WE START WITH YES, DATA



HEP-CCE I/O STRATEGIES STORAGE & COMPRESSION OUTLOOK

PETER VAN GEMMEREN ROB ROSS

HEP-CCE/IOS





Year

HEP-CCE/IOS: STORAGE AND COMPRESSION Future Priorities

- The current cycle of HEP-CCE has been mainly focused on making HEP applications make [efficient] use of High Performance Computer
- This addresses the crucial need for CPU cycles expected for HEP experiment at the HL-LHC, DUNE and beyond.
- HEP, however, faces similar challenges for disk and tape storage, which also need to be addressed
 - Additional compute cycles may help, but won't solve this issue
- Most experiment HEP data is stored in a compressed format using standard loss-less compression algorithms
- More advanced/intelligent, but often lossy compression algorithms are less common
 - Exception: CMS Nano-AOD, soon? ATLAS PHYSLITE





INTELLIGENT LOSSY COMPRESSION Computing Science

- Overview of "intelligent" data compression:
- Oct 18, 2022: Speakers: Prof. Anand Rangarajan, Prof. Sanjay Ranka: Hybrid Learning Techniques for Scientific Data Reduction with Performance Guarantees
- Nov 29, 2022: Speakers: Dr Franck Cappello (ANL), Dr Sheng Di (ANL): Compression of Scientific Data with SZ
- Mar 21, 2023: Speaker: John Wu (LBNL): Statistical Similarity for Data Compression





HYBRID LEARNING TECHNIQUES FOR SCIENTIFIC DATA REDUCTION

Prof. Anand Rangarajan, Prof. Sanjay Ranka: <u>GitHub -</u> CODARcode/MGARD: MGARD: MultiGrid Adaptive Reduction of Data

- Compression of scientific applications differ from video and image compression
 - Guarantees on Quantities of Interest (QoI): Scientists are principally interested in QoI that are derived from raw data. The ability to quantify these with realistic bounds is essential.
- Compression Ratio of ~30-40 for fusion code data

MGARD - Multigrid Adaptive Recursive Decomposition

- MGARD is a transform-based compressor

 Decompose the original data u into u_mc
 by recursively performing L² projection
 and multilinear interpolation on the
 - Quantize u_mc to ũ_mc keeping error tolerance

multilevel grids.

 Encode ũ_mc to ũ to reduce the number of bits



• PD Guarantees: Method controls the compression error for a variety of s-norms. The relation between $||u_mc - \tilde{u}_mc||_s$ and $||u - \tilde{u}||_s$ is mathematically preserved

- Qol Guarantees: Provide error management on linearly derived Qol.
- Compression ratios at PD error and Qol error within NRMSE 10⁻³ for XGC: 30-40. Compression is smaller for lower Qol error bounds.
- Used for XGC Fusion Code that can produce 4.3 PB/day.



COMPRESSION OF SCIENTIFIC DATA WITH SZ Dr Franck Cappello (ANL), Dr Sheng Di (ANL): <u>SZ Lossy Compression</u>

SZ Lossy Compressor (szcompressor.org)

- Consist in reducing scientific data volume by leveraging correlations and reducing precision
- Goal: keep the same science
 Requires error bounds on observables
- Compression Ratio of ~5-100 for scientific data

Example: Cosmology 1/2 (Storage Footprint Reduction)

HACC: N-body problem with domain decomposition, medium/long-range force solver (particle-mesh method), short-range force solver (particle-particle/ particle-mesh algorithm). Particle dataset: 6 x 1D array (x, y, z, vx, vy ,vz) 10⁻³ error bound



 An example application others understand better than me ;).



STATISTICAL SIMILARITY FOR DATA COMPRESSION

John Wu (LBNL): IDEALEM at LBNL (Ibl.gov)

- Motivated by reading out many (1000s) of micro-Phaser Measurement Unit over time
 - Monitoring device is capable of sample dozens of measures many thousands of times a second
- That's for the power grid, don't ask me how, but does not sound so unsimilar to some detectors.
- Compression Ratio of ~100-200 in PMU example!



How IDEALEM Works

- > Breaks an incoming data stream into blocks of a fixed size
- > Represents similar blocks with the one that appears earlier in the sequence
- Similarity here is based on statistical measure
 - ➤ not on Euclidean distance
 - > Kolmogorov-Smirnov test (KS test)
- One drawback/challenge: KS test is computational expensive.



OUTLOOK

- HEP-CCE/IOS has accomplished their main goals:
 - Darshan for ROOT I/O in HEP workflows on HPC
 - Investigate HDF5 as intermediate event storage for HPC processing using ROOT serialization
 - Start to Investigate HPC/GPU friendly data model (joined with PPS)
- Documentation (and CHEP publications) are being worked on and should be completed before project end.
- Foundation research for next HEP-CCE cycle work is well underway:
 - Investigate HPC/GPU friendly data model (joined with PPS)
 - Intelligent lossy compression for storage needs reduction
- Big Thanks to everyone involved, HEP-CCE and experiments!



