Quantifying truncation errors in effective field theory

R. J. Furnstahl,^{1,*} N. Klco,^{2,†} D. R. Phillips,^{2,‡} and S. Wesolowski^{1,§}

¹*Department of Physics, The Ohio State University, Columbus, Ohio 43210, USA*

²*Institute of Nuclear and Particle Physics and Department of Physics and Astronomy, Ohio University, Athens, Ohio 45701, USA*

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Bayesian procedures designed to quantify truncation errors in perturbative calculations of quantum chromodynamics observables are adapted to expansions in effective field theory (EFT). In the Bayesian approach, such truncation errors are derived from degree-of-belief (DOB) intervals for EFT predictions. Computation of these intervals requires specification of prior probability distributions ("priors") for the expansion coefficients. By encoding expectations about the naturalness of these coefficients, this framework provides a statistical interpretation of the standard EFT procedure where truncation errors are estimated using the order-by-order convergence of the expansion. It also permits exploration of the ways in which such error bars are, and are not, sensitive to assumptions about EFT-coefficient naturalness. We first demonstrate the calculation of Bayesian probability distributions for the EFT truncation error in some representative examples and then focus on the application of chiral EFT to neutron-proton scattering. Epelbaum, Krebs, and Meißner recently articulated explicit rules for estimating truncation errors in such EFT calculations of few-nucleon-system properties. We find that their basic procedure emerges generically from one class of naturalness priors considered and that all such priors result in consistent quantitative predictions for 68% DOB intervals. We then explore several methods by which the convergence properties of the EFT for a set of observables may be used to check the statistical consistency of the EFT expansion parameter.

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I. INTRODUCTION

Effective field theories (EFTs) describe the physics of systems with a separation of scales.¹ A key element in any EFT is a power counting that organizes calculations into an expansion in a dimensionless parameter or parameters, which are typically formed from ratios of the low-energy and high-energy scales in the system under consideration. We denote this parameter generically as *Q*. In the simplest case $Q = p/\Lambda_b$ is the ratio of the typical momentum, *p*, of the process of interest to the breakdown scale, Λ_b , of the EFT, i.e., the scale at which the first dynamics not explicitly included in the EFT appears. Even in more complex situations with many low-energy scales, the EFT expansion for *X* can be denoted

$$
X = X_0 \sum_{n=0}^{\infty} c_n \mathcal{Q}^n, \qquad (1)
$$

where X_0 is the natural size of the observable X, and $\{c_n\}$ are dimensionless coefficients, some of which may be zero. In most EFTs the expansion (1) is inherited directly from the EFT Lagrangian or potential, with suitable additions [e.g., terms of the form $Q^n \ln(Q)$] owing to quantum corrections. In nuclear physics, however, the dynamics is intrinsically nonperturbative, and there exists at least some subclass of EFT graphs that must be summed to all orders. The connection

between the Lagrangian and observables is then less direct. Nevertheless, a properly formulated EFT for nuclear physics is expected to have a *Q* expansion for observables of the form (1) and it is the properties of such expansions that are our concern in this paper.

A key benefit of the perturbative series (1) is that it permits estimation of the error induced by truncation at a finite-order k : "truncation errors." If the coefficients c_n for an observable were to vary significantly and unsystematically in size, the expansion (1) would be unsuited to this end. However, experience and the principle of naturalness suggest that the coefficients *are* typically of order one, even in the more complex nuclear context.

In Ref. [\[4\]](#page-18-0) we laid out a recipe for uncertainty quantification in EFTs for nuclear physics. While they are not the only source of theory uncertainty, truncation errors are often the dominant uncertainty in EFT calculations. We argued that Bayesian methods [\[5\]](#page-18-0) provide an error bar, with a well-founded statistical interpretation, that accounts for *all* sources of uncertainty in the EFT. In particular, Bayesian methods are essential to the assessment of truncation error: assumptions (or expectations) about the EFT are encoded in "prior probability distribution functions" (pdfs). The Bayesian approach then proceeds by integrating out ("marginalizing") the coefficients of omitted terms to establish the truncation error.

The use of priors is often controversial because they can introduce subjective judgments about, e.g., the meaning of naturalness into the computation. We argue that, on the contrary, introducing and stating Bayesian priors on higherorder EFT coefficients renders explicit in the calculation assumptions that are present but typically not articulated. This allows such assumptions to be applied consistently, tested, and modified in light of new information.

^{*}furnstahl.1@osu.edu

[†] klcon@uw.edu

[‡] phillips@phy.ohiou.edu

[§]wesolowski.14@osu.edu

¹Pedagogical introductions to EFTs can be found in Refs. $[1-3]$.

In this work we begin with the general formalism for computation of truncation errors discussed in the context of perturbative QCD (pQCD) by Cacciari and Houdeau (CH) in Ref. $[6]$ and further developed in Refs. $[7,8]$, where it is called $\overline{\text{CH}}$ (cf. Ref. [\[9\]](#page-18-0) for a brief summary). We rederive, adapt, and extend their prescription to EFT expansions. We explore several different choices of prior for the coefficients ${c_n}$ and examine—within some generic examples—how such prior choice affects the truncation-error estimate. We then look specifically at the nuclear context, focusing on the extent to which such calculations justify the uncertainty quantification (UQ) procedure typically adopted in EFTs. This procedure has recently been clearly stated and applied to nucleonnucleon (*NN*) cross sections by Epelbaum, Krebs, and Meißner (henceforth EKM) in their fourth- and fifth-order applications of chiral EFT to these observables $[10,11]$. (Introductions to chiral EFT can be found in Refs. $[12-17]$.) Note that here we do not deal with the extent to which truncation errors affect the low-energy constants (LECs) extracted from fitting EFT expansions to data. This will be discussed in a separate publication $[18]$. Our focus here is solely on estimating the truncation error at order k for the series (1) , given the assumption of naturalness, and information on the size of the coefficients c_0, \ldots, c_k .

In Sec. II, we provide a brief overview of the Bayesian rules we will need and then adapt the CH prescription so that it is suitable for application to EFT expansions. We also enlarge the set of priors considered by CH. In Sec. [III,](#page-7-0) this approach is applied to some two-body observables considered by EKM, using their assumed breakdown scale to compare to their error assessment. In Sec. [IV](#page-13-0) we explore methods to determine the breakdown scale from the requirement that the EFT coefficients be consistent with naturalness. In Sec. [V](#page-16-0) we summarize our results.

II. ADAPTING CH TO EFT

A. Setting up the problem

Consider the perturbative series [\(1\)](#page-0-0) for the observable *X*. If the series is truncated at order *k*, then the error induced is $X_0 \Delta_k$, where the scaled, dimensionless parameter that determines the truncation error is

$$
\Delta_k \equiv \sum_{n=k+1}^{\infty} c_n \mathcal{Q}^n, \tag{2}
$$

provided that the series actually converges and is not solely asymptotic. For sufficiently small values of *Q*, the first omitted term $c_{k+1}Q^{k+1}$ is a good estimate for Δ_k . This leads to simplified formulas for the evaluation of degree of belief (DOB) intervals. Below we consider both this first-term approximation and evaluations at larger *Q* that use several terms in Δ_k . In either case, this provides an estimate of the deviation of the series at order *k* from the true value of the observable, even if the series is asymptotic.

In Ref. $[6]$ CH considered the case that the series (1) is a pQCD expansion. The expansion is then in powers of the strong coupling, $\alpha_s(\mu)$, where μ is a renormalization scale chosen appropriately for the observable *X*. The optimal choice of μ

is the subject of much debate and many prescriptions in the literature. Indeed, the variation of the truncated-at-order-*k* expression for *X* under an order-unity change in μ is canonically used to estimate Δ_k . This is justified because of the truncated expansion's residual dependence on the renormalization scale $μ$; the full sum should be independent of $μ$, so the variation with μ contains information about omitted terms.

CH pointed out that varying the scale μ around an optimal value μ_0 , say, between $\mu_0/2$ and $2\mu_0$, does not yield an uncertainty with a straightforward statistical interpretation. They therefore laid out a Bayesian probability-theory calculation of Δ_k . Ultimately estimates from scale variation seem to coincide quite well with the results of this more rigorous probabilistic analysis. As we now describe, that analysis starts with priors for ${c_n}$ that encode the assumption that these pQCD coefficients are of order unity (once the typical size of the observable X is factored out of the expression). It modifies them in light of information acquired as more orders in the series for *X* are computed and ultimately obtains a posterior pdf for Δ_k . With this posterior in hand, either the DOB corresponding to a given interval of values of the truncation error or the range of truncation errors corresponding to a specified DOB can be computed.

CH's analysis of truncation errors in pQCD took the case where the series is in powers of α_s , rather than *Q*. Later work $[7,8]$ introduced a scale factor $λ$, such that the expansion was in powers of α_s/λ (e.g., because the expansion parameter might really be α_s/π or include a color factor) and a possible combinatoric factor (such as *n*! from high-order renormalon contributions). In this, termed the "CH prescription," the assumption is modified to say that the coefficients in the perturbative series of an appropriately chosen expansion parameter are distributed such that they share a common upper bound. In EFT the rescaling by a factor *λ* corresponds to the choice of a different breakdown scale for the EFT, and we discuss this possibility in Sec. [IV.](#page-13-0) We do not consider the combinatoric factor, which has not been identified in EFT expansions for few-nucleon-system observables.

Because one of the low-momentum scales of which *Q* is formed is the momentum at which the observable *X* is measured, the EFT expansion parameter is strongly dependent on kinematics. While the QCD expansion's convergence can be improved by matching the scale at which α_s is evaluated to that of the observable of interest, in EFT the dependence of *Q* on momentum is intrinsic, not a matter of choice. Furthermore, the high-momentum scale, Λ_b , that specifies the radius of convergence of the EFT momentum expansion, may not be known *a priori*; it may only be able to be inferred from the behavior of the EFT series. This is a key difference between EFT and pQCD, because in pQCD, the value of α_s can always be specified. In EFT a value of Q corresponding to a particular momentum must be chosen and then checked for consistency. Complicating the choice of an appropriate Λ_b —and concomitantly the evaluation of Q —for many low-energy EFTs is that at least some of the c_n 's need to be extracted from data, either from *X* itself or from other observables.

These differences from the pQCD situation are reflected in the need to check the naturalness of EFT coefficients for a given choice of expansion parameter, something that we discuss in detail in Sec. [IV.](#page-13-0) For the time being we assume that Λ_b has been determined as part of the steps in the EFT analysis that yielded the coefficients $\{c_n : n = 0, \ldots, k\}$. Empirically EKM found that $\Lambda_b \approx 600$ MeV resulted in natural coefficients in their EFT series for neutron-proton scattering cross sections [\[10,11\]](#page-18-0). However, the nonperturbative nature of *NN* scattering makes it unclear how naturalness for EFT LECs results in these apparently natural values of ${c_n}$: $n = 0, \ldots, k$ in the cross section's expansion. This connection is very clear for perturbative EFT expansions of interest in nuclear physics, e.g., the chiral expansion for the nucleon mass (see Ref. [\[5\]](#page-18-0)) and the expansion for energy per particle of a dilute Fermi system with natural-sized scattering length [\[19\]](#page-18-0). Regardless, though, in either perturbative or nonperturbative cases, an incorrect choice of high-momentum scale, Λ_b , will result in coefficients that are *not* natural. This emphasizes the close connection between the assumption of a particular expansion parameter and the imposition of a naturalness prior.

B. Conditional probabilities: Definitions and rules

We use the notation $pr(x|I)$ to denote the probability (density) of *x* given information *I*; thus, $pr(\Delta_k|c_0, \ldots, c_k)$ is the desired pdf for Δ_k . The specification c_0, \ldots, c_k suggests that c_0 is nonzero, but it is straightforward to generalize the results derived here to the case where the first nonzero coefficient is c_l with $l > 0$ (as often is the case in QCD) or that where some intermediate coefficients are identically zero (as for chiral EFT in *NN* scattering, where $n = 1$ does not appear).

Because the terminology, techniques, and manipulations of Bayesian statistics may be unfamiliar to our intended audience, we include a brief overview here of those aspects needed for the CH procedures $[20,21]$. We indicate parenthetically some analogies to familiar manipulations in quantum mechanics. We emphasize that the correspondences are not to be taken literally.

Bayesian probabilistic inference is built on the sum and product rules. If the set $\{x_i\}$ is exhaustive and exclusive (cf. complete and orthogonal), then the sum rule says that $pr(x_i|I)$ is normalized,

$$
\sum_{i} \text{pr}(x_i|I) = 1 \longrightarrow \int dx \,\text{pr}(x|I) = 1,\tag{3}
$$

where the continuum version is integrated over the appropriate range of *x*. It further implies marginalization (cf. inserting a complete set of orthonormal basis states),

$$
pr(x|I) = \sum_{j} pr(x, y_j|I),
$$
 (4)

or the continuum version

$$
\text{pr}(x|I) = \int dy \,\text{pr}(x, y|I),\tag{5}
$$

where $pr(x, y|I)$ is the joint probability of x and y given I. We apply this repeatedly, either to introduce new parameters or to integrate out "nuisance" parameters.

Expressing $pr(x|I)$ in terms of the joint probability $pr(x, y|I)$ through Eq. (5) leads to progress by applying the product rule to relate it to other pdfs:

$$
pr(x, y|I) = pr(x|y, I) pr(y|I) = pr(y|x, I) pr(x|I).
$$
 (6)

The first equality translates to "the joint probability of *x* and *y* is equal to the probability of *x* given *y* and *I* times the probability of *y* given *I* ." The second equality follows by symmetry, but when rearranged becomes Bayes' theorem,

$$
pr(x|y,I) = \frac{pr(y|x,I)pr(x|I)}{pr(y|I)},
$$
\n(7)

which here relates the *posterior* $pr(x|y, I)$ to the *likelihood* $pr(y|x, I)$ given the *prior* $pr(x|I)$ and the *evidence* $pr(y|I)$. These relations will enable us to derive the posterior for Δ_k in terms of assumed priors.

Another implication of the product rule follows when *x* and *y* are mutually independent, which means that knowing *y* does not affect the probability of *x*, so that $pr(x|y, I) = pr(x|I)$. Then Eq. (6) tells us that

$$
pr(x, y|I) \longrightarrow pr(x|I) pr(y|I). \tag{8}
$$

In the following we sometimes omit the explicit *I*, but the specification of prior information should always be assumed.

C. CH synopsis and EFT correspondence

We consider multiple priors that reflect the expectation that all coefficients in the expansion of an observable in powers of *Q* are of roughly the same size, or, more precisely, they have a distribution with a characteristic size. The fundamental assumption made by CH in Ref. [\[6\]](#page-18-0) is that all coefficients of α_s in the pQCD series are roughly the same size, which is implemented by treating them as random variables having a shared distribution with upper bound \bar{c} . This assumption is motivated by empirical evidence from the behavior of such series. But it may not be correct for EFT expansions, where the form [\(1\)](#page-0-0) is expected to result in coefficients which are $\mathcal{O}(1)$, not arbitrarily large.

To proceed we need to translate such a fundamental assumption into concrete expressions for priors. Cacciari and Houdeau do this through three supplementary assumptions (which they call "hypotheses") [\[6\]](#page-18-0), as follows:

(i) The prior probability densities for coefficients at different orders are independent in the sense of Eq. (8). That is, given an upper bound \bar{c} , the joint prior density for coefficients factorizes

$$
\text{pr}(c_0,\ldots,c_n|\bar{c})=\prod_{i=0}^n \text{pr}(c_i|\bar{c}).\tag{9}
$$

CH then also assume that $pr(c_i|\bar{c})$ is the same pdf for each *i*. Thus, the value of \bar{c} is the most knowledge obtainable from the known coefficients when predicting possible values of unknown ones. In this way, we have isolated communication from the data about the sum of all omitted higher-order terms into one variable \bar{c} .

(ii) Next we need a specific prior probability distribution for $pr(c_i|\bar{c})$. In the interest of understanding the

| Set | $pr(c_n \bar{c})$ | $pr(\bar{c})$ |
|-----|---|---|
| A | $\frac{1}{2\bar{c}}\theta(\bar{c}- c_n)$ | $\frac{1}{\ln \bar{c}_>/\bar{c}_<}\frac{1}{\bar{c}}\theta(\bar{c}-\bar{c}_<)\theta(\bar{c}_>- \bar{c})$ |
| - B | $\frac{1}{2\bar{c}}\theta(\bar{c}- c_n)$ | $\frac{1}{\sqrt{2\pi}\bar{c}\sigma}e^{-(\ln \bar{c})^2/2\sigma^2}$ |
| C | $\frac{1}{\sqrt{2\pi}\bar{c}}e^{-c_n^2/2\bar{c}^2}$ | $\frac{1}{\ln \bar{c}_>/\bar{c}_<}\frac{1}{\bar{c}}\theta(\bar{c}-\bar{c}_<)\theta(\bar{c}_>- \bar{c})$ |

TABLE I. Prior pdfs.

prior dependence of our analysis, we test alternative implementations of naturalness in the priors. The extent to which the posterior pdf for Δ_k is stable under different, but reasonable, choices of prior indicates the extent to which data on $\{c_n : n = 0, \ldots, k\}$ is sufficiently informative to dominate the analysis.

When we know there is an upper bound to the coefficients, an application of maximum entropy dictates that the least-informative distribution is uniform for $|c_i| < \bar{c}$. Such uniformity is additionally appealing because it can lead to simple, analytic results. This uniform prior is the initial choice of Ref. [\[6\]](#page-18-0). We employ it in priors we denote as "Set A" and "Set B" (see Table I), the difference being the prior pdf assumed for \bar{c} in the two cases (see below).

The priors of "Set C" in Table I then correspond to the ensemble naturalness assumption of Ref. [\[5\]](#page-18-0). This Gaussian prior follows from the maximum-entropy principle assuming knowledge of testable information on the mean and standard deviation of the c_n 's [\[20,22\]](#page-18-0),

$$
\left\langle \sum_{n=0}^{k} c_n^2 \right\rangle = (k+1)\bar{c}^2, \quad \langle c_n \rangle = 0. \quad (10)
$$

We see below that analyses with Sets A and B are insensitive to details of the distribution of $\{c_0, \ldots, c_k\}$: The only feature of the distribution that matters is the value of the largest of these $k + 1$ lower-order coefficients. However, results under Set C priors are affected by the specific distribution of these coefficients, as well as by the largest value.

(iii) Finally, the application of Bayes' theorem requires a prior for \bar{c} : pr(\bar{c}). Uniformity of ln \bar{c} is the only way to ensure unbiased expectations regarding the scale of \bar{c} [\[23\]](#page-18-0). This log-uniform prior for \bar{c} was chosen in Ref. $[6]$, and so Set A of Table I is their choice of prior. We also employ the log-uniform prior for \bar{c} in Set C, there following Schindler and Phillips in Ref. [\[5\]](#page-18-0). Such a prior cannot be normalized for \bar{c} in (−∞*,*∞) and is therefore termed an "improper prior." Limiting the range of \bar{c} through the use of θ functions permits an examination of the otherwise ill-defined limiting behavior. CH chose \bar{c} _< = ϵ and \bar{c} ₂ = 1/ ϵ and take the limit $\epsilon \to 0$ at the end of the calculations. Thus, the θ functions and associated $\ln \bar{c}_>/\bar{c}_<$ factor serve to regulate the distribution so that the pdf is always normalized. Taking the limit $\epsilon \to 0$ expresses complete ignorance of the scale of \bar{c} , although we also

consider finite ranges for the marginalization over \bar{c} , thereby rendering the priors more informative. In Refs. $[7,8]$, a more informative \bar{c} prior is considered based on the fact that the first coefficient c_0 can be scaled out. The authors argue that in this case it is no

longer necessary to allow for an arbitrarily large value for the other coefficients. In consequence, they assume \bar{c} 's prior is a log-normal distribution about zero. We take this as Set B of Table I. Note that scaling the observable so that the first coefficient is order unity is also what we do for the EFT expansion; see Eq. [\(1\)](#page-0-0).

In the case of prior information on the naturalness of coefficients that is different than that discussed here, maximum entropy can be used to derive how the different information should be reflected in alternative priors [\[22\]](#page-18-0). Such direct conversion from information on the interpretation of naturalness to prior pdfs facilitates rigorous derivation of the consequences of the concepts in question through the use of formal reasoning and the language of probability. We now show how this transpires by deriving the pdf for Δ_k , initially refraining from specifying anything about the priors on $\{c_0, \ldots, c_k\}$.

D. Posteriors and DOB intervals for Δ_k

Given the three assumptions described above and the prior sets of Table I, we can systematically derive the posterior for Δ_k by repeated application of the sum and product rules and their logical Bayesian consequences. At each step, we introduce a specific concept being built into the analysis. For this general derivation we assume that the coefficients start from $k = 0$ and are all significant and nonzero (later we modify the general results to treat the case of *NN* scattering in chiral EFT, where the orders are nominally Q^0 , Q^2 , Q^3 , ... with Q^1 absent).

(1) Formula for $pr(\Delta_k|c_0,\ldots,c_k)$. We seek $pr(\Delta_k|c_0,\ldots,c_k)$, which is the probability density for the dimensionless residual, Δ_k , given the known values of the first $k + 1$ coefficients. Because the true value of Δ_k depends only (explicitly) on the unknown coefficients $c_{n>k}$, we insert them into the equation by integrating over all their possible values using Eqs. (5) and (6) ,

$$
pr(\Delta_k|c_0, ..., c_k)
$$

= $\int pr(\Delta_k|c_{k+1}, c_{k+2}, ...)$ pr(c_{k+1}, c_{k+2}, ... |c₀, ..., c_k)
 $\times dc_{k+1} dc_{k+2} ...$
= $\int \left[\delta \left(\Delta_k - \sum_{n=k+1}^{\infty} c_n Q^n \right) \right] pr(c_{k+1}, c_{k+2}, ...$
|c₀, ..., c_k) $dc_{k+1} dc_{k+2} ...$, (11)

where we have used

$$
pr(\Delta_k|c_0,\ldots,c_k,c_{k+1},c_{k+2},\ldots) = pr(\Delta_k|c_{k+1},c_{k+2},\ldots)
$$

$$
= \delta\left(\Delta_k - \sum_{n=k+1}^{\infty} c_n Q^n\right).
$$
(12)

The latter is a direct consequence of Eq. [\(2\)](#page-1-0). Equation [\(11\)](#page-3-0) states that, to get a specified Δ_k given a set of known coefficients, we need to sum up all the different combinations of c_n 's with $n > k$ that give us this Δ_k , weighting each combination by its probability given the known values of coefficients c_n for $n \leq k$. Note that all of these integrals over *c_n* are from $-\infty$ to $+\infty$, in general, but in particular cases there may be constraints (e.g., a cross section is positive, so the leading coefficient will be positive).

The probability density (11) is correctly normalized because the normalization integral over Δ_k can be performed using the *δ* function, leaving the normalization integral for $pr(c_{k+1}, c_{k+2}, \ldots | c_0, \ldots, c_k)$, which is unity.

(2) Independent priors. Our priors are based on the assumption that \bar{c} is the only information that gets transmitted to the distribution of c_n for $n > k$. Thus, at this stage we introduce \bar{c} as an intermediary in the pdf in the integrand of Eq. (11) via another marginalization integral and apply this assumption:

$$
pr(c_{k+1}, c_{k+2}, \dots | c_0, \dots, c_k)
$$

=
$$
\int_0^\infty pr(c_{k+1}, c_{k+2}, \dots | \bar{c}, c_0, \dots, c_k) pr(\bar{c}|c_0, \dots, c_k) d\bar{c}
$$

=
$$
\int_0^\infty pr(c_{k+1}, c_{k+2}, \dots | \bar{c}) pr(\bar{c}|c_0, \dots, c_k) d\bar{c}
$$

=
$$
\int_0^\infty \left[\prod_{n=k+1}^\infty pr(c_n | \bar{c}) \right] pr(\bar{c}|c_0, \dots, c_k) d\bar{c}.
$$
 (13)

In the final equality we have used the assumption that the *ci* distributions are independent, causing the joint densities for the c_n 's with $n > k$ to become the product of independent densities $pr(c_n|\bar{c})$. We see that the imposition of Set A or Set C priors for \bar{c} makes the limits on this integral finite.

(3) Leading-term approximation. We next assume $\Delta_k \approx$ $c_{k+1}Q^{k+1} \equiv \Delta_k^{(1)}$ in Eq. [\(11\)](#page-3-0) and return later to relax this assumption. By examining the effect of this assumption on DOB intervals, we show that this approximation is quite appropriate for small values of *Q*. This is the simplest way to exploit the δ function, which then depends only on c_{k+1} . After substituting Eq. (13) into [\(11\)](#page-3-0), the c_{k+2} , ... integrals are just normalization integrals (equal to 1), leaving integrations over c_{k+1} and \bar{c} :

$$
pr(\Delta_k^{(1)}|c_0,\ldots,c_k)
$$

=
$$
\int_{-\infty}^{\infty} \int_0^{\infty} \left[\delta(\Delta_k^{(1)} - c_{k+1} Q^{k+1}) \right] pr(c_{k+1}|\bar{c})
$$

$$
\times pr(\bar{c}|c_0,\ldots,c_k) d\bar{c} dc_{k+1}
$$

=
$$
\frac{1}{Q^{k+1}} \int_0^{\infty} pr(c_{k+1} = \Delta_k^{(1)}/Q^{k+1}|\bar{c}) pr(\bar{c}|c_0,\ldots,c_k) d\bar{c}.
$$
 (14)

(4) Expanding the composite prior. The first pdf in the integrand of Eq. (14) may be directly evaluated for a given choice of prior, but the second cannot. It can, however, be identified as being constructed from the priors defined in Table [I,](#page-3-0) via application of Bayes' theorem:

$$
pr(\bar{c}|c_0, ..., c_k) = \frac{pr(c_0, ..., c_k|\bar{c}) pr(\bar{c})}{pr(c_0, ..., c_k)}
$$

=
$$
\frac{pr(c_0, ..., c_k|\bar{c}) pr(\bar{c})}{\int_0^\infty pr(c_0, ..., c_k|\bar{c}') pr(\bar{c}') d\bar{c}'}
$$

=
$$
\frac{\left[\prod_{n=0}^k pr(c_n|\bar{c})\right] pr(\bar{c})}{\int_0^\infty \left[\prod_{n=0}^k pr(c_n|\bar{c}')\right] pr(\bar{c}') d\bar{c}'}
$$
(15)

In the second line we have introduced another marginalization over \bar{c} in the denominator, while in the third line we apply the independence assumption of Eq. (9) . Combining Eqs. (15) and (14) gives

$$
pr(\Delta_k^{(1)}|c_0,\ldots,c_k) = \frac{\int_0^\infty pr(c_{k+1} = \Delta_k^{(1)}/\mathcal{Q}^{k+1}|\bar{c})[\prod_{n=0}^k pr(c_n|\bar{c})]pr(\bar{c}) d\bar{c}}{\mathcal{Q}^{k+1}\int_0^\infty [\prod_{n=0}^k pr(c_n|\bar{c}')]pr(\bar{c}') d\bar{c}'}
$$
\n(16)

Now we can apply one of the sets of assumptions in Table [I,](#page-3-0) which give us specific forms to evaluate each of the pdfs in Eq. (16). Note that if some of the c_i 's for $i < k$ are identically zero, there are correspondingly fewer terms in the products of $pr(c_n|\bar{c})$ in Eq. (16).

 (5) *Prior Set* A⁽¹⁾. Prior Set A has been developed under the assumption that identifying a maximum value \bar{c} is a valid concept. We here start with a finite \bar{c} range between \bar{c} and \bar{c} for which Eq. (16) can be evaluated analytically. If \bar{c} = ϵ and $\bar{c}_> = 1/\epsilon$ and we take the limit as $\epsilon \to 0$, we designate this as Set A_ϵ . Meanwhile, the superscript (1) is introduced to denote the use of the first-term approximation.

For this prior choice, $A^{(1)}$, the denominator of Eq. (16) is directly evaluated as there are only integrals over theta functions,

$$
\int_0^\infty \left[\prod_{n=0}^k \text{pr}(c_n | \bar{c}') \right] \text{pr}(\bar{c}') d\bar{c}'
$$
\n
$$
= \int_0^\infty \left[\prod_{n=0}^k \frac{1}{2\bar{c}'} \theta(\bar{c}' - |c_n|) \right]
$$
\n
$$
\times \frac{1}{\ln \bar{c}_> / \bar{c}_<} \frac{1}{\bar{c}'} \theta(\bar{c}' - \bar{c}_<) \theta(\bar{c}_> - \bar{c}') d\bar{c}'
$$
\n
$$
= \frac{1}{2^{k+1}} \frac{1}{\ln \bar{c}_> / \bar{c}_<} \int_{\max(\bar{c}_{(k)}, \bar{c}_<)}^{\bar{c}_>} \frac{1}{\bar{c}'^{k+2}} d\bar{c}', \qquad (17)
$$

where we have followed CH [\[6\]](#page-18-0) and introduced the variable $\bar{c}_{(i)}$ to denote the maximum of the first $j + 1$ coefficients:

$$
\bar{c}_{(j)} \equiv \max(|c_0|, \dots, |c_j|). \tag{18}
$$

The integration over \bar{c} in the numerator of Eq. (16) is similar, but contains the extra pdf $pr(c_{k+1} = \Delta_k^{(1)}/Q^{k+1}|\bar{c})$ in the integrand. Using the *θ* functions to once again define the integration bounds, the numerator simplifies to

$$
\frac{1}{2^{k+2}} \frac{1}{\ln \bar{c}_{>} / \bar{c}_{<}} \theta(\bar{c}_{>} - \bar{c}_{(k+1)}) \int_{\max(\bar{c}_{(k+1)}, \bar{c}_{<})}^{\bar{c}_{>}} \frac{1}{\bar{c}^{k+3}} d\bar{c}.
$$
 (19)

We can see now how regulating the integrals with \bar{c} _> and \bar{c} _< will allow terms such as $\ln \bar{c}_>/\bar{c}$ (and most factors of 2) to cancel between the numerator and denominator, after which we may choose to take ϵ to zero in $A_{\epsilon}^{(1)}$ without consequence.

More generally, we assume that the integration range for \bar{c} is wide enough that \bar{c} < \bar{c} _(*k*) < \bar{c} _>. The posterior then evaluates to

$$
pr(\Delta_k^{(1)}|c_0, \ldots, c_k)
$$
\n
$$
= \frac{1}{Q^{k+1}} \frac{1}{2} \left(\frac{k+1}{k+2}\right) \frac{\theta(\bar{c}_> - \bar{c}_{(k+1)})}{\bar{c}_{(k)}^{-(k+1)} - \bar{c}_>}^{-(k+1)}
$$
\n
$$
\times \begin{cases}\n\bar{c}_{(k)}^{-(k+2)} - \bar{c}_>^{-(k+2)} & \text{if } |\Delta_k^{(1)}| \le \bar{c}_{(k)} Q^{k+1}, \\
(\frac{Q^{k+1}}{|\Delta_k^{(1)}|})^{k+2} - \bar{c}_>}^{-(k+2)} & \text{if } |\Delta_k^{(1)}| > \bar{c}_{(k)} Q^{k+1}.\n\end{cases}
$$
\n(20)

If some of the coefficients are zero (e.g., the series starts at Q^l with $l > 0$, or one or more intermediate coefficients are zero), we can revise these formulas trivially: The only change is that there are fewer θ functions in the integrals. Taking n_c to be the number of nonzero constants, we implement this generalization by replacing k with $n_c - 1$ everywhere except for powers of Q , which remain $k + 1$. Thus, the modified posterior for Set $A^{(1)}$ is

$$
pr(\Delta_k^{(1)}|c_0, ..., c_k)
$$

= $\frac{1}{Q^{k+1}} \frac{1}{2} \left(\frac{n_c}{n_c + 1} \right) \frac{\theta(\bar{c}_> - \bar{c}_{(k+1)})}{\bar{c}_{(k)}^{-n_c} - \bar{c}_>} \times \begin{cases} \bar{c}_{(k)}^{-(n_c+1)} - \bar{c}_>^{-(n_c+1)} & \text{if } |\Delta_k^{(1)}| \le \bar{c}_{(k)} Q^{k+1}, \\ (\frac{Q^{k+1}}{|\Delta_k^{(1)}|})^{n_c+1} - \bar{c}_>^{-(n_c+1)} & \text{if } |\Delta_k^{(1)}| > \bar{c}_{(k)} Q^{k+1}, \end{cases}$ (21)

which simplifies to the corresponding equation of Ref. [\[6\]](#page-18-0) in the limiting case of $A_{\epsilon}^{(1)}$,

$$
pr(\Delta_k^{(1)}|c_0, ..., c_k)
$$

= $\left(\frac{n_c}{n_c+1}\right) \frac{1}{2\bar{c}_{(k)}Q^{k+1}}$

$$
\times \begin{cases} 1 & \text{if } |\Delta_k^{(1)}| \le \bar{c}_{(k)}Q^{k+1}, \\ (\frac{\bar{c}_{(k)}Q^{k+1}}{|\Delta_k^{(1)}|})^{n_c+1} & \text{if } |\Delta_k^{(1)}| > \bar{c}_{(k)}Q^{k+1}. \end{cases}
$$
(22)

Note that this simple generalization is possible owing to the identical treatment of the priors for each coefficient.

(6) Prior Sets $B^{(1)}$ and $C^{(1)}$. Neither Set B nor Set C priors allow for analytic integrals over \bar{c} , so the discussion here will necessarily be less extensive than that for Set A. In the first-term approximation the posterior for Δ_k can be reduced to a one-dimensional integral, whose evaluation must be left to numerical integration. Inserting Set C priors into Eq. [\(16\)](#page-4-0) results in

$$
pr(\Delta_k^{(1)}|c_0,\ldots,c_k) = \frac{\frac{1}{\mathcal{Q}^{k+1}}\frac{1}{\sqrt{2\pi}}\int_{\tilde{c}_<}^{\tilde{c}_>}d\bar{c}\exp\left[-\frac{(\Delta_k^{(1)})^2}{2(\mathcal{Q}^{k+1})^2\bar{c}^2}\right]\left(\frac{1}{\bar{c}}\right)^{n_c+2}\left[\prod_n e^{-c_n^2/2\bar{c}^2}\right]}{\int_{\tilde{c}_<}^{\tilde{c}_>}d\bar{c}'\left(\frac{1}{\bar{c}'}\right)^{n_c+1}\left[\prod_n e^{-c_n^2/2\bar{c}^2}\right]},
$$
\n(23)

 (1)

where products are assumed to run over all n_c coefficients with defined prior distributions.

(7) DOB intervals. In the Bayesian framework, the posterior $pr(\Delta_k|c_0,\ldots,c_k)$ contains the complete information we claim to have about the dimensionless residual Δ_k . In some applications we need to use the entire posterior because it is very structured (e.g., multimodal or simply non-Gaussian), but here we can capture most of the information with the choice of a small number of DOB intervals.2

In particular, the DOB for a particular interval in Δ_k is found simply by integrating $pr(\Delta_k|c_0, \ldots, c_k)$ over this interval. We could also start with a given DOB, e.g., the standard frequentist (Gaussian) 68% or 95%, and determine the smallest interval that integrates to that number. Alternatively, we could specify some other criterion for deciding the interval, such as that it is symmetric about the mode. In fact, the use of any of the priors in Table [I](#page-3-0) results in a smallest p%-DOB interval for Δ_k that is symmetric about the mode; following Ref. [\[6\]](#page-18-0) we denote the corresponding dimensionless limits by $\pm d_k^{(p)}$. Thus, the implicit definition of this interval is

$$
p\% = \int_{-d_k^{(p)}}^{d_k^{(p)}} \text{pr}(\Delta_k|c_0,\ldots,c_k) \, d\Delta_k. \tag{24}
$$

In the limiting case of prior Set $A_{\epsilon}^{(1)}$, this integral can be evaluated explicitly [\[6\]](#page-18-0),

$$
d_k^{(p)} = \bar{c}_{(k)} Q^{k+1} \times \begin{cases} \frac{n_c+1}{n_c} p^{q_0} & \text{if } p \leq \frac{n_c}{n_c+1}, \\ \left[\frac{1}{(n_c+1)(1-p^{q_0})}\right]^{1/n_c} & \text{if } p > \frac{n_c}{n_c+1}, \end{cases}
$$
(25)

where n_c is again the number of nonzero known coefficients. Thus, with these priors, the interval of width $\bar{c}_{(k)}Q^{k+1}$ about the EFT prediction at order *k* is a $n_c/(n_c + 1) * 100\%$ DOB interval, cf. Ref. [\[6\]](#page-18-0). Such a theory error bar has often been assigned in previous EFT calculations, and—as we discuss further in Sec. [III—](#page-7-0)corresponds to the prescription formalized in Refs. $[10,11]$. It is important—e.g., in the context of error propagation—to keep in mind that this prior leads to a distribution of probability for the truncation error that is not Gaussian.

For the more general form of prior Set $A^{(1)}$, an analytic formula for $d_k^{(p)}$ can still be found. The explicit form of the integral depends on the *p*% value of interest, because of the change in structure for $|\Delta_k^{(1)}| > \bar{c}_{(k)} Q^{k+1}$. Thus, we first calculate this transition value ($p\ddot{\mathcal{D}}_t$ by integrating the maximal probability within the first region in which $|c_{k+1}| \leq \bar{c}_{(k)}$ to obtain

$$
(p\%)_{t} = \begin{bmatrix} \frac{1}{\tilde{c}_{(k)}^{n_{c+1}}} - \frac{1}{\tilde{c}_{>}^{n_{c}}}\\ \frac{1}{\tilde{c}_{(k)}^{n_{c}}} - \frac{1}{\tilde{c}_{>}^{n_{c}}} \end{bmatrix} \begin{pmatrix} n_{c} \\ n_{c} + 1 \end{pmatrix} \bar{c}_{(k)}.
$$
 (26)

Now suppose we are interested in $p\%$ intervals for $p < p_t$. Equation (26) implies that the interval bounded by variation $\pm \bar{c}_{(k)}Q^{k+1}$ is a ($p\%$)_t-DOB interval. Generally, the DOB

²These are also called "credibility" or "credible" intervals.

interval for Set $A^{(1)}$ is bounded by

$$
d_k^{(p)} = \left[\frac{\frac{1}{\tilde{c}_{(k)}^{n_c+1}} - \frac{1}{\tilde{c}_{\leq k}^{n_c+1}}}{\frac{1}{\tilde{c}_{(k)}^{n_c}} - \frac{1}{\tilde{c}_{\leq k}^{n_c}}}\right]^{-1} \frac{n_c+1}{n_c} p\% Q^{k+1} \text{ if } p\% \leq (p\%)_t. \tag{27}
$$

When one is interested in larger *p*% values, it may be beneficial to take advantage of the normalization of the pdf to conduct an integration in only one region by integrating the second case of Eq. [\(21\)](#page-5-0) on the interval $[d_k^{(p)}, \infty]$. Because $\bar{c}_{(k+1)} =$ c_{k+1} in this region, the θ function truncates this integration at $\Delta_k^{(1)} = \bar{c}_> Q^{k+1}$. The resulting implicit expression for $d_k^{(p)}$ if $p\%$ > $(p\%)$ _t is thus

$$
(1 - p\%) = \frac{1}{Q^{k+1}} \left(\frac{n_c}{n_c+1}\right) \frac{1}{\frac{1}{\tilde{c}_{(k)}^{n_c}} - \frac{1}{\tilde{c}_{\succ}^{n_c}} \left\{ \frac{(d_k^{(p)} - \bar{c}_{\succ} Q^{k+1})}{\bar{c}_{\succ}^{n_c+1}} \right. \\
\left. + \frac{(Q^{k+1})^{n_c+1}}{n_c} \left[\frac{1}{(d_k^{(p)})^{n_c}} - \frac{1}{(\bar{c}_{\succ} Q^{k+1})^{n_c}} \right] \right\}.
$$
 (28)

For Set $B^{(1)}$, Set $C^{(1)}$, or, indeed, for any of the sets if we do not make the first-term approximation, the DOB interval $d_k^{(p)}$ can be found numerically from Eq. [\(24\)](#page-5-0) by integrating $pr(\Delta_k|c_0,\ldots,c_k)$ [e.g., from Eq. [\(23\)](#page-5-0)] from zero until the integral equals *p/*2.We stress again the resulting DOB intervals are *not* standard deviations and make no statement about the shape of the normalized function that integrates to 0.68 between the bounds $\pm d_k^{(68)}$.

(8) Relaxation of first-term approximation. To relax the assumption that the first omitted term dominates, we introduce the generalized notation

$$
\Delta_k \approx \Delta_k^{(1)} + \sum_{m=k+2}^{k_{\text{max}}} c_m Q^m \equiv \Delta_k^{(k_{\text{max}} - k)} = \Delta_k^{(h)},\tag{29}
$$

where *k*max is the highest-order coefficient kept in the sum of omitted terms. Returning to step 3 above, we continue to use the δ function to eliminate the integral over c_{k+1} , with the result that $\Delta_k^{(1)}$ is replaced with $\Delta_k^{(k_{\text{max}}-k)}$ in the subsequent expression and the integrations over c_m for $m > k + 1$ up to $m = k_{\text{max}}$ remain. The generalization of Eq. [\(16\)](#page-4-0) is then

$$
\text{pr}(\Delta_k^{(h)}|c_0,\ldots,c_k) = \frac{\int_{-\infty}^{\infty}\cdots\int_{-\infty}^{\infty}\int_{0}^{\infty}\text{pr}(c_{k+1}=\Delta_k^{(h)}(Q)/Q^{k+1}|\bar{c})\left[\prod_{n=0}^k\text{pr}(c_n|\bar{c})\right]\text{pr}(\bar{c})\,d\bar{c}\,\prod_{m=k+2}^{k_{\text{max}}}\text{pr}(c_m|\bar{c})\,dc_m}{Q^{k+1}\int_{0}^{\infty}\left[\prod_{n=0}^k\text{pr}(c_n|\bar{c}')\right]\text{pr}(\bar{c}')\,d\bar{c}'}.
$$
(30)

where there are $k_{\text{max}} - k - 1$ integrals from $-\infty$ to ∞ in the numerator, in addition to the integral over the (positive) \bar{c} . Note that if the first omitted term really does dominate, then the integrals over higher *cm*'s are trivial normalization integrals, restoring the result of the first-omitted-term approximation.

(9) Summary. We have derived a general result for $pr(\Delta_k|c_0, \ldots, c_k)$ in Eq. (30), which is valid for any of the sets in Table [I.](#page-3-0) In most cases this expression must be evaluated numerically, for example by Monte Carlo integration. By assuming the first omitted term dominates, we obtain the much less involved integration in Eq. [\(16\)](#page-4-0). Evaluating the application of this approximation to Set $A^{(1)}$ yields the analytic result in Eq. (21) while for Sets B⁽¹⁾ and $C^{(1)}$ integrals are left to be evaluated numerically; see, e.g., Eq. [\(23\)](#page-5-0). Finally, DOB intervals can be derived from these posteriors analytically for $A^{(1)}$ [Eqs. [\(25\)](#page-5-0), (27), and (28)] and numerically for the others from Eq. [\(24\)](#page-5-0).

E. Representative examples

Before applying the Bayesian framework developed by CH, and extended above, to the specific problem of *NN* scattering, we make some general observations on the form of the posteriors for Δ_k and the systematics of the 68% and 95% DOB intervals for various prior sets from Table [I.](#page-3-0)

We start with the set A_ϵ , defined by $\bar{c}_< = \epsilon$, $\bar{c}_> = 1/\epsilon$, with $\epsilon \to 0$ (in practice, all results here in which ϵ is invoked use $\epsilon = 0.001$). The posterior distribution for $\Delta_k^{(1)}$ in Eq. [\(21\)](#page-5-0), which assumes that the first omitted term dominates the error, has a flat central plateau with power-suppressed tails. This

is illustrated by the red curves in Fig. [1](#page-7-0) for $k = 0$, $k = 2$, and $k = 4$, for $Q = 0.33$. The heavy and light shaded regions show the 68% and 95% DOB intervals, respectively. From Eq. [\(25\)](#page-5-0), the width of the posterior is given by $\bar{c}_{(k)}Q^{k+1}$ times a number of order unity, so the dominant effect is that the width decreases by a factor of *Q* with each increase of *k* by one. In fact, only the maximum value of the c_n 's for a given k , $\bar{c}_{(k)}$, matters under this choice of prior; the distribution of those c_n 's is irrelevant. The overall size of all DOB intervals then scales linearly with $\bar{c}_{(k)}$, so here c_0, \ldots, c_k have all been set to 1 for simplicity. For Set A priors the generalization to other cases is trivial.

To relax the first-term approximation we include the first four omitted terms in our computation of Δ_k . The result is then converged numerically in all cases shown, so, in practice, Set $Y^{(4)}$ $(Y = A, B, \text{ or } C)$ priors lead to the same results as when arbitrarily many higher-order terms are included in the truncation-error calculation. In consequence, we do not include superscripts below when reporting results with terms beyond the first omitted one included in the computation of Δ_k . Such calculations show that the central plateau in the posterior becomes rounded (blue curve in Fig. [1\)](#page-7-0). The corresponding effect on the DOB intervals depends on the value of *k*; for $k \geq 2$ there is no significant effect on the 68% DOB intervals while the 95% intervals are increased slightly.

If we use the more informative log-normal prior for \bar{c} from set B, the tails are more quickly suppressed than for set A_ϵ , to a degree that depends in detail on the values of σ and \mathcal{Q} [\[7,8\]](#page-18-0). Representative examples for Δ_2 Δ_2 are shown in Figs. 2 and [3](#page-8-0) for $Q = 0.2$ and $Q = 0.5$, respectively, with $\sigma = 0.25, 0.5$, and 1*.*0 respectively. We see that the 68% DOB and 95% DOB

F[I](#page-3-0)G. 1. (Color online) Posteriors for $\Delta_k^{(1)}$ under Set $A_{\epsilon}^{(1)}$ priors of Table I for (a) $k = 0$, (b) $k = 2$, and (c) $k = 4$, with $Q = 0.33$. In all cases, $c_n = 1$ was assumed. The solid red curve is the analytic result from Eq. [\(21\)](#page-5-0), with the shaded regions marking the 68% and 95% DOB intervals. The solid blue curve is the posterior Δ_k for A_ϵ once higher-order terms are included, with dot-dashed and dashed lines marking the corresponding 68% and 95% DOB intervals.

intervals are smaller than those for A_ϵ , with the difference increasing with smaller σ . The further extension of the tail for A_{ϵ} is not surprising as we have allowed for the possibility of \bar{c} having a large range. As σ gets larger, the posteriors for each *Q* value approach the A_{ϵ} result; once $\sigma \geq 1.0$ there is very little difference between A_ϵ and Set B for $k \ge 2$. $k = 0$ and $k = 1$ are more sensitive to σ .

We might expect that the Set B results with $\sigma > 1.0$ will be even closer to those from Set A if we impose a range of \bar{c} values in Set A that reflects naturalness expectations. Results of varying the range over which \bar{c} is marginalized are shown in Table [II,](#page-8-0) where we compare DOB intervals for Δ_k with *k* from 0 to 4. For $k \ge 3$, the change in the range of \bar{c} has no noticeable effect on either the 68% or the 95% DOB. For $k = 2$, effects are 5% –10% on the 68% interval if a narrow range (\bar{c} from 0.5 to 2.0) is employed. Effects on the 95% interval can be up to 20% if this narrow range is employed at $k = 2$.

The Set C priors are qualitatively different from those of Set A because they correspond to an ensemble naturalness assumption for $pr(c_i|\bar{c})$, which means that the distribution of *cn*'s for a given *k*—and not just their maximum—affects the result. This is illustrated by the results in Table [III,](#page-9-0) in which DOB intervals for Δ_2 with prior choices A_ϵ and C_ϵ are compared. Because $k = 2$, the coefficients c_0 , c_1 , and c_2 are all influential; we consider three representative choices for their

values. The systematics going from c_n sets a to b to c show that having more *cn*'s near 1 leads to larger DOB intervals. Taking $c_n(b)$ to give generic results for a roughly even distribution of coefficients, we find that the Set C vs Set A comparison is close: only a 10%–15% increase for the 68% DOB and a roughly 20% increase for the 95% DOB. (The Set A intervals are wider for all but the case in which all three known coefficients are 1.0.) This reflects the stronger central peaking of the Set C pdf under a reasonable distribution of the first three coefficients, as depicted (in the first-omitted-term approximation) in Fig. [4.](#page-9-0) Such differences in DOB intervals under different prior choices will be amplified if $k = 0$ or $k = 1$.

Table [III](#page-9-0) also assesses the approximation of keeping only the leading omitted term in Δ_2 . Once $Q = 0.5$ we see appreciable differences between Set $C^{(1)}$ and Set C results that include multiple higher-order terms, but even then it is only about a 15% effect on the error bar.

III. COMPARISON TO RECENT CHIRAL EFT RESULTS FOR *np* **SCATTERING**

A. EKM's truncation-error estimates

Chiral perturbation theory (*χ*PT) encodes the consequences of QCD at momenta of order of the pion mass [\[12–15\]](#page-18-0). It can

FIG. 2. (Color online) Comparison of Δ_2 for prior set A_{^{*i*}} (red solid line) and B (blue solid line) for (a) $\sigma = 0.25$, (b) $\sigma = 0.5$, and (c) $\sigma = 1.0$. In each case c_0 , c_1 , c_2 are all set to unity with an expansion parameter $Q = 0.2$. The DOB intervals are indicated as in Fig. 1.

FIG. 3. (Color online) Comparison of Δ_2 for prior set A_{^{*i*}} (red solid line) and B (blue solid line) for (a) $\sigma = 0.25$, (b) $\sigma = 0.5$, and (c) $\sigma = 1.0$ $\sigma = 1.0$ $\sigma = 1.0$, and c_0 , c_1 , c_2 all set to unity with an expansion parameter $Q = 0.5$. The DOB intervals are indicated as in Fig. 1.

be used to compute the interaction of single nucleons and pions for momenta well below the chiral-symmetry-breaking scale, $\Lambda_{\chi SB}$. χPT yields a purely perturbative expansion in powers of $(p,m_\pi)/\Lambda_{\chi SB}$ for low-energy pion-pion and pionnucleon scattering. But, nuclei are bound states and will not be generated from such an expansion.

In the early 1990s Weinberg pointed out that the infrared enhancement associated with multinucleon intermediate states meant that the χ PT expansion cannot be applied directly to the scattering amplitude in systems with more than one nucleon [\[24\]](#page-18-0). He argued that the *χ*PT Lagrangian and counting rules should instead be used to compute an *NN* (or *NNN* or ...) potential up to some fixed order, *n*, in *χ*PT. Such an expansion can then be examined for convergence with *n*. The *χPT* potential *V* was computed to $O(Q^3)$ in Refs. $[25-27]$ and to $O(Q⁴)$ in Refs. [\[28,29\]](#page-18-0). Consistent threenucleon forces have been derived and implemented in such an approach [\[30,31\]](#page-18-0).

However, while there is a χ PT expansion for *V*, the resulting nuclear binding energies (and other observables) contain effects to all orders in the chiral expansion: There is no obvious perturbative expansion for them. In practice, chiral EFT for few-nucleon systems is often implemented as described in the previous paragraph, but with the Hamiltonian acting only on a limited space: In momentum space a cutoff Λ in the range $450 < \Lambda < 800$ MeV must be imposed [\[32\]](#page-18-0). From now on when we use the term chiral EFT in the context of few-nucleon systems we mean calculations that are carried out in this way. A formal justification of the *Q* expansion (e.g., via the distorted-wave Born approximation evaluation of higher-order contributions [\[33–35\]](#page-18-0) or use of a relativistic propagator [\[36,37\]](#page-18-0)) requires a more sophisticated power counting [\[38](#page-18-0)[–40\]](#page-19-0). Nevertheless, in practice, the convergence of chiral EFT calculations for observables can be examined *a posteriori* to see if they inherit the *Q* expansion that has been used for the potential.

TABLE II. Resulting 68% and 95% DOB intervals for Δ_k using Set A⁽¹⁾ with different choices for the minimum and maximum of the \bar{c} prior. In all cases $\bar{c}_{(k)} = 1$.

| | min/max | $\mathcal Q$ | $k=0$ | $k=1$ | $k=2$ | $k=3$ | $k=4$ |
|-----|------------|--------------|-------|-------|--------|---------|---------|
| | 0.001/1000 | | 0.31 | 0.041 | 0.0073 | 0.00136 | 0.00026 |
| | 0.25/4.0 | 0.20 | 0.22 | 0.039 | 0.0072 | 0.00136 | 0.00026 |
| | 0.50/2.0 | | 0.18 | 0.035 | 0.0068 | 0.00132 | 0.00026 |
| | 0.001/1000 | | 0.51 | 0.111 | 0.033 | 0.0101 | 0.0032 |
| 68% | 0.25/4.0 | 0.33 | 0.36 | 0.106 | 0.032 | 0.0101 | 0.0032 |
| | 0.50/2.0 | | 0.30 | 0.095 | 0.030 | 0.0098 | 0.0031 |
| | 0.001/1000 | | 0.78 | 0.26 | 0.113 | 0.053 | 0.026 |
| | 0.25/4.0 | 0.50 | 0.55 | 0.243 | 0.112 | 0.053 | 0.025 |
| | 0.50/2.0 | | 0.45 | 0.22 | 0.106 | 0.051 | 0.025 |
| | 0.001/1000 | | 1.96 | 0.103 | 0.0137 | 0.0023 | 0.00041 |
| | 0.25/4.0 | 0.20 | 0.47 | 0.077 | 0.0129 | 0.0022 | 0.00041 |
| | 0.50/2.0 | | 0.29 | 0.056 | 0.011 | 0.0020 | 0.00039 |
| | 0.001/1000 | | 3.2 | 0.28 | 0.0614 | 0.0168 | 0.0050 |
| 95% | 0.25/4.0 | 0.33 | 0.77 | 0.21 | 0.058 | 0.0166 | 0.0050 |
| | 0.50/2.0 | | 0.48 | 0.152 | 0.048 | 0.0150 | 0.0047 |
| | 0.001/1000 | | 4.91 | 0.645 | 0.21 | 0.0884 | 0.040 |
| | 0.25/4.0 | 0.50 | 1.16 | 0.48 | 0.201 | 0.087 | 0.040 |
| | 0.50/2.0 | | 0.73 | 0.35 | 0.166 | 0.079 | 0.038 |

TABLE III. DOB intervals for Sets A_{ϵ} and C_{ϵ}, with and without the leading-omitted-term approximation, for $k = 2$, with three sets of c_n values. These sets are $\{c_n\}(a) \equiv \{1.0, 1.0, 1.0\}, \{c_n\}(b) \equiv \{1.0, 0.5, 0.1\}, \text{ and } \{c_n\}(c) \equiv \{1.0, 0.1, 0.1\}.$

| | Q | $A_{\epsilon}^{(1)}/A_{\epsilon}$ | $C_{\epsilon}^{(1)}/C_{\epsilon}$ { c_n }(<i>a</i>) | $C_{\epsilon}^{(1)}/C_{\epsilon}$ { c_n }(<i>b</i>) | $C_{\epsilon}^{(1)}/C_{\epsilon}$ { c_n }(c) |
|-----|------|-----------------------------------|---|---|--|
| 68% | 0.20 | 0.0073/0.0073 | 0.0095/0.0097 | 0.0062/0.0063 | 0.0056/0.0057 |
| | 0.33 | 0.033/0.033 | 0.043/0.045 | 0.028/0.029 | 0.025/0.026 |
| | 0.50 | 0.113/0.123 | 0.149/0.171 | 0.096/0.111 | 0.087/0.100 |
| 95% | 0.20 | 0.0137/0.0137 | 0.025/0.026 | 0.017/0.017 | 0.015/0.015 |
| | 0.33 | 0.061/0.066 | 0.114/0.121 | 0.074/0.079 | 0.067/0.071 |
| | 0.50 | 0.21/0.25 | 0.40/0.46 | 0.26/0.30 | 0.23/0.27 |

In two recent papers, EKM estimated the errors that arise from truncation of the chiral EFT expansion at a finite order $[10,11]$ (see also Ref. $[41]$). Similar prescriptions have previously been used in other EFT contexts (see, e.g., Refs. [\[42,43\]](#page-19-0)). Such estimates apply to individual observables (such as the total cross section for neutron-proton scattering at a given laboratory energy or nucleon electric and magnetic polarizabilities). They are independent of procedures used to fit LECs to two-body scattering data at each order. While Bayesian analysis could also be applied to those procedures, that is not our concern here; it will be the focus of a future publication [\[18\]](#page-18-0).

Instead, EKM assume that the EFT expansion holds for individual observables *X*(*p*), i.e.,

$$
X(p) = X_0 \sum_{n=0}^{k} c_n(p) Q^n,
$$
 (31)

with *Q* the EFT expansion parameter, and $c_1 = 0$ in the Weinberg expansion for *NN* scattering in chiral EFT. Cumulative sums at LO, NLO, N^2LO , N^3LO , and N^4LO are then given by

$$
X^{LO}(p) = c_0(p),
$$
 (32)

$$
X^{\text{NLO}}(p) = \sum_{n=0}^{2} c_n(p) Q^n,
$$
 (33)

$$
X^{\text{N/LO}}(p) = \sum_{n=0}^{j+1} c_n(p) Q^n, \quad j = 2, 3, 4. \tag{34}
$$

EKM also assume that the dominant error at order *k* comes from the first omitted— $(k + 1)$ th—term. Two ingredients go into their estimate of this term. The first is to identify the EFT expansion parameter *Q*, defined as

$$
Q \equiv \max\left(\frac{p}{\Lambda_b}, \frac{m_\pi}{\Lambda_b}\right). \tag{35}
$$

Note that, in contrast to pQCD, this is a momentum-dependent expansion parameter, and so the expansion will perform differently at different kinematic points. Furthermore, to know Q we must identify Λ_b , the breakdown scale of the EFT. In Refs. [\[10,11\]](#page-18-0), EKM estimate Λ_b from error plots of the fit phase shifts. The second ingredient is to determine the shift beyond N^jLO as

$$
\Delta X^{\text{N}^j\text{LO}} = Q^{j+2} \text{max}(|c_0|, |c_1|, \dots, |c_{j+1}|), \quad (36)
$$

where the c_n 's are defined as above.

In Refs. $[10,11]$ the expressions for the theory error are defined via differences of the partial sums (34), but the result may be summarized compactly according to Eq. (36). The similarity of this prescription to the simplest analytic form obtained above with $A_{\epsilon}^{(1)}$ priors, the CH procedure written in Eq. [\(25\)](#page-5-0), is evident. For a given observable, the value of *Q* that is identified defines the perturbative expansion parameter, and the EKM uncertainty is the maximum coefficient times the first omitted power of *Q*. Up to factors of order unity, this is what Eq. (25) predicts for the 68% (" 1σ ") DOB interval. There is then clearly a semiquantitative correspondence. We now make a quantitative comparison using the various priors from Table [I.](#page-3-0)

FIG. 4. (Color online) Comparison of Δ_2 for prior set $A_{\epsilon}^{(1)}$ (red solid line) and $C_{\epsilon}^{(1)}$ (blue solid line)—note that both are in the leading-omittedterm approximation—for three sets of c_n values with an expansion parameter $Q = 0.33$. These sets are (left to right) $\{c_n\}(a) \equiv \{1.0, 1.0, 1.0\}$, ${c_n}(b) \equiv \{1.0, 0.5, 0.1\}$ ${c_n}(b) \equiv \{1.0, 0.5, 0.1\}$ ${c_n}(b) \equiv \{1.0, 0.5, 0.1\}$, and ${c_n}(c) \equiv \{1.0, 0.1, 0.1\}$. The DOB intervals are indicated as in Fig. 1.

TABLE IV. Order-by-order calculations for σ_{np} in mb for $R =$ 0*.*9 fm from EKM [\[10,11](#page-18-0)[,44\]](#page-19-0). Lab energy *T*lab and relative momentum *p*rel are in units of MeV.

| $T_{\rm lab}$ | p_{rel} | $\sigma_{\rm LO}$ | $\sigma_{\rm NLO}$ | $\sigma_{\rm N^2LO}$ | $\sigma_{\rm N^3LO}$ | $\sigma_{\rm N^{4}LO}$ |
|---------------|-----------|-------------------|--------------------|----------------------|----------------------|------------------------|
| 50 | 153 | 183.6 | 166.5 | 167.0 | 166.8 | 167.5 |
| 96 | 212 | 84.8 | 75.1 | 78.3 | 77.5 | 78.0 |
| 143 | 259 | 52.5 | 49.1 | 54.2 | 53.7 | 53.9 |
| 200 | 307 | 34.9 | 35.9 | 42.6 | 43.2 | 42.7 |

We note that in chiral EFT, having posited a *Q* expansion, we do not find the coefficients directly but extract them from the calculations at different orders. In contrast, for the QCD expansions, the coefficients are calculated independently of each other. Thus, the EFT application will require additional empirical verification; see Sec. [IV.](#page-13-0)

B. The pattern of EFT coefficients in EKM's result

In Refs. [\[10,](#page-18-0)[44\]](#page-19-0), results for the neutron-proton total cross section at various energies are given for several values of a coordinate-space regulator parameter *R*. These provide empirical tests of the priors from Table [I.](#page-3-0) The order-by-order cross sections are given in Tables IV and V for $R = 0.9$ fm and $R = 1.2$ fm, respectively. In line with Eq. (1) , we write the cross section at order k in the chiral EFT expansion as

$$
\sigma_{np}(E_{\text{lab}}) \approx \sigma_{\text{ref}} \sum_{n=0}^{k} c_n \left(\frac{p}{\Lambda_b}\right)^n, \tag{37}
$$

where σ_{ref} is a reference cross section that might be taken as σ_{LO} , as we do here, or the N⁴LO result, or the experimental value. The analysis is not sensitive to this choice. The breakdown scale Λ_b was identified in Ref. [\[10\]](#page-18-0) as $\Lambda_b = 600 \text{ MeV}$ for cutoffs $R = 0.8, 0.9, \text{ and } 1.0 \text{ fm}$, $\Lambda_b = 500 \text{ MeV}$ for $R = 1.1 \text{ fm}$, and $\Lambda_b = 400 \text{ MeV}$ for $R = 1.2$ fm. Note that this decrease in Λ_b with increasing *R* corresponds to the change in the regulator cutoff scale rather than a change in the intrinsic underlying breakdown scale. In Ref. [\[4\]](#page-18-0) it was emphasized that residuals for a *k*th-order EFT calculation had two types of errors: regulator artifacts dictated by the imposed cutoff Λ (~1/R in this context) and truncation errors in the Hamiltonian dictated by the underlying breakdown scale Λ_b . EKM do not make this distinction in their notation; i.e., they use Λ_b for both.

Under the EKM choices for Λ_b , the dimensionless c_n coefficients are given in Tables VI and VII and Figs. [5](#page-11-0) and [6](#page-11-0) for

TABLE V. Order-by-order calculations for σ_{np} in mb for $R =$ 1.2 fm from EKM $[10,11,44]$ $[10,11,44]$. Lab energy T_{lab} and relative momentum *p*rel are in units of MeV.

| $T_{\rm lab}$ | p_{rel} | $\sigma_{\rm LO}$ | $\sigma_{\rm NLO}$ | $\sigma_{\rm N^2LO}$ | $\sigma_{\rm N^3LO}$ | $\sigma_{\rm N^4LO}$ |
|---------------|-----------|-------------------|--------------------|----------------------|----------------------|----------------------|
| 50 | 153 | 159.4 | 164.8 | 165.6 | 167.2 | 167.9 |
| 96 | 212 | 60.2 | 68.9 | 71.3 | 78.1 | 78.5 |
| 143 | 259 | 30.8 | 38.6 | 41.4 | 52.6 | 52.7 |
| 200 | 307 | 17.2 | 22.5 | 25.0 | 38.6 | 38.3 |

TABLE VI. Dimensionless coefficients from the expansion of $\sigma_{np} = \sigma_{LO} \sum_{n=0}^{5} c_n Q^n$ for $R = 0.9$ fm from Table IV, with $Q =$ *p*rel*/*600 MeV.

| $T_{\rm lab}$ | c ₀ | c ₁ | \mathcal{C} | c_3 | C ₄ | c ₅ |
|---------------|----------------|----------------|---------------|-------|----------------|----------------|
| 50 | 1.0 | 0.0 | -1.43 | 0.16 | -0.26 | 3.5 |
| 96 | 1.0 | 0.0 | -0.92 | 0.86 | -0.61 | 1.07 |
| 143 | 1.0 | 0.0 | -0.35 | 1.21 | -0.27 | 0.25 |
| 200 | 1.0 | 0.0 | 0.11 | 1.44 | 0.25 | -0.41 |

the $R = 0.9$ fm and $R = 1.2$ fm cases, respectively. Although the coefficients in both cases are natural, rather different patterns are seen. As discussed and illustrated by EKM (e.g., see Fig. 2 of Ref. [\[11\]](#page-18-0)), the softer cutoff shifts contributions between different chiral orders so that the systematic pattern of corrections is disrupted. In particular, corrections at orders N^2LO and N^4LO , which are purely from nonanalytic terms in the chiral expansion, become heavily regulated by the soft cutoff. This has the consequence that the corresponding coefficients are anomalously small—which may, in turn result in $N³LO$ coefficients being somewhat large. This pattern is seen in Fig. [6,](#page-11-0) but what is shown there is insufficient to definitively establish that there is an interorder correlation owing to regulator artifacts. Here we focus on the $R = 0.9$ fm example to ensure that the pattern is primarily driven by the inheritance of naturalness from the fit LECs and not by regulator artifacts that spring from a choice of *R* that makes the $\Lambda \sim 1/R$ effects predominate over the physics at Λ_b that was integrated out of the theory.

C. DOB intervals from a Bayesian analysis

There is a minimum of necessary information that must exist between the prior and data for the resulting posterior to accurately describe the above distributions. Two extremes exist: a large supply of precise and accurate data paired with an uninformative prior (or, even worse, an informative yet incorrect prior) and a small amount of data paired with a precisely and accurately defined prior. Each of these situations may result in realistic posteriors as lack of information in one realm is compensated by abundance in the other. In practice, though, we conduct analyses between these extremes. We are often able to define a reasonable, and appropriately loose, prior that is subsequently fine tuned by a modest amount of data. We now show that each of the priors defined in Table [I](#page-3-0) may be considered reasonable representations of naturalness in the EFT-coefficient distribution obtained in the previous section. The DOB intervals that result from Bayesian analyses using

TABLE VII. Dimensionless coefficients from the expansion of $\sigma_{np} = \sigma_{LO} \sum_{n=0}^{5} c_n Q^n$ for $R = 1.2$ fm from Table V, with $Q =$ *p*rel*/*400 MeV.

| $T_{\rm lab}$ | c_0 | c ₁ | \mathcal{C}_{2} | c ₃ | c_4 | c ₅ |
|---------------|-------|----------------|-------------------|----------------|-------|----------------|
| 50 | 1.0 | 0.0 | 0.23 | 0.09 | 0.47 | 0.54 |
| 96 | 1.0 | 0.0 | 0.51 | 0.27 | 1.43 | 0.16 |
| 143 | 1.0 | 0.0 | 0.60 | 0.33 | 2.07 | 0.03 |
| 200 | 1.0 | 0.0 | 0.52 | 0.32 | 2.28 | -0.07 |

FIG. 5. (Color online) Chiral EFT expansion coefficients from Table [VI](#page-10-0) for σ_{np} at four different energies using potentials with regulator parameters $R = 0.9$ fm and $\Lambda_b = 600$ MeV. Note that the coefficient $c_5 = 3.5$ at $T_{\text{lab}} = 50$ MeV is off scale.

these priors show agreement and increased similarity at low *Q* and high *k*, where the strength of available data is greatest.

In Fig. 7, cross sections from Table [IV](#page-10-0) for $R = 0.9$ fm at four different energies are plotted order-by-order in the chiral expansion, with error bars indicating the 68% and 95% DOB intervals if we adopt prior set A_ϵ . The LO' error bars are from the calculation for the posterior of Δ_0 while the LO error bars are from the posterior of Δ_1 . When calculating Δ_1 , we have $k = 1$ and $n_c = 1$, so the resulting error bar is simply Q times the LO' one. This is the correct error estimate for a LO chiral EFT calculation of *NN* scattering, as long as we know *a priori* that the coefficient c_1 in the expansion [\(37\)](#page-10-0) is identically zero.

Cross sections at subsequent orders generally fall within the DOB intervals of lower-order error analyses, in accord with the DOB intervals' statistical interpretation. The order-by-order decrease in the error bars primarily reflects the additional factors of *Q* with each successive order. The very conservative assumption for $pr(\bar{c})$ used here, which encodes ignorance of its scale even though we anticipate naturalness, leads to long tails in the posterior for the lowest orders and correspondingly large 95% DOB intervals, further reflecting the non-Gaussian nature of this distribution. When we use a form for $pr(\bar{c})$ that reflects the expectation of naturalness, the long tails are suppressed and the 95% DOB intervals are closer to "2*σ*" errors, although the pdfs do remain non-Gaussian, in general.

Table [VIII](#page-12-0) is an analytical compilation of DOB intervals in the limiting case of A_ϵ with the leading-term approximation; see Eq. [\(25\)](#page-5-0). The top number in each cell has been calculated using coefficients of Table [VI,](#page-10-0) which are scaled with the

FIG. 6. (Color online) Chiral EFT expansion coefficients from Table [VI](#page-10-0) for σ_{np} at four different energies using potentials with regulator parameters $R = 1.2$ fm and $\Lambda_b = 400$ MeV.

FIG. 7. (Color online) Cross sections at different energies and orders from EKM, with DOB intervals at each order using Set A_ϵ priors. The thick error bars indicate 68% DOB intervals, while the thin error bars indicate 95% DOB intervals.

*σ*ref corresponding to each energy. The lower number is the resulting DOB interval in units of mb with the factor of $\sigma_{\text{ref}} = \sigma_{\text{LO}}$ included. The 95% DOB interval being more than 6 times broader than the corresponding 68% DOB interval at LO' and LO emphasizes the strength of tails within these posteriors.

Representative numerical results for the various prior sets are given in Table [IX.](#page-12-0) Though we omit mention of σ_{ref} , values here should also be multiplied by the energy-appropriate *σ*ref $(i.e., \sigma_{LO})$ to obtain DOB values in units of mb. Systematically, we observe that the ratios of DOB intervals between prior sets are the same across all four energies for LO['] and LO as all c_1 's are 0 and we have scaled all c_0 's to the value 1.0. Thus, given the same set of coefficients, all posteriors scale similarly with energy. Table IX also shows that the ensemble prior in Set C_{ϵ} generally predicts 68% DOB intervals, quite similar to those from Set A_ϵ , with much greater variation for 95% DOB intervals for the lower orders. From this, we see that prior choice affects the structure of the tails more significantly than the structure of the peak. This is indicative of the strength of information coming from the data and the prior at different points in the distribution. Though Set B results in significantly narrower DOB intervals at low *k*, the EFT coefficients provide enough information for $k \geq 2$ to modify these posteriors into agreement with those of Sets C_{ϵ} and A_{ϵ} .

A comparison of Set A results in Table [IX](#page-12-0) with those in Table [VIII](#page-12-0) shows that the approximation of keeping only the leading omitted term is excellent for the 68% DOB for $k > 2$ and still quite good for $k = 1$ (which is the true leading order). This approximation always underestimates the interval from including higher-order terms and worsens as the expansion parameter *Q* increases. Figures [8](#page-13-0) and [9](#page-14-0) show that this result is general and that the approximation is better for the 95% interval with a less conservative prior for \bar{c} . One outlier is the $k = 5$ prediction at $T_{\text{lab}} = 50 \text{ MeV}$, where we see consequences of a c_5 coefficient known to have an anomalously

| DOB | E_{lab} | \mathcal{Q} | LO' | LO | NLO | N^2LO | N^3LO | N^4LO |
|-------------------|-----------|---------------|------|-------|------------|---------|---------|---------|
| | | | | | | | | |
| 68% | 50 | 0.255 | 0.40 | 0.102 | 0.024 | 0.0055 | 0.0013 | 0.00079 |
| \times 183.6 mb | | | 73 | 19 | 4.4 | 1.0 | 0.24 | 0.15 |
| 68% | 96 | 0.354 | 0.55 | 0.20 | 0.045 | 0.0142 | 0.0047 | 0.0017 |
| \times 84.8 mb | | | 47 | 17 | 3.8 | 1.2 | 0.40 | 0.15 |
| 68% | 143 | 0.432 | 0.68 | 0.29 | 0.082 | 0.038 | 0.015 | 0.0064 |
| \times 52.5 mb | | | 35 | 15 | 4.3 | 2.0 | 0.81 | 0.34 |
| 68% | 200 | 0.511 | 0.80 | 0.41 | 0.136 | 0.089 | 0.043 | 0.021 |
| \times 34.9 mb | | | 28 | 14 | 4.7 | 3.1 | 1.5 | 0.73 |
| 95% | 50 | 0.255 | 2.6 | 0.650 | 0.061 | 0.0103 | 0.0022 | 0.0012 |
| \times 183.6 mb | | | 470 | 120 | 11 | 1.9 | 0.40 | 0.23 |
| 95% | 96 | 0.354 | 3.5 | 1.25 | 0.115 | 0.027 | 0.0079 | 0.0027 |
| \times 84.8 mb | | | 300 | 110 | 9.8 | 2.3 | 0.67 | 0.23 |
| 95% | 143 | 0.432 | 4.3 | 1.87 | 0.21 | 0.072 | 0.026 | 0.010 |
| \times 52.5 mb | | | 230 | 98 | 11 | 3.8 | 1.4 | 0.53 |
| 95% | 200 | 0.511 | 5.1 | 2.6 | 0.35 | 0.17 | 0.071 | 0.033 |
| \times 34.9 mb | | | 180 | 91 | 12 | 5.9 | 2.5 | 1.1 |

TABLE VIII. DOB intervals for EKM σ_{np} with $R = 0.9$ fm using prior Set $A_{\epsilon}^{(1)}$.

large value, which is an artifact of the fitting procedure [\[44\]](#page-19-0). Note that this results in the omission of the DOB interval for N^4 LO at 50 MeV with Set $A_{0.5-2}$ as $\bar{c}_>$ is then less than $\bar{c}_{(k)}$, so the distribution is not defined in this case.

Overall, the prior sets A_{ϵ} and C_{ϵ} appear to be too conservative for predictions at LO; we know that A_ϵ and C_ϵ

have incorporated less information than the alternatives so it is no surprise that their posteriors are more widely distributed. Importantly, we find that the posteriors for Δ_k for $k \geq 2$ are largely insensitive to the choice of prior, even for the 95% DOB interval. As posteriors retain artifacts of the prior in inverse proportion to the strength of the data, this similarity suggests

TABLE IX. DOB intervals for EKM σ_{np} scaled by σ_{LO} with $R = 0.9$ fm. Results for prior Sets A_{ϵ}, B (with $\sigma = 1.0$), and C_{ϵ}, all without the leading-omitted-term approximation.

| | Set | $E_{\rm lab}$ | \mathcal{Q} | LO' | LO | NLO | N^2LO | N^3LO | N^4LO |
|-----|-----------------------|---------------|---------------|------|-------|-------|---------|---------|---------|
| | A_{ϵ} | | | 0.43 | 0.11 | 0.025 | 0.0055 | 0.0013 | 0.00080 |
| | \mathbf{C}_ϵ | 50 | 0.255 | 0.48 | 0.12 | 0.028 | 0.0053 | 0.0011 | 0.00056 |
| | $\, {\bf B}$ | | | 0.29 | 0.073 | 0.022 | 0.0052 | 0.0013 | 0.00076 |
| | A_{ϵ} | | | 0.59 | 0.21 | 0.048 | 0.015 | 0.0048 | 0.0018 |
| | \mathbf{C}_ϵ | 96 | 0.354 | 0.69 | 0.25 | 0.060 | 0.019 | 0.0058 | 0.0021 |
| 68% | $\, {\bf B}$ | | | 0.40 | 0.143 | 0.043 | 0.014 | 0.0047 | 0.0017 |
| | \mathbf{A}_ϵ | | | 0.74 | 0.32 | 0.089 | 0.040 | 0.016 | 0.0067 |
| | \mathbf{C}_ϵ | 143 | 0.432 | 0.87 | 0.38 | 0.088 | 0.043 | 0.015 | 0.0059 |
| | $\, {\bf B}$ | | | 0.51 | 0.22 | 0.080 | 0.038 | 0.016 | 0.0065 |
| | \mathbf{A}_ϵ | | | 0.91 | 0.46 | 0.15 | 0.097 | 0.046 | 0.022 |
| | \mathbf{C}_ϵ | 200 | 0.511 | 1.08 | 0.58 | 0.14 | 0.096 | 0.041 | 0.019 |
| | B | | | 0.63 | 0.32 | 0.14 | 0.091 | 0.044 | 0.022 |
| | \mathbf{A}_ϵ | | | 2.7 | 0.69 | 0.066 | 0.011 | 0.0023 | 0.0013 |
| | \mathbf{C}_ϵ | 50 | 0.255 | 3.3 | 0.85 | 0.089 | 0.014 | 0.0027 | 0.0013 |
| | B | | | 0.67 | 0.172 | 0.042 | 0.0091 | 0.0021 | 0.0012 |
| | \mathbf{A}_ϵ | | | 3.8 | 1.3 | 0.13 | 0.030 | 0.0088 | 0.0030 |
| | \mathbf{C}_ϵ | 96 | 0.354 | 4.8 | 1.7 | 0.20 | 0.050 | 0.0142 | 0.0049 |
| 95% | $\, {\bf B}$ | | | 0.97 | 0.34 | 0.088 | 0.026 | 0.0083 | 0.0029 |
| | \mathbf{A}_ϵ | | | 4.7 | 2.0 | 0.24 | 0.083 | 0.030 | 0.012 |
| | \mathbf{C}_ϵ | 143 | 0.432 | 6.0 | 2.6 | 0.29 | 0.114 | 0.038 | 0.014 |
| | $\, {\bf B}$ | | | 1.22 | 0.53 | 0.17 | 0.071 | 0.028 | 0.0115 |
| | \mathbf{A}_ϵ | | | 5.7 | 2.9 | 0.41 | 0.20 | 0.088 | 0.041 |
| | \mathbf{C}_ϵ | 200 | 0.511 | 7.4 | 3.8 | 0.47 | 0.26 | 0.100 | 0.043 |
| | B | | | 1.53 | 0.78 | 0.29 | 0.173 | 0.081 | 0.040 |
| | | | | | | | | | |

FIG. 8. (Color online) Cross sections at 50 and 96 MeV for all orders from EKM, with DOB intervals at each order using a wide variety of prior sets. Note the change in scale at each order. The thick error bars indicate 68% DOB intervals, while the thin error bars indicate 95% DOB intervals. In each panel the dashed line is the result of the next-order calculation (NLO at LO, N²LO at NLO, etc.), shown to facilitate an assessment of the statistical consistency of different prior choices. For each prior choice, the intervals on the left are from keeping only the first omitted term, while those on the right are including four omitted terms. The shaded bands indicate the uncertainty from EKM.

that the data is sufficiently informative that any reasonable prior is properly subservient and thus able to adapt to evidence of the real world presented by the data.

IV. CHOICE OF EXPANSION PARAMETER

In the previous section, the scale Λ_b in the expansion parameter was taken from Ref. [\[10\]](#page-18-0), where it was extracted from error plots after the fit of the LECs. This identification was certainly not rigorous in any statistical sense. Therefore, here we explore how Λ_b can be extracted from the convergence pattern of the EFT for observables.

In the case of pQCD, CH discussed using an expansion parameter that is different from α_s . They introduced a scale factor λ , so that the expansion is in powers of α_s/λ [\[6\]](#page-18-0). This changes the expressions for $pr(\Delta_k|c_0,\ldots,c_k)$ by a rescaling of the expansion parameter *Q* and a corresponding rescaling of the coefficients themselves. We can rewrite the series for an observable *X* in terms of the rescaled expansion parameter and coefficients as

$$
X = X_0 \sum_{n=0}^{\infty} (c_n \lambda^n) \times \left(\frac{Q}{\lambda}\right)^n.
$$
 (38)

In an EFT expansion this is equivalent to a rescaling of Λ_b by a factor *λ*.

Subsequent papers explored procedures for determining the value of *λ* based on various criteria:

- (i) In Refs. $[7,8]$, λ was chosen empirically by comparing the consistency of the computed DOB intervals with known higher-order calculations. An extra factor of $(n - 1)!$ was also introduced along with λ in Eq. (38) motivated by effects from renormalon chains at higher orders in the expansion. The authors denoted the resulting scheme CH. We have no evidence for such a factorial in our EFT expansions and do not consider it further here.
- (ii) In Ref. [\[45\]](#page-19-0), it was proposed that with the best expansion parameter, the coefficients should form a normal distribution of mean μ and standard deviation *σ*. This criterion was used to choose a value of *λ*. This approach is consistent with naturalness for the ${c_n}$, as long as μ and σ are both $\mathcal{O}(1)$.

Here we explore these procedures for tuning the expansion parameter in the EKM cross sections, and we also suggest another criterion for assessing *λ* based on the assumption of

FIG. 9. (Color online) Cross sections at 143 and 200 MeV for all orders from EKM, with DOB intervals at each order using a wide variety of sets. Note the change in scale at each order. The thick error bars indicate 68% DOB intervals while the thin error bars indicate 95% DOB intervals. In each panel the dashed line is the result of the next-order calculation (NLO at LO, N^2LO at NLO, etc.), shown to facilitate an assessment of the statistical consistency of different prior choices. For each prior choice, the intervals on the left are from keeping only the first omitted term while those on the right are including four omitted terms. The shaded bands indicate the uncertainty from EKM.

naturalness in the EFT expansion for a particular value of Λ_b . If a *λ* emerges from such analyses that is measurably different from 1, it suggests that the true breakdown scale of the EFT expansion is not Λ_b , but instead $\Lambda_b\lambda$. Given the limited number of coefficients (20 at most) at our disposal from the EKM analysis, any statistical procedure can only determine *λ*, and hence Λ_b , within sizable error bars. Our goal in this section is less to determine Λ_b than to establish whether the choice $\Lambda_b =$ 600 MeV is consistent with our other *a priori* assumptions and deductions about the convergence properties of the EFT.

A. Consistency checks based on higher-order calculations

In Refs. $[7,8]$ λ was determined by checking the consistency of CH DOB intervals obtained with expansion parameters α_s/λ in several large sets of pQCD observables. This is done by examining actual vs expected success rates of the pQCD calculations. As stated in Ref. [\[46\]](#page-19-0), "For a finite set of observables and a given model (with fixed parameters) at order *k*, the success rate is defined as the number of observables whose subsequent-order contributions are within the uncertainty interval predicted by the model."

We want to use the observed success rates $n(p)/N$ for our EFT calculation to infer the likelihood that *p* is the true success rate for many different choices of *p*. If each observable being considered is uncorrelated, the success rate should follow a binomial distribution. Therefore, the likelihood for *n* successes among *N* observables, given *p*, is

$$
pr(n|p,N) = \frac{N!}{n!(N-n)!}p^n(1-p)^{N-n}.
$$
 (39)

We generalize the pdf (39) to its continuous version, the *β*distribution,

$$
pr(a,b|p,N) = \frac{(a+b-1)!}{(a-1)!(b-1)!} p^{a-1} (1-p)^{b-1}, \quad (40)
$$

with $a = n + 1$ and $b = N - n + 1$. We can then compute confidence intervals (CIs) on *n* (or, equivalently *a*) for a given value of p (in practice we consider only the 68% and 95% CIs). This can be done using standard integrals, and the result expressed in terms of a range of success rates that are consistent with the chosen value of *p*.

As in Refs. $[7,8]$, we have calculations of the cross sections at several orders and energies and are trying to determine values of *λ* that result in consistency between assumed values of *p* and the resulting success rates *n*. To do this, we take the set of 16 observables we have from the EKM results: calculations at LO, NLO, N^2LO , N^3LO for four different laboratory energies. (Note that each observable must have a higher-order result to which it can be compared.) We then pick a value of λ and proceed to assess the consistency of the success rates of the theory predictions for that λ via this algorithm (adapted from pQCD to EFT for our purposes):

- (i) Select a grid of *p*% DOB intervals with *p* ranging from 0 to 100.
- (ii) Use the formalism laid out in Secs. Π and Π to compute the *p*% DOB interval for each observable in the set.
- (iii) For each next-order calculation that is within the DOB interval of the previous order, count one success.
- (iv) Take the number of successes and divide by the total number of observables to get the actual success rate.
- (v) Compare the actual success rate for this value of *p* with the 68% and 95% CIs for the number of successes if *p* were the true success rate, as computed from the distribution [\(40\)](#page-14-0).

This algorithm generates a function of *p* for this value of *λ*. If the curve is within the 68% CI for the entire range of *p* values, we say that the value of λ is consistent at 1σ with the performance of the perturbative series. Moderate fluctuations outside the 1*σ* band over limited regions of the entire *p* domain can indicate a statistically consistent choice for *λ*, but the concern is with curves that end up systematically outside the 1*σ* region. This can occur in one of two ways. If the curve starts to veer above the 1σ region, then that indicates the EFT predictions are *too* successful. The expansion parameter is overestimated, which means the EFT breakdown scale is underestimated. Alternatively, the function $n(p)/N$ may deviate well below the 68% CI, in which case the EFT is underperforming compared to statistical expectations. In that case the stated expansion parameter is too small; i.e., Λ_b is overestimated. We note that this interpretation is somewhat specific to EFT: In a case where we were confident of the expansion parameter in the series we could instead use this diagnostic to probe whether different prior choices are too conservative or too aggressive.

Here, though, we try to draw conclusions on the performance of the EFT expansion that are invariant under the choice of priors defined above. We thus implement this procedure for two different prior assumptions on \bar{c} and the coefficients ${c_n}$. In each case we use the approximation that the leading term dominates for computational ease. The curves do not change substantially if we go beyond the first-omitted-term approximation.

We first consider Set $A_{\epsilon}^{(1)}$. The results of computing $p\%$ success rates for various values of *λ* are shown by the lines in Fig. 10. We include 68% and 95% confidence bands to evaluate which *λ* curves meet our consistency criterion. With only 16 observables, the confidence bands are fairly wide, but still the only curve which falls completely within the 68% interval is $λ = 1.3$. The original expansion parameter at $λ = 1$ spends some time above the 1σ region, which may reflect that DOB intervals resulting from this prior are too conservative; i.e., the actual success rate regularly exceeds the DOB that has been

FIG. 10. (Color online) Empirical determination of *λ* by comparing results at different orders. The cross sections used are the computations with the $R = 0.9$ fm regulator. Priors are Set $A_{\epsilon}^{(1)}$. For full explanation, see text.

assigned. This is consistent with our earlier observation that Set A_{ϵ} priors produce overly conservative DOB intervals.

We also compute the intervals using Set $C_{\epsilon}^{(1)}$, which accounts for the effects of each coefficient and is less conservative. The results are contained in Fig. 11. We see that even for these assumptions, the $\lambda = 1$ curve gets outside the 1σ band. The plot suggests $\lambda = 1.1$ is a more consistent choice (other values near $\lambda = 1.1$ will, of course, also be consistent). Because the DOB intervals computed with Set $C_{\epsilon}^{(1)}$ priors are more informed by the available coefficients, this result may suggest that a small increase in the assigned breakdown scale is appropriate. However, we note the small amount of data on EFT convergence that is being used here; almost all rescalings considered are consistent at the 2σ level. Such determinations of Λ_b from success rates can be sharpened by considering the behavior of the EFT series for more observables.

FIG. 11. (Color online) Empirical determination of *λ* by comparing results at different orders. The cross sections used are the computations with the $R = 0.9$ fm regulator. Priors are Set $C_{\epsilon}^{(1)}$. For full explanation, see text.

B. Gaussian naturalness and the Forte method

In Ref. [\[45\]](#page-19-0), Forte *et al.* suggest that, for QCD expansions, the best λ is the one that makes all the expansion coefficients closest to the same size, which they interpret as a statement that the coefficients should be normally distributed around a single number *μ* with variance $σ²$ [\[45\]](#page-19-0). For a quantity for which the known information is a mean and standard deviation, in this case a particular coefficient c_n , the method of maximum entropy results in a distribution that is a Gaussian [\[20,22\]](#page-18-0):

$$
\text{pr}(c_n|\lambda,\mu,\sigma) = \frac{1}{\sqrt{2\pi}\sigma} \exp\left[-\frac{(|c_n|\lambda^n - \mu)^2}{2\sigma^2}\right].\tag{41}
$$

If we have several known coefficients, all of which are drawn from a distribution with the same mean and standard deviation, the joint pdf $pr(c_0, \ldots, c_k | \lambda, \mu, \sigma)$ becomes the standard likelihood function. If $\sigma = \bar{c}$ and $\mu = 0$ such a distribution corresponds to the Set C prior of Table [I.](#page-3-0)

Forte *et al.* consider the probability distribution for both *μ* and *λ* given a set of ${c_n}$ [\[45\]](#page-19-0). This can be obtained from Eq. (41) using Bayes' theorem:

$$
pr(\lambda, \mu|c_0, \ldots, c_k, \sigma) = \frac{pr(c_0, \ldots, c_k|\lambda, \mu, \sigma) pr(\lambda, \mu|\sigma)}{pr(c_0, \ldots, c_k|\sigma)}.
$$
\n(42)

Forte *et al.* assign no prior information to λ and μ other than that both are larger than zero, and neither quantity depends on σ *a priori*. They then take the prior and the evidence in the denominator to be an overall normalization factor that is independent of λ and μ and so do not calculate them explicitly (cf. discussion of a scale-invariant prior for *λ* below). The pdf for λ and μ can then be written

$$
\text{pr}(\lambda,\mu|c_0,\ldots,c_k,\sigma) \propto \text{pr}(c_0,\ldots,c_k|\lambda,\mu,\sigma),\tag{43}
$$

meaning that maximizing the probability of λ and μ is equivalent to minimizing

$$
\chi^{2} = \sum_{i=1}^{N_{0}} \sum_{n=0}^{k} \left(\frac{|c_{n}^{(i)}| \lambda^{n} - \mu}{\sigma} \right)^{2},
$$
 (44)

where $\{c_n^{(i)}\}$ is the set of EFT coefficients found for the *i*th observable, and N_O is the number of observables being used to form the χ^2 . In our case $N_Q = 4$: the cross sections at the four different energies analyzed by EKM.³ Note also that for chiral EFT for *NN* scattering the coefficient c_1 is known to be zero, and so the $n = 1$ term should be omitted from the sum.

The assumption that λ has a uniform prior is not consistent with arguments regarding the invariance of the pdf under a change of scale [\[23\]](#page-18-0). In fact, *λ* should be treated as a scale parameter. So, in contrast to Ref. $[45]$, we assign a uniform prior to the *logarithm* of *λ*, resulting in a probability distribution for *λ* and *μ* that is

$$
\text{pr}(\lambda,\mu|c_0,\ldots,c_k,\sigma) \propto \frac{1}{\lambda} \times e^{-\chi^2/2},\tag{45}
$$

with the parameter space for λ and μ restricted to both being positive. Assuming $\sigma = 1$, we find that the maximum of the probability (43) for the $R = 0.9$ fm EKM coefficients occurs at $λ = 0.92$, $μ = 0.69$. To consider the pdf of $λ$ only, we marginalize over the parameter μ and maximize $pr(\lambda|c_0, \ldots, c_k, \sigma)$ to find $\lambda = 1.01_{-0.19}^{+0.18}$, which is consistent with the Forte *et al.* hypothesis at a 68% DOB. Larger *σ*'s generate still wider ranges. From this point of view too, then, $\Lambda_b = 600$ MeV is a consistent choice for the $R = 0.9$ fm *np* scattering EFT-expansion coefficients.

C. *χ***² test**

Alternatively, we can demand that the mean of the c_n 's be fixed at $\mu = 0$ and that the width σ should affect the results as in Set C Gaussian pdfs on the coefficients, where \bar{c} is an important feature of the prior. This leaves us with the probability

$$
\text{pr}(\lambda, \mu = 0 | c_0, \dots, c_k, \sigma) \propto \frac{1}{\lambda} \exp\left[-\frac{\chi^2(\mu = 0)}{2}\right], \quad (46)
$$

where $\chi^2(\mu = 0)$ is given by Eq. (44) with $\mu = 0$.

We can then test whether, for a given λ , the data, i.e., the EKM coefficients from their $R = 0.9$ fm calculation, follow a normal distribution with mean zero and width *σ*. We do this by comparing $\chi^2(\mu = 0)$ with the way that χ^2 should be distributed for a normal distribution with 19 degrees of freedom. Once again, to do this we must fix *σ*. With the choice $\sigma = 1$ we find that $\lambda = 1.09$ gives χ^2 of 19—the central value one would expect for this many data points.4 Using the rule of thumb for large number of degrees of freedom, *N* [\[47\]](#page-19-0), that the χ^2 should have a width of $\sqrt{2N}$ indicates that λ could (68% DOB) be anywhere between 1.01 and 1.15. As in the previous section, choices of $\sigma > 1$ will increase this range of possibilities.

D. Summary of expansion-parameter checks

In any case, while none of these methods provides a crisp result for Λ_b from the 19 data points analyzed, it is reassuring that there is little evidence for a large change in Λ_b . Minimally, EKM's estimate $\Lambda_b \approx 600$ MeV for their $R = 0.9$ fm calculation is consistent with these analyses, and the breakdown scale may, in fact, be a little higher. Further investigations employing these techniques with EFT coefficients drawn from many more observables will provide more definitive answers.

V. SUMMARY AND OUTLOOK

We have adapted and extended the Bayesian framework originally introduced in the context of pQCD by CH [\[6\]](#page-18-0) to evaluate truncation errors in EFT expansions. Assumptions about the nature of the coefficients in the expansion are encoded as priors on the coefficients of higher-order terms in the

³In general, there would be $N_0 n_c$ terms in the χ^2 sum, but we omit the N4LO coefficient from the 50-MeV cross section, because it is clearly an outlier. Our χ^2 thus has 19 terms in the sum.

 4 Including the N 4 LO coefficient from the 50-MeV cross section lowers the results for *λ* by about 10%.

EFT series. The pdfs for these coefficients then ultimately also include information on the distribution of coefficients at orders that are calculated. Here we employed priors derived from the notion of "naturalness" of EFT coefficients, i.e., the idea that they should be $\mathcal{O}(1)$ when the observable and the momentum of the process in question are measured in appropriate units. We took the coefficients in the EFT expansion of cross sections to be natural in this sense. Such a choice is uncontroversial for perturbative processes, e.g., meson-meson scattering at momenta well below the chiral-symmetry-breaking scale. It remains to be fully investigated for cross sections in *NN* scattering, where the relationship between the underlying scales and observables is quite complex; we rely here on an empirical validation (see Fig. [5\)](#page-11-0).

We investigated the influence of two prior pdfs for EFT coefficients on the truncation errors. The first was the CH characterization of an upper bound \bar{c} ; the second was a Gaussian of width \bar{c} . We also investigated the influence of priors on \bar{c} itself on the results. We did this in the context of representative examples in Sec. [II](#page-1-0) and, in Sec. [III,](#page-7-0) using results from the order-by-order calculations of neutron-proton cross sections by EKM in Ref. [\[11\]](#page-18-0) (obtained with a regulator parameter $R = 0.9$ fm). Combining the insights from both sections we find the following:

- (i) Priors that reflect a natural size for \bar{c} give similar DOB intervals at the lowest orders.
- (ii) The resulting error bands are tighter than those for which the scale of \bar{c} is not constrained.
- (iii) For higher orders, 68% DOB intervals show little dependence on prior choice; 95% DOB intervals have larger, but still quite small, dependence.

These results have wide applicability to observables; they can be used in many EFT contexts. In the case of neutron-proton scattering our formulas provide a statistical interpretation to error bars obtained by EKM in Ref. [\[10\]](#page-18-0). Their error bar is obtained in the case that the distribution of coefficients is uniform, in which case it is a $j/(j + 1)$ 1) ∗ 100% DOB interval for the omitted terms in a N*^j*LO calculation. However, as already stated, truncation errors in these calculations at NLO or beyond (i.e., which include at least two orders beyond leading) were only mildly dependent on prior choice. In particular, the 68% DOB intervals obtained in our Bayesian framework varied by at most 15% among all the priors considered here, and the variation was less than that in calculations beyond NLO. Error bands at a given order were also consistent with a statistical interpretation when compared with known higher-order results. Truncation errors at leading order *are* sensitive to prior choice, because–given the choice of scaling observable we made—almost no information on the pattern of coefficients emerges from a leading-order calculation. Comparison of the resulting error band with the known results of NLO, N^2LO , N^3LO , and N^4LO calculations suggests that the CH choice of a *θ*-function distribution for coefficients, and a scale-independent distribution for the width of that θ function, is too conservative, at least for this case. Overall, then, at sufficiently high order, the prior picked from Table [I](#page-3-0) hardly matters; in practice $k = 2$ may be enough.

At lower orders priors provide a rigorous way to explore different assumptions about the pattern of coefficients in the EFT.

Indeed, the application of Bayesian methods to data is often criticized because of the apparently subjective selection of prior pdfs. However, the priors manifest what would otherwise be implicit assumptions, so that they can be tested. The information encoded in those assumptions is then modified in light of subsequent data: In this case the distribution of low-order coefficients influences the distributions computed for coefficients that enter the assessment of the truncation error. Furthermore, the development of specific pdfs for those higher-order coefficients allows a statistical interpretation of the "theory error"—or at least the part of it that results from the truncation of the EFT series. This allows crisp answers to questions regarding, for example, how theory error bars should be combined, or the extent to which theory errors on different quantities are correlated. Those answers may have some sensitivity to the choice of prior on the higher-order coefficients, but the advantage of the Bayesian framework is that the consequences of prior assumptions about the distribution of coefficients (uniformly distributed or Gaussian, natural or scaleless) can be traced through to the statistical uncertainties on the EFT calculation. Those assumptions can then—if necessary—be refined.

Such refinement may be necessary in light of the need to identify an EFT breakdown scale before extracting the (supposedly) $\mathcal{O}(1)$ coefficients which are input to our analysis. Misidentification of the breakdown scale is one manner in which a particular prior could fail. But, in this case, we showed in Sec. [IV](#page-13-0) that this breakdown scale $\Lambda_b = 600$ MeV leads to success rates taken from the EFT predictions at four different energies, and for four different orders, that are statistically consistent with the DOB intervals resulting from our Bayesian formalism. Furthermore, the distribution of coefficients with the $R = 0.9$ fm regulator choice is consistent with a Gaussian distribution. Qualitatively, a natural distribution is not seen for the coefficients obtained using a second, larger, value of *R*. The calculation at this larger regulator radius reflects cutoff artifacts, which lead to peculiar convergence of the EFT expansion. The breakdown of the EFT is then not set by Λ_b , but by the effects of this softer cutoff. With the general formalism for probability distributions of EFT coefficients laid out here, it will be important to check when the EFT coefficients obtained over a wide range of cutoff values and observables are empirically consistent with the application of naturalness priors to observables in the *NN* system.

The Bayesian approach to error estimation presented here is an alternative to procedures that calculate error bands based on variation of the EFT regulator, which could be a cutoff in either momentum or coordinate space. While variation with regulator scale gives a lower bound on the uncertainty (theories should, after all, be regulator invariant up to higher-order terms), the resulting error band has no statistical interpretation. A particular flaw is the arbitrariness of the interval in which the cutoff is varied; for QCD this is only of mild concern, because the dependence on the regulator parameter is only logarithmic. However, running in the chiral EFT applied to *NN* scattering is much faster: It can contain high positive powers of the regulator (momentum) scale. This concern is exacerbated by the narrow range that is possible before encountering irremediable cutoff artifacts or spurious deep bound states. It is also the case that residual cutoff dependence only reflects the contribution from omitted contact operators. These only enter the chiral expansion for *NN* observables at even orders, and so examination of cutoff dependence alone may substantially underestimate the EFT truncation error. More generally, when computed using only cutoff variation, the error bands for predictions of observables (as opposed to quantities used to fit EFT LECs) generically exhibit undesirable systematics (e.g., sometimes growing wider with order) and often underestimate the error when compared with actual higher-order calculations [4]. In contrast, the Bayesian assessment of truncation errors laid out here is applicable to all EFTs, admits a statistical interpretation of truncation errors, is justified when regulator parameters cannot be varied widely, and predicts decreased errors at *all* orders, not just when new LECs are added.

The truncation-error assessment described here is just one piece of a broader framework for EFT UQ using Bayesian methods. We have under development analogous procedures, together with a suite of diagnostic tools, for parameter estimation and the assessment and propagation of errors both statistical and truncation—in fitted LECs and predicted observables. Bayesian model selection is also well suited for addressing fundamental questions in nuclear EFT, such as the comparative efficacy of theories with different degrees of freedom, from pionless to chiral EFTs with and without an explicit $\Delta(1232)$.

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