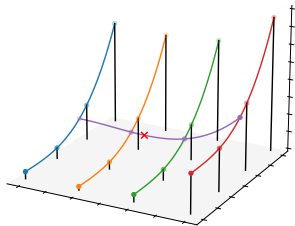


Performance Improvements in LHAPDF

Max Knobbe
23. MCnet Meeting

(Very) brief Introduction

- LHAPDF-6 is a general purpose C++ interpolator, initially released in 2013
→ Mostly used for PDF+ α_s interpolations
- Interfaced to core MCnet software projects (Herwig, Pythia, Sherpa, ...)
- Today (December 6, 2021) 1153 different PDF sets available via
<https://lhapdf.hepforge.org/pdfsets>
→ Interpolations grids provided by fitting groups (CTEQ, NNPDF, MMHT, ...)
→ LHAPDF interpolates between these grids/knots



LHAPDF ID	Set name and links	Number of set members	Latest data version	Notes
201	GRV98	(SetA) (SetA) 1	1	GRV's main website is LHAPDF6. This version uses approximate 5th order running from reported Lambda45 values.
202	GRV91	(SetA) (SetA) 1	1	
203	FFN91L_NLO_015	(SetA) (SetA) 8	1	
204	FFN91L_NLO_NMR	(SetA) (SetA) 6	1	
1000	JMCT1FourFEno	(SetA) (SetA) 760	1	Negative prior PDFs fit to E818 and NMC15 3rd Van-Data using NNPDF11, and E818 and ZEO15 leading order data. Overall chi2/Npts=0.85. https://arxiv.org/abs/1703.03622
2000	JMCT1FourFEno_T	(SetA) (SetA) 760	1	Negative prior PDFs fit to E818 (3e+27 and 27 integrated) and NMC15 3rd Van-Data using NN23-Bores and E818 and ZEO15 leading order data. Overall chi2/Npts=0.85. https://arxiv.org/abs/1703.03622
3000	JMCT1FourFEno_low	(SetA) (SetA) 760	1	Negative prior PDFs fit to E818 and NMC15 3rd Van-Data using NN23-Bores with custom method, and E818 and ZEO15 leading order data. Overall chi2/Npts=1.28. https://arxiv.org/abs/1703.03622
4000	JMCT1FourFEno_expansion	(SetA) (SetA) 760	1	Negative prior PDFs fit to E818 and NMC15 3rd Van-Data using NN23-Bores with expansion method, and E818 and ZEO15 leading order data. Overall chi2/Npts=0.95.

1. Reduce execution speed / changes in LHAPDF-6.4.0

LHAPDF workflow – what is using up the computing time?

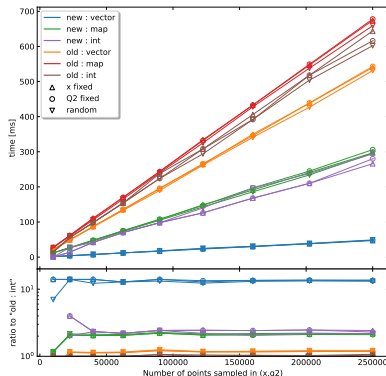
- 1 Find the right grid / knots
Grids allow for maximal flexibility (discontinuous. grids, different grids for each particle)
→ 3 (binary) searches
- 2 Compute new anchor points
- 3 Perform final interpolation

Significant Changes:

- New memory layout
→ Remove unused freedom in grids
→ Smart memory layout
→ Single binary search
- Cache common computation if multiple pid's requested
- Reduce number of transcendental calls

→ Significant speedup of factor 3-10

Released in LHAPDF-6.4.0



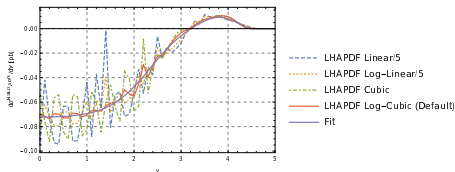
2. LHAPDF for higher-order calculations

Observed in [Dulat](#), [Mistlberger](#), [Pelloni](#), soft-virtual term of rapidity contribution in the soft limit

$$\begin{aligned} \frac{d\sigma_{gg}}{dY} = \frac{\sigma_0}{9w^2} \left(\frac{\alpha_s}{\pi}\right)^5 \int_{\tau}^1 dz f_g \left(\sqrt{\frac{\tau}{zY}}\right) f_g \left(\sqrt{\frac{\tau Y}{z}}\right) & \left\{ 1124.31 \delta(1-z) + 1466.48 \left[\frac{1}{1-z}\right]_+ \right. \\ & - 6062.09 \left[\frac{\log(1-z)}{1-z}\right]_+ + 7116.02 \left[\frac{\log^2(1-z)}{1-z}\right]_+ \\ & \left. - 1824.36 \left[\frac{\log^3(1-z)}{1-z}\right]_+ - 230 \left[\frac{\log^4(1-z)}{1-z}\right]_+ + 216 \left[\frac{\log^5(1-z)}{1-z}\right]_+ \right\} \end{aligned} \quad (5.1)$$

Problem:

- Higher order terms seem to be sensitive to interpolation polynomial
- Introduces oscillations in differential cross-section



[1710.03016]

2. LHAPDF for higher-order calculations

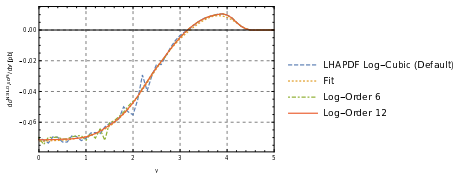
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Solution: higher order Polynomials (Lagrange)

Applied in

- 1 Global fit:
 - definitely continuous, smooth
 - potential numerical problems (Runge's phenomenon, interpolation errors)
- 2 Local fit:
 - continuation of LHAPDF-approach
 - relatively simple implementation
 - continuous, not smooth



[1710.03016]

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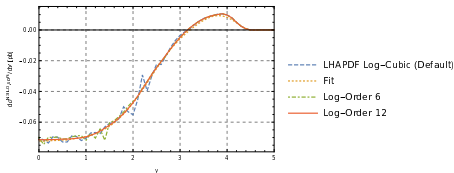
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[1710.03016]

3. Modern Architectures – why do we have to care?

Machine Learning Efforts:

- Almost every part of MC tool-chain is investigated
→ Naturally, GPU-based computations

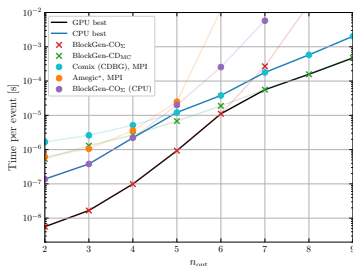
GPU Monte Carlo's

Some, (recent) developments in chronological order:

- Tess [Giele, Stavenga, Winter]
C++, Cuda
- BlockGen [Bothmann, Giele, Höche, Isaacson, MK]
C++, Cuda, (Kokkos)
- MadFlow [Carrazza, Cruz-Martinez, Rossi, Zaro]
Python, Tensorflow
- MadGraph-GPU [Valassi, Roiser, Mattelaer, Hageboeck]
C++, Cuda, (Alpaka, Kokkos, Sycl)

New Clusters/Supercomputer:

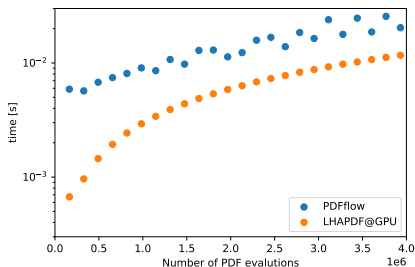
- Aurora (2×Intel CPU + 6×Intel GPU per node)
- More to come..?



[Aurora]

3. LHAPDF@Heterogenous

- Kokkos code, build on top of LHAPDF
 - receiving LHAPDF updates
 - minimal code doubling
- Can provide PDF's to aforementioned projects
- only competitor: PDFFlow
 - [Carrazza, Cruz-Martinez, Rossi]
 - Probably more natural for ML



Possible application in classical frameworks:

- Many variations at once?
- All-pid version for single PS-point?
- ...
- Suggestions, ideas, requests?

→ **Not released yet, more testing needed**

Conclusion / Outlook

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- Significant interpolation speedup, Sherpa+LHAPDF benchmark pending
- Fixed higher order computations problems
- New interpolator, suitable for modern systems

Possible future projects:

- Higher Resolution?
- TMD's, much easier to include with generalised memory/interpolator structure

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Thank you
MCnet: for giving me the opportunity
You: for your attention!