



# NNPDF 3.0:

A next generation parton set for the LHC

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for the NNPDF collaboration:

R. D. Ball, V. Bertone, S. Carrazza, C. S. Deans, L. Del Debbio, S. Forte, A. Guffanti, N. P. Hartland, J. I. Latorre, J. Rojo, MU

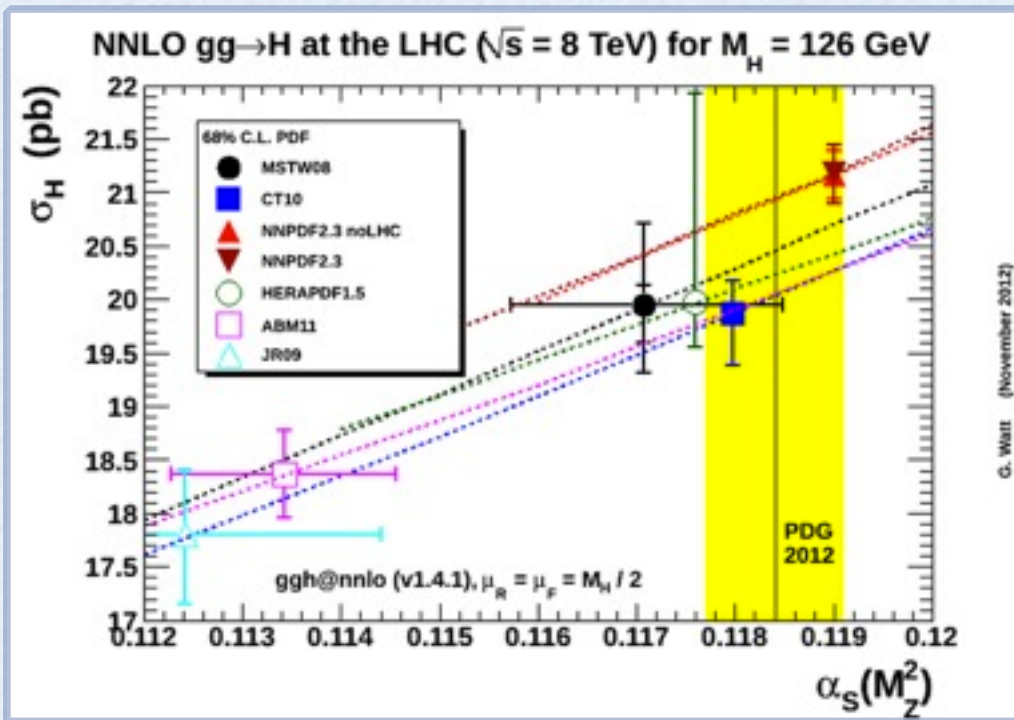


29<sup>th</sup> April 2014

DIS2014 workshop, Warsaw, Poland

# Motivation

## PDFs and LHC interplay

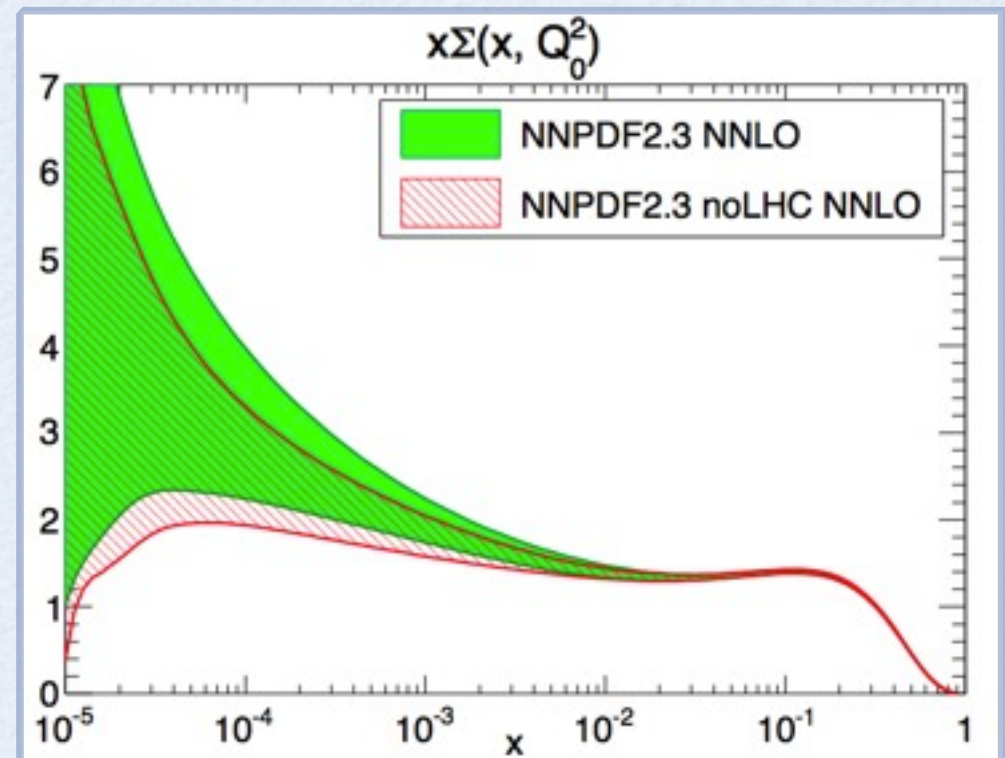


S. Forte, G. Watt, ArXiv:1301.6754

- LHC data provides huge amount of information in kinematical regions where PDFs are not well constrained or rely on fixed-target data: must fully exploit its physics potential

- PDFs are crucial input for the LHC: a faithful determination of PDF uncertainties (experimental, statistical and theoretical) is vital for precision physics and exclusion/discovery in BSM searches

NNPDF, Nucl.Phys. B867 (2013) 244-289



# Outlook

- Introduction
- The NNPDF3.0 parton set
  - New methodology
  - Closure test
  - New data
- Results
  - Description of the LHC data
  - The NNPDF3.0 partons
- Conclusions

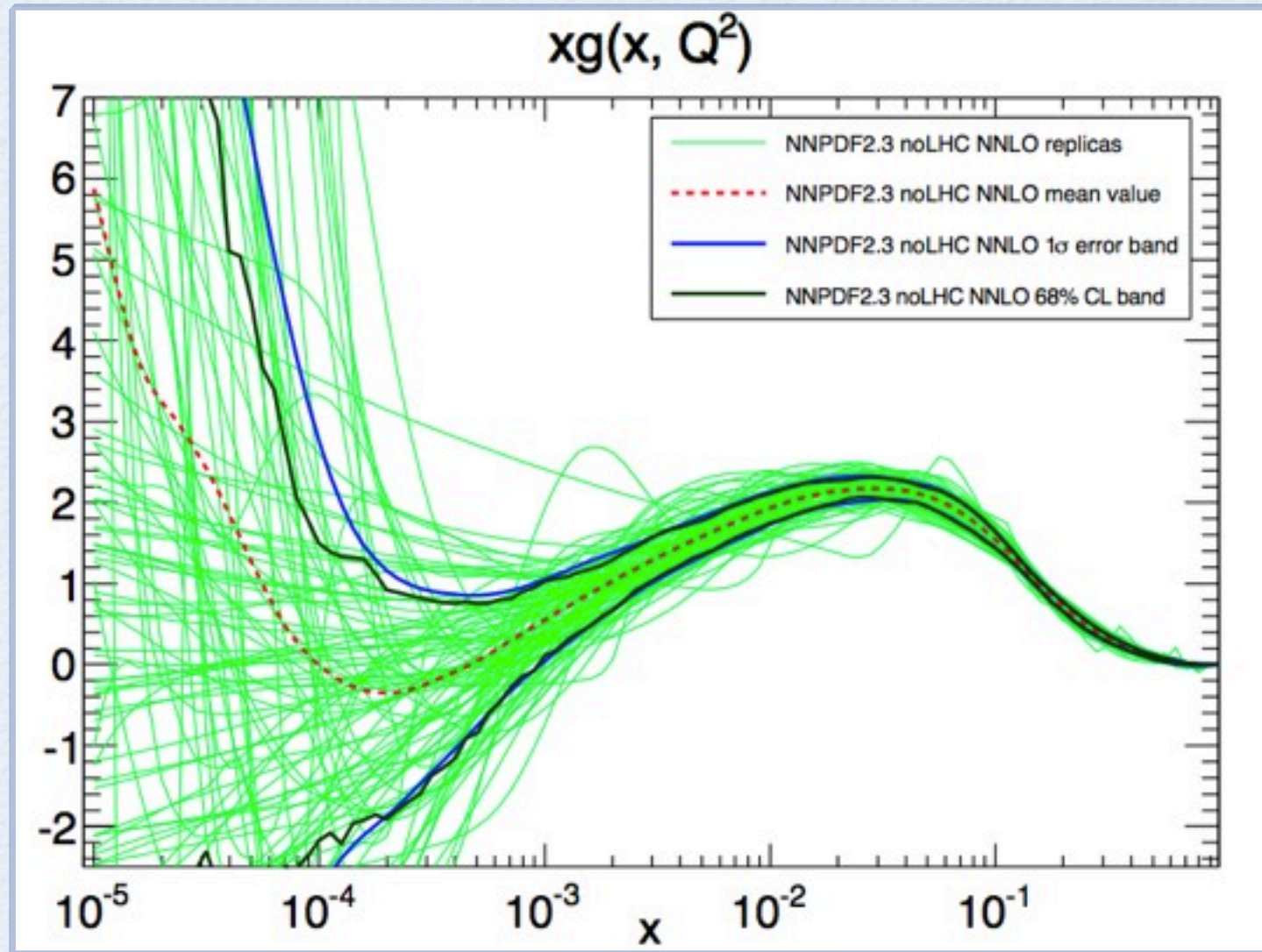
# Introduction

## The NNPDF approach

- Monte Carlo by importance sampling
- Neural Networks as interpolants
- Genetic algorithm for neural network training
- Cross-validation to stop of the minimization

$$\langle \mathcal{O} \rangle = \int \mathcal{O}[f] \mathcal{P}(f) Df$$

$$\frac{1}{N} \sum_{k=1}^N \mathcal{O}[f^{(k)}]$$



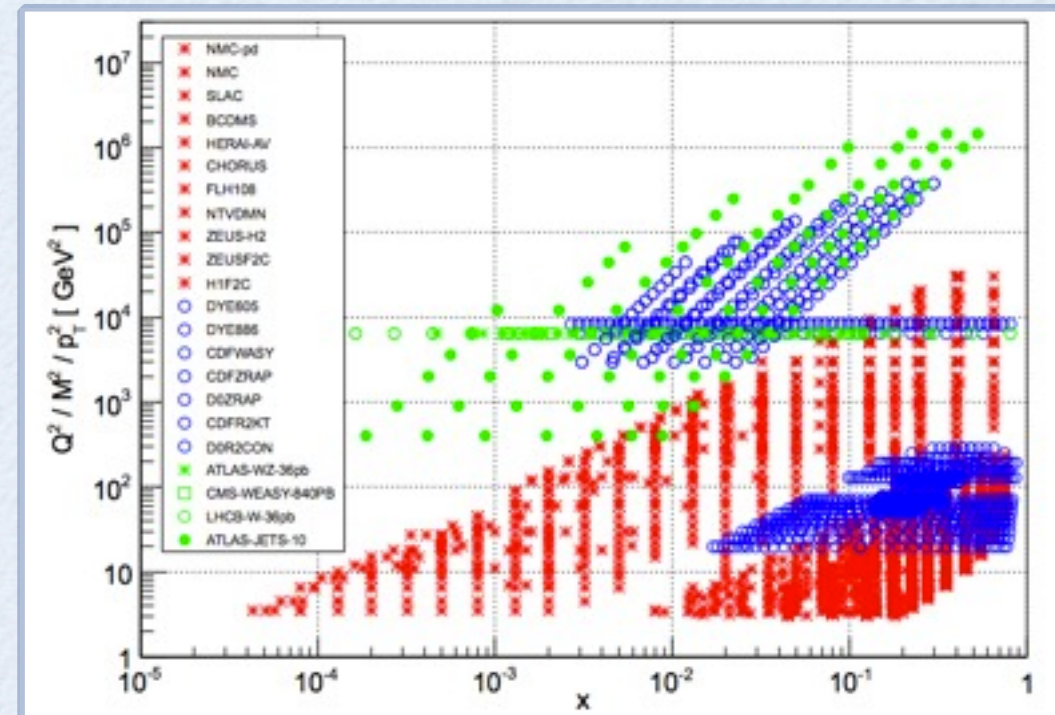
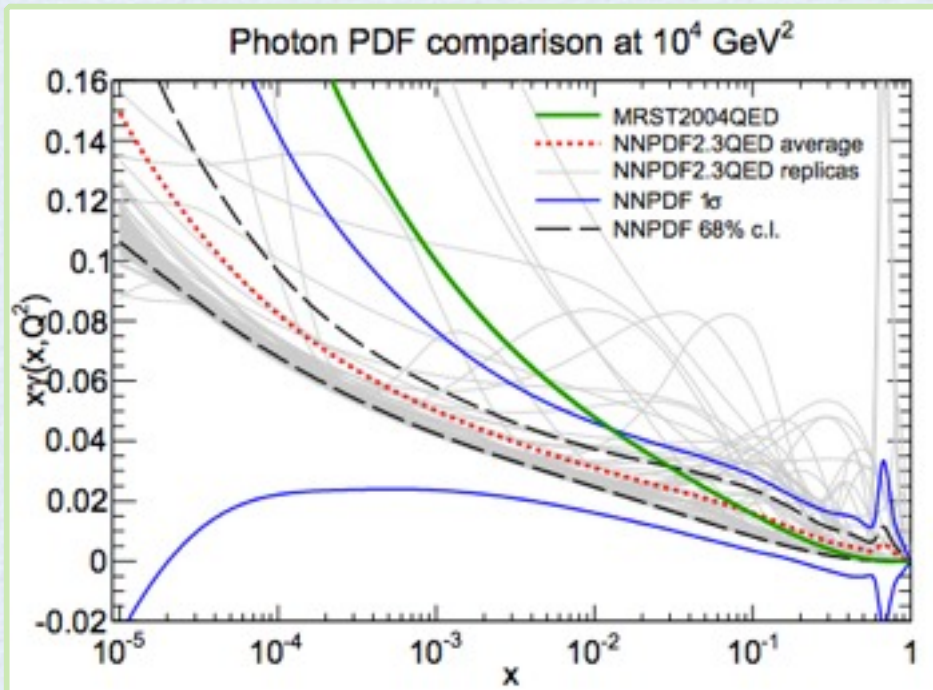
# Introduction

## The NNPDF latest releases

[NNPDF2.3](#): improved genetic algorithm and inclusion of early 2010 LHC data with all information on correlations

- ATLAS W and Z lepton rapidity  $35 \text{ pb}^{-1}$
- ATLAS inclusive jets  $36 \text{ pb}^{-1}$
- LHCb W rapidity at large Y  $36 \text{ pb}^{-1}$
- CMS W electron asymmetry  $36 \text{ pb}^{-1}$

NNPDF, Nucl.Phys. B877 (2013) 2, 290–320



NNPDF, Nucl.Phys. B867 (2013) 244–289

[NNPDF2.3QED](#): PDF set with QED corrections, uncertainty on photon PDF and inclusion of photon-initiated processes at the LHC

- ATLAS W and Z lepton rapidity  $35 \text{ pb}^{-1}$
- ATLAS  $\gamma$  /Z high mass  $4.9 \text{ fb}^{-1}$
- LHCb  $\gamma$  /Z low mass  $37 \text{ pb}^{-1}$

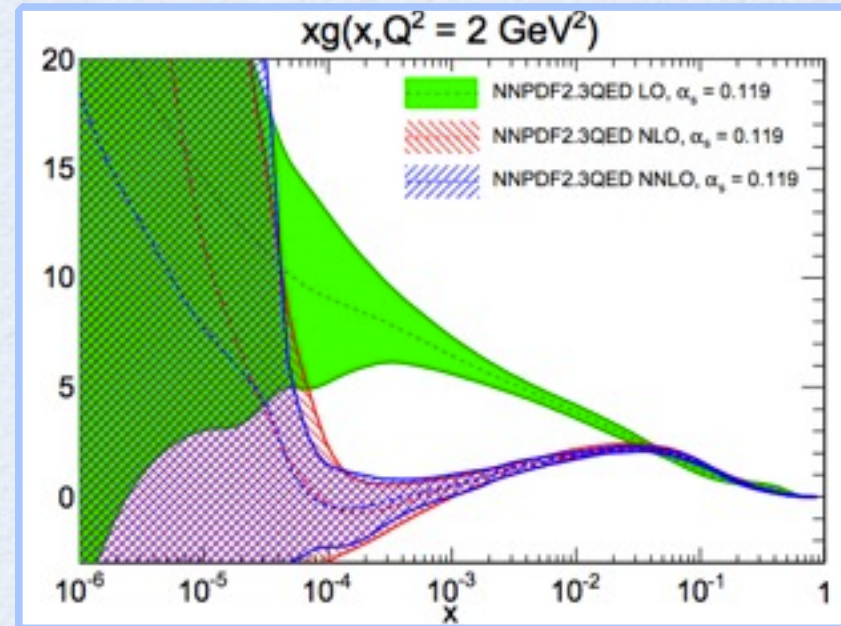
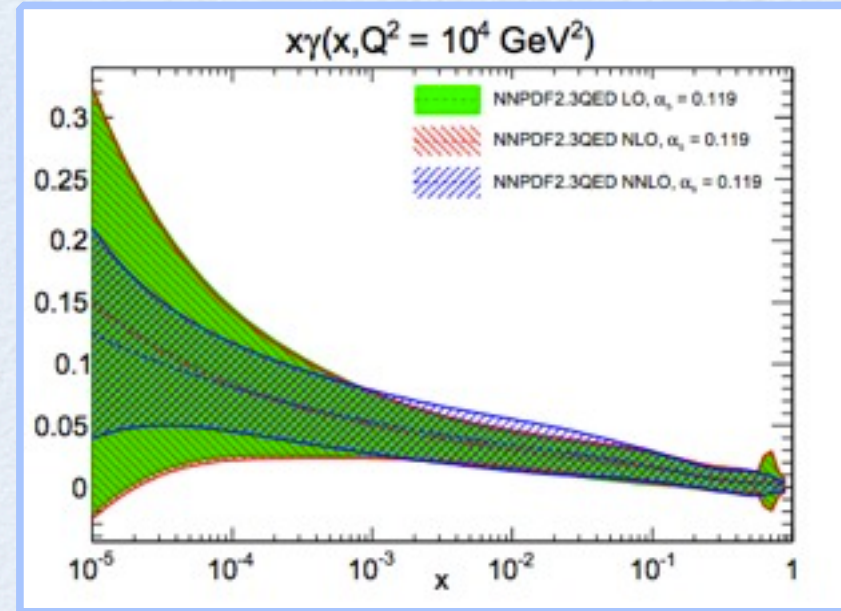
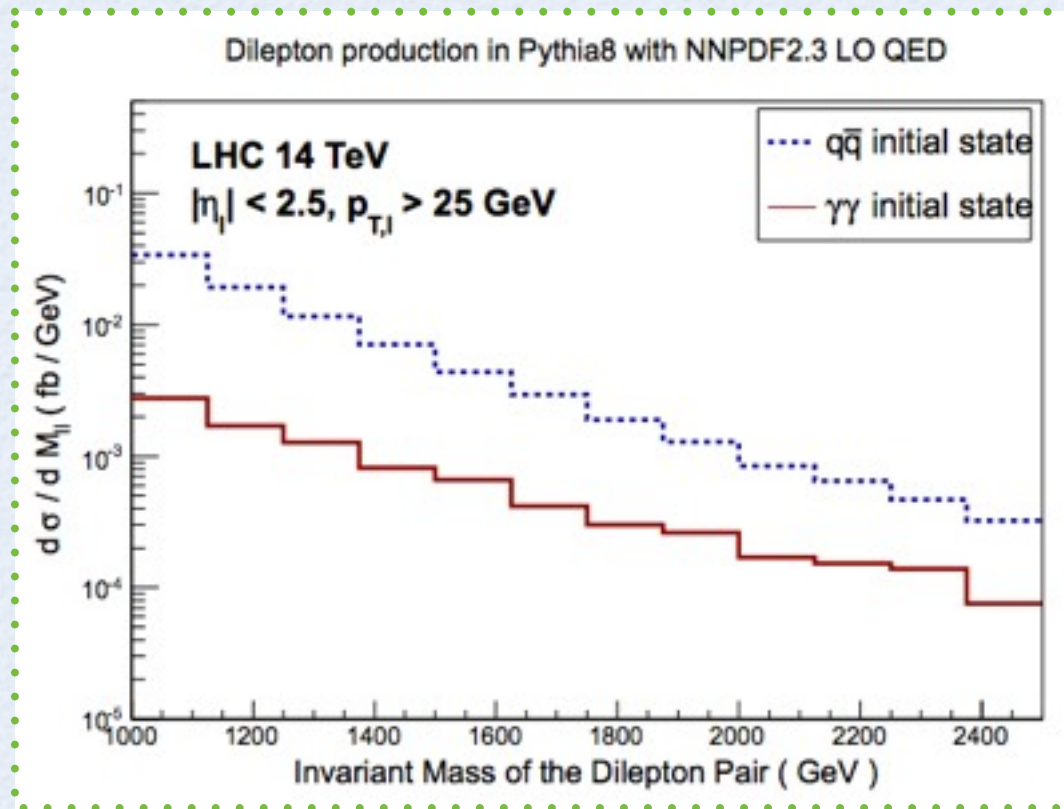
# Introduction

## The NNPDF latest releases

[NNPDF2.3QED@LO](#) : LO PDFs with QED corrections  
photon extracted from same data as NNPDF23 N(N)LO sets, internal set in Pythia8. [s. Carrazza et al, ArXiv: 1311.5887]  
Photon-initiated contribution relevant at large invariant mass. Important for new physics searches.

Employed in the **Monash 2013** tune of Pythia8

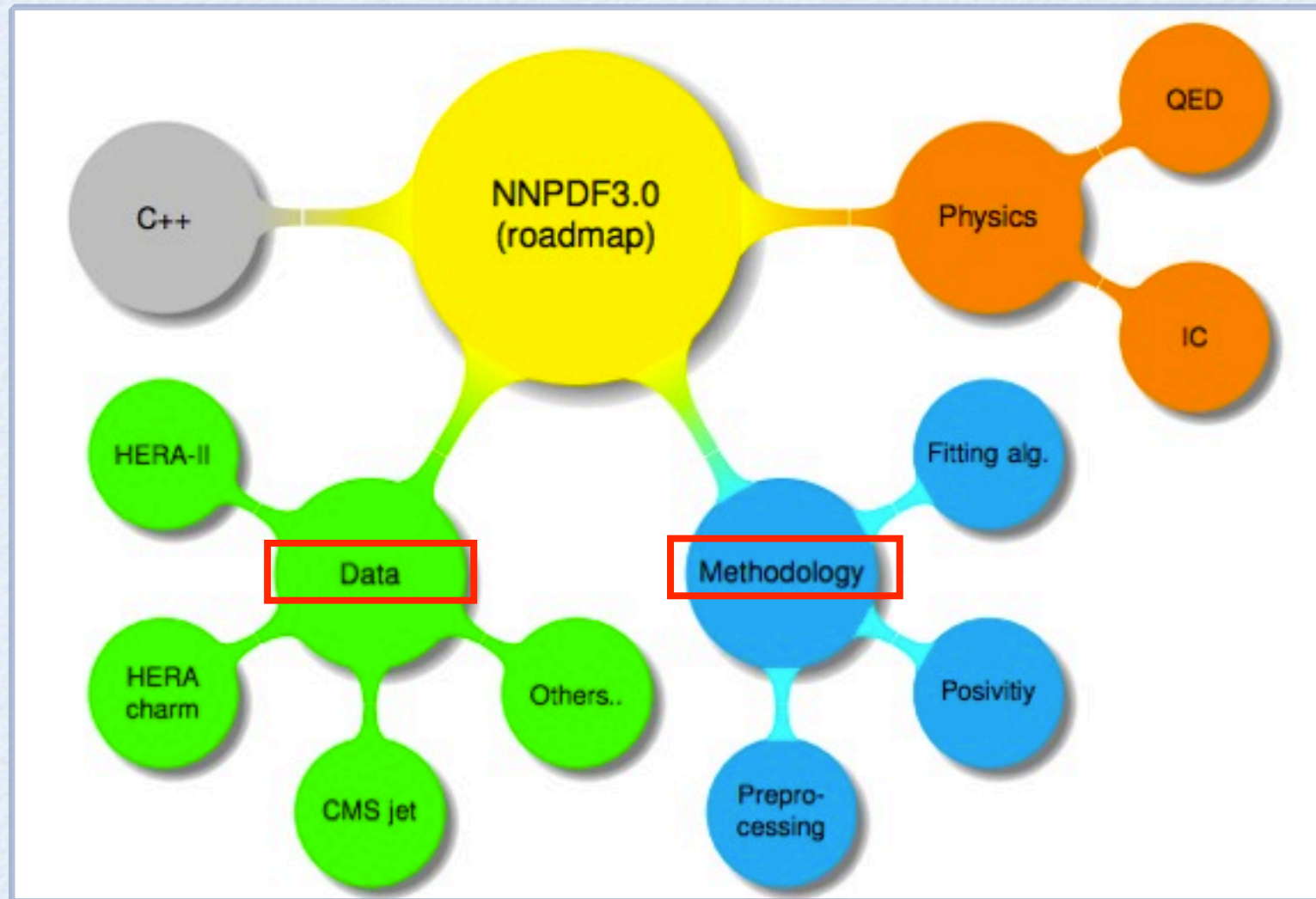
[P. Skands et al, ArXiv: 1404.5630]



# Introduction

## Moving forward: the NNPDF3.0 set

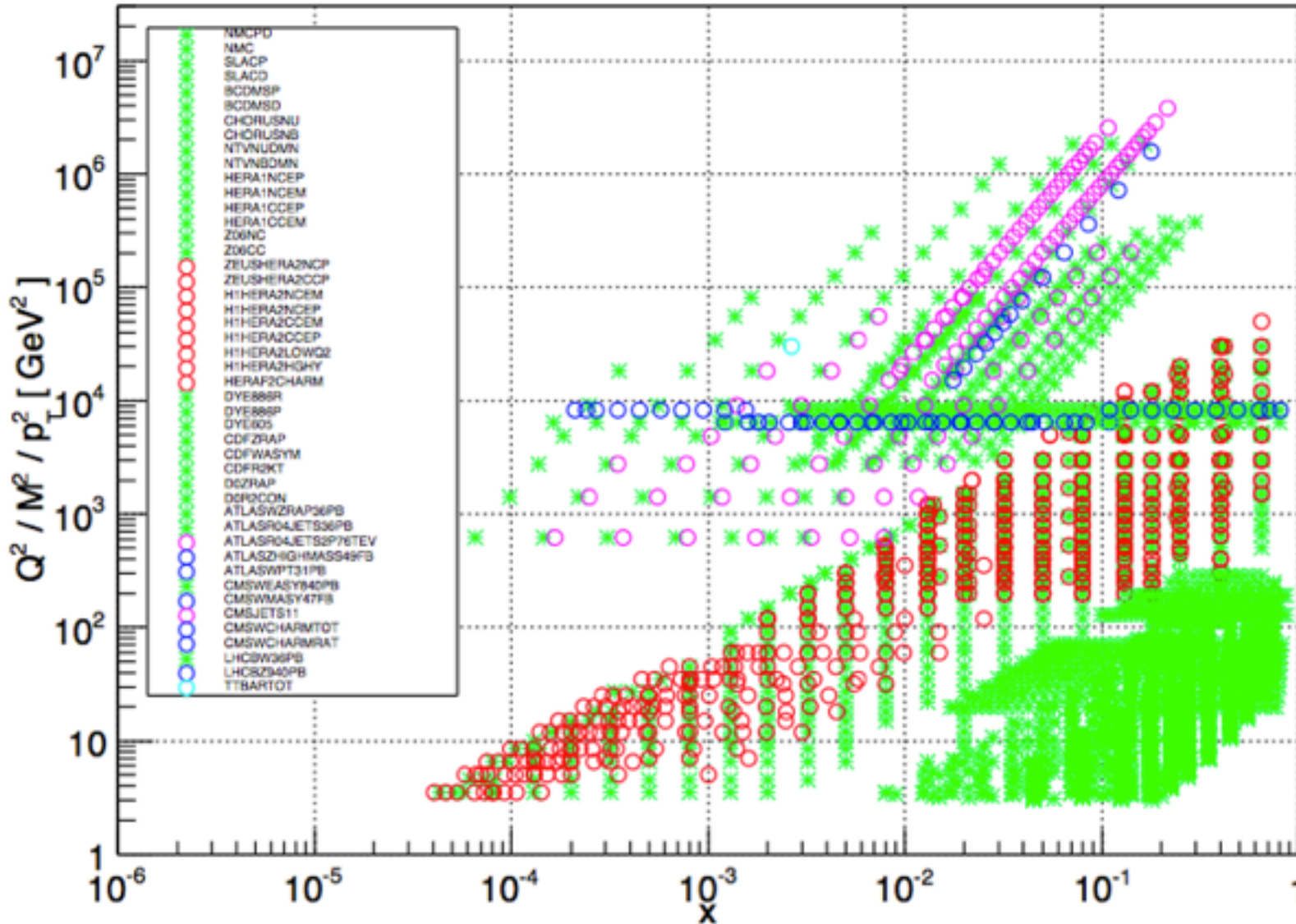
- Major update
- Code completely re-written in `C++`
- Completely re-designed fitting methodology based on closure test with known underlying physical law
- Tested Weight Penalty method based on iterative Bayesian regularization
- More than 1000 new data points from HERA II and LHC



# The NNPDF3.0 set

Data set

## NNPDF3.0 - preliminary



NNPDF23

HERAII

new LHC EW

new LHC jets

LHC tt



# The NNPDF3.0 set

## Data set

### HERAII

- H1 high  $Q^2$  data [JHEP 1209 (2012) 061]  $\rightarrow$  quark at medium and large  $x$
- H1 data at lower CoM energy ( $E_p = 460,575$  GeV) [Eur.Phys.J. C71 (2011) 1579]
- H1 high inelasticity data [Eur.Phys.J. C71 (2011) 1579]
- Combined HERA charm production [Eur.Phys.J. C73 (2013) 2311]  $\rightarrow$  gluon at small/medium  $x$
- ZEUS NC and CC with positron beams [Eur.Phys.J. C70 (2010) 945]

### ATLAS

- Jets 2.76 TeV and 7 TeV [Eur.Phys.J. C73 (2013) 2509]  $\rightarrow$  stronger constraint
- High mass Drell-Yan [Phys.Lett. B725 (2013) 223]  $\rightarrow$  quark-antiquark separation at large  $x$
- W  $p_T$  distributions

### CMS

- Jets 7 TeV  $5\text{fb}^{-1}$  [Phys.Rev. D87 (2013) 112002]  $\rightarrow$  gluon at large  $x$
- DY double differential distributions [JHEP 12 (2013) 30]  $\rightarrow$  flav. separation
- Muon charge asymmetry  $4.7\text{fb}^{-1}$  [ArXiv:1312.6283]
- W + charm [JHEP 02 (2014) 013]  $\rightarrow$  strangeness

### LHCb

- Large rapidity Z distributions [JHEP 1302 (2013) 106]
- + Total  $t\bar{t}$  cross section from ATLAS and CMS (7 and 8 TeV)

O(1000) NEW data points!

Over 4000 data points:

**FastKernel + FASTNLO/APPLgrid**  
**systematically employed!**

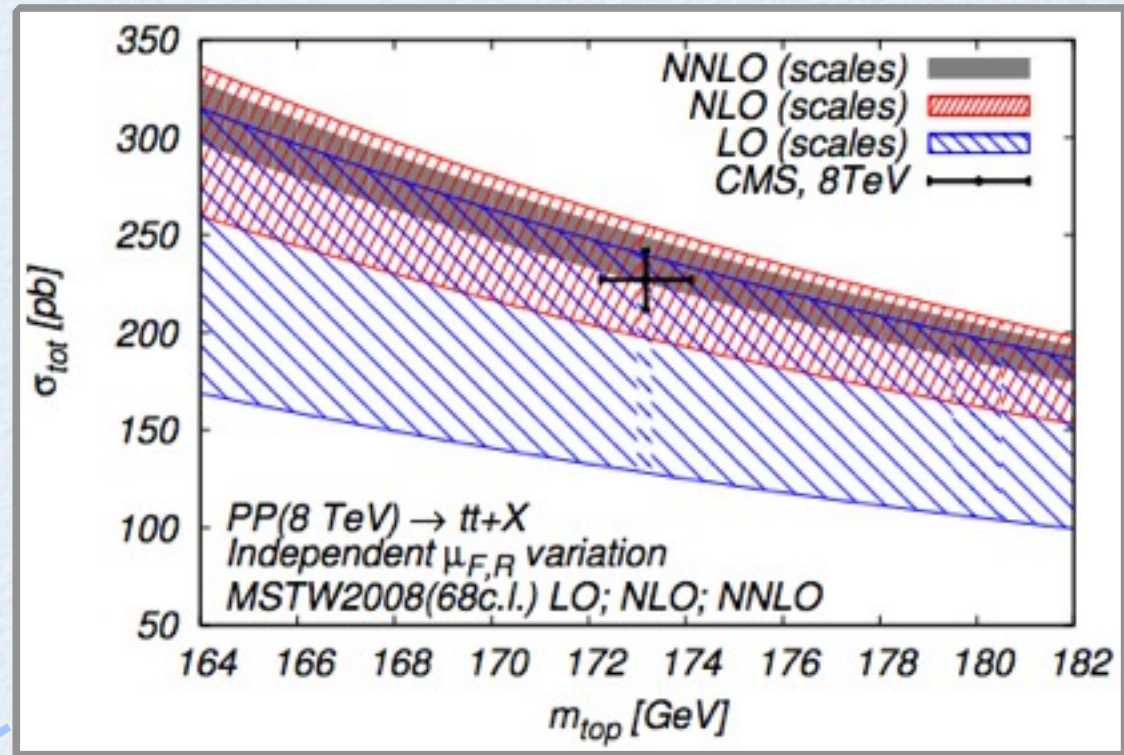
# The NNPDF3.0 set

## Theoretical aspects: higher order corrections

- NNLO calculations are essential to reduce theoretical uncertainties in PDF analyses
- Recently important progress has been made on some key processes

- ▶ Full NNLO top quark production cross section is available (TOP++2.0) and differential distributions are expected soon → gluon at large  $x$
- ▶ H+1j also available now at NNLO, important milestone towards Z,W+1j → gluon & quark separation

If NNLO calculations available, include NNLO corrections via C-factors



Czakon et al., ArXiv:1305.3892

Czakon, Fiedler, Mitov PRL 110 (2013) 25

Boughezal et al, JHEP1306 (2013) 072

- Top quark very promising observable to provide constraint on the gluon

Czakon et al JHEP 1307 (2013) 167

Beneke et al JHEP 1207 (2012) 194

Alekhin et al Phys.Rev. D89 (2014) 054028]

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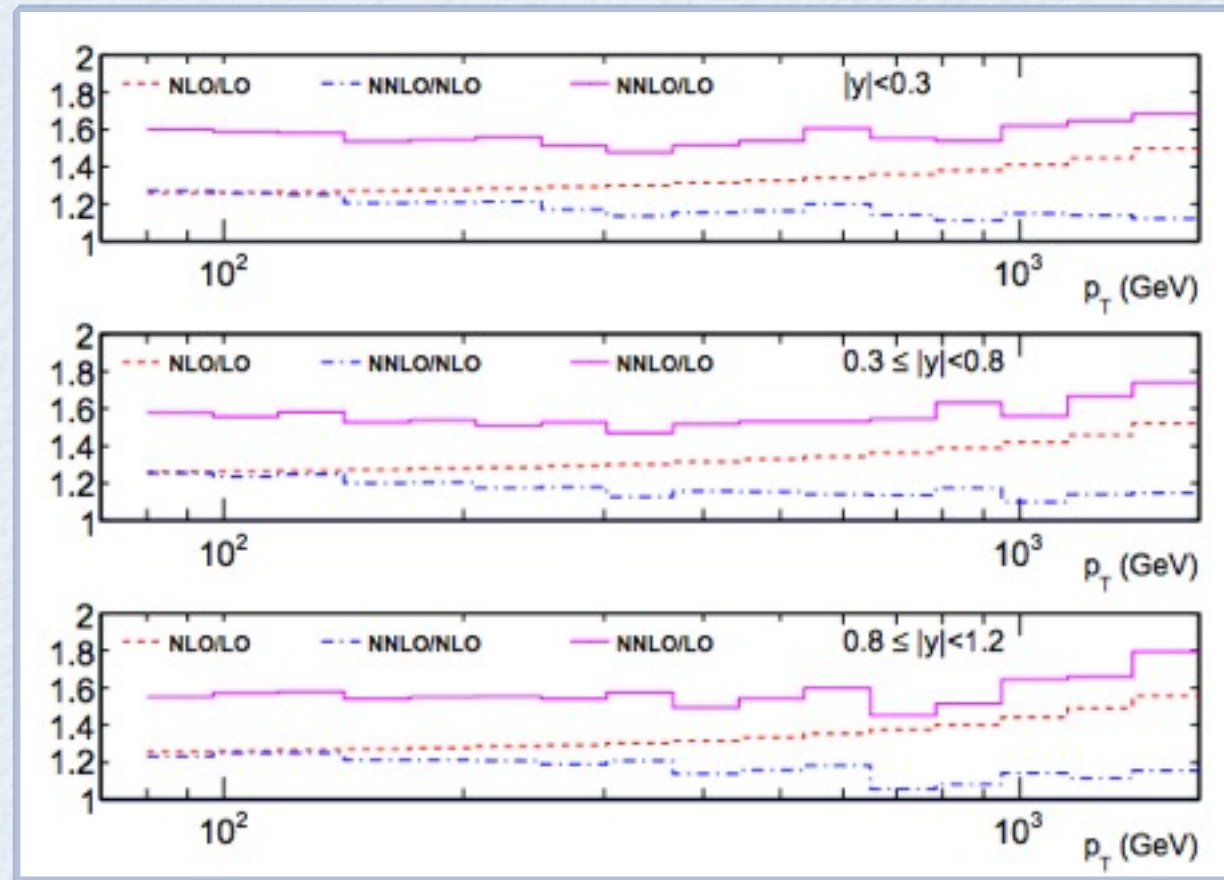
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→ gluon & quark separation

► NNLO inclusive jet production in the gg channel has been completed

→ gluon & quark at large  $x$



Gehrmann-De Ridder et al, Phys.Rev.Lett. 110 (2013) 16

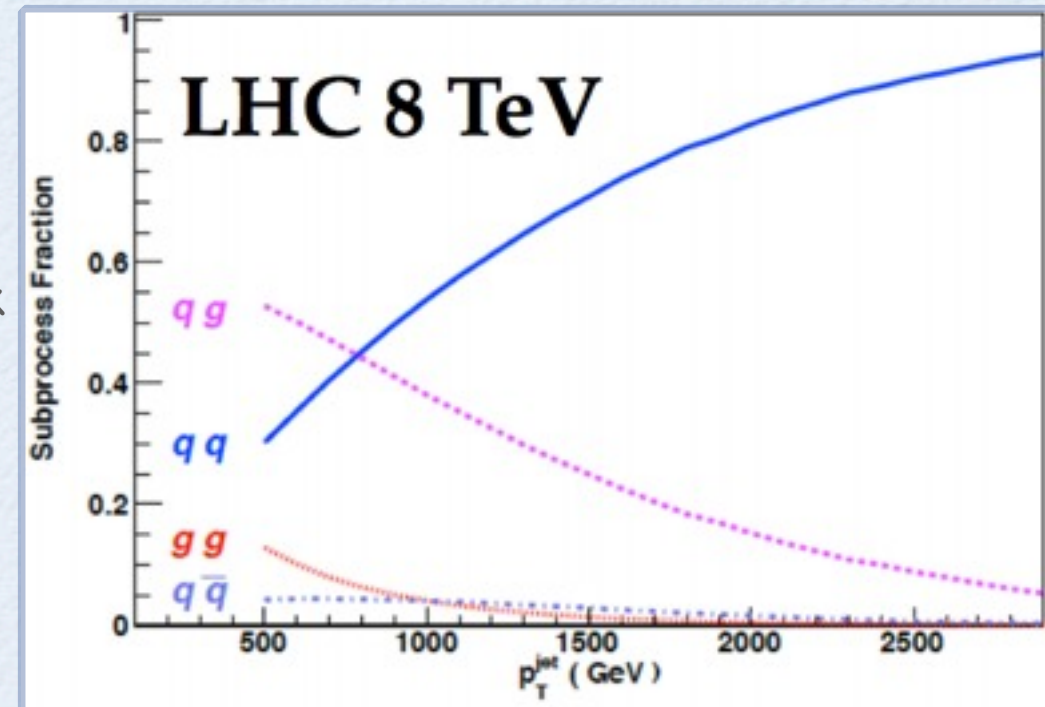
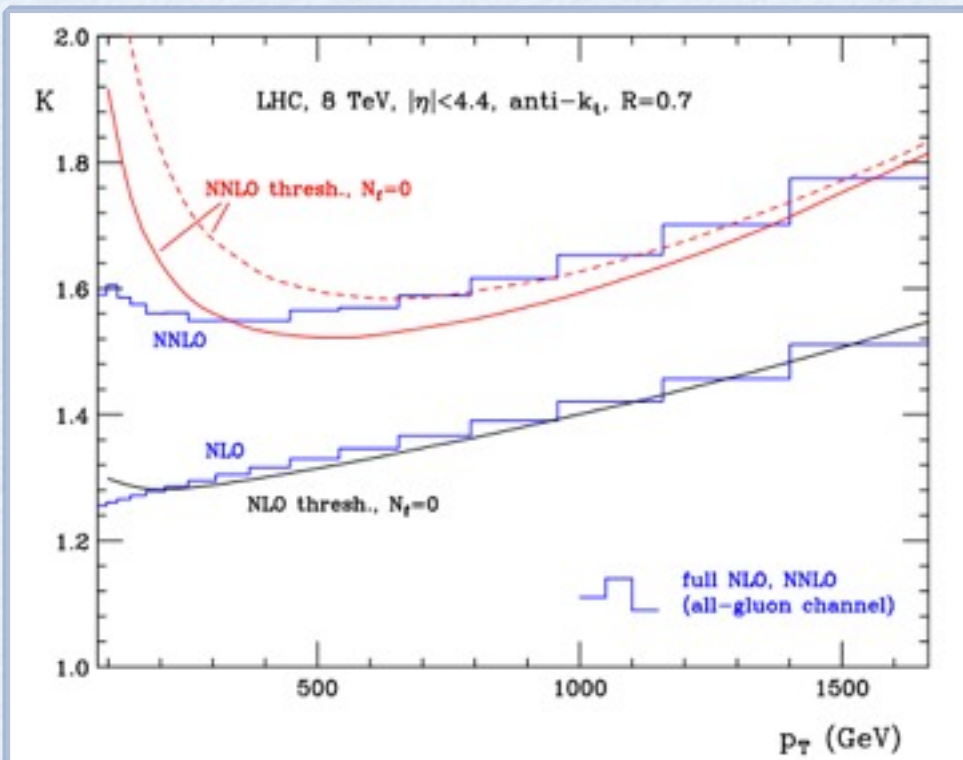
For jets full NNLO calculation is not yet available but...

In gg channel up to 20-25% enhancement of NNLO wrt NLO result

# The NNPDF3.0 set

## Theoretical aspects: jet cross section

- At the LHC gluon-gluon channel is small at medium-large  $p_T$
- Approximate NNLO results can be derived from the improved threshold calculation, reasonable at large  $p_T$  and expected to break down at small  $p_T$
- Approx NNLO is an improved version of Kidonakis et al. [Phys.Rev. D63 (2001) 054019]



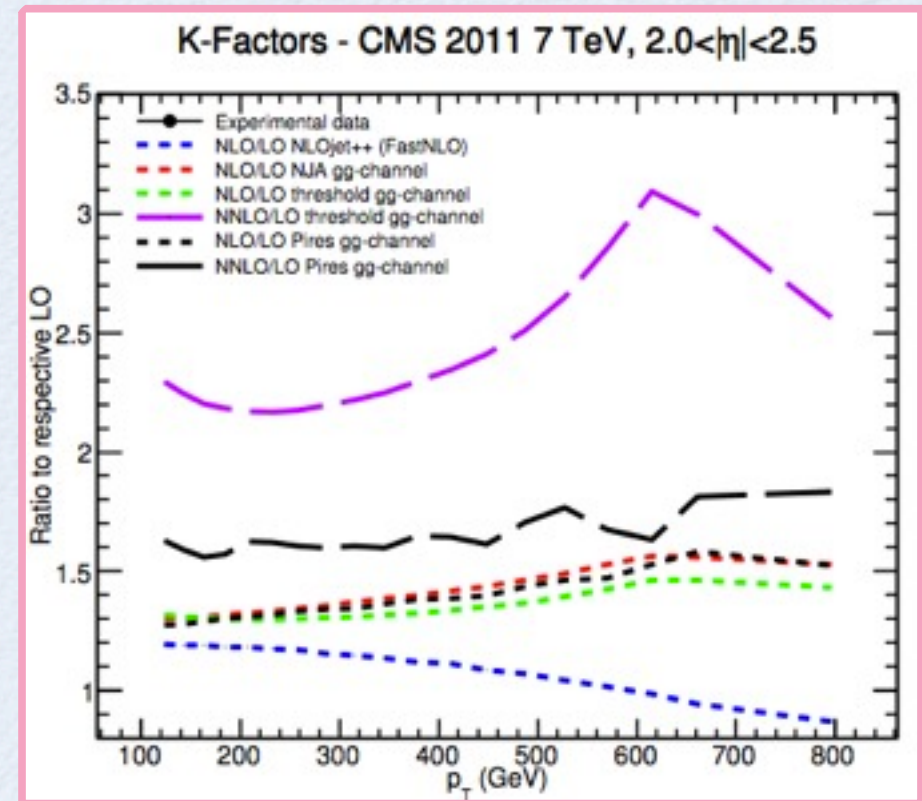
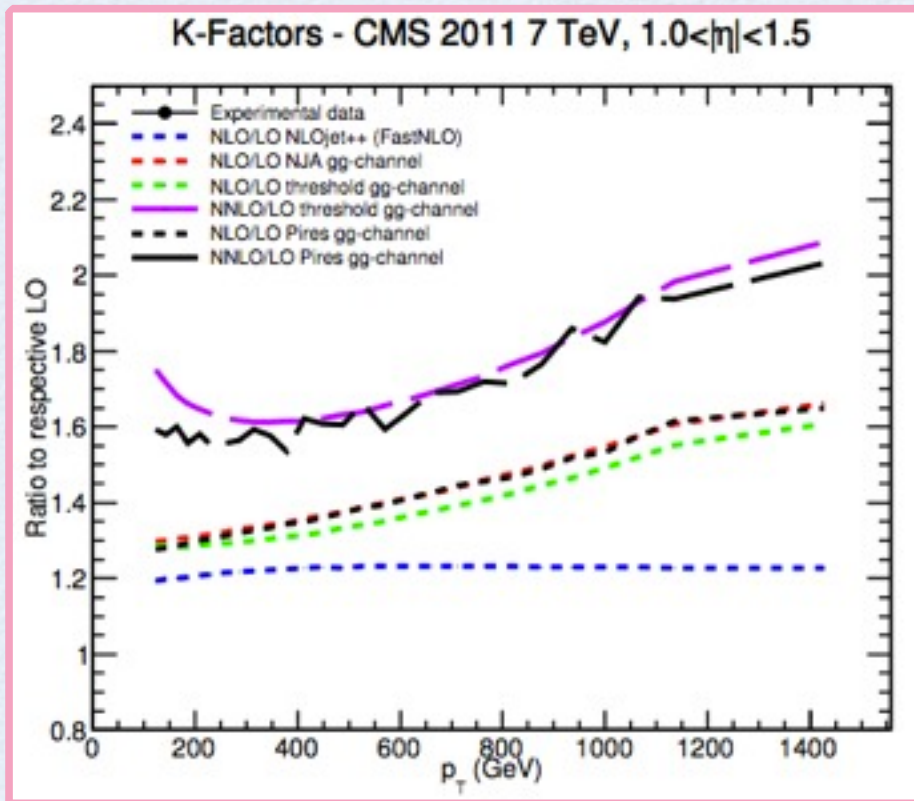
[De Florian et al, Phys.Rev.Lett. 112 (2014) 082001]

- Comparison between NNLO approx and full NNLO in the  $gg$  channel can determine for which value of  $p_T$  and  $\eta$  NNLO approx can be trusted
- This assumes NNLO K-factors similar in all channels

# The NNPDF3.0 set

## Theoretical aspects: jet cross section

Plots courtesy of J. Pires and S. Carrazza

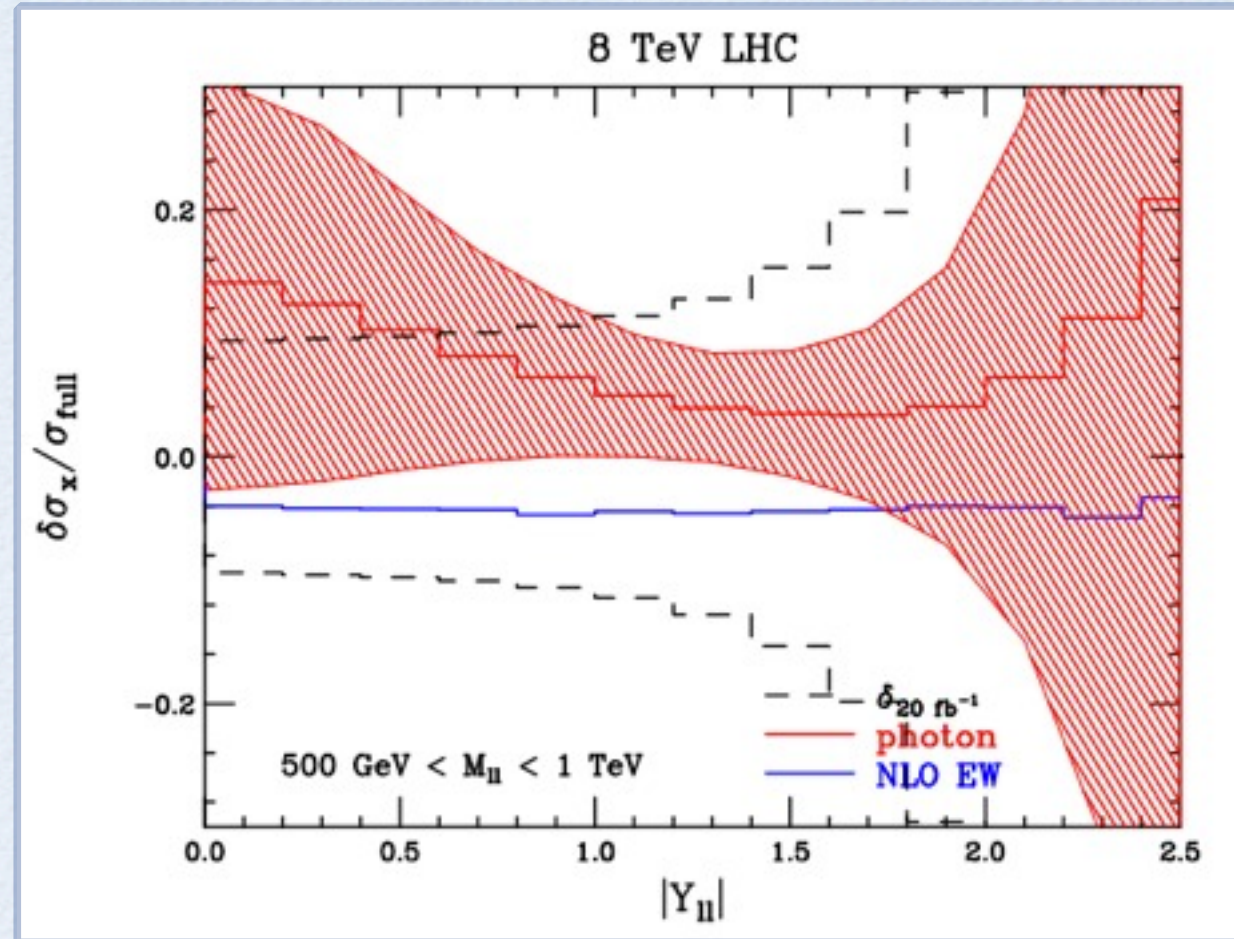


- Until exact NNLO result available, jet data at small jet transverse momentum and large pseudo-rapidity have better been cut out from NNPDF3.0 NNLO fits as NNLO\_threshold is not suitable in that region.
- Tevatron data and ATLAS 2010 data less affected due to different validity range and larger uncertainties
- Otherwise we include them by computing the NNLO\_threshold/NLO C factors

# The NNPDF3.0 set

Theoretical aspects: higher order corrections

- QED and EW corrections can also be easily computed with FEWZ3.1 [ Li, Petriello, Phys.Rev. D86 (2012) 094034]
- They can be sizable especially at large invariant mass
- QED corrections affected by large uncertainty induced from uncertainty on photon PDF



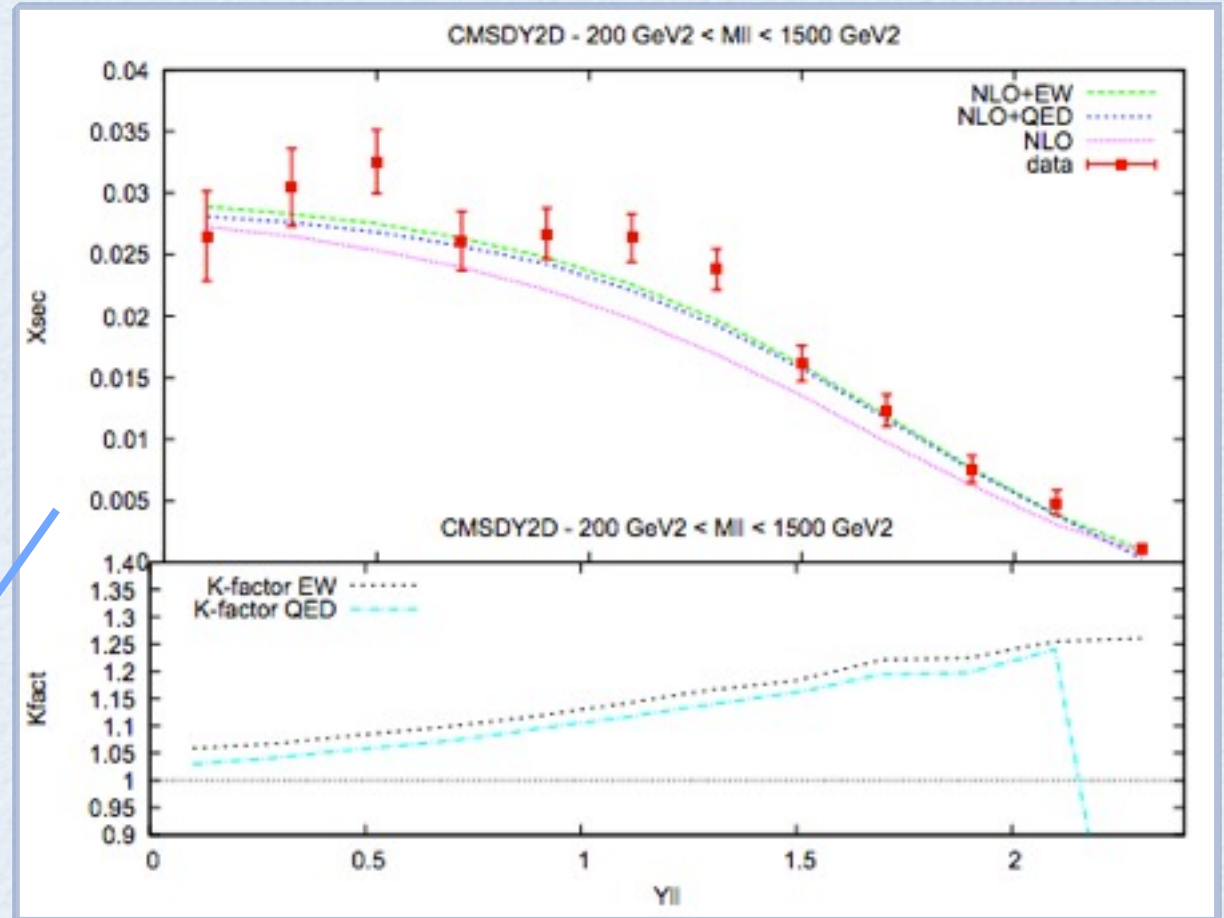
Boughezal, Liu, Petriello, ArXiv:1312.4535

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Pure EW C-factors included in theoretical predictions at NLO and NNLO in NNPDF30 fit



$$C_{\text{fact}}^{\text{NNLO}} = \frac{\hat{\sigma}_{\text{NNLO}} \otimes f_{\text{NNLO}}^i}{\hat{\sigma}_{\text{NLO}} \otimes f_{\text{NNLO}}^i}$$

$$C_{\text{fact}}^{\text{EW}} = \frac{\hat{\sigma}_{\text{NLO+EW}} \otimes f_{\text{NLO}}^i}{\hat{\sigma}_{\text{NLO}} \otimes f_{\text{NLO}}^i}$$

# The NNPDF3.0 set

## Improved methodology: Weight Penalty

- NNPDF optimal fitting has been determined so far by using CROSS-VALIDATION: data randomly divided in two sets: training (fitted) and validation (non-fitted).
- Alternatively one can introduce a penalty factor in the measure of goodness, designed to discriminate against functions that vary too fast [Graczyk, Plonski, Sulej JHEP1009 (2010) 053]

$$E[d, f] = \frac{1}{2}\chi^2[d, f] + \alpha\Delta[f]$$

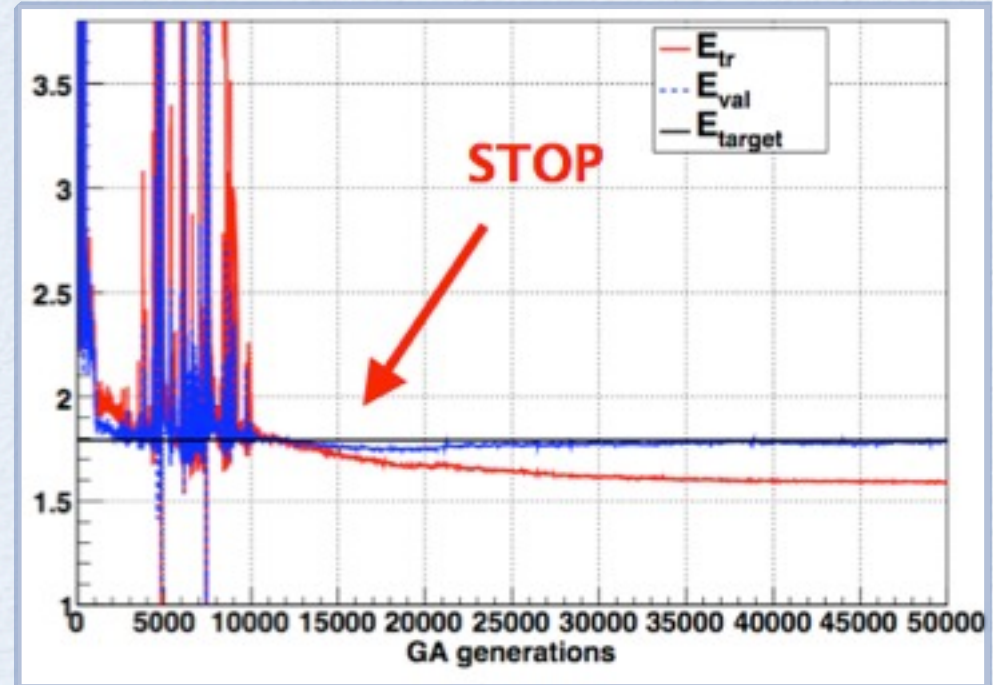
constant  
determined by  
the expected  
complexity of  
each NN based  
on previous fits

penalty function related to  
the complexity of each NN

$$\Delta[f] = \sum_i w_i^2$$

$$\alpha_i = \left[ \frac{\langle \Delta_i \rangle}{N_w} \right]^{-1}$$

- Iterate till convergence
- Convergence is reached when network fit the data but are not too complex





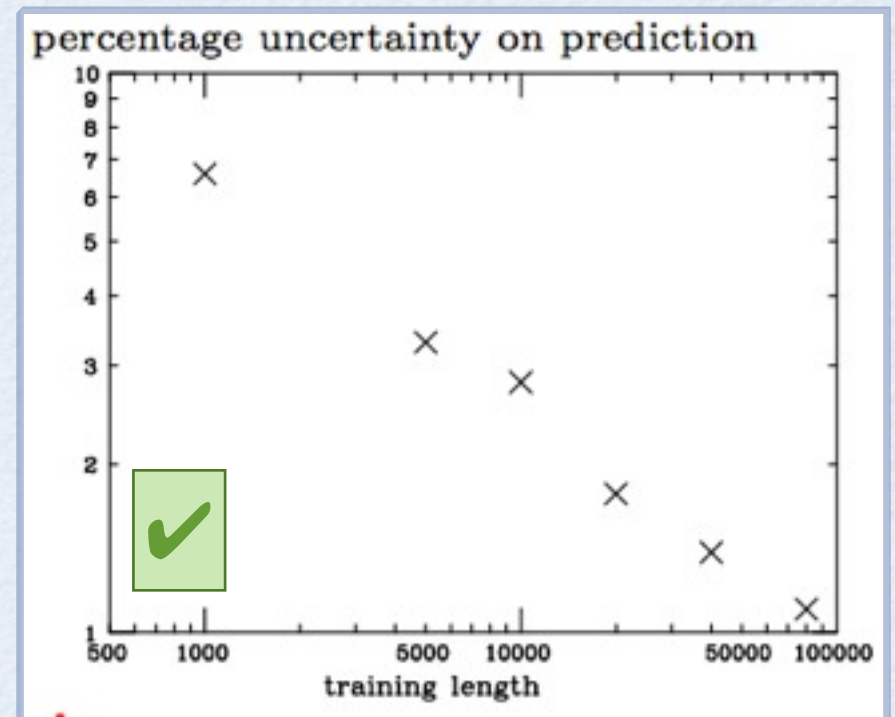
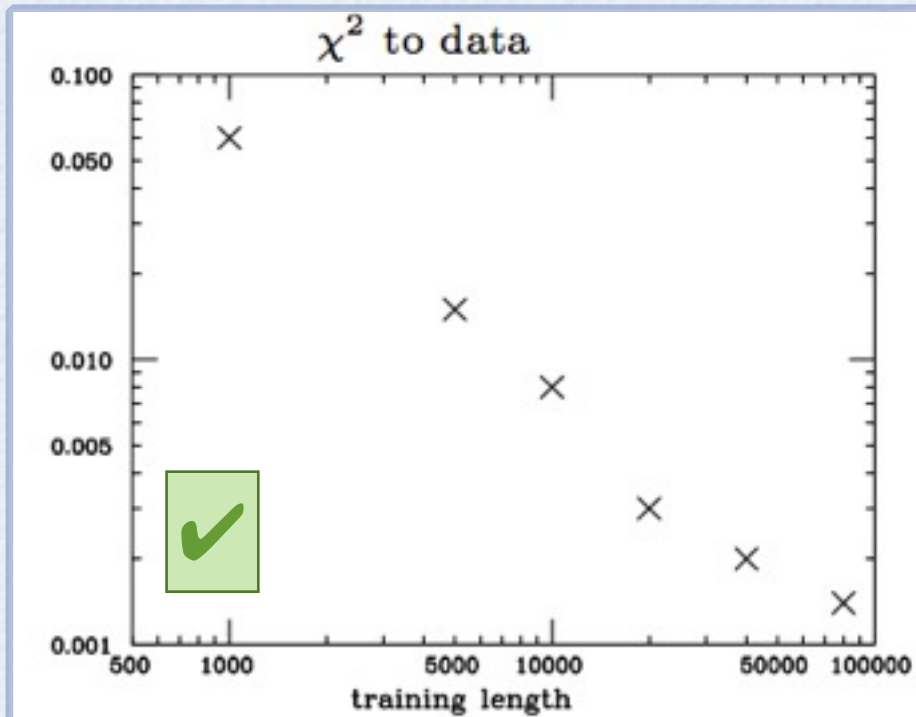
# The NNPDF3.0 set

Improved methodology: closure test

How do we determine the best minimization strategy?

- (i) Assume underlying PDFs known (say, MSTW2008)
- (ii) Generate data with given statistical and correlated systematics
- (iii) Perform a fit and compare to the "truth"

LEVEL 0: each datapoint equal to the MSTW true value and uncertainties assumed equal to experimental ones. Fit: must find  $\chi^2 = 0$

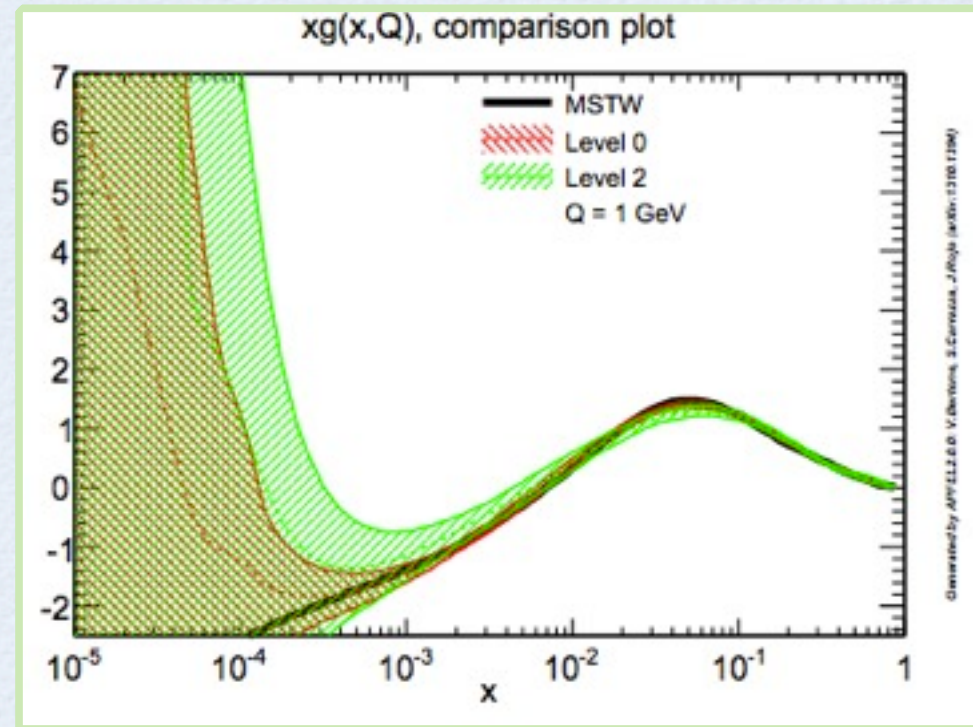
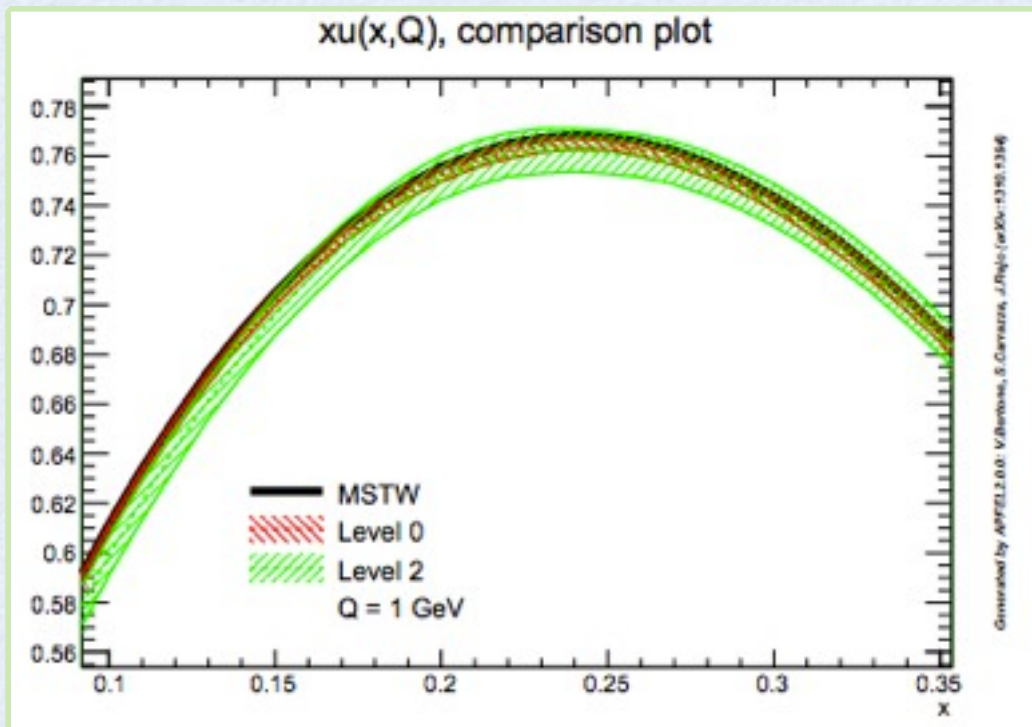


# The NNPDF3.0 set

Improved methodology: closure test

LEVEL 2: each datapoint is obtained as a random fluctuation with given covariance matrix about the "truth". Generate pseudo-data replicas of these "data", then fit PDF replicas to pseudo-data replicas. Fit, must find  $\chi^2 = 1$ , (predictions-theory) compatible with 0 and within  $1\sigma$  of MSTW "true" PDFs

Perform Fixed-Length fit to 100% data



Truth is within  $1\sigma$  error band!

# The NNPDF3.0 set

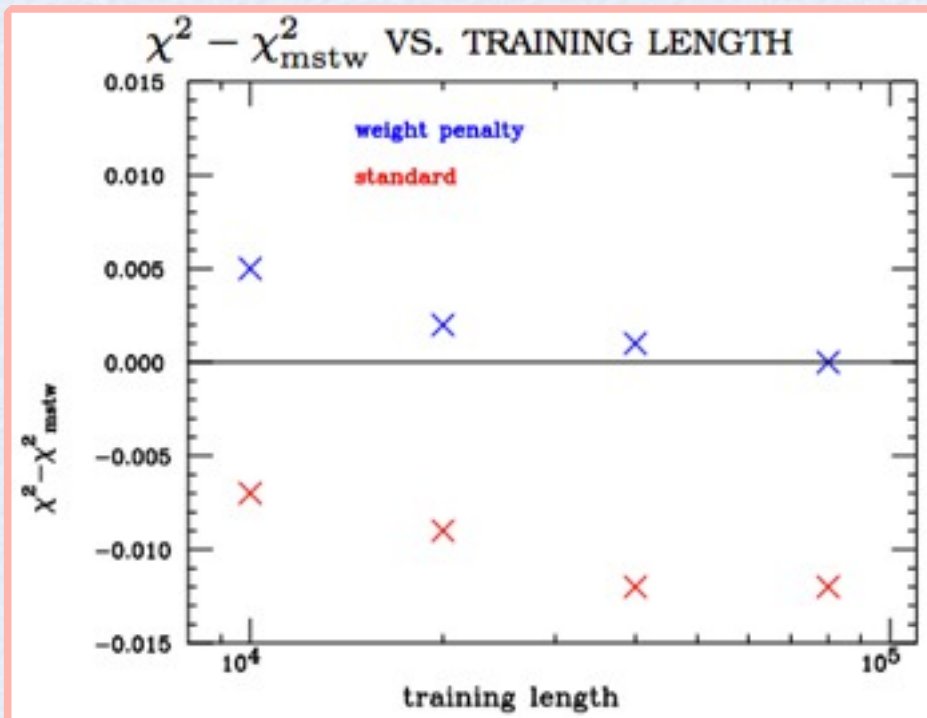
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- At 10K iterations



$$\chi^2 = 0.96, \langle E \rangle = 2.0 \text{ (NOTE } \chi_{mstw}^2 = 0.96)$$



- Chi2 within 0.1% accuracy!
- Same at 20K, 30K and 40K iterations.
- Non WP show signs of micro-overlearning around 10K iterations of GA
- WP does not overlearn up to 80K iterations
- However micro-overlearning is much smaller than statistical fluctuations

$$\Delta\chi^2 \ll \sigma_{\chi^2}$$

# The NNPDF3.0 set

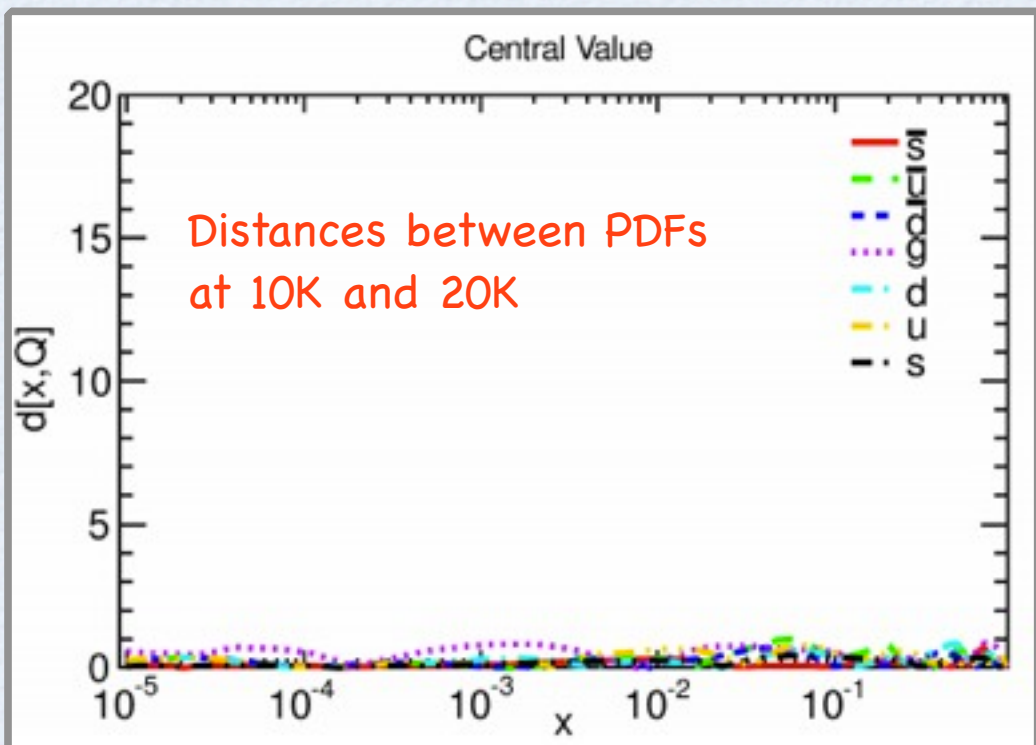
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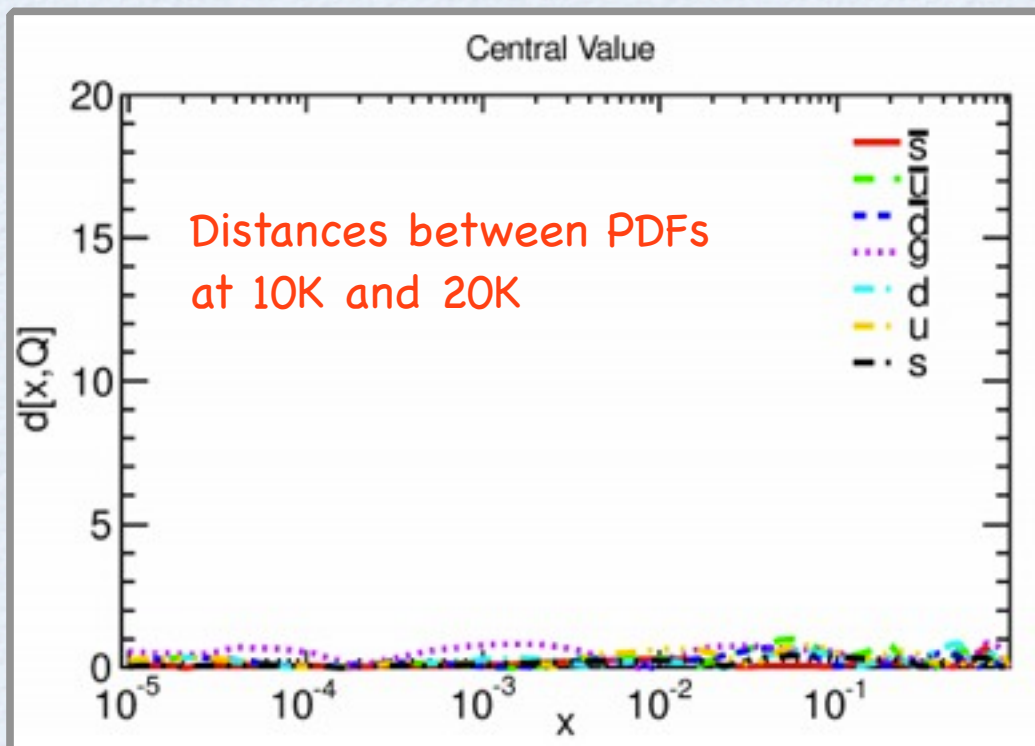
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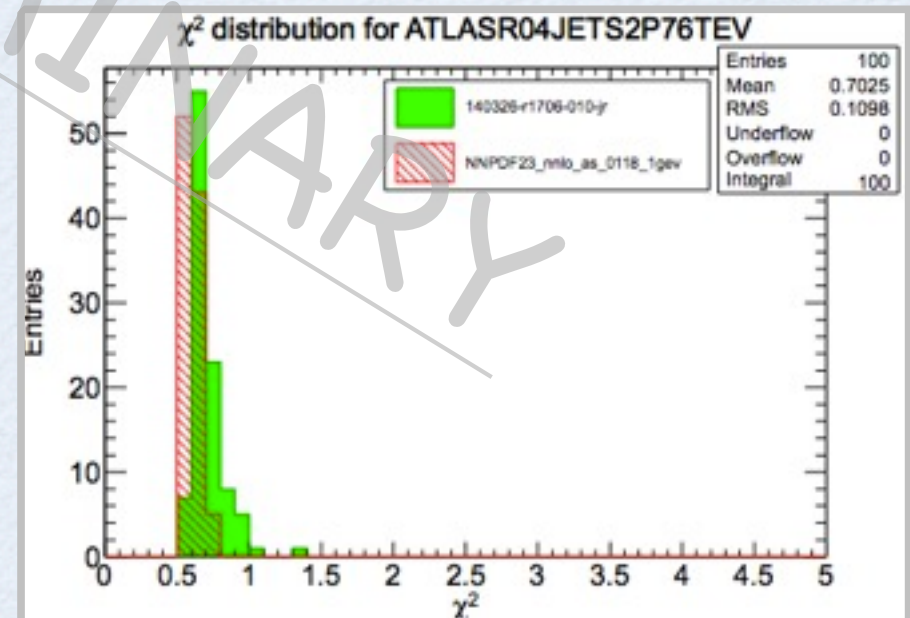
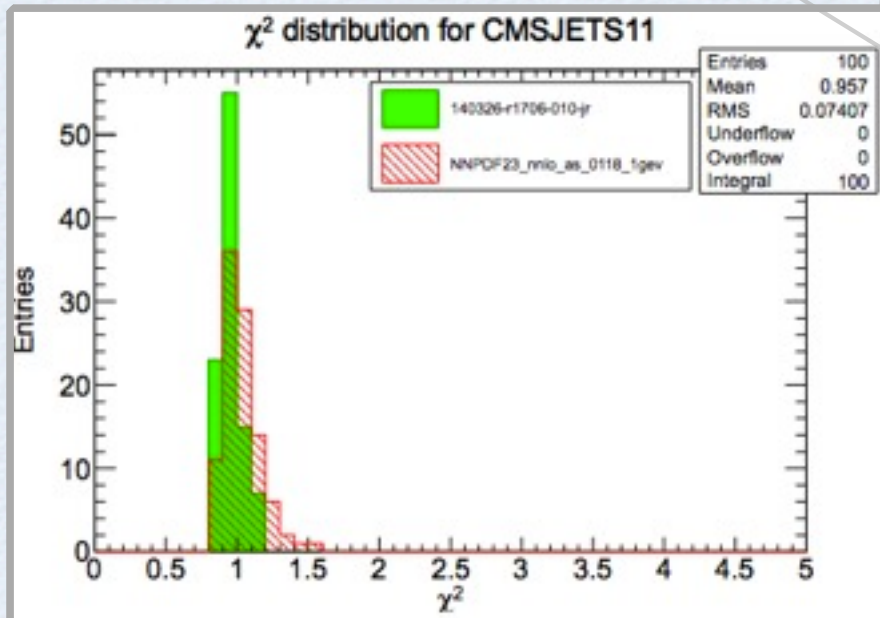
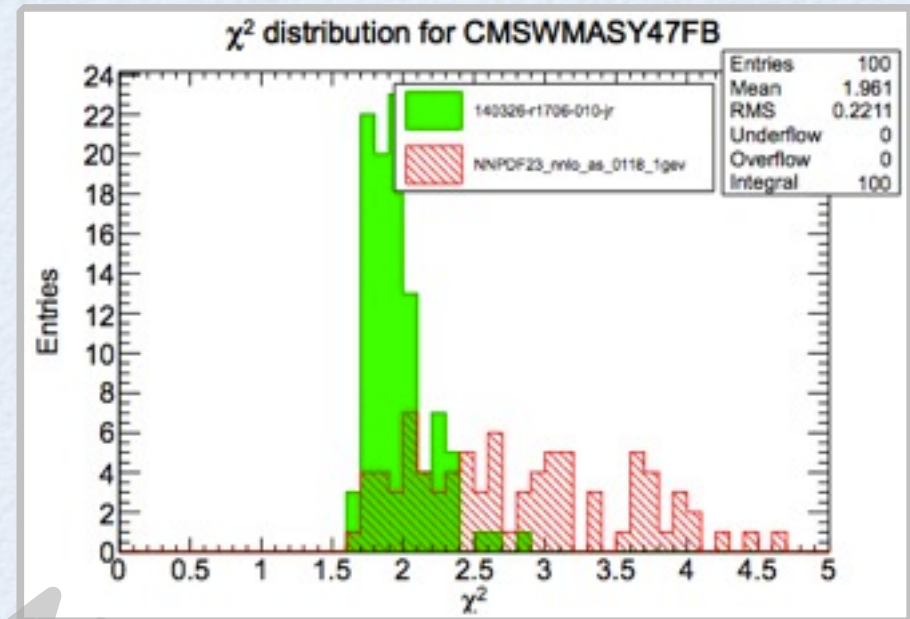
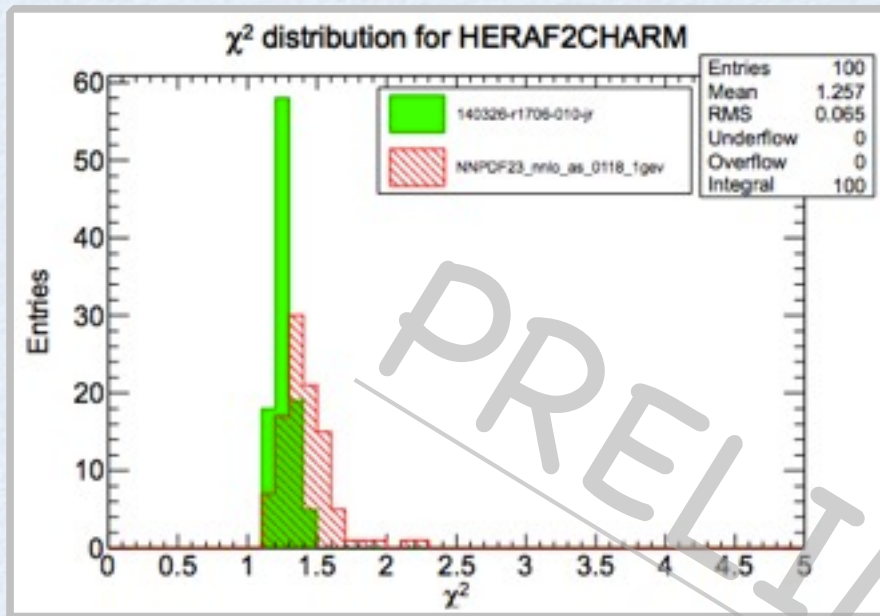


## Preliminary conclusions

- Fixed-Length fit fully adequate
- No overlearning in global fit due to large number of data
- Over-learning observed in fits to reduced datasets
- Effect of Weigh-Penalty moderate

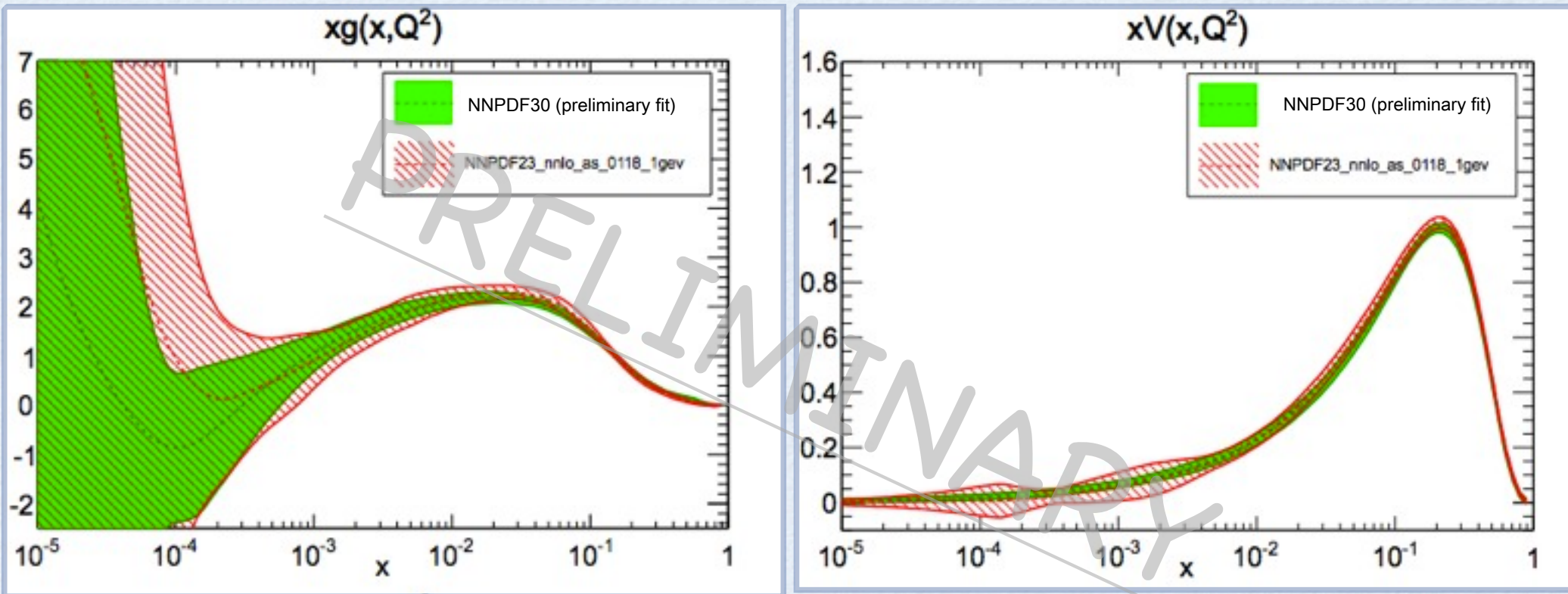
# Results

## Description of the new data



# Results

The NNPDF3.0 partons



Preliminary fit:

- some data (ATLAS W pT) not yet included
- some theoretical refinement (C-factors for EW corrections and some NNLO C-factors)

# Conclusions and Outlook

- NNPDF23 is the first public fit to include the effect of the LHC data.  
NNPDF23QED and NNPDF23 for MC widely used
- NNPDF is the only unpolarized and polarized set available in LHAPDF  
[see Emanuele Nocera's talk in WG6]
- Fit to fragmentation functions within similar framework soon available!
- Upcoming NNPDF30 release is a major upgrade
  - Totally rewritten code NNPDF++
  - Improved methodology and closure test validation
  - Proven independence of basis
  - More accurate theory settings: jets, EW corrections
  - Many more LHC data included, larger impact expected than NNPDF23
  - Improved positivity (SUSY observables and large  $x$  gluons and quarks)
- Release in LHAPDF expected by summer 2014
  - NNPDF30 will be available at LO, NLO, NNLO
  - Soon after NNPDF30QED and NNPDF30IC with intrinsic charm
  - In the near future NNPDF30 including N3LO approx and resummations  
based on Ball, Bonvini, Forte, Marzani, Ridolfi et al, NP B874 (2013)



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THANKS for your  
attention and  
STAY TUNED!