

Parallel I/O with HDF5: Overview, Tuning, and New Features

HPC Best Practices Webinar

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exascaleproject.org

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WHAT IS HDF5?





HDF5 is like ...





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HDF5 is designed ...

- for high volume and / or complex data
- for every size and type of system from cell phones to supercomputers
- for flexible, efficient storage and I/O
- to enable applications to evolve in their use of HDF5 and to accommodate new models
- to support long-term data preservation



HDF5 Ecosystem



What is HDF5?

HDF5 → Hierarchical Data Format, v5

• Open file format

- Designed for high volume and complex data
- Open source software
 - Works with data in the format

• An extensible data model

- Structures for data organization and specification



HDF5 DATA MODEL



HDF5 File

An HDF5 file is a **container** that holds data objects.





HDF5 Data Model



File



HDF5 Dataset



• HDF5 datasets organize and contain data elements.

- HDF5 datatype describes individual data elements.
- HDF5 dataspace describes the logical layout of the data elements.



HDF5 Dataspace

- Describes the logical layout of the elements in an HDF5 dataset
 - NULL
 - no elements
 - Scalar
 - single element
 - Simple array (*most common*)
 - multiple elements organized in a rectangular array
 - rank = number of dimensions
 - dimension sizes = number of elements in each dimension
 - maximum number of elements in each dimension
 - » may be fixed or unlimited



HDF5 Dataspace

Two roles:

Spatial information for Datasets and Attributes

- Rank and dimensions
- Permanent part of object definition





Partial I/O: Dataspace and selection describe application's data buffer and data elements participating in I/O



HDF5 Datatypes

- Describe individual data elements in an HDF5 dataset
- Wide range of datatypes supported
 - Integer
 - Float
 - Enum
 - Array
 - User-defined (e.g., 13-bit integer)
 - Variable-length types (e.g., strings, vectors)
 - Compound (similar to C structs)
 - More ...



HDF5 Datatypes

- Describe individual data elements in an HDF5 dataset
- Wide range of datatypes supported
 - Integer
 - Float
 - Enum
 - Array (similar to matrix)
 - User-defined (e.g., 12-bit integer, 16-bit float)
 - Variable-length types (e.g., strings, vectors)
 - Compound (similar to C structs)
 - More ...



HDF5 Dataset



Dimensions = 5×3



HDF5 Dataset with Compound Datatype







How are data elements stored? (1/2)





How are data elements stored? (2/2)



HDF5 Groups and Links



HDF5 Attributes

- Attributes "decorate" HDF5 objects
- Typically contain *user* metadata
- Similar to Key-Values:
 - Have a unique <u>name</u> (for that object) and a <u>value</u>
- Analogous to a dataset
 - "Value" is an array described by a datatype and a dataspace
 - Do not support partial I/O operations; nor can they be compressed or extended



HDF5 SOFTWARE



HDF5 Home Page

HDF5 home page: http://www.hdfgroup.org/solutions/hdf5/

- Latest release: HDF5 1.10.5 (1.10.6 coming soon)

HDF5 source code:

- Written in C, and includes optional C++, Fortran, and Java APIs
 - Along with "High Level" APIs
- Contains command-line utilities (h5dump, h5repack, h5diff, ..) and compile scripts

HDF5 pre-built binaries:

- When possible, include C, C++, Fortran, Java and High Level libraries.
 - Check ./lib/libhdf5.settings file.
- Built with and require the SZIP and ZLIB external libraries



Useful Tools For New Users

h5dump: Tool to "dump" or display contents of HDF5 files

h5cc, h5c++, h5fc: Scripts to compile applications (like mpicc, ...)

HDFView: Java browser to view HDF5 files http://support.hdfgroup.org/products/java/hdfview/

HDF5 Examples (C, Fortran, Java, Python, Matlab, ...) http://support.hdfgroup.org/HDF5/examples/



HDF5 PROGRAMMING MODEL AND API



HDF5 Software Layers & Storage



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The General HDF5 API

- C, Fortran, Java, C++, and .NET bindings
 - Also: IDL, MATLAB, Python (H5Py, PyTables), Perl, ADA, Ruby, ...
- C routines begin with prefix: H5?

? is a character corresponding to the type of object the function acts on

Example Functions:

H5D : Dataset interfacee.g., H5DreadH5F : File interfacee.g., H5FopenH5S : dataSpace interfacee.g., H5Sclose



The HDF5 API

- For flexibility, the API is extensive
 - \checkmark 300+ functions



Victorinox Swiss Army Cybertool 34

- This can be daunting... but there is hope
 ✓ A few functions can do a lot
 - ✓ Start simple
 - ✓ Build up knowledge as more features are needed



General Programming Paradigm

- Object is opened or created
- Object is accessed, possibly many times
- Object is closed

- Properties of object are optionally defined
 - ✓ Creation properties (e.g., use chunking storage)
 - ✓ Access properties



Basic Functions

```
H5Fcreate (H5Fopen)
```

H5Dclose

H5Screate_simple/H5Screate

H5Dcreate (H5Dopen)

H5Dread, H5Dwrite

create (open) Dataset

create (open) File

create dataSpace

access Dataset

close Dataset

close dataSpace

close File





H5Sclose

Other Common Functions

DataSpaces: H5Sselect_hyperslab (Partial I/O) H5Sselect_elements (Partial I/O) H5Dget_space

DataTypes: H5Tcreate, H5Tcommit, H5Tclose H5Tequal, H5Tget_native_type

Groups: H5Gcreate, H5Gopen, H5Gclose

Attributes:H5Acreate, H5Aopen_name, H5AcloseH5Aread, H5Awrite

Property lists:

H5Pcreate, H5Pclose H5Pset_chunk, H5Pset_deflate



PARALLEL HDF5



(MPI-)Parallel vs. Serial HDF5

- PHDF5 allows multiple MPI processes in an MPI application to perform I/O to a single HDF5 file
- Uses a standard parallel I/O interface (MPI-IO)
- Portable to different platforms
- PHDF5 files <u>ARE</u> HDF5 files conforming to the <u>HDF5 file format</u> <u>specification</u>
- The PHDF5 API consists of:
 - The standard HDF5 API
 - A few extra knobs and calls
 - A parallel "etiquette"



Standard HDF5 "Skeleton"

H5Fcreate (H5Fopen) create (open) File H5Screate_simple/H5Screate create dataSpace Create (open) Dataset Create (open) Dataset Create (open) Dataset H5Dclose close Dataset Close dataSpace H5Fclose close File



Example of a PHDF5 C Program

A parallel HDF5 program has a few extra calls

```
file_id = H5Fcreate(FNAME, ..., H5P_DEFAULT);
space_id = H5Screate_simple(...);
dset_id = H5Dcreate(file_id, DNAME, H5T_NATIVE_INT, space_id, ...);
```

status = H5Dwrite(dset_id, H5T_NATIVE_INT, ..., H5P_DEFAULT, ...);



...

...

Example of a PHDF5 C Program

A parallel HDF5 program has a few extra calls

```
MPI_Init(&argc, &argv);
fapl_id = H5Pcreate(H5P_FILE_ACCESS);
H5Pset_fapl_mpio(fapl_id, comm, info);
file id = H5Fcreate(FNAME, ..., fapl id);
space_id = H5Screate_simple(...);
dset_id = H5Dcreate(file_id, DNAME, H5T_NATIVE_INT, space_id, ...);
xf_id = H5Pcreate(H5P_DATASET_XFER);
H5Pset_dxpl_mpio(xf_id, H5FD_MPIO_COLLECTIVE);
status = H5Dwrite(dset_id, H5T_NATIVE_INT, ..., xf_id, ...);
...
```


PHDF5 Implementation Layers



PHDF5 Etiquette

- PHDF5 opens a shared file with an MPI communicator
 - Returns a file handle
 - All future access to the file via that file handle
- All processes must participate in collective PHDF5 APIs
- Different files can be opened via different communicators
- All HDF5 APIs that modify file structure are collective!
 - Object create / delete, attribute and group changes, etc.
 - http://support.hdfgroup.org/HDF5/doc/RM/CollectiveCalls.html



Collective vs. Independent I/O

- Collective I/O attempts to combine multiple smaller independent I/O ops into fewer larger ops.
 - Neither mode is preferable a priori
- MPI definition of collective calls:
 - All processes of the communicator must participate in calls in the same order:

Process 1Process 2call A(); \rightarrow call B();call A(); \rightarrow call B(); **right**call A(); \rightarrow call B();call B(); \rightarrow call A(); **wrong**

- Independent calls are not collective ③
- Collective calls are not necessarily synchronous, nor must they require communication
 - It could be that only internal state for the communicator changes



Parallel HDF5 tutorial examples

• For examples how to write different data patterns see:

http://support.hdfgroup.org/HDF5/Tutor/parallel.html



Tools **DIAGNOSTICS AND INSTRUMENTATION**



Data and Metadata I/O

| Data | Metadata |
|---|---|
| Problem-sized | Small |
| I/O can be independent or collective | Reads can be independent or collective |
| Improvement targets: Avoid unnecessary I/O I/O frequency Layout on disk Different I/O strategies for chunked layout Aggregation and balancing Alignment | All modifying I/O must be collective Improvement targets: Metadata design Use the latest library version, if possible Metadata cache In desperate cases, take control of evictions |



Don't Forget: It's a Multi-layer Problem





A Textbook Example

User reported:

- Independent data transfer mode is much slower than the collective data transfer mode
- Data array is tall and thin: 230,000 rows by 4 columns



Symptoms

Writing to one dataset

- 4 MPI processes → 4 columns
- Datatype is 8-byte floats (doubles)
- -4 processes x 1000 rows x 8 bytes = 32,000 bytes
- % mpirun -np 4 ./a.out 2000 ≻ Execution time: 3.838858 s. (linear scaling)
- 2 sec. extra for 1000 more rows = 32,000 bytes.
 16KB/sec → Way too slow!!!



"Poor Man's Debugging"

- Build a version of PHDF5 with
 - ./configure --enable-debug --enable-parallel ...
- This allows the tracing of MPIO I/O calls in the HDF5 library such as MPI_File_read_xx and MPI_File_write_xx
- Don't forget to:
 - % setenv H5FD_mpio_Debug "rw"
- You'll get something like this...



Independent and Contiguous

% setenv H5FD_mpio_Debug "rw" % mpirun -np 4 ./a.out 1000 # Indep.; contiguous. in H5FD mpio write mpi off=0 size i=96 in H5FD mpio write mpi off=0 size_i=96 in H5FD_mpio_write mpi_off=0 size_i=96 in H5FD_mpio_write mpi_off=0 size_i=96 in H5FD_mpio_write mpi_off=2056 size_i=8 in H5FD_mpio_write mpi_off=2048 size i=8 in H5FD_mpio_write mpi_off=2072 size_i=8 in H5FD mpio write mpi off=2064 size i=8 in H5FD_mpio_write mpi_off=2088 size_i=8 in H5FD mpio write mpi off=2080 size i=8

A total of 4000 of these 8 bytes writes == 32,000 bytes.



•••

Plenty of Independent and Small Calls

Diagnosis:

 Each process writes one element of one row, skips to next row, writes one element, and so on.

• Each process issues 230,000 writes of 8 bytes each.



Chunked by Column

% setenv H5FD_mpio_Debug "rw" % mpirun -np 4 ./a.out 1000 # Indep., Chunked by column. in H5FD_mpio_write mpi_off=0 size i=96 in H5FD_mpio_write mpi_off=0 size_i=96 size_i=96 in H5FD_mpio_write mpi_off=0 size_i=96 in H5FD mpio write mpi off=0 in H5FD_mpio_write mpi_off=3688 size_i=8000 in H5FD_mpio_write mpi_off=11688 size_i=8000 in H5FD mpio write mpi off=27688 size i=8000 in H5FD mpio write mpi off=19688 size i=8000 size_i=40 in H5FD_mpio_write mpi_off=96 in H5FD mpio write mpi off=136 size i=544 in H5FD_mpio_write mpi_off=680 size_i=120 in H5FD mpio write mpi off=800 size i=272

• Execution time: 0.011599 s.



Metadata

Metadata

Dataset elements

Use Collective Mode or Chunked Storage

Remedy:

- Collective I/O will combine many small independent calls into few but bigger calls
- Chunks of columns speeds up too



Collective vs. independent write



Other Helpful Tools...

- Two kinds of tools:
 - I/O benchmarks for measuring a system's I/O capabilities
 - I/O profilers for characterizing applications' I/O behavior
- Two examples:
 - h5perf (in the HDF5 source code distro)
 - <u>Darshan</u> (from Argonne National Laboratory)
- Profilers have to compromise between
 - A lot of detail \rightarrow large trace files and overhead
 - Aggregation \rightarrow loss of detail, but low overhead



I/O Patterns





h5perf(_serial)

- Measures performance of a filesystem for different I/O patterns and APIs
- Three File I/O APIs for the price of one!
 - POSIX I/O (open/write/read/close...)
 - MPI-I/O (MPI_File_{open,write,read,close})
 - HDF5 (H5Fopen/H5Dwrite/H5Dread/H5Fclose)
- An indication of I/O speed ranges and HDF5 overheads
- Expectation management...



A Serial Run

h5perf_serial, 3 iterations, 1 GB dataset, 1 MB transfer buffer, HDF5 dataset contiguous storage, HDF5 SVN trunk, NCSA BW





A Parallel Run

h5perf, 3 MPI processes, 3 iterations, 3 GB dataset (total), 1 GB per process, 1 GB transfer buffer, HDF5 dataset contiguous storage, HDF5 SVN trunk, NCSA BW





Darshan (ANL)

- Design goals:
 - Transparent integration with user environment
 - Negligible impact on application performance
- Provides aggregate figures for:
 - Operation counts (POSIX, MPI-IO, HDF5, PnetCDF)
 - Datatypes and hint usage
 - Access patterns: alignments, sequentiality, access size
 - Cumulative I/O time, intervals of I/O activity
- Does not provide I/O behavior over time
- Excellent starting point, maybe not your final stop



Darshan Sample Output





PARALLEL HDF5 TUNING



Metadata Read Storm Problem (I)

• All metadata "write" operations are required to be collective:

if(0 == rank)
 H5Dcreate("dataset1");
else if(1 == rank)
 H5Dcreate("dataset2");

/* All ranks have to call */
H5Dcreate("dataset1");
H5Dcreate("dataset2");

• Metadata read operations are <u>not</u> required to be collective:

 \checkmark

if(0 == rank)
 H5Dopen("dataset1");
else if(1 == rank)
 H5Dopen("dataset2");

 \checkmark

/* All ranks have to call */
H5Dopen("dataset1");
H5Dopen("dataset2");

Metadata Read Storm Problem (II)

- Metadata read operations are treated by the library as independent read operations.
- Consider a very large MPI job size where all processes want to open a dataset that already exists in the file.
- All processes
 - Call H5Dopen("/G1/G2/D1");
 - Read the same metadata to get to the dataset and the metadata of the dataset itself
 - IF metadata not in cache, THEN read it from disk.
 - Might issue read requests to the file system for the same small metadata.
- → READ STORM



Avoiding a Read Storm

- Application sets hint that metadata access is done collectively
 - A property on an access property list: H5Pset_all_coll_metadata_ops
 - If set on the file access property list, then all metadata read operations will be required to be collective
- Can be set on individual object property list or on a file level
- If set, MPI rank 0 will issue the read for a metadata entry to the file system and broadcast to all other ranks



Successful Collective Dataset I/O

• Request Collective Dataset I/O:

xf_id = H5Pcreate(H5P_DATASET_XFER); H5Pset_dxpl_mpio(xf_id, H5FD_MPIO_COLLECTIVE); H5Dwrite(dset_id, H5T_NATIVE_INT, ..., xf_id, ...);

- However, collective I/O can be changed to independent I/O within HDF5:
 - Datatype conversion, data transform, layout isn't contiguous or chunked



...

Successful Collective Dataset I/O

• Check for Collective I/O and why I/O was performed Independently:

```
xf_id = H5Pcreate(H5P_DATASET_XFER);
H5Pset_dxpl_mpio(xf_id, H5FD_MPIO_COLLECTIVE);
H5Dwrite(dset_id, H5T_NATIVE_INT, ..., xf_id, ...);
H5Pget_mpio_actual_io_mode(xf_id, &io_mode);
if(io_mode == H5D_MPIO_NO_COLLECTIVE)
H5Pget_mpio_no_collective_cause(xf_id, &local_cause,
&global cause);
```



...

ECP EXAHDF5



ECP ExaHDF5 project mission

- Work with ECP applications and facilities to meet their needs
- Productize HDF5 features
- Support, maintain, package, and release HDF5
- Research toward future architectures and incoming requests from ECP teams



ECP Engagement – AD and Co-design teams

| ECP AD team | Type of engagement | Status | ExaHDF5 POC(s) / ECP team POC(s) |
|------------------------------------|------------------------------|---|--|
| Subsurface simulation – Chombo I/O | I/O performance tuning | Improved performance | Suren Byna, Quincey / Brian van Straalen |
| QMCPACK | File close performance issue | Improved performance | Rick Zamora / Ye Luo |
| EQSim – SW4 | HDF5 I/O implementation | Benchmark developed | Suren Byna / Hans Johansen |
| WarpX | Performance issue | Improved performance | Alex Sim / Jean-Luc Vay |
| ExaFEL | SWMR enhancements | Prototype in testing | Quincey Koziol / Amedeo Perazzo |
| ExaSky – HACC | I/O performance tuning | Tuning performance | Scot Breitenfeld / Hal Finkel, Salman Habib |
| ExaSky – Nyx | I/O performance tuning | Tuned performance for the AMReX I/O benchmark | Suren Byna / Ann Almgren, Zarija Lukic |
| AMReX co-design center | AMReX I/O performance tuning | Tuned performance for the AMReX I/O benchmark | Suren Byna / Ann Almgren, Andrew Myers |
| E3SM-MMF | Testing Data Elevator | The AD team tested the feature | Suren Byna / Jayesh Krishna |
| Lattice QCD, NWChemEx, CANDLE | I/O using HDF5 | Initial communications w/ the AD teams | Suren Byna, Venkat Vishwanath / Chulwoo (LQCD), Ray Bair (NWChem), Venkat (CANDLE) |
| ExaLearn | I/O for ML applications | Initial communications | Quincey Koziol / Quincey Koziol |

More details: https://confluence.exascaleproject.org/display/STDM10



ECP & ASCR Engagement – ST teams

| ECP ST team | Type of engagement | Status | ExaHDF5 POC(s) / ECP team POC(s) |
|-------------|--|--|--|
| ADIOS | Interoperability of HDF5 and other file formats | Developing VOL to read ADIOS dataADIOS R/W of HDF5 data | Suren Byna, Quincey / Junmin Gu, John Wu |
| DataLib | Interoperability of HDF5 and other file formats | VOL to read netCDF data – To Do HDF5 relies on MPI-IO | Venkat Vishwanath / Rob Ross, Rob Latham |
| UnifyCR | Data Elevator can use a unified node-local storage namespace | Discussion with the UnifyCR teams on the API, data movement strategy, etc. | Suren Byna / Kathryn Mohror |
| EZ | Compression in HDF5 | EZ team developing parallel filter with HDF5 | Scot Breitenfeld / Franck Cappello, Sheng Di |
| ZFP | Compression in HDF5 | Initial communications | Suren Byna / Peter Lindstorm |
| ALPINE | VTK / HDF5 mapping | Initial communications | Suren Byna, Scot Breitenfeld / Jim Ahrens |



Productizing HDF5 features

- Virtual Object Layer (VOL)
- Indexing and querying raw data



Virtual Object Layer (VOL)

- Goal: Provide an application with the HDF5 data model and API, but allow different underlying storage mechanisms
- Enables developers to easily use HDF5 on novel current and future storage systems
 - Prototype plugins for using burst buffer storage transparently and for accessing DAOS are available
 - VOL plugins for reading netCDF and ADIOS data are in development
- Integrated into the HDF5 trunk <u>https://bitbucket.hdfgroup.org/projects/HDFFV/repos/hdf5/</u>





Indexing and querying datasets

- HDF5 index objects and API routines allow the creation of indexes on the contents of HDF5 containers, to improve query performance
- HDF5 query objects and API routines enable the construction of query requests for execution on HDF5 containers
 - H5Qcreate
 - H5Qcombine
 - H5Qapply
 - H5Qclose



 HDF5 Bitbucket repo containing the "topic-parallel-indexing" source code: <u>https://bitbucket.hdfgroup.org/projects/HDFFV/repos/hdf5</u>



• Parallel scaling of index generation and query resolution is evidenced even for small-scale experiments:



Support and maintenance

- HDF5 home page: <u>http://hdfgroup.org/HDF5/</u>
 - Latest release: HDF5 1.10.5 (1.10.6, 1.12.0 Spring 2019)
 - Bitbucket repo: <u>https://bitbucket.hdfgroup.org/projects/HDFFV/repos/hdf5/</u>
- Documentation is available <u>https://portal.hdfgroup.org/display/HDF5/HDF5</u>
- Support: HDF Helpdesk <u>help@hdfgroup.org</u>
- HDF-FORUM <u>https://forum.hdfgroup.org/</u>
- For ECP teams: Contact the ExaHDF5 POCs for existing collaborations and the PIs for new collaborations


New features for exascale architectures

- Data Elevator to take advantage of burst buffers
- Topology-aware I/O
- Full Single writer multiple readers (SWMR) functionality
- Asynchronous I/O
- Querying metadata
- Interoperability with other file formats



Data Elevator for write and read caching using burst buffers

- Data Elevator write caching prototype
 - Transparent data movement in storage hierarchy
 - In situ data analysis capability using burst buffers
- Tested with a PIC code and Chombo-IO benchmark
- Applications evaluating Data Elevator
 - E3SM-MMF and Sandia ATDM project is evaluating performance
 - Other candidates: EQSim, AMReX
- Installed on NERSC's Cori system (module load data-elevator)









Topology-aware I/O

- Taking advantage of the topology of compute and I/O nodes and network among them improves overall I/O performance
- Developing topology-aware data-movement algorithms and collective I/O optimizations within a new HDF5 virtual file driver (VFD)



Performance comparison of the new HDF5 VFD, using one-sided aggregation, with the default binding to Cray MPICH MPI-IO. Data was collected on Theta using an I/O benchmarking tool (the HDF5 Exerciser),

Prototype implementation: **CCIO** branch <u>https://bitbucket.hdfgroup.org/projects/HDFFV/</u> repos/hdf5/



Full functionality of Single Writer, Multiple Readers (SWMR)

- SWMR enables a single writing process to update an HDF5 file, while multiple reading processes access the file in a concurrent, lock-free manner
- Previously limited to the narrow use-case of appending new elements to HDF5 datasets
- Full SWMR extends existing SWMR to support all metadata operations, such as object creation and deletion, attribute updates

In ECP, ExaFEL project requires this feature. In general, Full SWMR is useful for managing experimental and observational data

Full SWMR branch of HDF5: https://bitbucket.hdfgroup.org/projects/HDFFV/repos/hdf5/ browse?at=refs%2Fheads%2Ffull_swmr



Features in development

- Asynchronous I/O
 - Store data in an intermediate faster memory or storage location and move data asynchronously to storage
 - Prototype of the async I/O VOL with Argobots in progress
- Interoperability with other file formats
 - Capability to read netCDF and ADIOS files
 - Developed a VOL to read ADIOS files and netCDF read VOL dev in progress
- Indexing and querying metadata
 - HDF5 file metadata querying design is in progress
- Breaking collective dependency in updating metadata
 - Metadata updates are collective operations, which may have high overhead
 - Developing independent updates, inspired by blockchain technology



Roadmap of current project





FY20 – 22 Plans

- HDF5 I/O to handle extreme scalability
 - Performance enhancement features to use memory and storage hierarchy of exascale systems
- Productization of features that have been prototyped
 - Various features have been developed recently to improve data access performance and data reduction, and to open the HDF5 API
- Support for ECP apps
 - I/O performance tuning for ECP apps
- Support for DOE exascale facilities
 - Deployment and performance tuning
- Software Maintenance
 - Integration of features, bug fixes, releases of ECP features



Experimental & Observational Data (EOD) Management Requirements

- Experimental and observational science (EOS) facilities have data management requirements beyond existing HDF5 features
- Targeted science drivers
 - LCLS / LCLS-II, NCEM, ALS, NIF, LSST
- Requirements
 - Multiple producers and multiple consumers of data
 - Remote streaming synchronization
 - Handling changes in data, data types, and data schema
 - Search metadata and provenance directly in HDF5 files
 - Support for different forms of data Streaming, sparse, KV, etc.
 - Optimal data placement



EOD-HDF5 - Features

- Multi-modal access and distributed data in workflows
 - Multiple-Writers / Multiple-Readers ("MWMR" or "Multi-SWMR")
 - Distribution of local changes to remote locations
 - "rsync for HDF5 data"
- Data model extensions
 - Storing new forms of data (Key-Value pairs, Sparse data, Column-oriented data)
 - Addressing science data schema variation
 - Managing collections of containers
- Metadata and Provenance management
 - Capturing and storing rich metadata contents and provenance
 - Searching metadata and provenance
 - Optimal data placement based on data analysis patterns





Thank you!





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