





NNPDF Status and Plans

Juan Rojo STFC Rutherford Fellow Rudolf Peierls Center for Theoretical Physics University of Oxford





Juan Rojo

Parton Distributions for the LHC, Benasque Center for Science, 16/02/2015

The NNPDF Timeline

2008	MNPDF1.0: DIS only, fixed strangeness
	Building on previous fits to F2NS (2002), F2 proton (2005) and qNS (2007)
2009	MNPDF1.2: DIS only, strangeness from neutrino dimuon data
	Impact on the NuTeV anomaly, precision determination of Vcs
2010	MNPDF2.0: first global PDF fit with Drell-Yan, W,Z and jet production data, ZM-VFN
	Included for first time combined HERA-I data, studies of combined PDF+alphas unc
01/2011	MNPDF2.1 NLO: heavy quark effects with FONLL, charm and bottom mass variations
	Combined PDF+mc uncertainties, inclusion of HERA F2charm data
07/2011	MNPDF2.1 NNLO and LO: first LO and NNLO sets
	FONLL-C GM-VFN scheme, LO vs LO* PDFs study
2012	MNPDF2.3: first global PDF fit included ATLAS, CMS and LHCb constraints
	ATLAS jets and W,Z, CMS W asymmetry, LHCb W rapidity + NNPDF2.3QED
	Reference internal PDF set in Pythia8 and in MadGraph5_aMC@NLO
10/2014	MNPDF3.0 : major update following a complete rewriting of the code in C++ and Python , methodology validated on closure tests, > 1000 data points from HERA-II and LHC, approximate NNLO for jets
	Quantitative understanding of the different statistical origin of PDF uncertainties
V	Reference internal PDF set in Sherpa 2.2.0

NNPDF3.0 is really NNPDF++

Completely rewritten Fortran NNPDF fitting code into C++ and Python: massive code development effort, > 2 years to complete

Modular structure: each dataset is now an individual object, with the associated theory encapsulated in individual **FK tables**: easy to include new measurements, to upgrade theory for existing ones

M This new efficient code is the key to be able to perform systematic studies of the PDF fitting methodology like **closure testing**, which were not possible with the old Fortran code

Greatly improved fitting efficiency: main bottleneck for PDF fits is convolution between input PDFs and theory, performed here with **assembly-like structure**

Generalized PDF parametrization: fits can now be performed in any **arbitrary input PDF basis**, with new self-consistent method to determine **preprocessing exponent ranges**

Optimisation of the **generalised positivity of PDFs**: crucial for robust estimates of PDF errors in extrapolation regions

These technical and conceptual improvements guarantee **robustness and stability for NNPDF development** in the medium and long term

✓ Now working in integrating APFEL in NNPDF with APFELcomb, to be able to include straightforwardly in the NNPDF fits new theory developments like resummations, intrinsic charm, scale variations, new QCD+QED fits

Validation and optimization of fitting strategy performed on closure test with known underlying PDF set



***** Level 0: no fluctuations on pseudo-data, no Monte Carlo replica generation

***** Level 1: with fluctuations on pseudo-data, no Monte Carlo replica generation

* Level 2: with fluctuations on pseudo-data, with Monte Carlo replica generation

Level 0 Closure Tests:

- **Central values of input PDF** reproduced with arbitrary accuracy
- **PDF uncertainties on the fitted data points** can become arbitrarily small

Genetic Algorithms minimization efficiency substantially improved wrt NNPDF2.3

$$\varphi_{\chi^2} \equiv \sqrt{\langle \chi^2[\mathcal{T}[f_{\text{fit}}], \mathcal{D}_0] \rangle - \chi^2[\langle \mathcal{T}[f_{\text{fit}}] \rangle, \mathcal{D}_0]} \,.$$



Measure of PDF uncertainties in the fitted cross-sections

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Level 2 Closure Tests:

Mathebasic Reproduced χ^2 of input PDF - both total and individual experiments

Fitted PDF central values fluctuate around input values by the same amount as

expected from the size of the PDF uncertainties

Difference between fit and input PDFs central values in units of the PDF uncertainties



Comparing Level 0, 1 and 2 closure tests provide a quantitative determination of the different components of the total PDF uncertainty:

Level 0: *Extrapolation* **uncertainty**, due to limited kinematical coverage of experimental data. Here best-fit PDF uniquely defined - the input PDF set

Sectional uncertainty, where a large number of different functional forms can provide an equally good fit to the pseudo-data (which now includes fluctuations)

Level 2: *Experimental* data uncertainty, due to the genuine fluctuations in the experimental measurements around their true value

In regions with experimental data, the **three components are of similar size**: mandatory to include all of them for a robust estimate of PDF uncertainties



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Closure Testing - What's next?

Closure tests introducing artificial inconsistencies between datasets: does the interpretation of PDF uncertainties change? Can we understand this way the values of the tolerances used by CT and MMHT?

Closure tests including **theory systematics**: can we test their statistical interpretation? What happens if different probability distributions for the theory (gaussian, flat, ...) are used?

Closure tests to optimize **experimental measurements**. Very clean tool to diagnose the best way to **present data**, in terms of binning, breakup of errors etc....

For instance we found that **finner binning** is always preferable to **smaller uncertainties**, since the latter is more sensitive to **functional and extrapolation PDF uncertainties** (similar remarks by Pavel)

Closure tests might provide also a unique, very clean, framework for **PDF benchmarking exercises**

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NNPDF Plans - Experimental Data

First of all, we plan to include the final **HERA legacy dataset (March 2015)** as soon as it is released (but note that NNPDF3.0 already includes all published HERA-II inclusive data!)

W We keep also including LHC measurements: **ATLAS 2011 inclusive jets and dijets**, **ATLAS/CMS top quark pair differential distributions**, **ATLAS W+charm**, **CMS 2012 Drell-Yan**, LHCb Z rap distributions, direct photon production, **Z pt distributions**,

With available data, **collider-only PDFs** are still subject to **rather larger uncertainties than in global fits**, but as more and more data becomes available, the differences will be reduced



"ATLAS Global fit" based on NNPDF3.0

Pinning down the photon PDF

At Run II, some interesting EWK measurements that have been proposed to constrain the photon PDF

For instance, the triple differential measurement of Drell-Yan cross-sections in **invariant mass, rapidity and lepton transverse momentum** allows to neatly disentangle photon PDF effects from other EWK effects



We plan to produce a NNPDF3.0QED fit using the **aMCfast** interface to the upcoming **QED+EW capabilities of MadGraph5_aMC@NLO** and updated LHC data sensitive to the photon PDF

We also plan to systematically include EWK corrections in NNPDF using aMCfast

Theoretical uncertainties on PDFs

Perhaps one of the most urgent topics that PDF fitters need to tackle as soon as possible is that of the **theoretical uncertainties on PDFs**

☑ Assessing TH uncertainties on PDFs is really crucial to establish the robustness of PDF predictions at the LHC and ensure that there are no hidden systematics

A very crude estimate of how large TH uncertainties might be can be provided by comparing PDFs at **different perturbative orders**



Other options that should be explored are scale variations, the Cacciari-Houdeu method
Challenging task, but we cannot avoid it for longer

Theoretical uncertainties on PDFs

The recent updates of the three global PDF sets agree reasonably well for ggHiggs

But is the picture **robust once we include theoretical uncertainties in the PDF fits**? What about other **theory systematics like heavy quark masses**? This is a really important issue for our community!



Improving heavy quark treatment

W We are working on extending the **FONLL GM-VFN scheme** to include **MSbar running masses** and the possibility of **intrinsic charm**

The effect of the **pole -> MSbar scheme change on F2charm**, keeping the same numerical value of the charm mass fixed, is moderate, <10% in the relevant region but **not negligible** (1% effect at the inclusive level)

Markov In our next release, NNPDF3.1, we will provide a **range of variations in the charm and bottom masses**, important to estimate the **combined PDF+mc/mb uncertainties**



Beyond fixed-order QCD

W we are also working on PDF fits beyond fixed-order QCD, with **large-***x* **(threshold) resummations** and **small-***x* **(high-energy) resummation**

Threshold resummation could important for large-*x* DIS (fixed-target data) and for Drell-Yan at large rapidities, although in these processes perturbative convergence is rather good

M Plan to produce for the first time **NNLO+NNLL resumed PDFs** (which can be used consistently with resumed calculations for Higgs, ttbar, etc) and **approximate N3LO PDFs**



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High-energy resummation



✓ Possible departures from linear DGLAP evolution at small-*x* due to BFKL (high-energy) resummation, saturation or non-linear QCD effects, still need to be robustly identified

The recent **HERAPDF2.0** analysis, using the HERA legacy data, shows a strong trend toward linear DGLAP might have trouble to describe the low Q2 data

To verify if this is a genuine BFKL effect, we plan to produce **NNPDF fits** with small-x resummation

✓ If this trend cured by resummation, this would provide the first unambiguous evidence for BKFL dynamics at small-x, with important implications at the LHC

PDFs and Monte Carlo generators

PDFs are an essential ingredient for the **tuning of soft and semi-hard physics** in LO Monte Carlo event generators like **Pythia8**, **Herwig++** or **Sherpa**

Most updated tune of **Pythia8**, the **Monash 2013 Tune**, is based on the **NNPDF2.3LO** set. Same for the **dedicated ATLAS14 (A14) tune**

The harder small-x gluon in NNPDF2.3LO helps to improve the description of the LHC forward data



PDF fits at NLO+PS accuracy

NLO+PS is current standard for LHC event simulation, and **improves in many directions over fixed-order NLO results**: improved pert. behaviour, direct relation with measured quantities, less need for kin cuts ...

Using NLO+PS calculations in global PDF fits should have many important applications, like for the W mass among others, and is now technically possible thanks to aMCfast, the fast interface to MadGraph5_aMC@NLO based on the applgrid library

Prediction for $e^+\nu$ production (PYTHIA8) 800 600 ME(NNPDF) + PS(Internal) dσ∕dy_₩ (pb) 400 ME(NNPDF) + PS(NNPDF)ME(ABM) + PS(Internal)200 ME(ABM) + PS(ABM)ME(NNPDF) + PS(Internal) grid conv. with ABM 1.050 1.025 .000).975 .000).975).950 1.10 1.05 1.00 0.95 0.90 -20 2 Уw

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aMCfast: Bertone, Frixione, Frederix, J.R., Sutton, arXiv:1406.7693 (for NLO), NLO+PS in preparation

> One crucial aspect to explore is the role of the PDF used by the MC shower, since this is fixed even in the fast NLO+PS grid

Quite small effect in most observables, except **extreme kinematics** like forward rapidities

aMCfast makes possible to include easily **hadronlevel measurements** directly into PDF fits

Compressed Monte Carlo PDFs

Motivation: provide a practical implementation of the **PDF4LHC recommendation**, **easy to use** by the experiments and **computationally less intensive** that the original prescription

Having a **single combined PDF sets** (even with large number of eigenvector/replicas) would already be useful since widely-used tools like MadGraph5_aMC@NLO, POWHEG or FEWZ provide the **PDF uncertainties without any additional cost**

But this is not true for all theory tools used at the LHC, so there is still a good motivation to be able to use a combined PDF set with a **small number of eigenvectors/replicas**

GMC-PDFs based on the **Monte Carlo statistical combination** of different PDF sets, followed by a **compression algorithm** to end up with a reduced number of replicas

Free Monte Carlo combination has a **robust statistical interpretation**, and in many cases leads to similar results, with somewhat smaller uncertainties, compared to the **original PDF4LHC envelope**.



Open markers: usual best-tit and 68% C.L. Hessian uncertainty. Closed markers: average and s.d. over random predictions.



Open markers: usual best-tit and 68% C.L. Hessian uncertainty. Closed markers: average and s.d. over random predictions.

Basic strategy

The MC combination of PDF sets is easy, but **number of MC replicas still too large**

Compress the original probability distribution to one with a **smaller number of replicas**, in a way that all the relevant estimators (mean, variances, correlations etc) for the PDFs are reproduced



$$ERF_{KOL} = \frac{1}{N_{KOL}} \sum_{i=-n_f}^{n_f} \sum_{j=1}^{N_x} \sum_{k=1}^{6} \left(\frac{F_i^k(x_j, Q) - G_i^k(x_j, Q)}{G_i^k(x_j, Q)} \right)^2$$
$$N_{KOL} = \frac{1}{N_{\text{rand}}} \sum_{d=1}^{n_f} \sum_{i=-n_f}^{N_x} \sum_{j=1}^{6} \sum_{k=1}^{6} \left(\frac{R_i^k(x_j, Q) - G_i^k(x_j, Q)}{G_i^k(x_j, Q)} \right)^2$$

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 $\stackrel{\circ}{\Rightarrow}$ The compression is applied at **Q** = 2 GeV, though the results are robust wrt other choices

✓ Various options about how the error function to be minimised can be defined, ie., to reproduce central values add a term

$$ERF_{CV} = \frac{1}{N_{CV}} \sum_{i=-n_f}^{n_f} \sum_{j=1}^{N_x} \left(\frac{f_i^{CV}(x_j, Q) - g_i^{CV}(x_j, Q)}{g_i^{CV}(x_j, Q)} \right)^2$$
$$f_i^{CV}(x_j, Q) = \frac{1}{N_{rep}} \sum_{r=1}^{N_{rep}} f_i^r(x_j, Q)$$

Same for variances, correlations and higher moments

At the end, **optimal choice** decided by the resulting phenomenology

For the algorithm also minimises the **Kolmogorov distance** between the original and compressed distributions

LHC Phenomenology

From The ultimate validation is of course to check that the **compressed set reproduces the original combination** for a wide variety of observables

 $\stackrel{_{\tiny \ensuremath{\wp}}}{=}$ We have tested a very large number of processes, both at the **inclusive and differential level** and always found that N_{rep}=20-30 replicas are enough for **phenomenology**



Correlations

Agreement between original and CMC-PDFs also holds at the level of **cross-section correlations** Not an accident: **selecting replicas at random fails** to reproduce the correlation accurately enough



MC2Hessian

For many important applications, a **linearised Hessian version of Monte Carlo sets**, based on **orthogonal eigenvectors**, would be useful

A MC2Hessian algorithm would allow to use NNPDF and CMC-PDF sets for profiling, as nuisance parameters, construct sets with reduced number of eigenvectors for specific applications like W mass

.... while keeping also the crucial possibility of testing for the potential deviations from Gaussianity of the underlying probability distribution, quantifying the range of validity of linear approximation

Various options possible, for example a la **Meta-PDF**, fit a **functional form** to each of the MC replicas

$$f(x, Q_0; \{a\}) = e^{a_1} x^{a_2} (1-x)^{a_3} e^{\sum_{i \ge 4} a_i} \left[T_{i-3}(y(x)) - 1 \right].$$

But this is subject to the usual **functional bias**.

A more robust choice is to use also **MC replicas as linear expansion basis**:

$$g^{(k)}(x,Q^2) = \sum_{i=1}^{\tilde{N}_{rep}} a_i^{(k)} \tilde{g}^{(i)}(x,Q^2)$$

 $\stackrel{\scriptstyle \vee}{}$ The eigenvectors can then be determined from the a χ^2 defined in the space of PDFs:

$$\chi_{\text{pdf}}^2 \equiv \sum_{x=1}^{N_x} \left(g^{(k)}(x_i, Q_0^2) - \left\langle g^{(k)}(x_i, Q_0^2) \right\rangle \right) (\text{cov}_{ij})^{-1} \left(g^{(k)}(x_j, Q_0^2) - \left\langle g^{(k)}(x_j, Q_0^2) \right\rangle \right)$$

Covariance Matrix in the space of PDFs

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MC2Hessian - Preliminary results

Preliminary results validate this strategy: it is possible to efficiently construct a Hessian representation of NNPDF3.0, or in general of any MC PDF set

✤ In particular, the CMC-PDFs will also be available in a Hessian representation

The comparison between the **original MC representation** of a PDF set and its **Hessian representation** allow to determine the **range of validity** of the latter

For instance, in important cases like **BSM** searches at high-mass, it is know that the **Gaussian approximation** is not adequate



The NNPDF (Future?) Timeline

MNPDF3.0Hessian using the **MC2Hessian** conversion algorithm

MNPDF3.1: includes **legacy HERA data**, **LHC data** on jets, top quark differential distributions, *W*,*Z* rapidity, Drell-Yan. **MSbar running masses**, provide **range of m**_{charm} **and m**_{bottom} **variations**, implications at the LHC

MNPDF3.x with large-x resummation

Markov NNPDF3.x with small-x resummation

Minimum NNPDF3.x for NLO event generators using **aMCfast** and **aMC@NLO**

MNPDF3.x with intrinsic charm

MNPDF3.xQED: precision determination of the **photon PDF** from LHC data. Also **EWK corrections** systematically included in all LHC measurements with aMCfast

☑ Also: determination of the strong coupling, large-x PDFs and impact for searches, comparisons with non-perturbative models of the proton structure

MNPDF4.0 (?) with theoretical uncertainties on PDFs