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Uncertainties in Pion and Kaon Fragmentation Functions

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We present a detailed assessment of uncertainties in parton-to-pion and parton-to-kaon fragmentation functions obtained in recent global QCD analyses of single-inclusive hadron production data at next-to-leading order accuracy. We use the robust Lagrange multiplier approach for determining uncertainties to validate the applicability of the simpler but approximate Hessian method. Extensive comparisons of the results obtained within both methods are presented for the individual parton-to-pion and kaon fragmentation functions. We provide Hessian eigenvector sets of pion and kaon fragmentation functions that allow one to easily propagate their uncertainties to any observable. Various applications of these sets are presented for pion and kaon production in electron-positron annihilation, lepton-nucleon scattering, and proton-proton collisions.

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I. INTRODUCTION AND MOTIVATION

Fragmentation functions (FFs) contain vital non-perturbative information required to describe a great variety of hard scattering processes with a given identified hadron in the final-state within the framework of perturbative Quantum Chromodynamics (pQCD). The enhanced sensitivity of such less inclusive probes to crucial features of the partonic structure of hadrons, including its flavor content, dependence on spin [1, 2], or possible nuclear modifications [3, 4], combined with ever growing experimental precision, opens up novel opportunities for phenomenological QCD studies with an accuracy hitherto reserved to fully inclusive measurements. In this context, the availability of reliable sets of parton-to-hadron FFs, as well as accurate estimates of their uncertainties, is of the utmost relevance.

The extraction of FFs from data, originally restricted to single-inclusive electron-positron annihilation (SIA) [5–8], has evolved in recent years into truly global QCD analyses encompassing data obtained in hadron-hadron collisions [9–11] as well as hadron multiplicities in semi-inclusive deep-inelastic scattering (SIDIS) [9]. Only the combined analysis of the large body of existing data taken in different processes and for different hadron species allows for a consistent determination of all aspects of hadronization such as fully charge and flavor separated parton-to-hadron FFs. A global fit also constitutes an explicit check of the assumed underlying factorizability and universality of FFs in hard processes, which is the foundation of the predictive power of pQCD.

As is the case with parton distribution functions (PDFs) [12], the assessment of uncertainties for FFs obtained in global QCD analyses is far from being straightforward. Such studies incorporate data from many different experiments with diverse characteristics and errors. The data are in turn confronted with theoretical estimates whose inherent uncertainties are notoriously difficult to quantify, because, in addition to the truncation of the perturbative expansion at a given order of pQCD, there are also unavoidable approximations and assumptions involved. The latter comprise the choice of the functional form used to parametrize FFs [13] (or PDFs [14]) at some low input scale $Q_0 \approx 1$ GeV, the value of the strong coupling at some reference scale, the selection of and cuts applied to the data sets used in the fit, or the treatment of heavy flavors in the scale evolution and the calculation of observables.

In recent years, significant progress has been made in putting forward, exploring, validating, and comparing different strategies to estimate uncertainties in global QCD analyses of PDFs. Among the various approaches, the robust Lagrange Multiplier (LM) technique [15] directly relates the variation of the parameters determined in the fit or, more generally, of any observable computed with them, to the variation of the $\chi^2$ function that quantifies the goodness of the fit to data. While this avoids any approximations or assumptions about the dependence of the $\chi^2$ hypersurface on the parameters used to

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describe the PDFs or how to propagate uncertainties to a given observable, it requires an extensive amount of \( \chi^2 \) minimizations involving all data sets included in the fit. The computationally less demanding “Improved (iterative) Hessian” (IH) approach [16] assumes a quadratic behavior of the \( \chi^2 \) hypersurface on the parameter displacements and represents the \( \chi^2 \) increment from its minimum value in terms of combinations of the fit parameters that maximize the variation. Within this eigenvector representation of the Hessian matrix, and assuming a linear propagation of errors, the uncertainty of any observable can be straightforwardly estimated from a set of pre-calculated fits corresponding to fixed displacements along the eigenvector directions. Another approach is based on analyzing a large amount of replicas of the original data sets with neural networks [17]. While this has the drawback of defining the central fit only as the statistical average of the drawback of defining the central fit only as the statistical average of \( \mathcal{O}(100) \) PDF fits, it is largely free of the bias from assuming a certain functional form for the PDFs at scale \( Q_0 \).

Corresponding studies of uncertainties in parton-to-hadron FFs are scarce despite the large body of available data. An analysis based solely on SIA data, which do not allow for a full charge and flavor separation of FFs, was presented in Ref. [8] using the Hessian method but without validating its applicability. The so far most comprehensive analysis based on data from SIA, SIDIS, and hadronic collisions was presented in Refs. [9, 10], henceforth referred to as DSS FFs. However, uncertainties of the extracted FFs were only assessed qualitatively for certain truncated moments within the fit.

In the following, we will extend the DSS analysis by performing a detailed assessment of the uncertainties in pion and kaon FFs based on the IH method. We closely follow the DSS framework [9] and adopt the same functional form to parametrize the FFs at the initial scale \( Q_0 = 1 \) GeV and the same selection of data sets. These include data from electron-positron annihilation into hadrons obtained at CERN-LEP and SLAC [18], semi-inclusive deep inelastic lepton-nucleon scattering measured by HERMES-DESY [19], and hadroproduction in proton-proton collisions from RHIC [20]. In general, we find good agreement with the results obtained with the robust LM technique but notice that for the same nominal tolerance criterion, i.e., increase in \( \chi^2 \), the IH method typically leads to somewhat smaller uncertainty estimates. We devise a recipe to account for these small differences and provide sets of Hessian eigenvectors to facilitate the propagation of uncertainties to arbitrary observables. We believe that such an analysis is particularly timely and useful in view of the wealth of upcoming or new precise data on identified hadron yields in SIA from \( B \) factories [21], SIDIS [22], and hadron-hadron collisions both at RHIC [23] and the LHC [24]. The results of our analysis will help to quantify the impact of these data sets, identify possible tensions with the DSS analysis, and will serve as the baseline result for an anticipated update of the DSS sets of pion and kaon FFs.

The remainder of the paper is organized as follows: in the next Section we briefly recall the main aspects of the DSS analysis and the IH method, study in detail the uncertainties of parton-to-pion FFs in IH approach, and compare to the results obtained with the LM technique. Hessian eigenvector sets of pion FFs are provided and applied to calculations of pion yields in SIA, SIDIS, and hadron-hadron collisions. Section III is devoted to a similar study for kaon FFs. We briefly summarize the main results in Sec. IV.

II. PION FRAGMENTATION FUNCTIONS

A. Preliminaries

Since both the framework and methodology for the extraction of FFs in global QCD analyses at next-to-leading order (NLO) accuracy as well as the implementation of the IH and LM techniques have already been explained in quite some depth in the literature [9, 15, 16], we will only briefly recall the main concepts and results relevant for our studies.

As was mentioned in the Introduction, we choose the DSS NLO analysis of pion and kaon FF [9] and their error estimates based on the LM method as our baseline fit. We adopt the same selection of data sets used in the DSS fit and the same flexible functional form

\[
D_i^H(z, Q_0) = \frac{N_i z^{\alpha_i}(1-z)^{\beta_i} [1 + \gamma_i (1-z)^{\delta_i}]}{B[2 + \alpha_i, \beta_i + 1] + \gamma_i B[2 + \alpha_i, \beta_i + \delta_i + 1]},
\]

(1)

to parametrize the hadronization of a parton \( i \) into a hadron \( H \) at the initial scale \( Q_0 = 1 \) GeV. \( z \) denotes the fraction of the parton’s momentum taken by the observed hadron, and \( B[a, b] \) represents the Euler Beta-function. The \( N_i \) in (1) are normalized such to represent the contribution of \( D_i^H \) to the momentum sum rule

\[
\sum_H \int_0^1 dz z D_i^H(z, Q^2) = 1.
\]

(2)

Since presently available data do not constrain all free parameters in (1) for each parton \( i \) equally well, certain relations upon the individual FFs had to be imposed in the DSS analysis [9] without jeopardizing the quality of the fit. Apart from assuming isospin symmetry for the unfavored sea quark FFs, i.e., \( D_{u}^{\pi^+} = D_{d}^{\pi^+} \), the total \( u \)-quark \( D_{u+\bar{u}}^{\pi^+} \) and \( d \)-quark \( D_{d+\bar{d}}^{\pi^+} \) FFs are only allowed to differ in normalization \( N \), and the strange quark FFs \( D_{s}^{\pi^+} = D_{\bar{s}}^{\pi^+} \) are related to the sea quark FFs through another normalization factor \( N' \). The corresponding FFs for negatively charged pions are obtained by charge conjugation invariance and those for neutral pions by assuming \( D_{i}^{\pi^0} = [D_{i}^{\pi^+} + D_{i}^{\pi^-}]/2 \).

The remaining 23 free parameters \( \{a_i\} \) describing the DSS FFs for quarks and gluons into positively charged
pions, $D_{1}^\pm$, are then determined by a standard $\chi^2$ minimization. Since the full error correlation matrices are not available for most of the data sets used in the fit, statistical and systematical errors are usually added in quadrature [5–9]. As in the DSS analysis, we allow each data set to float within the quoted experimental normalization uncertainty by introducing a set of 7 extra parameters to the fit, namely \{N_{ALEPH}, N_{SLED}, N_{HERMES}, N_{STAR}, N_{OPAL}, N_{PHENIX}, N_{OPAL}\}.

It suffices to say that we fully reproduce the set of optimum parameters $\{a_{i}^{0}\}$ of the DSS analysis [9], corresponding to the minimum in the $\chi^2$ profile. To explore their uncertainties with the IH approach [16] we express the Hessian matrix

$$H_{ij} \equiv \frac{1}{2} \frac{\partial^2 \chi^2}{\partial y_i \partial y_j} \bigg|_{0},$$

where the derivatives are taken at the minimum, in terms of its $N_{\text{par}}$ eigenvectors $v_{i}^{(k)}$, associated to eigenvalues $\epsilon_{k}$. The displacements $y_{i} \equiv a_{i} - a_{i}^{0}$ in Eq. (3) and the increase in $\chi^2$

$$\Delta \chi^2 = \chi^2(\{a_{i}\}) - \chi^2(\{a_{i}^{0}\}) = \sum_{ij} H_{ij} y_{i} y_{j}$$

are then replaced by a new set of parameters $\{z_{i}\}$ defined by [16]

$$y_{i} \equiv \sum_{j} v_{i}^{(j)} s_{j} z_{j}. \quad (5)$$

The factors $s_{j} \propto \sqrt{1/\epsilon_{j}}$ are used to rescale the $\{z_{i}\}$ such that the distance from the $\chi^2$ minimum is simply given by

$$\Delta \chi^2 = \sum_{i} z_{i}^{2}. \quad (6)$$

The $\chi^2$ function changes rapidly for directions corresponding to large eigenvalues $\epsilon_{k}$ of the Hessian matrix while small eigenvalues belong to directions where the fit parameters are only weakly constrained.

What makes the eigenvector representation $\{z_{i}\}$ particularly useful and convenient is the possibility to construct $2N_{\text{par}}$ basis sets $S_{k}^{\pm}$ of FFs which greatly facilitate the propagation of their uncertainties to arbitrary observables $O$. An estimate of the error $\Delta O$ away from its best fit estimate $O(S^{0})$ is obtained by computing [16]

$$\Delta O = \frac{1}{2} \left[ \sum_{k=1}^{N_{\text{par}}} [O(S_{k}^{+}) - O(S_{k}^{-})]^2 \right]^{1/2}. \quad (7)$$

The eigenvector sets $S_{k}^{\pm}$ are defined by choosing the amount $T = \sqrt{\Delta \chi^2}$ still tolerated for an acceptable global fit and correspond to positive and negative displacements by $T$ along each of the eigenvector directions

$$z_{i}(S_{k}^{\pm}) = \pm T \delta_{ik}. \quad (8)$$

We will extensively use the obtained basis sets $S_{k}^{\pm}$ and Eq. (7) in the remainder of the paper to propagate uncertainties of FFs to several observables.

### B. Results

![FIG. 1: Correlations between the fit parameters $\{a_{i}\}$ and the eigenvector directions $\{z_{i}\}$. The larger the box size the larger the overlap, see text.](image)

First, before making use of the eigenvector sets, we need to validate the Hessian method as a reliable tool to determine uncertainties of pion FFs. Figure 1 shows the overlap of each of the original fit parameters $\{a_{i}\}$ in Eq. (1) with the eigenvector directions $\{z_{i}\}$ introduced in Sec. II A. The larger the box size the larger the contribution of a certain eigenvector direction to a fit parameter $a_{i}$. The $\{z_{i}\}$ in Fig. 1 are ordered in terms of the size of the corresponding eigenvalues of the Hessian matrix: $z_{1}$ corresponds to the largest eigenvalue, i.e., the direction in parameter space where $\chi^2$ changes most rapidly, whereas $z_{30}$ is only very weakly constrained by data. One can see that in most cases there is a fairly strong correlation between a given original fit parameter $a_{i}$ and a single eigenvector direction $z_{j}$. The opposite case, when several fit parameters are strongly correlated with an eigenvector direction, implies that those fit parameters are mutually correlated cannot be constrained independently.

As can be inferred from Fig. 1, the relative normalizations applied to data sets in the fit, \{N_{ALEPH}, N_{SLED}, N_{HERMES}, N_{STAR}, N_{OPAL}, N_{PHENIX}, N_{OPAL}\}, are among the best constrained parameters as they are typically linked to only a very small number of eigenvector directions, all corresponding to large eigenvalues. The range of variation of these parameters is governed by the normalization uncertainty quoted by each of the experiments.
and their main role is to ease possible tensions among the data sets in the fit.

Here, we vary only one of the parameters \( z_i \) at a time such that a given change of \( \Delta \chi^2 = T^2 \) is produced. Of course, since each \( z_i \) has in principle overlap with all fit parameters \( \{ a_i \} \), the latter all vary in this procedure. For a truly quadratic behavior near the minimum, as is the underlying assumption in the Hessian approach, the quantity \( T^2 - \Delta \chi^2 \) vanishes, where \( \Delta \chi^2 \) is the change in \( \chi^2 \) induced by the variation of the parameter \( z_i \). Any deviation from zero will signal a departure from the expected parabolic dependence.

As can be seen, for all the parameters \( z_i \) shown in Fig. 2 the choice \( T = 1 \), i.e., \( \Delta \chi^2 = 1 \), works very well, leading only to fairly small deviations from zero. This implies that Hessian method is reliable for \( \Delta \chi^2 = 1 \), and our eigenvector sets \( S_{\chi}^2 \) are expected to produce faithful uncertainty estimates close to those obtained with the robust LM approach. For some of the eigenvector directions \( z_i \), those strongly constrained by data and corresponding to large eigenvalues of the Hessian matrix, the quadratic behavior persists even far away from the \( \chi^2 \) minimum, i.e., up to large values of \( T \). Examples are \( z_3 \) and \( z_6 \), which are mainly correlated with the normalizations \( N_{u+\bar u} \) and \( N_{c+\bar c} \) of the total up and charm quark FFs, respectively. Some eigenvector directions, like, for instance, \( z_{19} \), according to Fig. 1 mainly related to the small \( z \) exponent \( \alpha_u \) of the anti-up-quark FF, and \( z_{18} \), controlling the large \( z \) behavior of the total charm quark FF through \( \beta_{c+\bar c} \), do show a more pronounced departure from the ideal parabolic behavior starting already at about \( T^2 \approx 5 \). Not surprisingly, deviations are most pronounced for poorly constrained parameters such as \( z_{25} \) and \( z_{30} \) mainly correlated with the dependence of total up quark and gluon FFs at intermediate values of \( z \) as described by \( \delta_{u+\bar u} \) and \( \gamma_g \), respectively.

The deviations from the assumed quadratic behavior observed above are also reflected in the actual \( \chi^2 \) profiles for the fit parameters mainly associated with the eigenvector directions \( z_i \) shown in Fig. 2. They are readily computed within the LM technique and displayed in Fig. 3. Clearly, while for some of the parameters the profiles are reasonably smooth and parabolic, as is assumed in the Hessian method, in general they are not. The profiles can exhibit asymmetric shapes, almost flat regions, and perhaps even multiple minima. It is worth pointing out that in case of the DSS fit [9] none of these features is related to a lack of flexibility in the chosen functional form, Eq. (1). For instance, tensions among different data sets cause the asymmetry in the \( \chi^2 \) profile for \( \alpha_{\pi} \), and the flat part in the profile for \( \gamma_g \) is caused by insufficient constraints from data in some kinematic regions.

At this point it is important to check whether the IH approach yields meaningful uncertainty estimates for observables, despite the deviations from the assumed quadratic dependence of \( \chi^2 \) on the parameters, illustrated in Figs. 2 and 3. In the DSS analysis [9], truncated second moments of the FFs were identified as representative indicators of the typical uncertainties in the fit, and

\[ D_{\chi}^H(Q^2) = \int_0^1 z D_{\chi}^H(z, Q^2) dz, \]  

where \( D_{\chi}^H(z, Q^2) \) is the effective form factor for the process in question.
their variations were studied within the LM framework. They are defined in complete analogy to Eq. (2) by introducing a lower cut-off $z_{\text{min}}$ to the range of integration:

$$
\eta^H_i(z_{\text{min}}, Q^2) \equiv \int_{z_{\text{min}}}^{1} z D^H_i(z, Q^2) dz . \tag{10}
$$

To avoid the kinematic region of small $z$ where mass effects, neglected in FFs, become relevant, $z_{\text{min}} = 0.2$ was chosen in [9]. We note that the picture arising from the DSS analysis of the truncated second moments $\eta^H_i(z_{\text{min}}, Q^2)$ [9] was recently shown to agree well with explicit calculations of uncertainties in hadron production cross sections at LHC kinematics based on the robust LM method [25].

In Figure 4 we show the $\chi^2$-profiles (solid lines) for the truncated second moments $\eta^H_i$ of the DSS pion FFs at NLO accuracy at $Q = 5$ GeV and for selected parton flavors $i = \{u + \bar{u}, g, c + \bar{c}\}$ as obtained with the LM technique. The moments are normalized to the value $\eta_0$ they take for the optimum fit to data, characterized by the set of parameters $\{a_i^0\}$. From the width of the curves at a given value of $\Delta \chi^2$, one can read off the uncertainties on the various $\eta_i/\eta_0$, which can be in general asymmetric with respect to the best fit, i.e., $\eta_i/\eta_0 = 1$.

In the DSS analysis of pion and kaon FFs [9], a typical tolerance of $\Delta \chi^2/\chi^2 = 2\%$ was regarded as a faithful measure of uncertainties, which amounts to an increase in the total $\chi^2$ of the fit to pion data by about 17 units as is indicated by the horizontal lines in Fig. 4 labeled as “LM 2%”. It is important to recall that this tolerance criterion is not derived from any theoretical argument but is an empirical estimate by requiring that all data sets included in the global fit are still adequately described. Such kind of choices at various levels of sophistication are typically made also in global QCD analyses of polarized and unpolarized parton densities, see, e.g., [1, 12]. The naive criterion $\Delta \chi^2 = 1$ is usually regarded as too small to reliably account for PDF or FF uncertainties due to the complex nature of global fits, the different characteristics of the data sets, and various, often unaccounted sources of non-Gaussian theoretical errors. As can be inferred from Fig. 4, variations of the truncated second moments are typically found to be of the order of $2 \div 3\%$, 5%, and around 10% for the $u + \bar{u}$, gluon, and $c + \bar{c}$ to pion FFs.

Also in Fig. 4, the horizontal lines labeled as “IH 2%” and “IH 5%” represent the same uncertainties as obtained with the LM method above but now are estimated within the IH framework for two different tolerances (2 and 5 percent increase in the total $\chi^2$ of the fit, respectively). Clearly, the 2% criterion systematically underestimates the uncertainties found in the robust LM approach. Not surprisingly, the differences have their origin in the assumed quadratic behavior of the $\chi^2$ profile away from its minimum, which, in general, is not fully adequate as we have already demonstrated above in Fig. 2.

Since the discrepancies between the LM and IH estimates based on $\Delta \chi^2/\chi^2 = 2\%$ are not large enough to completely invalidate the Hessian method, we devise a simple recipe to remedy its shortcomings in practical applications based on pion FFs. We observe, that the IH method reproduces the LM results obtained for $\Delta \chi^2/\chi^2 = 2\%$ much better if one allows for a larger tolerance of 5%, as is indicated by the horizontal lines for “IH 5%” in Fig. 4. Hence, we propose to use preferably the IH method with $\Delta \chi^2/\chi^2 = 5\%$ to closely match the uncertainty estimates for pion FFs advocated in the DSS analysis [9] and provide relevant Hessian eigenvector basis sets $S_k^H$ for both a $\Delta \chi^2/\chi^2$ of 2% and 5% [26].

As an application and also to further verify the usefulness of the IH method, we calculate uncertainty estimates for various representative data sets used in the DSS analysis of pion FFs. To propagate the uncertainties of the FFs to pion production cross sections we use Eq. (7) throughout. Figure 5 illustrates the agreement between preliminary data for charged pion multiplicities [19] in SIDIS and the corresponding results of the DSS fit at NLO accuracy [9] in various bins of $z$. The results are
FIG. 4: Comparison of the uncertainties for selected truncated moments $\eta^i_0$ of the DSS pion FFs (indicated by the horizontal bars) estimated with the LM and IH methods at $Q = 5$ GeV; see text.

FIG. 5: **left:** comparison of the NLO DSS results for charged pion multiplicities in SIDIS with preliminary data [19] as a function of $Q^2$ in various bins of $z$. **right:** “(data-theory)/theory” for the DSS results; open and full circles denote $\pi^+$ and $\pi^−$ multiplicities, respectively. For all panels, the light and dark shaded bands indicate uncertainty estimates for $\Delta \chi^2/\chi^2 = 2\%$ and 5\%, respectively, based on our Hessian eigenvector sets and using Eq. (7).

largely independent of the choice of PDFs. The multiplicity data are instrumental in providing flavor and charge separated quark-to-pion fragmentation functions. We notice that the differences between uncertainties obtained with the 2\% and 5\% Hessian sets are less pronounced than in Fig. 4, suggesting that the 2\% variations already account for most of the error in the kinematic region probed by the multiplicity data.

Similar comparisons for single-inclusive pion production in SIA and $pp$ collisions at BNL-RHIC are shown in Fig. 6. Data are taken from [18] and [20], respectively. Again, the differences between the uncertainty estimates obtained with the 2\% and 5\% Hessian eigenvector sets are minimal, except for regions sensitive to large momentum fractions, $z \gtrsim 0.6$, where experimental constraints become very scarce. In these regions, uncertainties are severely underestimated and not trustworthy. In case of $pp$ collisions (right-hand-side of Fig. 6), we include for
FIG. 6: Uncertainty estimates for single-inclusive pion production in SIA [18] (left) and in pp collisions at 200 GeV and mid-rapidity [20] (right). The light and dark shaded bands indicate the results for $\Delta \chi^2/\chi^2 = 2\%$ and $5\%$, respectively, based on our Hessian eigenvector sets and using Eq. (7). For $pp \rightarrow \pi^0 X$, we also show the theoretical scale ambiguity (outermost bands).

FIG. 7: Uncertainty bands for the DSS pion FFs estimated with the IH and LM methods at $Q^2 = 10\text{ GeV}^2$ and $Q^2 = M^2_Z$. Comparison an estimate of the theoretical ambiguity due to the choice of the factorization scale in the NLO calculation [27] which is much more significant than errors on FFs (or PDFs as was shown in Ref. [25]).

A common feature of the results shown in Figs. 5 and 6 is that the estimates of the relative uncertainties due to FFs remain almost constant in a wide range of hadron momentum fractions $z$ and energy scale $\mu$ set by the photon virtuality $Q$ in case of SIA or SIDIS or the transverse momentum $p_T$ in pp collisions. As expected, the obtained
uncertainty bands cover and reflect the typical range of the statistical errors of the fitted data relative to the best fit prediction. We note that results very similar to those shown in Figs. 5 and 6 have been obtained for other observables depending on pion FFs.

Finally, we address the uncertainty estimates on the individual parton-to-pion FFs. Figure 7 shows the NLO DSS $zD_\gamma^+(z,Q^2)$ for $i = u + \bar{u}$, $\bar{s} + s$, $g$, $c + \bar{c}$, and $b + \bar{b}$ for two different scales $Q^2 = 10$ GeV$^2$ and $Q^2 = M_f^2$ along with our estimates of their uncertainties using both the IH and LM method. For better visibility and to facilitate comparisons between the different FFs, the lower panels for each flavor show the relative uncertainties which are typically of the order of $5\%$ for the favored quark combination $u + \bar{u}$ and around $10\%$ for unfavored quark-to-pion and gluon FFs, fairly independent of the scale $Q$. Uncertainties increase significantly for large momentum fractions, $z \gtrsim 0.6$, where current experimental constraints are insufficient.

In the DSS analysis [9], the fragmentation of charm and bottom quarks into charged pions is included discontinuously as massless partons in the scale evolution above their $\overline{MS}$ “thresholds”, $Q = m_{c,b}$, with $m_{c,b}$ denoting the mass of the charm and bottom quark, respectively. This simplified treatment of heavy flavors is at variance with current PDF fits [12, 14], where very elaborate schemes have been developed to properly include mass effects near threshold and to resum potentially large logarithms for $Q^2 \gg m_{c,b}^2$. Only flavor-tagged SIA data constrain the charm and bottom FFs in the DSS analysis, and their uncertainties, albeit reasonably small, should be taken with a grain of salt.

Concerning the comparison between the two methods to obtain our uncertainty estimates, we find good agreement if the IH eigenvector sets with the $5\%$ tolerance criterion for $\Delta \chi^2/\chi^2$ are used. Only for $z \lesssim 0.3$ and unfavored, i.e., less well constrained FFs, the LM method yields somewhat larger uncertainties compared to the corresponding bands obtained with the IH technique as can be seen, for instance, in the panels showing the $\bar{u}$, $s + \bar{s}$, and the gluon FFs.

While the robust LM method is straightforwardly applied to cross sections or truncated moments of FFs, it is not very handy in determining the $z$ dependent uncertainties. One can make use, for instance, of the profiles shown in Fig. 3 for the variations of each fit parameter $\{a_i\}$ to compute the spread in the FFs for each parton flavor $i$. In doing so, one neglects, however, correlations among the variations of the fit parameters, which can be non-negligible as we have demonstrated in Fig. 1. This might lead to an overestimate of uncertainties for the $z$ dependent FFs. On the other hand, the Hessian method is particularly simple, using Eq. (7), provided its applicability has been carefully established and appropriate eigenvector sets have been generated [26]. This was the purpose of our studies for pion FFs presented in this Section.

III. KAON FRAGMENTATION FUNCTIONS

A. Preliminaries

Next, we proceed with a similar error analysis for the NLO DSS kaon FFs [9]. Since even the most precise kaon production data in SIA exhibit experimental uncertainties typically at least twice as large as those found for pions, one must expect much less, but still reasonably well constrained parton-to-kaon FFs.

To account for the phenomenological expectation that the formation of secondary $s\bar{s}$ pairs should be suppressed in the production of, say, a $K^+$ = $|u\bar{s}|$, the two favored quark combinations $D_{u+\bar{u}}^K$ and $D_{s+s+\bar{s}}^K$ are fitted independently in the DSS analysis using the functional form (1). Indeed, in line with that expectation, the DSS fit prefers $D_{u+\bar{u}}^K > D_{s+s+\bar{s}}^K$. Since presently available data do not fully constrain all unfavored kaon FFs, it was assumed that they all share the same functional form, i.e.,

$$D_{u+\bar{u}}^K = D_s^K = D_d^K = D_{d+\bar{d}}^K.$$ (11)

Corresponding FFs into $K^-$ are obtained, as usual, by charge conjugation symmetry, which leaves a total of 24 free fit parameters $\{a_i\}$ describing the DSS FFs for quarks and gluons into positively charged kaons. Six additional parameters control the relative normalization of the data sets in the DSS analysis [9].

B. Results

As for the pion FFs, we start our analyses by showing the correlations between the fit parameters $\{a_i\}$ and eigenvector directions $\{z_i\}$ in Fig. 8. As before, the $\{z_i\}$ are ordered by the size of the corresponding eigenvalues of the Hessian matrix, and correlations can be found across the entire parameter space. In most cases, there are, however, fairly strong correlations relating a certain eigenvector direction with just a one (or only a few) of the original fit parameters. Again, the best constrained fit parameters are those related to relative normalizations applied to the data sets in the fit. In a second group are the normalization factors $N_i$ of the different FFs for positively charged kaons $D_{u+\bar{u}}^K$, see Eq. (1). Among the least well constrained parameters are mainly those associated with subtle details of the $z$ dependence of the FFs, i.e., $\gamma_i$ and $\delta_i$ in Eq. (1).

In the DSS analysis of kaon FFs [9], uncertainties were estimates within the LM method for the truncated moments (10) and found to be at least twice as large as those for pions. Again, an increase of $\Delta \chi^2/\chi^2 = 2\%$, corresponding to about 8 units in $\chi^2$, were regarded as a faithful estimate of the typical uncertainties. As a representative example, Fig. 9 shows the corresponding $\chi^2$ profile (solid line) and error estimate (horizontal bar labeled as “LM 2%”) for the dominant total strange quark
FFs into positively charged kaons. As in Fig. 4, the variation of \( \eta_{s+s}^{K^+} \) is normalized to its value \( \eta_0 \) taken for the optimum set of parameters \( \{a_i^0\} \) and is found to be of order of about 10%.

When compared to the uncertainties obtained within the IH approach, we find that the results corresponding to \( \Delta \chi^2/\chi^2 = 2\% \) and 5% slightly under- and overestimate the range of variation of \( \eta_{s+s}^{K^+} \) determined with the LM method. Qualitatively very similar results can be obtained for all the other parton-to-kaon FFs. Again, we provide Hessian eigenvector basis sets \( S_{0i}^k \) for both tolerance criteria [26] to facilitate estimates of uncertainties for arbitrary observables involving kaon FFs.

Before discussing an application of our Hessian sets, we first study the uncertainty bands for the individual NLO DSS parton-to-kaon FFs. Figure 10 shows \( zD^{K^+}(z, Q^2) \) for \( i = u, u, g, s, s, c, c \), and \( b, b \) for two different scales \( Q^2 = 10 \text{ GeV}^2 \) and \( Q^2 = M_Z^2 \) along with our estimates of their uncertainties using both the IH (5%) and LM (2%) method. As for pion FFs, the lower panels for each flavor show the relative uncertainties obtained with the IH approach.

Despite the sizable disparity in size, the two favored \( s + \bar{s} \) and \( u + \bar{u} \) FFs exhibit very similar relative uncertainties: close to 20% at intermediate values of \( z \) and a significant growth for both large and small \( z \). All unfavored quark FFs, such as \( D_{u}^{K^+} \), are not well constrained by data and show extremely large uncertainties of 50% or more. All these features can be traced back to the much larger experimental uncertainties for flavor-tagged SIA [18] and SIDIS [19] data for kaons compared to those for identified pions.

Rather unexpectedly, the gluon-to-kaon FF shows rather small relative uncertainties over most of the \( z \)-range, comparable to those for the favored quark FFs. This feature is found both within the LM and IH method and hence cannot be attributed to the approximations made in the latter approach. Since the \( pp \) data, which mainly constrain \( D_{u}^{K^+} \) at \( z \simeq 0.5 \), are rather sparse and less precise than for identified pions, the result most likely reflects a lack of flexibility in the parametrization chosen in the DSS analysis, albeit not affecting the overall quality of the fit. More and better data will be needed to constrain \( D_{g}^{K^+} \) more reliably. In particular, upcoming precise data from BELLE [21] might be sufficient to determine the gluon FF from scaling violations in SIA. Additional \( pp \) data from RHIC and the LHC will add to this. We note that as in the case of pions, charm and bottom quark FFs and their uncertainties have to taken with a grain of salt.

In order to illustrate the impact of the estimated uncertainties for the DSS kaon FFs, we compute the charged kaon multiplicities at NLO accuracy in the kinematic range of the HERMES experiment [19]. To propagate the uncertainties of the kaon FFs we use Eq. (7) with our Hessian sets for both \( \Delta \chi^2/\chi^2 = 2\% \) and 5%. The results are shown in Fig. 11. For positively charged kaons, the uncertainties resemble in shape those found in the case of pions, see Fig. 5, i.e., they are largely independent of \( z \) and the energy scale \( Q \). As has to be expected from a comparison of Figs. 7 and 10, the differences between results obtained with the Hessian sets for the 2% and 5% tolerances are more pronounced for kaons than for pions. For negatively charged kaon multiplicities the propagated uncertainties behave, however, rather differently. We observe an increase in size with the scale \( Q \),...
and, in addition, the estimates for the 2% and 5% Hessian sets differ much more significantly than for $K^+$ and $\pi^\pm$ multiplicities. These features can be associated with the larger sensitivity of the $K^-$ multiplicities to the less well determined unfavored kaon FFs as well as with the more erratic behavior of the fitted SIDIS data.

We note that kaon FFs are extremely relevant in connection with the proper extraction of the strangeness helicity PDF from spin-dependent SIDIS data [1, 2]. Our error estimates for pion and kaon FFs will be particularly useful in future global analyses of the spin structure of the nucleon as they allow one to straightforwardly propagate these sources of uncertainties. Upcoming new data on multiplicities for identified hadrons [22] will be critical in further reducing uncertainties of fully flavor and charge separated sets of FFs.

\section*{IV. CONCLUSIONS}

We have performed a detailed estimate of the uncertainties inherent to the extraction of pion and kaon fragmentation functions as performed in the DSS global analysis framework. We have carefully examined the validity of the approximations underlying the more practical, improved Hessian method by comparing with the results based on the robust Lagrange multiplier technique.

Even though we have found some differences between uncertainties obtained with the two methods, they can be readily understood and accounted for by choosing are larger tolerance in the Hessian approach. In general, the agreement is much better for the rather well constrained parton-to-pion fragmentation functions and somewhat less satisfactory for kaons, where data are less precise.

We provide Hessian eigenvector basis sets for both pion and kaon fragmentation functions and corresponding to two different error estimates [26]. These sets will greatly facilitate the propagation of uncertainties related to fragmentation functions to observables such as single-inclusive hadron production cross sections or multiplicities. Good knowledge of fragmentation functions and their uncertainties is also relevant in understanding and analyzing results for spin-dependent semi-inclusive deep-inelastic scattering and the modification of identified hadron yields in heavy-ion collisions. Our results will also prove to be relevant in quantifying the impact of future measurements of pion and kaon yield in upcoming global analyses of fragmentation functions.

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FIG. 10: As in Fig. 7 but now showing the uncertainty bands for the NLO DSS kaon FFs at $Q^2 = 10\text{ GeV}^2$ and $Q^2 = M_Z^2$.

FIG. 11: As in Fig. 5 but for charged kaon multiplicities. On the right-hand-side, only the uncertainty bands for $K^−$ are visible, which are larger than those for $K^+$.
[26] Hessian eigenvector sets are available upon request from the authors.