

Systematic Uncertainties in Theory

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1. Types of uncertainties
2. Perturbation theory and beyond
3. Uncertainties in parton density fits
4. Summary

Different sources of theoretical uncertainties

“observable = theoretical expression”

1. theoretical expression is only approximate

- ▶ often obtained by expansion in **small parameter**
e.g. in coupling constant → **perturbation theory**
↪ estimate size of uncalculated/neglected terms
- ▶ for some situations/aspects do not have systematic theory
must use **models**
↪ may estimate uncertainty by comparing different models



Different sources of theoretical uncertainties

“observable = theoretical expression”

2. input parameters from standard model, e.g.
 $\alpha_s, m_{c,b}, m_t, m_{W,Z}, m_H$, CKM matrix elements
 note: running $\alpha_s(\mu)$ depends implicitly on quark masses
3. nonperturbative QCD parameters or functions
 - ▶ most prominently: parton distributions (PDFs)
 note: PDFs depend on $\alpha_s(\mu)$ via evolution
 - ▶ other examples: decay constants, wave functions
 (e.g. for $B \rightarrow D\ell\nu, B \rightarrow \pi K$)

quantities in points 2. and 3. may be obtained from

- ▶ comparison “measured observable = theor. expression”
- ▶ nonperturbative calculation (e.g. in lattice QCD)

Some parameters and their uncertainties

from: Review of Particles Physics 2012

Phys. Rev. D86 (2012) 010001, <http://hepdata.cedar.ac.uk/1b1>

	relative uncertainty
$m_W = 80.385 \pm 0.015 \text{ GeV}$	1.9×10^{-4}
$m_Z = 91.1876 \pm 0.0021 \text{ GeV}$	2.3×10^{-5}
$m_\tau = 1.77682 \pm 0.00016 \text{ GeV}$	9.0×10^{-5}
$m_b = 4.18 \pm 0.03 \text{ GeV}$	0.72%
$m_t = 160^{+5}_{-4} \text{ GeV}$	+3.1% -2.5%
$1/\alpha_{em} = 137.035999074(44)$	3.2×10^{-9}
$\alpha_s(m_Z) = 0.1184 \pm 0.0007$	0.59%
$= 0.1183 \pm 0.0012$ (without lattice QCD)	1.0%

masses and couplings often appear raised to some power \rightarrow larger uncertainties

m_b and m_t are $\overline{\text{MS}}$ masses at scales $m_b(m_b)$, $m_t(m_t)$

Coupling constants and their running

- ▶ due to quantum effects (loop corrections) coupling constants depend on **renormalization scale** μ set by “typical momentum scale” of physical process
- ▶ electroweak interactions: $\alpha_{em}(0) \approx 0.00730$ generally quick convergence of pert. series
- ▶ strong interactions:
 - $\alpha_s(m_Z) \approx 0.118$, $\alpha_s(m_\tau) \approx 0.33$
 - higher order corrections often very important (**easily factors of 2**)
 - coupling grows with decreasing μ
 - \rightsquigarrow expansion in α_s not useful at low μ

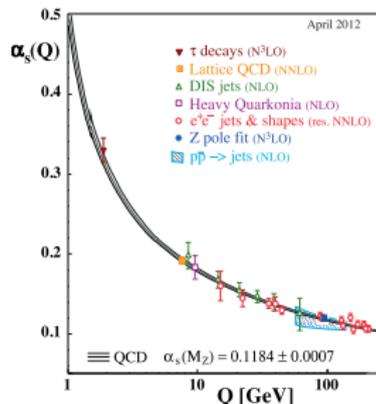
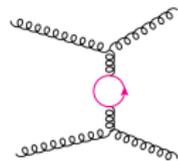


figure: Rev. Part. Phys. 2012

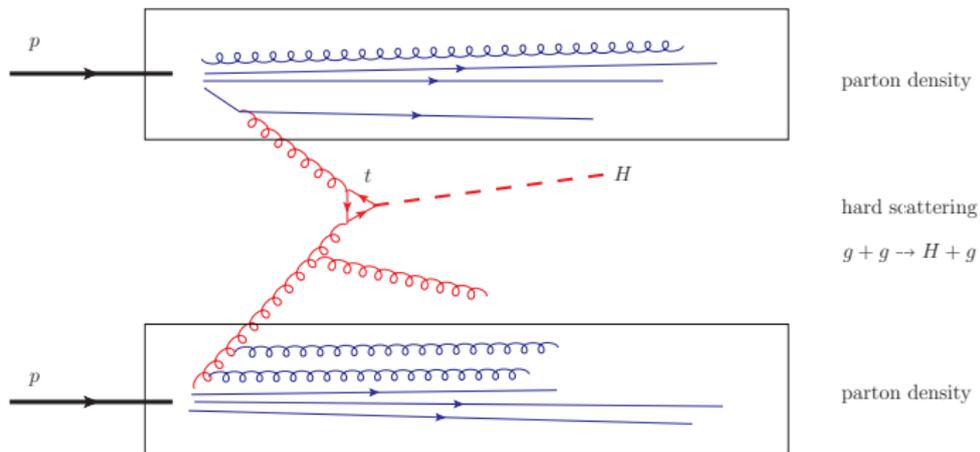
- ▶ not everything can be expanded in coupling (**e.g. $e^{-\text{const}/\alpha}$**) **non-perturbative effects** most ubiquitous in strong interactions

will concentrate on uncertainties due to strong interactions

Factorization: a cornerstone of calculations in QCD

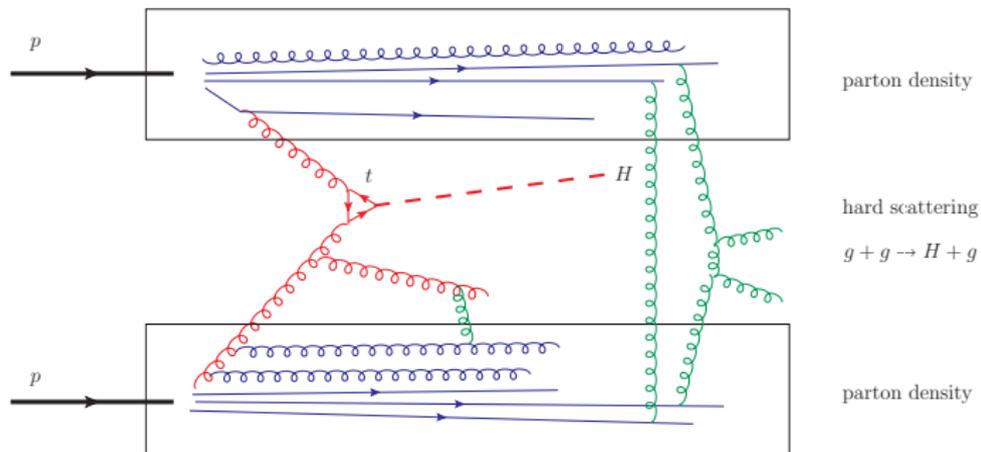
- ▶ confinement: quarks and gluons do not exist as free particles; only hadrons are observed
 - ↪ even at very high energies pp (and ep) collisions involve dynamics at scales ~ 1 GeV and below
- ▶ idea: separate physics at high and low momentum scales
 - ▶ at high scales use expansion in α_s
 - ▶ at low scales:
 - determine non-perturbative quantities (e.g. parton densities) from experiment, theory or models
 - once they are determined, we have predictive power

Example: $p + p \rightarrow H + X$ ($X = \text{anything}$)



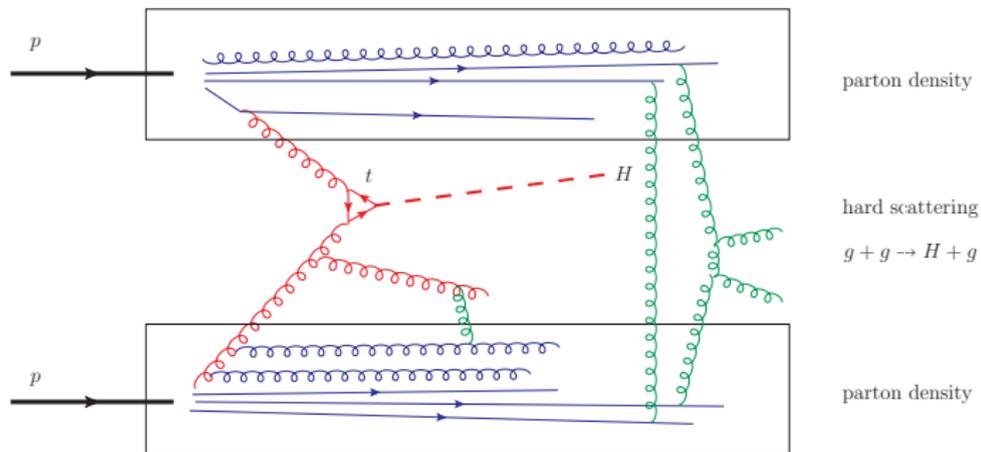
- ▶ factorization formula: parton densities and hard-scattering subprocesses $gg \rightarrow H$, $gg \rightarrow H + g$, ...

Example: $p + p \rightarrow H + X$ ($X = \text{anything}$)



- ▶ actual physics more complicated: soft gluon exchange
 - ▶ outside domain of perturbation theory \rightsquigarrow must model
 - ▶ does not affect sufficiently inclusive observables
 - ▶ but does matter for details of final state \rightsquigarrow “underlying event”

Example: $p + p \rightarrow H + X$ ($X = \text{anything}$)



- ▶ if additional interactions hard \rightsquigarrow “multiparton interactions”
suppressed in sufficiently inclusive observables
no systematic theory yet \rightsquigarrow must model

Factorization formulae

schematic structure for pp collisions

$$\frac{d\sigma}{d(\text{variables})} = f_1(\mu_F) \otimes_{x_1} \frac{1}{Q^n} C \left\{ \frac{\mu_F}{Q}, \frac{\mu_R}{Q}, \alpha_s(\mu_R), \dots \right\} \otimes_{x_2} f_2(\mu_F) + \mathcal{O}\left(\frac{1}{Q^{n+1}} \text{ or } \frac{1}{Q^{n+2}}\right)$$

- ▶ $f_1, f_2 =$ parton densities, $C =$ hard-scattering coefficient
- ▶ $Q =$ hard momentum scale (e.g. Higgs mass, jet E_T)
 $x_1, x_2 =$ dimensionless variables constructed from kinematics

- ▶ convolution $f \otimes_x g = \int_x^1 \frac{dz}{z} f\left(\frac{x}{z}\right) g(z)$

- ▶ in $C(\dots)$ possible dependence on m_t, m_H etc.
- ▶ higher-order corrections (1st line) → next slides
power corrections (2nd line) → not discussed here

Factorization formulae

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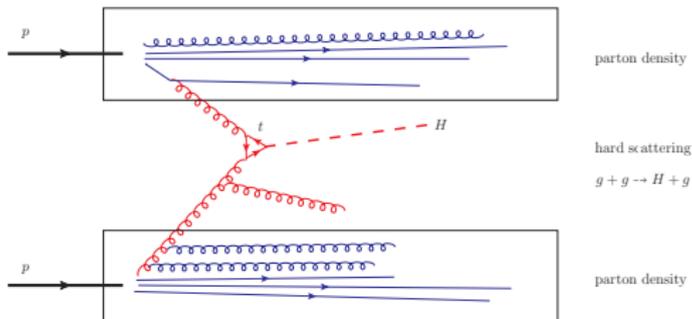
- ▶ have α_s expansions for C and for $df/d\mu_F$
- ▶ $\mu_R =$ **renormalization scale**
separates physics at scale Q from physics at much higher scales (ultraviolet region)

Factorization formulae

schematic structure for pp collisions

$$\frac{d\sigma}{d(\text{variables})} = f_1(\mu_F) \otimes_{x_1} \frac{1}{Q^n} C \left\{ \frac{\mu_F}{Q}, \frac{\mu_R}{Q}, \alpha_s(\mu_R), \dots \right\} \otimes_{x_2} f_2(\mu_F) + \mathcal{O}\left(\frac{1}{Q^{n+1}} \text{ or } \frac{1}{Q^{n+2}}\right)$$

- ▶ have α_s expansions for C and for $df/d\mu_F$
- ▶ $\mu_F =$ factorization scale
separates physics at scale Q from physics at lower scales



Renormalization scale dependence

on next slides write μ instead of μ_R for brevity

- ▶ renormalization group equation

$$\frac{d}{d \log \mu^2} \alpha_s(\mu) = \beta(\alpha_s(\mu))$$

$$\text{with } \beta(\alpha_s) = -\alpha_s^2 (b_0^{n_f} + b_1^{n_f} \alpha_s + b_2^{n_f} \alpha_s^2 + b_3^{n_f} \alpha_s^3 + \dots)$$

- ▶ in practice: truncate series of $\beta(\alpha_s)$ and solve RGE numerically or analytically (possibly approximate)
- ▶ higher coefficients in α_s expansion of hard-scattering coefficient are μ dependent

$$C = \alpha_s^m(\mu) C_0 + \alpha_s^{m+1}(\mu) C_1\left(\frac{Q}{\mu}\right) + \alpha_s^{m+2}(\mu) C_2\left(\frac{Q}{\mu}\right) + \dots$$

but C is independent of μ to any given accuracy in α_s :

$$\frac{d}{d \log \mu^2} C(\mu) = 0$$

see how this works:

- ▶ set $\mu = Q$ in expansion:

$$\begin{aligned} C &= \alpha_s^m(\mu) C_0 + \alpha_s^{m+1}(\mu) C_1\left(\frac{Q}{\mu}\right) + \alpha_s^{m+2}(\mu) C_2\left(\frac{Q}{\mu}\right) + \dots \\ &= \alpha_s^m(Q) C_0 + \alpha_s^{m+1}(Q) C_1(1) + \alpha_s^{m+2}(Q) C_2(1) + \dots \end{aligned}$$

- ▶ expand $\alpha_s(Q) = \alpha_s(\mu) + a_1\left(\frac{Q}{\mu}\right) \alpha_s^2(\mu) + a_2\left(\frac{Q}{\mu}\right) \alpha_s^3(\mu) + \mathcal{O}(\alpha_s^4)$

$$\begin{aligned} \frac{d}{d \log Q^2} (\text{l.h.s.}) &= \beta(\alpha_s(Q)) = -b_0 \alpha_s^2(Q) - b_1 \alpha_s^3(Q) + \mathcal{O}(\alpha_s^4) \\ &= -b_0 \alpha_s^2(\mu) - 2a_1 b_0 \alpha_s^3(\mu) - b_1 \alpha_s^3(\mu) + \mathcal{O}(\alpha_s^4) \\ \frac{d}{d \log Q^2} (\text{r.h.s.}) &= \frac{da_1}{d \log Q^2} \alpha_s^2(\mu) + \frac{da_2}{d \log Q^2} \alpha_s^3(\mu) + \mathcal{O}(\alpha_s^4) \end{aligned}$$

- ▶ compare coefficients of $\alpha_s^n(\mu)$:

$$\begin{aligned} \frac{da_1}{d \log Q^2} = -b_0 &\quad \Rightarrow \quad a_1\left(\frac{Q}{\mu}\right) = -b_0 \log \frac{Q^2}{\mu^2} \\ \frac{da_2}{d \log Q^2} = -2a_1 b_0 - b_1 &\quad \Rightarrow \quad a_2\left(\frac{Q}{\mu}\right) = +b_0^2 \log^2 \frac{Q^2}{\mu^2} - b_1 \log \frac{Q^2}{\mu^2} \end{aligned}$$

► inserting

$$\alpha_s(Q) = \alpha_s(\mu) \left[1 - \alpha_s(\mu) b_0 \log \frac{Q^2}{\mu^2} + \alpha_s^2(\mu) \left(b_0^2 \log^2 \frac{Q^2}{\mu^2} - b_1 \log \frac{Q^2}{\mu^2} \right) + \dots \right]$$

into $C = \alpha_s^m(Q) \left[C_0 + \alpha_s(Q) C_1(1) + \alpha_s^2(Q) C_2(1) + \dots \right]$ get

$$\begin{aligned} C &= \alpha_s^m(\mu) \\ &\times \left[1 - \alpha_s(\mu) m b_0 \log \frac{Q^2}{\mu^2} + \alpha_s^2(\mu) \left(\frac{m(m+1)}{2} b_0^2 \log^2 \frac{Q^2}{\mu^2} - m b_1 \log \frac{Q^2}{\mu^2} \right) \right] \\ &\times \left[C_0 + \alpha_s(\mu) C_1(1) + \alpha_s^2(\mu) \left(C_2(1) - C_1(1) b_0 \log \frac{Q^2}{\mu^2} \right) \right] + \mathcal{O}(\alpha_s^{m+3}) \end{aligned}$$

► in $C = \alpha_s^m(\mu) C_0 + \alpha_s^{m+1}(\mu) C_1\left(\frac{Q}{\mu}\right) + \alpha_s^{m+2}(\mu) C_2\left(\frac{Q}{\mu}\right) + \dots$
have coefficients

$$C_1\left(\frac{Q}{\mu}\right) = C_1(1) - m b_0 C_0 \log \frac{Q^2}{\mu^2}$$

$$C_2\left(\frac{Q}{\mu}\right) = C_2(1) - \left[(m+1) b_0 C_1(1) + m b_1 C_0 \right] \log \frac{Q^2}{\mu^2} + \frac{m(m+1)}{2} b_0^2 C_0 \log^2 \frac{Q^2}{\mu^2}$$

► check (exercise): $\frac{d}{d \log \mu^2} C\left(\frac{Q}{\mu}, \alpha_s(\mu)\right) = \left[\frac{\partial}{\partial \log \mu^2} + \beta \frac{\partial}{\partial \alpha_s} \right] C = 0$

- ▶ have

$$C = \alpha_s^m(\mu) C_0 + \alpha_s^{m+1}(\mu) C_1\left(\frac{Q}{\mu}\right) + \alpha_s^{m+2}(\mu) C_2\left(\frac{Q}{\mu}\right) + \dots$$

with

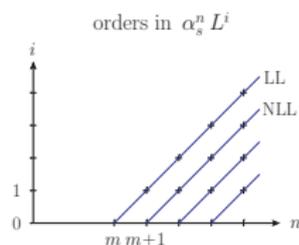
$$C_1\left(\frac{Q}{\mu}\right) = C_1(1) - mb_0 C_0 \log \frac{Q^2}{\mu^2}$$

$$C_2\left(\frac{Q}{\mu}\right) = C_2(1) - \left[(m+1)b_0 C_1(1) + mb_1 C_0 \right] \log \frac{Q^2}{\mu^2} + \frac{m(m+1)}{2} b_0^2 C_0 \log^2 \frac{Q^2}{\mu^2}$$

- ▶ calculating C_0 (LO) get also terms $\alpha_s^{m+1} \log \frac{Q^2}{\mu^2}, \alpha_s^{m+2} \log^2 \frac{Q^2}{\mu^2}, \dots$
- ▶ calculating $C_1(1)$ (NLO) get also terms $\alpha_s^{m+2} \log \frac{Q^2}{\mu^2}, \alpha_s^{m+3} \log^2 \frac{Q^2}{\mu^2}, \dots$
- ↪ recover logarithmic terms at higher orders, but **not** coefficients $C_n(1)$
- ▶ varying μ in N^n LO result get variation at N^{n+1} LO corresponding to

$$\alpha_s^{n+1} \sum_{i=1}^{n+1-m} (\text{known coeff.}) \times \log^i \frac{\mu^2}{Q^2} + \mathcal{O}(\alpha_s^{n+2})$$

but **no** information on $\alpha_s^{n+1} C_{n+1}(1)$



Renormalization scale dependence

- ▶ varying μ in N^n LO result get variation at N^{n+1} LO corresponding to

$$\alpha_s^{n+1} \sum_{i=1}^{n+1-m} (\text{known coeff.}) \times \log^i \frac{\mu^2}{Q^2} + \mathcal{O}(\alpha_s^{n+2})$$

but **no** information on $\alpha_s^{n+1} C_{n+1}(1)$

consequences:

- ▶ when calculate higher orders
expect that **scale dependence** decreases
- ▶ **scale variation** in N^n LO result estimates size of certain higher-order terms, but **not** of all
 - ▶ uncalculated higher orders often estimated by varying μ between 1/2 and 2 times some central value
is a conventional choice
 - ▶ but what to take for central value?

Renormalization scale choice

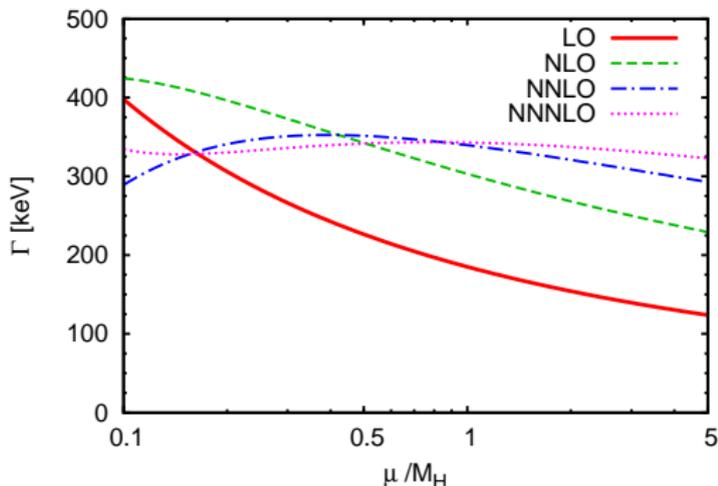
- ▶ prescriptions for **scale choice** aiming to minimizing size of higher-order terms

take NLO calc. of $C(\mu) = \alpha_s^m C_0 + \alpha_s^{m+1} C_1(\mu) + \mathcal{O}(\alpha_s^{m+2})$

- ▶ $\mu =$ typical virtuality in hard-scattering graphs
useful guidance, but obviously not a well-defined quantity
- ▶ principle of minimal sensitivity (PMS): $\frac{d}{d\mu^2} \sum_{i=0}^1 \alpha_s^{m+i} C_i(\mu) = 0$
- ▶ fastest apparent convergence (FAC): $C_1(\mu) = 0$
- ▶ Brodsky-Mackenzie-Lepage (BLM): more complicated
- ▶ how much these reduce higher orders depends on process
cannot “predict” higher orders without calculating them

Renormalization scale dependence

- ▶ example: inclusive hadronic decay of Higgs boson via top quark loop (i.e. without direct coupling to $b\bar{b}$)
- ▶ in perturbation theory: $H \rightarrow 2g$, $H \rightarrow 3g$, ... known to N³LO Baikov, Chetyrkin, hep-ph/0604194



plot for $m_H = 125$ GeV

Factorization scale dependence

- ▶ scale dependence of PDF given by DGLAP equation:

$$\frac{d}{d \log \mu_F^2} \text{PDF}(x, \mu_F) = \text{PDF}(\mu_F) \otimes_x P(\alpha_s(\mu_F))$$

evolution kernels have perturbative expansion in α_s :

$$P(z, \alpha_s(\mu_F)) = \alpha_s(\mu_F) P_0(z) + \alpha_s^2(\mu_F) P_1(z) + \mathcal{O}(\alpha_s^3)$$

- choose approx. of evolution kernel (LO, NLO, NNLO)
- solve DGLAP equations numerically
 ⇒ obtain $\text{PDF}(\mu_1)$ from $\text{PDF}(\mu_0)$
- ▶ hard-scattering coefficient contains powers of $\log(\mu_F/Q)$
 μ_F independence of $\text{PDF}(\mu_F) \otimes C(\mu_F)$ implies

$$\frac{d}{d \log \mu_F^2} C(x, \mu_F, \mu_R, \alpha_s(\mu_R)) = -P(\alpha_s(\mu_F)) \otimes_x C(\mu_F, \mu_R, \alpha_s(\mu_R))$$

Factorization scale dependence

$$\frac{d}{d \log \mu_F^2} C(x, \mu_F, \alpha_s(\mu_R), \dots) = -P(\alpha_s(\mu_F)) \otimes_x C(\mu_F, \mu_R, \alpha_s(\mu_R))$$

using renormalization group equation can rewrite

$$\alpha_s(\mu_R) = \alpha_s(\mu_F) + \sum_{i>1} c_i(\mu_R/\mu_F) \alpha_s^i(\mu_F)$$

with expansions

$$C(\mu_F, \alpha_s(\mu_F), \mu_R) = C_0(\mu_R) + \alpha_s(\mu_F) C_1(\mu_F, \mu_R) + \mathcal{O}(\alpha_s^2)$$

$$P(\alpha_s(\mu_F)) = \alpha_s(\mu_F) P_0 + \alpha_s^2(\mu_F) P_1 + \mathcal{O}(\alpha_s^3)$$

can match coefficients order by order

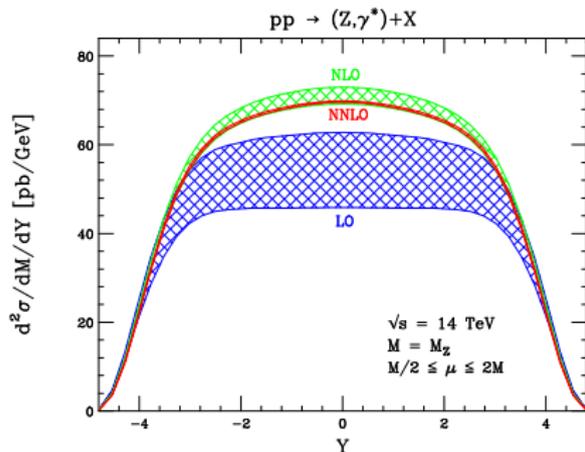
$$\Rightarrow C_1(\mu_F, \mu_R) = C_1(Q, \mu_R) - C_0(\mu_R) \otimes P_0 \log \frac{\mu_F^2}{Q^2} \quad \text{etc.}$$

Factorization scale dependence

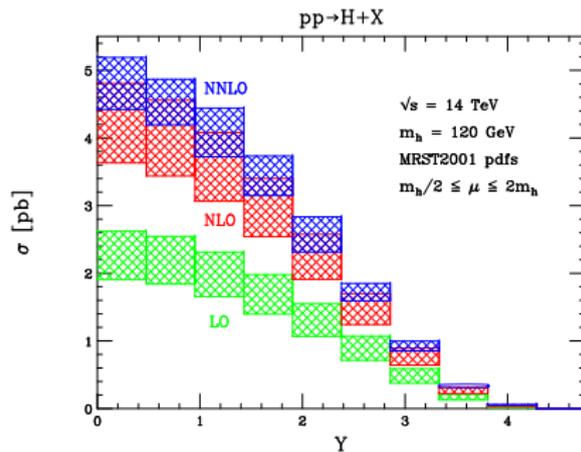
- ▶ try to chose μ_F such as to avoid large higher-order coefficients
- ▶ with C calculated to N^n LO have μ_F dependence of order N^{n+1} LO in convolution PDF $\otimes C$
 - if evolve PDFs with DGLAP kernels up to $\alpha_s^n P_{n-1}$ or higher
- ▶ as for μ_R may estimate certain higher-order terms by varying μ_F between e.g. 1/2 and 2 times some central value
- ▶ as for μ_R no general solution for finding μ_F that minimizes higher orders
- ▶ often set $\mu_F = \mu_R$ (and vary them) together but can also set and vary them separately

Scale dependence

examples: rapidity distributions in Z/γ^* and in Higgs production



Anastasiou, Dixon, Melnikov, Petriello, hep-ph/0312266

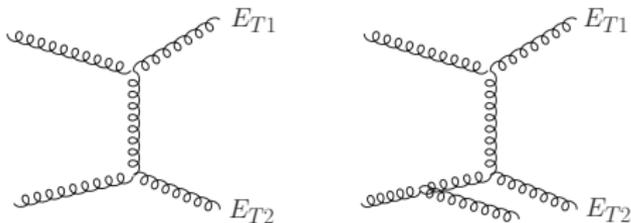


Anastasiou, Melnikov, Petriello, hep-ph/0501130

$\mu_F = \mu_R = \mu$ varied within factor 1/2 to 2

LO, NLO, and higher

- ▶ instead of varying scale(s) may estimate higher orders by comparing $N^n\text{LO}$ result with $N^{n-1}\text{LO}$
- ▶ caveat: comparison NLO vs. LO may not be representative for situation at higher orders
 - often have especially large step from LO to NLO
 - ▶ certain types of contribution may first appear at NLO
 - e.g. terms with gluon density $g(x)$ in DIS, $pp \rightarrow W + X$, etc.
 - ▶ final state at LO may be too restrictive
 - e.g. in $\frac{d\sigma}{dE_{T1} dE_{T2}}$ for dijet production



Multi-scale problems

- ▶ scale choice even less obvious when have several hard scales
e.g. Q and p_T , Q and m_c , p_T and m_W , ...
may try to identify typical virtualities in graphs
- ▶ for small/large ratios of hard scales
(or small/large values of scaling variables, e.g. $x \rightarrow 0$ or $x \rightarrow 1$)
then have large logarithms in C for any choice of μ_R, μ_F

Multi-scale problems

- ▶ for certain cases can resum large logarithms to all orders

e.g. $\alpha_s^n \log^{n+i}$ for all n with given $i = 0, 1, \dots$

- ▶ transverse-momentum logs: $\log \frac{p_T}{Q}$ for $p_T \ll Q \rightsquigarrow$ Sudakov factors

- ▶ threshold logs: $\log \frac{M^2}{\hat{s}}$ for $\hat{s} \rightarrow M^2$

for production of mass M with partonic collision energy $\sqrt{\hat{s}}$

$$\sigma(pp) \sim \int dz_1 dz_2 \text{PDF}(z_1) \text{PDF}(z_2) C(\hat{s} = z_1 z_2 s)$$

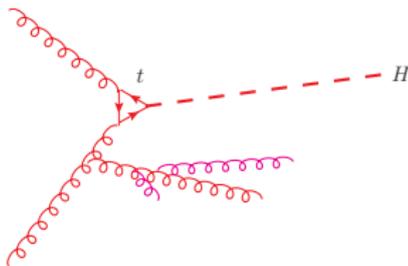
- ▶ high-energy logs: $\log \frac{Q^2}{s}$ for $s \gg Q^2 \rightsquigarrow$ BFKL equation

- ▶ resummation procedure may have its own uncertainties

e.g. from integrals of type $\int_0^Q d\mu \text{fct.}(\alpha_s(\mu)) \rightsquigarrow$ Landau pole

Jet production

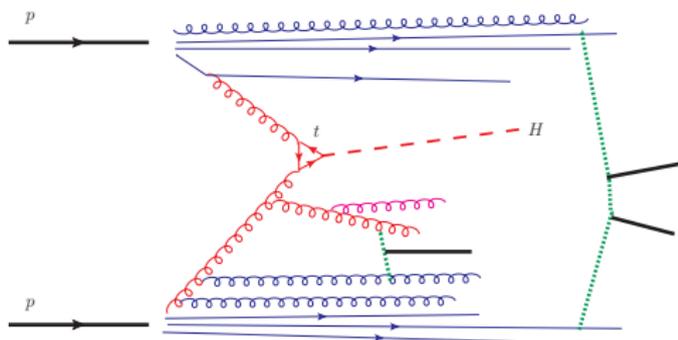
- ▶ fundamental problem: factorization formulae are for prod'n of high- p_T **partons**, not high- p_T **hadrons**
- ▶ parton \rightarrow hadron transition non-perturbative \rightsquigarrow need model
- ▶ to minimize theory uncertainties:
 - ▶ define **hadronic jets** using an algorithm that is **not** sensitive to collinear and soft radiation (**beyond perturbative control**)



- ▶ apply algorithm to partons in computation and to hadrons in measurement
- ▶ **hadronization corrections** should then be moderate and typically decrease with jet E_T

Monte Carlo generators e.g. HERWIG, PYTHIA, SHERPA

- ▶ build on structure of factorization formulae
- ▶ but compute fully **exclusive** final states (no unspecified “+X”)



- ▶ ingredients:
 - ▶ parton densities and hard-scattering **matrix elements**
 - ▶ **parton showers**: small-angle radiation from partons in initial and final state **in perturbative region**
 - ▶ models for **hadronization**, underlying event, multiparton int's

Parton density fits

Principle of PDF determinations:

- ▶ compare data with factorization formulae for selected processes and kinematics
- ▶ specify PDF at reference scale μ_0
use DGLAP eqs. to evolve to scales μ used in fact. formulae
- ▶ conventional determinations parameterize PDFs at μ_0 and determine parameters by χ^2 fit to data

NNPDF collab. uses neural networks, avoids choice of function claims “unbiased” representation of PDFs

Recent PDF sets

PDF set	order	fitted PDF parameters	μ_0^2 [GeV ²]	Q_{\min}^2 [GeV ²]	$\alpha_s(m_Z)$	
JR09	NNLO	20	0.55	2	0.1124(20)	fitted
ABKM09	NNLO	21	9	2.5	0.1135(14)	fitted
MSTW08	LO	28	1	2	0.139	
	NLO				0.120	
	NNLO				0.117	
HERAPDF1.0	NLO	10	1.9	3.5	0.1176	
CT10	NLO	26	1.69	4	0.118	
NNPDF2.1	LO	259	2	3	0.119, 0.130	
	NLO				0.119	
	NNLO				0.119	

Q_{\min} = minimum Q for fitted data on deep inelastic scattering
 updates: ABKM09 \rightarrow ABM10, HERAPDF1.0 \rightarrow 1.5, NNPDF2.1 \rightarrow 2.3

Recent PDF sets

PDF set	m_c	m_b	tolerance T	
	[GeV]	[GeV]	68% CL	90% CL
JR09	1.3	4.2	4.54	
ABKM09	1.5	4.5	1	
MSTW08	1.4	4.75	≈ 1 to 6.5	≈ 2.5 to 11
HERAPDF1.0	1.4	4.75	1	
CT10	1.3	4.75		10
NNPDF2.1	1.414	4.75	—	—

m_c and m_b are pole masses

T will be explained later

Uncertainties on extracted PDFs

“systematic theory uncertainties”

- ▶ selection of data sets and kinematics
- ▶ perturbative order of evolution and hard-scattering coefficients
- ▶ values of α_s and m_c, m_b and possibly other constants if taken as external parameters i.e. not fitted
some PDF sets are available for different values of α_s
- ▶ fine details of perturbative calculations
e.g. treatment of heavy quarks, resummation
- ▶ power corrections (typically try to avoid by minimal Q in data)
- ▶ corrections for data with nuclear targets

errors on fitted parameters

- ▶ reflect errors (stat. and syst.) of fitted data
discuss on the following slides

Parametric errors in PDF fits

see e.g. [hep-ph/0201195 \(CTEQ6\)](#), [arXiv:0802.0007 \(CTEQ6.6\)](#)

[arXiv:0901.0002 \(MSTW 2008\)](#)

- ▶ errors obtained in χ^2 fit

$$\text{simplest version: } \chi^2 = \sum_i \frac{[D_i - T_i(\mathbf{p})]^2}{\sigma_{i,\text{stat}}^2 + \sigma_{i,\text{syst}}^2}$$

D_i = data point number i

T_i = corresponding theory prediction

$\mathbf{p} = \{p_1, \dots, p_k\}$ = set of fitting parameters

more sophisticated treatment for correlated systematic errors,
i.e. **overall normalization**

$$\chi^2 = \sum_i \frac{[D_i - T_i(\mathbf{p})]^2}{\sigma_{i, \text{stat}}^2 + \sigma_{i, \text{syst}}^2}$$

if assume that errors of D_i follow a **Gaussian** distribution, then

- ▶ fitted \mathbf{p} follow a k -dim. Gaussian dist. around true values \mathbf{p}_0
- ▶ have k -dim. χ^2 distribution for

$$\Delta\chi^2(\mathbf{p}) = \chi^2(\mathbf{p}) - \chi_{\min}^2 = \sum_{ij} (p - p_0)_i H_{ij} (p - p_0)_j$$

H = **Hesse matrix** = **inverse of covariance matrix V**

- ▶ observable $\mathcal{O}(\mathbf{p})$ follows Gaussian dist. with error

$$\Delta\mathcal{O} = T \sqrt{\sum_{ij} \frac{\partial\mathcal{O}}{\partial p_i} H_{ij}^{-1} \frac{\partial\mathcal{O}}{\partial p_j}}$$

with $T = 1$ for 68% C.L., $T = 2.71$ for 95% C.L. etc.

readily generalizes to several obs. and their correlated errors

↪ complicated in practice, would need derivatives $\partial\mathcal{O}/\partial p_i$

$$\Delta\mathcal{O} = T \sqrt{\sum_{ij} \frac{\partial\mathcal{O}}{\partial p_i} H_{ij}^{-1} \frac{\partial\mathcal{O}}{\partial p_j}}$$

- ▶ diagonalize Hesse matrix H and rescale eigenvectors
 \Rightarrow linear combinations z_i of $(p - p_0)_j$ satisfying

$$\Delta\chi^2 = \sum_i z_i^2$$

$$\Delta\mathcal{O} = T \sqrt{\sum_i \frac{\partial\mathcal{O}}{\partial z_i} \frac{\partial\mathcal{O}}{\partial z_i}} = \sqrt{\sum_i \left[\frac{\mathcal{O}(S_i^+) - \mathcal{O}(S_i^-)}{2} \right]^2}$$

with **eigenvector PDF sets** S_i^\pm

corresponding to parameters $z_i = \pm T$ and $z_j = 0$ for $j \neq i$

in last step have linearized \mathcal{O} around $z = 0$

- ▶ for large errors $\Delta\chi^2$ not quadratic in $(p - p_0)_i$ or z_i
 \rightsquigarrow linear error propagation not reliable
 \rightsquigarrow Lagrange multiplier method (not discussed here)

see e.g. CTEQ, hep-ph/0101051

The tolerance criterion

- ▶ if data points D_i follow Gaussian distribution then experiment with N_j data points contributes $\chi_{j,\min}^2 \sim N_j$ to global χ_{\min}^2
- ▶ not always seen in practice: for some cases
 - ▶ $\chi_{j,\min}^2$ significantly below or above N_j
 - ▶ $\chi_{j,\min}^2$ much larger than χ^2 minimized separately for experiment

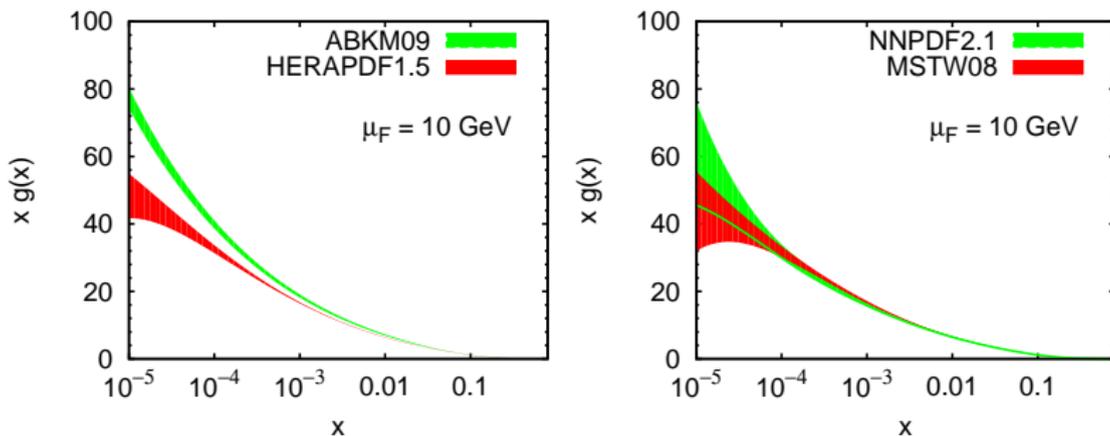
may be due to inconsistent data sets, shortcomings of theory description or of PDF parameterization
in such a case standard χ^2 errors misrepresent uncertainty
- ▶ modified criterion for T adopted by groups CT, MSTW, JR
 - ▶ obtained by procedure/algorithm looking at χ^2 from individual experiments
 - ▶ may be seen as ad hoc deviation from “standard statistics”
but “standard criterion” for T requires that all data points have Gaussian dist. with quoted uncertainties

The NNPDF approach

- ▶ to avoid bias due to functional form of PDFs, use very flexible functions (called “neural networks”) with large number of free parameters (about $10\times$ more than in standard approach)
- ▶ standard χ^2 fit then not possible, instead
 - ▶ generate Monte Carlo ensemble of replicas of original data (typically $N_{\text{rep}} = 100$ or 1000), according to central values and errors of measurement
 - ▶ in each replica divide data into “training” and “validation” set
 - ▶ for each replica minimize χ^2 on training set until χ^2 of validation set starts to increase (thus avoiding to fit “noise in the data”)
- ▶ central values and uncertainties on observable (or on PDFs themselves) given by ensemble average etc.

$$\bar{\mathcal{O}} = \frac{1}{N_{\text{rep}}} \sum_r \mathcal{O}_r \quad (\Delta\mathcal{O})^2 = \frac{1}{N_{\text{rep}} - 1} \sum_r (\mathcal{O}_r - \bar{\mathcal{O}})^2$$

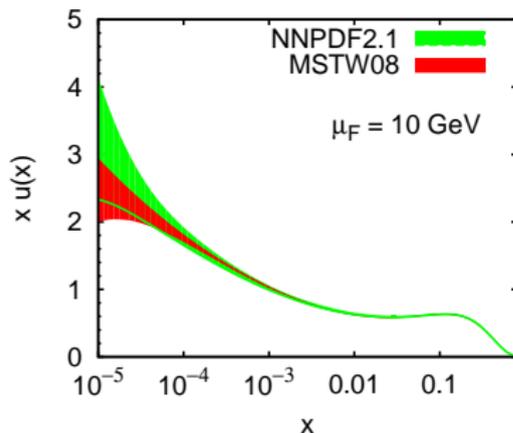
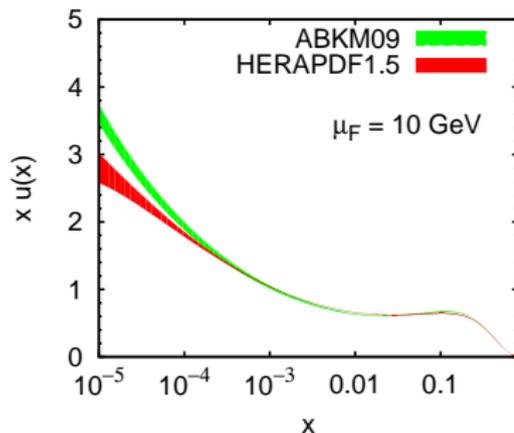
Illustration of PDF sets and their errors



error bands for 68% CL

- ▶ spread between different parameterizations often larger than error bands of single parameterization
- ▶ error bands propagate uncertainties of fitted data into PDFs but do **not** reflect “systematic theory uncertainties” of PDF extraction

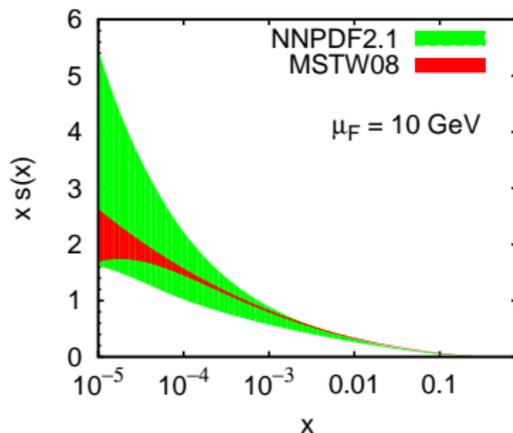
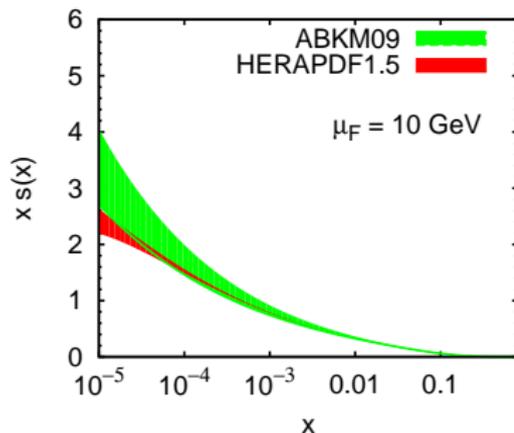
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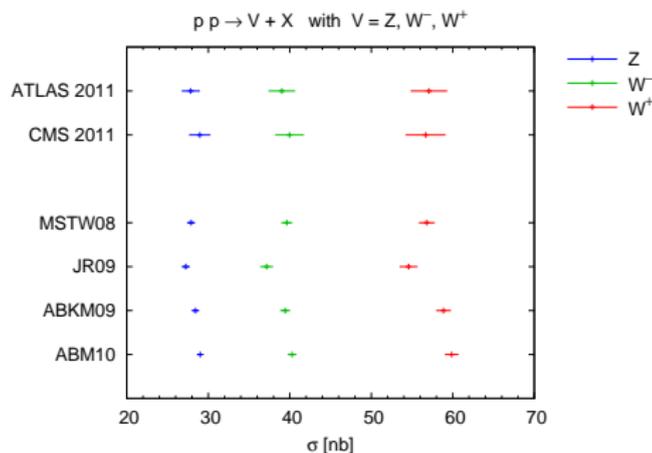
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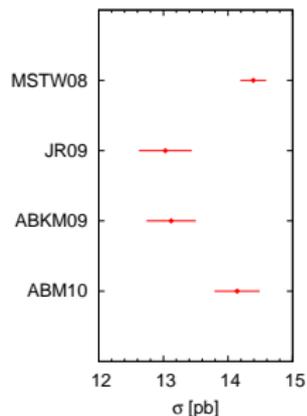
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$p p \rightarrow H + X$ for $m_H = 125$ GeV



benchmark NNLO cross sections at $\sqrt{s} = 7$ TeV from Alekhin et al., arXiv:1011.6259

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Summary

- ▶ estimating theoretical uncertainties \neq an exact science
- ▶ “scale uncertainty” based on renormalization group eq. estimates **certain** higher-order terms in α_s
prescriptions for scale choice = educated guesses
- ▶ higher orders in pert. theory **not** the only source of uncertainty
full final state details, hadronization corrections, ...
are more difficult to quantify
- ▶ errors of PDF fits reflect uncertainties of fitted data
(**not always a straightforward exercise in textbook statistics**)
do **not** include uncertainties of theory used to fit data