

How Lattice QCD Modeling and Uncertainties Work

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Theoretical Physics Uncertainties to Empower Neutrino Experiments
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“*ab initio*” Paradigm

- Targets in neutrino experiments are nuclei like ^{12}C , ^{16}O , or ^{40}Ar .
- In Standard Model (particle physics), nuclei emerge from QCD, so **just**:
 - calculate $\nu A \rightarrow lA'X$ scattering amplitude, just like decay $D \rightarrow Kl\nu$;
 - alas, beyond humankind’s capabilities in 2023.
- “*ab initio*” paradigm is to treat nuclei as a collection of nucleons with
 - two-, three-, more-body interactions (scattering, EFT);
 - obtain nucleon amplitudes from QCD ← this talk.

Nucleon Amplitudes from QCD

- Nucleon-level matrix elements are feasible:
 - quasielastic and DIS regions now/soon;
 - resonance and SIS regions maybe not so far away.
- Tool of choice is lattice QCD:
 - *The neutrino nucleus cross section problem is complex and has many moving pieces.... Knowing the axial form factor will **stop one piece from moving** and thus facilitates addressing the other moving pieces.... [N]ucleon transition form factors to the Δ and other low-mass baryon resonances would be similarly valuable.*

Lattice Field Theory

- Everything in QFT can be expressed as

$$\langle \phi(x_1)\phi(x_2)\cdots\phi(x_n) \rangle = \frac{1}{Z} \int \prod_{\phi} \prod_x d\phi_x \phi(x_1)\phi(x_2)\cdots\phi(x_n) e^{-S(\phi)}$$

gluons, quarks, antiquarks

uncountably many spacetime points

- Replace continuous, infinite spacetime by
 - discrete lattice (countably many degrees of freedom)...
 - ... in a finite spacetime volume (finitely many degrees of freedom).

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Rigorous definition of QFT.

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Computational Lattice Gauge Theory

- Finite # degrees of freedom makes the problem computable:
 - 10^9-10^{10} variables of integration \Rightarrow Monte Carlo with importance sampling

$$\langle \phi(x_1) \phi(x_2) \cdots \phi(x_n) \rangle = \frac{1}{C} \sum_{c=1}^C \phi^{(c)}(x_1) \phi^{(c)}(x_2) \cdots \phi^{(c)}(x_n)$$
$$\phi^{(c)}(x) \sim e^{-S(\phi)}$$

- Quarks (fermions) are Grassmann variables but can be integrated “by hand”, replacing $\psi(x_1) \bar{\psi}(x_2)$ with $G(x_1-x_2)$ in all combinations:

$$U_{\mu}^{(c)}(x) \sim \text{Det}(\not{D} + m) e^{-S(U)}$$

- K. Wilson showed how to make lattice field theory gauge invariant ([1974](#)).

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sea-quark loops, very demanding

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No Modeling, but Uncertainties

- QCD is the theory of the strong interactions; no physics left out:
 - historical caveat of “quenched” approximation.
- Computational science inevitably has **uncertainties**:
 - “make lattice finer” \leftrightarrow “take continuum limit” \leftrightarrow “remove **UV cutoff**”;
 - “make volume larger” \leftrightarrow “remove **IR cutoff**”;
 - adjust $1+n_f$ free parameters to match $1+n_f$ measurements;
 - fitting correlation functions to get physical information.

QCD Lagrangian

- SU(3) gauge symmetry and $1 + n_f + 1$ parameters:

$$\begin{aligned}\mathcal{L}_{\text{QCD}} = & \frac{1}{g_0^2} \text{tr}[F_{\mu\nu}F^{\mu\nu}] \\ & - \sum_f \bar{\Psi}_f (\not{D} + m_f) \Psi_f \\ & + \frac{i\theta}{32\pi^2} \varepsilon^{\mu\nu\rho\sigma} \text{tr}[F_{\mu\nu}F_{\rho\sigma}]\end{aligned}$$

- Gauge coupling g_0 and quarks masses m_f are not directly measurable:
 - each free parameter set by a hadronic property, e.g., mass;
 - coupling equivalent to a scale, hence use a hadron mass here too.

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$$\begin{aligned}\mathcal{L}_{\text{QCD}} &= \frac{1}{g_0^2} \text{tr}[F_{\mu\nu}F^{\mu\nu}] && M_\Omega \text{ or similar;} \\ &- \sum_f \bar{\Psi}_f (\not{D} + m_f) \Psi_f && M_\pi, M_K, M_{J/\psi}, M_Y, \dots; \\ &+ \frac{i\theta}{32\pi^2} \varepsilon^{\mu\nu\rho\sigma} \text{tr}[F_{\mu\nu}F_{\rho\sigma}] && \theta = 0.\end{aligned}$$

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Uncertainty Budget

Source	%
Statistics	
Excited-state contamination, correlator fitting choices	
Chiral-continuum extrapolation (continuum) (chiral)	
Lattice spacing: w_0/a , w_0 (fm)	
Quark mass tuning	
Finite volume: exponential topology freezing	
Total (after model averaging)	

Source	%
Statistics	

Statistics for Correlation Functions

- Nucleon two-point correlation function:

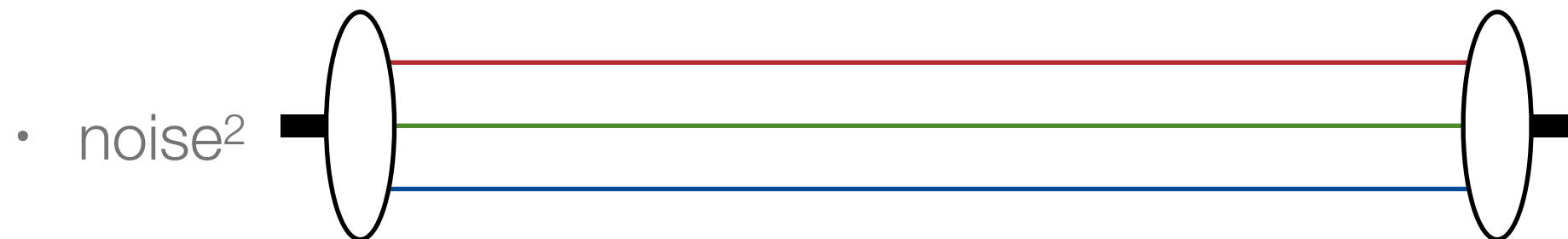
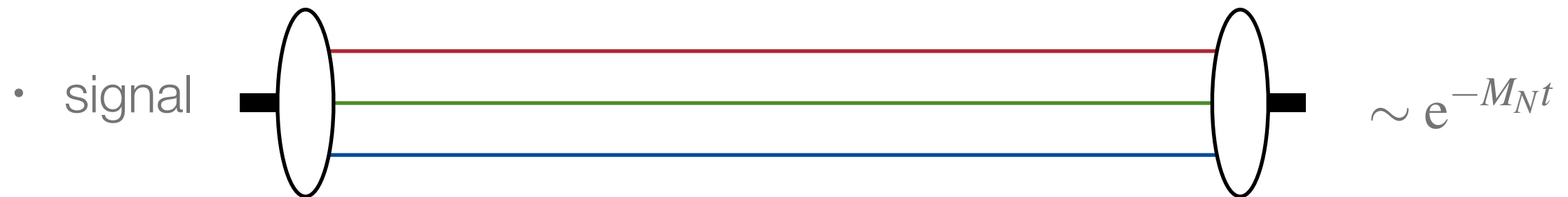
$$\begin{aligned}\sum_{\mathbf{x}} \langle N(t, \mathbf{x}) \bar{N}(0, \mathbf{0}) \rangle &= \frac{1}{C} \sum_{c=1}^C G_u^{(c)}(t, \mathbf{x}; 0, \mathbf{0}) G_u^{(c)}(t, \mathbf{x}; 0, \mathbf{0}) G_d^{(c)}(t, \mathbf{x}; 0, \mathbf{0}) \\ &= \sum_{n=1}^{\infty} \langle 0 | \hat{N} | n \rangle e^{-M_{N,n} t} \langle n | \hat{N}^\dagger | 0 \rangle\end{aligned}$$

where $M_{N,1}$ is nucleon mass and others ($n > 1$) are excited nucleons.

- Statistical uncertainty of LHS estimated from the samples in the usual way (average of square minus square of average).
- Obtain (first few) $|\langle 0 | \hat{N} | n \rangle|^2$ and $M_{N,n}$ from fitting: can use Hessian error estimate here.

Signal-to-Noise

- Obstacle to statistical precision with nucleons:



- ratio $\sim e^{-(M_N - 3M_\pi/2)t}$

- Have to try to find the signal at small t ; cf., next section.

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Statistics for Ensemble Quantities

- Nucleon three-point correlation function:

$$\sum_{\mathbf{x}_1, \mathbf{x}_2} e^{i\mathbf{p}\cdot\mathbf{x}_2} \langle N(t_2, \mathbf{x}_2) A_\mu(t_1, \mathbf{x}_1) \bar{N}(0, \mathbf{0}) \rangle = \sum_{n, m=1}^{\infty} \langle 0 | \hat{N} | n \rangle e^{-E_{N,n}(t_2-t_1)} \langle n | \hat{A}_\mu | m \rangle e^{-M_{N,m}t_1} \langle m | \hat{N}^\dagger | 0 \rangle$$

axial form factors

- Matrix element from more fitting with output of previous step.
- Propagate statistical uncertainties and correlations of ensemble quantities (e.g., mass ratios) with resampling, aka “pseudoensembles”:
 - jackknife ([Quenouille](#))—eliminate J adjacent samples, average over $C-J$;
 - bootstrap ([Efron, 1979](#))—choose samples at random, allowing repeats.

Correlated Statistical Uncertainties

- Related quantities (e.g., form factors at nearby p) fluctuate together, so covariance matrix is not close to being diagonal.
- Sample estimate of covariance has well-known problems once the number of (nonzero) entries approaches number of samples.
- “Shrinkage” of spectrum of covariance matrix:
 - linear, e.g., [arXiv:1901.07519](#);
 - nonlinear, e.g., [arXiv:2212.12648](#);
 - used by economists at banks to make money.

Source	%
Statistics	
Excited-state contamination, correlator fitting choices	

Fitting Correlation Functions

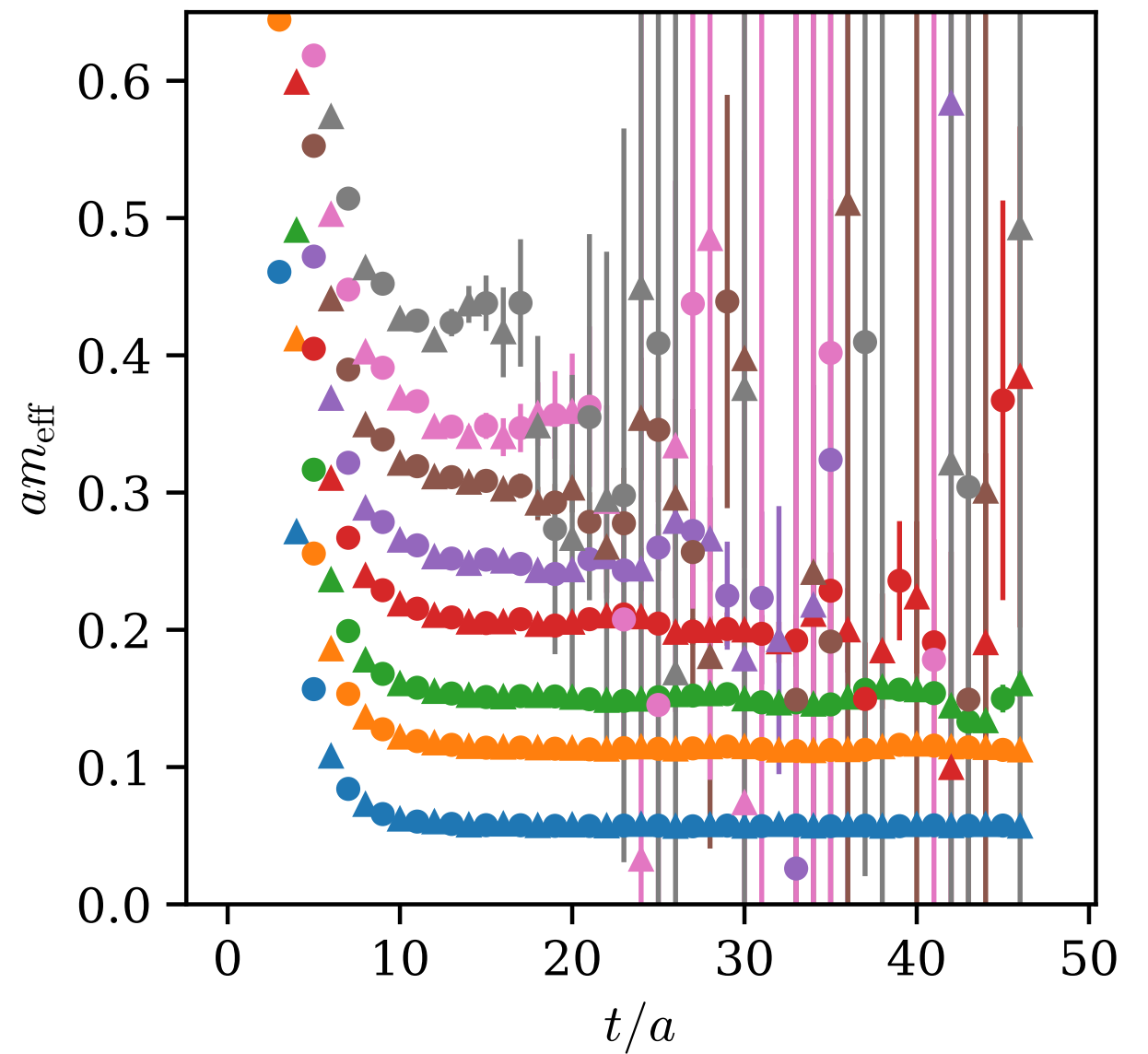
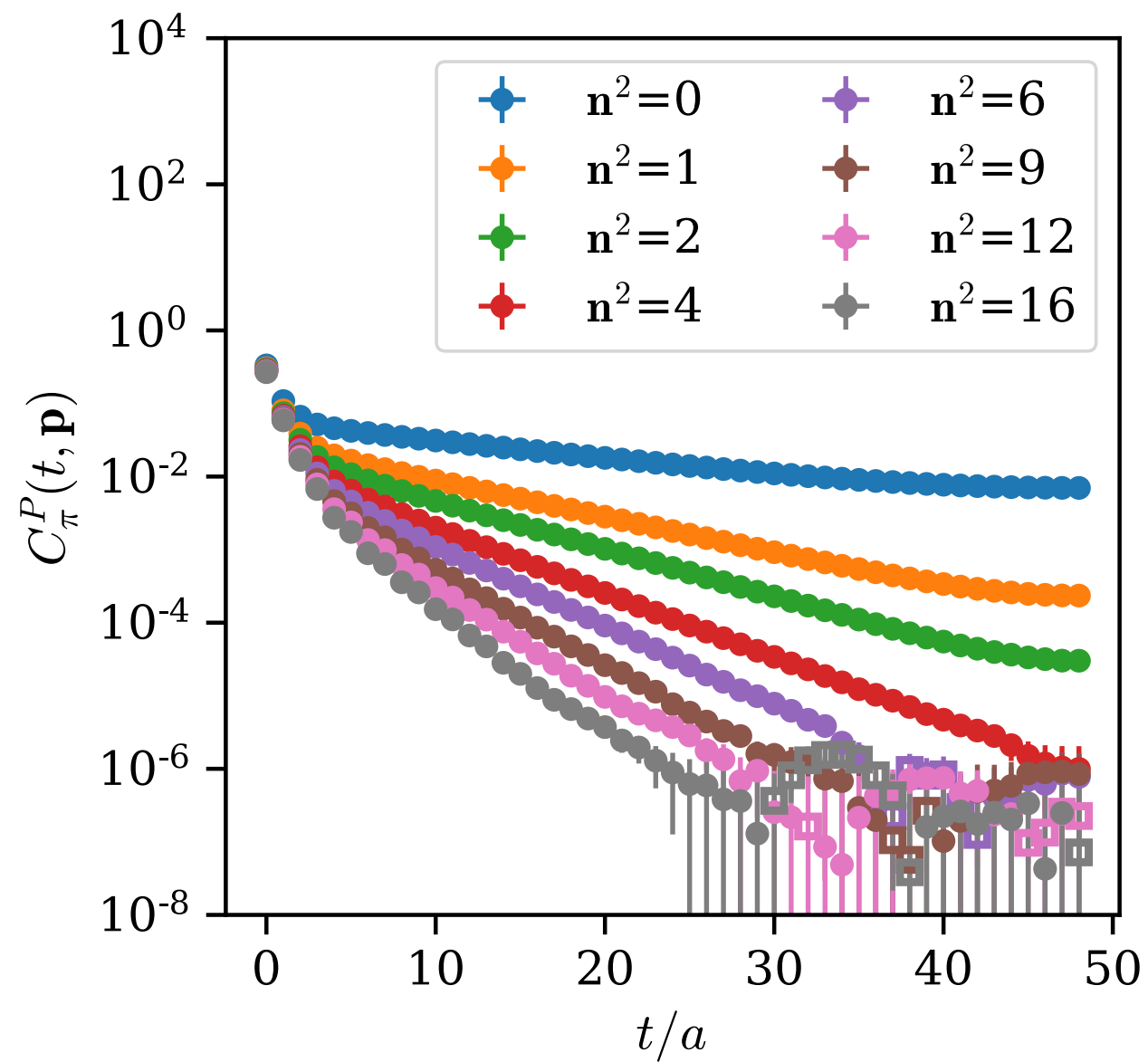
- Nucleon two-point correlation function again:

$$\sum_{\mathbf{x}} \langle N_i(t, \mathbf{x}) \bar{N}_j(0, \mathbf{0}) \rangle = \sum_{n=1}^{\infty} \langle 0 | \hat{N}_i | n \rangle e^{-M_{N,n} t} \langle n | \hat{N}_j^\dagger | 0 \rangle$$

- Could take t very large, but better to fit time dependence to several states; for nucleons, excited states = special concern.
- Bayesian view natural: priors on mass splittings & weights $A_{i,n} = \langle 0 | \hat{N}_i | n \rangle$:
 - truncating is the same as a prior $A \sim \delta(A)$.
- Matrix correlation: “generalized eigenvalue problem”:
 - yields optimal operator $w_i N_i$ for use in three-point functions.

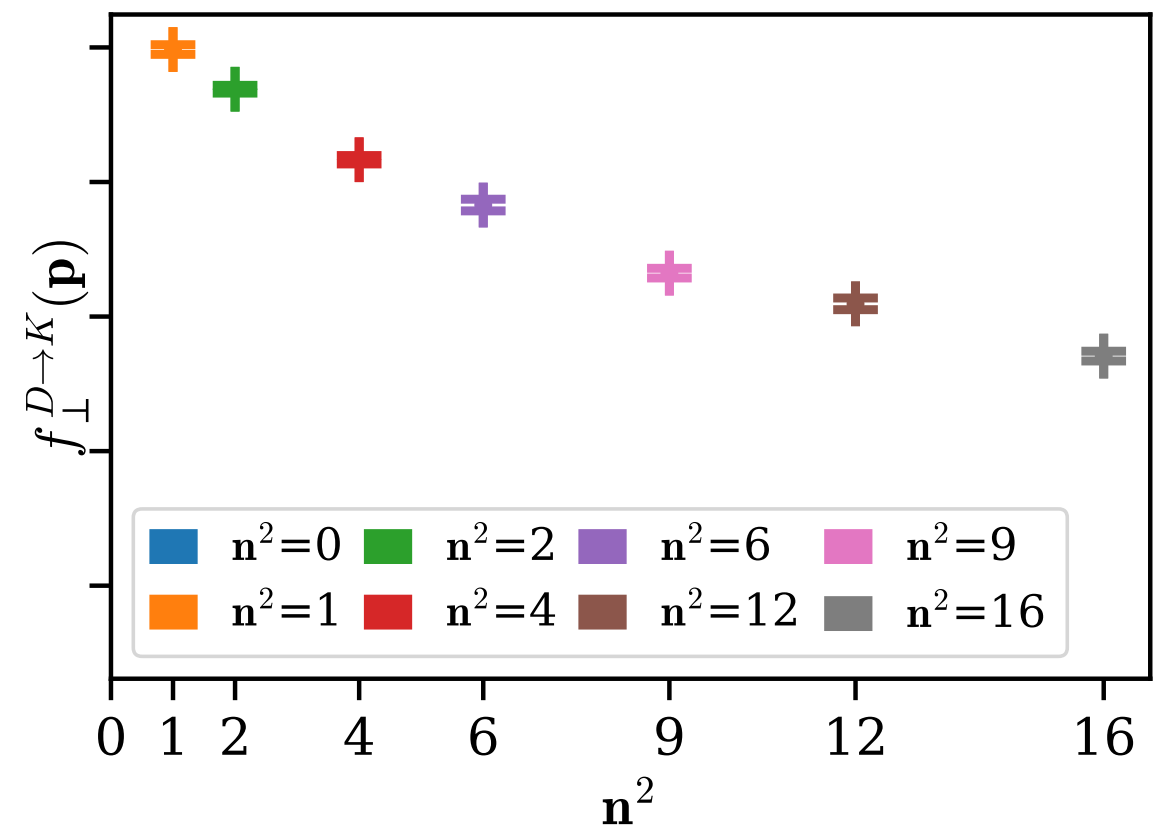
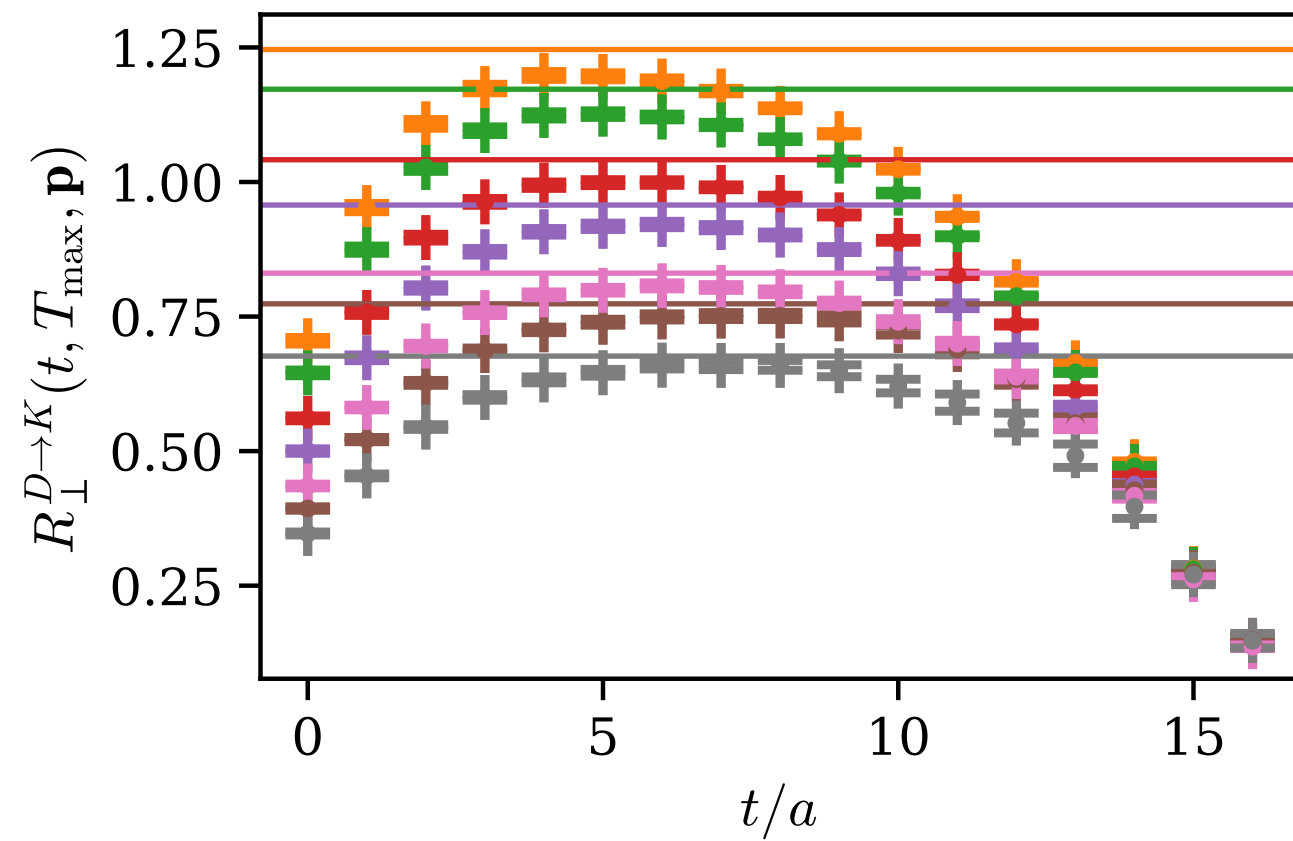
Pion

[Fermilab Lattice and MILC, arXiv:2212.12648](#)



D \rightarrow K

[Fermilab Lattice and MILC, arXiv:2212.12648](#)



Source	%
Statistics	
Excited-state contamination, correlator fitting choices	
Chiral-continuum extrapolation (continuum)	

Symanzik EFT



- Discretization effects can be described as

$$\mathcal{L}_{\text{LGT}} \doteq \mathcal{L}_{\text{Sym}} = \mathcal{L}_{\text{QCD}} + \sum_i a^{d_i} \mathcal{K}_i \mathcal{L}_i$$

which guides the extrapolation in lattice spacing.

- On same foundation as operator-product expansion, factorization, etc., in perturbative QCD:
 - established in perturbation theory, structure expected to hold nonperturbatively.
- Leading power is usually a^2 or $\alpha_s a^2$, but with several (3–6) different lattice spacings, fit leading \oplus subleading.

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Chiral-continuum extrapolation (continuum) (chiral)	

Chiral EFT



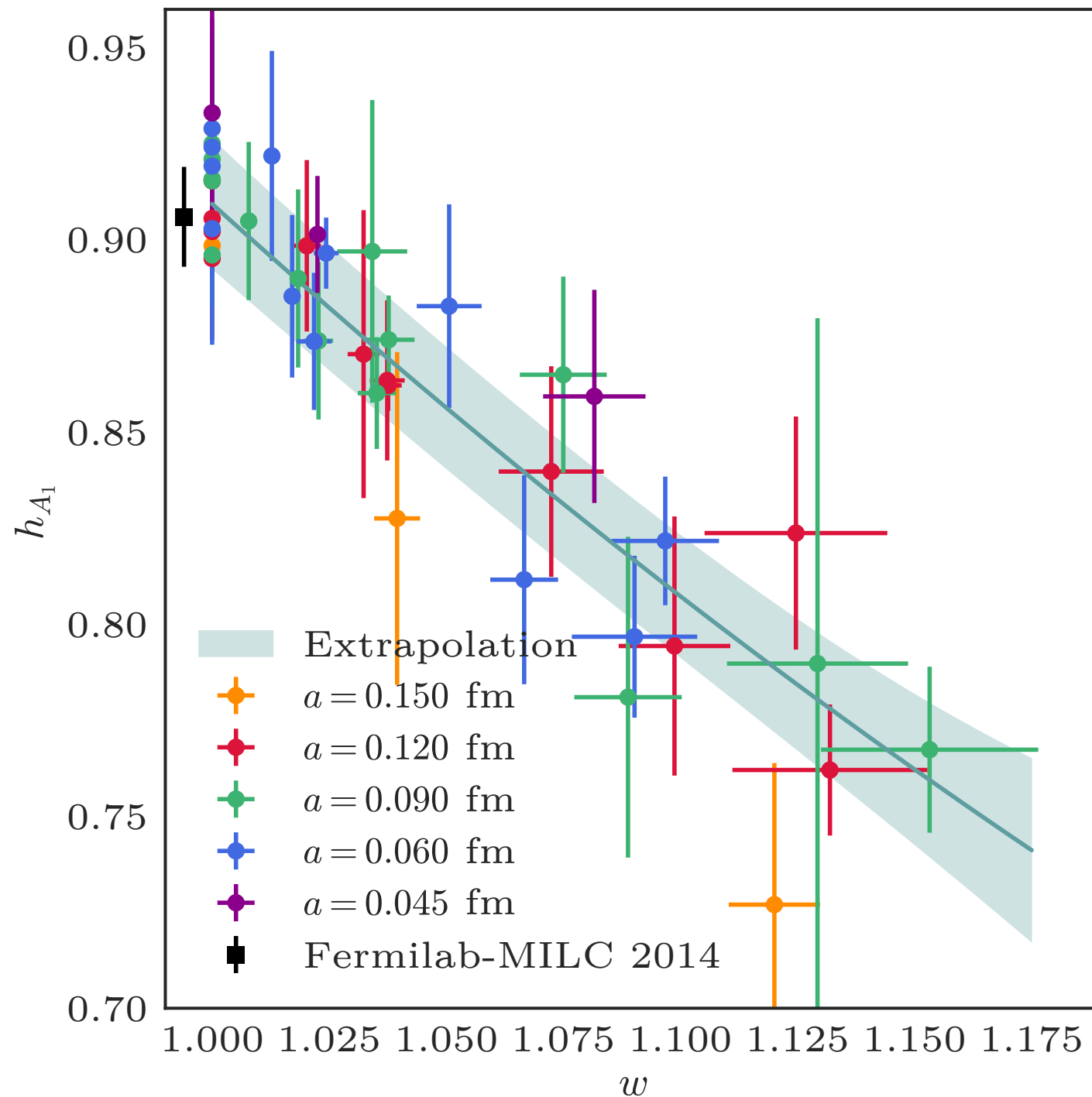
- Making the quark masses as small as down and up is computationally demanding: take somewhere in $\frac{1}{2}(m_u + m_d) \leq m_l < m_s$ and extrapolate.
- That means the pion in the computer has a mass larger than that in Nature. Pion interactions described by chiral Lagrangian

$$\mathcal{L}_{\text{QCD}} \doteq \mathcal{L}_{\chi\text{PT}} = \sum_i \Lambda_\chi^{-d_i} L_i \mathcal{O}_i$$

coupled to other particles, e.g., nucleon.

- There are many ensembles on disk with physical light-quark mass:
 - very desirable for nucleon because chiral extrapolation less persuasive (empirically) than for kaon, D-meson, B-meson.

- Often, Symanzik EFT and chiral EFT steps combined into a grand fit of quark-mass and lattice-spacing dependence:



• $B \rightarrow D^* l \nu$

• arXiv:2105.14019

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Lattice spacing: w_0/a , w_0 (fm)	

Convert from Lattice Units to MeV

- Actually, convert from natural QCD units to SI (electro-atomic) units.
- Vary bare gauge coupling, compute various masses, aM_π , aM_K , aM_Ω , etc. Factor a is fictitious albeit mnemonic that all change in proportion:

$$aM_\Omega \propto e^{-1/2\beta_0 g_0^2}$$

- Form dimensionless ratios with aM_Ω in denominator, vary am_l & am_s to adjust aM_π/aM_Ω & aM_K/aM_Ω to PDG values for M_π/M_Ω & M_K/M_Ω .
- Compute continuum limit of aM_N/aM_Ω to get M_N/M_Ω ; multiply by PDG M_Ω .
- Alternatively, use w_0/a instead of $1/aM_\Omega$ and look up w_0 (fm) in FLAG.

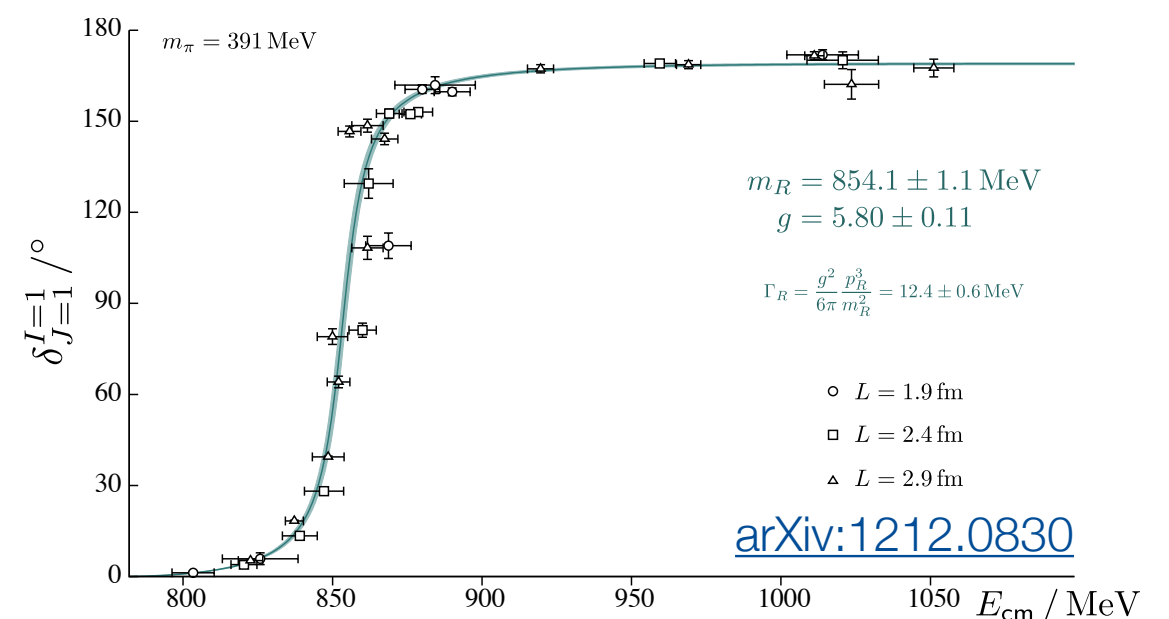
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Quark mass tuning	
Finite volume: exponential	

Exponential Finite Volume

- Virtual particle exchange “around the world” are suppressed exponentially:
 - FLAG’s rule of thumb $M_\pi L > 4$; check by having more than one L .
- Resonances are more interesting:
 - ρ meson (Δ baryon) not really a particle but a feature in the $\pi\pi$ ($N\pi$) scattering amplitude;
 - resonant properties obtained from detailed study of L dependence of two-particle states;
 - path to rigorous $N \rightarrow \Delta$ form factors.

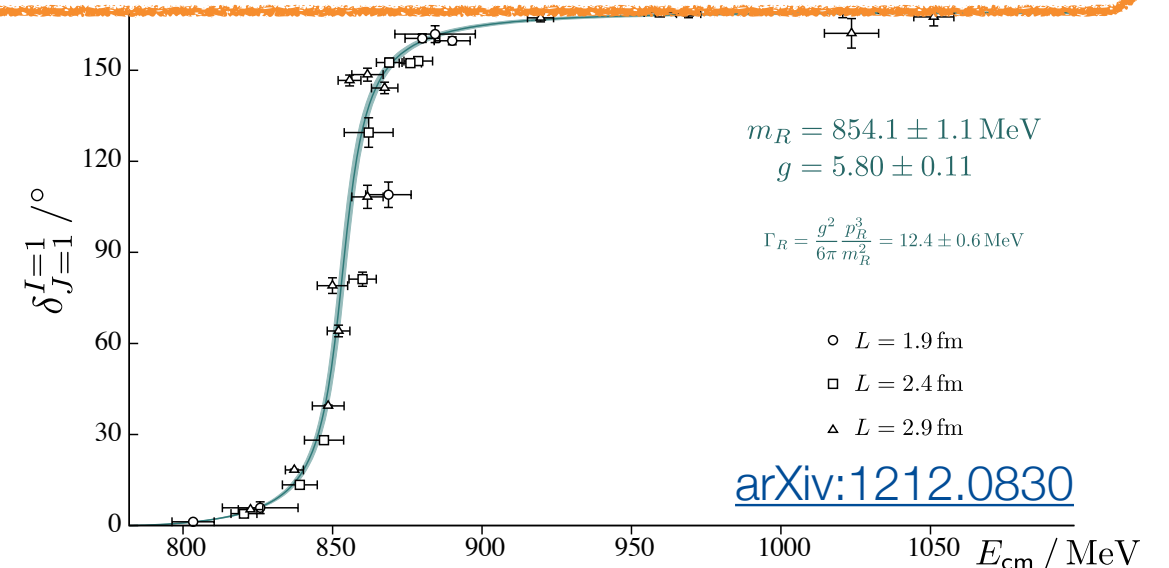


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Huge literature on theoretical formalism.

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Finite volume: exponential topology freezing	

Topology in Gauge Theories

- QCD states possess a quantum number $e^{i\theta}$ having to do with topology—can't change θ with any local operation.
- In 4-d functional integral, θ is introduced via a term $e^{i\theta Q}$, where Q is the spacetime integral of $\mathbf{E}^a \cdot \mathbf{B}^a$, which is (close to) an integer:
 - need big change in gauge field, but Markov chain makes small ones.
- Poor sampling of Q is usually just a finite-volume effect:

$$\frac{1}{2\chi_T} \frac{1}{V} \left(1 - \frac{Q^2}{\langle Q^2 \rangle} \right)$$

(I think) not a big concern in νA , but of course disastrous for neutron EDM.

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$$\frac{1}{2\chi_T} \frac{1}{V} \left(1 - \frac{Q^2}{\langle Q^2 \rangle} \right)$$

average of Q^2 in the simulation

vev of Q^2 in $\theta = 0$ vacuum

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Total Uncertainty

- Choices plus quadrature sum:
 - requires judgment whether a “test” is a cross-check or something that inflates a systematic.
- Bayesian model averaging:
 - introduce an “information criterion” (IC) depending on amount of data, number of fit parameters, quality of resulting fit, etc., which then yields a weight for each discrete set of choices;
 - early usage of Akaike IC by BMW [[arXiv1406.4088](https://arxiv.org/abs/1406.4088)]; more recent work starting from Bayes’s theorem: Jay & Neil [arXiv:2008.01069](https://arxiv.org/abs/2008.01069); Neil & Sitison [arXiv:2208.14983](https://arxiv.org/abs/2208.14983), [arXiv:2305.19417](https://arxiv.org/abs/2305.19417).