



workshop on

"Global Analysis of Polarized RHIC and DIS Data"

Monday, Oct. 8<sup>th</sup>

# Global Analysis Toolbox: Mellin Technique

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**the challenge:**

**analyze an ever growing amount of data  
within the best theoretical framework available  
in a finite amount of time**

# a highly non-trivial exercise:

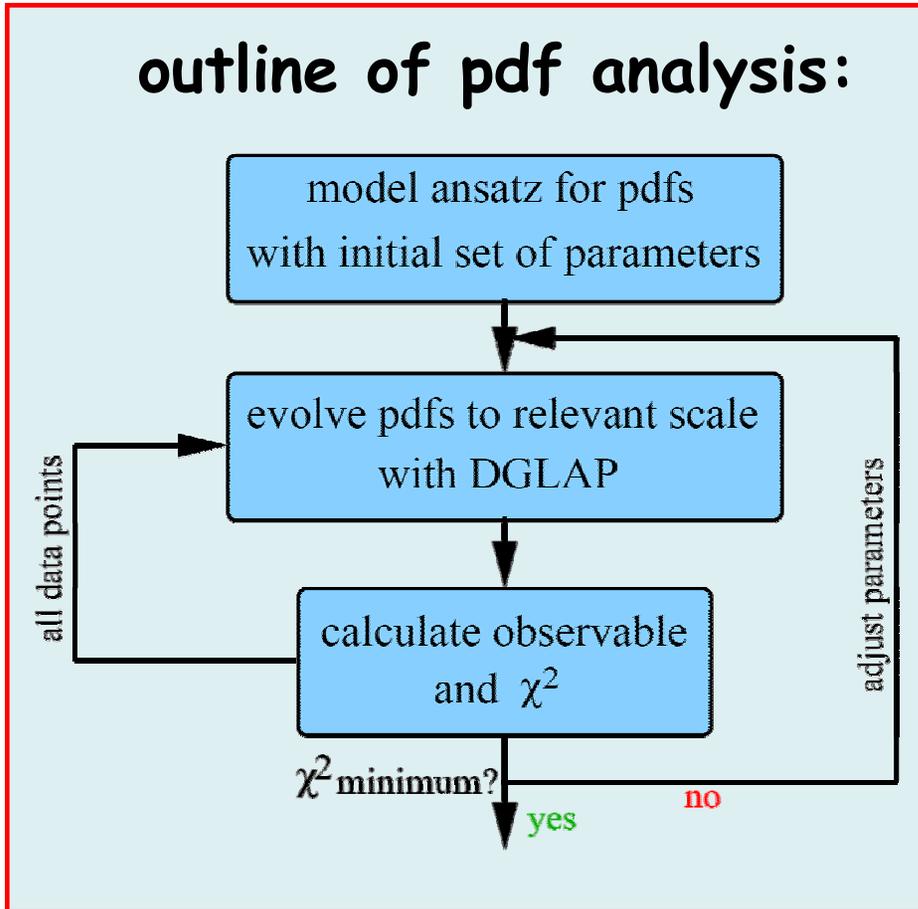
- **recall:** information on spin/nucleon structure and fragmentation cannot be read off from data but is hidden inside **complicated convolutions**, summed over many subprocesses

$$d\Delta\sigma = \sum_{a,b,c} \int \Delta f_a \otimes \Delta f_b \otimes d\Delta\hat{\sigma}_{ab \rightarrow cX} \otimes D_c^H$$

- many different processes needed to pin down all aspects of pdfs/ffct
- all processes must be analyzed in NLO (or beyond) to control theor. errors

# the way to do it: global $\chi^2$ minimization

## outline of pdf analysis:



involves multi-parameter fitting

→ 1000's of evaluations of  
NLO cross sections needed

(a proper error analysis adds to this)

**the problem:**

NLO expressions are fairly complex  
and numerically very time-consuming

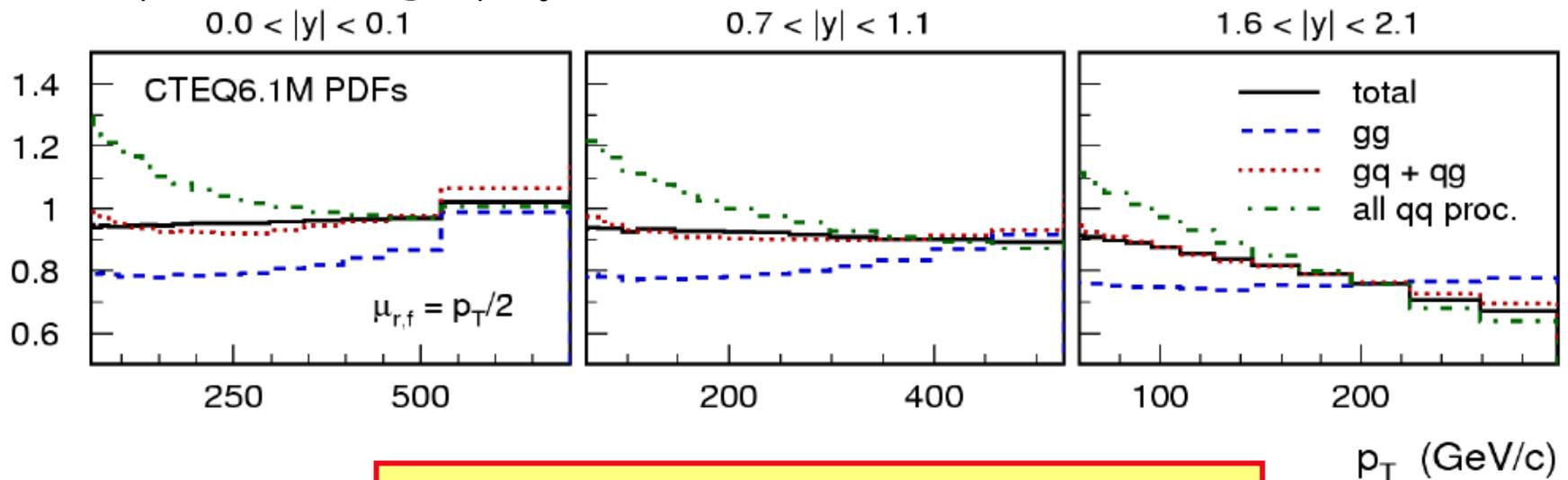
**computing time for a global analysis at NLO becomes excessive**

a common “workaround”:  $d(\Delta)\sigma^{NLO} \approx K \cdot d(\Delta)\sigma^{LO}$

- but**
- K itself depends on unknown pdfs/ffct
  - $K = K(p_T, y, \dots)$  and often large
  - K different for  $d\sigma$  and  $d\Delta\sigma \rightarrow$  no cancellation in  $A_{LL}$
  - K is different for different subprocesses
  - even LO cross sections for pp processes are too slow!

example: K for high- $p_T$  jets at TeVatron

taken from M. Wobisch (fastNLO)



introduces unknown systematic error

# 19<sup>th</sup> century math comes to help ...



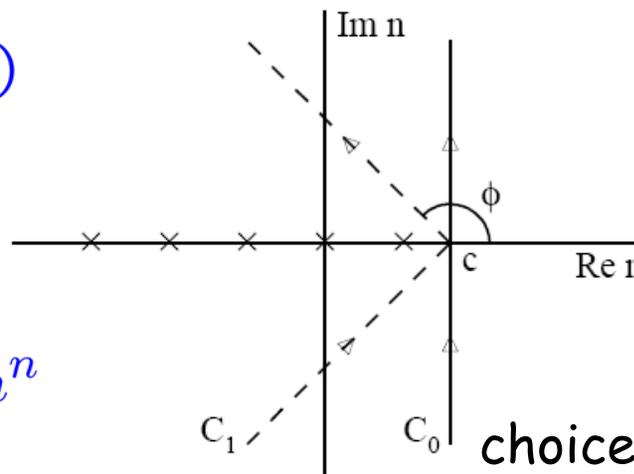
R.H. Mellin  
Finnish mathematician

integral transformation: **Mellin n-moments**

$$h^n \equiv \int_0^1 dx x^{n-1} h(x)$$

inverse

$$h(x) \equiv \frac{1}{2\pi i} \int_{C_n} dn x^{-n} h^n$$



choice of contour → later

**crucial property:** convolutions factorize into simple products

$$\begin{aligned} & \int_0^1 dx x^{n-1} \int_x^1 \frac{dy}{y} h(y) g(x/y) \\ &= \int_0^1 dx x^{n-1} \left[ \int_0^1 dy \int_0^1 dz h(y) g(z) \delta(x - zy) \right] \\ &= \int_0^1 dy y^{n-1} h(y) \int_0^1 dz z^{n-1} g(z) = h^n \cdot g^n \end{aligned}$$

# well-known application: DGLAP evolution

Bjorken-x space: integro-differential equations → no analytical solution

e.g. LO non-singlet (valence) evolution

$$\frac{dq(x, Q^2)}{d \ln Q^2} = \frac{\alpha_s(Q^2)}{2\pi} \int_x^1 \frac{dy}{y} q(y, Q^2) P_{qq}(x/y)$$

known up to NNLO

full singlet evolution more complicated: coupled equations

Mellin-n space: ordinary differential equations → analytical solution

$$\frac{dq^n(Q^2)}{d \ln Q^2} = \frac{\alpha_s(Q^2)}{2\pi} q^n(Q^2) P_{qq}^n$$

n-moments  
known analytically

solve analytically (to all orders !):

$$q^n(Q^2) = q^n(Q_0^2) \left( \frac{\alpha_s(Q^2)}{\alpha_s(Q_0^2)} \right)^{-2P_{qq}^n/\beta_0}$$

input  
(fitted)

pQCD scaling viol.

# back into x-space: optimizing the contour

$$f(x, Q^2) \equiv \frac{1}{2\pi i} \int_{C_n} dn x^{-n} f^n(Q^2)$$

$c$ : to the right of rightmost pole (convergence!)

$f(x)$  are real functions:  $(f^n)^* = f^{n^*}$

→ parametrize contour to integrate over real variable  $z$

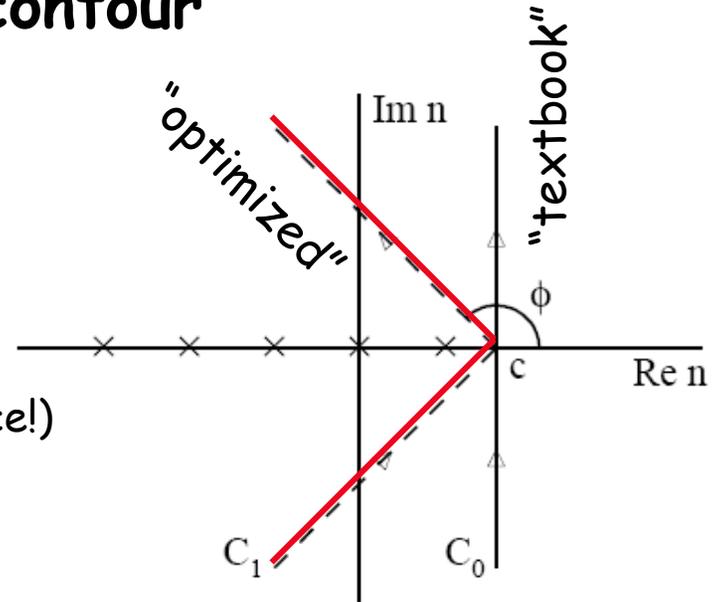
$$f(x, Q^2) = \frac{1}{\pi} \int_0^\infty dz \operatorname{Im} \left[ e^{-i\phi} x^{-c-ze^{i\phi}} f^{n=c+ze^{i\phi}}(Q^2) \right]$$

recipe for numerical fast but reliable inversion: *see, e.g., A. Vogt "QCD-PEGASUS" code*

$C_1$  contour with  $\phi=3\pi/4$ : exp. dampening for large  $|n|$  → can use **small**  $z_{\max}$

in practice:  $z_{\max}$  adaptive depending on  $x$  (large  $x$  more costly!)

choose  $n$  as supports for Gaussian integration **VERY FAST!**



# remarks on different solutions of DGLAP eqs.:

the iterative x-space solution (e.g. Runge-Kutta method) and

the analytical n-space solution may differ in  $f(x, Q^2)$  !

- ✓ of course, *differences are only beyond the order considered* but can be non-negligible in comparisons of different codes !!
- iteration introduces more scheme-dep. higher order terms
- n-space solutions truncated at given order satisfy DGLAP eqs. "only" in the sense of a power expansion
- the treatment of the RGE for  $\alpha_s(Q^2)$  is also an issue (exact numerical solution vs. power expansions)

**summary so far:**

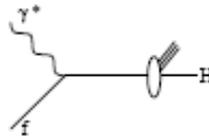
**the  $Q^2$  scale evolution of pdfs (and frag. fcts.)  
is not an obstacle in a global  $\chi^2$  analysis**

**it can be done to any given order in  
a fast and reliable way**

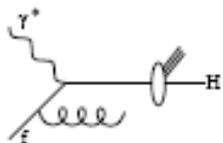
**but the analyses are on the cross section level ...**



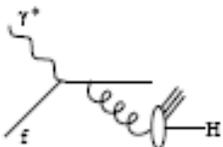
# semi-inclusive DIS data



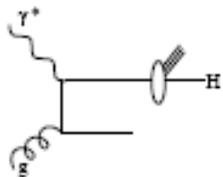
$$\frac{d^3 \Delta\sigma}{dx dy dz} \simeq \sum_{q=u, \bar{u}, \dots, \bar{s}} e_q^2 \left[ \overbrace{\Delta q(x, \mu_f) D_q^H(z, \mu'_f)} + \int_x^1 \frac{d\hat{x}}{\hat{x}} \int_z^1 \frac{d\hat{z}}{\hat{z}} \left\{ \right. \right.$$



$$\frac{\alpha_s(\mu_r)}{2\pi} \Delta q\left(\frac{x}{\hat{x}}, \mu_f\right) \Delta C_{qq}^{(1)}(\hat{x}, \hat{z}, \mu_f, \mu'_f) D_q^H\left(\frac{z}{\hat{z}}, \mu'_f\right) +$$



$$\frac{\alpha_s(\mu_r)}{2\pi} \Delta q\left(\frac{x}{\hat{x}}, \mu_f\right) \Delta C_{gq}^{(1)}(\hat{x}, \hat{z}, \mu_f, \mu'_f) D_g^H\left(\frac{z}{\hat{z}}, \mu'_f\right) +$$



$$\frac{\alpha_s(\mu_r)}{2\pi} \Delta g\left(\frac{x}{\hat{x}}, \mu_f\right) \Delta C_{qg}^{(1)}(\hat{x}, \hat{z}, \mu_f, \mu'_f) D_q^H\left(\frac{z}{\hat{z}}, \mu'_f\right) \left. \right\} \left. \right]$$

**crucial difference:** coefficient functions now depend on **two variables**  
 "only" NLO corrections are known

nevertheless, Mellin moments can be taken analytically!

but this time we need a **double-Mellin transform**:

Altarelli, Ellis, Martinelli, Pi; MS, Vogelsang

$$\Delta C_{ij}^{nm} \equiv \int_0^1 dx x^{n-1} \int_0^1 dz z^{m-1} \Delta C_{ij}(x, z)$$

and a double Mellin inverse ( $\rightarrow$  later!)

in practice, however, experiments integrate over  $z_{\min} \gtrsim 0.2$

$\rightarrow$  easier to introduce an "effective" 1-dim. coefficient function

$$\Delta \tilde{C}_j^n \equiv \int_{z_{\min}}^1 dz \int_{\mathcal{C}_m} dm z^{-m} \Delta C_{ij}^{nm} D_i^m$$

can be pre-calculated *once* prior to the fit and then used like an inclusive DIS coefficient

also **VERY FAST!**



remark on data averaged over x- or z-bins:

can be also directly implemented in moment space:

$$\text{for instance, } \langle g \rangle(a, b) \equiv \frac{1}{b-a} \int_a^b dx g(x)$$

insert Mellin representation for  $g(x)$  and perform  $x$  integration:

$$\langle g \rangle(a, b) = \frac{1}{b-a} \frac{1}{2\pi i} \int_{\mathcal{C}_n} dn \frac{b^{1-n} - a^{1-n}}{1-n} g^n$$

more efficient than computing  $g(x)$  first and then integrating in  $x$ -space !

this "trick" was used, e.g., in the global analysis of fragmentation functions (de Florian, Sassot, MS) to include OPAL flavor tagging probabilities

it is in the analysis of hadron-hadron data  
where the double Mellin moment technique  
exhibits its full potential...

MS, Vogelsang

earlier ideas: Berger, Graudenz,  
Hampel, Vogt; Kosower

NLO expressions in pp are *much more* complicated than in (SI)DIS

→ Mellin moments cannot be taken analytically & numerically very slow

**idea:** re-organize multi-convolutions by taking Mellin moments

**example:**  $pp \rightarrow \pi X$

$$d\Delta\sigma = \sum_{abc} \int \Delta f_a \Delta f_b d\Delta\hat{\sigma}_{ab \rightarrow cX} D_c dx_a dx_b dz_c$$

express pdfs by their Mellin inverses

$$\frac{1}{2\pi i} \int_{\mathcal{C}_n} dn x_a^{-n} \Delta f_a^n \quad \frac{1}{2\pi i} \int_{\mathcal{C}_m} dm x_b^{-m} \Delta f_b^m$$

$$= \frac{1}{(2\pi i)^2} \sum_{abc} \int_{\mathcal{C}_n} dn \int_{\mathcal{C}_m} dm \Delta f_a^n \Delta f_b^m \int x_a^{-n} x_b^{-m} d\Delta\hat{\sigma}_{ab \rightarrow cX} D_c dx_a dx_b dz_c$$

standard Mellin inverse	fit	$\equiv d\Delta\tilde{\sigma}_{ab \rightarrow cX}(n, m)$ can be <b>pre-calculated</b> on grids!
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**applicability:** completely general, tested for  $pp \rightarrow \gamma X$ ,  $pp \rightarrow \pi X$ ,  $pp \rightarrow \text{jet} X$

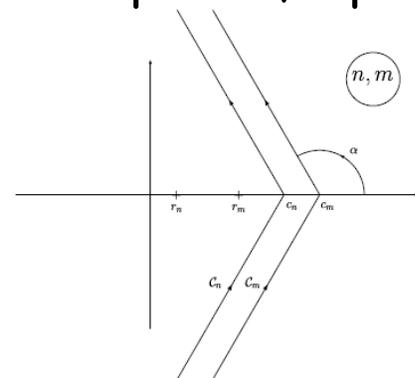
# Mellin technique in-depth: the ingredients

$$d\Delta\tilde{\sigma}_{ab\rightarrow cX}(n, m)$$

- contains all time-consuming integrations
- calculated once and forever **before the fit**
- stored in large  **$n\times m$  grids**

$$\int_{C_n} dn \int_{C_m} dm$$

- fast numerical Mellin inverse in complex  $n, m$  plane
- exponential fall-off of  $x^{-n}$ ,  $x^{-m}$  along contour optimal
- integration = summation in  $n, m$



$$\Delta f_a^n \Delta f_b^m$$

- Mellin moments of ansatz for pdfs in  $x$ -space, e.g.,  $f_a(x, \mu_0) = N x^\alpha (1-x)^\beta$
- parameters determined in standard  $\chi^2$  analysis

# Mellin technique in-depth: taking the inverse

straightforward extension to double contour:

use that pdfs are real and parametrize contour with 2 real parameters  $u_n$  and  $u_m$

find:

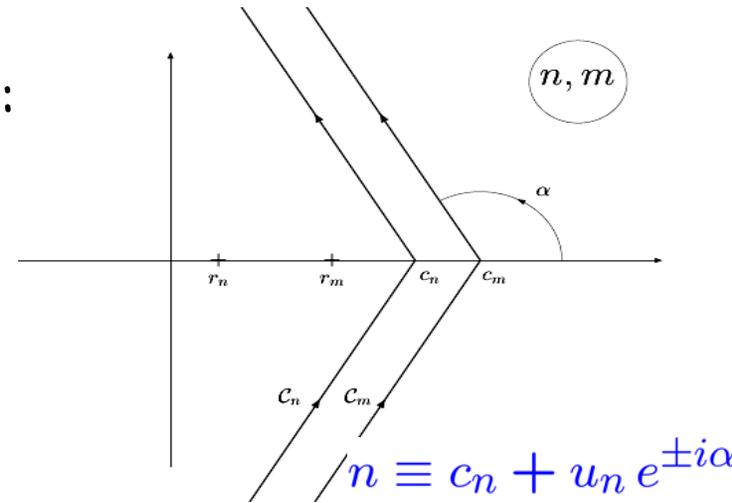
$$d\Delta\sigma = -\frac{1}{2\pi^2} \sum_{a,b} \text{Re} \left[ \int_0^\infty du_n \int_0^\infty du_m \Delta f_a^n \right. \\ \left. \times \left\{ e^{2i\alpha} \Delta f_b^m d\Delta\tilde{\sigma}_{ab}(n, m) - (\Delta f_b^m)^* d\Delta\tilde{\sigma}_{ab}(n, m^*) \right\} \right]$$

again, choose  $n, m$  as supports for Gaussian integration  $\rightarrow$  num. fast!

**bookkeeping:** for *each subprocess* we need two grids:  $(n, m)$  and  $(n, m^*)$

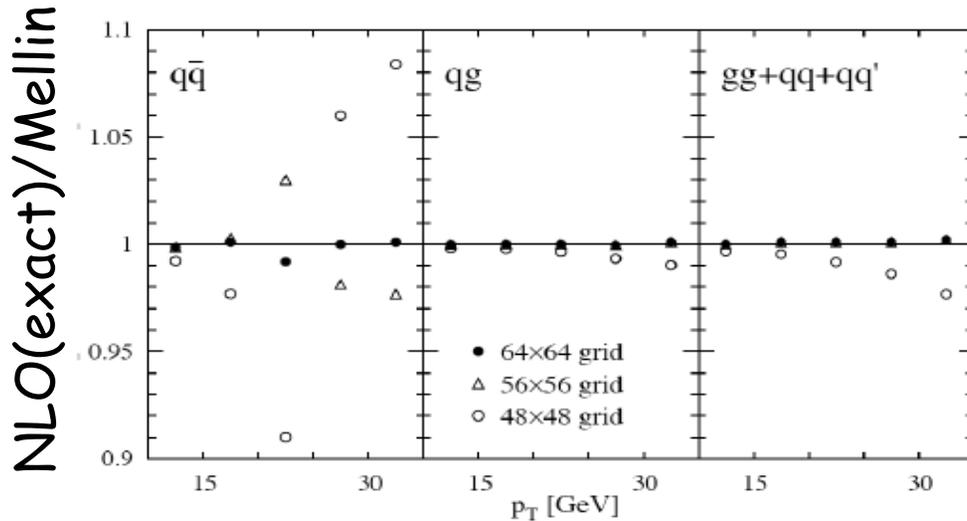
[in fact this requires four runs (!! ) of the NLO codes

since -- so far -- they cannot handle complex valued "pdfs"  $x^{-n}$ ]



# Mellin technique in-depth: performance & accuracy

**precision:** usually,  $64 \times 64$  grids sufficient for less than 0.5% deviation



example: prompt photons

**performance:**

“before”: typ. NLO code  $O(30\text{sec}/p_T \text{ value})$

“after Mellin tune-up”: bullet-train performance

100 evaluations of x-sec take a few seconds

ideal tool for multidim. fitting beyond LO



# Mellin technique in-depth: pre-calculated grids

how long does it take?

example:  $pp \rightarrow \text{jet } X$  (to analyse STAR data for  $A_{LL}$ )

6 different subprocesses to consider:  $gg, qg, 4^* \text{ "qq"}$

$\rightarrow 6 \times 4 \times 64 \times 64 \simeq 10^5$  calls of the NLO code per data point

$\rightarrow$  current # data points keep 4 dual-core CPU's busy for a week

example:  $pp \rightarrow \text{hadron } X$  (to analyse PHENIX & STAR data for  $A_{LL}$ )

many more grids since fragmentation distinguishes flavors !!

example:  $pp \rightarrow \gamma X$  (future)

somewhat less demanding than jets ✓

sufficient computing power is essential for the pre-analysis stage

# Mellin technique in-depth: improvements

**good news:** grids only “know about” the kinematics of the exp. bins

→ if binning & kinematics (e.g.  $\eta$ -range) remains unchanged we can simply add more bins if they become available

Mellin technique has passed an important stress test in global analyses of fragmentation functions [de Florian, Sassot, MS](#)

**improvements:** codes not really optimized for speed

parallelization possible

user intervention still required → automatization

currently, changing  $\mu_{r,f}$  requires new grids

→ separate grids for the few terms which depend on  $\mu_{r,f}$

ready to analyze ...

