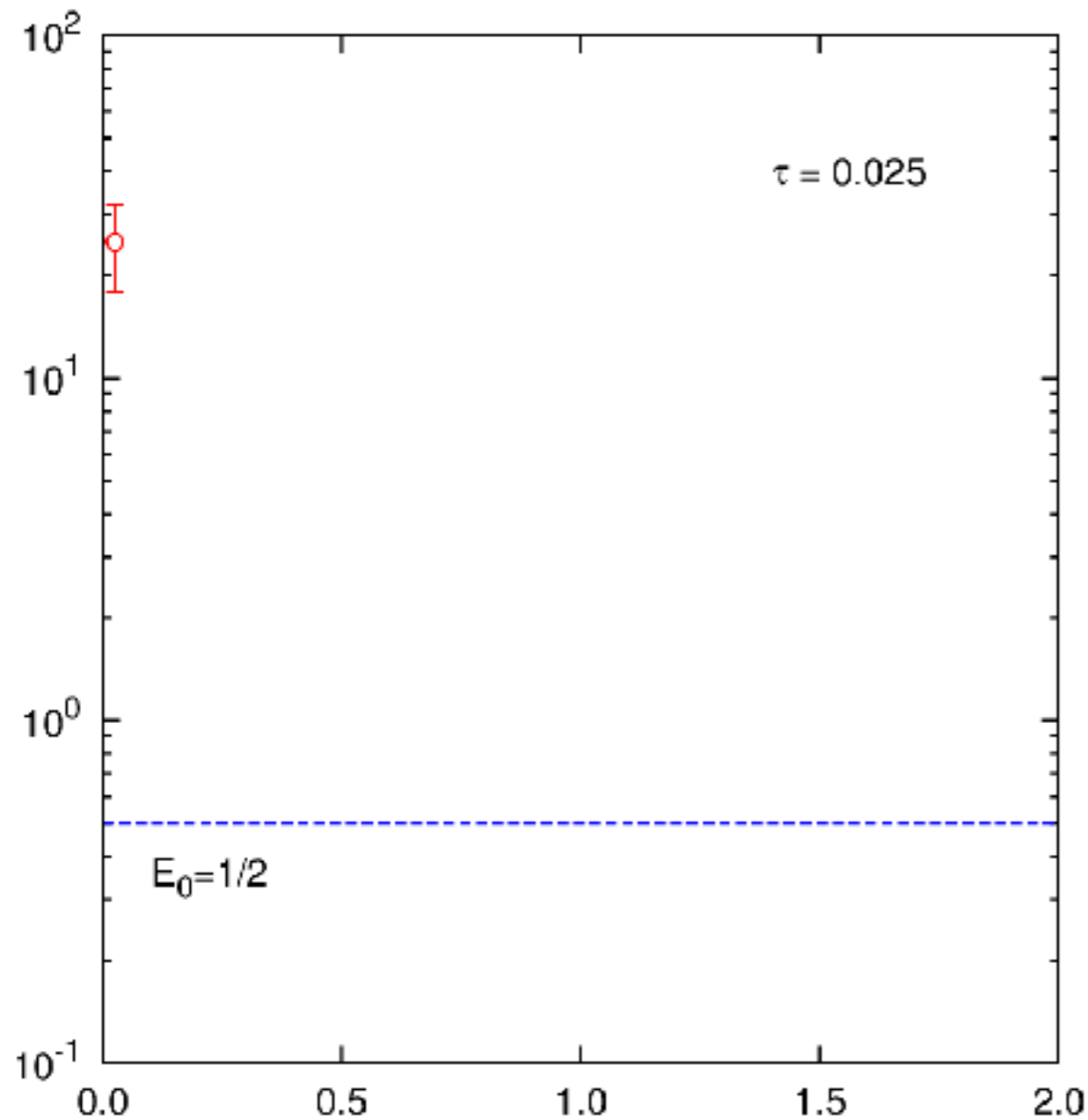
$$\langle H \rangle = \frac{\sum_{x_i} \langle x_i | H | \Psi_T \rangle w(x_i)}{\sum_{x_i} \langle x_i | \Psi_T \rangle w(x_i)}$$

# One-dimensional harmonic oscillator

$$H = -\frac{1}{2} \frac{d^2}{dx^2} + \frac{x^2}{2}$$



$$\Psi_0(x) = e^{-x^2/2}$$
$$E_0 = 1/2$$



# Green's function Monte Carlo

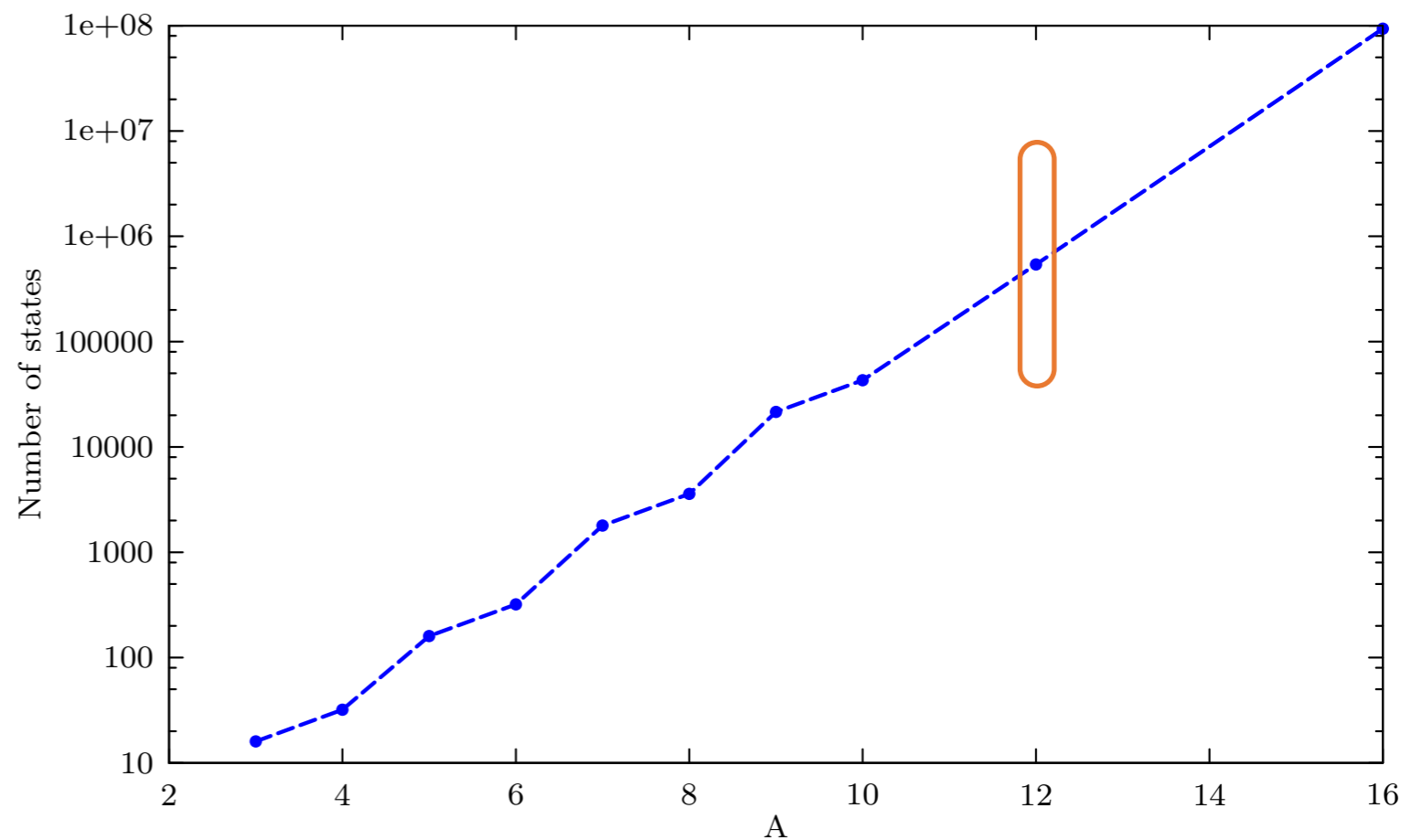
In the GFMC, a sum over all the many-body spin-isospin states is performed

$$\sum_{SS'} \langle S' | e^{-[V-E_0]\delta\tau} | S \rangle \simeq \sum_{SS'} \langle S' | \prod_{i<j} e^{-V_{ij}\delta\tau} | S \rangle e^{E_0\delta\tau}$$

Many-body spin-isospin states are utilized  $\longrightarrow$  unfavorable exponential scaling

The size of the spin state alone grows like  $2^A$

$$|S\rangle = \begin{pmatrix} s \uparrow\uparrow\uparrow \\ s \uparrow\uparrow\downarrow \\ s \uparrow\downarrow\uparrow \\ s \uparrow\downarrow\downarrow \\ s \downarrow\uparrow\uparrow \\ s \downarrow\uparrow\downarrow \\ s \downarrow\downarrow\uparrow \\ s \downarrow\downarrow\downarrow \end{pmatrix}$$



GFMC is extremely accurate but **limited to A=12 nuclei** and small ( $A \leq 14$ ) neutron systems



# Importance-sampling and sign problem

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The efficiency of the diffusion algorithm is crucially improved by the **importance sampling**

$$\langle X' | e^{-(H-E_0)\delta\tau} | X \rangle \longrightarrow \langle X' | e^{-(H-E_0)\delta\tau} | X \rangle \frac{\Psi_I(X')}{\Psi_I(X)}$$

Diffusion Monte Carlo algorithms suffers from the **fermion sign problem**, due to the fact that the importance-sampling wave-function entails components from the Bosonic ground-state

To alleviate it, in the AFDMC we implement an algorithm similar to the constrained-path approximation, but applicable to complex wave functions and propagators.

$$\frac{\Psi_I(R', S')}{\Psi_I(R, S)} \longrightarrow \max \left( \operatorname{Re} \left\{ \frac{\Psi_T(R', S')}{\Psi_T(R, S)} \right\}, 0 \right)$$

S. Zhang et al., PRB **55**, 7464 (1997)

The solution obtained from the constrained propagation is not the a rigorous upper-bound to the true ground-state energy

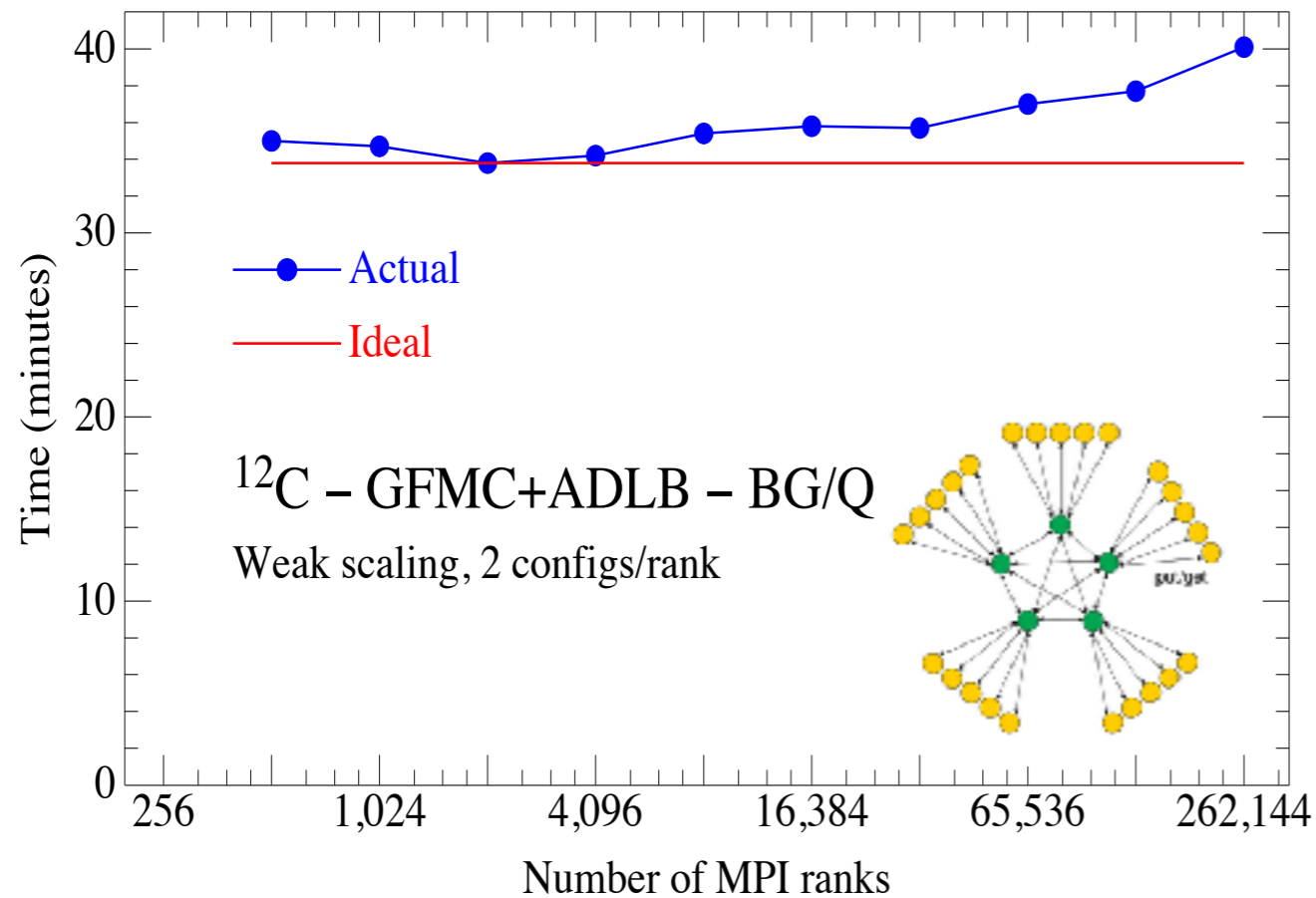
To remove the bias, the configurations obtained from a constrained propagation are further evolved using the following positive-definite importance sampling function

$$\Psi_G(X) = \sqrt{\operatorname{Re}\{\Psi_T(X)\}^2 + \alpha \operatorname{Im}\{\Psi_T(X)\}^2}$$

F. Pederiva et al., NPA, **742**, 255 (2004)

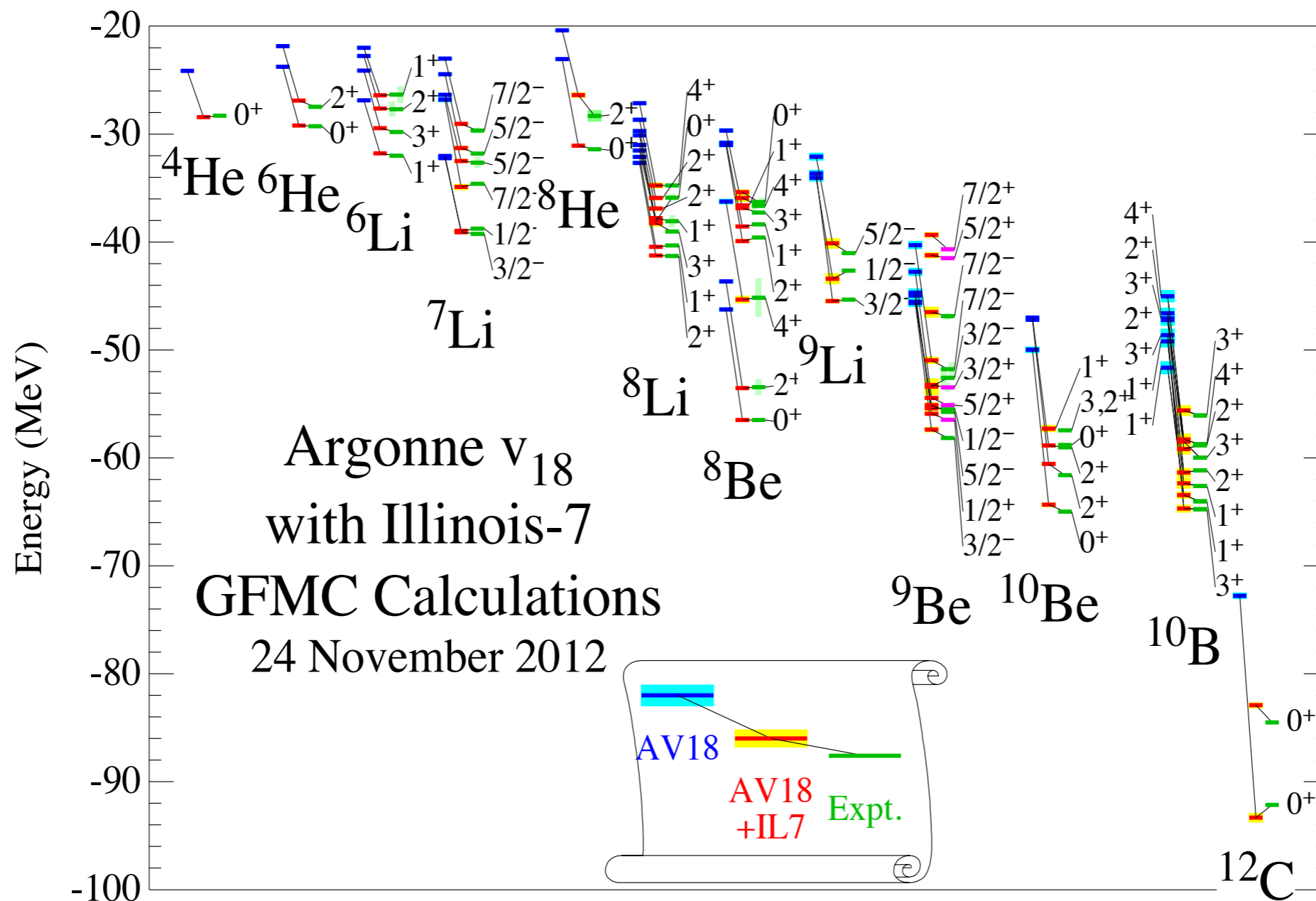
# Exploiting leadership-class computers

GFMC has steadily undergone development to take advantage of each new generation of parallel machine and was one of the first to deliver new scientific results each time.



# Nuclear quantum Monte Carlo

Green's function Monte Carlo is suitable to solve  $A \leq 12$  nuclei with  $\sim 1\%$  accuracy



# Boron Radii

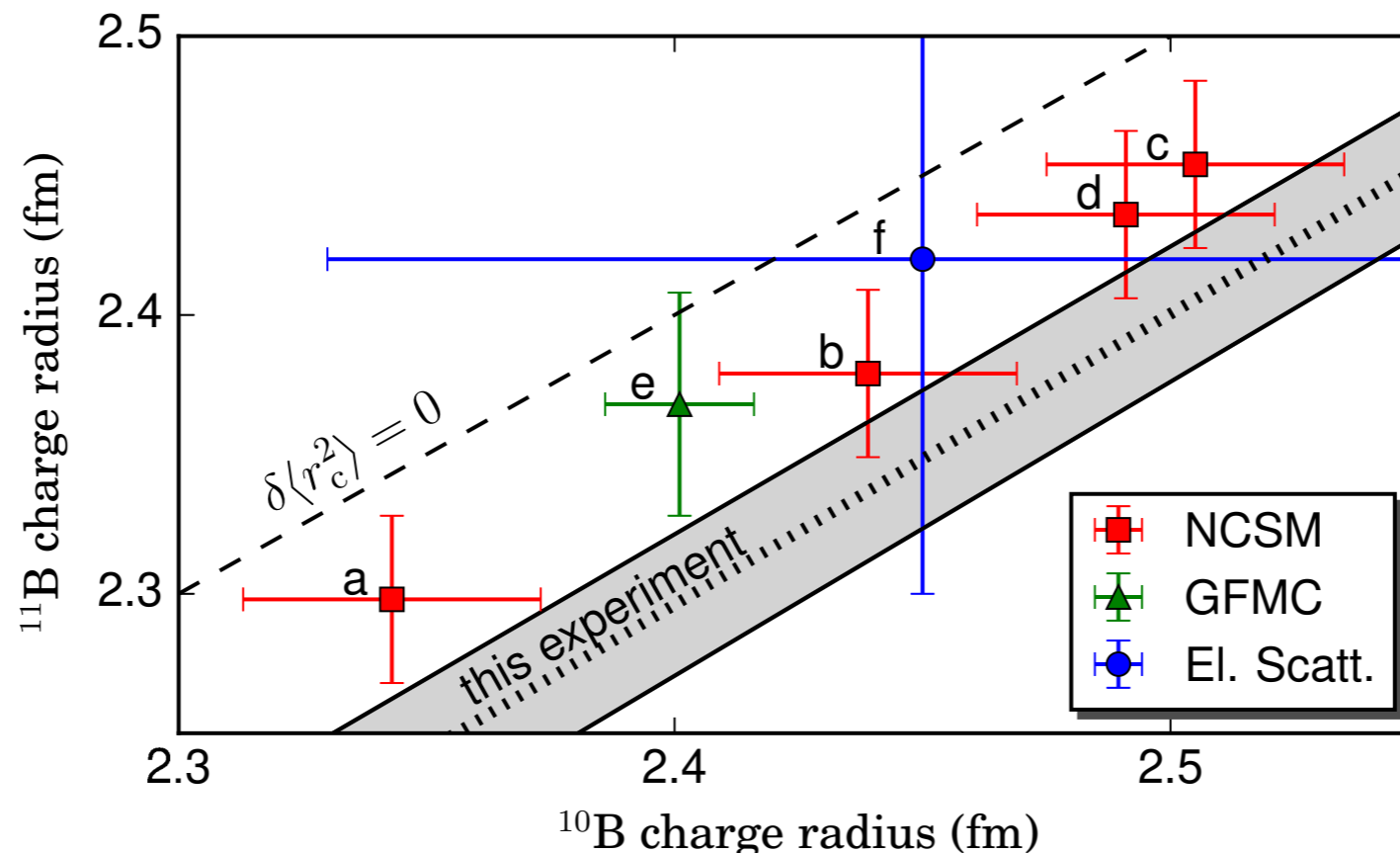
B. Maaß et al., PRL **122**, 182501 (2019)

## Atomic physics:

- Accurate measurement of the isotope shift in the atomic transition ( $2s^2 2p^2 P_{1/2} \rightarrow 2s^2 3s^2 S_{1/2}$ )
- Ab-initio QED mass-shift calculations for five-electron systems

## Nuclear theorists:

- We made GFMC calculations of point nucleon radii using the AV18+IL7 potentials
- No-core shell model calculations were made for chiral-EFT additional Hamiltonians
- Charge radii are evaluated by folding in the proton and neutron intrinsic radii along with the relativistic Darwin-Foldy correction



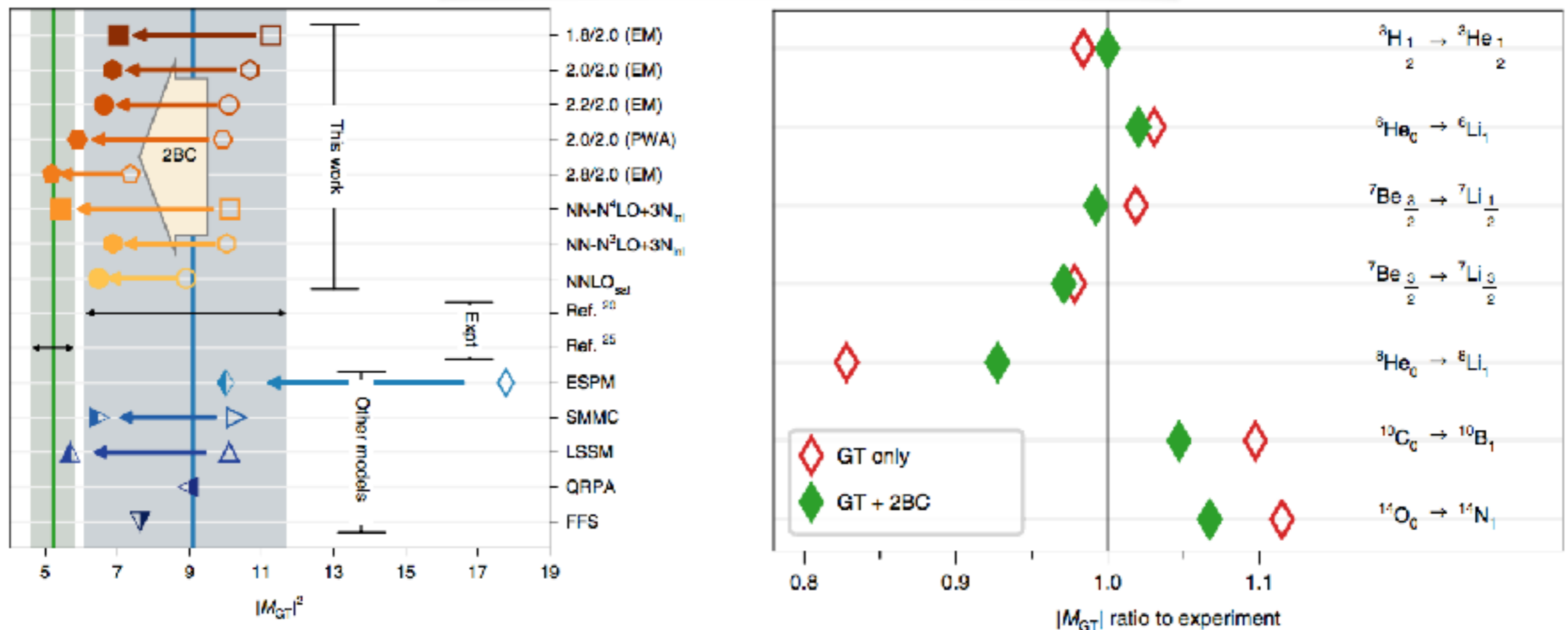
The experiment and nuclear theory results all agree that  $^{11}\text{B}$  has the smaller charge radius, although the theoretical values are systematically above the experiment by about one standard deviation.

# The *basic model* of nuclear Physics

Impressive progress have been made within **coupled-cluster** and nuclear many-body techniques based on a basis expansion

The long-standing discrepancy between experimental and theoretical and experimental  $\beta$ -decay rates has been resolved from first principles calculations

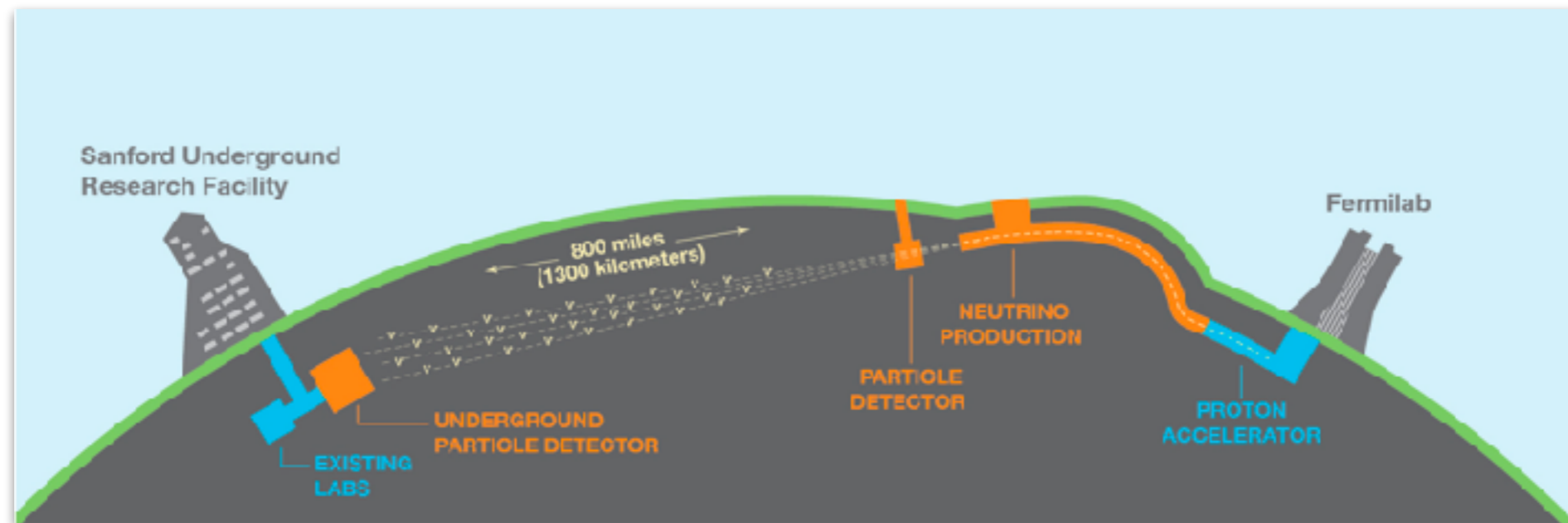
P. Gysbers et al., Nature Phys. **15** 428-431 (2019)



Quantum Monte Carlo remains the tool of choice to **simultaneously describe long-range structure and short-range dynamics** of atomic nuclei.



# Neutrino-nucleus interaction



# Neutrino experiments

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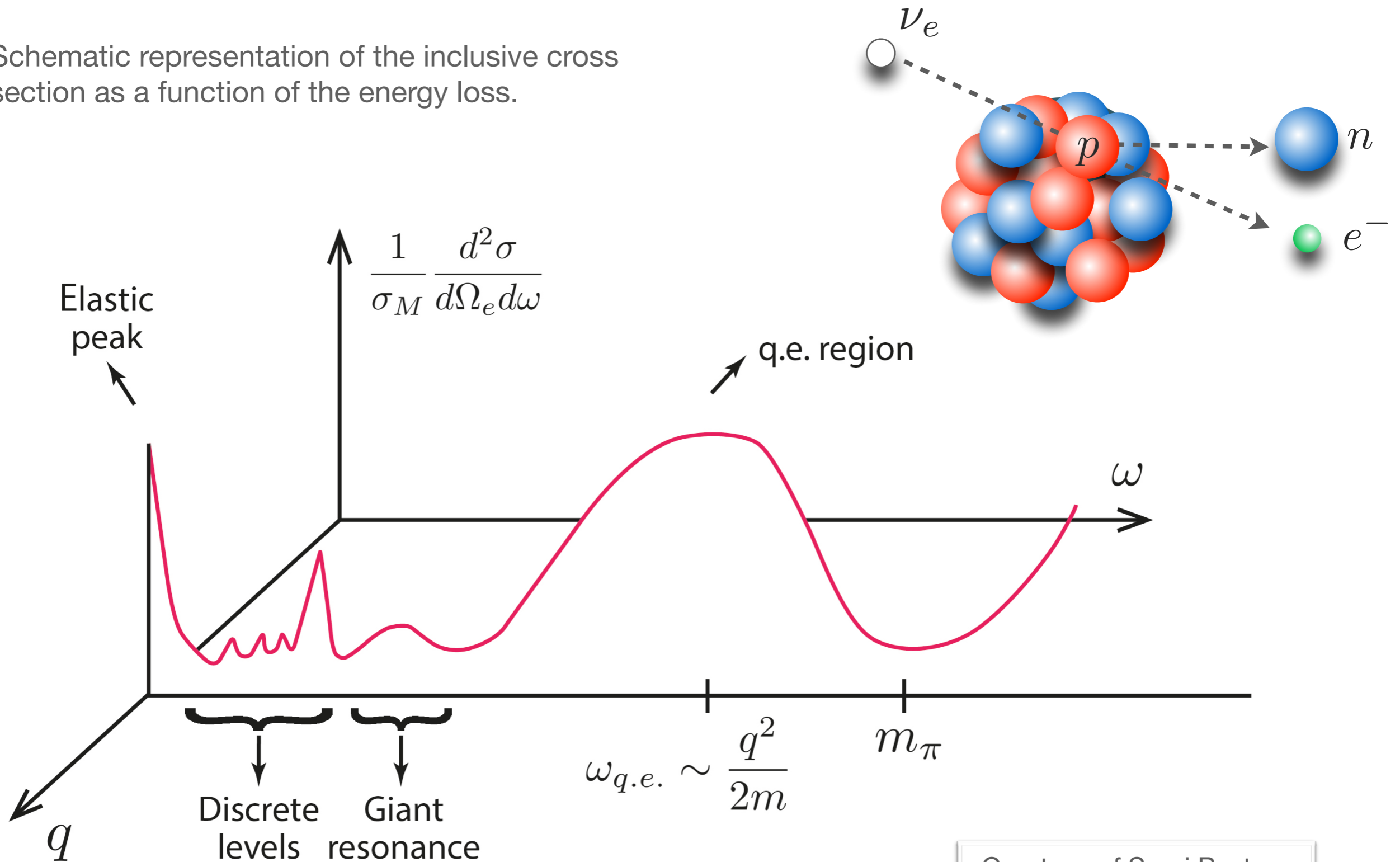
**Neutrino-oscillation and  $0\nu\beta\beta$  experiments are (also) sensitive to the high-momentum components of the nuclear wave function**

- Charge-parity (CP) violating phase and the mass hierarchy will be measured
- Determine whether the neutrino is a Majorana or a Dirac particle
- Need for including nuclear dynamics; mean-field models inadequate to describe neutrino-nucleus interaction
- A large body of experimental data for the electromagnetic cross sections of  $^4\text{He}$  and  $^{12}\text{C}$  (and many other nuclei) is available.
- A model unable to describe electron-nucleus scattering is (very) unlikely to describe neutrino-nucleus scattering.



# Lepton-nucleus scattering

Schematic representation of the inclusive cross section as a function of the energy loss.



Courtesy of Saori Pastore

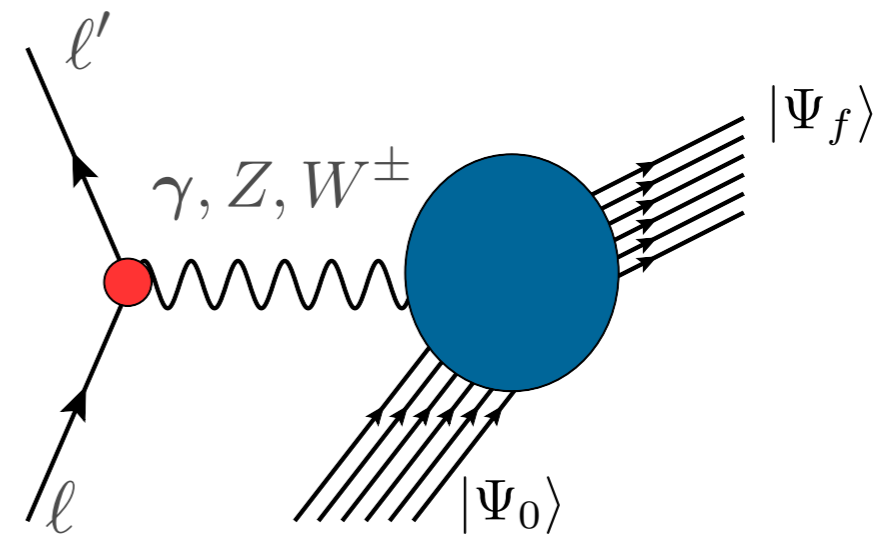


# Lepton-nucleus scattering

The lepton-nucleus inclusive cross section is determined by **five response functions**

$$\frac{d\sigma}{dE_{\ell'} d\Omega_{\ell}} \propto [v_{00}R_{00} + v_{zz}R_{zz} - v_{0z}R_{0z} + v_{xx}R_{xx} \mp v_{xy}R_{xy}]$$

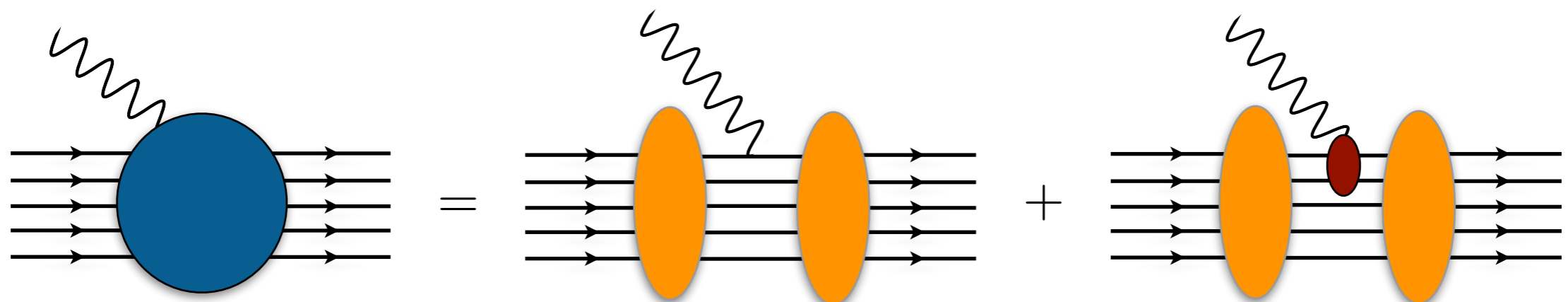
In electron scattering only the **longitudinal** and **transverse** responses contribute



The response functions contain all information on the structure and dynamics of the target

$$R_{\alpha\beta}(\omega, \mathbf{q}) = \sum_f \langle \Psi_0 | J_{\alpha}^{\dagger}(\mathbf{q}) | \Psi_f \rangle \langle \Psi_f | J_{\beta}(\mathbf{q}) | \Psi_0 \rangle \delta(\omega - E_f + E_0)$$

They include initial-state correlations, final state correlations and two-body currents



# Moderate momentum-transfer regime

Up to moderate values of the momentum transfer, both initial and final states are eigenstates of the nuclear Hamiltonian

$$H|\Psi_0\rangle = E_0|\Psi_0\rangle \quad H|\Psi_f\rangle = E_f|\Psi_f\rangle$$

As for the electron scattering on  $^{12}\text{C}$

$$|^{12}\text{C}^*\rangle, |^{11}\text{B}, p\rangle, |^{11}\text{C}, n\rangle, |^{10}\text{B}, pn\rangle, |^9\text{Be}, pp\rangle, |^9\text{C}, nn\rangle \dots$$

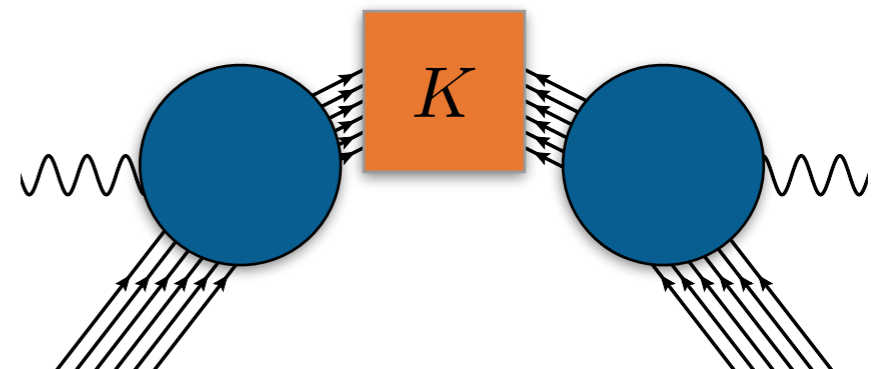
The **integral transform** of the response function are defined as

$$E_{\alpha\beta}(\sigma, \mathbf{q}) \equiv \int d\omega K(\sigma, \omega) R_{\alpha\beta}(\omega, \mathbf{q})$$

$$R_{\alpha\beta}(\omega, \mathbf{q}) = \sum_f \langle \Psi_0 | J_\alpha^\dagger(\mathbf{q}) | \Psi_f \rangle \langle \Psi_f | J_\beta(\mathbf{q}) | \Psi_0 \rangle \delta(\omega - E_f + E_0)$$

Using the completeness of the final states, the integral transform is expressed as **ground-state expectation values**

$$E_{\alpha\beta}(\sigma, \mathbf{q}) = \langle \Psi_0 | J_\alpha^\dagger(\mathbf{q}) K(\sigma, H - E_0) J_\beta(\mathbf{q}) | \Psi_0 \rangle$$

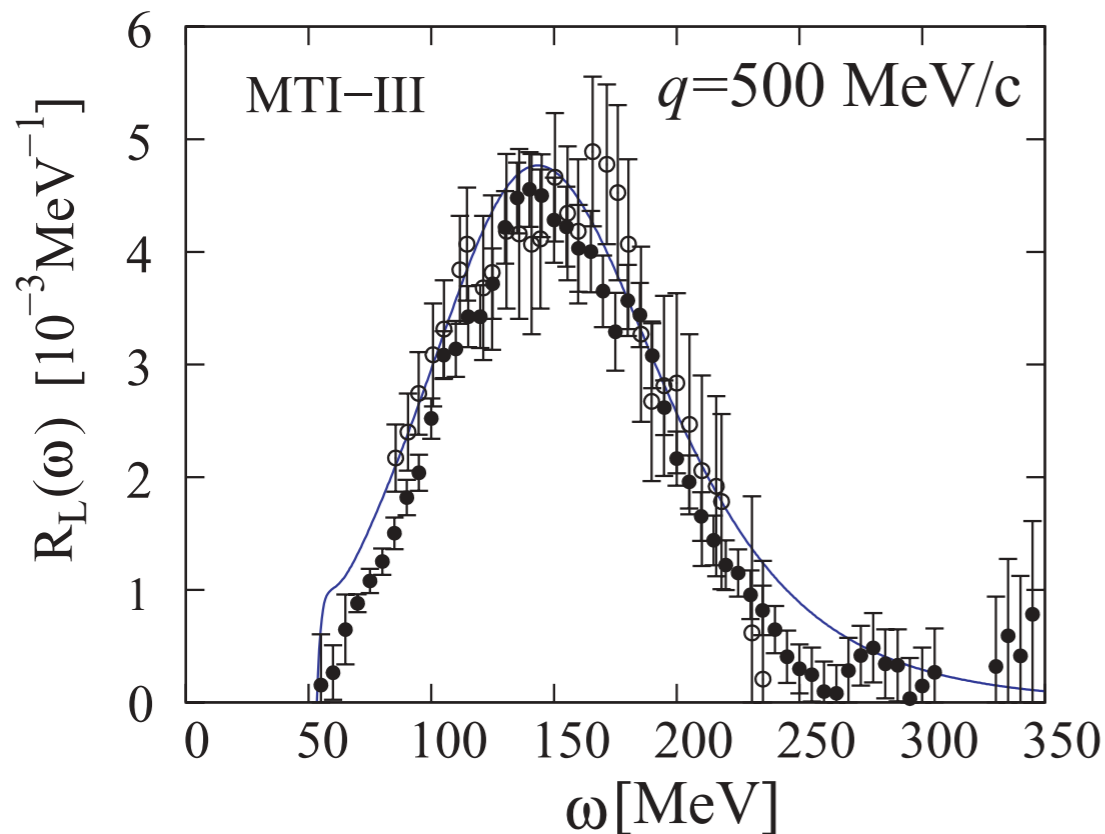


# Lorentz integral transform (LIT)

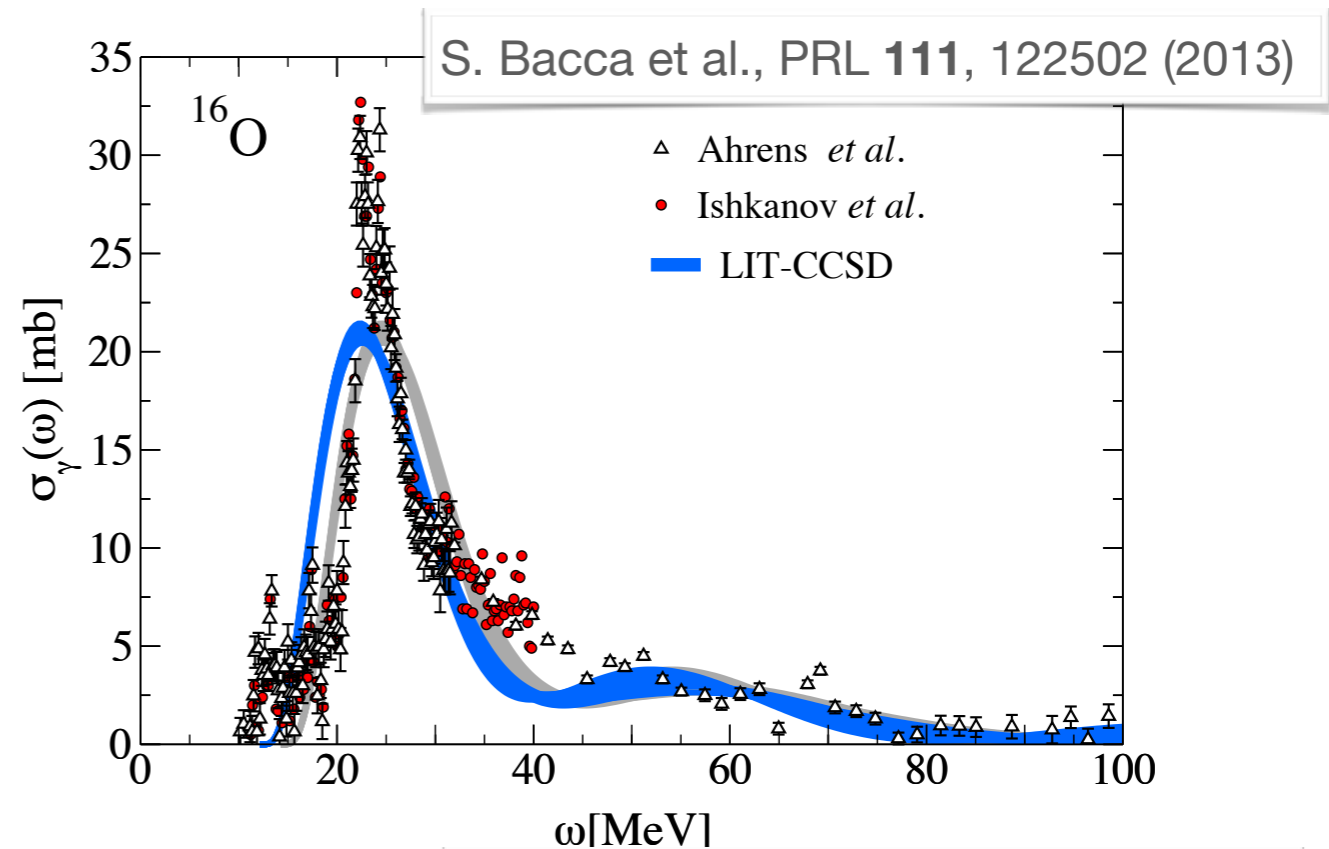
- The Lorentz integral transform

$$K(\sigma, \omega) = \frac{1}{(\omega - \sigma_R)^2 + \sigma_I^2}$$

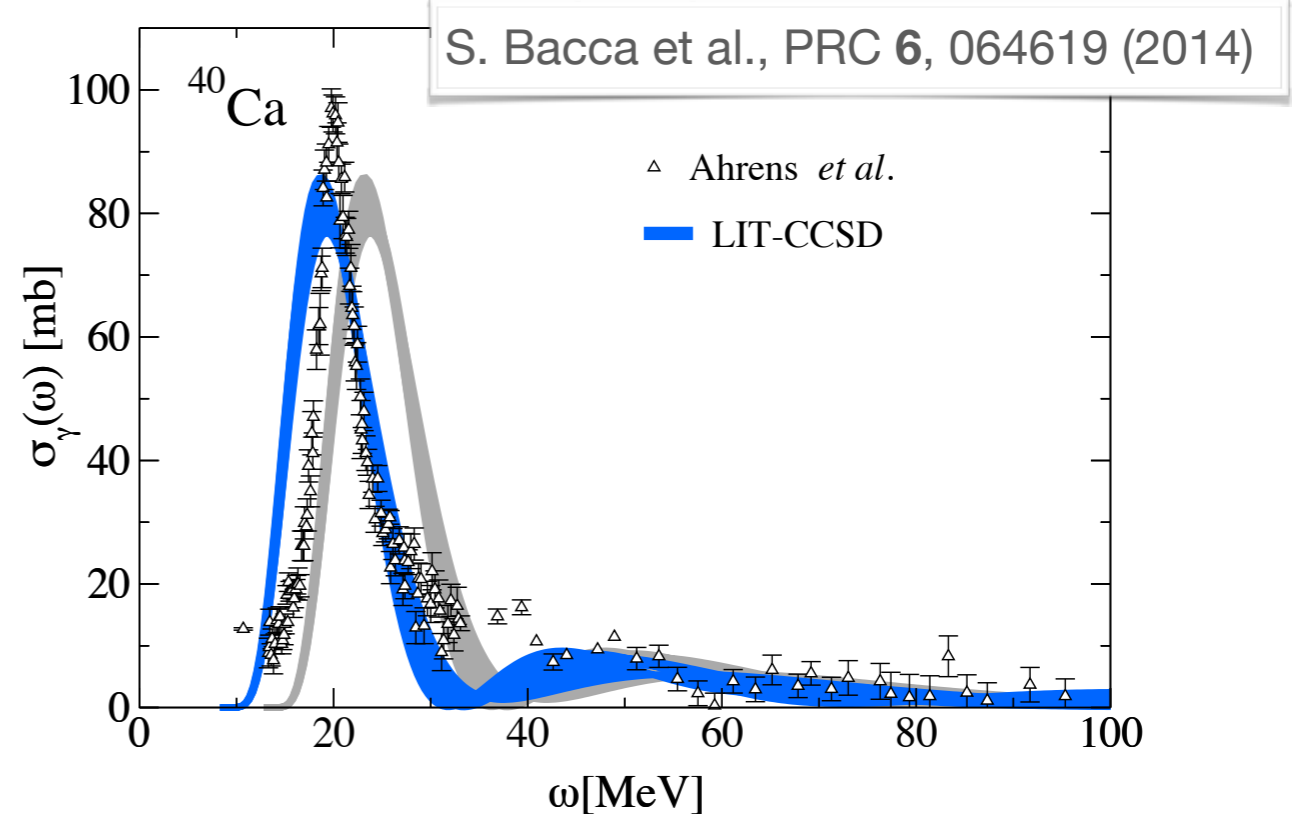
has been successfully exploited in the calculation of electromagnetic and neutral-weak responses



S. Bacca et al., PRC **76**, 014003 (2007)



S. Bacca et al., PRL **111**, 122502 (2013)



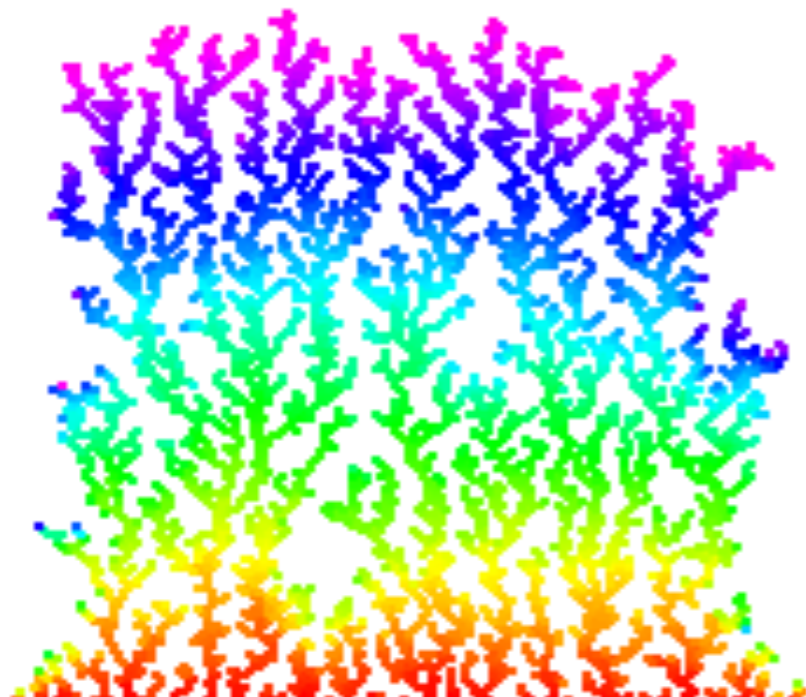
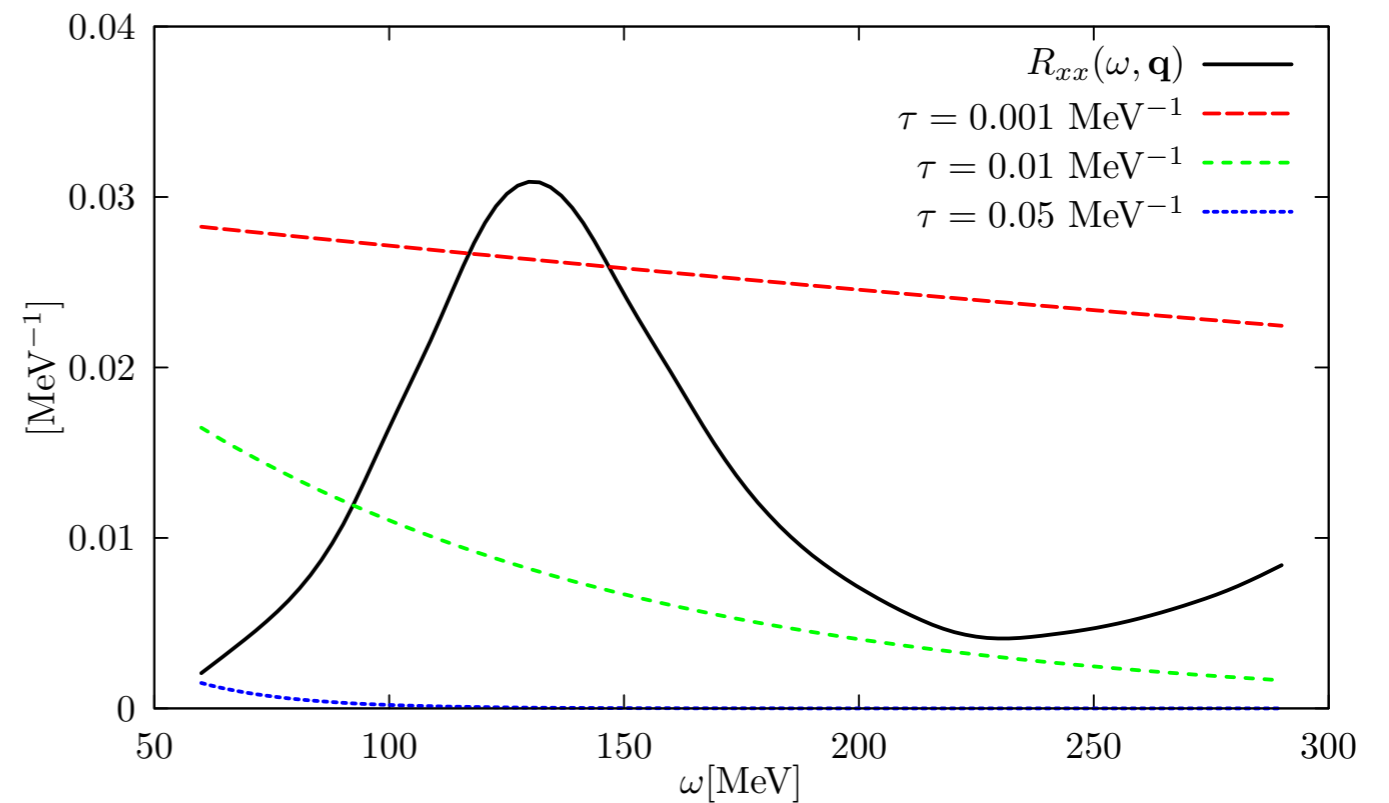
S. Bacca et al., PRC **6**, 064619 (2014)

# Euclidean response function

Valuable information on the energy dependence of the response functions can be inferred from their **Laplace transforms**

$$E_{\alpha\beta}(\tau, \mathbf{q}) \equiv \int d\omega e^{-\omega\tau} R_{\alpha\beta}(\omega, \mathbf{q})$$

At finite imaginary time the contributions from large energy transfer are quickly suppressed



The system is first heated up by the transition operator. Its cooling determines the **Euclidean response** of the system

$$E_{\alpha\beta}(\tau, \mathbf{q}) = \langle \Psi_0 | J_{\alpha}^{\dagger}(\mathbf{q}) e^{-\sum_f |\Psi_f\rangle\langle\Psi_f| (H-E_0)\tau} J_{\beta}(\mathbf{q}) | \Psi_0 \rangle$$

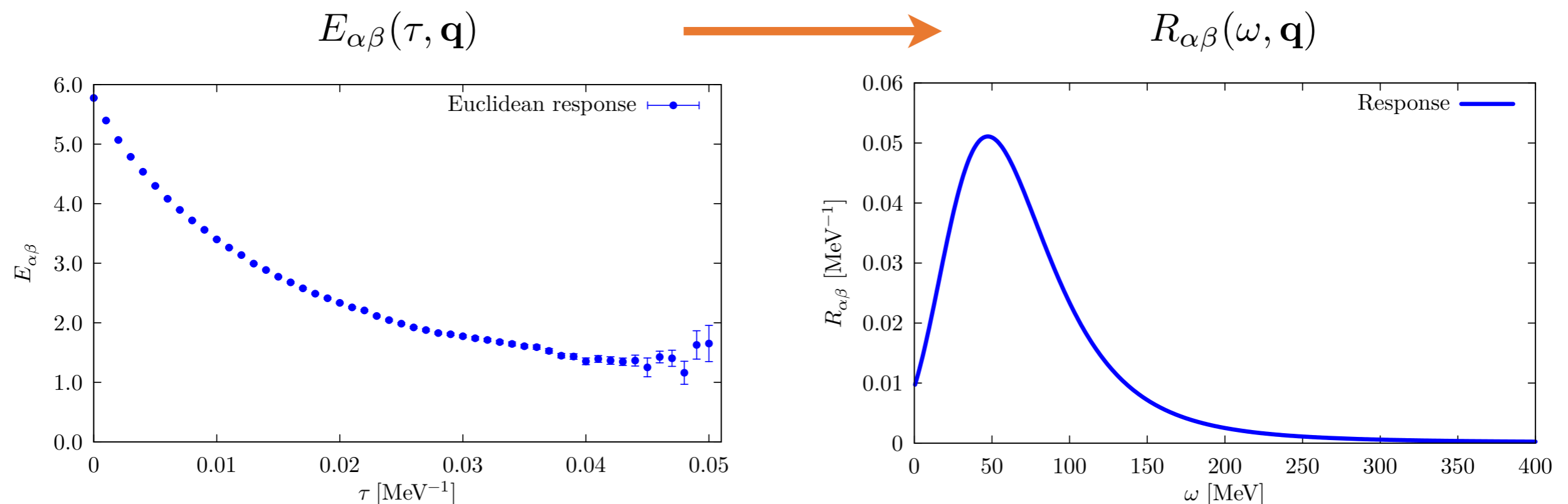
Analogous techniques are used in Lattice QCD and condensed matter Physics



# (Future) Inversion of the Euclidean response

The Euclidean response formalism allows one to extract dynamical properties of the system from ground-state calculations

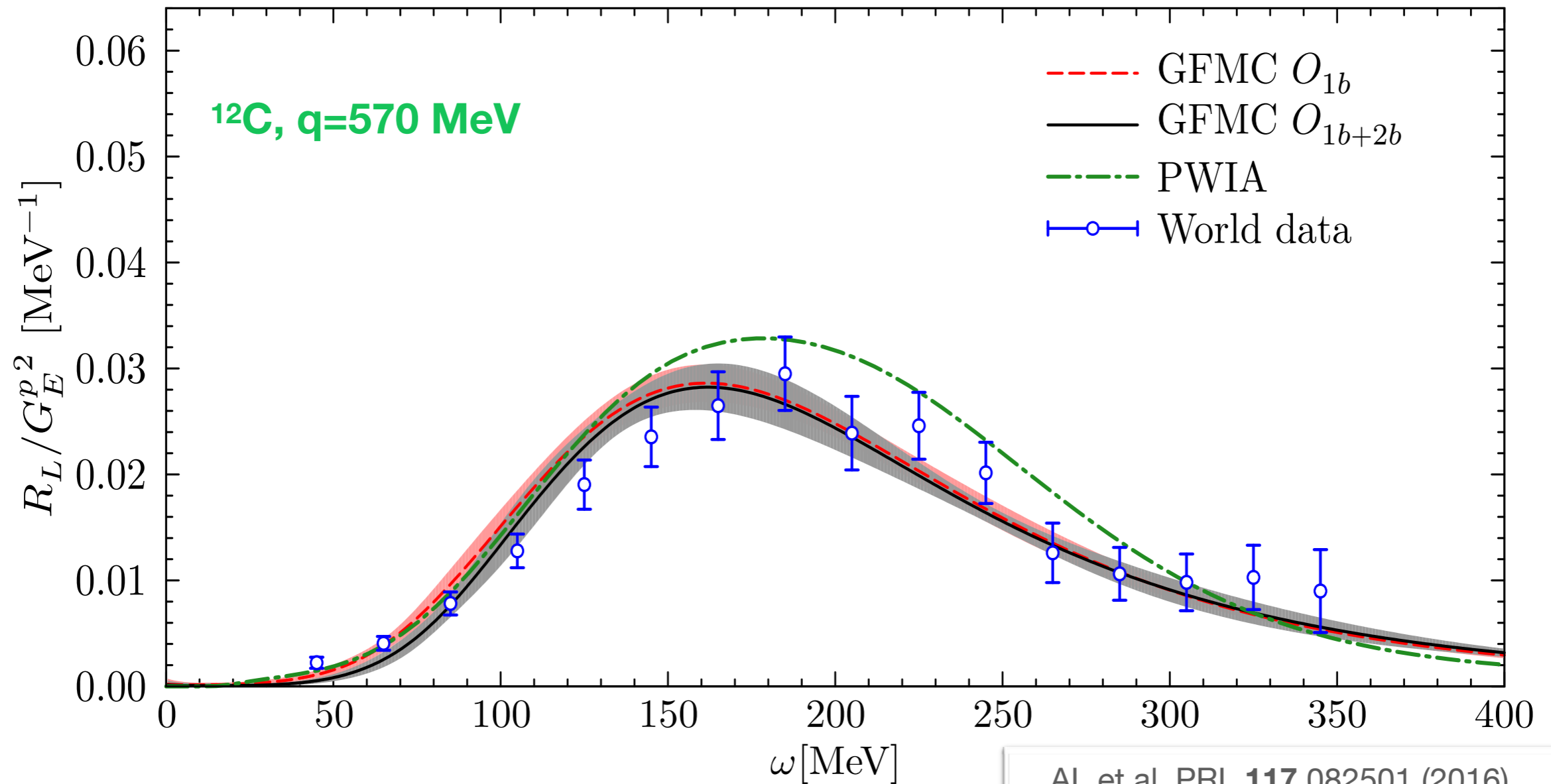
**Inverting the Euclidean response is an ill posed problem:** any set of observations is limited and noisy and the situation is even worse since the kernel is a smoothing operator.



**Maximum-entropy techniques** are reliable enough for quasi-elastic responses

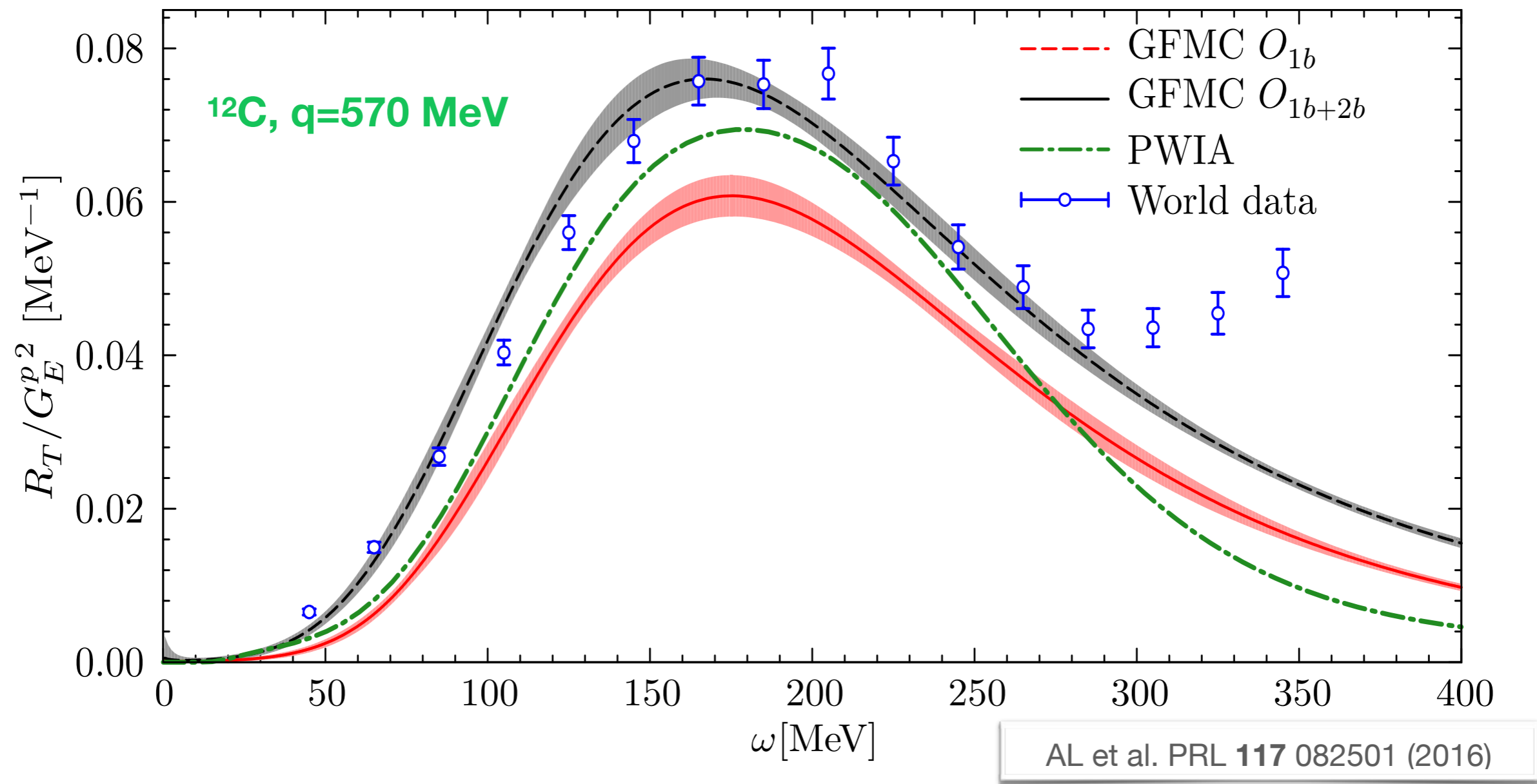
We are now exploring new strategies, based on **deep learning techniques**, to improve the accuracy of the inversion and to better estimate the associated uncertainties

# $^{12}\text{C}$ electromagnetic response



- Correlations and interaction effects in the final states redistribute strength from the quasi-elastic peak to high-energy transfer regions
- Good agreement with data **without in-medium modifications** of the nucleon form factors
- Small contribution from two-body currents.

# $^{12}\text{C}$ electromagnetic response

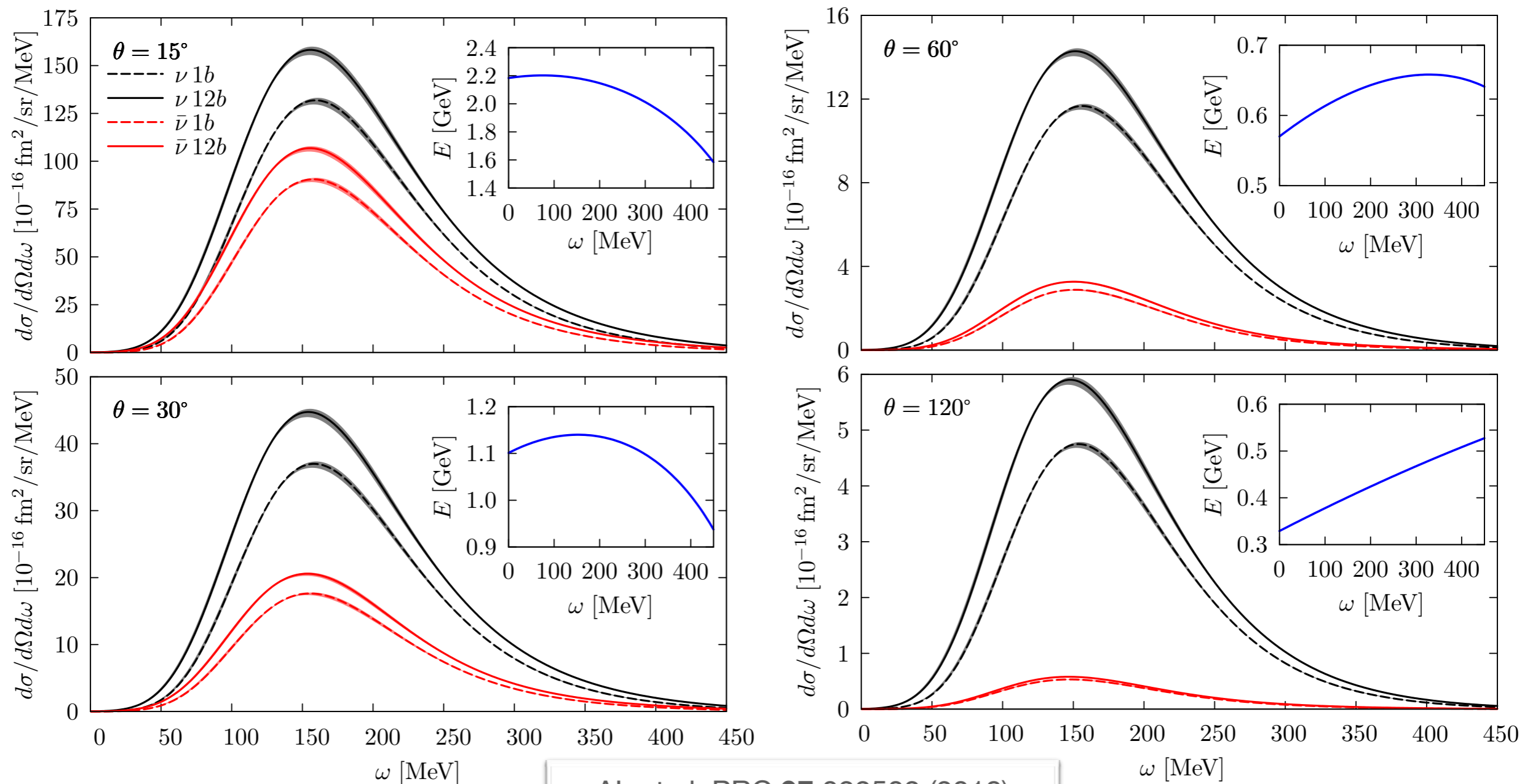


- Two-body currents generate a **large excess of strength** in over the whole quasi-elastic region
- Correlations and interaction effects in the final states redistribute strength from the quasi-elastic peak to high-energy transfer regions
- Need to include relativistic corrections in the kinematics

# $^{12}\text{C}$ neutral-current cross-section

- The anti-neutrino cross section decreases rapidly relative to the neutrino cross section as the scattering angle changes from the forward to the backward hemisphere
- Sizable enhancement from two-body currents**, more effective for neutrino than for anti-neutrino

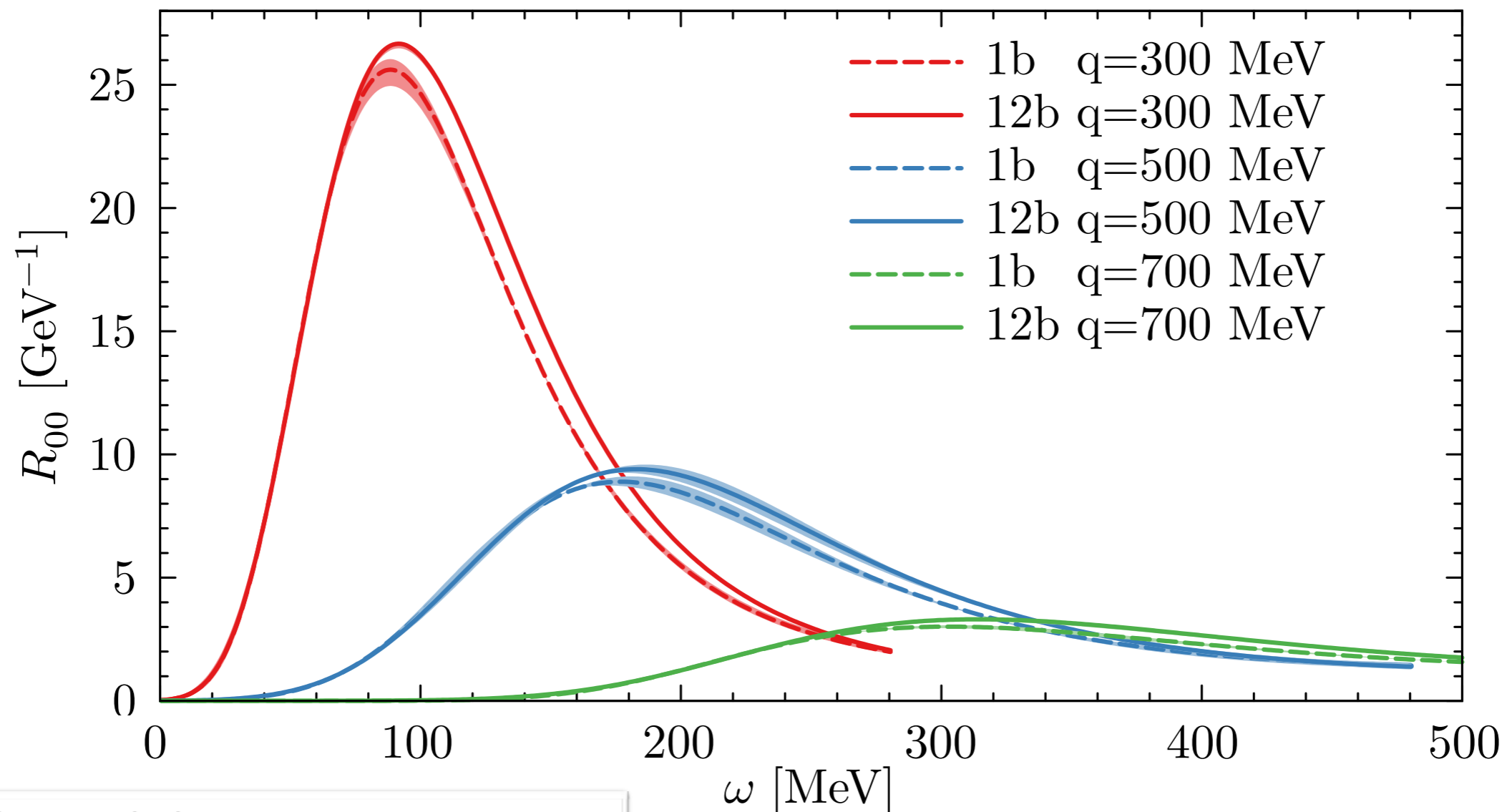
$$\sigma \propto [v_{00}R_{00} + v_{zz}R_{zz} - v_{0z}R_{0z} + v_{xx}R_{xx} \mp v_{xy}R_{xy}]$$



# $^{12}\text{C}$ charged-current responses

Computing charged-current reactions required **extending the GFMC** to propagate intermediate states with different numbers of protons and neutrons compared to the ground state

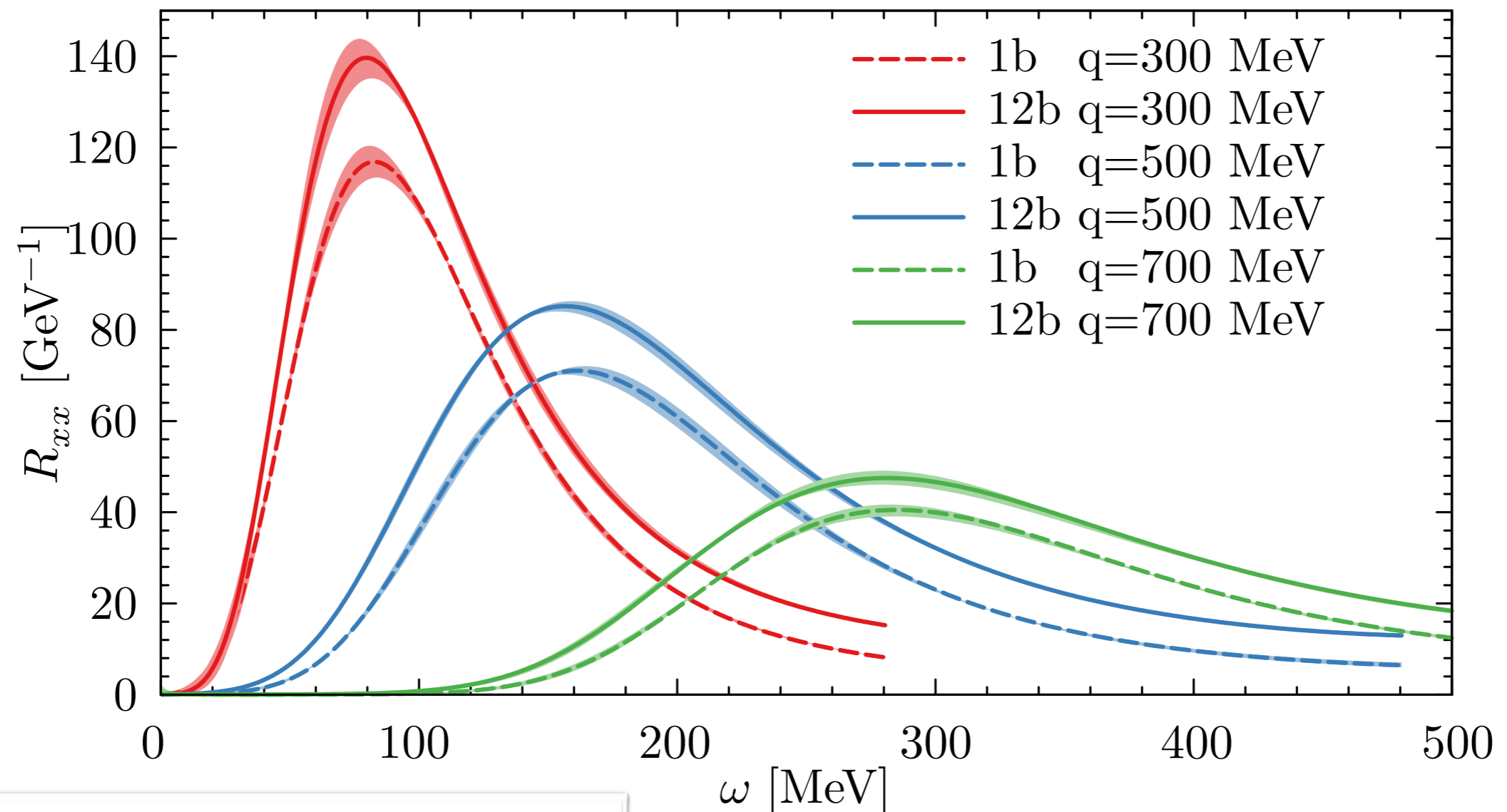
Two-body currents have **little effect in the vector term**, but enhance the axial contribution at energy larger than quasi-elastic kinematics



# $^{12}\text{C}$ charged-current responses

Computing charged-current reactions required **extending the GFMC** to propagate intermediate states with different numbers of protons and neutrons compared to the ground state

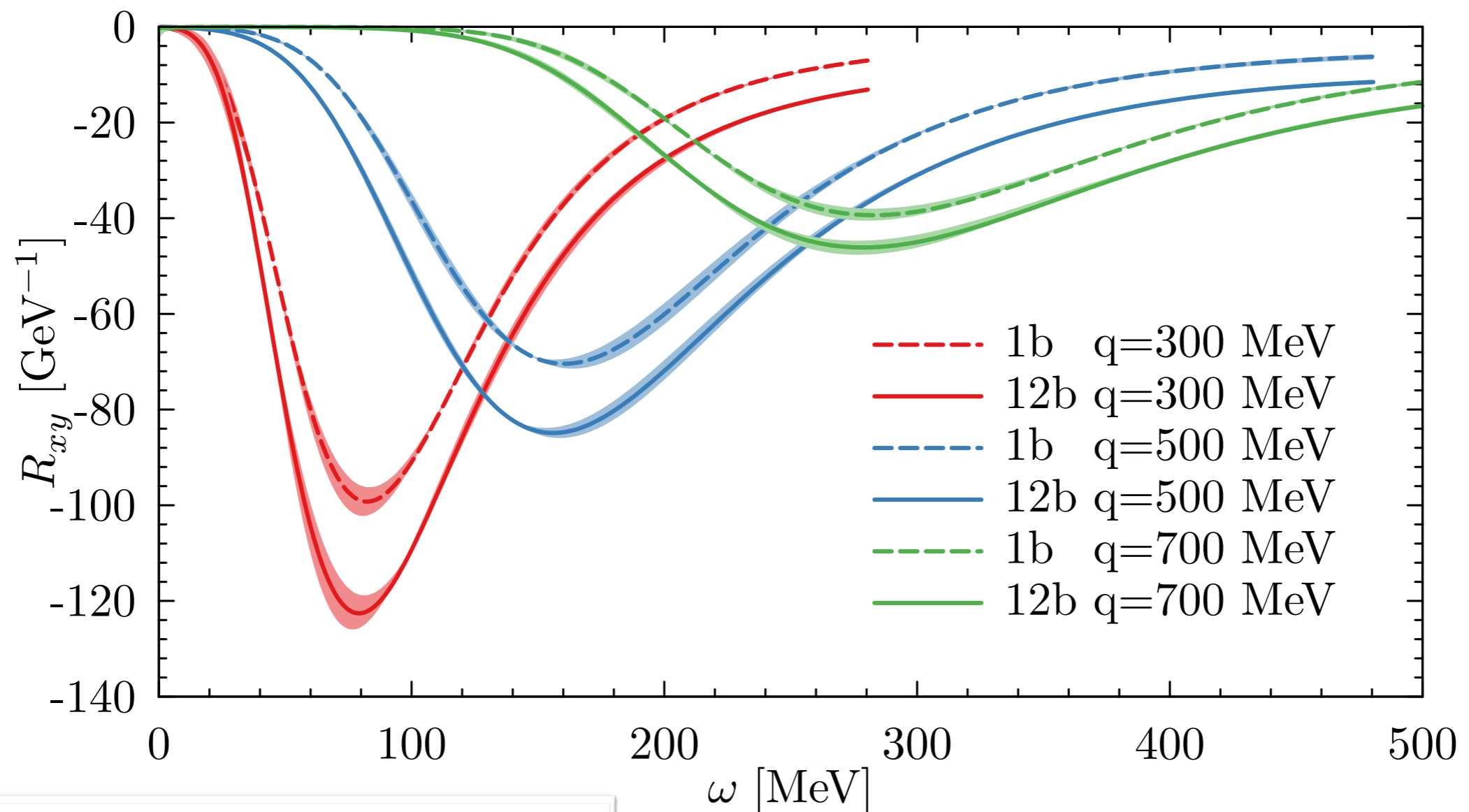
Two-body currents have a **sizeable effect in the transverse response**, both in the vector and in the axial contributions



# $^{12}\text{C}$ charged-current responses

Computing charged-current reactions required **extending the GFMC** to propagate intermediate states with different numbers of protons and neutrons compared to the ground state

Two-body currents have a **sizable effect in the interference between the axial and vector current contributions**, important to assess neutrino/antineutrino event rates



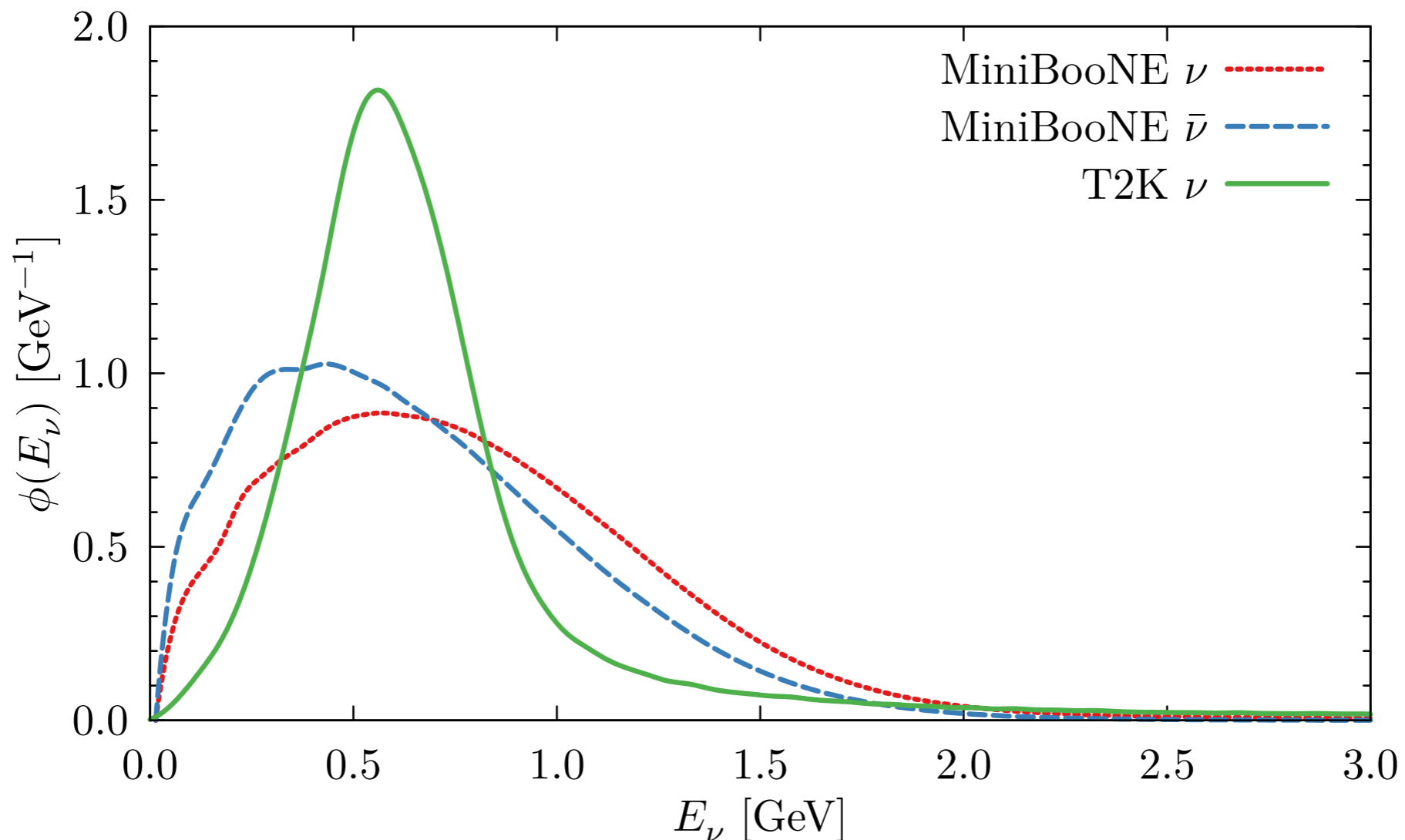


# $^{12}\text{C}$ charged-current cross sections

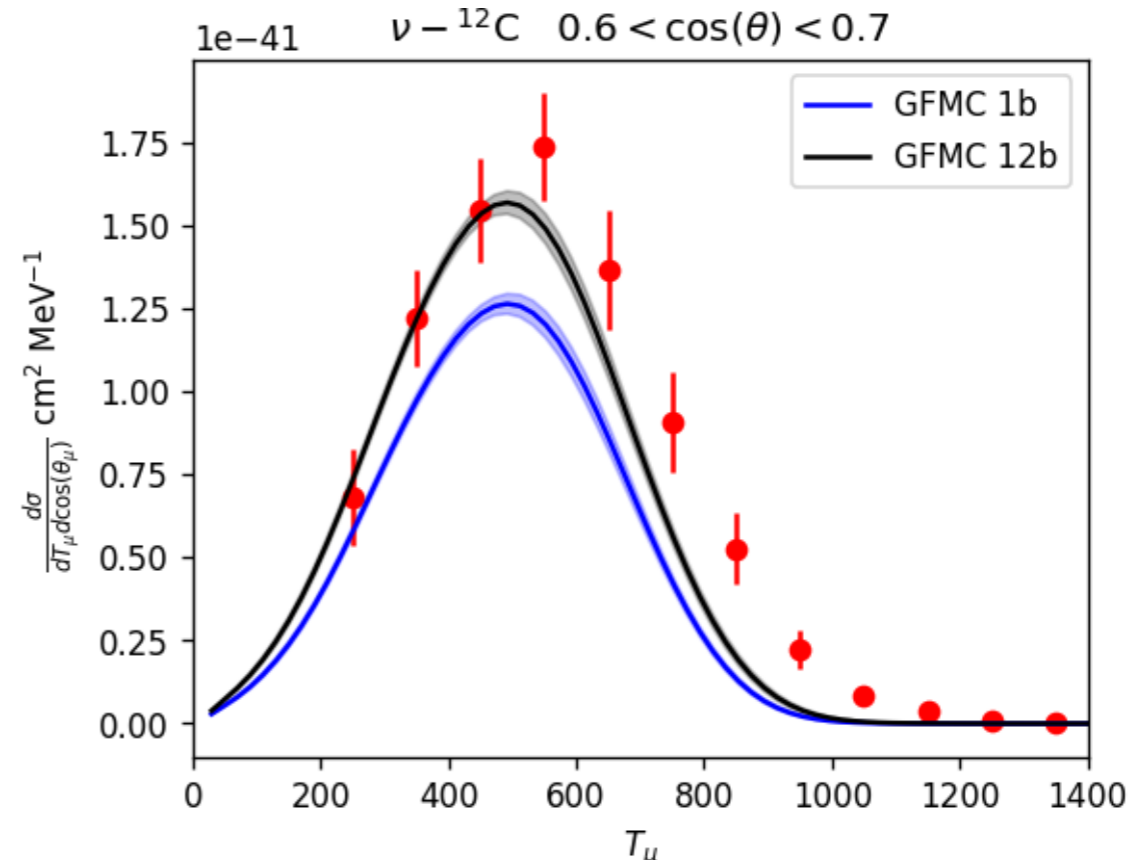
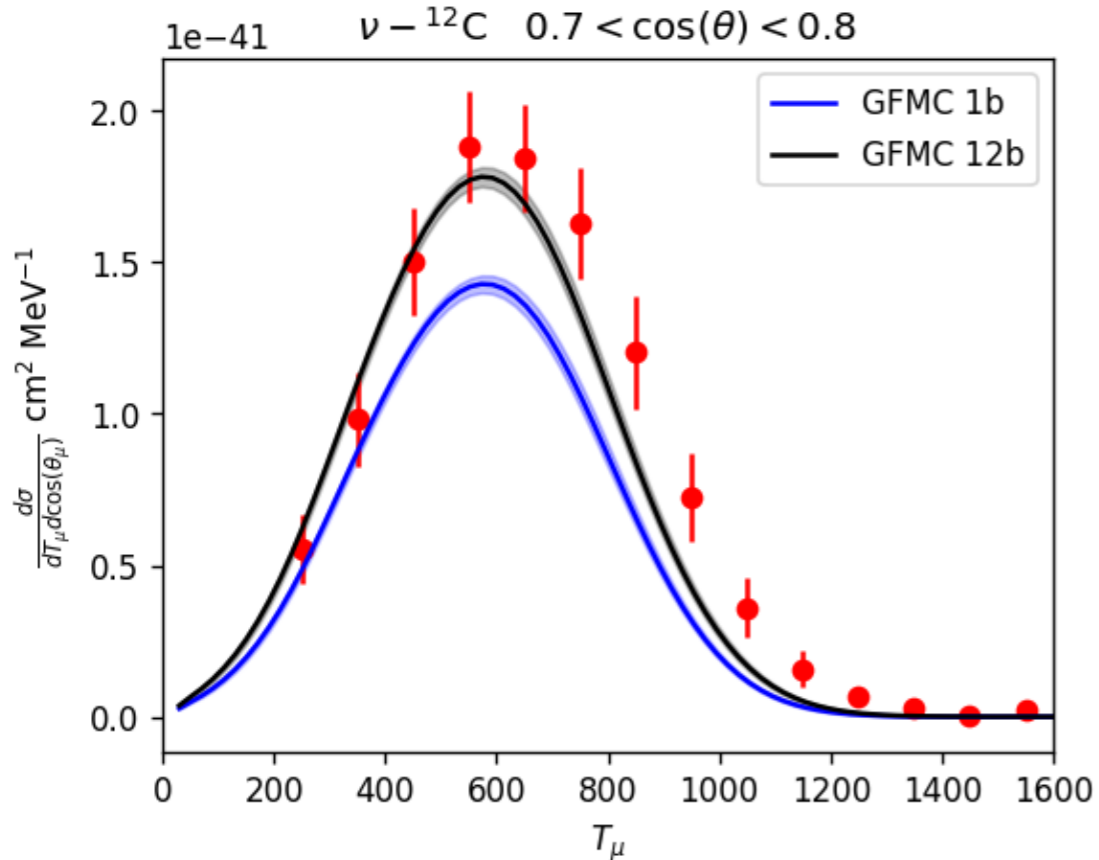
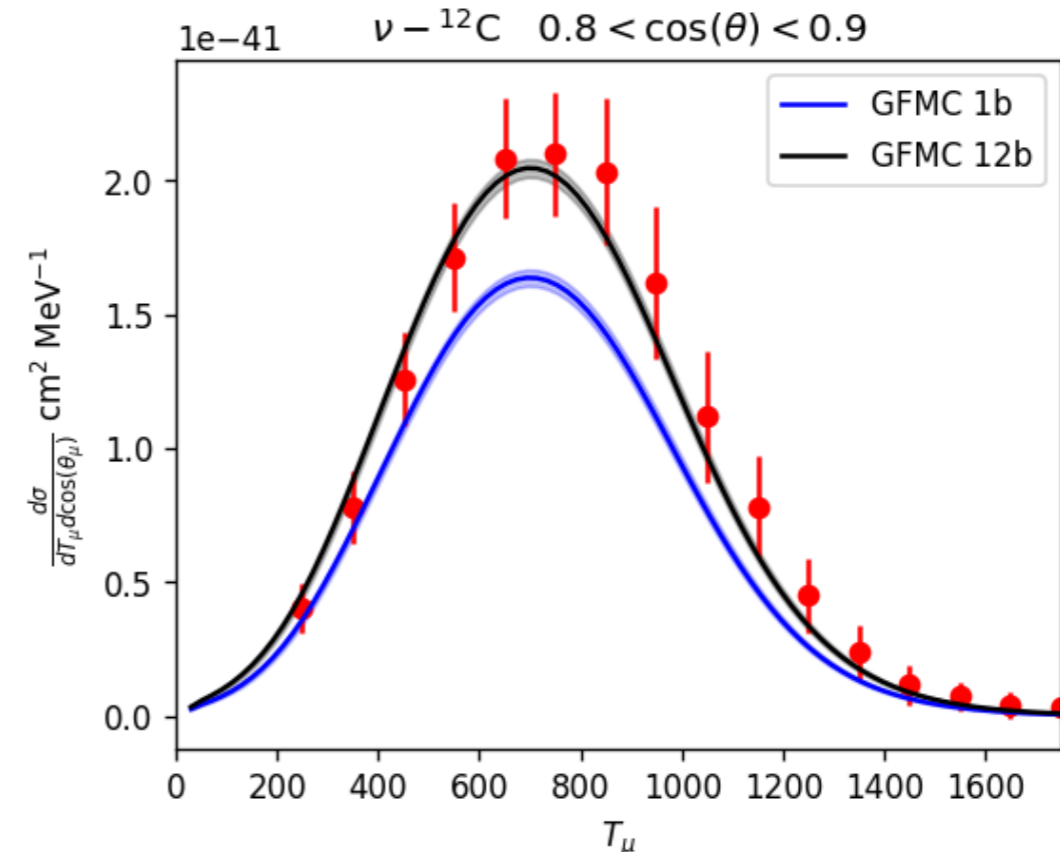
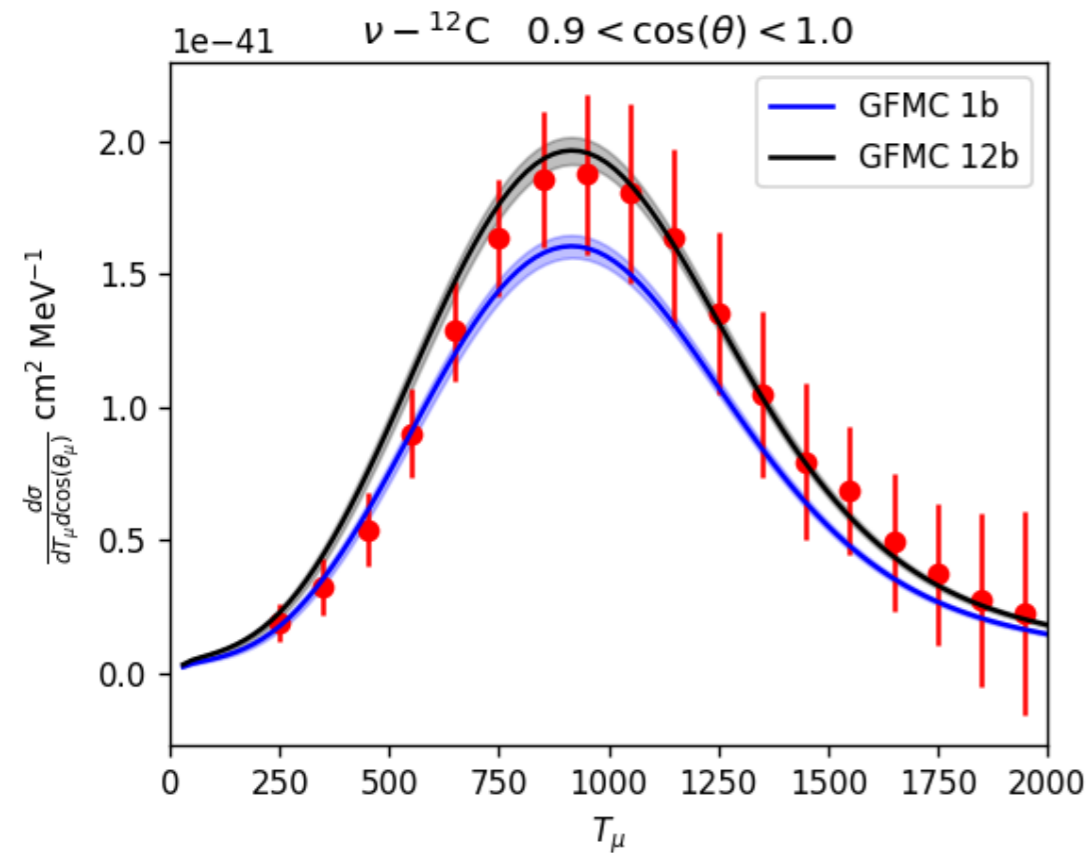
To obtain the inclusive cross section, we interpolate the response functions and fold the cross section with the fluxes of the MiniBooNE and T2K experiments

$$\left\langle \frac{d\sigma}{dT_\mu d\cos\theta_\mu} \right\rangle = \int dE_\nu \phi(E_\nu) \frac{d\sigma(E_\nu)}{dT_\mu d\cos\theta_\mu},$$

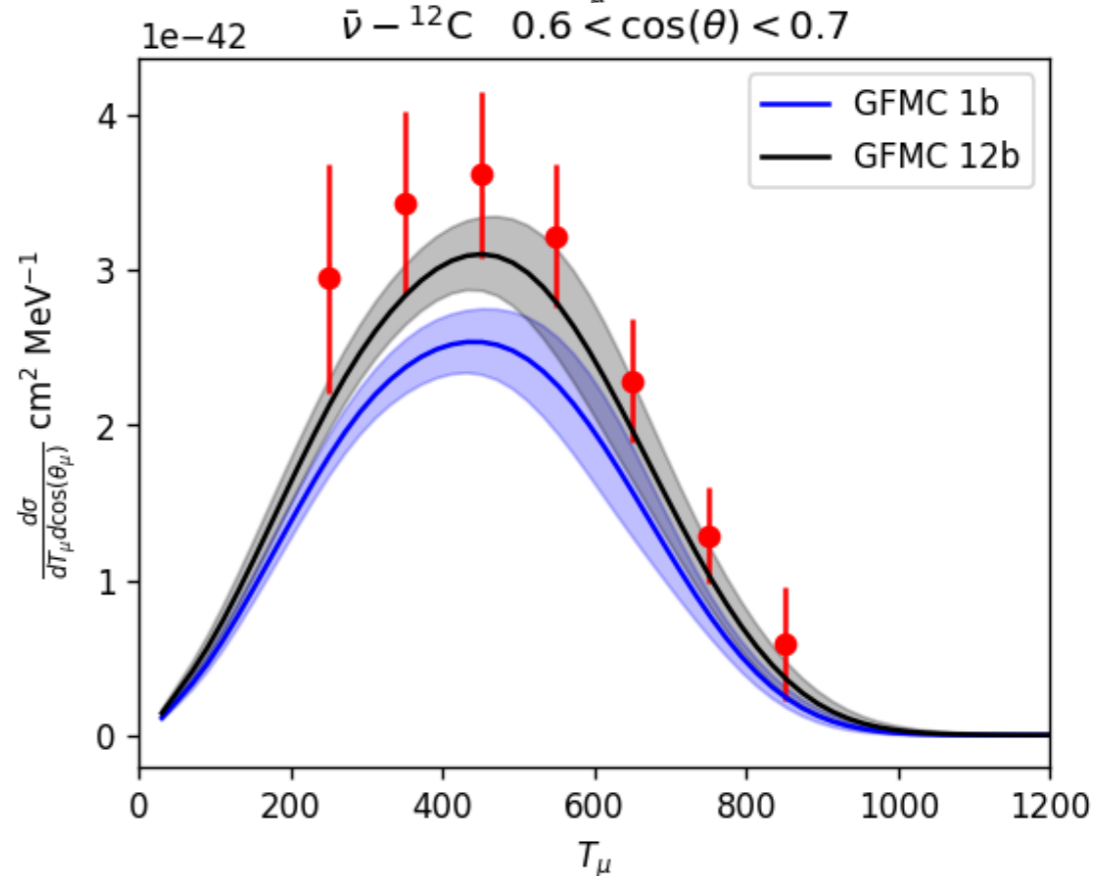
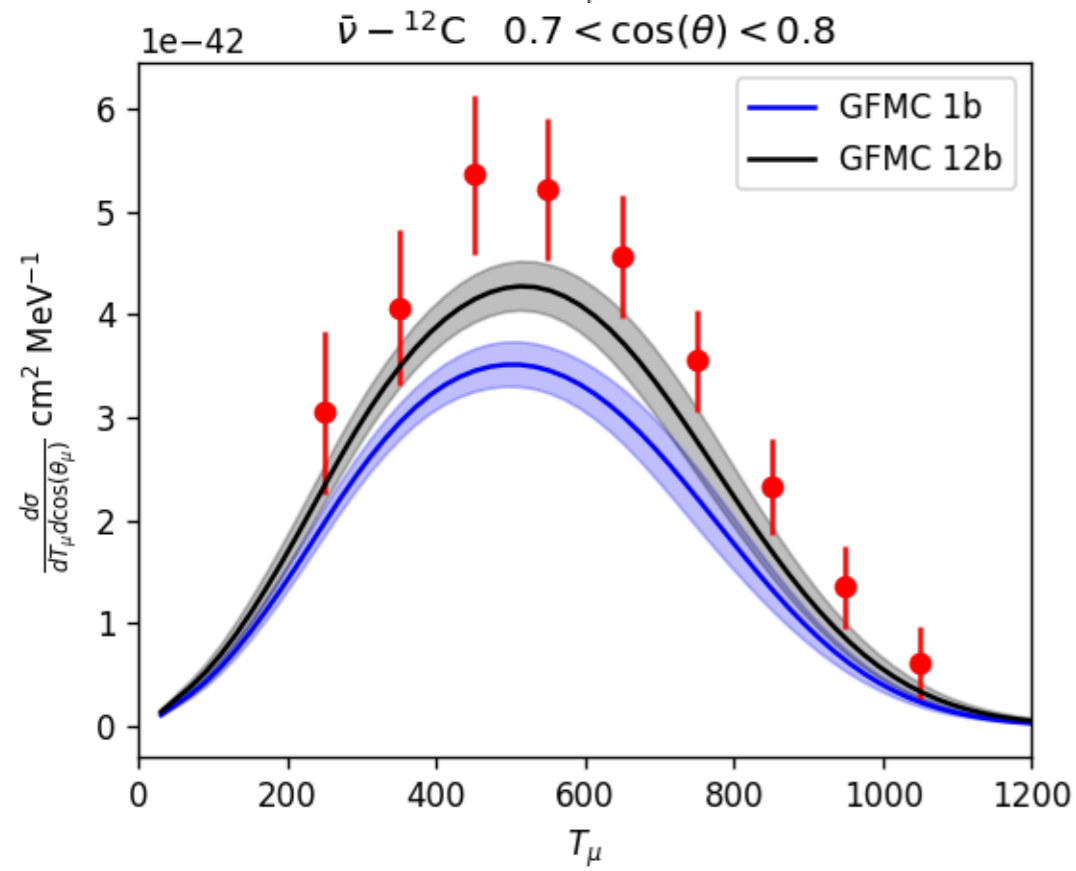
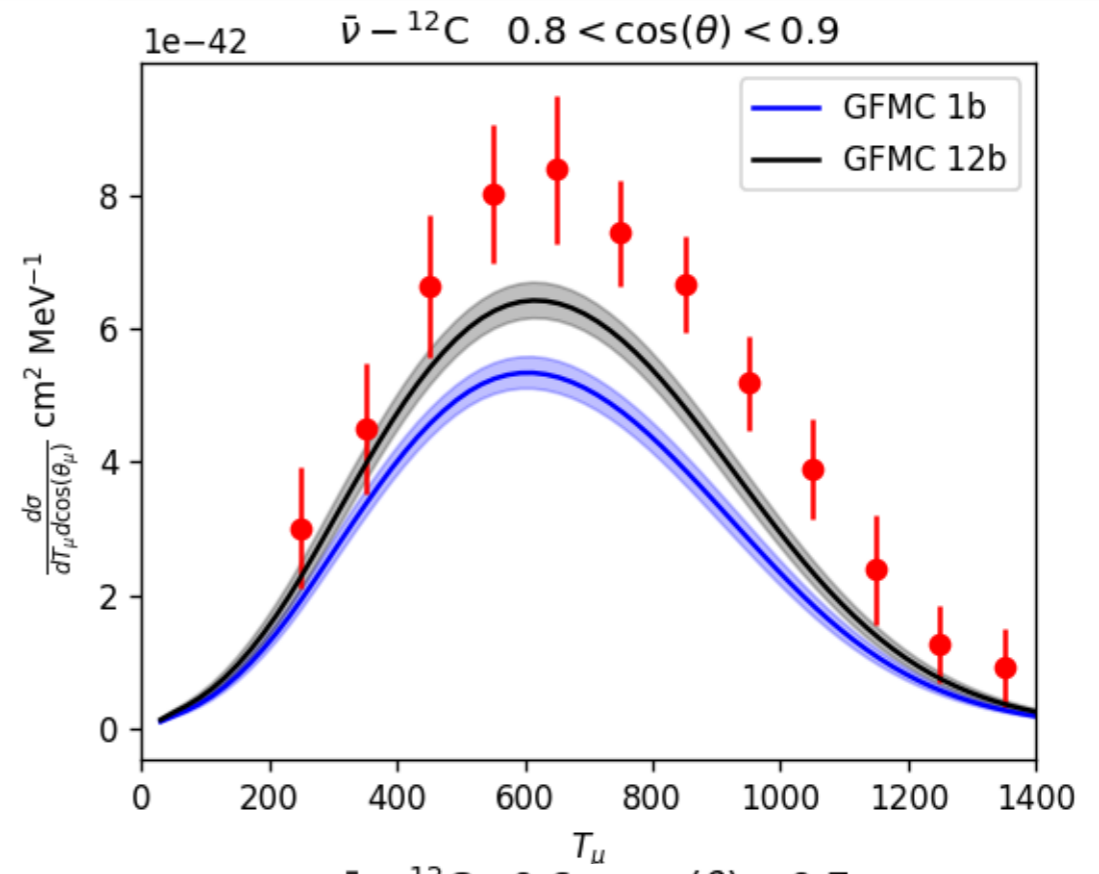
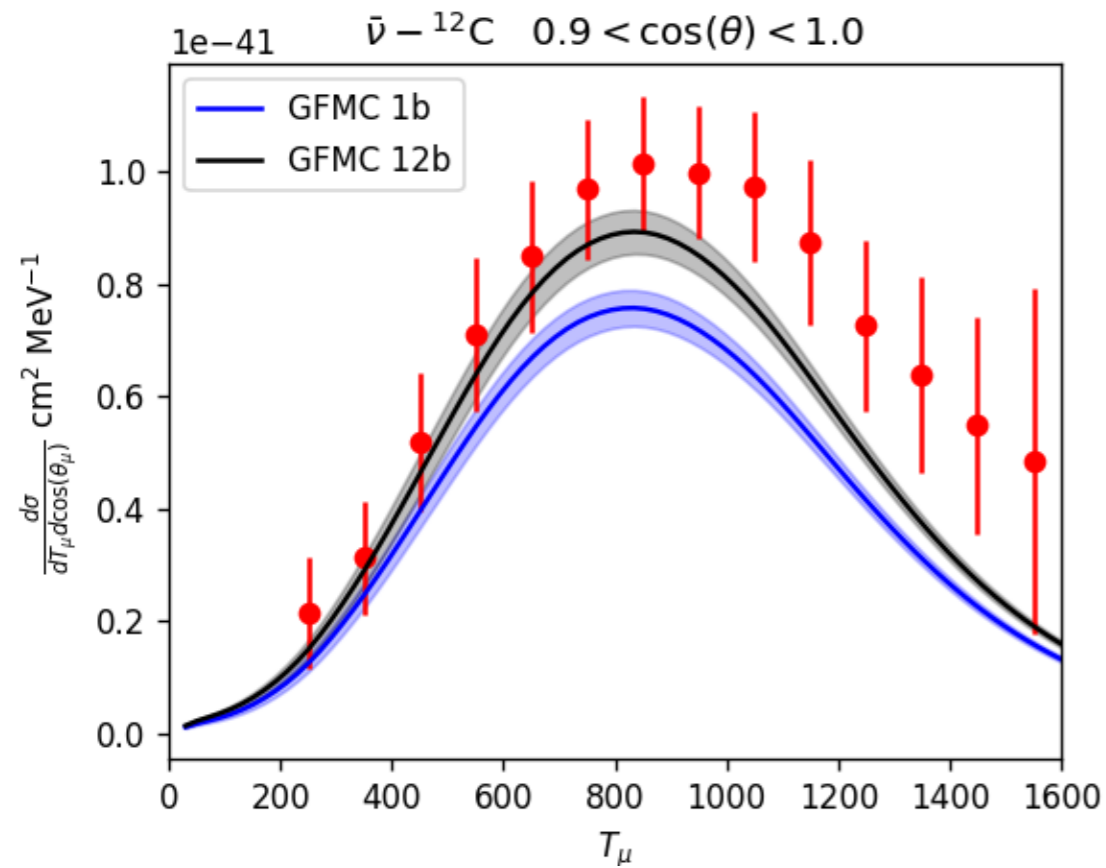
The energy of neutrino beams, produced as secondary decay products, is not monochromatic



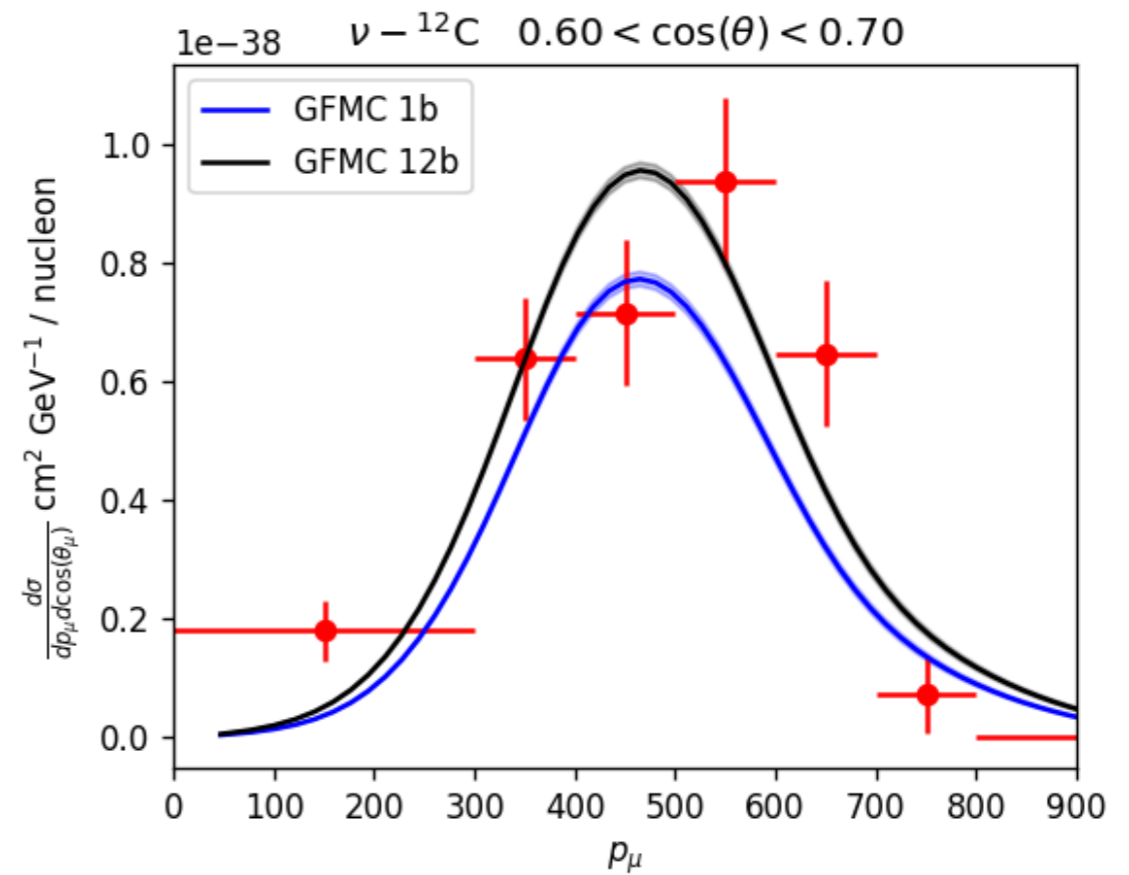
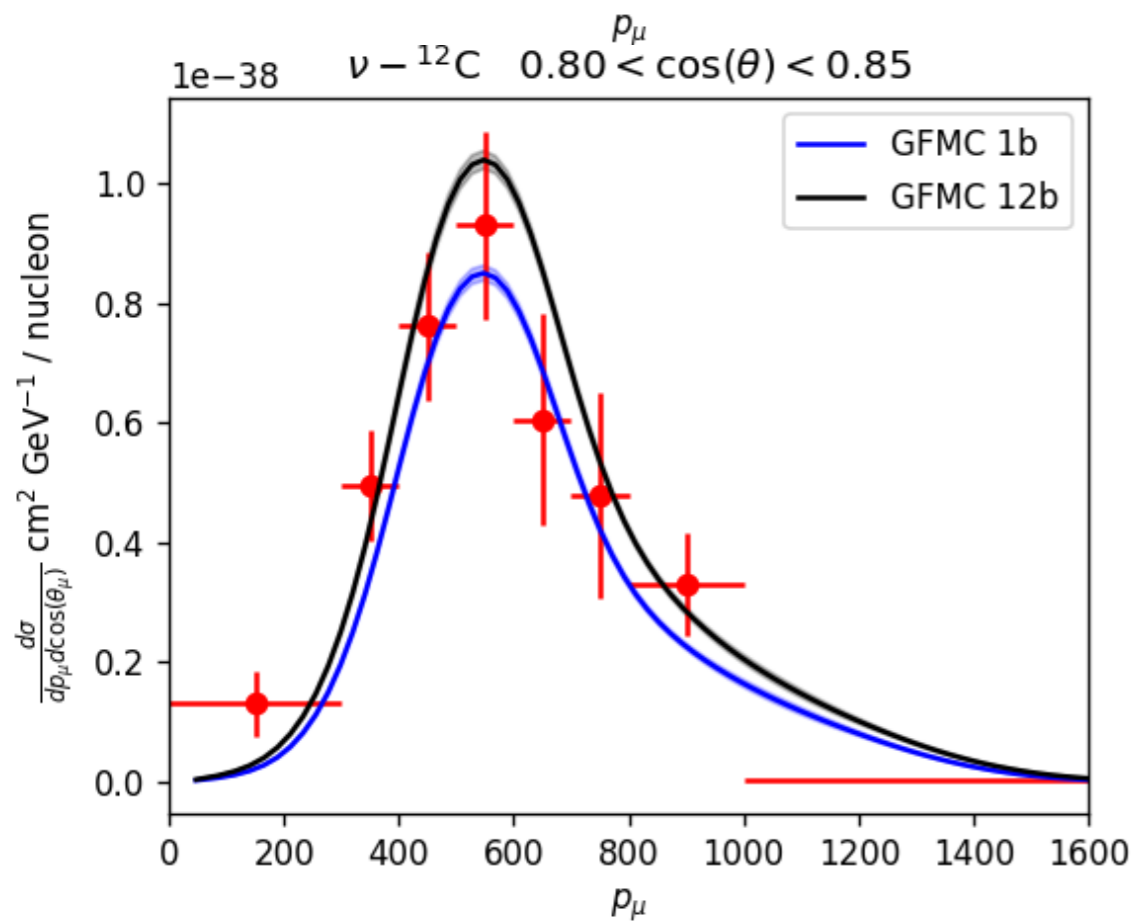
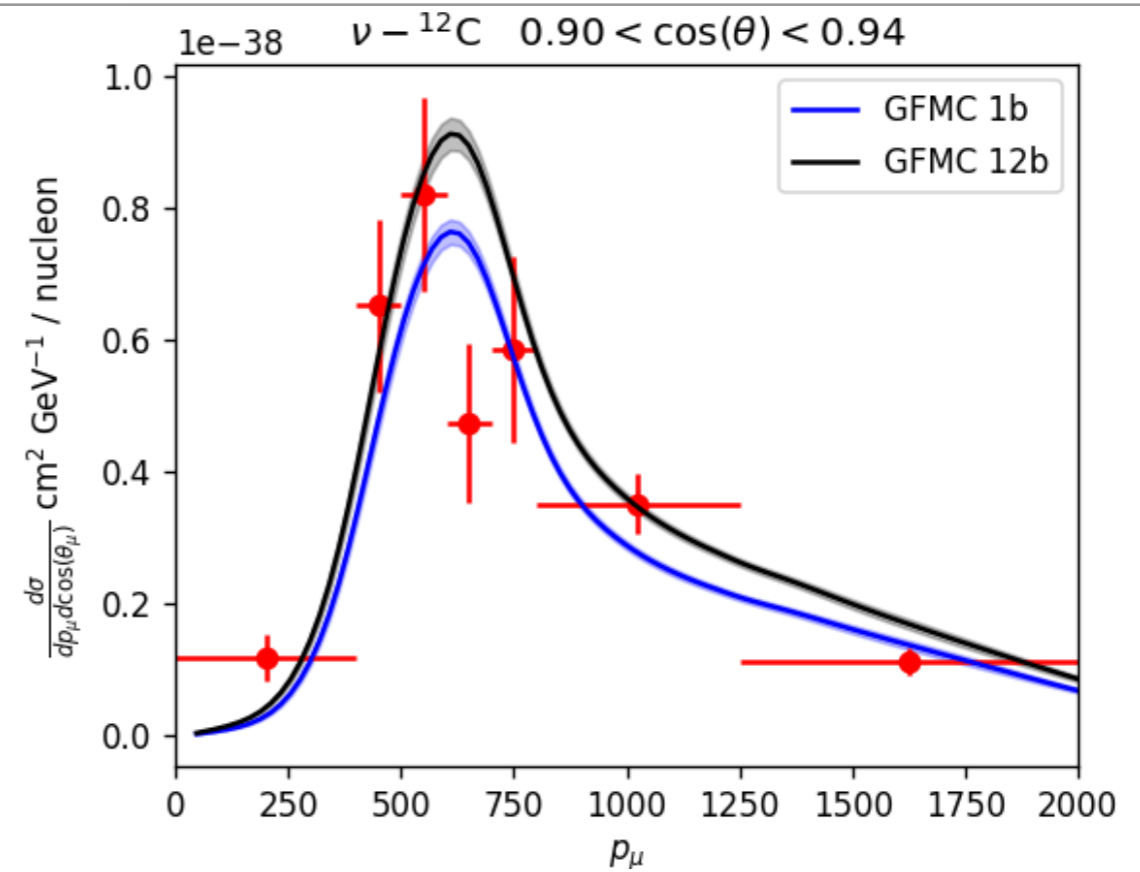
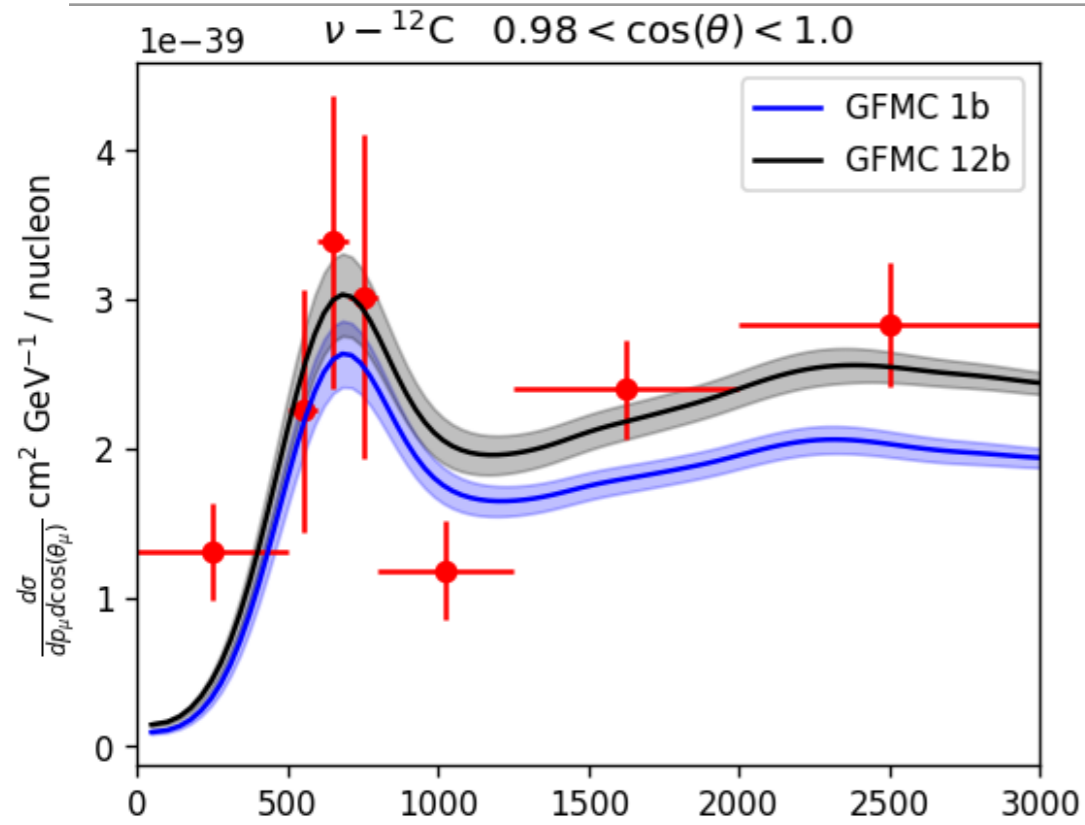
# MiniBoone cross sections



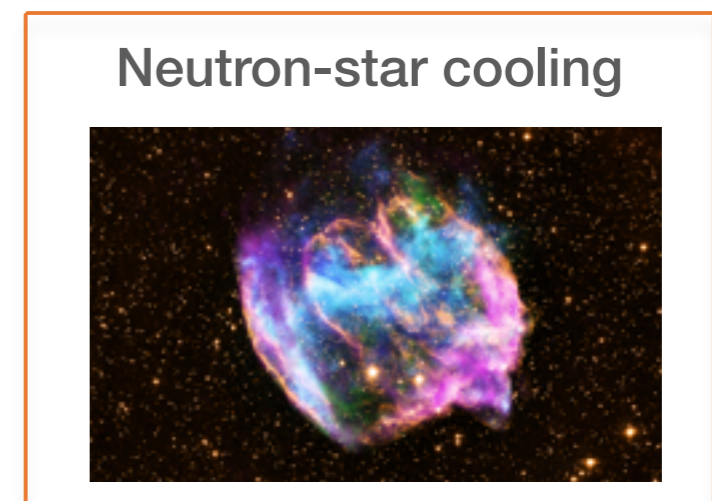
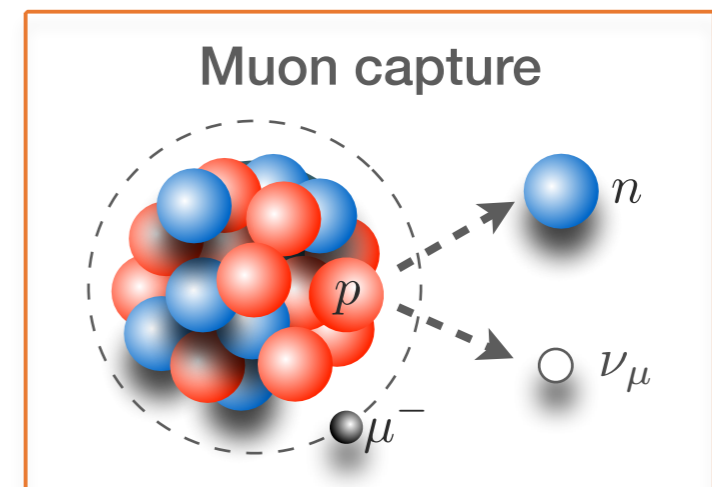
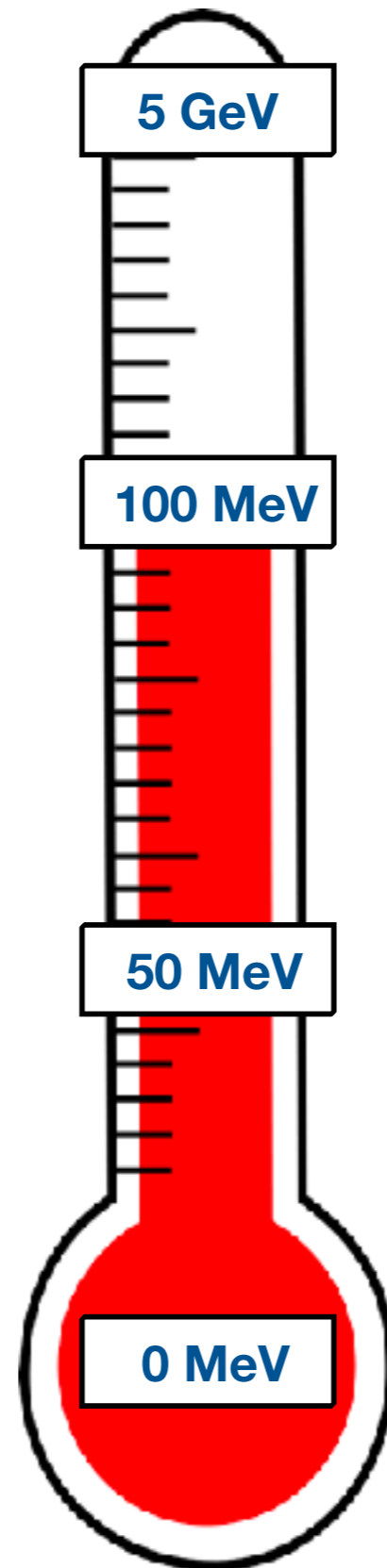
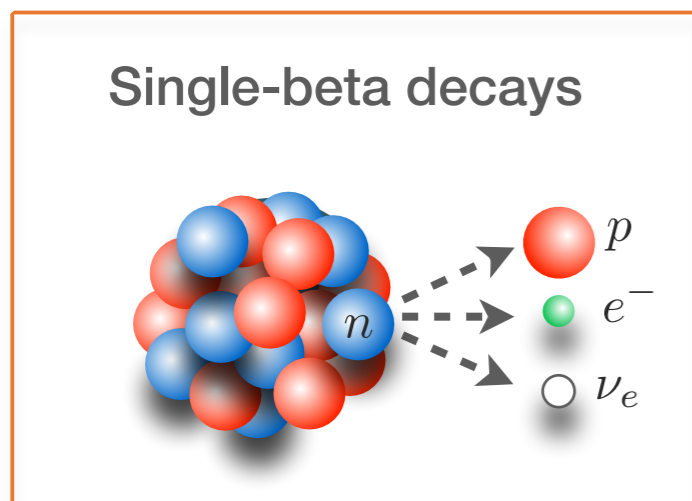
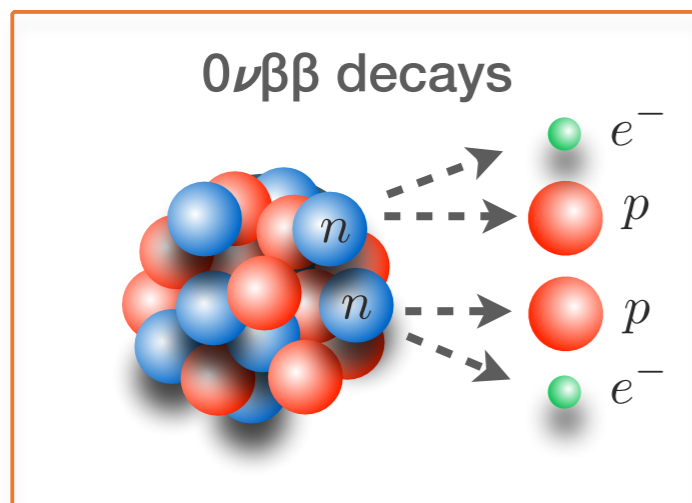
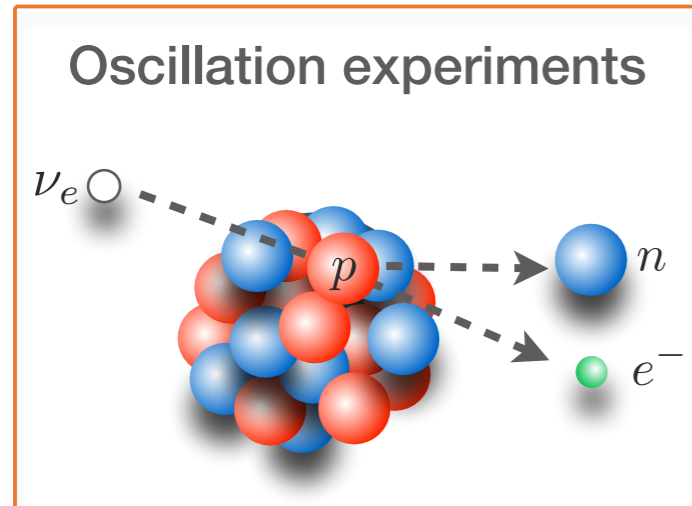
# MiniBoone cross sections



# T2K cross sections



# Momentum scales in neutrino interactions

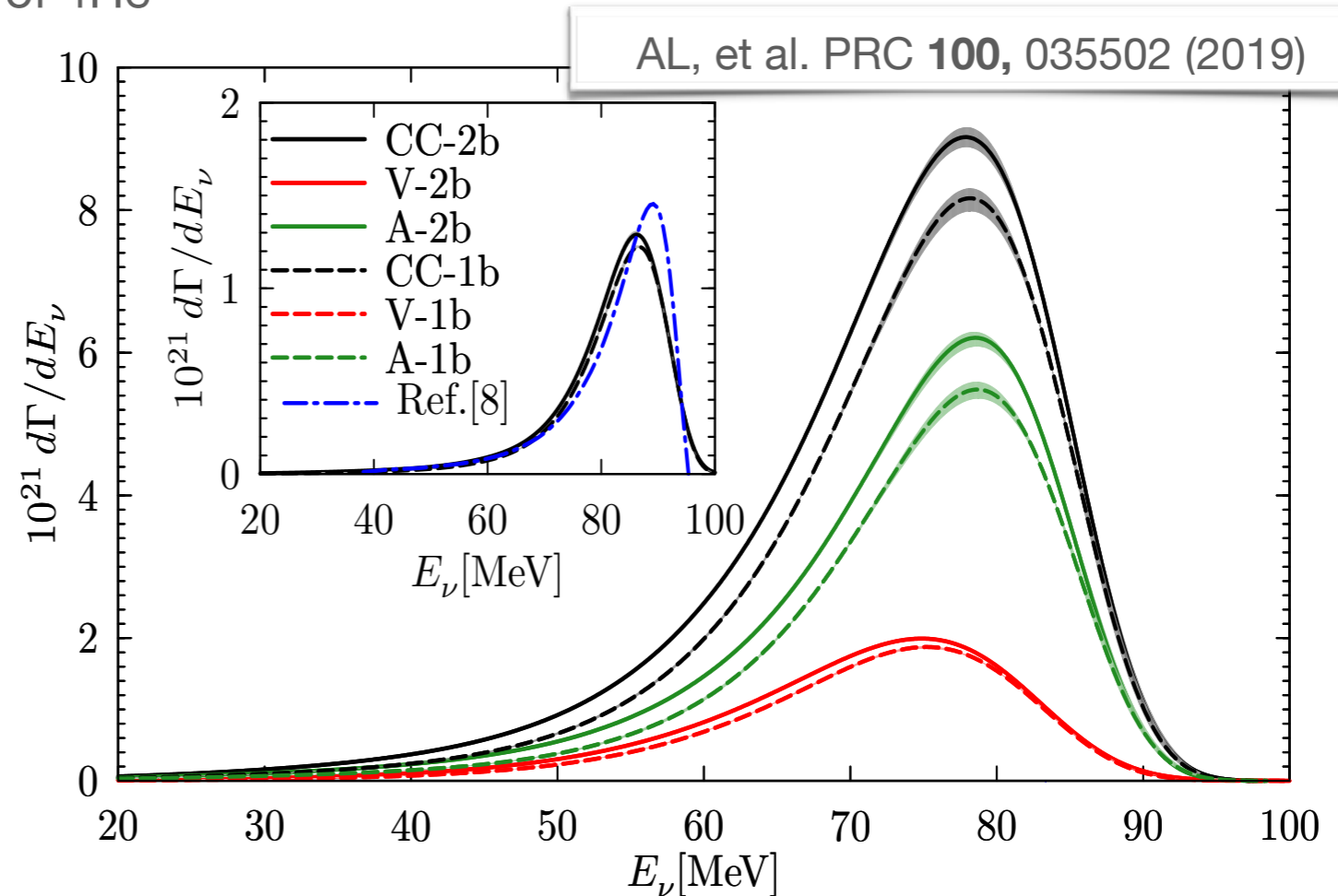
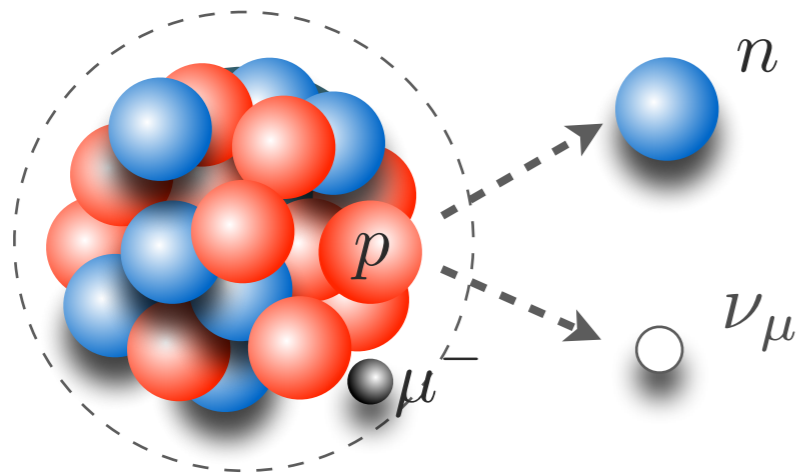




# Muon capture in $^3\text{H}$ and $^4\text{He}$

To **validate our model of nuclear dynamics** at intermediate values of momentum transfer we computed the total muon-capture rate of  $^4\text{He}$

- Role of **two-body axial terms**
- Single-nucleon **axial form factor**



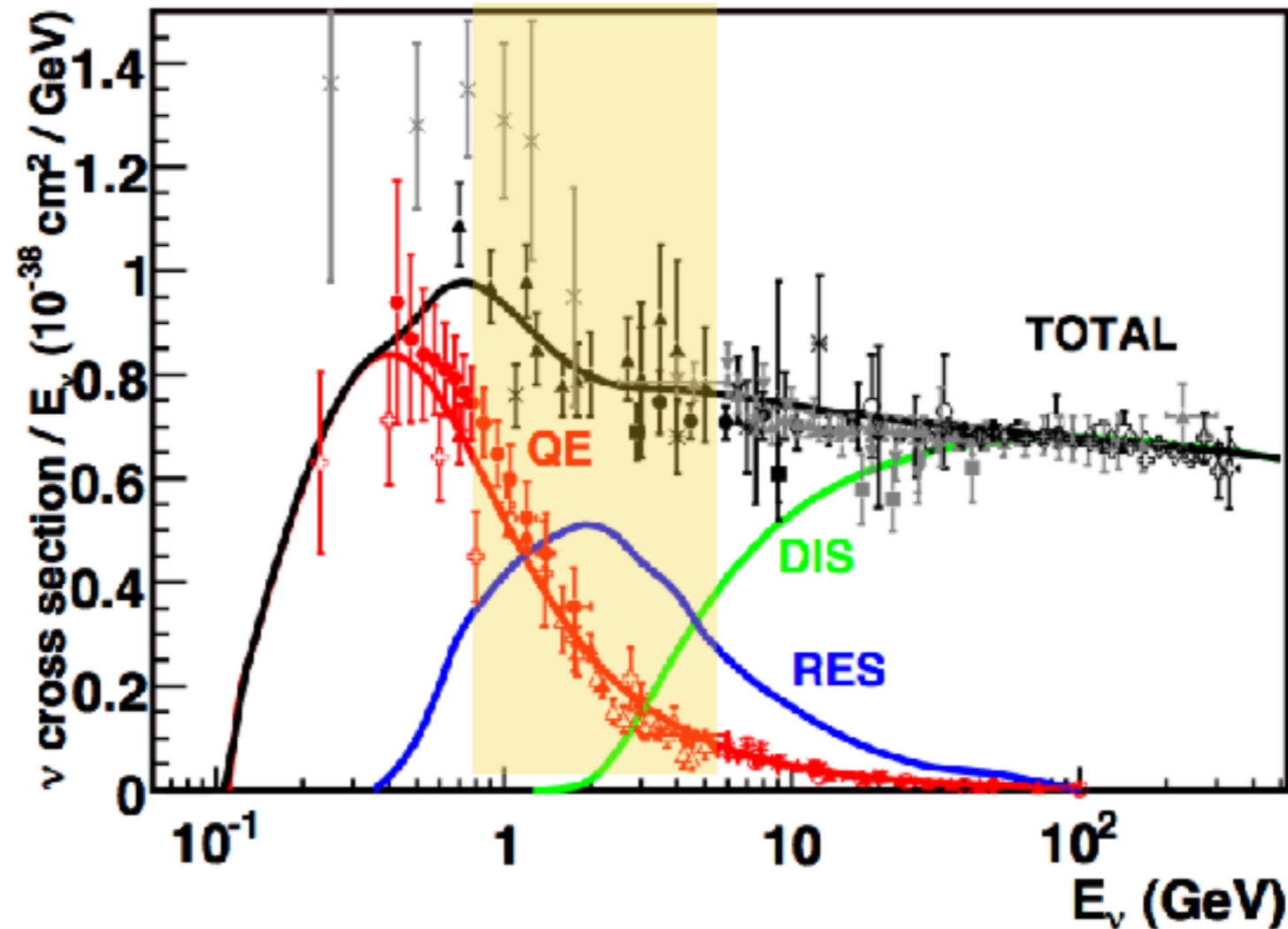
Excellent agreement with available data, which have large errors. **New measurements?**

	CC-1b	CC-2b	Exp [54]	Exp [55]	Exp [56]	Th [57]	Th [58]
$\Gamma(\text{s}^{-1})$	$265 \pm 9$	$306 \pm 9$	$336 \pm 75$	$375^{+30}_{-300}$	$364 \pm 46$	$345 \pm 110$	278

Two-body currents increase the rate by  $\sim 15\%$ . Percent effects from 10% change in the axial mass

# Addressing DUNE's physics

DUNE will be sensitive to a broad range of energies, characterized by different reaction mechanisms involving both nucleon and nuclear dynamics;



- Include fully relativistic (one- and two-body) currents and fully relativistic kinematics
- Resonance production and DIS scattering play an important role
- Keep a realistic description of the nuclear ground state



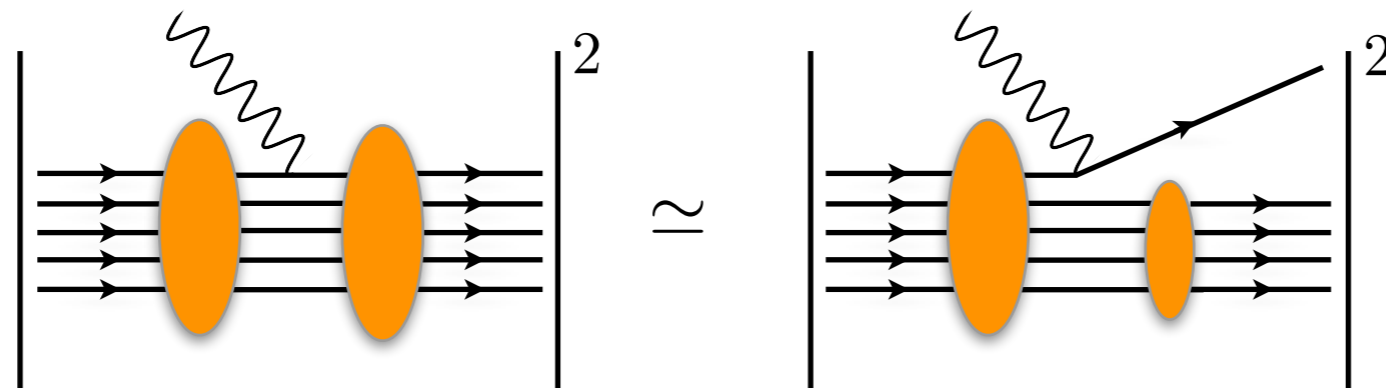
# “Standard” factorization scheme

At **large momentum transfer**, scattering off a nuclear target reduces to the sum of scattering processes involving **individual bound nucleons**

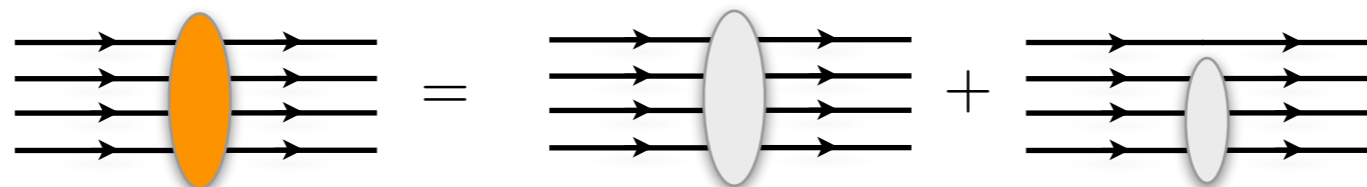
$$J^\mu \rightarrow \sum_i j_i^\mu \quad |\psi_f^A\rangle \rightarrow |p\rangle \otimes |\psi_f^{A-1}\rangle \quad E_f = E_f^{A-1} + e(\mathbf{p})$$

The **incoherent contribution** of the one-body response reads

$$R_{\alpha\beta} \simeq \int \frac{d^3k}{(2\pi)^3} dE P_h(\mathbf{k}, E) \sum_i \langle k | j_\alpha^i | k + q \rangle \langle k + q | j_\beta^i | k \rangle \delta(\omega + E - e(\mathbf{k} + \mathbf{q}))$$



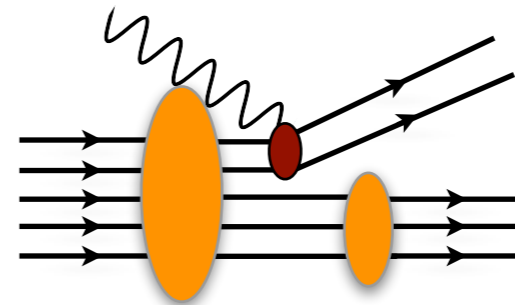
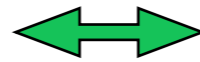
Excitations of the A-1 final state with **two nucleons in the continuum** are included



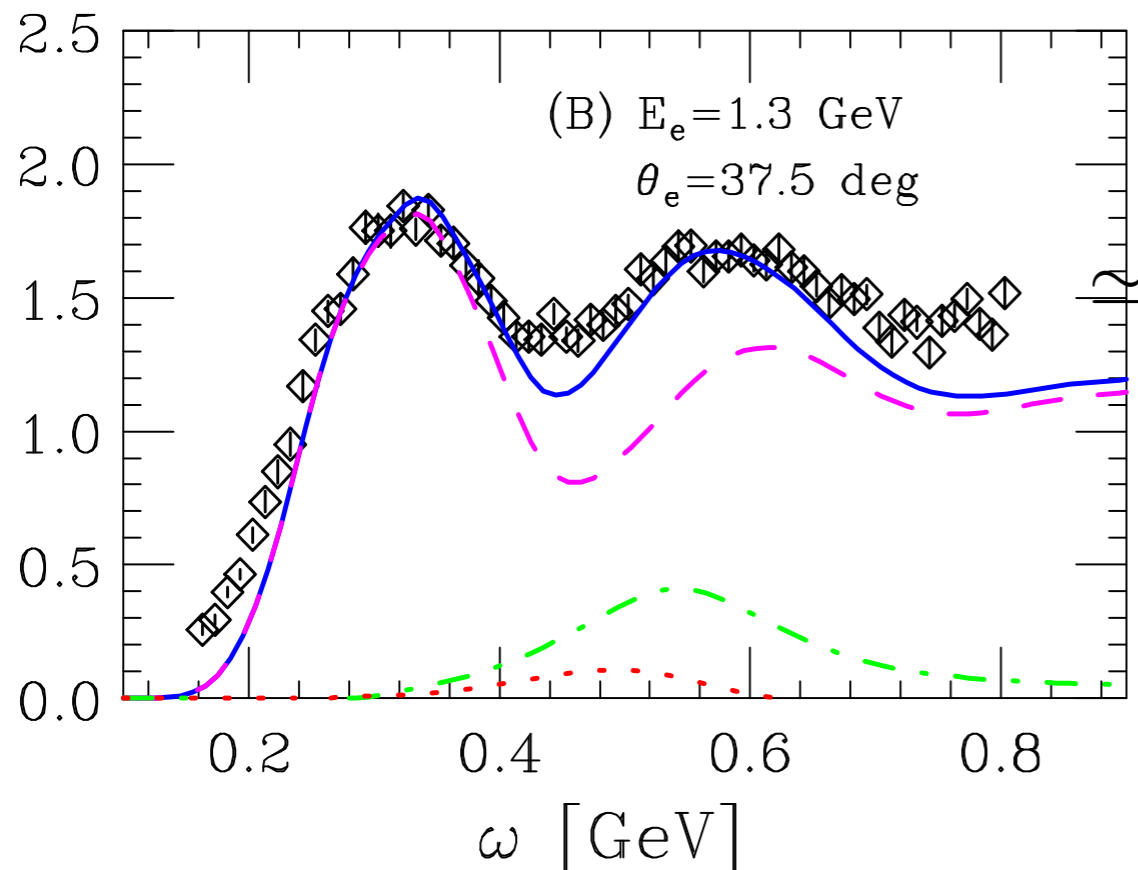
# “Extended” factorization scheme

Using relativistic MEC requires **extending the factorization scheme** to two-nucleon emissions

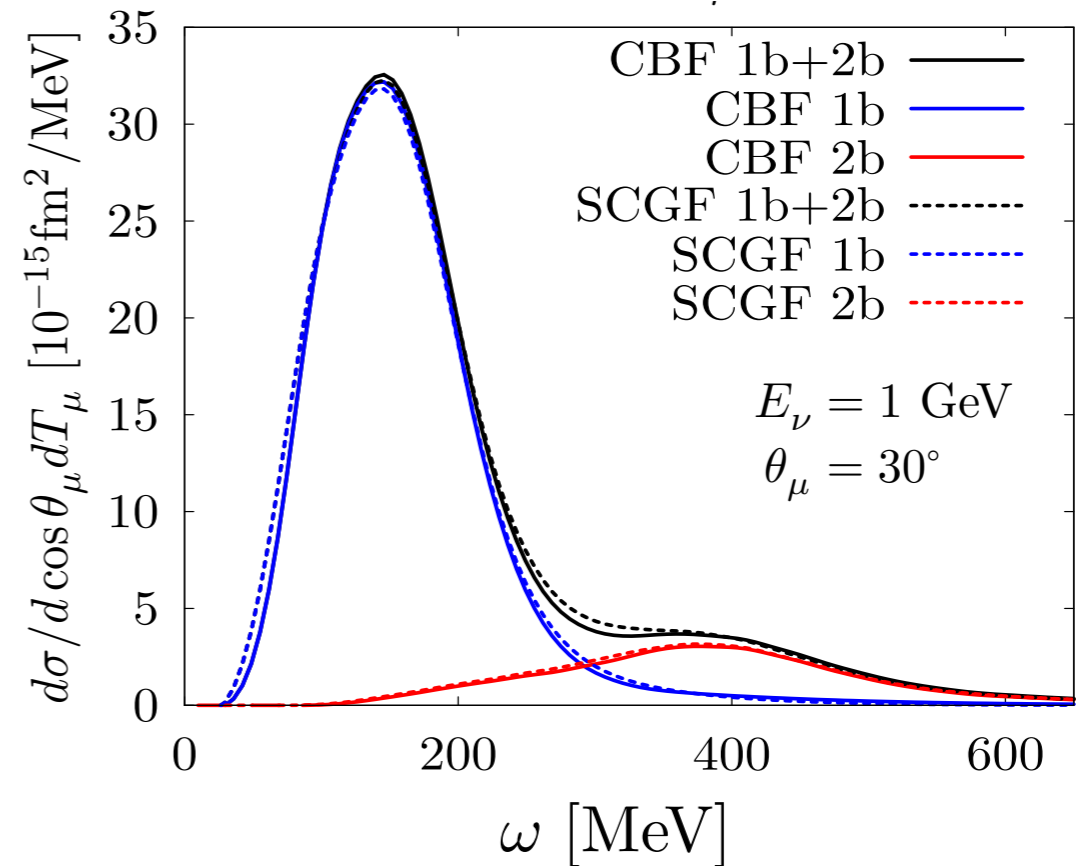
$$|\Psi_f^A\rangle \rightarrow |p_1 p_2\rangle \otimes |\Psi_f^{A-2}\rangle$$



We compute electron and neutrino inclusive cross sections using CBF and SCGF spectral functions



N. Rocco, et al. PRL. **116** 192501 (2016)

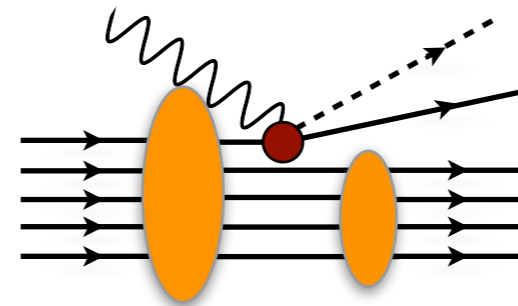


N. Rocco, et al. PRC **99** 025502 (2019)

# “Extended” factorization scheme

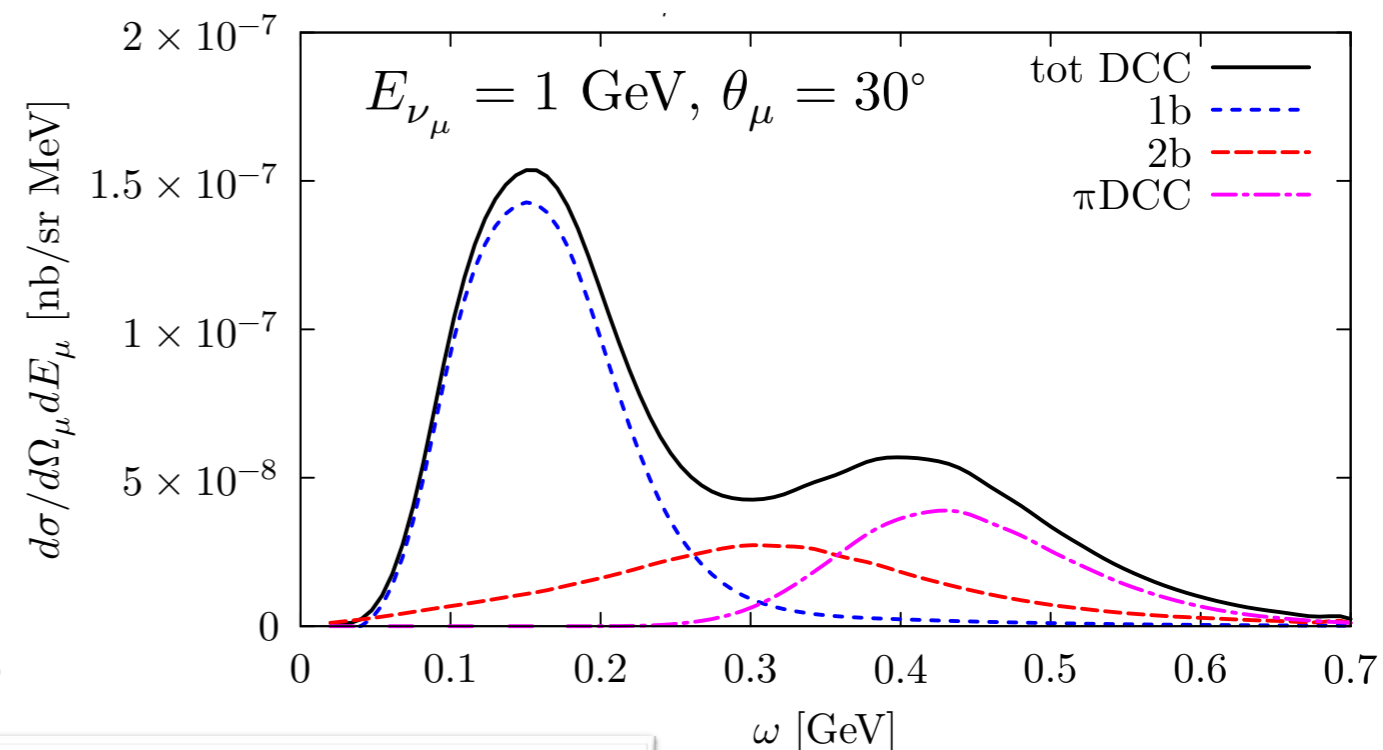
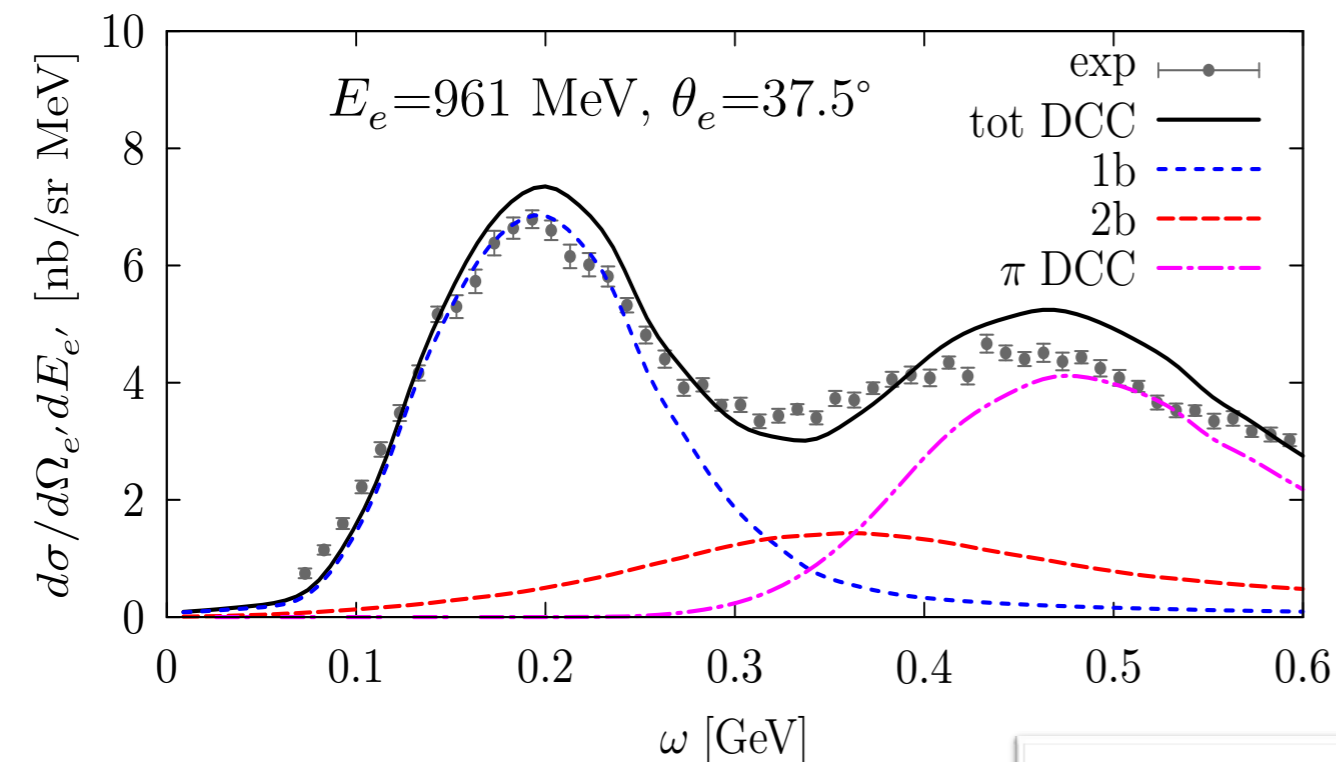
The factorization scheme can be **further extended** to include real pions in the final state

$$|\Psi_f^A\rangle \rightarrow |p_1, p_\pi\rangle \otimes |\Psi_f^{A-1}\rangle \longleftrightarrow$$



The DCC model, suitable to accurately describe single-nucleon pion-production, is folded with a realistic spectral function



The inclusion of pion production mechanism is essential to reproduce data in the resonance production region



# Summary and outlook

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## Lepton-nucleus scattering from quantum Monte Carlo

- $^{12}\text{C}$  electromagnetic responses in good agreement with experiments
- Two-body currents enhance electromagnetic, neutral- and charged-current responses
- Good agreement with MiniBooNE and T2K inclusive data  **First fully ab-initio results!**
- Total muon capture rate in  $^4\text{He}$  agrees with available data  **Need new experiments!**
- Exploit deep-learning techniques to improve the accuracy of the inversion

## Extended factorization scheme

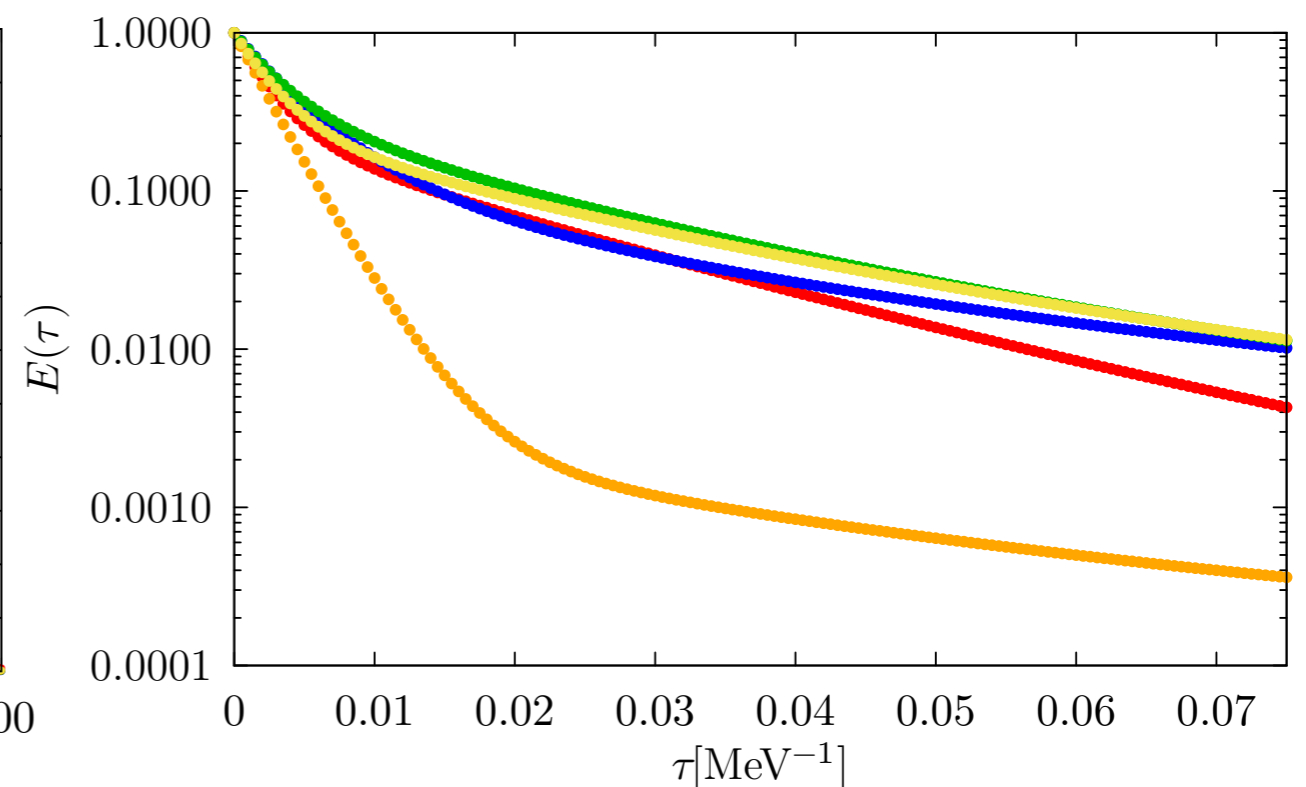
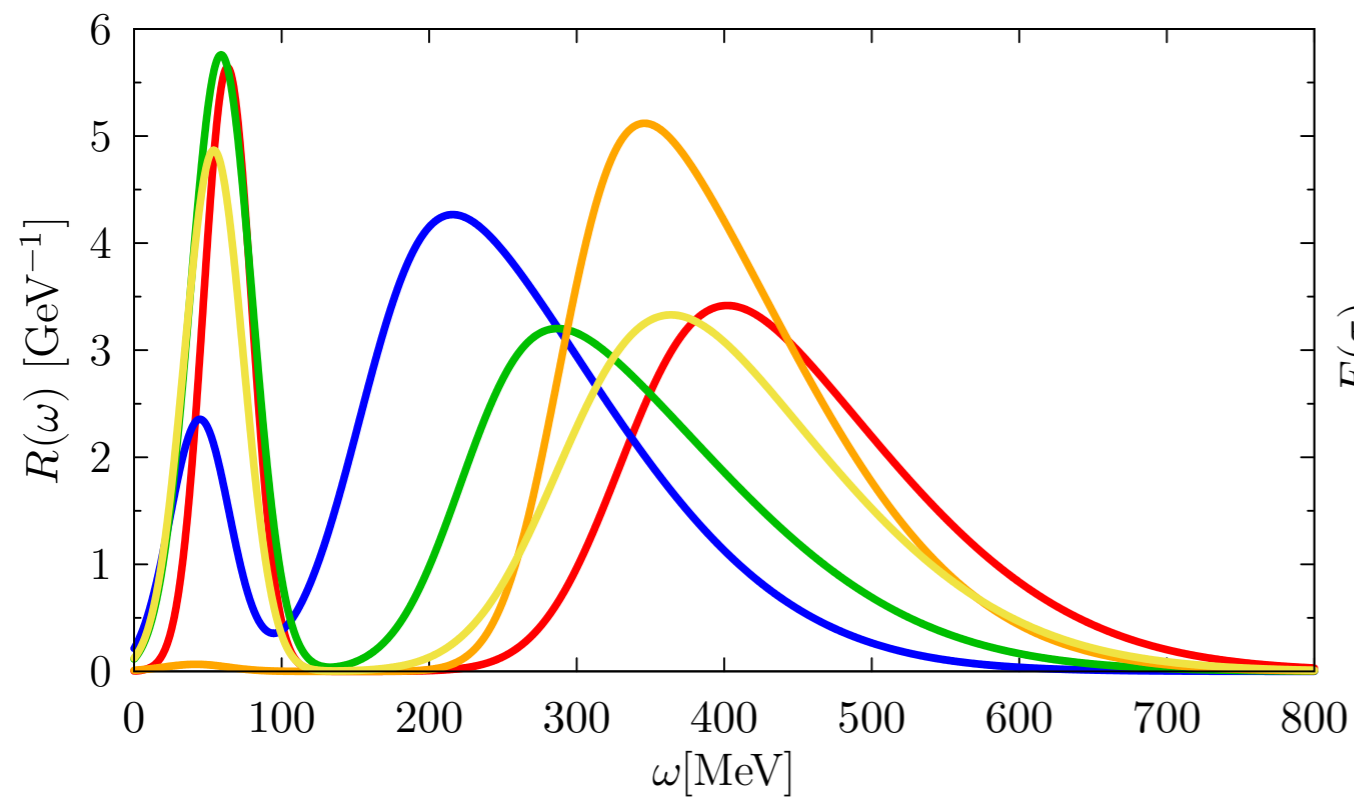
- Two-body currents and pion-production mechanisms are essential to reproduce electron-scattering data
- Cluster expansion formalism to improve treatment of FSI and interference

# Some developments

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Use **Deep Learning algorithms** to improve the inversion of the Euclidean response

We train the neural network providing a large number (200,000) of templates for the response functions and the corresponding set of Euclidean responses

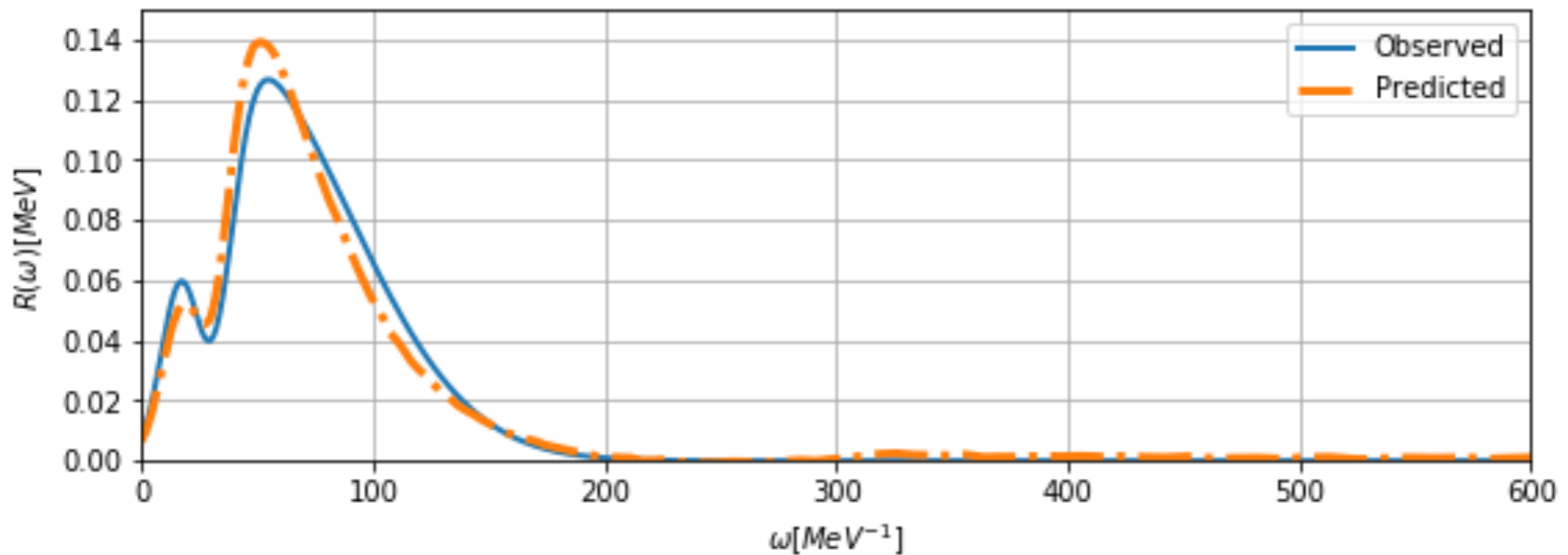
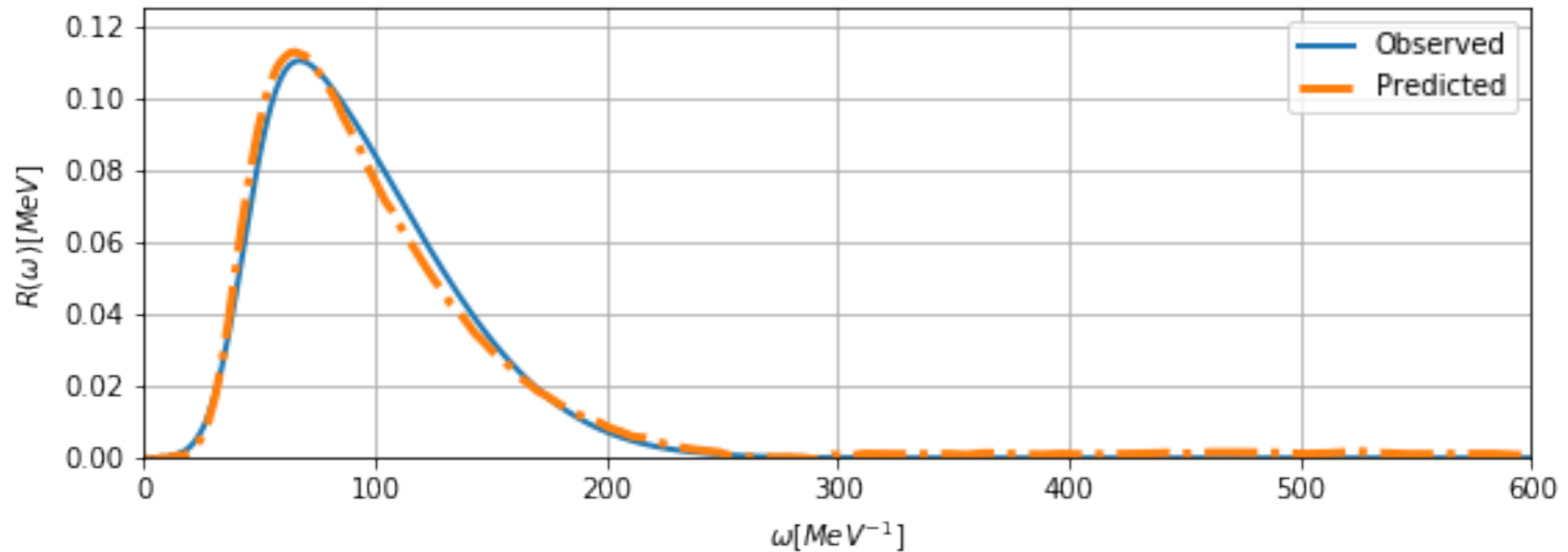


**Short-term goal:** resolve coherent peak at low energy transfer, reduce the computational cost

**Long-term goal:** achieve accurate inversions with robust error propagation

# Some developments

Preliminary results are encouraging for both single- and two-peaks responses



Thank you