

# The Structure of the Proton to One-Percent Accuracy: NNPDF4.0

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*on behalf of:*

THE NNPDF COLLABORATION & N3PDF TEAM

AMSTERDAM-BARCELONA-CAMBRIDGE-EDINBURGH-INFN-MILAN-NIKHEF

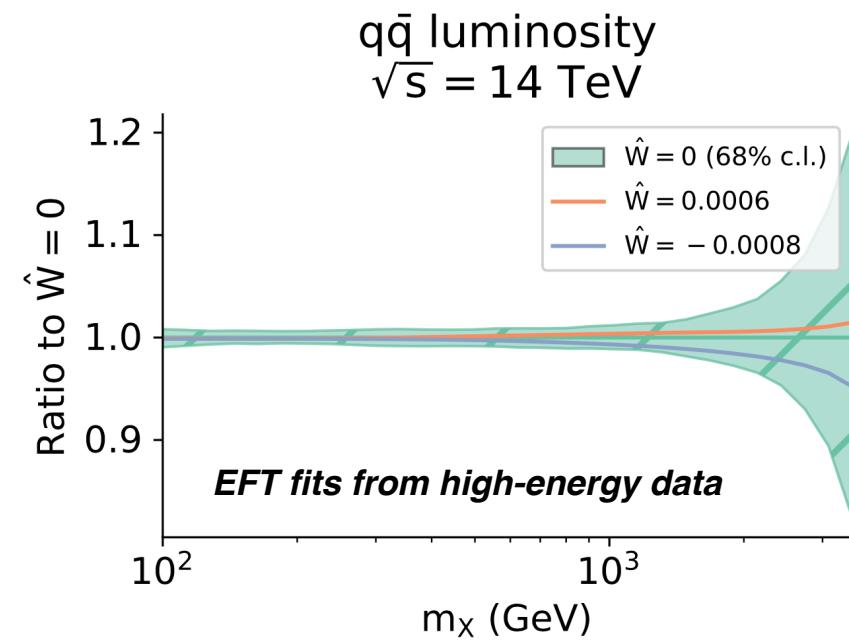
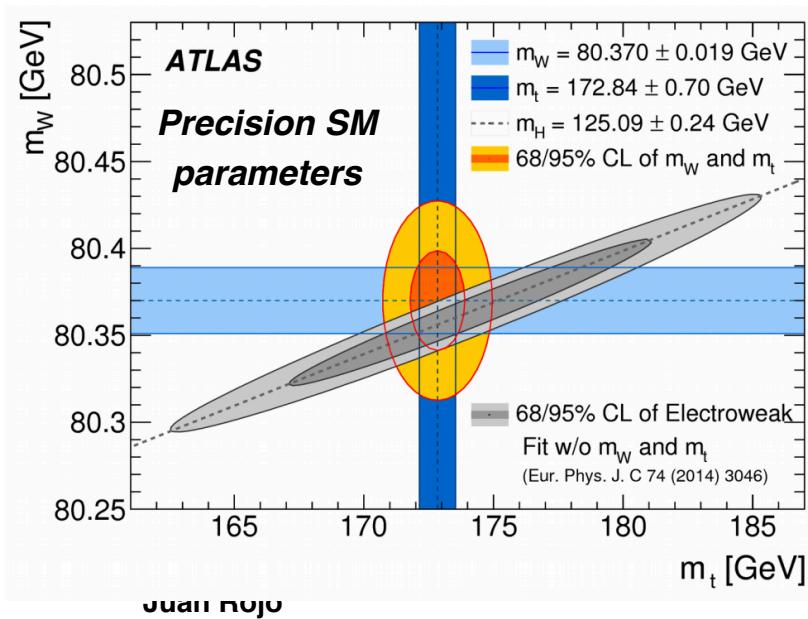
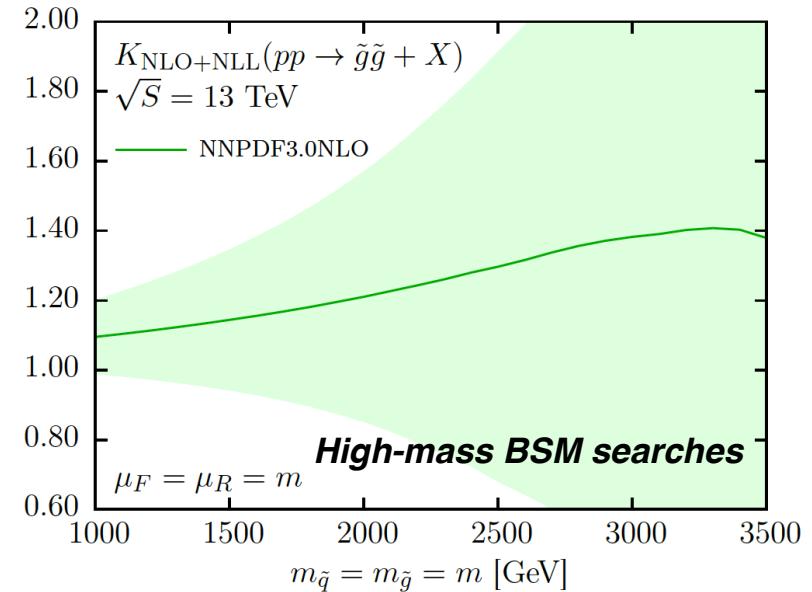
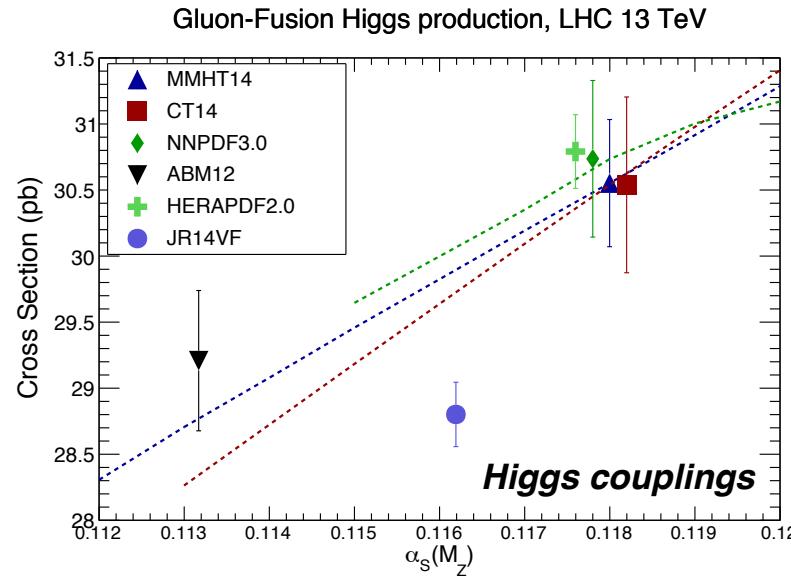


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# Why we need better PDFs?

PDF uncertainties: limiting factor in **theoretical interpretation** for many LHC analysis



# The road towards NNPDF4.0

Collaborative progress towards extending **data**, **theory** and **methodology**

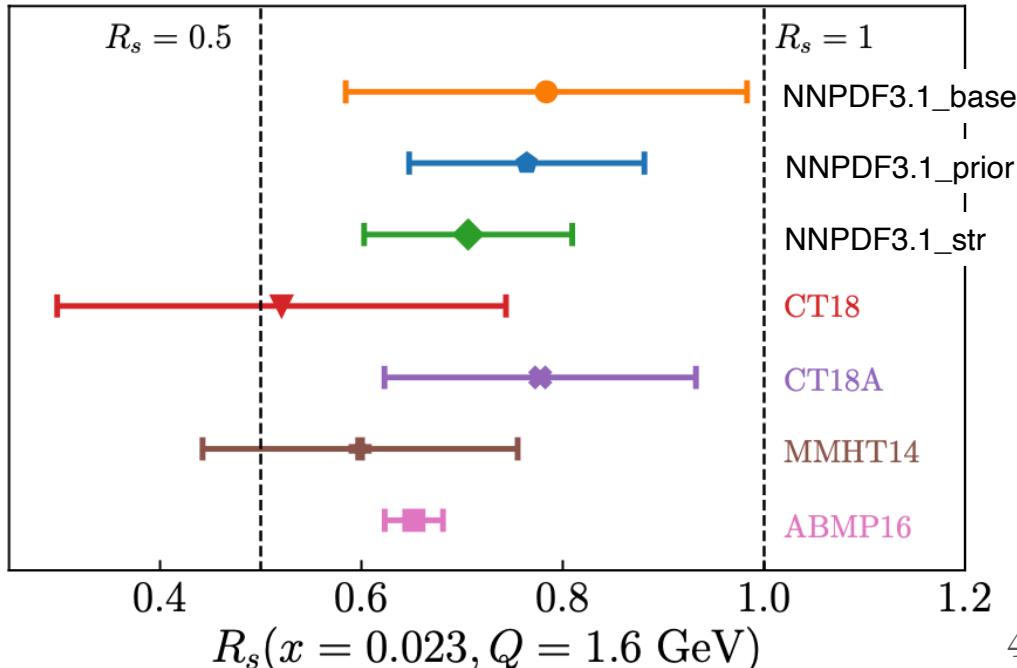
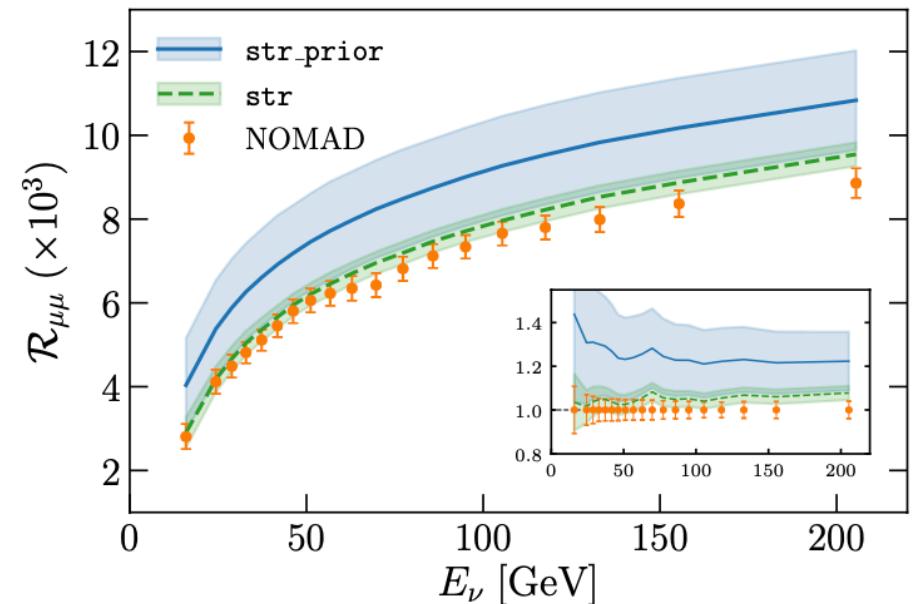
06/2017	<b>NNPDF3.1</b>	[EPJ C77 (2017) 663]
10/2017	<b>NNPDF3.1sx</b> : PDFs with small- $x$ resummation	[EPJ C78 (2018) 321]
12/2017	<b>NNPDF3.1luxQED</b> : consistent photon PDF à la luxQED	[SciPost Phys. 5 (2018) 008]
02/2018	<b>NNPDF3.1+ATLASphoton</b> : inclusion of direct photon data	[EPJ C78 (2018) 470]
12/2018	<b>NNPDF3.1alphas</b> : $\alpha_s$ from a correlated-replica method	[EPJ C78 (2018) 408]
12/2018	<b>NNPDF3.1nuc</b> : heavy ion nuclear uncertainties in a fit	[EPJ C79 (2019) 282]
05/2019	<b>NNPDF3.1th</b> : missing higher-order uncertainties in a fit	[EPJ C79 (2019) 838; ibid. 931]
07/2019	<b>Gradient descent and hyperoptimisation in PDF fits</b>	[EPJ C79 (2019) 676]
12/2019	<b>NNPDF3.1singletop</b> : inclusion of single top $t$ -channel data	[JHEP 05 (2020) 067]
05/2020	<b>NNPDF3.1dijets</b> : comparative study of single- and di-jets	[EPJ C80 (2020) 797]
06/2020	<b>Positivity of <math>\overline{\text{MS}}</math> PDFs</b>	[JHEP 11 (2020) 129]
08/2020	<b>PineAPPL</b> : fast evaluation of EW×QCD corrections	[JHEP 12 (2020) 108]
08/2020	<b>NNPDF3.1strangeness</b> : assessment of strange-sensitive data	[EPJ C80 (2020) 1168]
11/2020	<b>NNPDF3.1deu</b> : deuteron uncertainties in a fit	[EPJ C81 (2021) 37]
03/2021	<b>Future tests</b>	[arXiv:2103.08606]
2021	<b>NNPDF4.0</b>	[to appear]

*More details in the NNPDF talks at the PDF4LHC meeting 03/21*

# The strangest proton?

Reappraisal of the proton strangeness based combination of **all relevant experimental inputs**

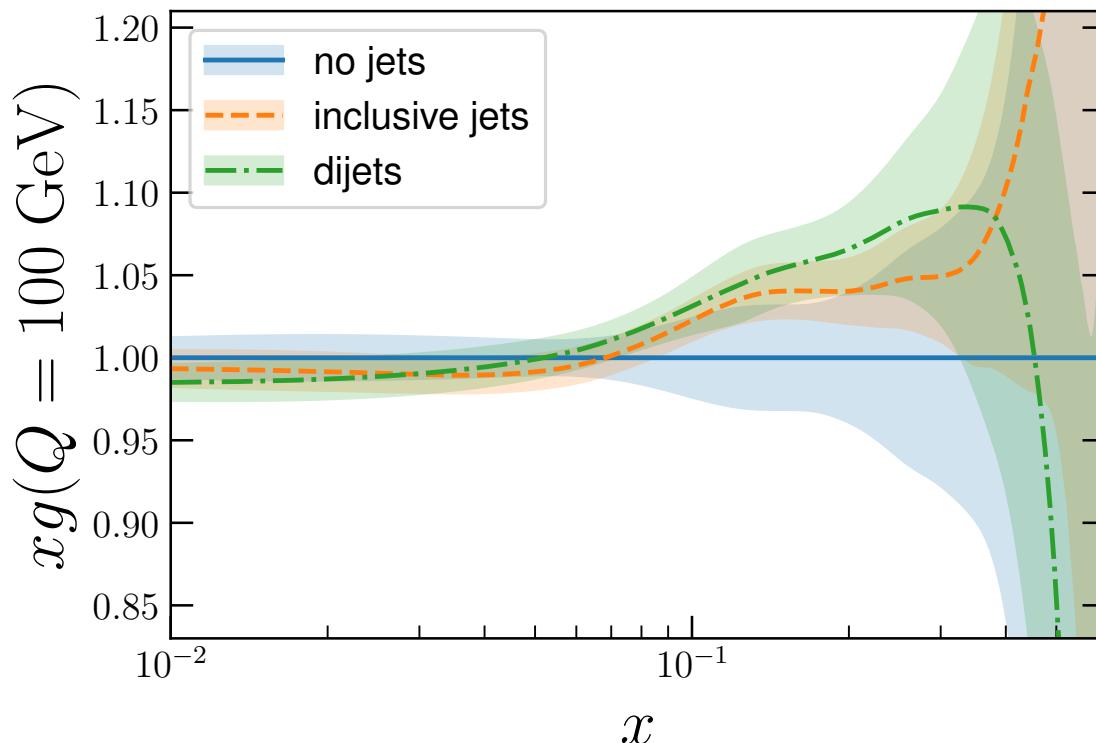
Process	Dataset	$n_{\text{dat}}$	$\chi^2_{\text{base}}$	$\chi^2_{\text{pr}}$	$\chi^2_{\text{str}}$
$\nu$ DIS ( $\mu\mu$ )		76/76/95/91/95	0.76	0.71	0.53
	NuTeV [9]	76/76/76/76/76	0.76	0.71	0.53
	NOMAD [10]	—/—/19/15/19	[9.3]	[8.8]	0.55
$W, Z$ (incl.)		391/418/418/418/418	1.45	1.40	1.40
	ATLAS [12]	34/61/61/61/61	1.96	1.65	1.67
$W+c$		—/37/37/37/37	[0.73]	0.68	0.60
	CMS [17, 18]	—/15/15/15/15	[1.04]	0.98	0.96
	ATLAS [16]	—/22/22/22/22	[0.52]	0.48	0.42
$W+\text{jets}$	ATLAS [15]	—/32/32/32/32	[1.58]	1.18	1.18
<b>Total</b>		3981/4077/4096/4092/4096	1.18	1.17	1.17



- Satisfactory simultaneous description of all datasets
- No **evidence for tension** between datasets or groups of processes
- Sizeable constraints from **NOMAD neutrino DIS data**, consistent with collider data
- Preference for a **moderately suppressed strangeness**

$$R_S(x = 0.023, Q = 1.6 \text{ GeV}) = 0.71 \pm 0.10$$

# LHC dijets to map the gluon PDF



With NNLO QCD (+ NLO EW) calculations, **all available dijet cross-sections** are successfully included in global fit, good agreement with data

*first use of dijets in PDF fits!*

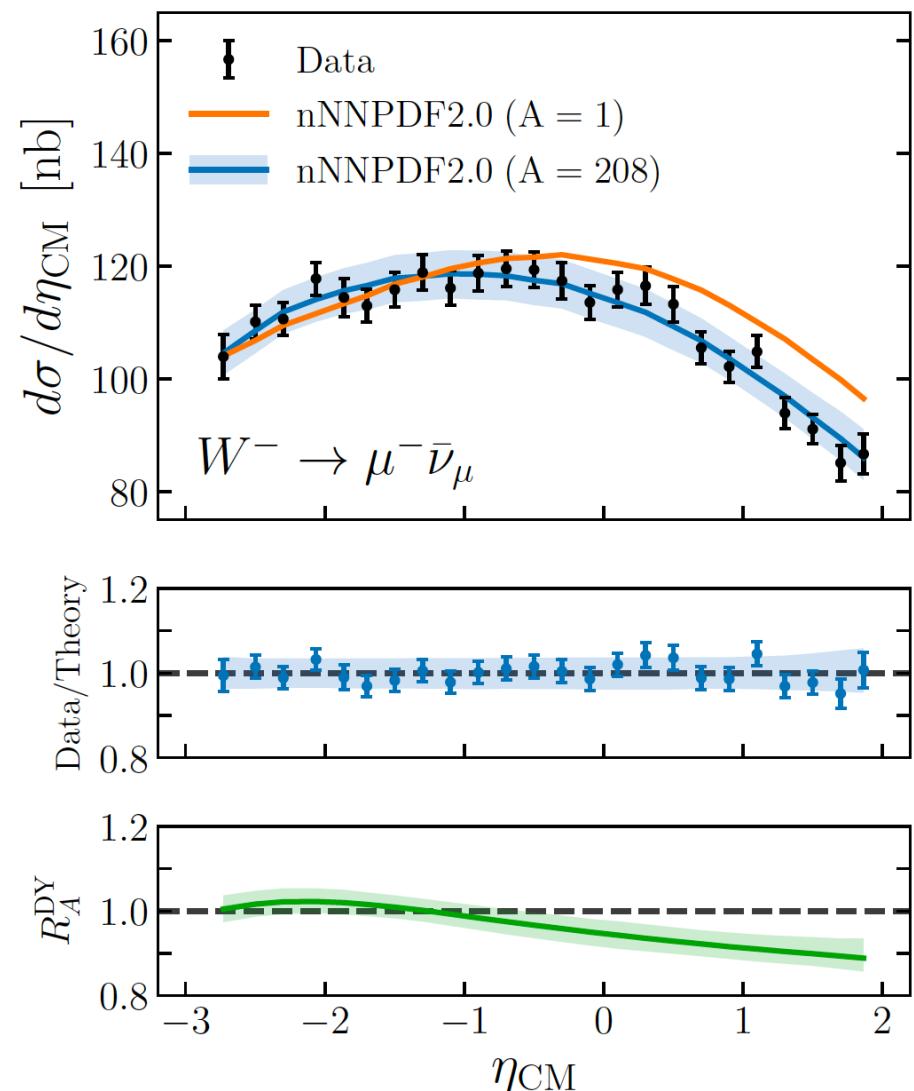
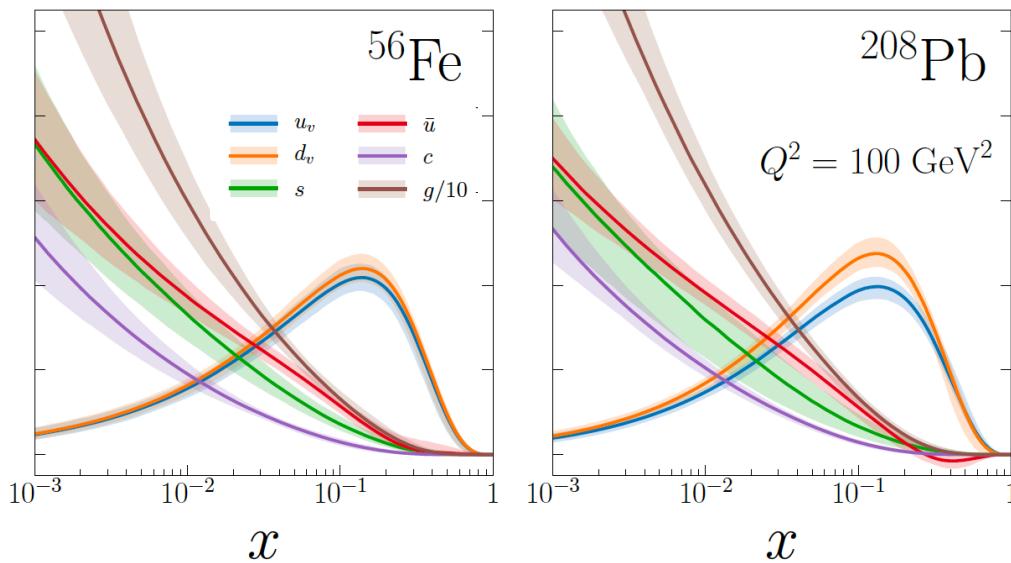
Constrains on the gluon **qualitatively consistent** between dijet and inclusive jet observables

Inclusive jets requires introducing **tailored decorrelation** models to achieve **good  $\chi^2$**

Experiment	Measurement	$\sqrt{s}$ [TeV]	$\mathcal{L}$ [ $\text{fb}^{-1}$ ]	$R$	Distribution	$n_{\text{dat}}$
ATLAS	Inclusive jets	7	4.5	0.6	$d^2\sigma/dp_T d y $	140
CMS	Inclusive jets	7	4.5	0.7	$d^2\sigma/dp_T d y $	133
ATLAS	Inclusive jets	8	20.2	0.6	$d^2\sigma/dp_T d y $	171
CMS	Inclusive jets	8	19.7	0.7	$d^2\sigma/dp_T d y $	185
ATLAS	Dijets	7	4.5	0.6	$d^2\sigma/dm_{jj} d y^* $	90
CMS	Dijets	7	4.5	0.7	$d^2\sigma/dm_{jj} d y_{\max} $	54
CMS	Dijets	8	19.7	0.7	$d^3\sigma/dp_{T,\text{avg}} dy_b dy^*$	122

# Quark flavour separation in nuclei from LHC data

- nNNPDF2.0: global determination of **nuclear PDFs** from heavy nuclear DIS (NC+CC) and LHC data
- Consistent fitting methodology with proton fits, NNPDF3.1 (and uncertainties) **reproduced for  $A=1$**
- Strong evidence for **quark shadowing at small- $x$**

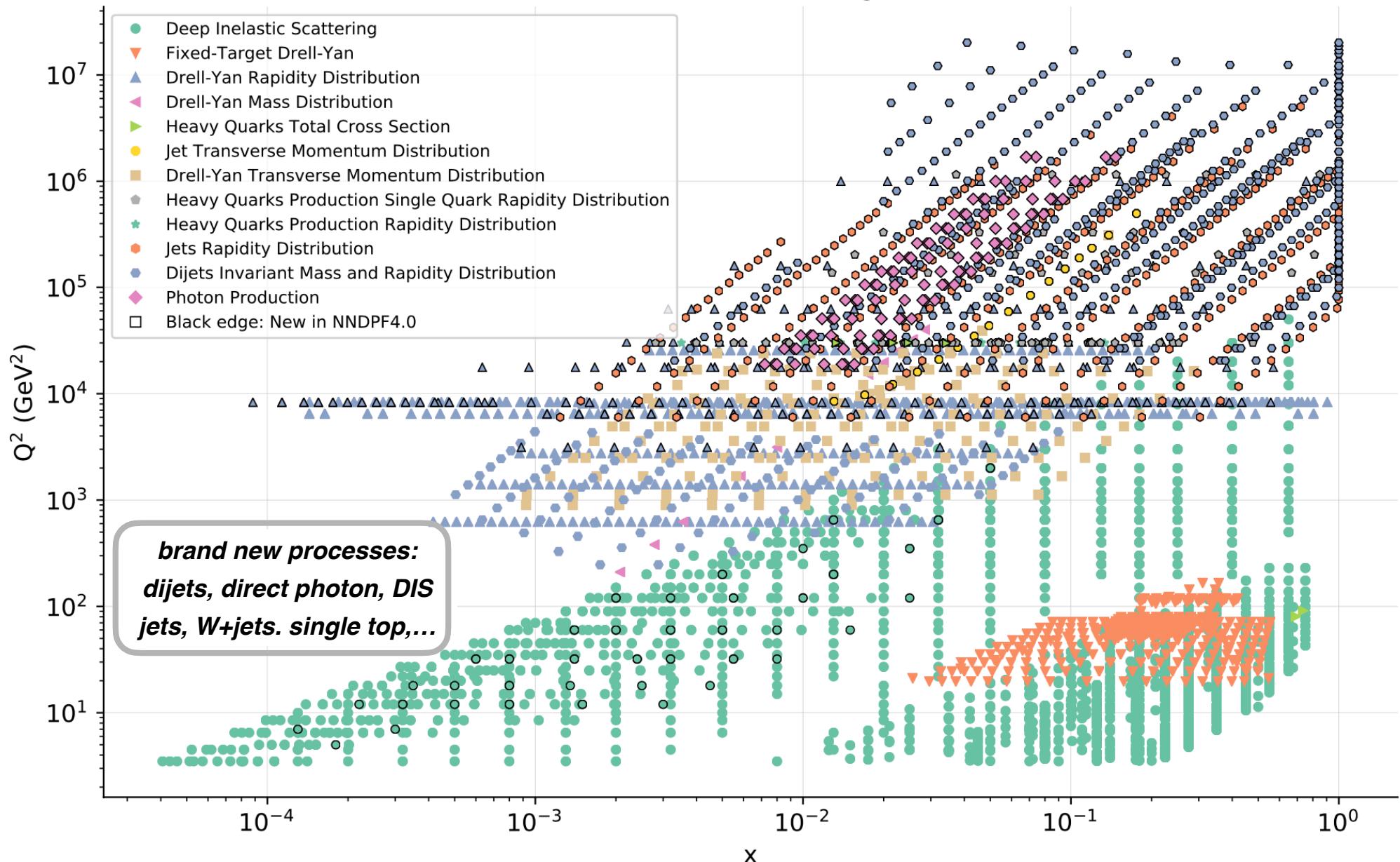


with nNNPDF2.0: consistent inclusion of **nuclear effects from neutrino DIS data** in NNPDF4.0

*using the Ball-Pearson-Nocera approach*

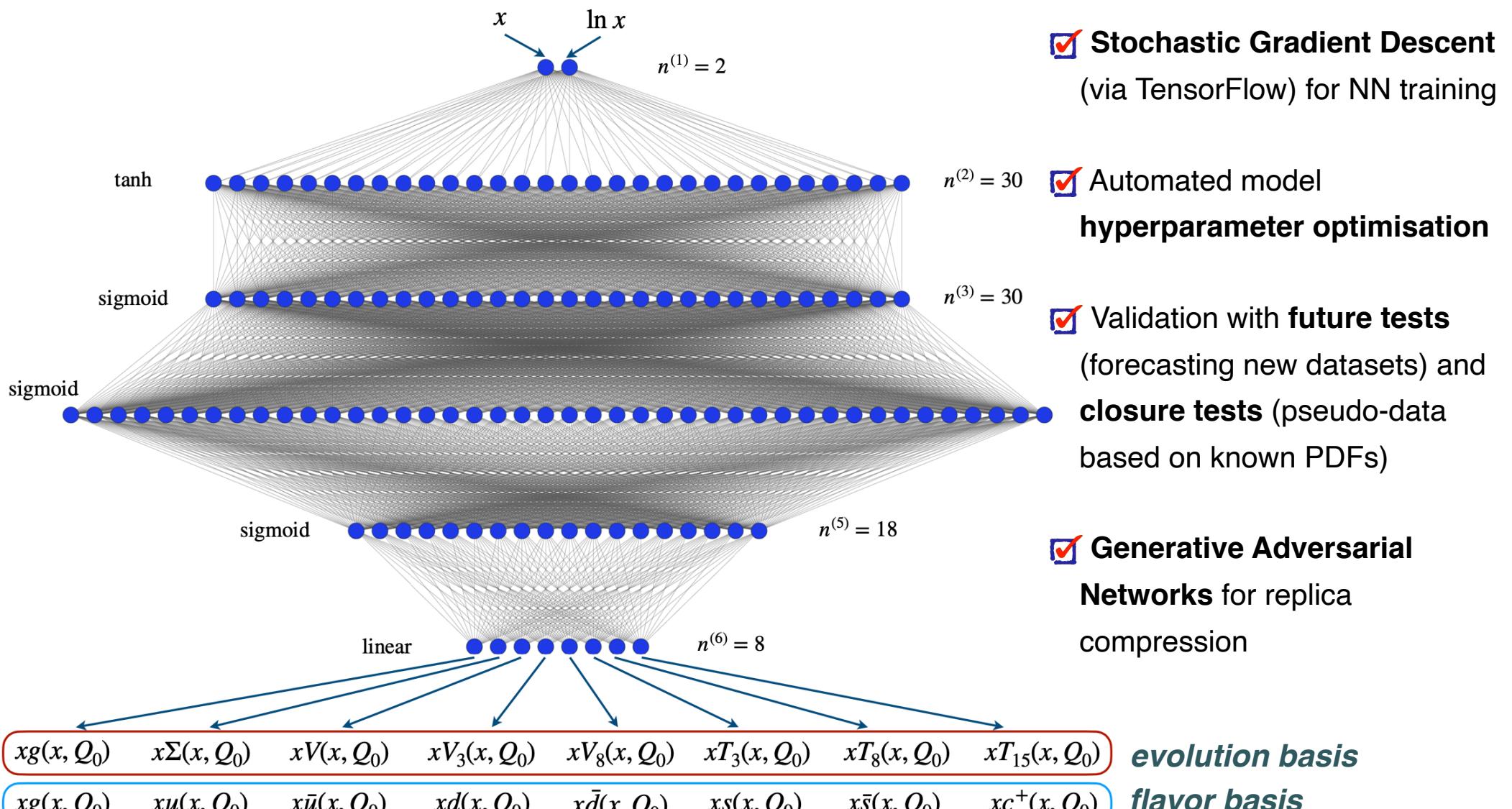
# NNPDF4.0: data set extension

## Kinematic coverage



$\mathcal{O}(50)$  data sets investigated;  $\mathcal{O}(400)$  data points more in NNPDF4.0 than in NNPDF3.1

# Improved fitting methodology



$$f_i(x, Q_0) = x^{-\alpha_i} (1 - x)^{\beta_i} \text{NN}_i(x)$$

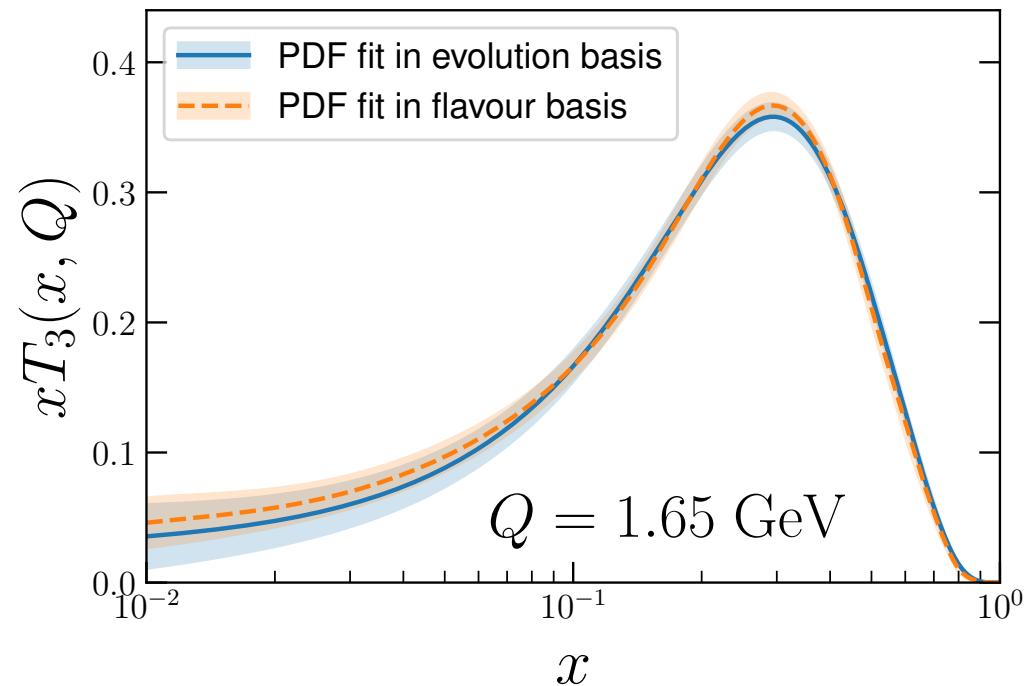
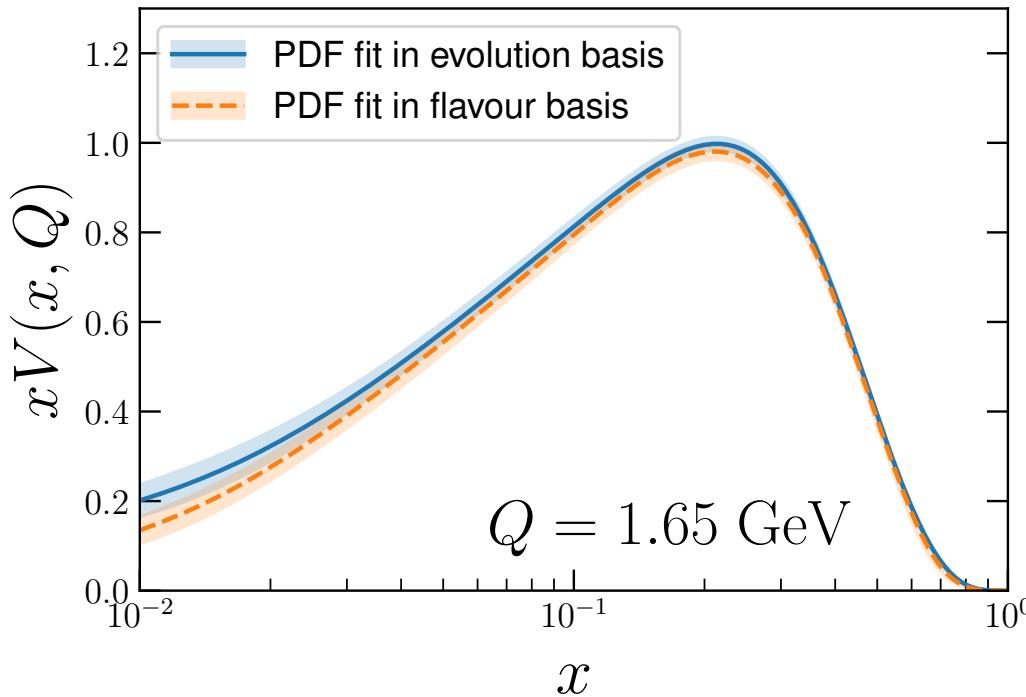
**Stochastic Gradient Descent**  
(via TensorFlow) for NN training

**Automated model  
hyperparameter optimisation**

**Validation with future tests**  
(forecasting new datasets) and  
**closure tests** (pseudo-data  
based on known PDFs)

**Generative Adversarial  
Networks** for replica  
compression

# Parametrisation basis independence



*evolution basis PDF parametrisation:*

$$xV(x, Q_0) \propto \text{NN}_V(x)$$

$$xT_3(x, Q_0) \propto \text{NN}_{T_3}(x)$$

Radically different strategies to parametrize the **quark PDF flavour combinations** lead to identical results:  
ultimate test of **parametrisation independence**

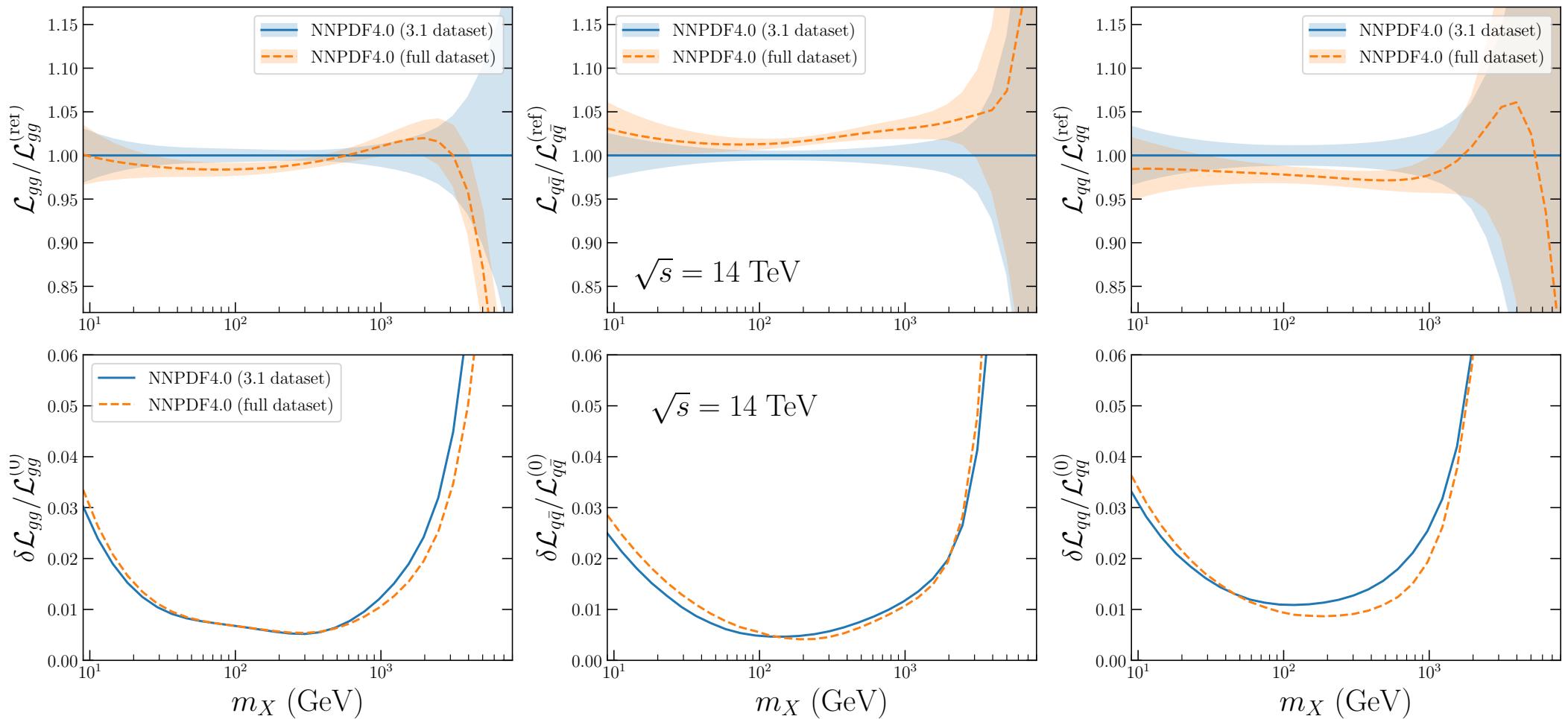
*flavour basis PDF parametrisation:*

$$xV(x, Q_0) \propto (\text{NN}_u(x) - \text{NN}_{\bar{u}}(x) + \text{NN}_d(x) - \text{NN}_{\bar{d}}(x) + \text{NN}_s(x) - \text{NN}_{\bar{s}}(x))$$

$$xT_3(x, Q_0) \propto (\text{NN}_u(x) + \text{NN}_{\bar{u}}(x) - \text{NN}_d(x) - \text{NN}_{\bar{d}}(x))$$

# Impact of new data

Partonic luminosities from fits based on the **same NNPDF4.0 methodology** but either with the **previous 3.1** or the **new 4.0 dataset**: good consistency, with 4.0 more precise

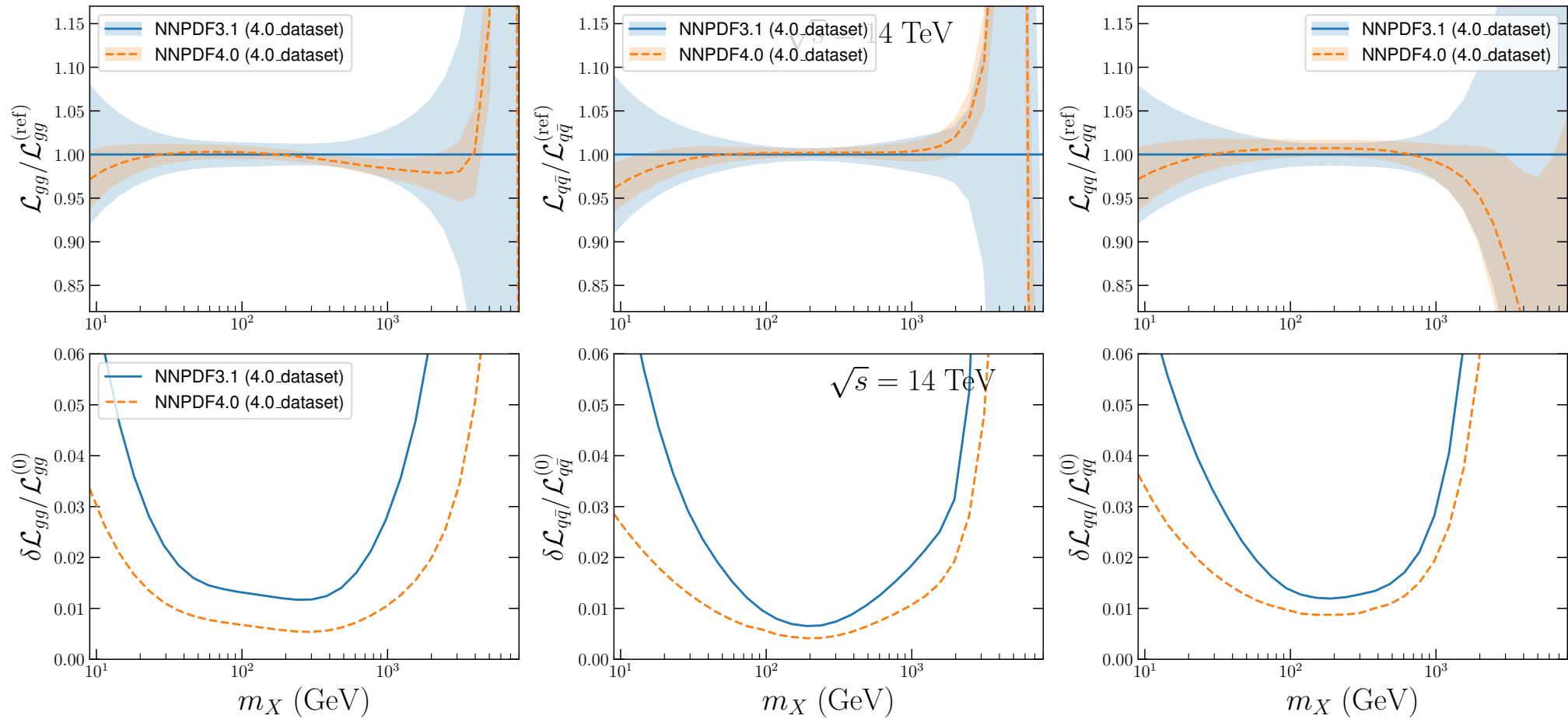


**One-percent PDF uncertainties** in LHC cross-sections for wide kinematic range

# Impact of new fitting methodology

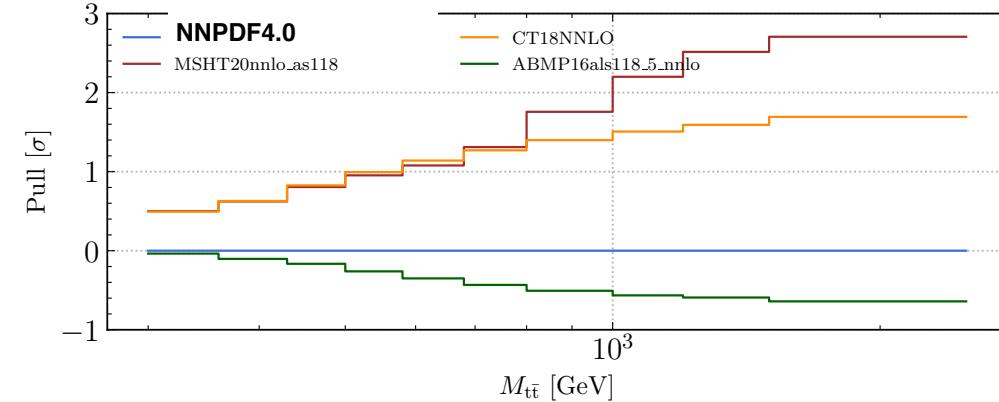
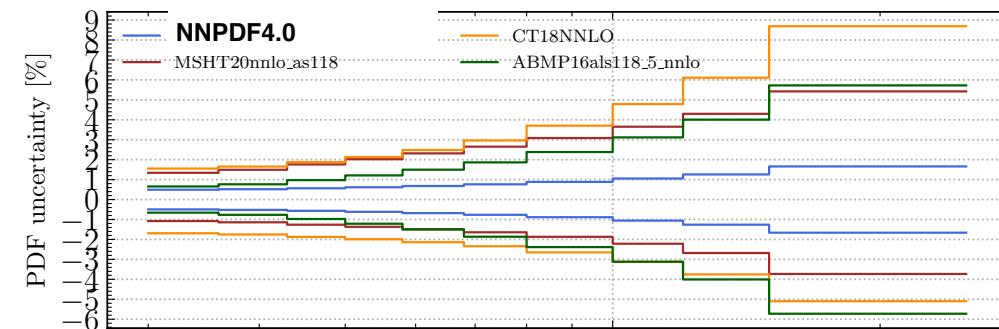
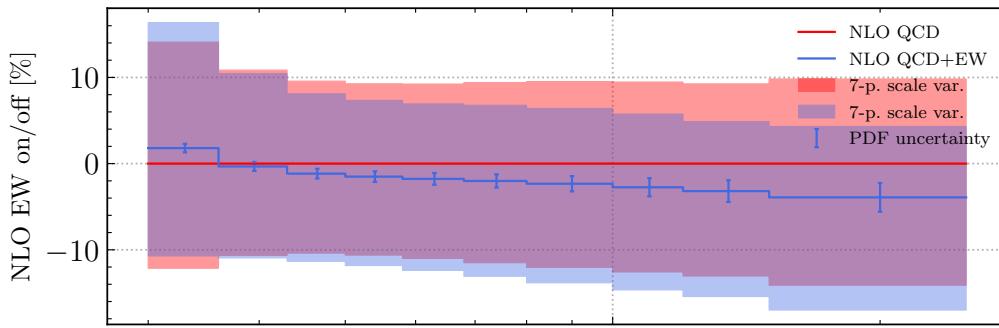
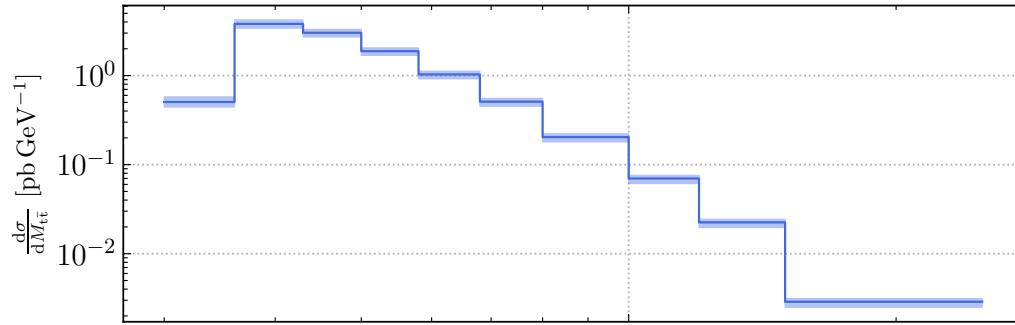
Partonic luminosities from fits based on the **same NNPDF4.0 dataset** but either with the **previous**

**3.1 or the new 4.0 methodology:** perfect consistency, with 4.0 markedly **more accurate**

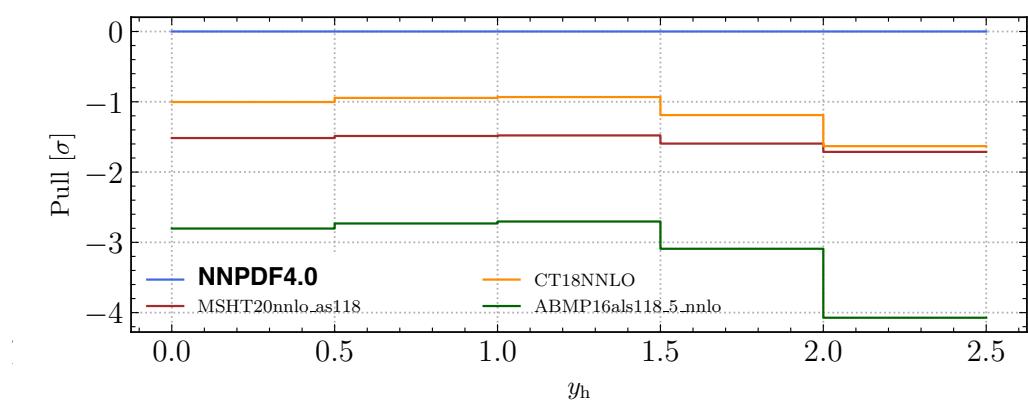
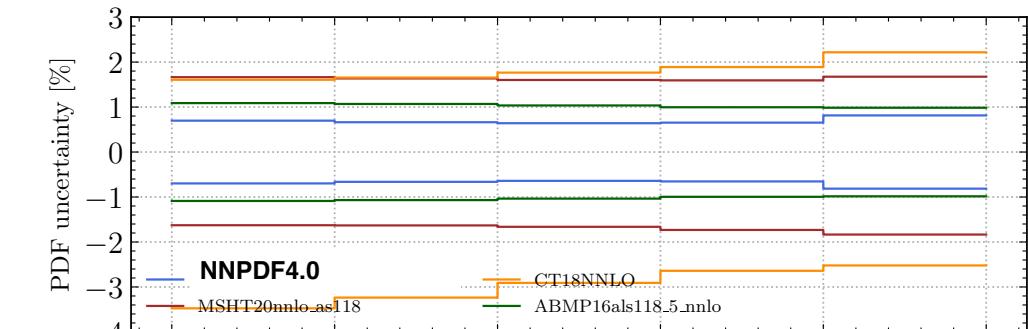
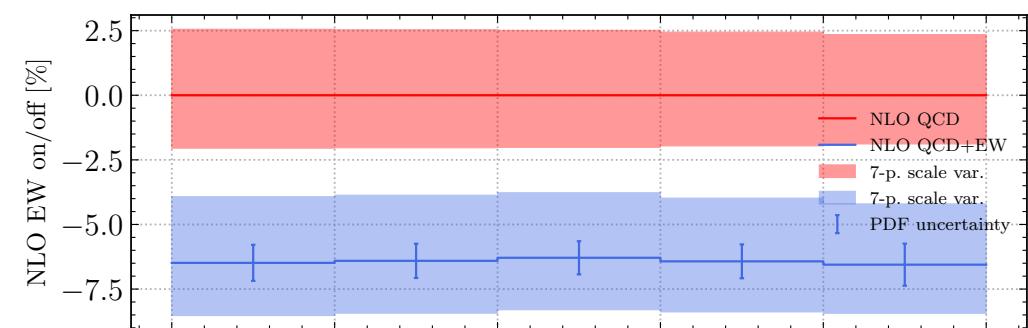
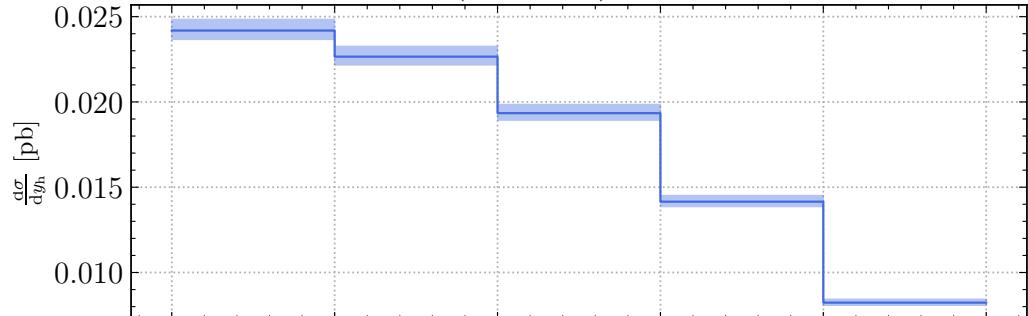


**One-percent PDF uncertainties** in LHC cross-sections for wide kinematic range

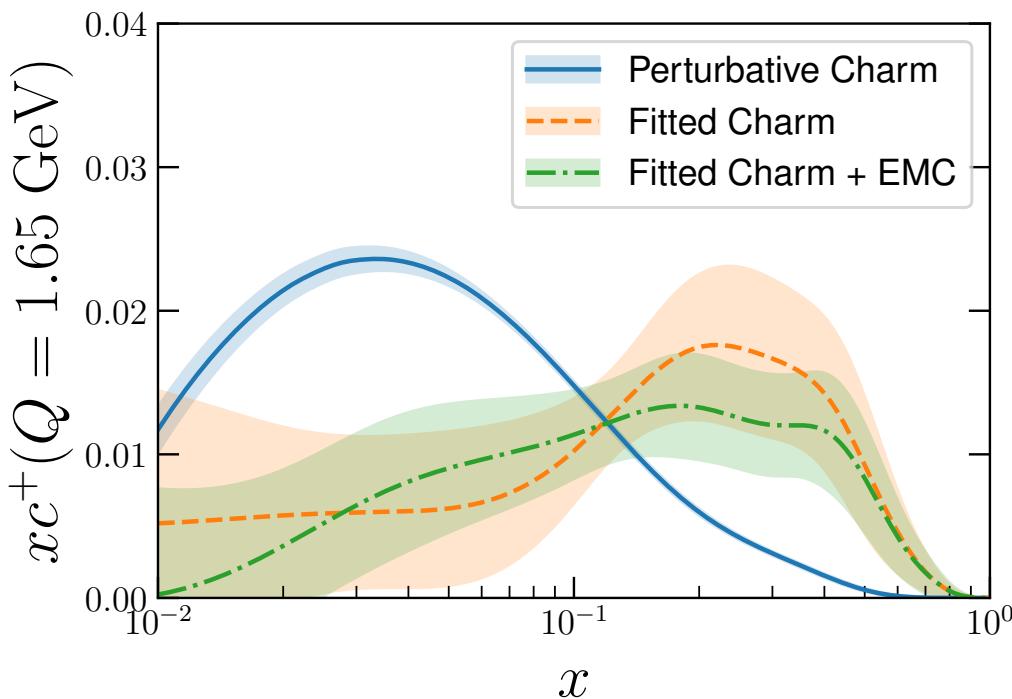
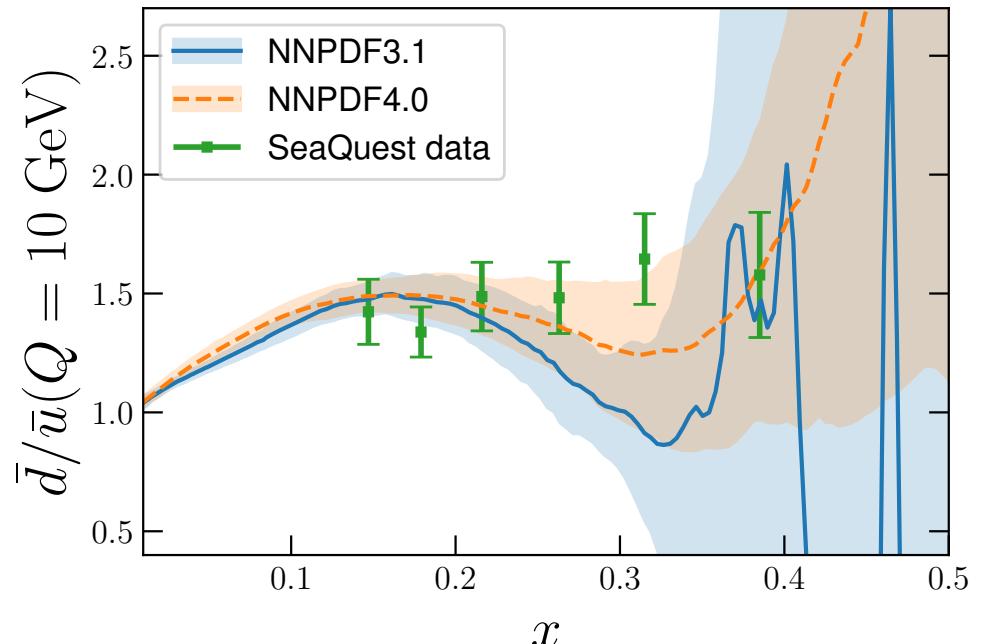
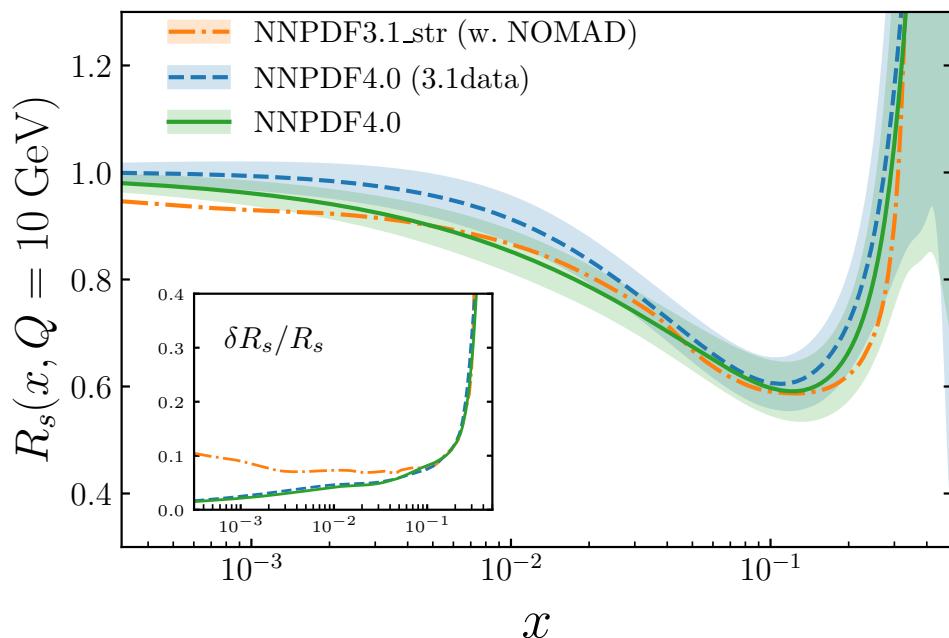
Differential top-pair production cross section at 14 TeV



Differential Higgs (with W-) cross section at 14 TeV



# From antimatter asymmetry to intrinsic charm



High-precision mapping of proton structure:

- Confirmation of **strangeness suppression factor**, full consistency with NOMAD constraints
- Excellent agreement with SeaQuest ``measurements'' of **proton antimatter asymmetry**
- Increasing evidence for a **charm component** in proton wave function

# Summary and outlook

- ➊ The global NNPDF4.0 fit achieves **1% accuracy** in an unprecedentedly broad kinematic range, thanks so its **extensive dataset** combined with **deep-learning optimisation models**
- ➋ Its faithfulness in representing PDF uncertainties is completely validated by **closure tests**, **future tests**, and **parametrisation basis independence**
- ➌ In addition to its implications for **LHC precision physics**, NNPDF4.0 sheds novel light of crucial aspects of proton structure from **light antiquark asymmetries** to **intrinsic charm**
- ➍ The current level of PDF uncertainties challenge the accuracy of theoretical predictions and demand an increased effort towards the systematic inclusion in the fit of **theoretical uncertainties** (nuclear, higher orders, SM parameters, . . . ) and **higher-order QCD** (including N3LO) **and EW corrections**

# Summary and outlook



Search docs

- Getting started
- Fitting code: n3fit
- Code for data: validphys
- Handling experimental data:  
Buildmaster
- Storage of data and theory predictions
- Theory
- Continuous integration and deployment
- Servers
- External codes
- Tutorials
- Adding to the Documentation

» NNPDF documentation View page source

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## NNPDF documentation

- The [NNPDF collaboration](#) is an organisation performing research in high-energy physics to determine the structure of the proton by producing **parton distribution functions (PDFs)**.
- This documentation is for the [NNPDF code](#), which allows the user to perform PDF fits and analyse the output.
- If you are a new user head along to [Getting started](#) and check out the [Tutorials](#).

## Contents

- [Getting started](#)
  - [Essential first steps](#)
  - [Necessary for developers](#)
- [Fitting code: n3fit](#)
  - [n3fit design](#)
- [Code for data: validphys](#)

The **NNPDF machine learning fitting framework** will be publicly released **open source**, together with extensive documentation and user-friendly examples, at same time as upcoming paper!