



# DETERMINATION OF $\alpha_s$ & THE CORRELATED REPLICA METHOD

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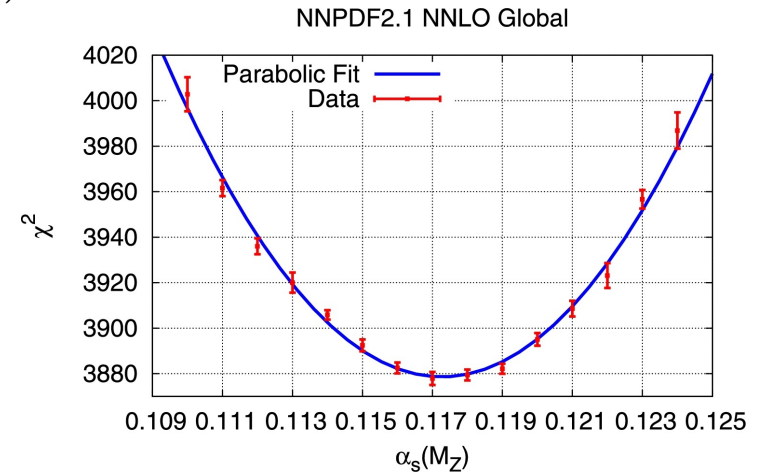
PDF4LHC

CERN, MARCH 28, 2018

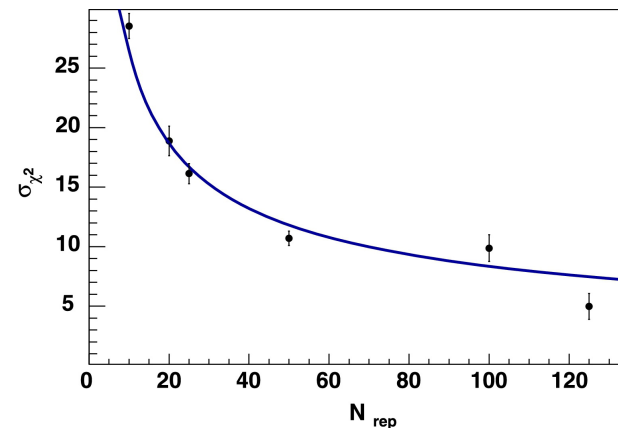
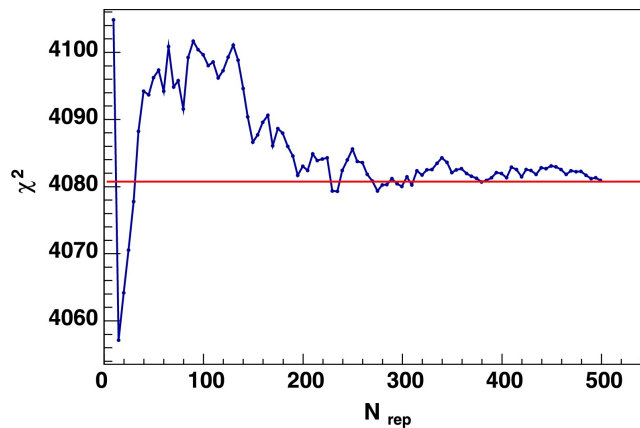
# $\alpha_s$ FROM REPLICAS

## NNPDF2.1 (2012)

- PERFORM GLOBAL FIT WITH DIFFERENT FIXED VALUES OF  $\alpha_s$
- DETERMINE  $\chi^2$  & FIT PARABOLA TO PROFILE
- BEST-FIT FROM MINIMUM UNCERTAINTY FROM  $\Delta\chi^2 = 1$

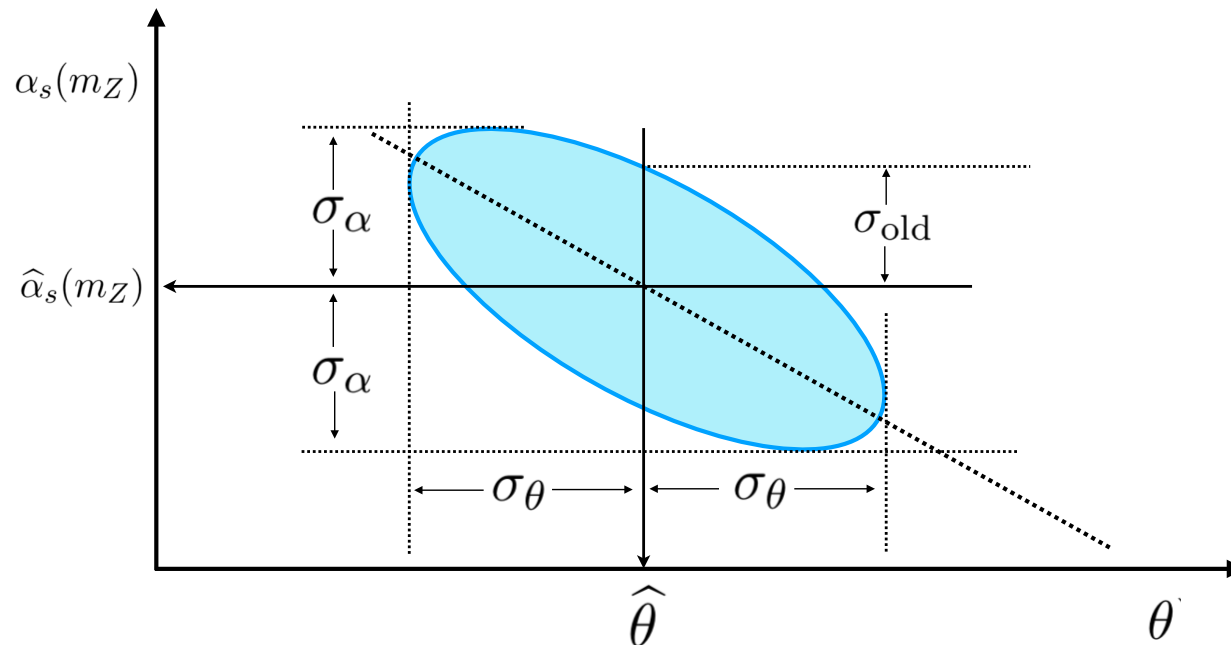


## PROBLEM (TRIVIAL)



- $\sigma_{\chi^2} = \sqrt{2N_{\text{dat}}}$   $\Rightarrow$  NEED LARGE  $N_{\text{rep}}$  TO SUPPRESS  $\chi^2$  FLUCTUATIONS

$\alpha_s$  FROM REPLICAS  
 NNPDF2.1 (2012)  
 PROBLEMS (LESS TRIVIAL)



- MINIMUM DETERMINED ALONG THE “BEST PDF” LINE  $\Rightarrow \sigma_{\text{old}}$   
 FOR **HIGHLY CORRELATED** VARIABLES & **UNEQUAL SEMIAXES**,  
 MAY **UNDERESTIMATE** ONE- $\sigma$  ERROR  $\Rightarrow \sigma_{\alpha}$
- IN NNPDF METHODOLOGY,  
**PDF UNCERTAINTY**  $\Leftrightarrow$  DETERMINED FROM **REPLICA SAMPLE VARIANCE**  
 $\Rightarrow$  IS IT  $\Delta\chi^2 = 1$ ? (**TOLERANCE?**)

NEED **SIMULTANEOUS MINIMIZATION** IN  $(\text{PDF}, \alpha_s)$  SPACE!

# THE CORRELATED REPLICA METHOD

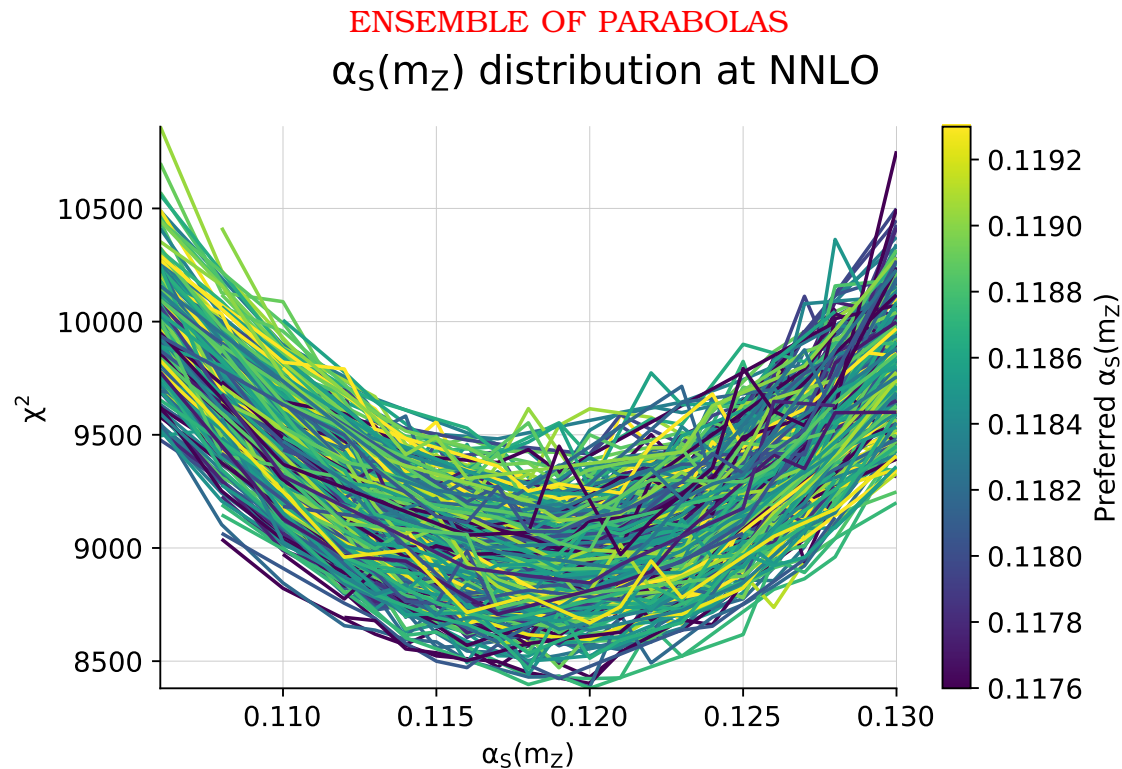
## NNPDF3.1 (2018)

- NNPDF METHOD  $\Rightarrow$  EACH PDF REPLICA FITTED BY GA TO DATA REPLICA
- IDEALLY PERFORM GENETIC MINIMIZATION IN (PDF,  $\alpha_s$ ) SPACE
- PROBLEM THEORY PREDICTION  $\Leftrightarrow$  PRECOMPUTED GRIDS  
DEPEND ON  $\alpha_s \Rightarrow$  DIFFICULT TO TREAT AS CONTINUOUS PARAMETER

# THE CORRELATED REPLICAS METHOD

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DEPEND ON  $\alpha_s \Rightarrow$  DIFFICULT TO TREAT AS CONTINUOUS PARAMETER
- SOLUTION DETERMINE BEST-FIT PDF REPLICA TO EACH DATA REPLICA FOR SEVERAL (DISCRETE)  $\alpha_s$  VALUES: C-REPLICA
  - EACH C-REPLICA  $\Rightarrow \chi^2$  PROFILE  $\Rightarrow \alpha_s$  VALUE



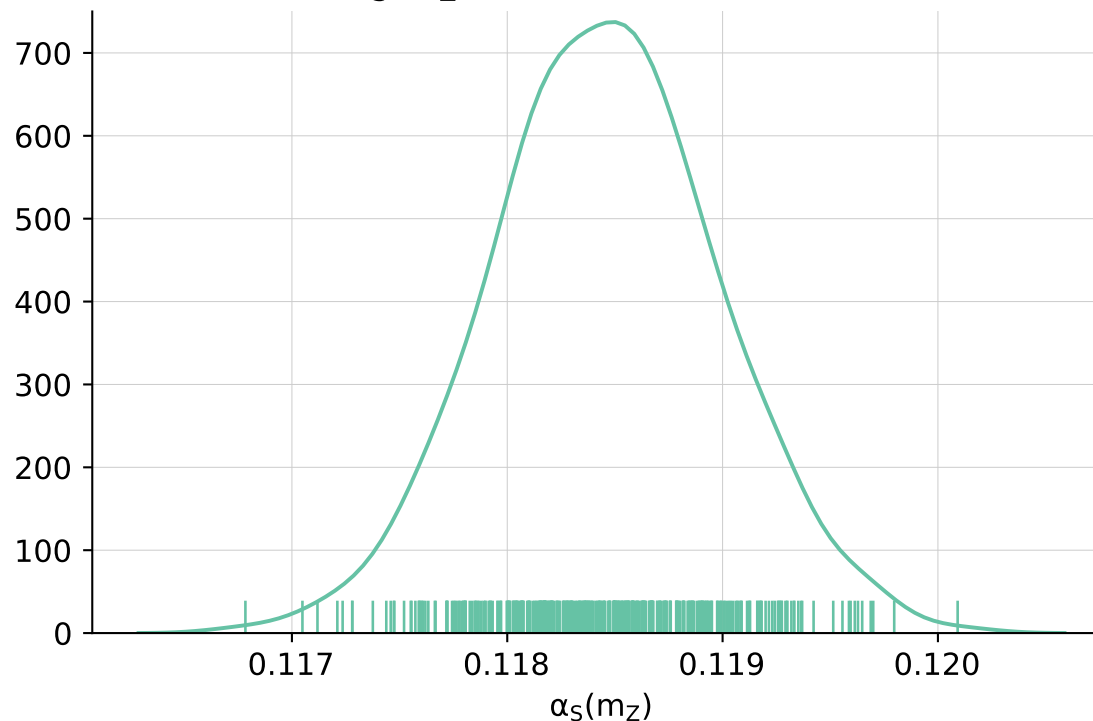
# THE CORRELATED REPLICAS METHOD

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  - EACH C-REPLICA  $\Rightarrow \chi^2$  PROFILE  $\Rightarrow \alpha_s$  VALUE
  - EACH C-REPLICA  $\Rightarrow$  BEST-FIT  $\alpha_s$  REPLICA

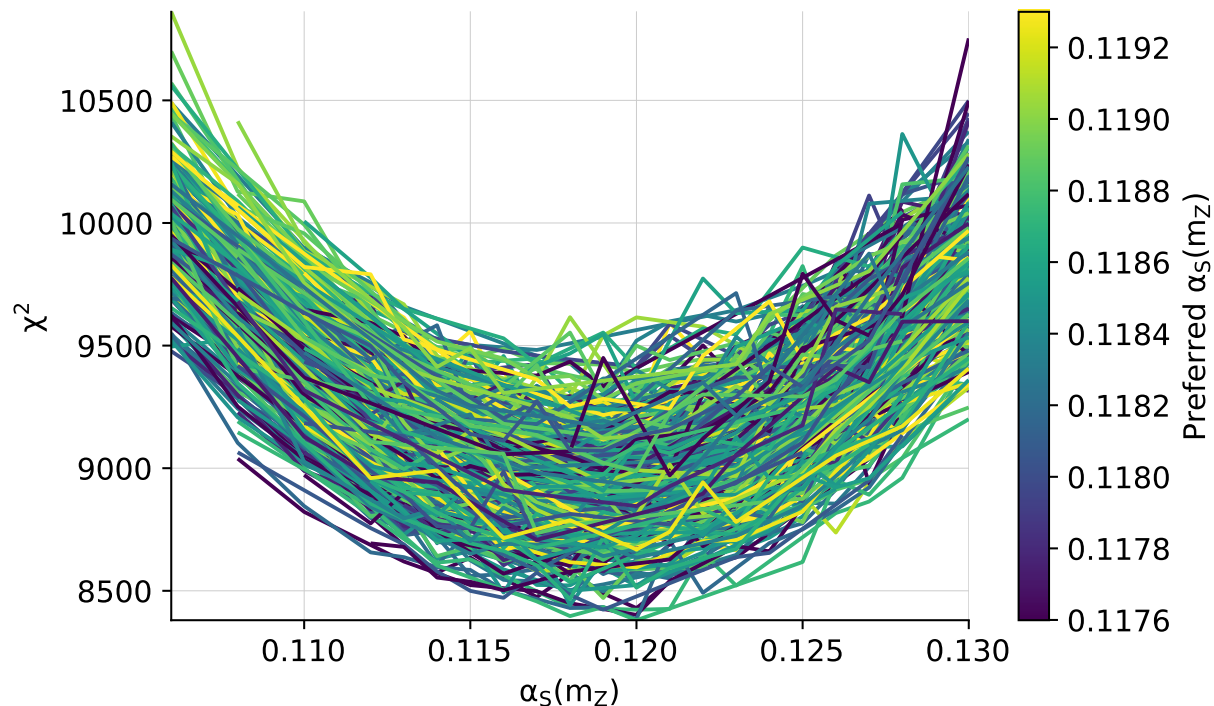
ENSEMBLE OF  $\alpha_s$  VALUES

$\alpha_s(m_Z)$  distribution at NNLO



# $\alpha_s$ FROM CORRELATED REPLICAS

$\alpha_s(m_z)$  distribution at NNLO



- NNP3.1 DATASET (ONLY NNLO JET DATA)  $\Rightarrow$  3979 DATAPOINTS
- 400 C-REPLICAS FOR 21  $\alpha_s$  VALUES:  $\alpha_s(M_Z) = 0.106, 0.108, 0.102, 0.112, 0.113, 0.114, 0.115, 0.116, 0.117, 0.118, 0.119, 0.120, 0.121, 0.122, 0.123, 0.124, 0.125, 0.126, 0.127, 0.128, 0.130$
- EXPERIMENTAL UNCERTAINTY  $\Leftrightarrow$  STANDARD DEV. OVER REPLICA SAMPLE

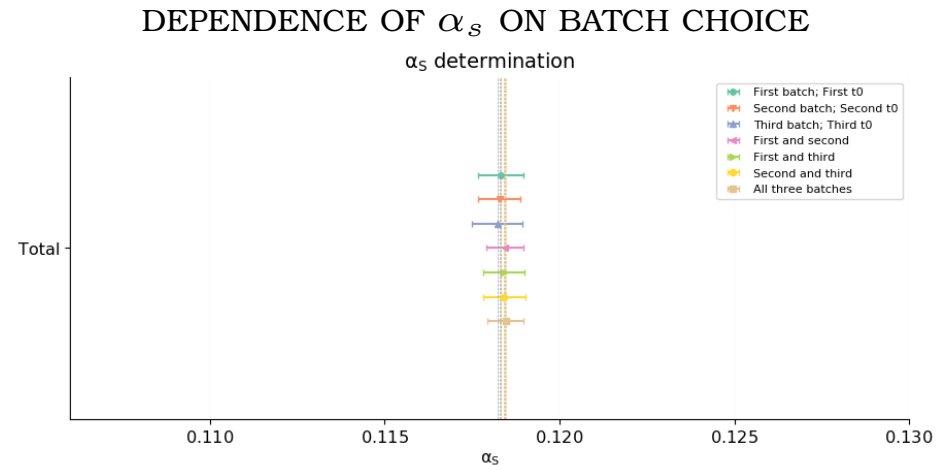
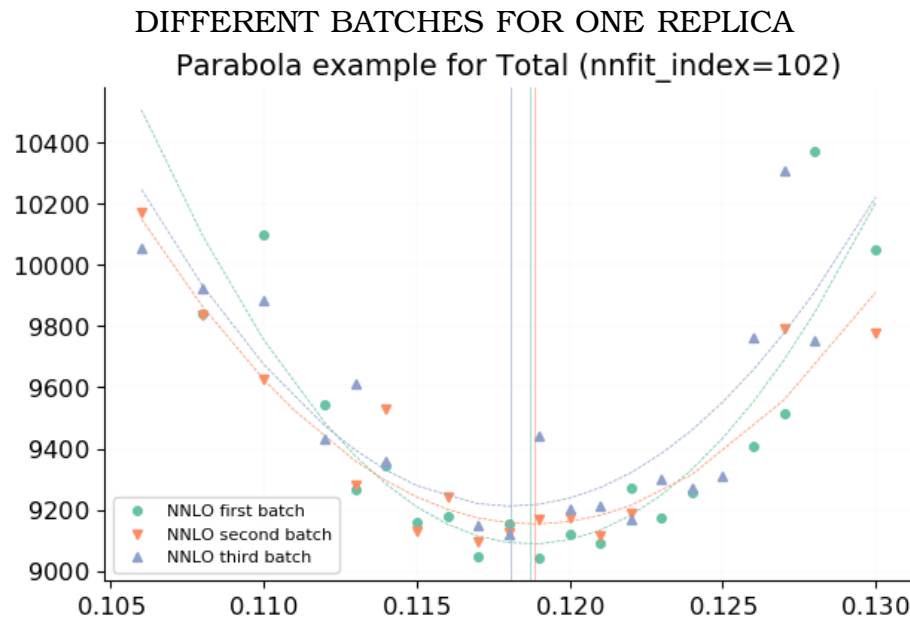
## THE RESULT

$$\alpha_s^{\text{NNLO}}(M_Z) = 0.11845 \pm 0.00052^{\text{exp}} (0.4\%)$$

# THE METHODOLOGY AND ITS UNCERTAINTIES

- WHY IS THE EXPERIMENTAL UNCERTAINTY SO SMALL?
- BECAUSE THERE IS A LOT OF INFORMATION IN C-REPLICAS

## BATCH MINIMIZATION



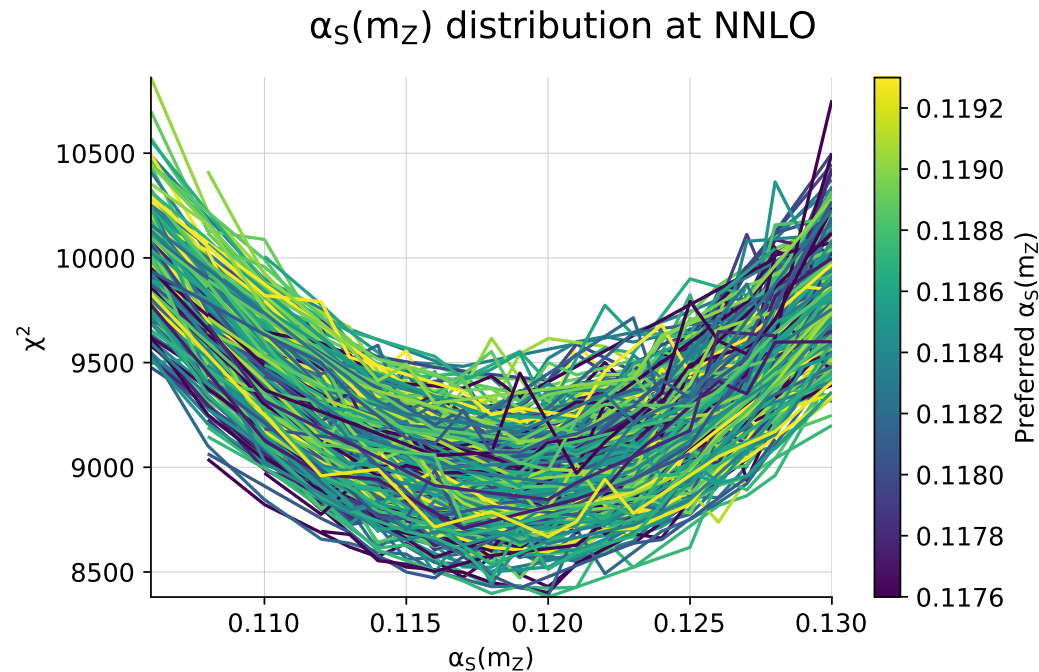
- EACH REPLICA FOR EACH  $\alpha_s$  FITTED THREE TIMES (BATCHES)
- BEST FIT CHOSEN
- SINGLE, DOUBLE & TRIPLE BATCH COMPARED  $\Rightarrow$   
LITTLE DEPENDENCE OF CENTRAL VALUE, IMPROVEMENT OF UNCERTAINTIES  
SINGLE BATCH  $\sigma^{\text{exp}} = 0.0006 - 0.0007$ ; THREE BATCHES  $\sigma^{\text{exp}} = 0.0005$



# METHODOLOGICAL UNCERTAINTIES

## FINITE-SIZE OF REPLICAS SAMPLE

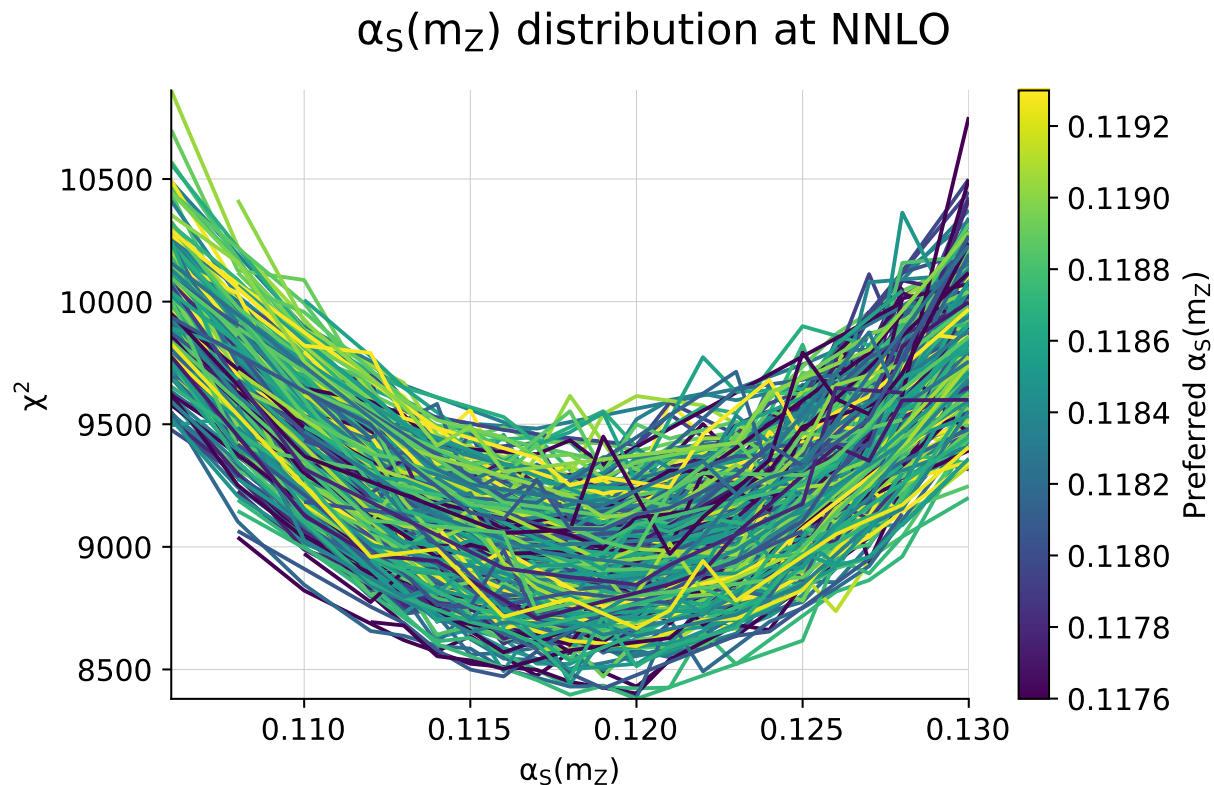
- ESTIMATED BY **BOOTSTRAPPING**:  $\Delta^{\text{finite size}} = 0.00003$  (0.03%)
- DEPENDS ON **REPLICA SELECTION**  $\Leftrightarrow$  ONLY  
INCLUDE A **C-REPLICA** IF **FIT CONVERGED** FOR AT LEAST  $N_{\text{min}}$   $\alpha_s$  VALUES
- **MORE RESTRICTIVE** SELECTION  $\Rightarrow$  **SMALLER**  $\sigma^{\text{exp}}$ , **LARGER**  $\Delta^{\text{finite size}} = 0.00009$
- WITH MOST RESTRICTIVE SELECTION ( $N_{\text{min}} = 18$ , 12 SURVIVING REPLICAS)  
 $\Delta^{\text{finite size}} = 0.00009$  (0.08%), BUT  $\sigma^{\text{exp}} = 0.00031$  (0.3%)
- NO DEPENDENCE OF  $\alpha_s$  VALUE ON CURVE SELECTION
- **DEFAULT: CONSERVATIVE** CHOICE ( $N_{\text{min}} = 6$ , 379 SURVIVING REPLICAS)  
 $\Delta^{\text{finite size}} = 0.00003$  (0.03%), BUT  $\sigma^{\text{exp}} = 0.00052$  (0.5%)  
**MINIMIZES UNCERTAINTY ON UNCERTAINTY**



# METHODOLOGICAL UNCERTAINTIES

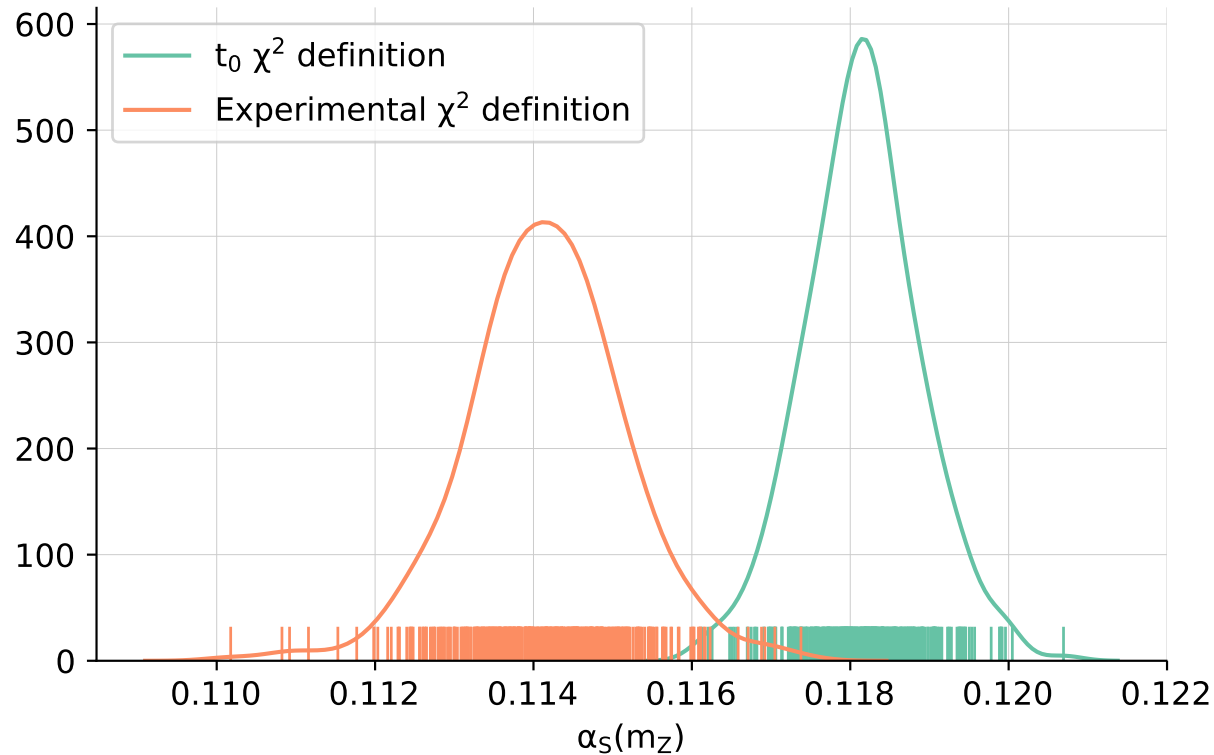
## PARABOLIC FITTING

- FIT  $\exp \alpha_s$  OR  $\ln(\alpha_s + 1)$   $\Rightarrow$  NO CHANGE
- REMOVE OUTER VALUES OF  $\alpha_s$ , SYMMETRICALLY OR ASYMMETRICALLY  $\Rightarrow$  LARGEST SHIFT  $\Delta^{\text{parabolic}} = 0.00010$  (0.08%)  $\Rightarrow$  DOMINANT METH. UNCERTAINTY
- NO EVIDENCE THAT CUBIC FIT IS BETTER THAN QUADRATIC



# METHODOLOGICAL UNCERTAINTIES

## NORMALIZATION UNCERTAINTIES



- **MULTIPLICATIVE** UNCERTAINTIES (ALL HADRON COLLIDER SYST.)  
⇒  $t_0$  METHOD, **REQUIRES PRIOR** FIT
- **GROSSLY BIASED** IF **EXPERIMENTAL COVARIANCE** MATRIX USED
- PRIOR FIT TAKEN FROM **THREE DIFFERENT BATCHES**  
⇒ **VERY SMALL SHIFT**  $\Delta^{t_0} = 0.00004$  (0.03%)

**TOTAL METHODOLOGICAL UNCERTAINTY**

$$\sigma^{\text{meth}} = 0.00011 \text{ (0.09\%)}$$

# MISSING HIGHER ORDER UNCERTAINTIES

$$\alpha_s^{\text{NLO}}(M_Z) = 0.11845 \pm 0.00052^{\text{exp}} \quad (0.4\%)$$
$$\alpha_s^{\text{NNLO}}(M_Z) = 0.12067 \pm 0.00065^{\text{exp}} \quad (0.5\%)$$
$$\Delta\alpha_s^{\text{NLO-NNLO}} = 0.0022$$

- **CACCIARI-HOUDEAU:**  $\alpha_s^{\text{N}^k\text{LO}} = \sum_{n=0}^k c_n [\alpha_s^{\text{true}}]^n$ ;  
BAYESIAN ESTIMATE FOR RANGE OF NEXT MISSING COEFFICIENTS

- **DIFFICULTIES:**

- $\alpha_s^{\text{true}}$  NOT KNOWN  $\Rightarrow$  VARY IN WIDE RANGE
- $\alpha_s^{\text{LO}}$  EFFECTIVELY NOT KNOWN  $\Rightarrow$  VARY IN WIDE RANGE
- IS IT **MEANINGFUL FOR A COMBINATION** OF PROCESSES?

$$\Delta\alpha_s^{\text{NLO, CH}} = 0.003$$
$$\Delta\alpha_s^{\text{NNLO, CH}} = 0.0004$$

NOTE AT NLO AGREES WELL WITH KNOWN NNLO-NLO SHIFT!

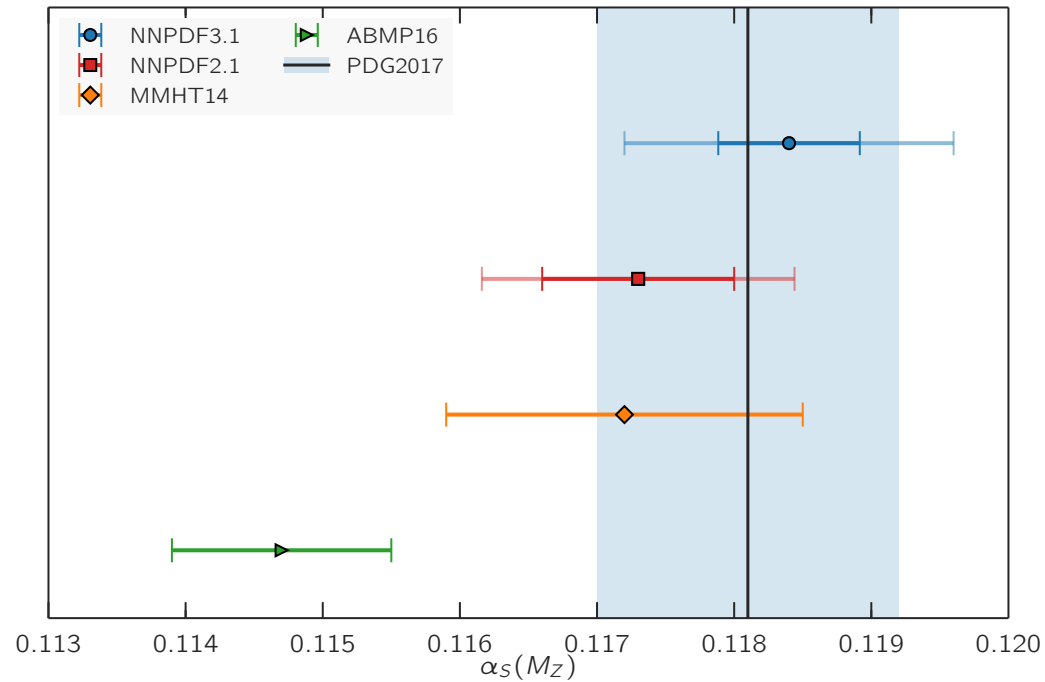
**TOTAL THEORY UNCERTAINTY**  
**OUR VERY CONSERVATIVE ESTIMATE:**

$$\sigma^{\text{th}} = 0.0011 \quad (0.9\%)$$

- HALF THE NLO-NNLO SHIFT
- THREE TIMES THE CH ESTIMATE

# FINAL RESULT & COMPARISON

$$\alpha_s^{\text{NNLO}}(M_Z) = 0.1185 \pm 0.0005^{\text{exp}} \pm 0.0001^{\text{meth}} \pm 0.0011^{\text{th}} = 0.1185 \pm 0.0012 (1\%)$$

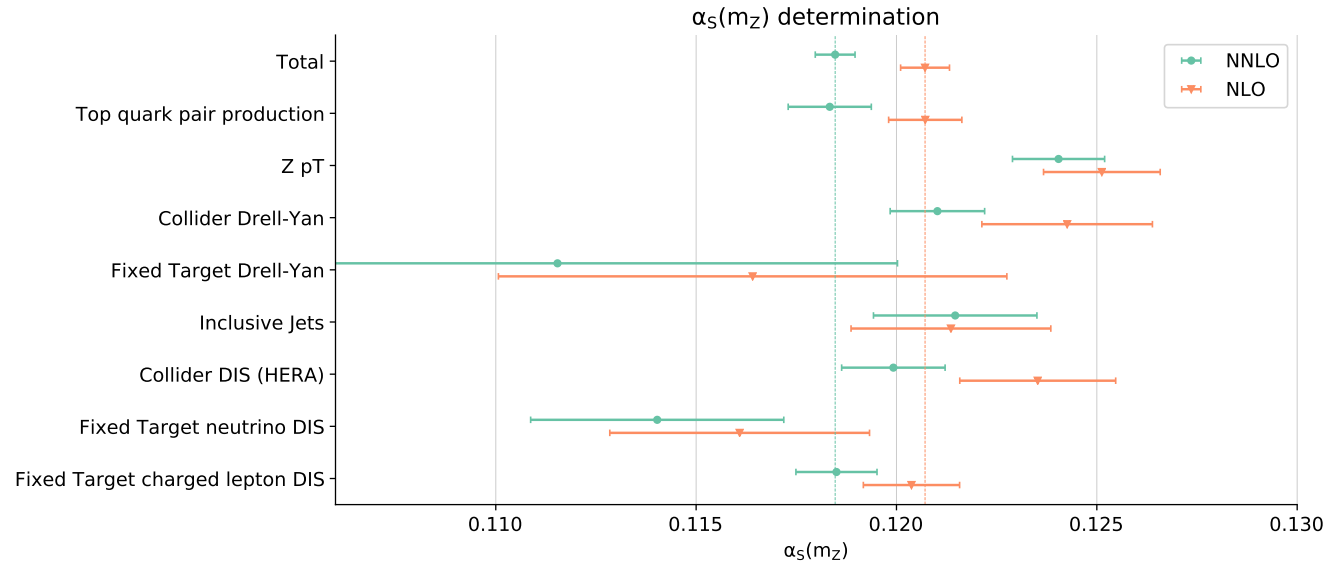


- **SIGNIFICANTLY SMALLER EXP. UNCERTAINTY** IN COMPARISON TO PREVIOUS NNPDF2.1 DETERMINATION (DESPITE MORE CONSERVATIVE ESTIMATE)
- SOMEWHAT **LARGER CENTRAL VALUE** THAN MMHT

# THE IMPACT OF LHC DATA

## PULLS FROM DATA SUBSETS

$\alpha_s$  values from minimization of partial  $\chi^2$  for each c-replica



## LESSONS

- NO SIGNS OF TENSION OR INCOMPATIBILITY
- HADRON COLLIDER DATA PULL TOWARDS LARGER  $\alpha_s$

## CAVEATS

- PARTIAL VALUES ARE NOT PARTIAL BEST-FITS (PDFs COME FROM GLOBAL FIT)
- REPLICA SELECTION BASED ON GLOBAL SET (SOME PARABOLAE  $\Rightarrow$  NO MINIMUM)
- MISSING SYSTEMATIC CORRELATION BETWEEN DATASETS
- PULLS CORRELATED THROUGH UNDERLYING PDFs

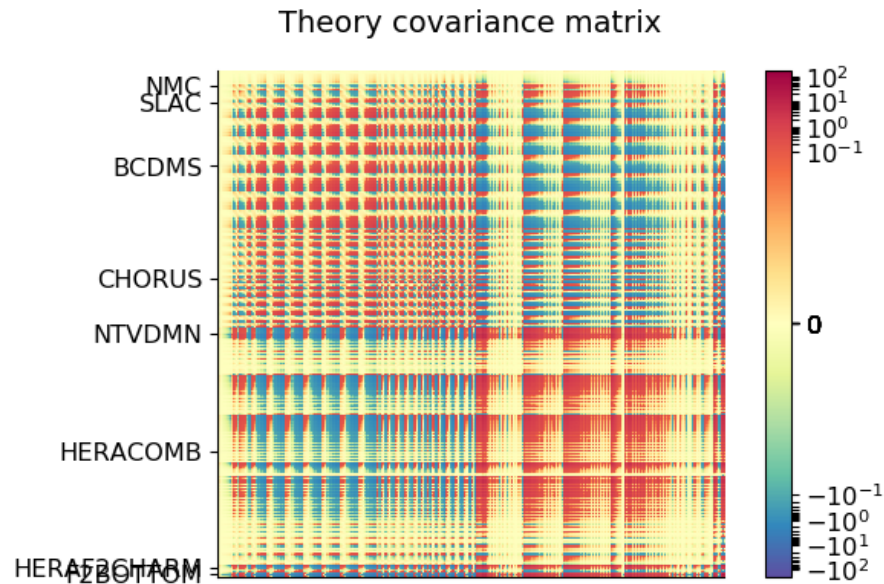
# LESSONS LEARNT

- LHC DATA  $\Rightarrow$  PDF +  $\alpha_s$  UNCERTAINTIES AT THE SUBPERCENT LEVEL
- LHC DATA  $\Rightarrow$  LARGER  $\alpha_s$  VALUE
- PDF-SENSITIVE  $\alpha_s$  DETERMINATION WITHOUT SIMULTANEOUS PDF FIT IS DANGEROUS AND LESS ACCURATE
- MORE GLOBAL DATASET  $\Rightarrow$  GREATER PERTURBATIVE STABILITY

# CAN WE DO BETTER?

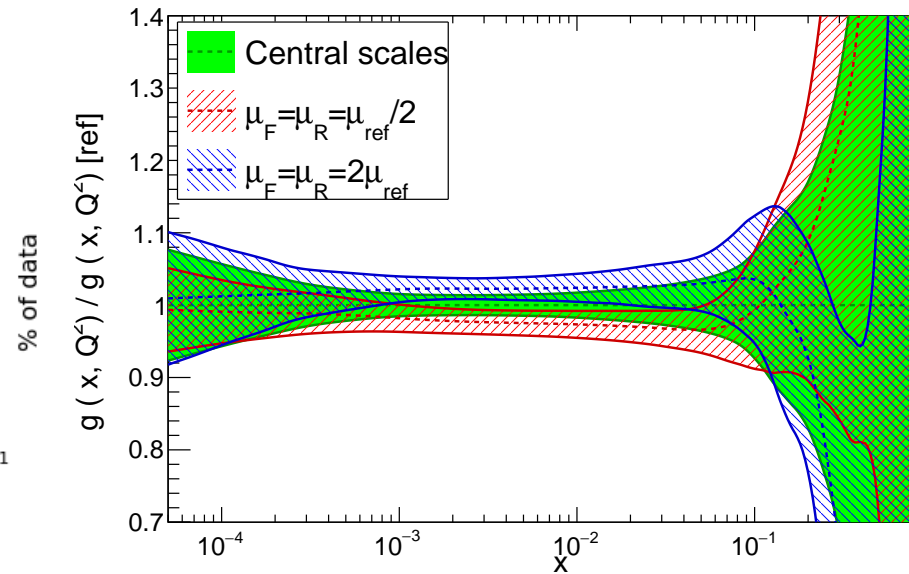
## THEORETICAL UNCERTAINTIES: MHO

THEORY UNCERTAINTIES: COVARIANCE MATRIX



GLUON PDF: SCALE VARIATION

NNPDF3.1 DIS-only NNLO, Q = 100 GeV

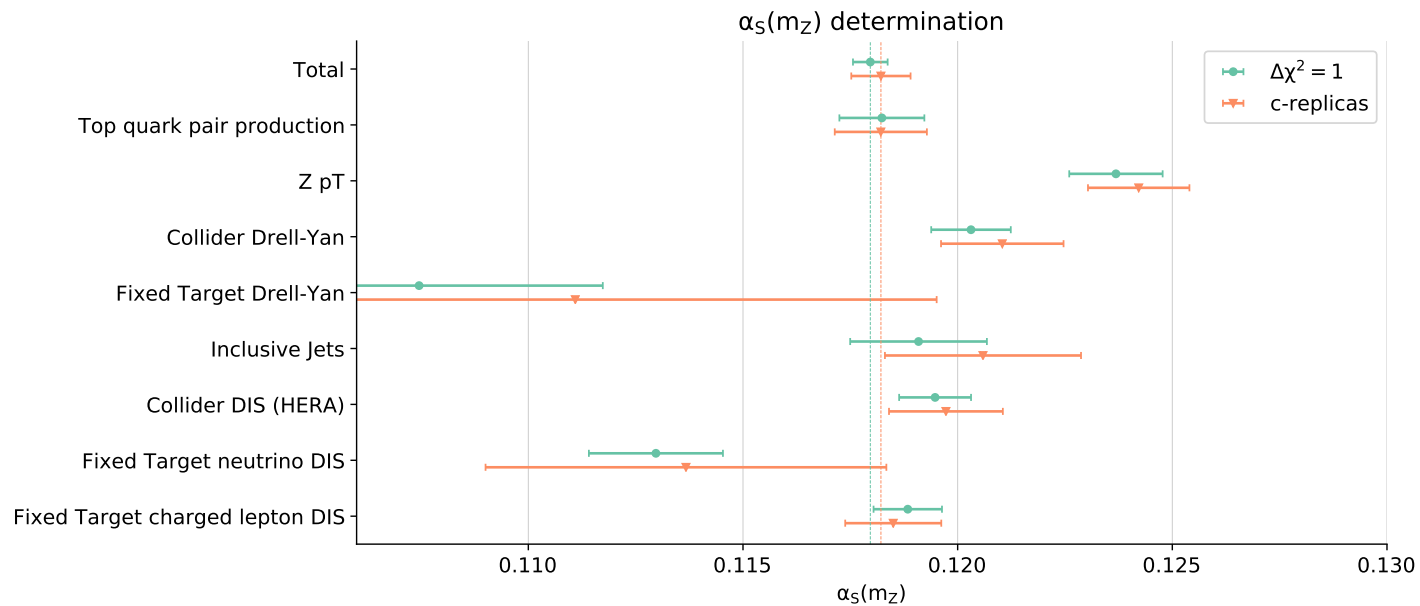


- PDF FITS WITH SCALE VARIED THEORY
- THEORY UNCERTAINTIES (FROM SCALE OR OTHERWISE)  
IN COVARIANCE MATRIX  
GENERALIZABLE TO OTHER THEORY UNCERTAINTIES
- THEORY UNCERTAINTIES INCLUDED IN PDF UNCERTAINTIES



**EXTRAS**

# COMPARISON WITH THE OLD METHOD



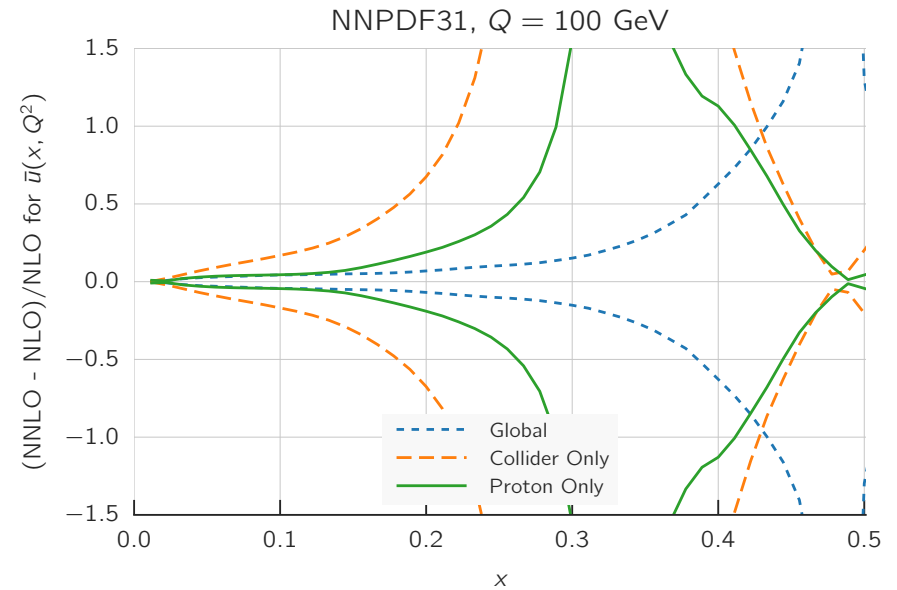
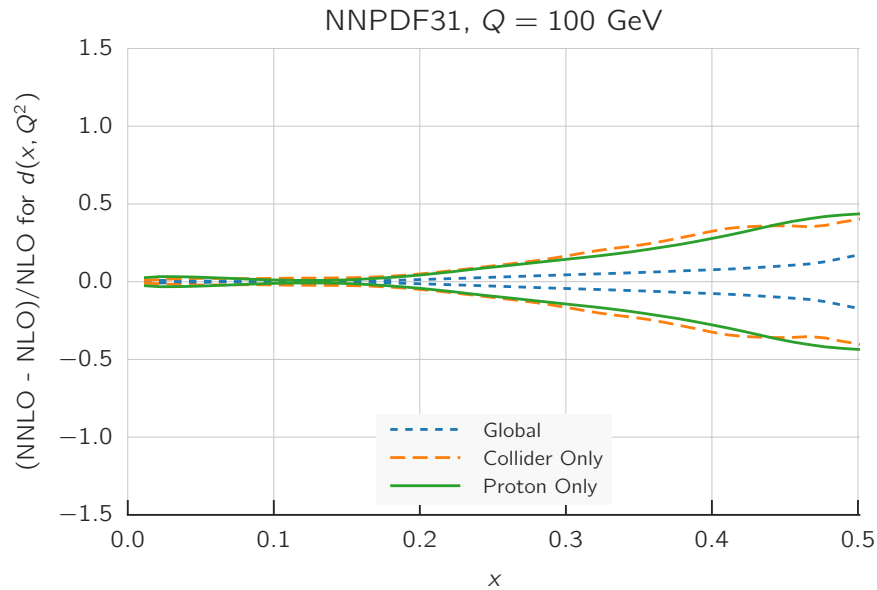
- **GOOD AGREEMENT** OF CENTRAL VALUES
- OLD METHOD  $\Rightarrow$  SOMEWHAT **UNDERESTIMATED UNCERTAINTIES**

# PERTURBATIVE STABILITY

## GLOBAL VS RESTRICTED DATASETS

DOWN

ANTIUP



- NLO-NNLO **SHIFTS SMALLER** WITH LARGER DATASET
- **GREATER STABILITY** OF  $\alpha_s$  ALSO OBSERVED