



# Recent Results and Ongoing Projects within NNPDF

**Juan Rojo, VU Amsterdam & Nikhef**

**PDF4LHC Working Group Meeting, CERN, 2nd December 2024**

# **NNPDF Timeline**

# NNPDF timescale

✓ Sep 2021: **NNPDF4.0**  
(paper & code)

✓ Sept 2022: **PDFs & BSM**  
**searches** ( $A_{FB}$  high-mass)

✓ Aug 2022:  
**Intrinsic charm**

✓ Nov 2023: **IC**  
**asymmetry** study

✓ Feb 2024: **NNPDF4.0**  
**aN<sup>3</sup>LO**

✓ Jan 2024: **NNPDF4.0**  
**MHOUs & QED**

✓ June 2024: **NNPDF4.0**  
**aN<sup>3</sup>LO & QED & MHOU**

✓ June 2024: **NNPDF4.0 LO, NLO & NNLO**  
for **Monte Carlo event generators**

**What comes next?**

# NNPDF timescale

📌 Oct 2024: GPU-  
based **ML hyperopt**

📌 Nov 2024: Global PDF fits  
**confront** precision LHC data

📌 Nov 2024: Combination of  
**aN<sup>3</sup>LO PDFs** for Higgs physics

📌 WIP:  $\alpha_s(m_Z)$  fit based on  
**aN<sup>3</sup>LO+QED theory** &  
closure-tested

📌 WIP: **Methodological**  
**studies** within and  
beyond NNPDF

📌 WIP: Closure tests with  
**built-in inconsistencies**

📌 WIP: **a new NNPDF release** combining all these developments!

# NNPDF timescale

this talk

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# NNPDF timescale

📌 Oct 2024: GPU-  
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**Giacomo's talk**

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**Roy's talk**

📌 WIP:  $\alpha_s(m_Z)$  fit based on  
**aN<sup>3</sup>LO+QED theory** &  
closure-tested

**Mark, James,  
Tommaso, Luigi, ....**

📌 WIP: **Methodological  
studies** within and  
beyond NNPDF

📌 WIP: Closure tests with  
**built-in inconsistencies**

**Stefano's talk**

**@ DIS 2025!**

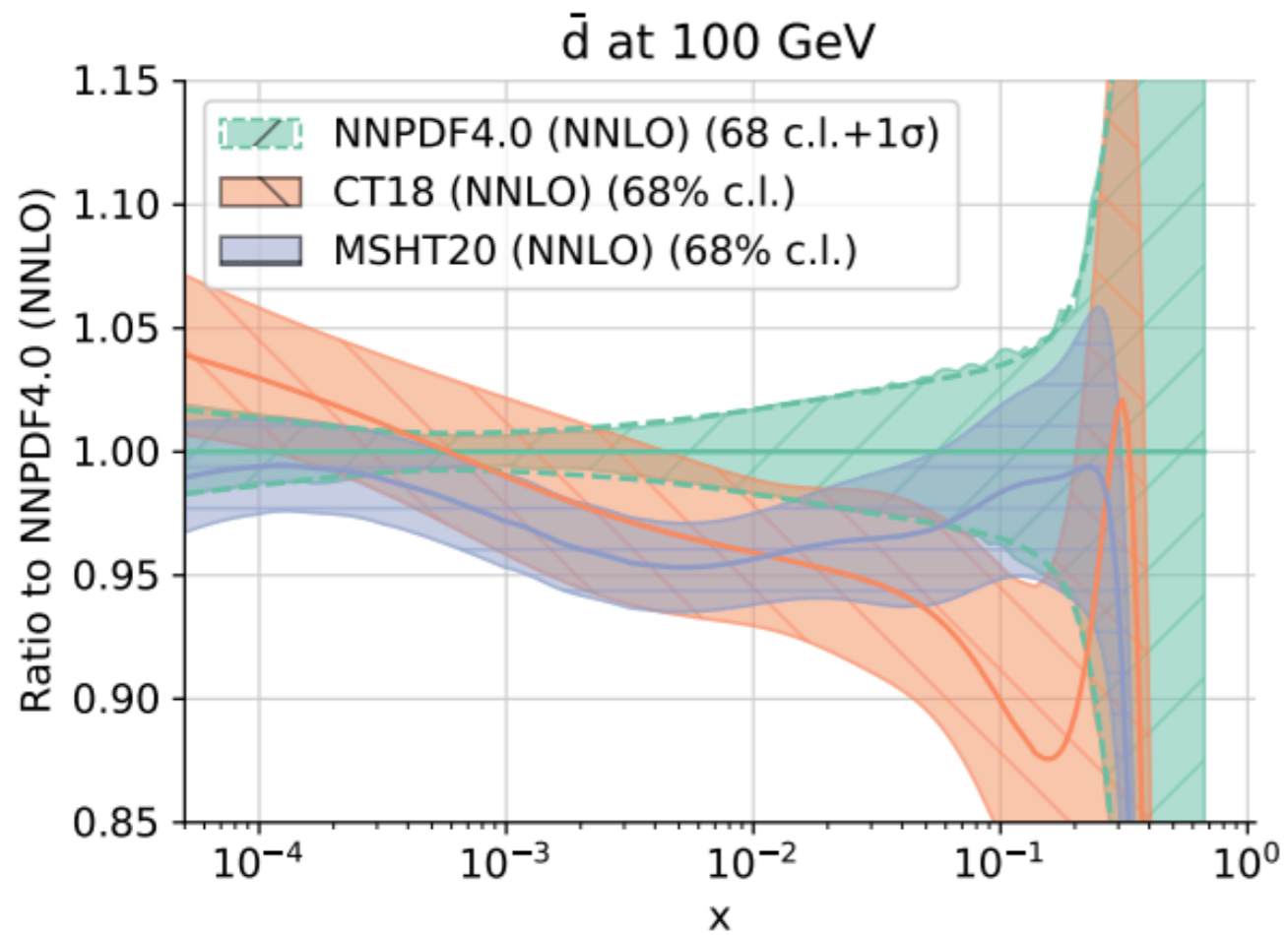
📌 WIP: **a new NNPDF release** combining all these developments!

# Parton Distributions Confront LHC Data: a Quantitative Appraisal

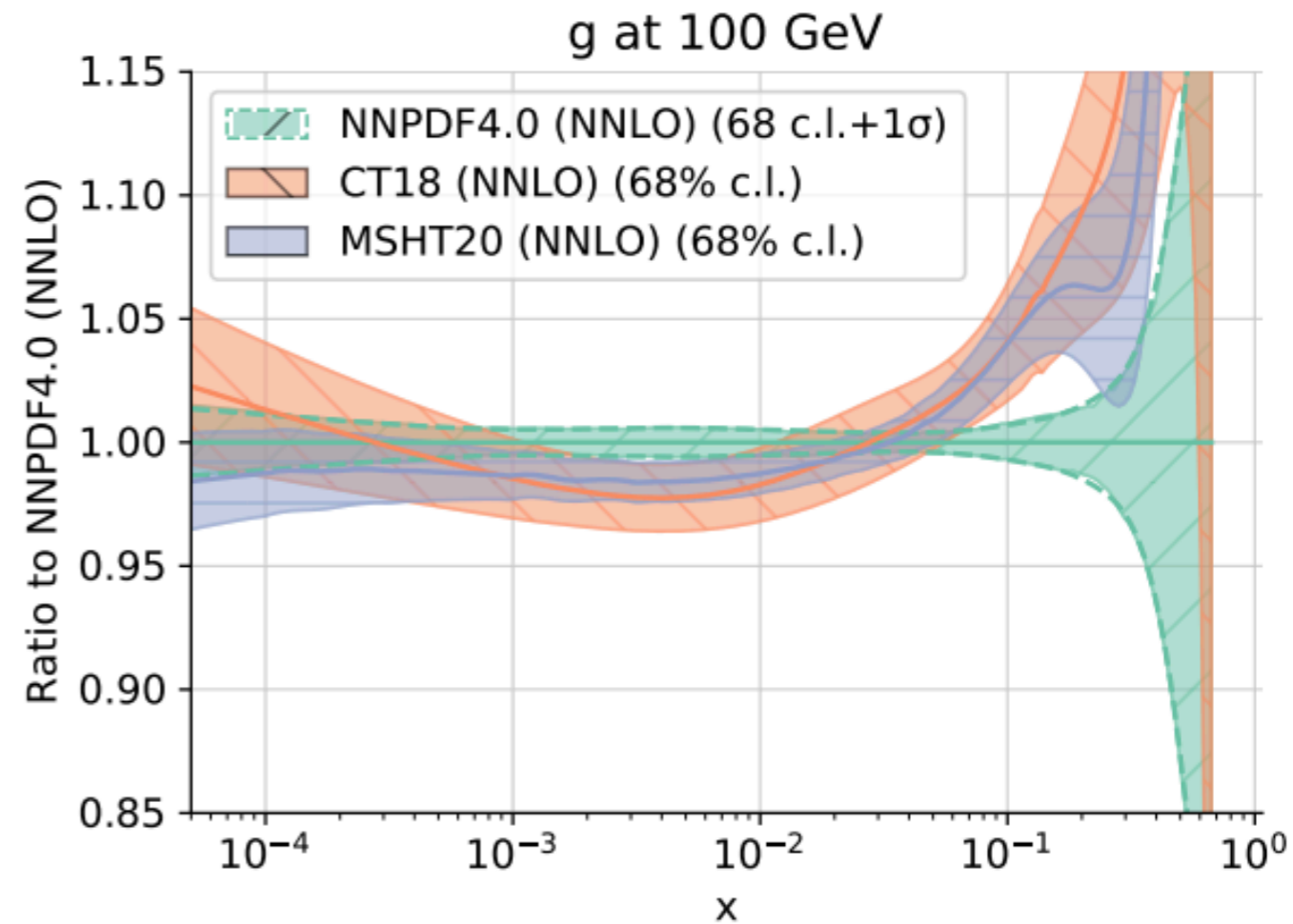
Chiefa, Costantini, Cruz-Martinez, Nocera, Rabemananjara,  
Rojo, Sharma, Stegeman, Ubiali, **arXiv:2412.aaaaa**

# Motivation

Reducing PDF uncertainties entering LHC predictions requires an **in-depth understanding of the differences and similarities between PDF analysis**



**Relevant for Drell-Yan**



**Relevant for top & jets**



# Motivation

Reducing PDF uncertainties entering LHC predictions requires an **in-depth understanding of the differences and similarities between PDF analysis**

ATLAS strong coupling extraction from Z  $p_T$  data at 8 TeV

PDF set	$\alpha_s(m_Z)$	PDF uncertainty	$g$ [GeV <sup>2</sup> ]	$q$ [GeV <sup>4</sup> ]
baseline MSHT20 [37]	0.11839	0.00040	0.44	-0.07
NNPDF4.0 [84]	0.11779	0.00024	0.50	-0.08
CT18A [29]	0.11982	0.00050	0.36	-0.03
HERAPDF2.0 [65]	0.11890	0.00027	0.40	-0.04

$$\Delta_{\text{PDF}} (\text{MSHT20 only}) = 0.34 \%$$

$$\Delta_{\text{PDF}} (\text{NNPDF4.0} - \text{CT18A}) = 1.6 \%$$

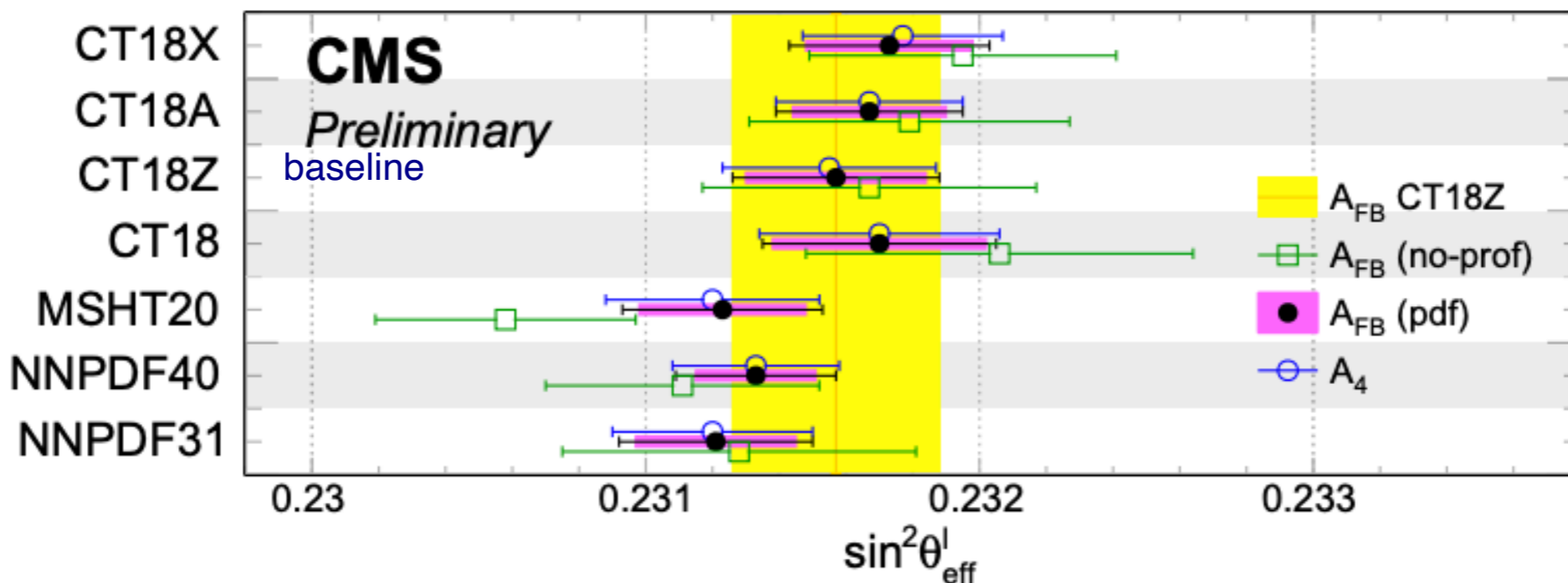
What is the “true PDF uncertainty” that should be associated to this measurement?

How to choose “baseline PDF” ? Is this an unbiased choice?

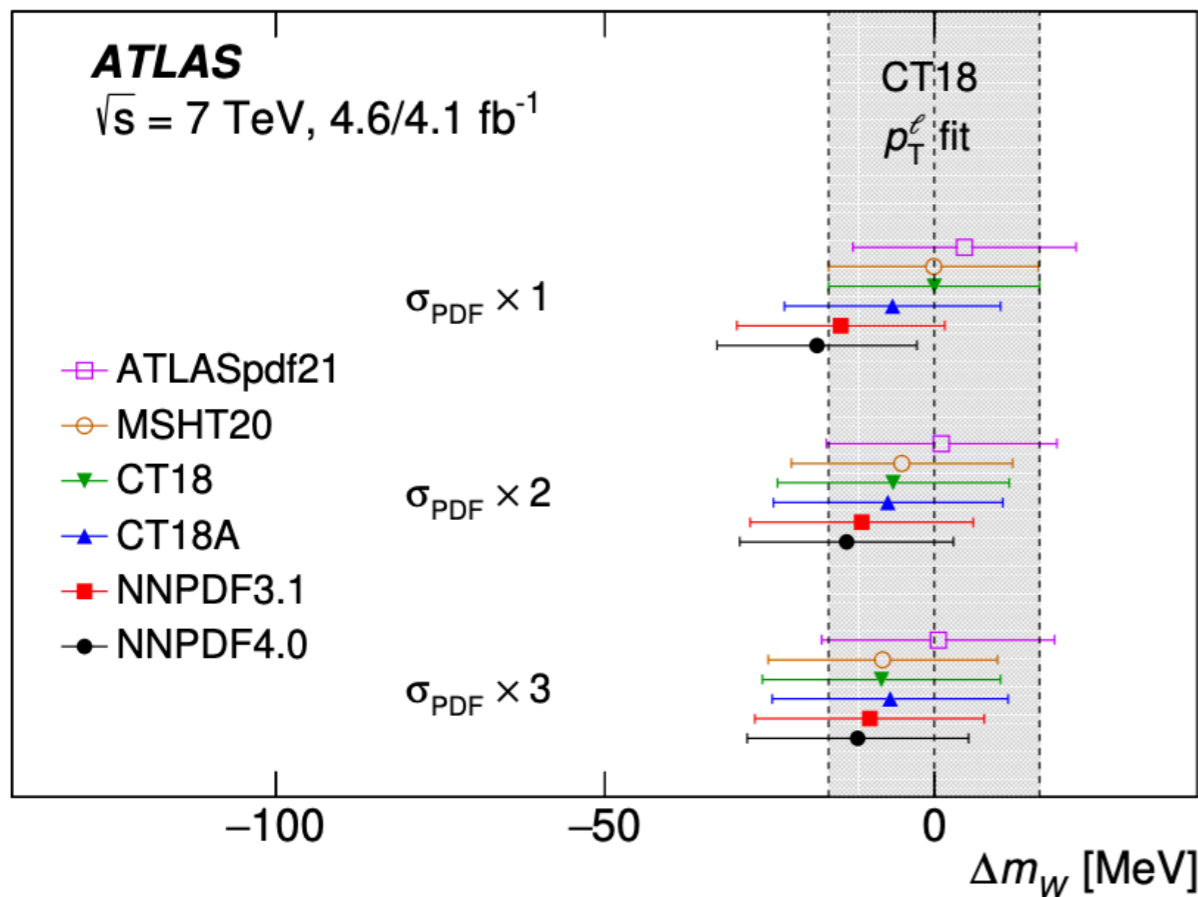
Is **in-situ profiling of PDFs** always justified? Back-reaction to other experiments in global fit?

# Motivation

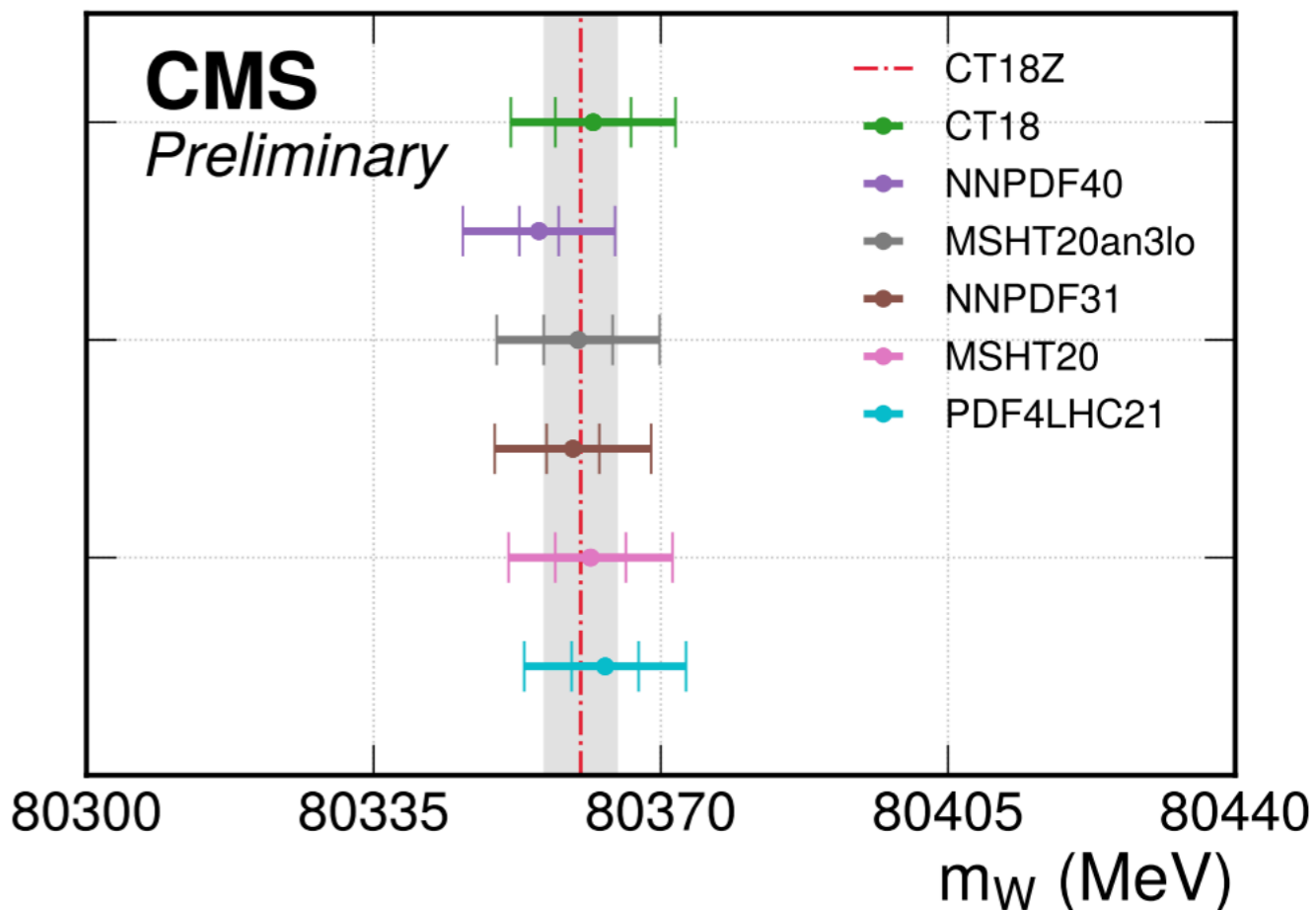
CMS determination of the weak mixing angle at 13 TeV



ATLAS determination of the  $W$  boson mass



CMS determination of the  $W$  boson mass



# Settings

Process	Experiment	Final State	Observable	$\sqrt{s}$ (TeV)	$\mathcal{L}$ (fb $^{-1}$ )	$n_{\text{dat}}$
$W, Z$	ATLAS	Z $p_T$ spectrum	$(\frac{1}{\sigma}) \frac{d\sigma}{dp_T^{\ell\bar{\ell}}}$	13	36.1	38
	ATLAS	Z incl. prod.	$\frac{d\sigma}{d y_{\ell\bar{\ell}} }$	8	20.2	7
	CMS	W incl. prod.	$\frac{d\sigma}{d \eta_{\ell} }$	13	35.9	36
	LHCb	Z incl. forward prod.	$\frac{d\sigma}{dy_Z}$	13	5.1	17
LHC jets	ATLAS	incl. jet $R = 0.4$ (0.7)	$\frac{d^2\sigma}{dp_T^j d y_j }$	13	3.2	177
	ATLAS	di-jets $R = 0.4$	$\frac{d^2\sigma}{dm_{jj} d y^* }$	13	3.2	136
	CMS	incl. jets $R = 0.4$ (0.7)	$\frac{d^2\sigma}{dp_T^j d y_j }$	13	36.3 (33.5)	78
DIS-jets	H1	incl. jet (low $Q^2$ )	$\frac{d^2\sigma}{dQ^2 dp_T^j}$	0.319	0.29	48
	H1	di-jets (low $Q^2$ )	$\frac{d^2\sigma}{dQ^2 d\langle p_T \rangle_2}$	0.319	0.29	48
	H1	incl. jet (high $Q^2$ )	$\frac{d^2\sigma}{dQ^2 dp_T^j}$	0.319	0.351	24
	H1	di-jets (high $Q^2$ )	$\frac{d^2\sigma}{dQ^2 d\langle p_T \rangle_2}$	0.319	0.351	24
	ZEUS	incl. jet	$\frac{d^2\sigma}{dQ^2 dE_T^j}$	0.3	0.038	30
	ZEUS	incl. jet	$\frac{d^2\sigma}{dQ^2 dE_T^j}$	0.319	0.082	30
	ZEUS	di-jets	$\frac{d^2\sigma}{dQ^2 d\langle E_T \rangle_2}$	0.319	0.374	22
top-pair	ATLAS	hadronic	$(\frac{1}{\sigma}) \frac{d\sigma}{dm_{t\bar{t}}}$	13	36.1	9
			$(\frac{1}{\sigma}) \frac{d\sigma}{d y_{t\bar{t}} }$	13	36.1	12
			$(\frac{1}{\sigma}) \frac{d^2\sigma}{d y_{t\bar{t}}  dm_{t\bar{t}}}$	13	36.1	11
	ATLAS	$\ell$ +jets	$(\frac{1}{\sigma}) \frac{d\sigma}{dm_{t\bar{t}}}$	13	36.1	9
			$(\frac{1}{\sigma}) \frac{d\sigma}{dp_{T,t}}$	13	36.1	8
			$(\frac{1}{\sigma}) \frac{d\sigma}{d y_t }$	13	36.1	5
			$(\frac{1}{\sigma}) \frac{d\sigma}{d y_{t\bar{t}} }$	13	36.1	7
	CMS	$\ell$ +jets	$(\frac{1}{\sigma}) \frac{d\sigma}{dm_{t\bar{t}}}$	13	137	15
			$(\frac{1}{\sigma}) \frac{d\sigma}{dp_{T,t}}$	13	137	16
			$(\frac{1}{\sigma}) \frac{d\sigma}{d y_{t\bar{t}} }$	13	137	10
$(\frac{1}{\sigma}) \frac{d\sigma}{d y_t }$			13	137	11	
$(\frac{1}{\sigma}) \frac{d^2\sigma}{d y_{t\bar{t}}  dm_{t\bar{t}}}$			13	137	35	

📍 **NNLO fast grids** for all processes (no  $K$ -factors)

📍 Datasets based on **highest lumi**, no overlap with inputs in considered PDF fits

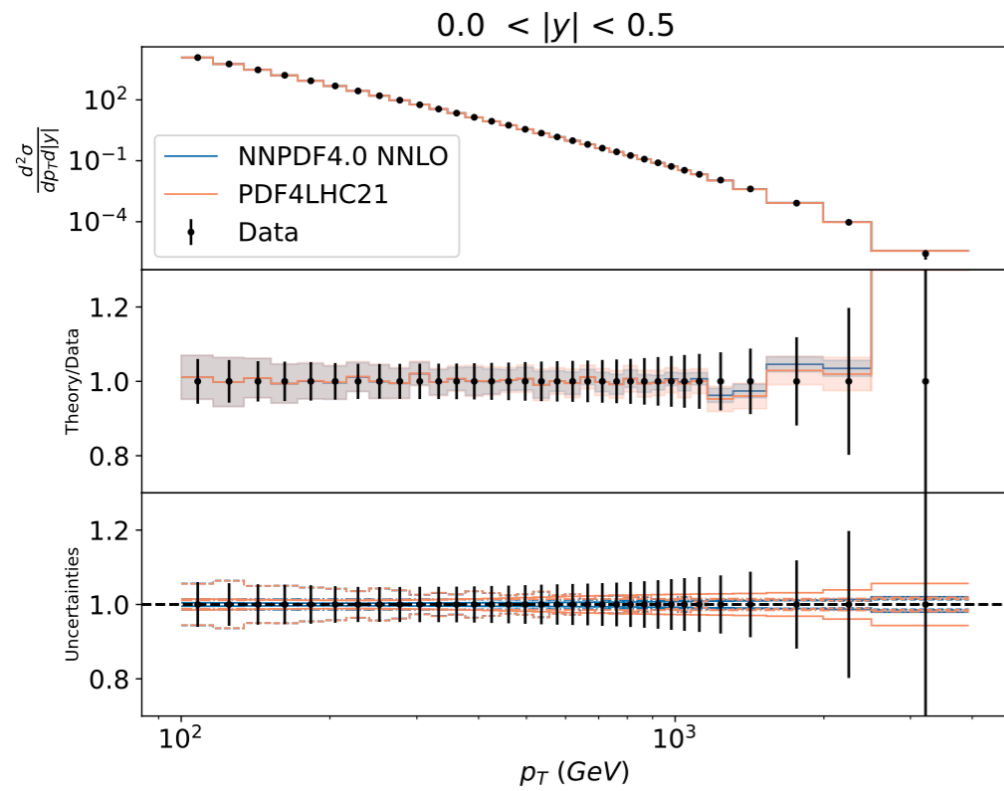
📍 Include all sources of **experimental & theory uncertainties**

📍 For datasets with unstable covariance matrix, apply **regularisation prescription**

$$\chi_{\text{exp+th}}^2 = \sum_{i,j=1}^{n_{\text{dat}}} \left( T_i^{(0)} - D_i \right) \left( (\text{COV}_{\text{exp}} + \text{COV}_{\text{mho}} + \text{COV}_{\text{pdf}} + \text{COV}_{\text{as}})^{-1} \right)_{ij} \left( T_j^{(0)} - D_j \right)$$

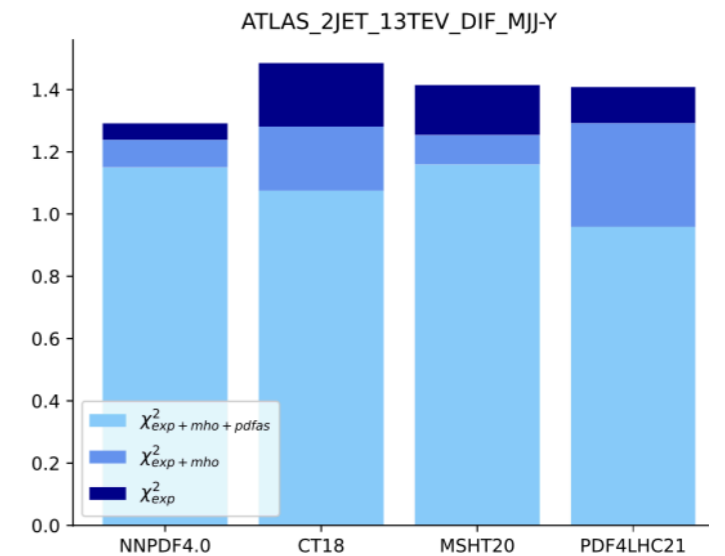
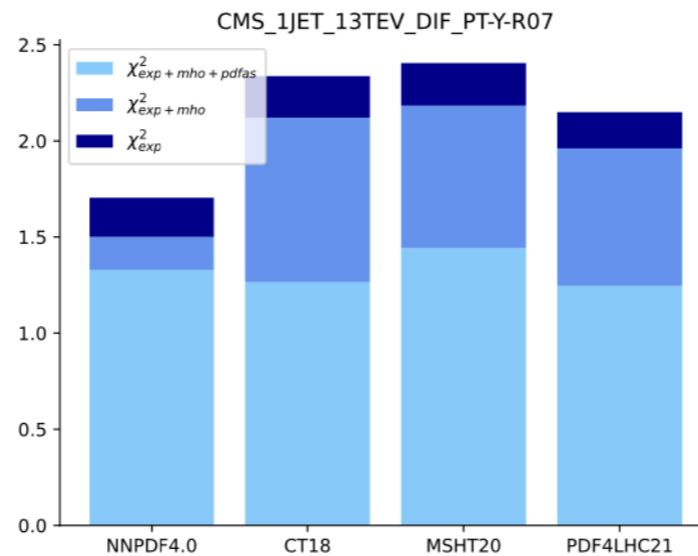
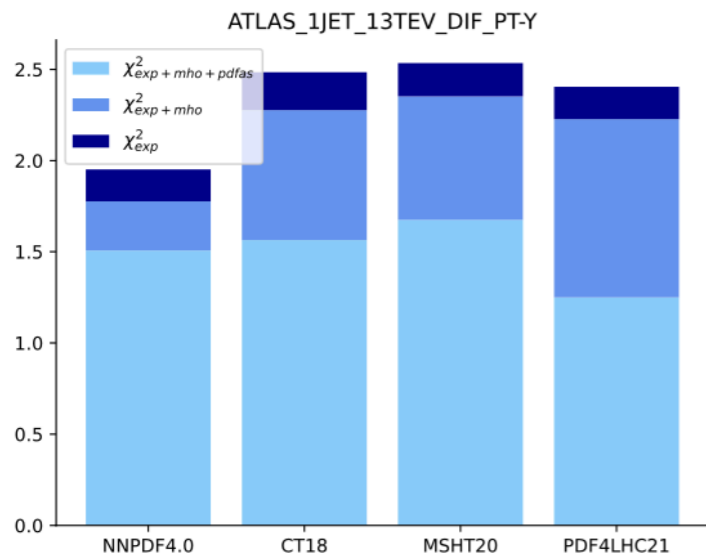
**7pt prescription**

# Results

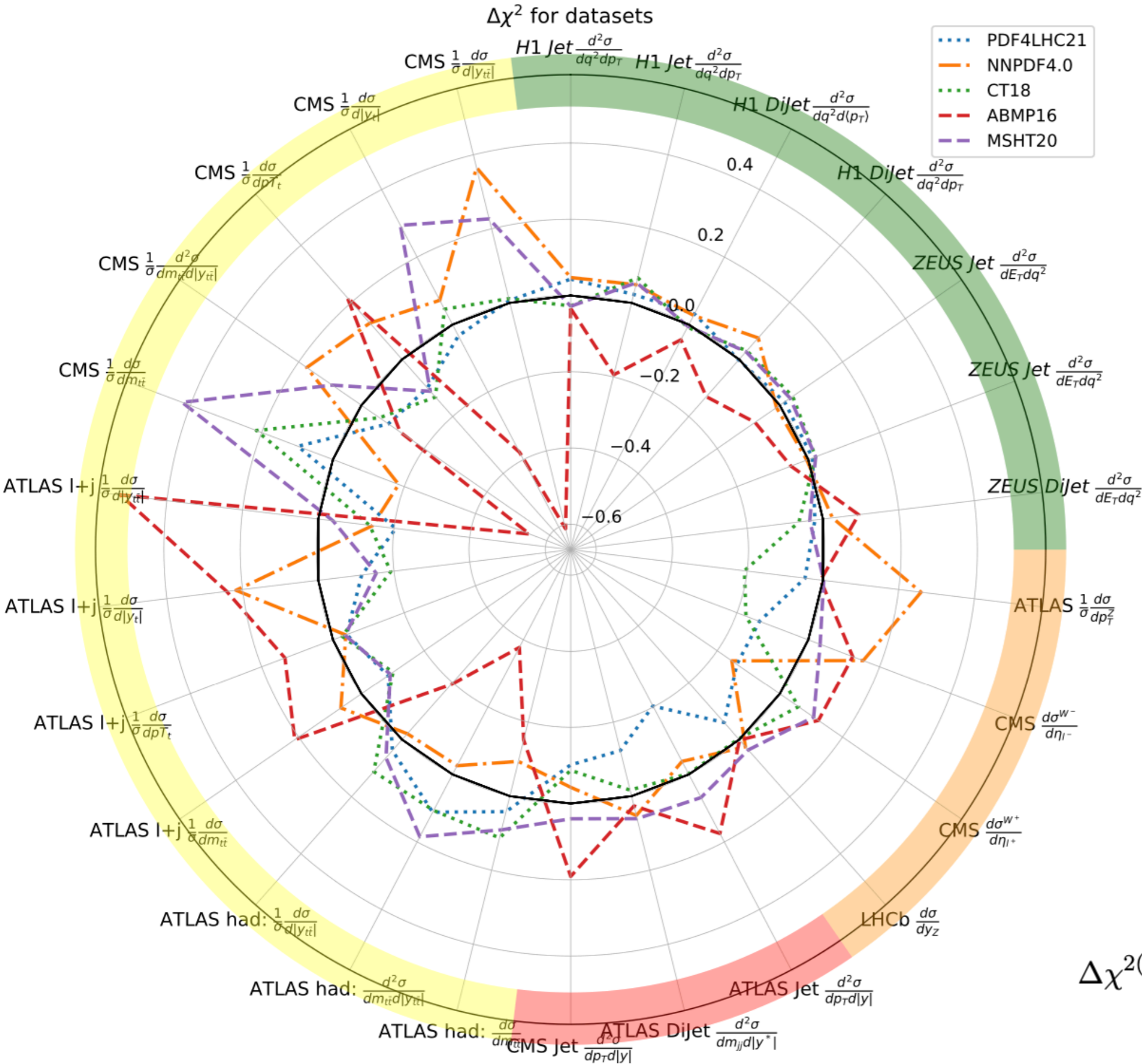


- For each dataset, **evaluate  $\chi^2$  breakdown** and data vs theory comparison plots (with shifted systematics)
- 9 different PDF sets considered**, extension to other PDF sets straightforward (fast NNLO QCD grids)
- For ABMP16, set with  $\alpha_s(m_Z) = 0.118$  adopted

		ABMP16	CT18	CT18A	CT18Z	MSHT20	NN3.1	NN4.0	PLHC15	PLHC21
ATLAS incl. jet	$\chi_{\text{exp+th}}^2$	1.84	1.56	1.64	1.38	1.67	1.21	1.51	1.20	1.25
	$\chi_{\text{exp}}^2$	2.32	2.48	2.47	2.50	2.53	2.98	1.95	3.02	2.40
CMS incl. jet	$\chi_{\text{exp+th}}^2$	1.65	1.26	1.26	1.19	1.44	1.50	1.33	1.25	1.25
	$\chi_{\text{exp}}^2$	2.10	2.34	2.31	2.03	2.41	2.28	1.70	2.46	2.15
ATLAS dijet	$\chi_{\text{exp+th}}^2$	1.12	1.08	1.09	1.05	1.16	1.09	1.15	1.01	0.96
	$\chi_{\text{exp}}^2$	1.35	1.49	1.47	1.48	1.41	1.37	1.29	1.42	1.41



# Results



Despite PDF differences, **no systematic outlier** in dataset description

Fully accounting for **theory errors** crucial

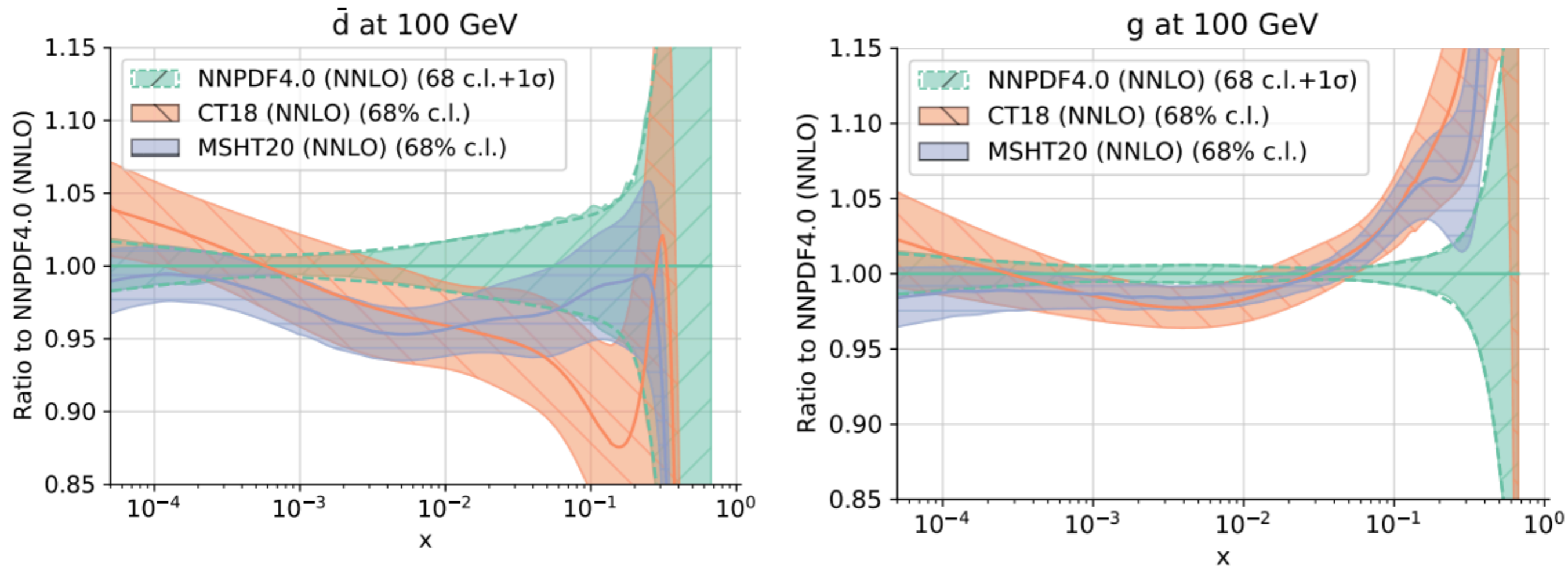
PDF4LHC21 represents the **“average”** behaviour

**Jet data** offers good discrimination power

$$\Delta\chi^{2(i)} = \frac{\chi_{\text{exp+th}}^{2(i)} - \langle \chi_{\text{exp+th}}^2 \rangle_{\text{pdfs}}}{\langle \chi_{\text{exp+th}}^2 \rangle_{\text{pdfs}}}$$

# Take-away lesson

Reducing PDF uncertainties entering LHC predictions requires an **in-depth understanding of the differences and similarities between PDF analysis**



Despite NNPDF4.0 displaying **smaller PDF uncertainties as compared to other fits**, its **agreement with Run II data** is of comparable quality (or even better!)

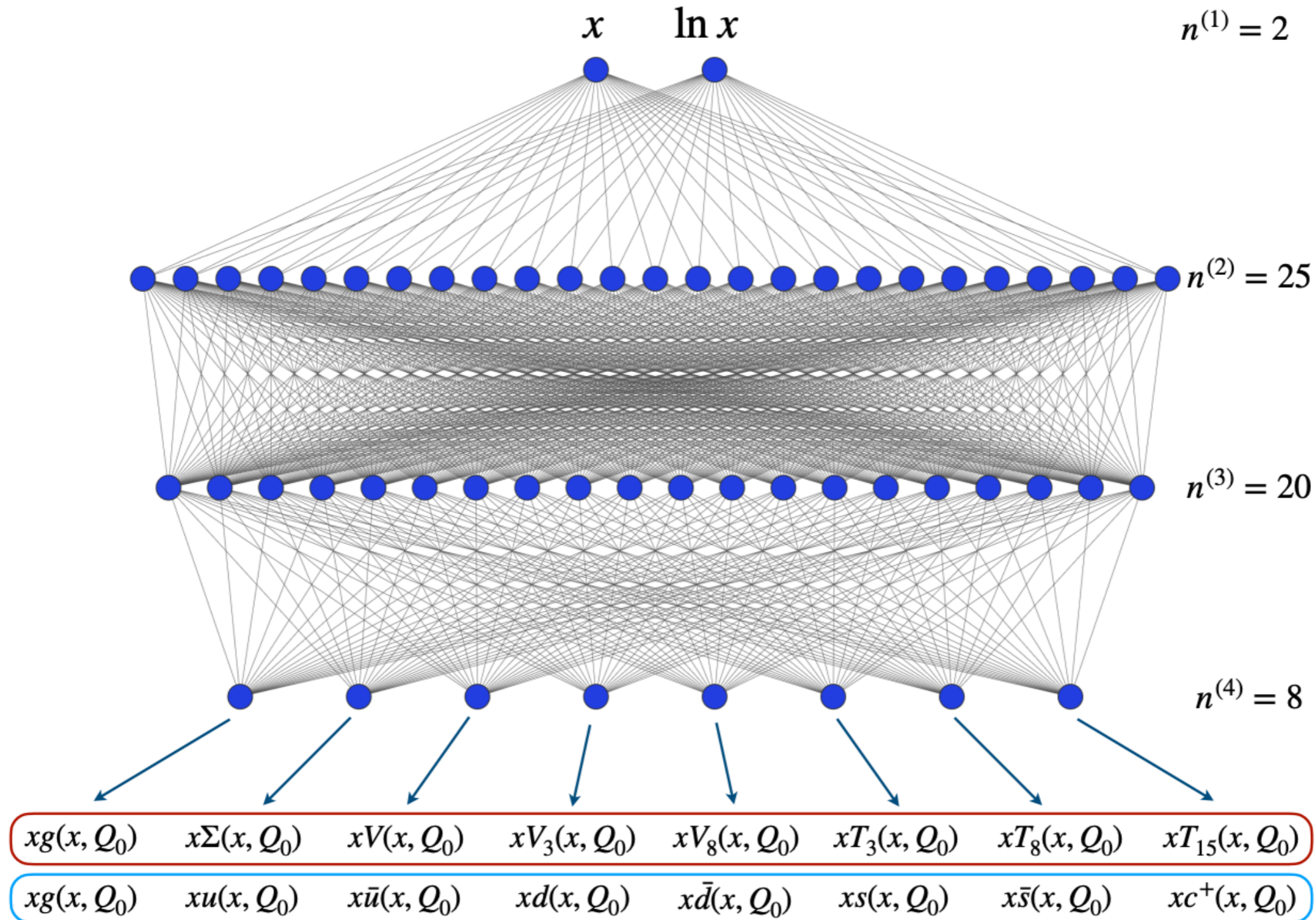
**falsifying the claim that NNPDF4.0 errors are somehow “underestimated”**

# Ensemble-based hyperoptimization in ML

Cruz-Martinez, Jansen, van Oord, Rabemananjara,  
Rocha, Rojo, Stegeman, [arXiv:2410.16248](https://arxiv.org/abs/2410.16248)

netherlands  
**eScience** center

# Hyperoptimisation in Machine Learning

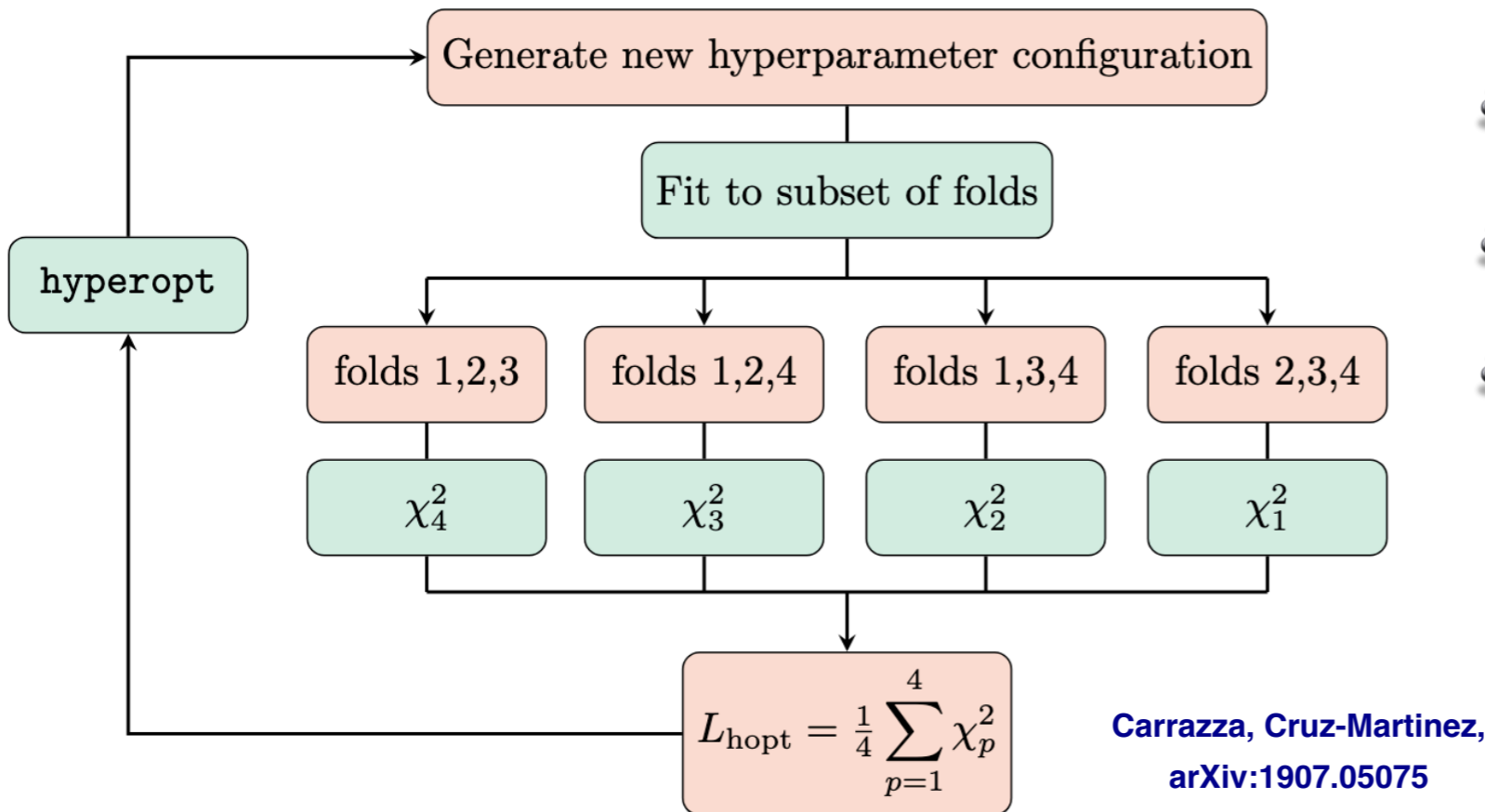


- ML applications rely on a **large number of hyperparameters** which are not fixed by the training algorithm: architecture, optimiser, initialisation, stopping, activation functions ...
- Choosing hyperparameters is a challenge in many cases. **Bias-free optimisation** is crucial!



# Hyperoptimisation in Machine Learning

## NNPDF4.0



- Partition global dataset into  $n$  folds
- Exclude one fold at a time, perform  $n$  fits
- Select hyperparameters leading to **best  $\chi^2$  to the non-fitted data**

Based on central PDF fit

- Select hyperparameters leading to **best  $\chi^2$  & largest PDF errors in non-fitted data**
- e.g. models with the **best generalisation power** are selected

Requires major restructure of NNPDF code to be able to train multiple ML models in parallel

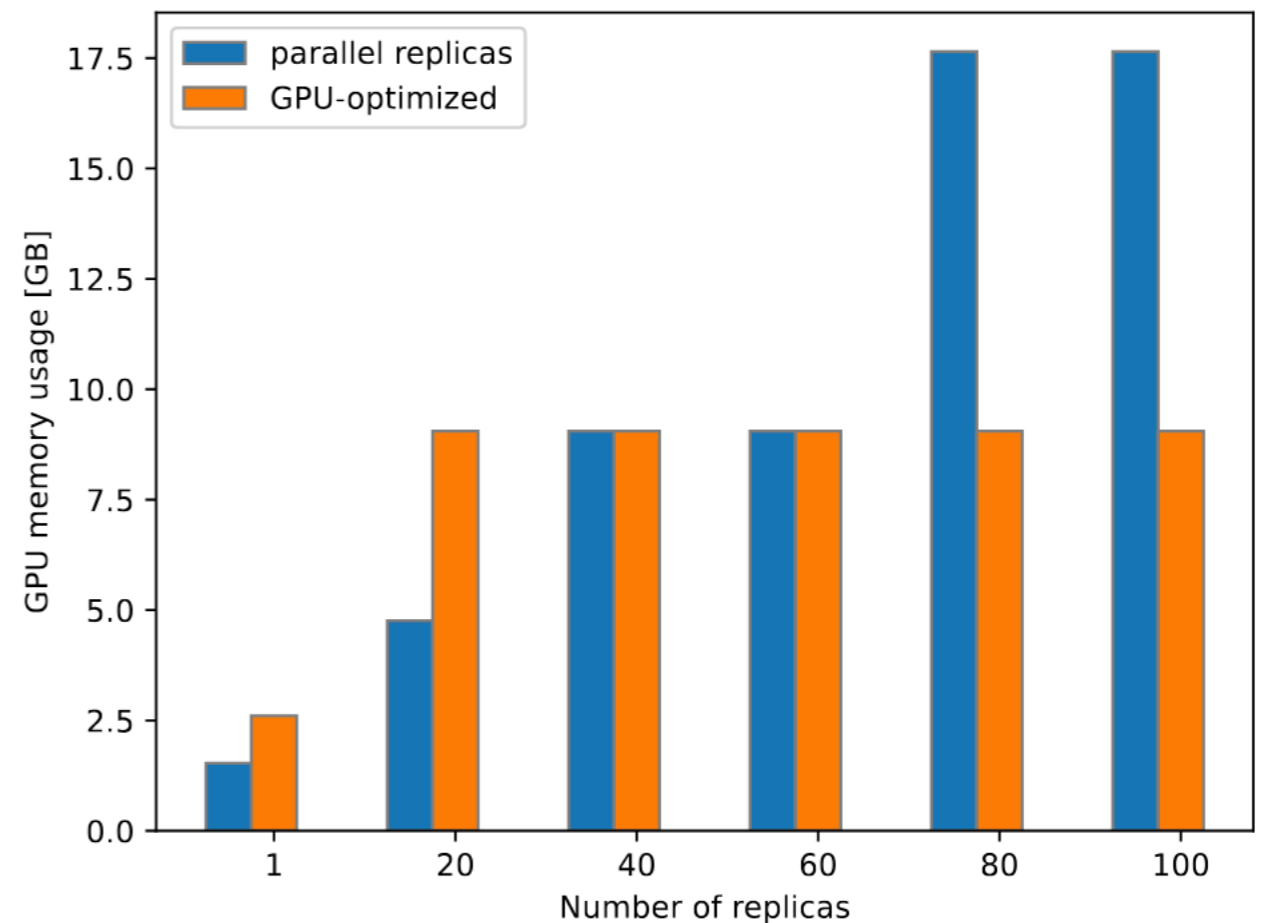
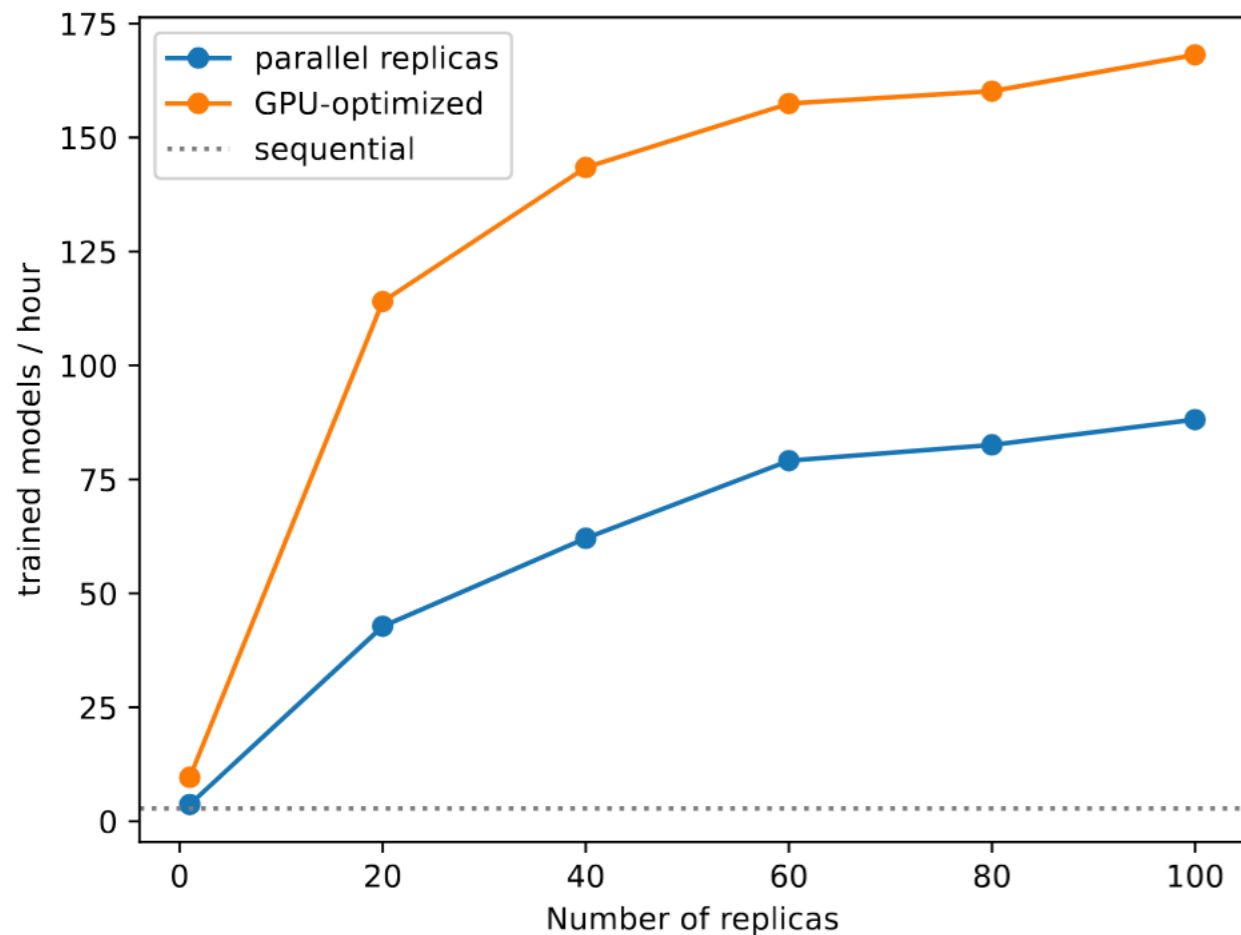
This work

$$\varphi_{\chi^2}^2 \equiv \left\langle \chi^2 [T, D^{(0)}] \right\rangle_{\text{rep}} - \chi^2 [\langle T \rangle_{\text{rep}}, D^{(0)}]$$

$$\varphi_{\chi^2}^2 = \frac{1}{n_{\text{dat}}} \sum_{i,j=1}^{n_{\text{dat}}} (\text{cov})_{ij}^{-1} T_{ji}$$

$$L_{\text{hopt}}^{(\varphi^2)}(\hat{\theta}) \equiv \left( \frac{1}{n_{\text{fold}}} \sum_{p=1}^{n_{\text{fold}}} \varphi_{\chi_p^2}^2(\hat{\theta}) \right)^{-1}$$

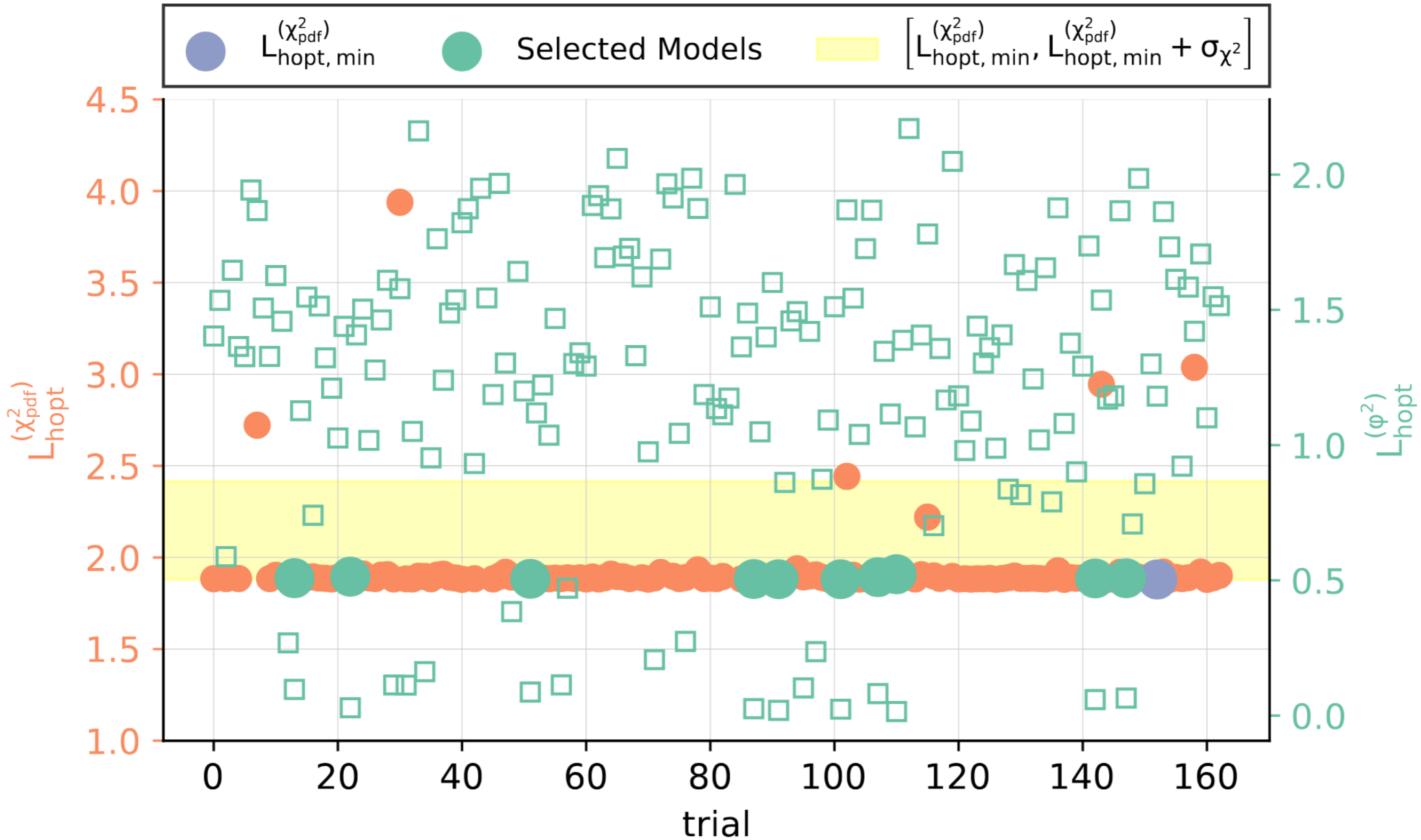
# GPU-optimised NNPDF fits



Replicas	10	50	100
Energy reduction	78%	87%	91%
Cost reduction	-45%	47%	55%

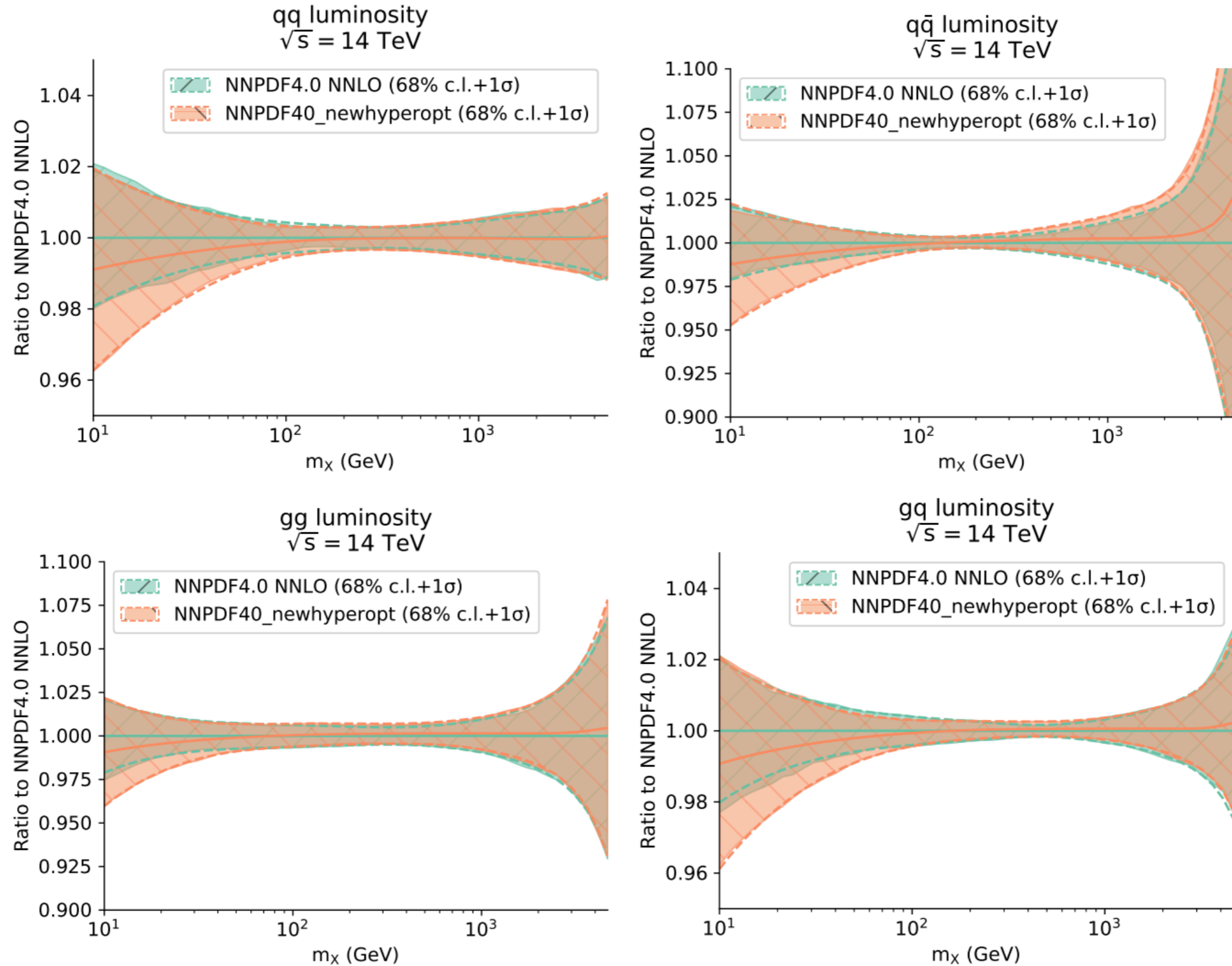
- 🚀 **Speed up by a factor 200** from new GPU-optimise NNPDF code
- 🚀 Memory usage kept under control, independent of number of models trained in parallel
- 🚀 Up to 90% energy reduction: **faster, more affordable, and more sustainable** ML model training!

# Results



Select not the best single set of hyperparameters but **instead randomly sample over the complete population of acceptable hyperparameters** displaying comparable performance

# Impact on LHC predictions



Despite radical change in hyperparameter determination methodology, **excellent consistency with NNPDF4.0 & moderate increase of PDF errors**: non-trivial validation of NNDF robustness

**What's next?**

# Towards the next NNPDF release

The developments presented in this talk and in the rest of NNPDF-related talks in the workshop will in the next months be combined **towards a new main NNPDF release**

## Theory Calculations

- 📌 **NNLO fast interpolation grids** for hadronic processes
- 📌 Remove NNLO *K*-factors from fit
- 📌 **aN<sup>3</sup>LO+QED** with **MHOUs** as default theory baseline
- 📌 Move to **latest version of Moch et al  $P_{ij}^{(3)}(x)$**
- 📌 Numerical FONLL as general-mass VFN

## Experimental Data

- 📌 Most recent **LHC Run-2 datasets**, including some based on full luminosity
- 📌 Many of them ready to go from our **PDF appraisal study**
- 📌 **HERA DIS+jets** part of the baseline dataset
- 📌 **Novel standardised data format** enabling versioning & metadata

## Methodology

- 📌 New GPU **replica-based hyperopt**, different ML model per replica
- 📌 Validation on (inconsistent) **closure tests** and future tests
- 📌 **Feature Scaling**, remove large-x pre-processing
- 📌 **Updated theory pipeline** based on EKO + YADISM + PineAPPL

# Towards the next NNPDF release

INCLUSIVE DIS			
Experiment ID	Description	Publication	Hepdata
JLAB	Proton, Deuteron and neutron structure function data from JLAB	<a href="#">Paper</a>	Accardi, <a href="#">tarball here</a>
CHORUSDM	CHORUS dimuon production measurements	<a href="#">Paper</a>	Paper
CDHSW	A measurement of differential cross sections and nucleon structure functions in charged current neutrino interactions on iron (F2p, F3p)	<a href="#">Paper</a>	<a href="#">Hepdata</a>
CCFR/Nutev	Measurements of F2 and F3 (neutrino) - F3(antineutrino) from CCFR (anti)neutrino-Fe data	<a href="#">Paper1</a> <a href="#">Paper2</a>	<a href="#">Hepdata</a>
ZEUS	Event count at large x	<a href="#">Paper</a>	

## DRELL YAN, V pT, and DIBOSC

Experiment ID	Description	Publication	Hepdata
ATLAS_WZ_276TEV_RAP	ATLAS W, Z inclusive production at 2.76 TeV: fiducial xsecs and asymmetries	<a href="#">Paper</a>	n/a
ATLASWZ5TEV	ATLAS W and Z production, 5 TeV (25 pb <sup>-1</sup> ) total and differential xsec	<a href="#">Paper</a>	Paper
ATLASZJETS8TEV	ATLAS Z+jets at 8 TeV	<a href="#">Paper</a>	
ATLAS_tbd8TEV	ATLAS Z full phase-space, 2D (pTZ,yZ) xsec, 8 TeV, 20 fb <sup>-1</sup>	<a href="#">Paper</a>	
ATLASZJET13TEV	ATLAS Z+jet at 13 TeV	<a href="#">Paper</a>	<a href="#">Paper</a> <a href="#">HepData</a>
ATLASWW13TEV	ATLAS WW cross section at 13 TeV, 3.12 fb <sup>-1</sup>	<a href="#">Paper</a>	<a href="#">HepData</a>
ATLAS_Zjet_13TEV	ATLAS Z+jet at 13 TeV	<a href="#">Paper</a>	

ATLAS_WC_13TEV	ATLAS W+charm at 13 TeV 140 fb <sup>-1</sup>	<a href="#">Paper</a>	
CMSZPHI8TEV	CMS Z Phi <sup>+</sup> distributions 8 TeV (19.7 fb <sup>-1</sup> )	<a href="#">Paper</a>	<a href="#">CMS page</a>
CMS_WPT_8TEV	CMS W pt distribution, 8 TeV (18.4 fb <sup>-1</sup> )	<a href="#">Paper</a>	<a href="#">Hepdata</a>
CMS_WC_8TEV	CMS W+charm at 8 TeV (18.4 fb <sup>-1</sup> )	<a href="#">Paper</a>	
CMS_tbd_8TEV	CMS forward-backward asymmetry in Z production at 8 TeV (18.4 fb <sup>-1</sup> )	<a href="#">Paper</a>	
CMS_Zjet_13TEV	CMS Z+jet at 13 TeV	<a href="#">Paper</a>	
CMS_Zb_13TEV	CMS Z+b and Z+c at 13 TeV	<a href="#">Paper</a>	
CMS_Zc_13TEV			
CMS_Zcbratio_13TEV			
CMS_DY_DIFF_13TEV	CMS differential DY cross sections at 13 TeV, 3 fb <sup>-1</sup>	<a href="#">Paper</a>	
CMS_W2D_13TEV	CMS double differential cross-sections for W production at 13 TeV and 35.9 fb <sup>-1</sup> double differential in pT <sup>lepton</sup> and y <sub>lepton</sub>  Also helicities and charge-asymmetry	<a href="#">Paper</a>	
CMS_WC_13TEV	CMS differential distributions (lepton rapidity and pT) in W+c production at 13 TeV and 138 fb <sup>-1</sup>	<a href="#">Paper</a>	
CMS_ZC_13TEV	CMS measurement of Z+charm as a function of Z pT at 13 TeV and 36 fb <sup>-1</sup>	<a href="#">Paper</a>	
LHCb_tbd_TEV	LHCb inclusive Z production and differential distributions at 5 TeV	<a href="#">Paper</a>	
LHCb_Z_dimuons_13TEV_RunII	LHCb inclusive Z production at 13 TeV, full Run II luminosity	<a href="#">Paper</a>	

## PHOTON PRODUCTION

Experiment ID	Description	Publication	Hepdata
CDFINCLPHOT	CDF inclusive photon cross-section	<a href="#">Paper</a>	
ATLASPHT11	ATLAS isolated photon production 7 TeV, 4.6 fb <sup>-1</sup>	<a href="#">Paper</a>	<a href="#">HepData</a>
ATLASDIPHOT8TEV	ATLAS diphoton differential	<a href="#">Paper</a>	<a href="#">HEPData</a>

ATLAS_PHT_13TEV	ATLAS isolated photon production 13 TeV, 139 fb <sup>-1</sup>	<a href="#">Conf note</a>	
CMSPHT11	CMS isolated photon production 7 TeV, 36 pb <sup>-1</sup>	<a href="#">Paper</a>	
CMSPHT15	CMS isolated photon production 13 TeV, 2.3 fb <sup>-1</sup>	<a href="#">Paper</a>	

## INCLUSIVE JET PRODUCTION

Experiment ID	Description	Publication	Hepdata
ATLAS3JET11	ATLAS three jet production 7 TeV, 5 fb <sup>-1</sup>	<a href="#">Paper</a>	
ATLASJET13TEV	ATLAS inclusive jet and dijet cross-sections at 13 TeV 3.2fb <sup>-1</sup>	<a href="#">Paper</a>	<a href="#">HepData</a>
ATLASJET13TEV	ATLAS inclusive jet and dijet cross-sections at 13 TeV 3.2fb <sup>-1</sup>	<a href="#">Paper</a>	<a href="#">HepData</a>
ALICE_1JET_5TEV	ALICE inclusive jet production at 5.02 TeV	<a href="#">Paper</a>	
CMS_1JET_13TEV	CMS inclusive jet production at 13 TeV, 36.3 fb <sup>-1</sup>	<a href="#">Paper</a>	<a href="#">HepData</a>

## TOP PAIR PRODUCTION

Experiment ID	Description	Publication	Hepdata
CMS_TTB_DIFF_13TEV	CMS single and double differential distributions in the lepton+jet channel 13 TeV 137 fb <sup>-1</sup>	<a href="#">Paper</a>	<a href="#">HepData</a>
ATLAS_TTB_DIFF_PT_NORM_13TEV	ATLAS single differential distributions of top-pair production in the lepton+jet channel 13 TeV, 36 fb <sup>-1</sup>	<a href="#">Paper</a>	<a href="#">HepData</a>
ATLAS_TTB_DIFF_PT_13TEV			
ATLAS_TTB_DIFF_TRAP_NORM_13TEV			
ATLAS_TTB_DIFF_TRAP_13TEV			
ATLAS_TTB_DIFF_TTRAP_NORM_13TEV			
ATLAS_TTB_DIFF_TTRAP_13TEV			
ATLAS_TTB_DIFF_TTM_NORM_13TEV			
ATLAS_TTB_DIFF_TTM_13TEV			
ATLAS_TTB_DIFF_13TEV_140fb	ATLAS single and double differential distributions of top-pair production in the di-lepton channel (particle level) 13 TeV, 36 fb <sup>-1</sup>	<a href="#">Paper</a>	
ATLAS_2D_TTBAR (various distributions)	ATLAS single and double differential distributions of top-	<a href="#">Paper</a>	n/a

ATLAS_INCL_TOPTOZ_RATIO_7TEV	ATLAS top-quark pair to Z-boson cross-section ratios, 7 TeV	<a href="#">Paper</a>	<a href="#">Hepdata</a>
ATLAS_INCL_TOPTOZ_RATIO_8TEV	ATLAS top-quark pair to Z-boson cross-section ratios, 8 TeV	<a href="#">Paper</a>	<a href="#">Hepdata</a>
ATLAS_INCL_TOPTOZ_RATIO_13TEV	ATLAS top-quark pair to Z-boson cross-section ratios, 13 TeV	<a href="#">Paper</a>	<a href="#">Hepdata</a>
ATLAS_TTBAR_TOT_7TEV_LJET	ATLAS top-pair production total cross section, lepton+jets, 7 TeV 4.6 fb <sup>-1</sup>	<a href="#">Paper</a>	

all datasets studied in the "appraisal" paper and many more, NNLO fast grids as baseline

# Summary and outlook

- ☑ Lots of progress in the NNPDF global analysis framework and related studies: **aN<sup>3</sup>LO+QED PDFs**, their combinations, and the associated  $\alpha_s(m_Z)$  extraction, methodological studies, inclusion of novel datasets with fast NNLO interpolation grids ....
- ☑ A quantitative appraisal of PDF fits with precision LHC data **does not indicate better agreement with the data for any specific PDF set**, despite the underlying differences
- ☑ **Improved hyperoptimisation** demonstrates the robustness of the NNPDF uncertainty estimate. As a non-trivial bonus, GPU-optimised code displays now major speedups.
- ☑ These developments will be combined in the coming months, aiming to for a new release of the NNPDF global fit.



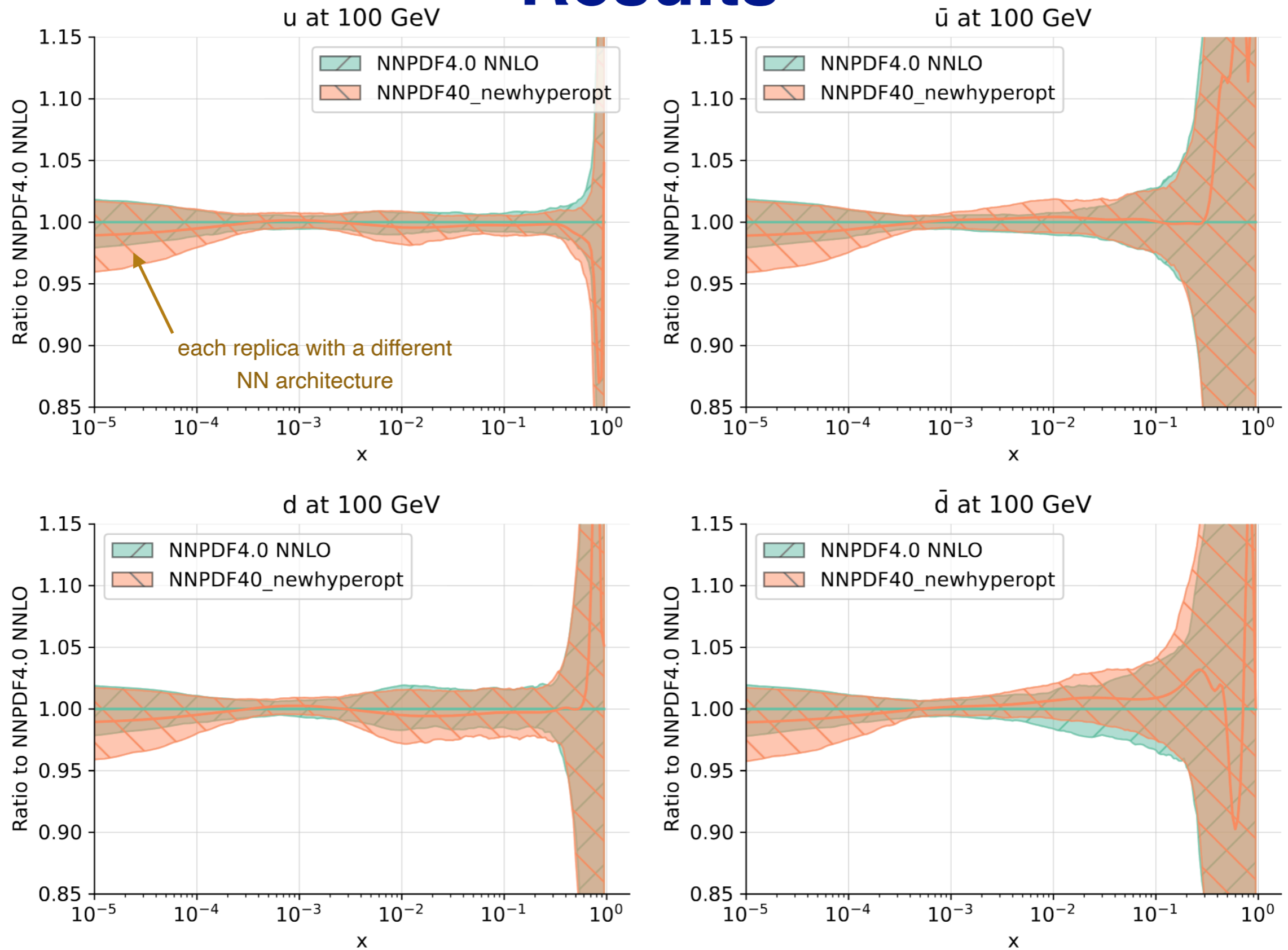
# Summary and outlook

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- ☑ A quantitative appraisal of PDF fits with precision **indicate better agreement with the data for any set of parameters** and the underlying differences
- ☑ Improved uncertainty estimates demonstrate the robustness of the NNPDF uncertainty estimates. As a bonus, GPU-optimised code displays now major speedups.
- ☑ These developments will be combined in the coming months, aiming to for a new release of the NNPDF global fit.

Thanks for your attention

# Extra Material

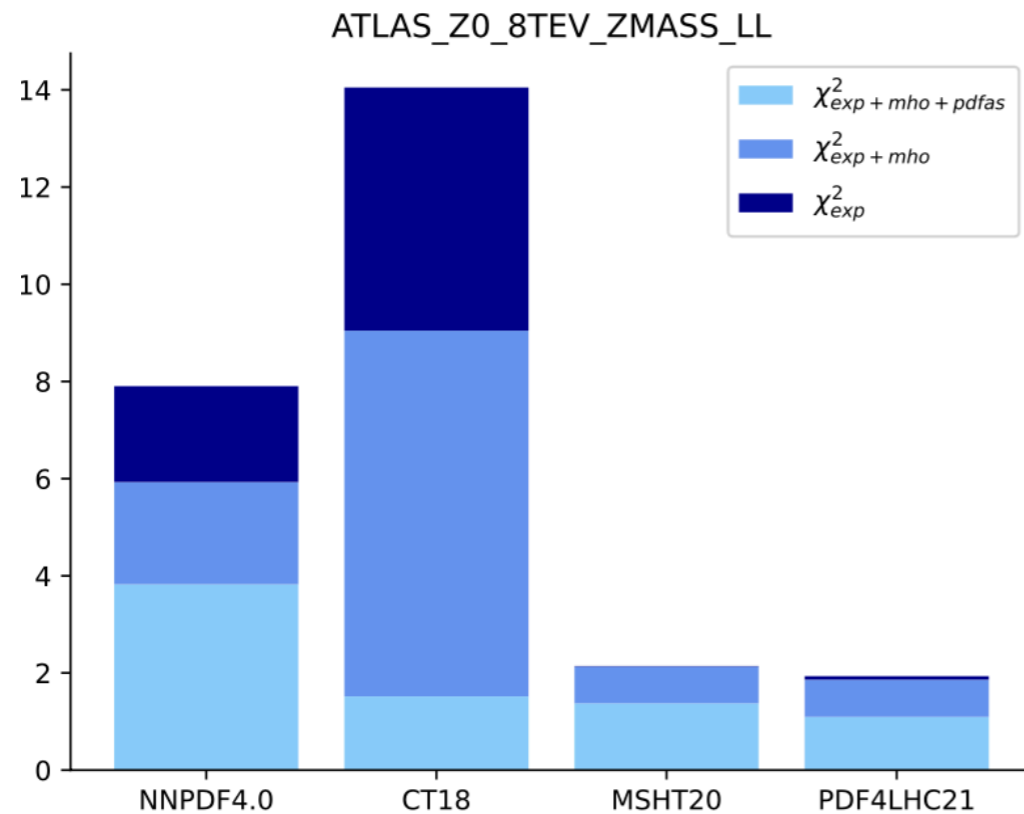
# Results



Despite radical change in hyperparameter determination methodology, **excellent consistency with NNPDF4.0 & moderate increase of PDF errors**: non-trivial validation of NNDF robustness

# ATLAS 8 TeV Z rapidity distributions

arXiv:2309.09318



📍 Reanalysis of Z production at 8 TeV (2012 dataset), on **full phase space** (not fiducial) of charged leptons.

(Same dataset as for  $\alpha_s(m_Z)$  extraction)

📍 Overlaps with [arXiv:1710.05167](#), included in MSHT20 and NNPDF4.0

NNPDF4.0  
NNLO

in fit

in fit  
with mhous

Dataset		PDF(a)	PDF(b)	PDF(c)	PDF(d)	PDF(e)	PDF(f)	PDF(g)	PDF(h)
$ y_{\ell\bar{\ell}} $ (2023 paper [38])	$\chi^2_{exp}$	7.902	8.424	8.383	8.774	7.238	3.492	0.175	3.357
	$\chi^2_{exp+th}$	3.825	3.317	3.329	3.932	3.431	2.238	0.168	2.003
$ y_{\ell\bar{\ell}} $ (2017 paper [68])	$\chi^2_{exp}$	1.227	1.179	1.112	1.248	1.244	1.276	1.413	1.168
	$\chi^2_{exp+th}$	1.079	1.048	1.014	1.088	1.085	1.059	1.018	1.008

- PDF(a): NNPDF4.0 NNLO baseline.

- PDF(b): NNPDF4.0 aN3LO (including MHOUs) [105].

- PDF(c): NNPDF4.0 NNLO including MHOUs [97].

- PDF(d): NNPDF4.0 NNLO including QED corrections [102].

- PDF(e): NNPDF4.0 NNLO excluding the ATLAS 2017 Z production dataset [68].

- PDF(f): Same as PDF(e) now including the ATLAS 2023 Z production dataset [38].

- PDF(g): Same as PDF(f) now with a larger weight applied to the data from [38].

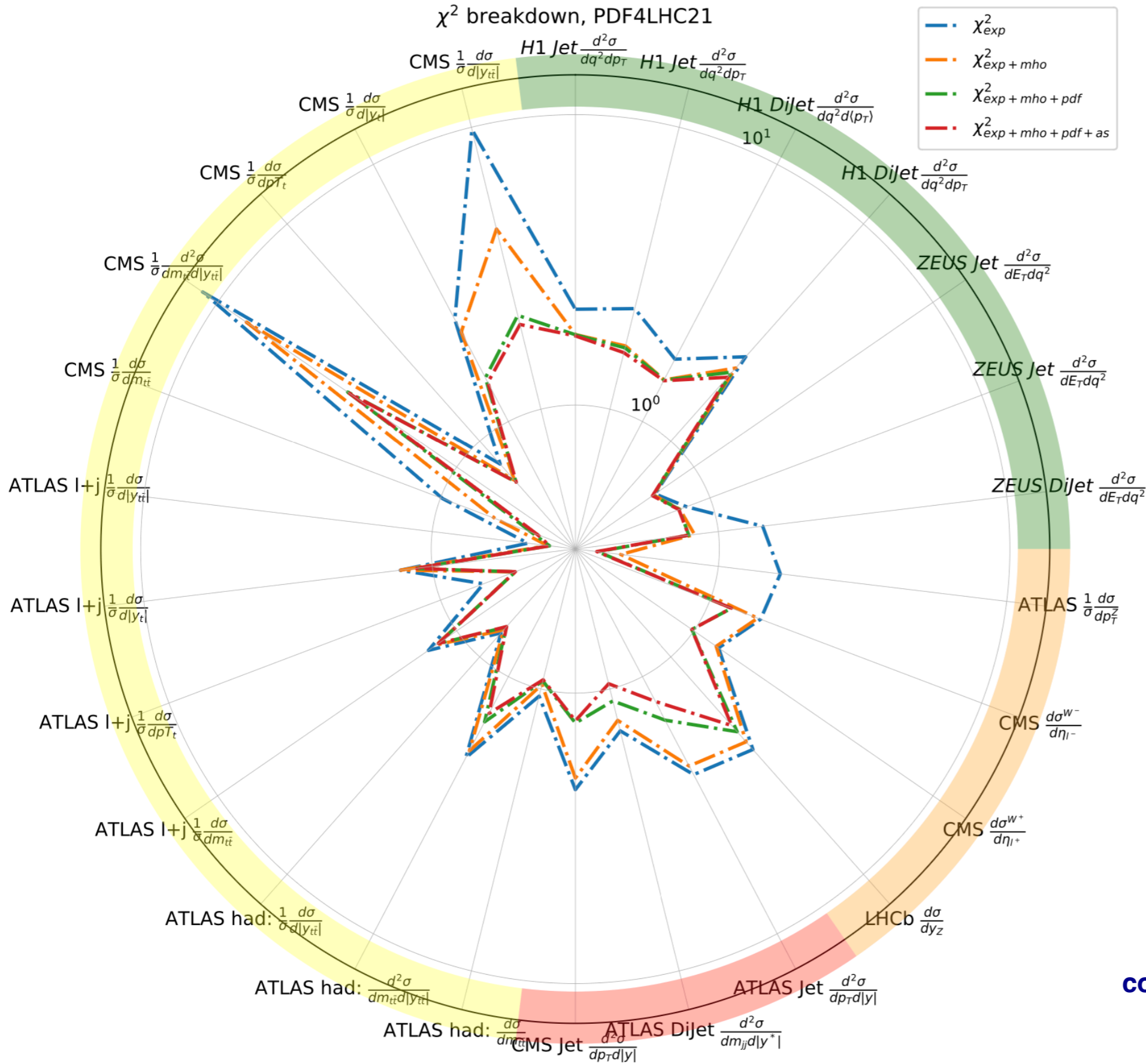
- PDF(h): Same as PDF(f) now including MHOUs.

📍 Improved  $\chi^2_{exp+th}$  once accounting for **MHOU** and **aN<sup>3</sup>LO** corrections

📍 Improved  $\chi^2_{exp+th}$  once **included with fit**, specially with MHOU ( $n_\sigma \sim 2$ )

📍 Weighted fit indicates some **tension** with other DY datasets e.g. LHCb W,Z

# Results



Despite PDF differences, **no systematic outlier** in dataset description

Fully accounting for **theory errors** crucial

PDF4LHC21 in general represents the **“average”** behaviour

ABMP16 unfavored by jet data

**Breakdown of contributions to  $\chi_{exp+th}^2$  for PDF4LHC21**