



# Parallel HDF5

The HDF Group



# Outline

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- Overview of Parallel I/O
- Overview of Parallel HDF5 design
- PHDF5 Programming Model
- Performance Analysis and use cases



# Overview of Parallel IO

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## Def. Parallel I/O

### At the application level

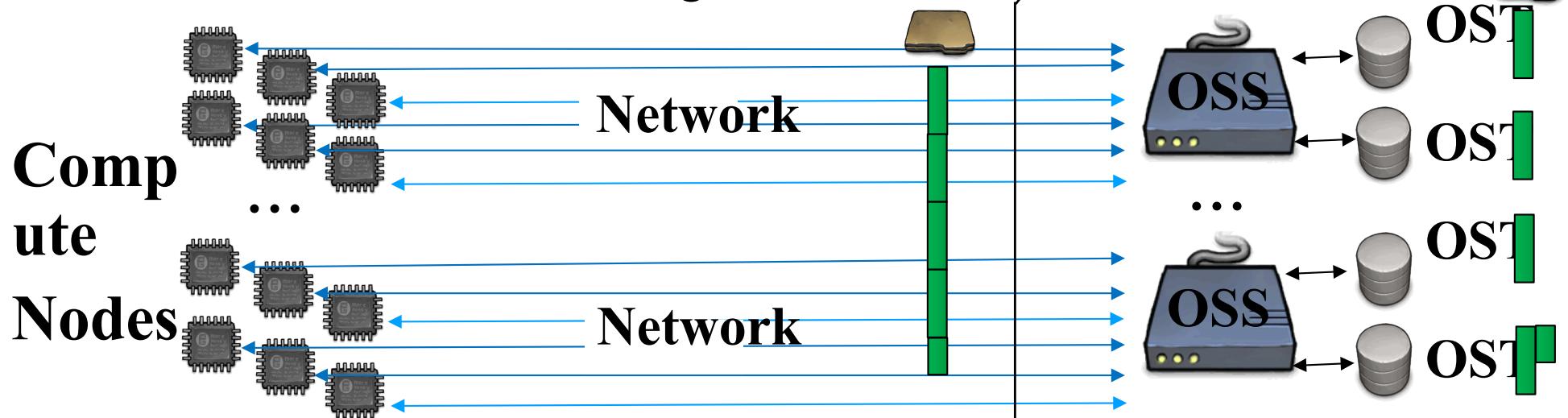
- Concurrent writing to and reading from a single file from multiple processes

### At the system level

- Parallel file system which supports concurrent process access

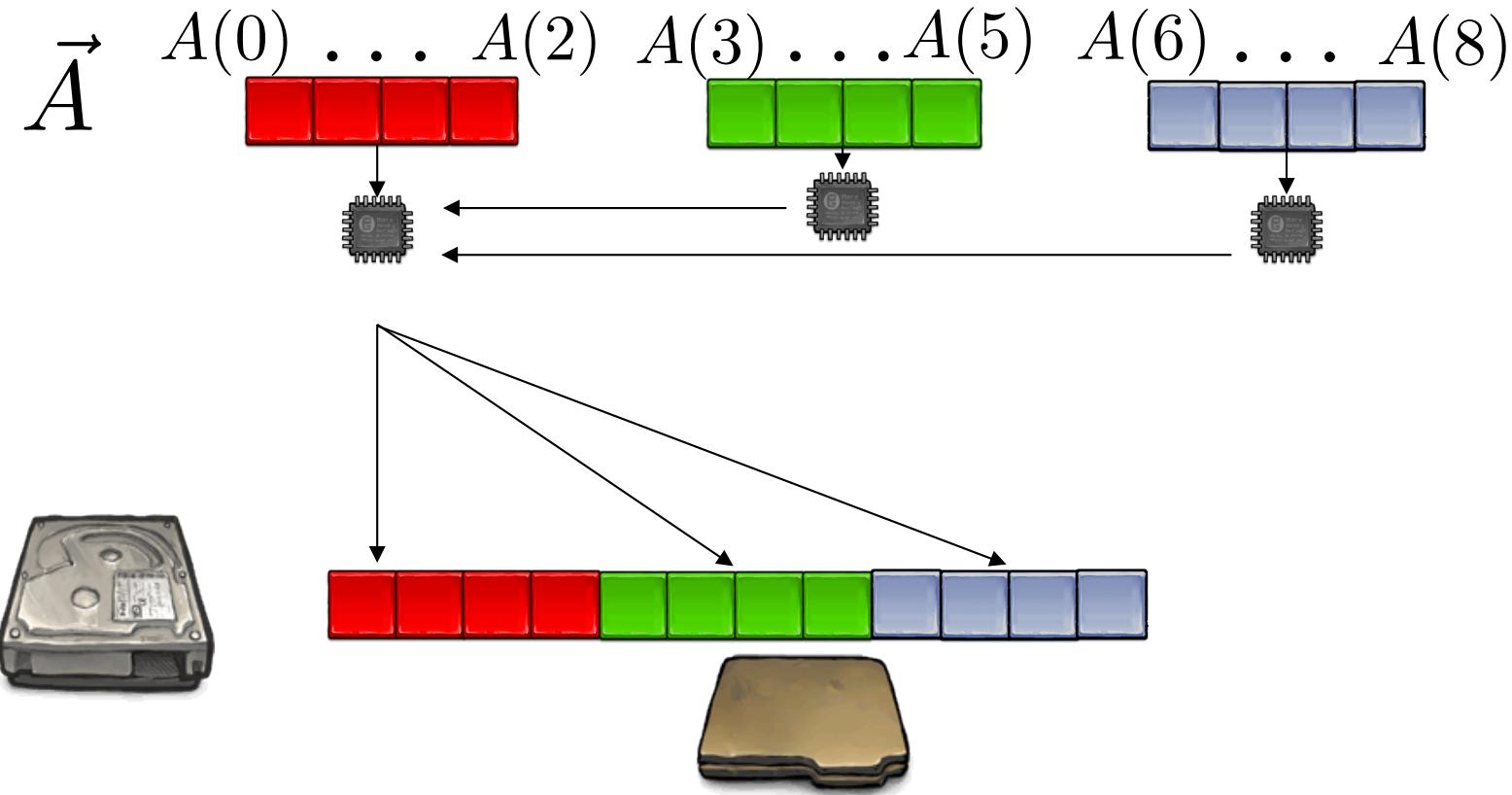
# Parallel File System Nomenclature

- OSS - Object Storage Server
- OST - Object Storage Target
- MDS - Metadata Sever
- MDT - Metadata Target



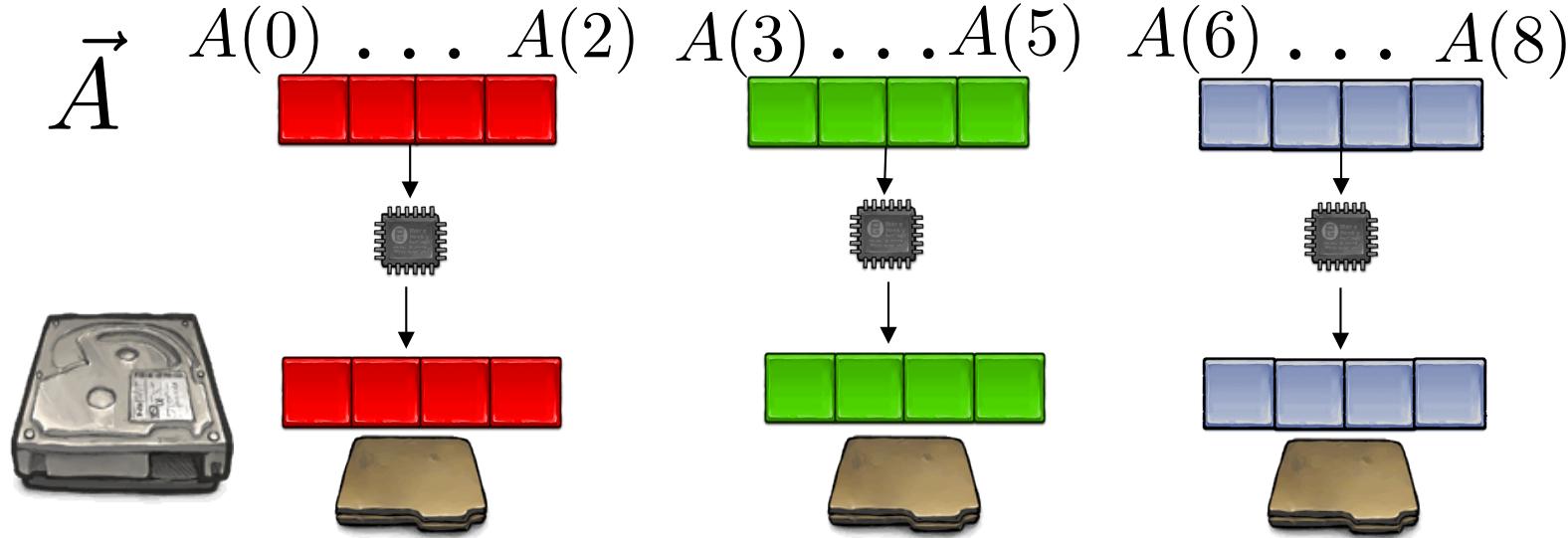
- The file is striped over multiple “disks” (e.g., Lustre OSTs) depending on the stripe size and stripe count with which the file was created
- <https://www.nics.tennessee.edu/computing-resources/file-systems/io-lustre-tips>

# Non-parallel I/O<sup>1</sup>

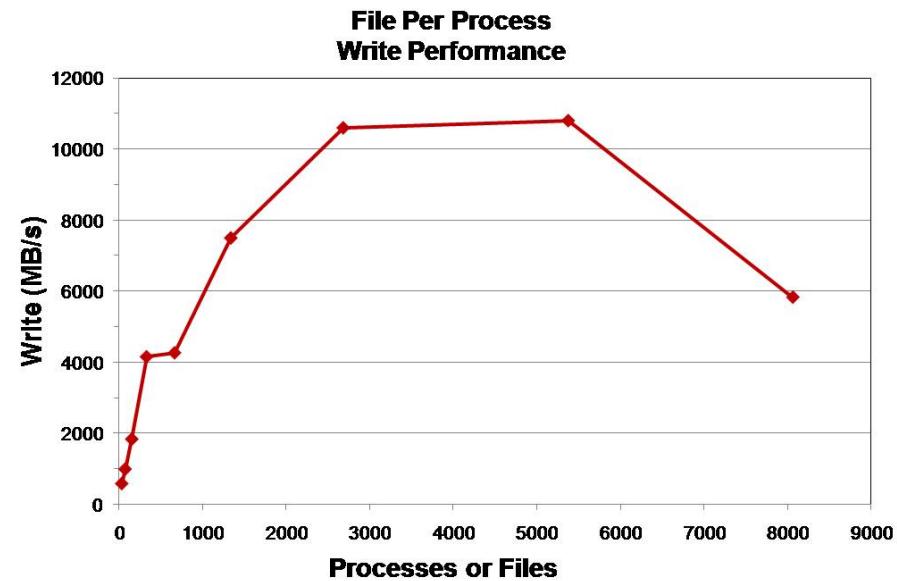


- *Friends don't let friends to this*
- Very bad performance
- Not scalable

# Independent Parallel I/O<sup>1</sup>

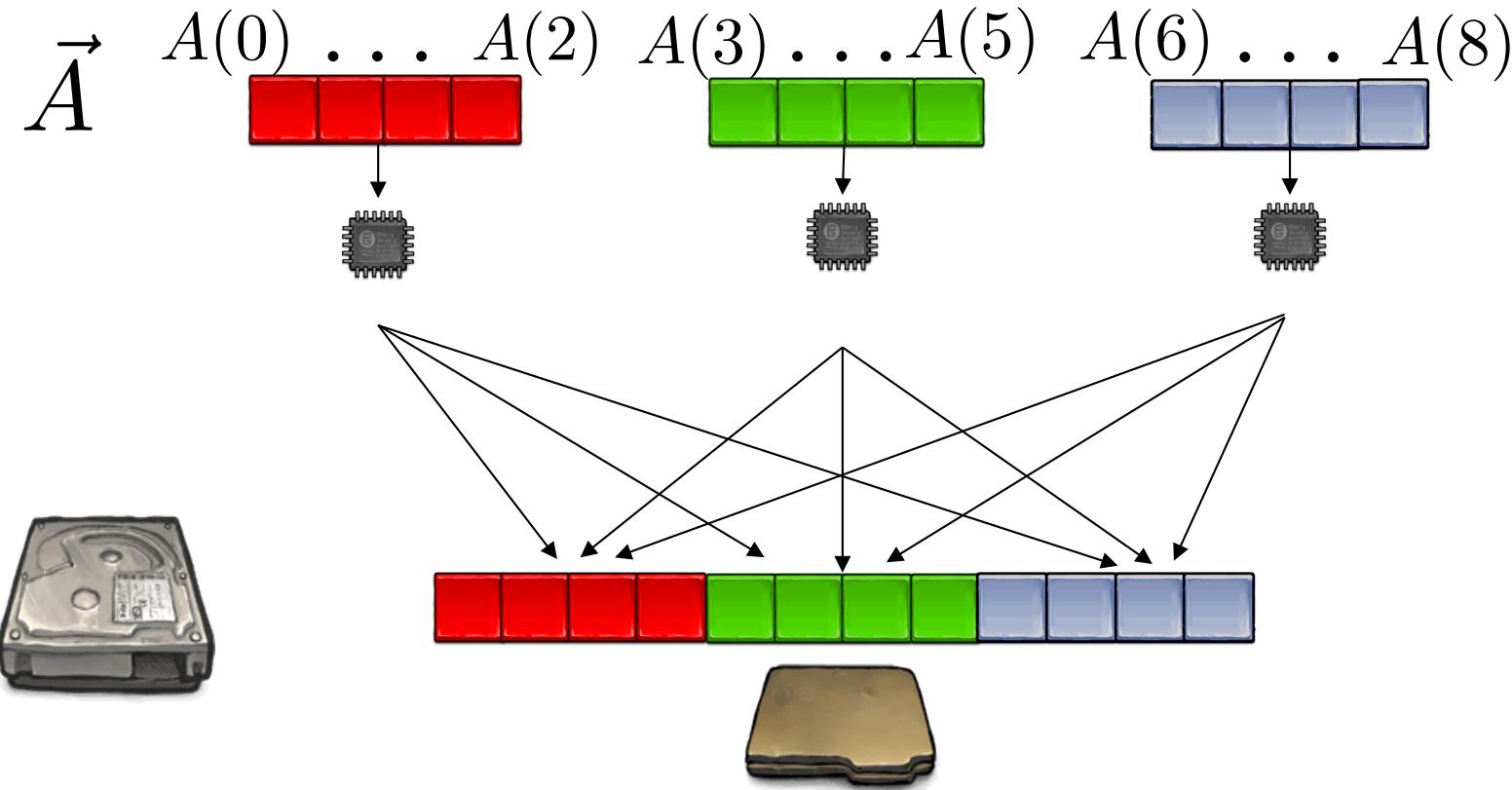


- Results in a large number of files
  - May run into file system limitation on the number of open files allowed
- Not usable from a different number of processes
- Usually, have to post-process the files
- Can achieve very good I/O performance



<https://www.nics.tennessee.edu/computing-resources/file-systems/io-lustre-tips>

# Cooperative Parallel I/O<sup>1</sup>



- Coordination between processes to a single file
- Must use MPI IO
- Can achieve excellent performance

- **MPI-IO is an Input/Output API<sup>1</sup>**
  - Replacement functions for POSIX I/O
  - Handles multiple I/O schemes
    - Including schemes only available via MPI
  - It treats the data file as a “linear byte stream”
    - Each MPI process needs to provide its own file view and data representations to interpret those bytes.
  - Programmer handles
    - Collective coordination of operations
    - Creating user-defined datatypes for both in memory and file layout
    - Process layout of data in a file

<sup>1</sup>W. Gropp, parallel@illinois

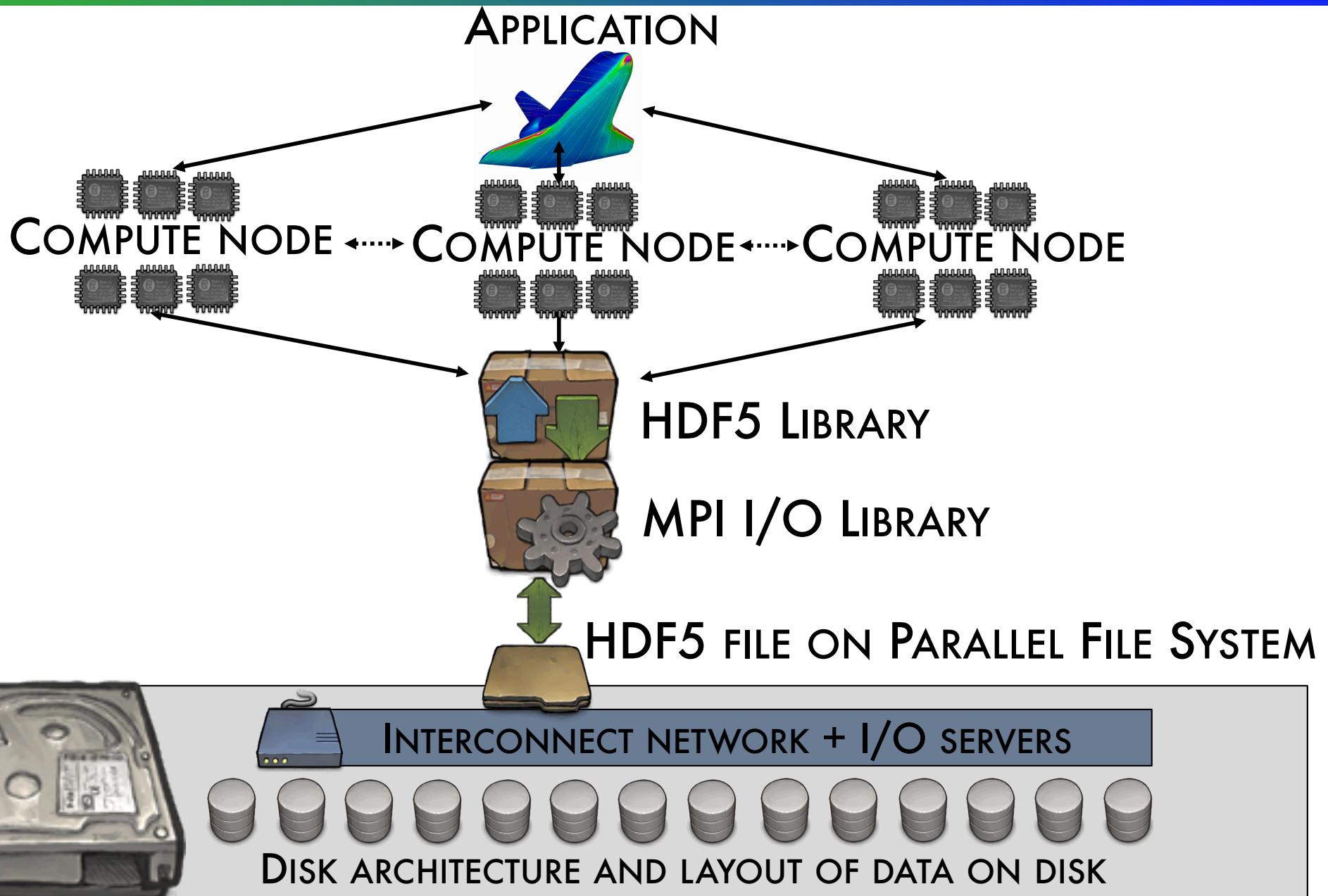


# MPI-IO vs. PHDF5

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- PHDF5 is data management software
  - It stores data and metadata according to the HDF5 data format specification  
<http://support.hdfgroup.org/HDF5/doc/H5.format.html>
- PHDF5 files are HDF5 files
  - Portable to different platforms
- PHDF5 handles the MPI I/O details at a higher level
  - It requires MPI I/O for parallel I/O<sup>†</sup>
- The PHDF5 API consists of:
  - The standard HDF5 API
  - A few extra knobs and calls
  - A parallel “etiquette”

# PHDF5 implementation layers





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# **OVERVIEW OF PARALLEL HDF5 DESIGN**



# How to Compile PHDF5 Applications

- Cmake
- Autotools (configure, make, etc..)
- Wrappers contain compiler/linker flags
  - h5pcc – HDF5 C compiler command
    - Similar to mpicc
  - h5pfc – HDF5 Fortran compiler command
    - Similar to mpif90
- To compile:
  - h5pcc h5prog.c
  - h5pfc h5prog.f90



# h5pcc/h5pfc -show option

- **-show displays the compiler commands and options without executing them, i.e., dry run**

```
> h5pcc -show Sample_mpio.c
```

```
mpicc -I/home/packages/phdf5/include \
-D_LARGEFILE_SOURCE -D_LARGEFILE64_SOURCE \
-D_FILE_OFFSET_BITS=64 -D_POSIX_SOURCE \
-D_BSD_SOURCE -std=c99 -c Sample_mpio.c
```

```
mpicc -std=c99 Sample_mpio.o \
-L/home/packages/phdf5/lib \
/home/packages/phdf5/lib/libhdf5_hl.a \
/home/packages/phdf5/lib/libhdf5.a -lz -lm -Wl,-rpath \
-Wl,/home/packages/phdf5/lib
```

- MPI definition of collective calls
  - All processes of the communicator must participate in the right order. E.g.,

Process1	Process2
 <b>call A(); call B();</b>	<b>call A(); call B(); ...CORRECT</b>
 <b>call A(); call B();</b>	<b>call B(); call A(); ...WRONG</b>

- Neither mode is preferable *a priori*

Collective I/O: Attempts to combine multiple smaller independent I/O ops into fewer larger ops



# Programming Restrictions

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- Most PHDF5 APIs are collective
- PHDF5 opens a parallel file with a communicator
  - Returns a file-handle
  - Future access to the file via the file-handle
- All processes must participate in collective PHDF5 APIs
- Different files can be opened via different communicators

- All HDF5 APIs that modify structural metadata are collective!
  - File operations
    - H5Fcreate, H5Fopen, H5Fclose, etc
  - Object creation
    - H5Dcreate, H5Dclose, etc
  - Object structure modification (e.g., dataset extent modification)
    - H5Dset\_extent, etc
- <http://www.hdfgroup.org/HDF5/doc/RM/CollectiveCalls.html>

- Array data transfer can be **collective** or **independent**
  - Dataset operations: H5Dwrite, H5Dread
- Collectiveness is indicated by **function parameters**, not by function names as in MPI API

# What does PHDF5 support ?

- After a file is opened by the processes of a communicator
  - All parts of file are accessible by all processes
  - All objects in the file are accessible by all processes
  - Multiple processes may write to the same data array
  - Each process may write to individual data array



# PHDF5 API languages

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- C and Fortran language interfaces
- Most platforms with MPI-IO supported. e.g.,
  - IBM AIX
  - Linux clusters
  - Cray XT

# Programming model

- HDF5 uses access template object (property list) to control the file access mechanism
- General model to access an HDF5 file in parallel:
  - Set-up MPI I/O access template (file access property list)

H5Fcreate (H5Fopen)

create (open) File

H5Screate\_simple/H5Screate

create dataSpace

H5Dcreate (H5Dopen)

create (open) Dataset

H5Dread, H5Dwrite

access Dataset

H5Dclose

close Dataset

H5Sclose

close dataSpace

H5Fclose

close File



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## Writing patterns

# EXAMPLE



# Parallel HDF5 tutorial examples

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- For simple examples how to write different data patterns see

<http://www.hdfgroup.org/HDF5/Tutor/parallel.html>



# General Programming model

- Each process defines memory and file hyperslabs using `H5Sselect_hyperslab`
- Each process executes a write/read call using hyperslabs defined, which can be either collective or independent
- The hyperslab parameters define the portion of the dataset to write to
  - Contiguous hyperslab
  - Regularly spaced data (column or row)
  - Pattern
  - Blocks



# Setup MPI-IO access template

Each process of the MPI communicator creates an access template and sets it up with MPI parallel access information

C:

```
herr_t H5Pset_fapl_mpio(hid_t plist_id,  
                         MPI_Comm comm, MPI_Info info);
```

Fortran:

```
h5pset_fapl_mpio_f(plist_id, comm, info)  
integer(hid_t) :: plist_id  
integer :: comm, info
```

**plist\_id** is a file access property list identifier



# C Example Parallel File Create

```
23     comm = MPI_COMM_WORLD;
24     info = MPI_INFO_NULL;
26     /*
27      * Initialize MPI
28      */
29     MPI_Init(&argc, &argv);
30     /*
31      * Set up file access property list for MPI-IO access
32      */
->36     plist_id = H5Pcreate(H5P_FILE_ACCESS);
->37     H5Pset_fapl_mpio(plist_id, comm, info);
38
->42     file_id = H5Fcreate(H5FILE_NAME, H5F_ACC_TRUNC,
39                           H5P_DEFAULT, plist_id);
40     /*
41      * Close the file.
42      */
43     H5Fclose(file_id);
44     MPI_Finalize();
```



# Fortran Example Parallel File Create

```
23 comm = MPI_COMM_WORLD
24 info = MPI_INFO_NULL
26 CALL MPI_INIT(mpierror)
29 !
30 !Initialize FORTRAN predefined datatypes
32 CALL h5open_f(error)
34 !
35 !Setup file access property list for MPI-IO access.
->37 CALL h5pcreate_f(H5P_FILE_ACCESS_F, plist_id, error)
->38 CALL h5pset_fapl_mpio_f(plist_id, comm, info, error)
40 !
41 !Create the file collectively.
->43 CALL h5fcreate_f(filename, H5F_ACC_TRUNC_F, file_id,
                     error, access_prp = plist_id)
45 !
46 !Close the file.
49 CALL h5fclose_f(file_id, error)
51 !
52 !Close FORTRAN interface
54 CALL h5close_f(error)
56 CALL MPI_FINALIZE(mpierror)
```



# Creating and Opening Dataset

- All processes of the communicator open/close a dataset by a collective call
  - ✓ C: H5Dcreate or H5Dopen; H5Dclose
  - ✓ Fortran: `h5dcreate_f` or `h5dopen_f`;  
`h5dclose_f`
- All processes of the communicator must extend an unlimited dimension dataset before writing to it
  - ✓ C: H5Dextend
  - ✓ Fortran: `h5dextend_f`



# C Example: Create Dataset

```
56 file_id = H5Fcreate(...);
57 /*
58  * Create the dataspace for the dataset.
59  */
60 dims[0] = NX;
61 dims[1] = NY;
62 filepace = H5Screate_simple(RANK, dims, NULL);
63 /*
64  * Create the dataset with default properties collective.
65  */
->67 dset_id = H5Dcreate(file_id, "dataset1", H5T_NATIVE_INT,
68                         filepace, H5P_DEFAULT);
69
70 H5Dclose(dset_id);
71 /*
72  * Close the file.
73  */
74 H5Fclose(file_id);
```



# Fortran Example: Create Dataset

```
43 CALL h5fcreate_f(filename, H5F_ACC_TRUNC_F, file_id,
                     error, access_prp = plist_id)
73 CALL h5screate_simple_f(rank, dims, filespace, error)
76 !
77 ! Create the dataset with default properties.
78 !
->79 CALL h5dcreate_f(file_id, "dataset1", H5T_NATIVE_INTEGER,
                     filespace, dset_id, error)
90 !
91 ! Close the dataset.
92 CALL h5dclose_f(dset_id, error)
93 !
94 ! Close the file.
95 CALL h5fclose_f(file_id, error)
```

# Accessing a Dataset

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- All processes that have opened dataset may do collective I/O
- Each process may do independent and arbitrary number of data I/O access calls
  - C: H5Dwrite and H5Dread
  - Fortran: `h5dwrite_f` and `h5dread_f`



# Programming model for dataset access

- Create and set dataset transfer property
  - C: `H5Pset_dxpl_mpio`
    - `H5FD_MPIO_COLLECTIVE`
    - `H5FD_MPIO_INDEPENDENT` (default)
  - Fortran: `h5pset_dxpl_mpio_f`
    - `H5FD_MPIO_COLLECTIVE_F`
    - `H5FD_MPIO_INDEPENDENT_F` (default)
- Access dataset with the defined transfer property



# C Example: Collective write

```
95  /*
96   * Create property list for collective dataset write.
97   */
98 plist_id = H5Pcreate(H5P_DATASET_XFER);
->99 H5Pset_dxpl_mpio(plist_id, H5FD_MPIO_COLLECTIVE);
100
101 status = H5Dwrite(dset_id, H5T_NATIVE_INT,
102                     memspace, filespace, plist_id, data);
```



# Fortran Example: Collective write

```
88 ! Create property list for collective dataset write
89 !
90 CALL h5pcreate_f(H5P_DATASET_XFER_F, plist_id, error)
->91 CALL h5pset_dxpl_mpio_f(plist_id, &
                         H5FD_MPIO_COLLECTIVE_F, error)
92
93 !
94 ! Write the dataset collectively.
95 !
96 CALL h5dwrite_f(dset_id, H5T_NATIVE_INTEGER, data, &
                  error, &
                  file_space_id = filespace, &
                  mem_space_id = memspace, &
                  xfer_prp = plist_id)
```



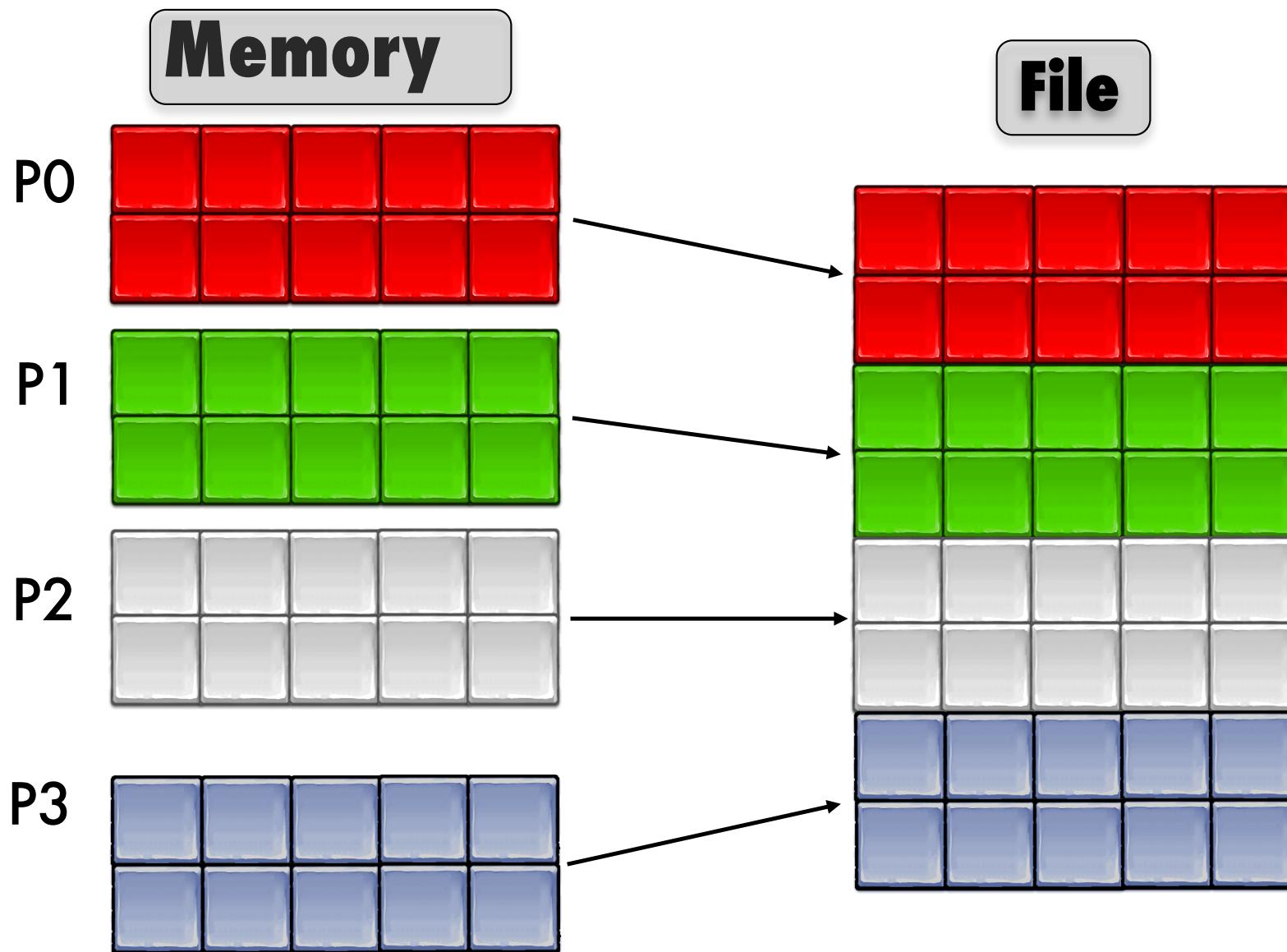
# Writing and Reading Hyperslabs

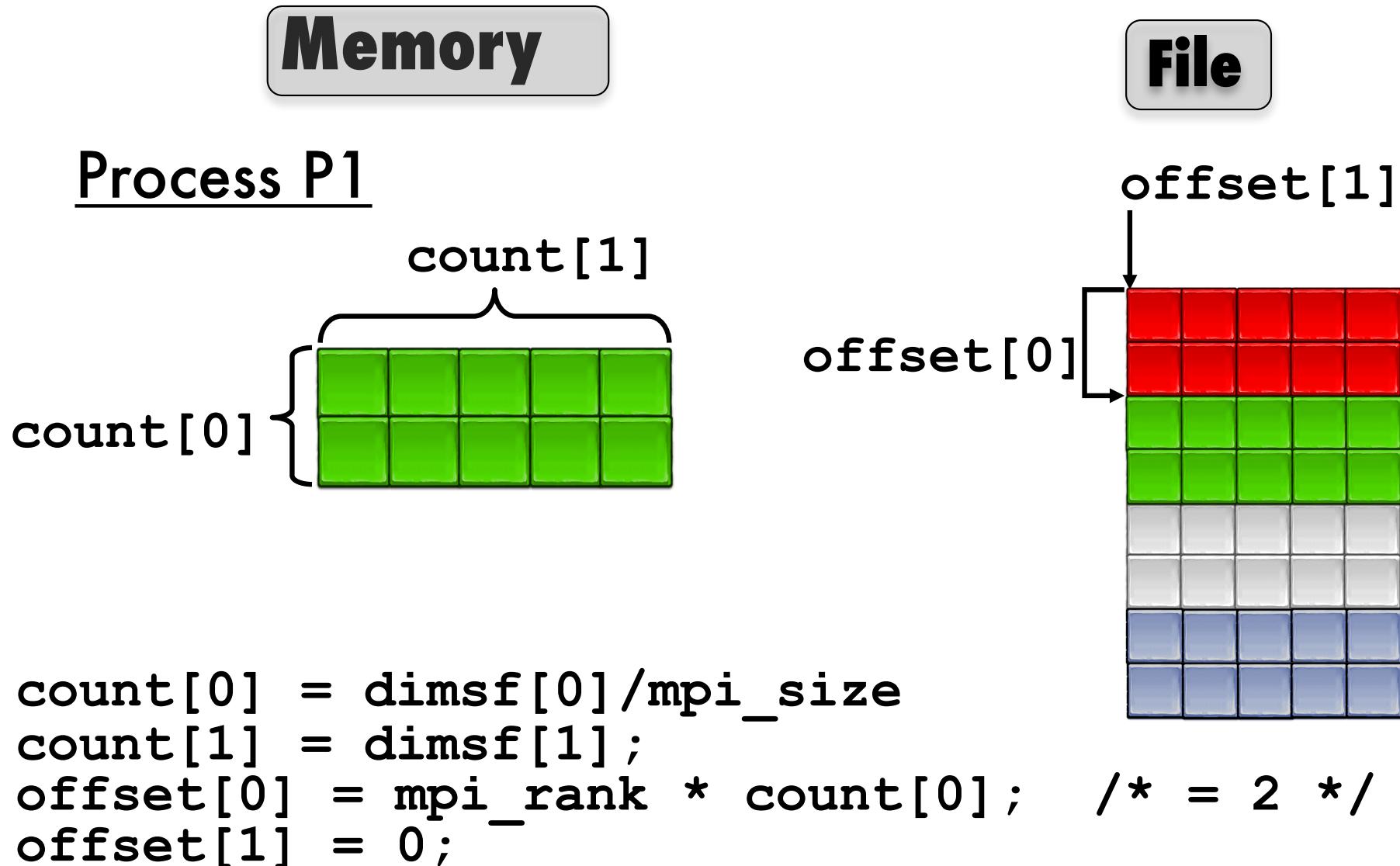
- Distributed memory model: data is split among processes
- PHDF5 uses HDF5 hyperslab model
- Each process defines memory and file hyperslabs

```
H5Sselect_hyperslab(  
    filepace, H5S_SELECT_SET,  
    offset, stride, count, block  
)
```

- Each process executes partial write/read call
  - Collective calls
  - Independent calls

# Example 1: Writing dataset by rows



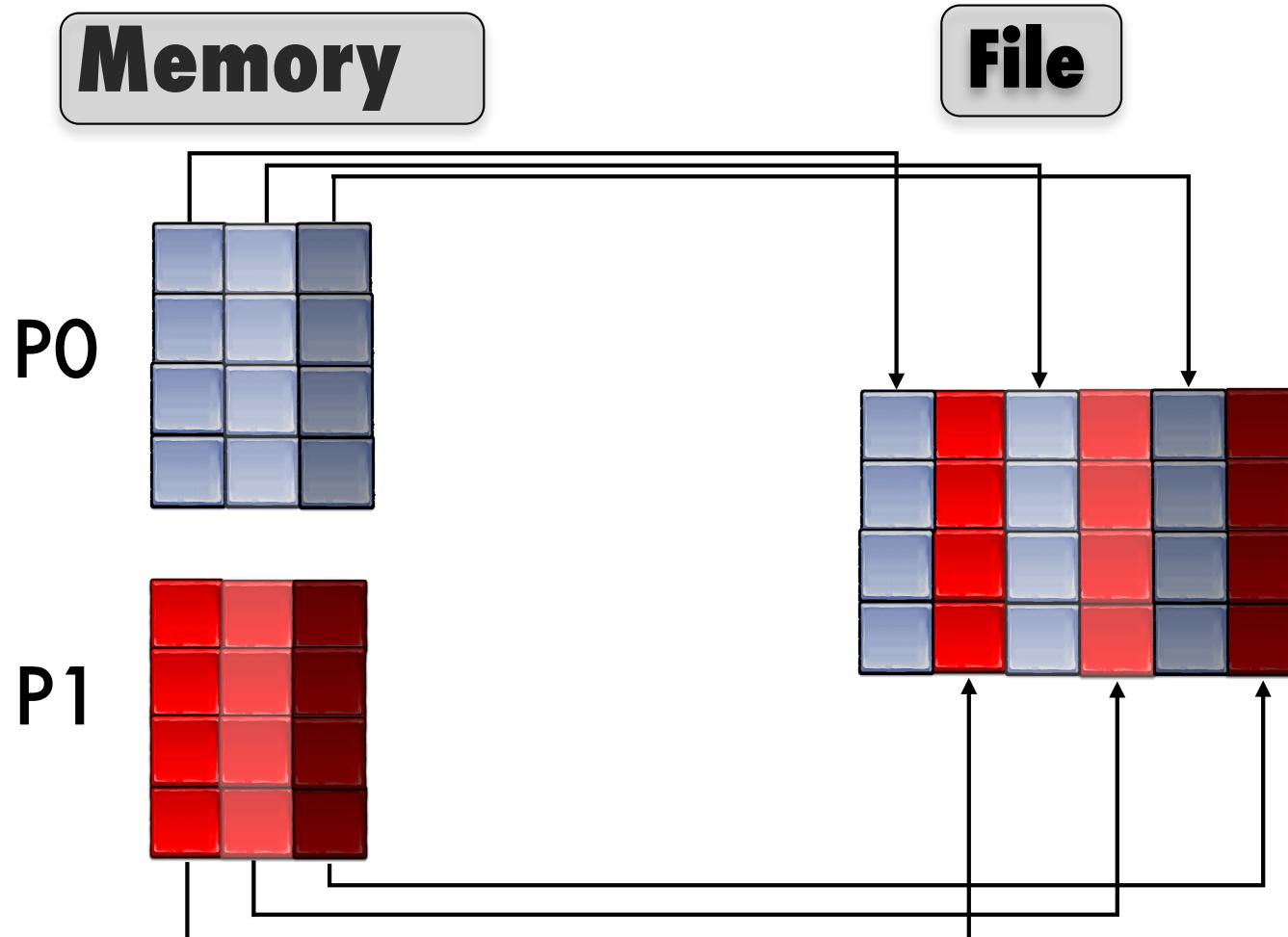


# Example 1: Writing dataset by rows

```
71  /*
72   * Each process defines dataset in memory and
73   * writes it to the hyperslab
74   */
75  count[0] = dims[0]/mpi_size;
76  count[1] = dims[1];
77  offset[0] = mpi_rank * count[0];
78  offset[1] = 0;
79  memspace = H5Screate_simple(RANK, count, NULL);
80
81 /*
82 * Select hyperslab in the file.
83 */
84 filespace = H5Dget_space(dset_id);
85 H5Sselect_hyperslab(filespace,
86                      H5S_SELECT_SET, offset, NULL, count, NULL);
```

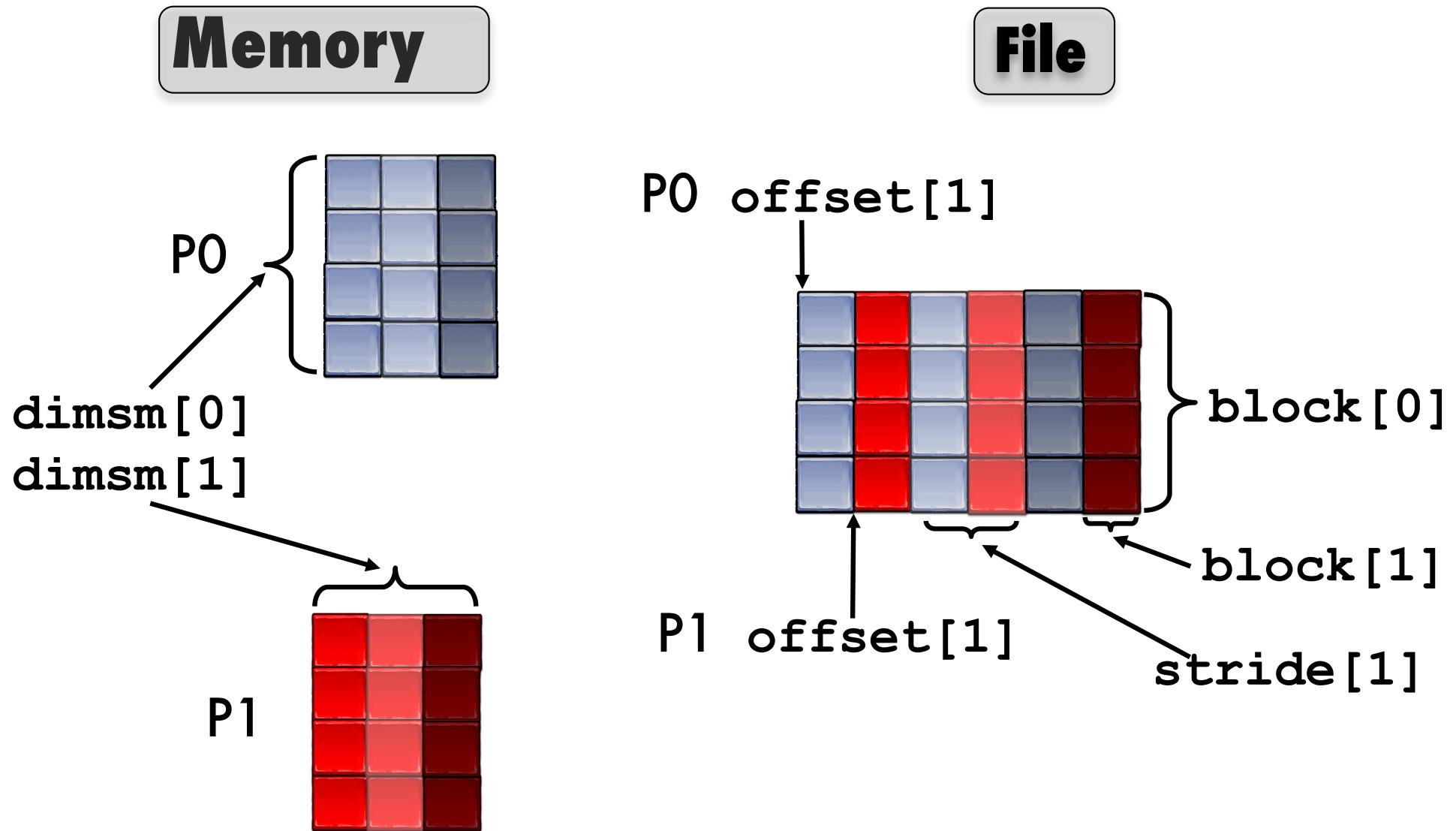
```
HDF5 "SDS_row.h5" {
GROUP "/" {
    DATASET "IntArray" {
        DATATYPE H5T_STD_I32BE
        DATASPACE SIMPLE{ ( 8, 5 ) / ( 8, 5 ) }
        DATA {
            10, 10, 10, 10, 10,
            10, 10, 10, 10, 10,
            11, 11, 11, 11, 11,
            11, 11, 11, 11, 11,
            12, 12, 12, 12, 12,
            12, 12, 12, 12, 12,
            13, 13, 13, 13, 13,
            13, 13, 13, 13, 13
        }
    }
}
}
```

# Example 2: Writing dataset by columns





## Example 2: Writing dataset by column





## column

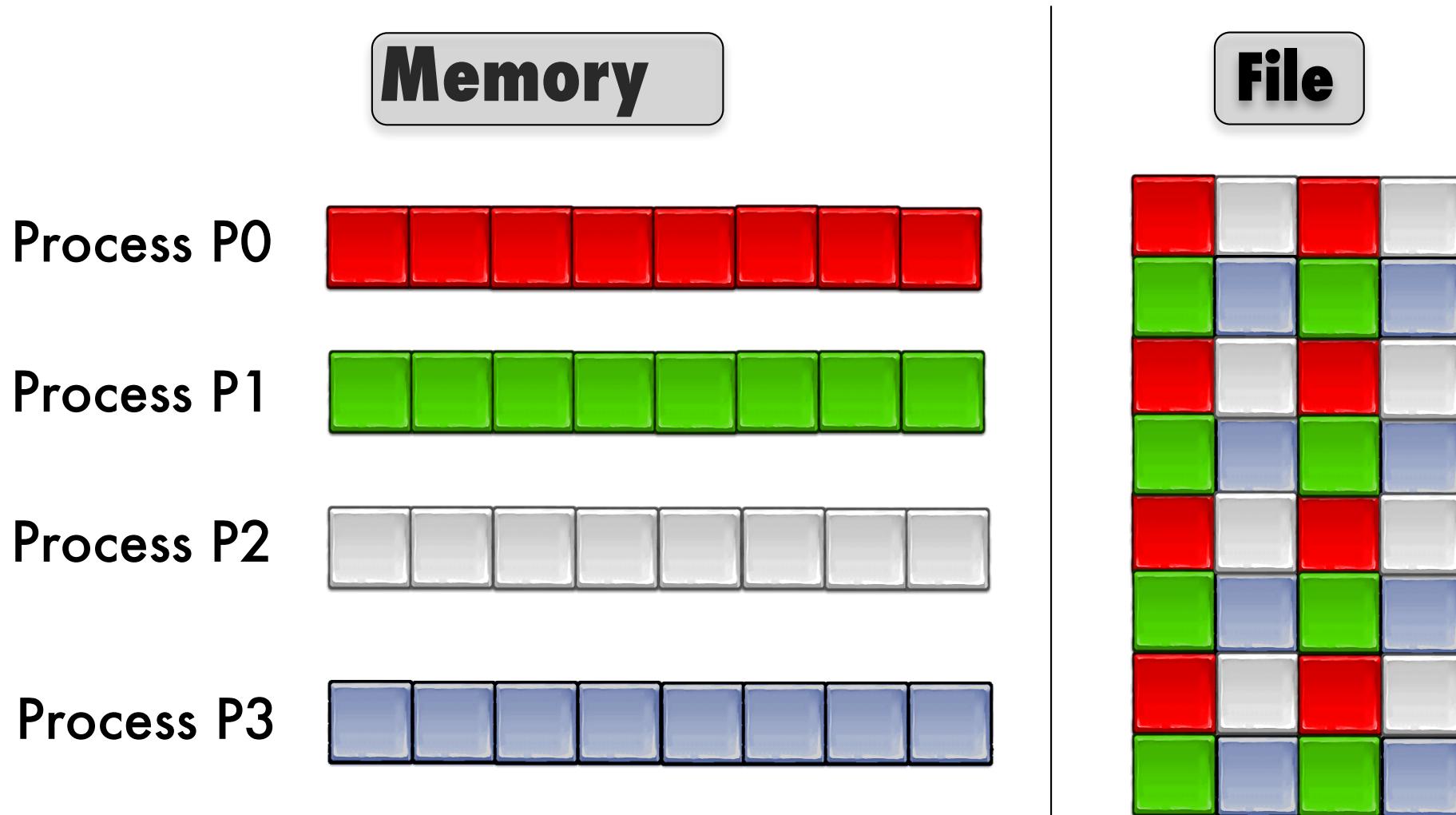
```
85  /*
86   * Each process defines a hyperslab in
87   *      * the file
88  */
89  count[0]    = 1;
90  count[1]    = dimsm[1];
91  offset[0]   = 0;
92  offset[1]   = mpi_rank;
93  stride[0]   = 1;
94  stride[1]   = 2;
95  block[0]    = dimsfs[0];
96  block[1]    = 1;
97
98 /*
99  * Each process selects a hyperslab.
100 */
101 filespace = H5Dget_space(dset_id);
102 H5Sselect_hyperslab(filespace,
103                      H5S_SELECT_SET, offset, stride,
104                      count, block);
```



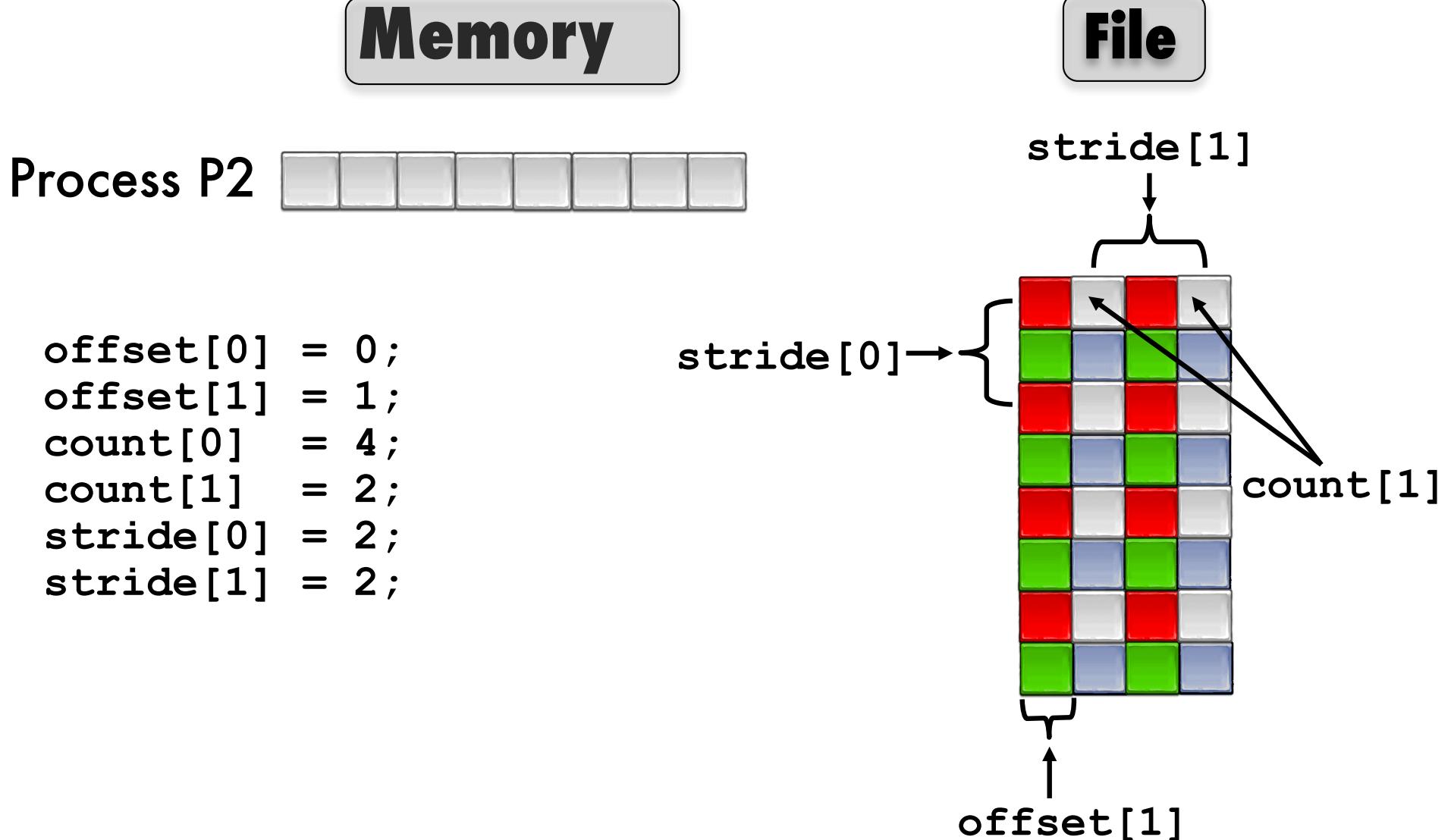
# Writing by columns: Output of h5dump

```
HDF5 "SDS_col.h5" {
GROUP "/" {
    DATASET "IntArray" {
        DATATYPE H5T_STD_I32BE
        DATASPACE SIMPLE{ ( 8, 6 ) / ( 8, 6 ) }
        DATA {
            1, 2, 10, 20, 100, 200,
            1, 2, 10, 20, 100, 200,
            1, 2, 10, 20, 100, 200,
            1, 2, 10, 20, 100, 200,
            1, 2, 10, 20, 100, 200,
            1, 2, 10, 20, 100, 200,
            1, 2, 10, 20, 100, 200,
            1, 2, 10, 20, 100, 200
        }
    }
}
}
```

# Example 3: Writing dataset by pattern



# Example 3: Writing dataset by pattern



# Example 3: Writing by pattern

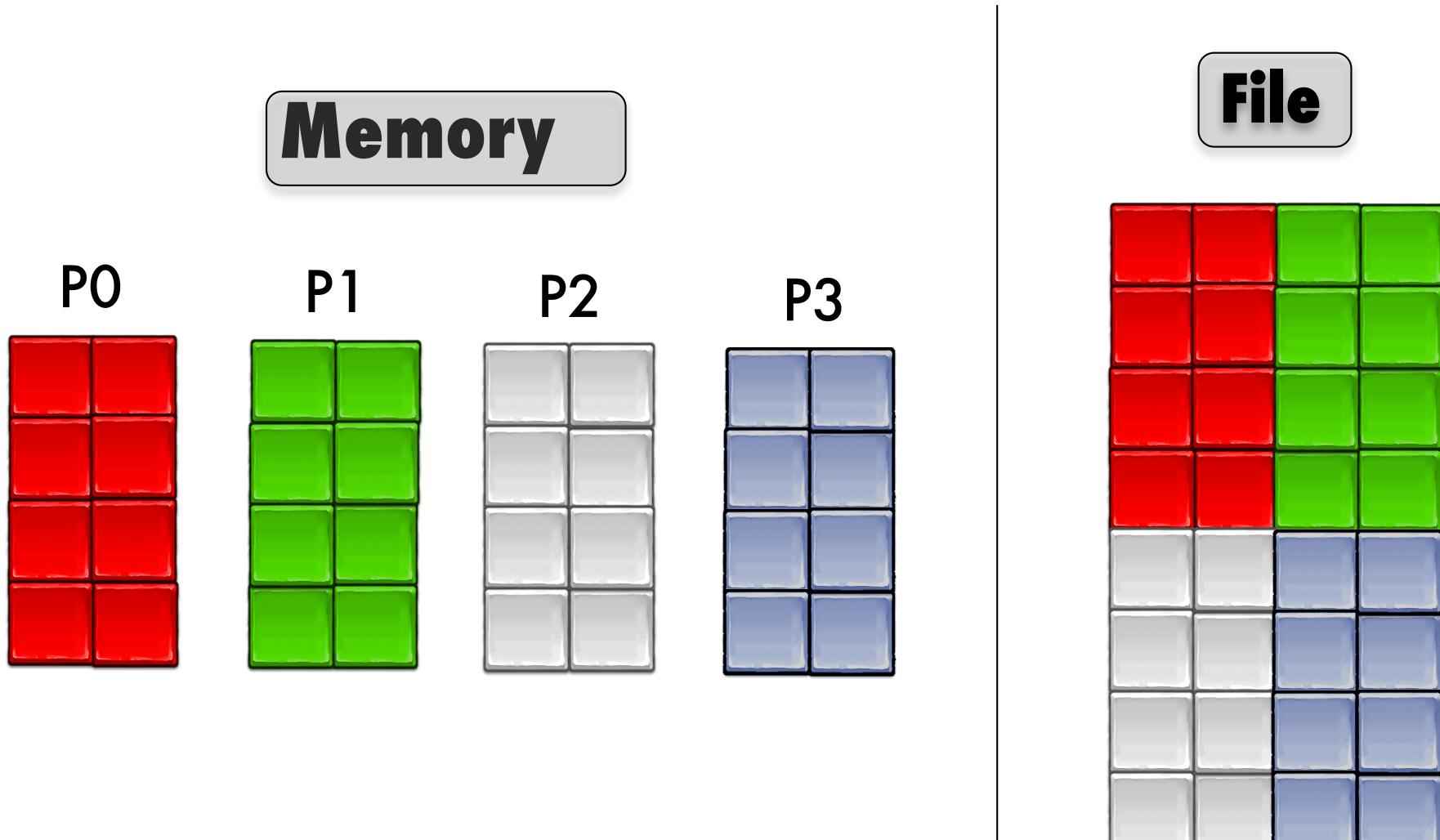
```
90  /* Each process defines dataset in memory and
91   * writes it to the hyperslab in the file.
92   */
93   count[0] = 4;
94   count[1] = 2;
95   stride[0] = 2;
96   stride[1] = 2;
97   if(MPI_Rank == 0) {
98     offset[0] = 0;
99     offset[1] = 0;
100   }
101   if(MPI_Rank == 1) {
102     offset[0] = 1;
103     offset[1] = 0;
104   }
105   if(MPI_Rank == 2) {
106     offset[0] = 0;
107     offset[1] = 1;
108   }
109   if(MPI_Rank == 3) {
110     offset[0] = 1;
111     offset[1] = 1;
112 }
```



# Writing by Pattern: Output of h5dump

```
HDF5 "SDS_pat.h5" {
GROUP "/" {
    DATASET "IntArray" {
        DATATYPE H5T_STD_I32BE
        DATASPACE SIMPLE{( 8, 4 ) / ( 8, 4 ) }
        DATA {
            1, 3, 1, 3,
            2, 4, 2, 4,
            1, 3, 1, 3,
            2, 4, 2, 4,
            1, 3, 1, 3,
            2, 4, 2, 4,
            1, 3, 1, 3,
            2, 4, 2, 4
        }
    }
}
}
```

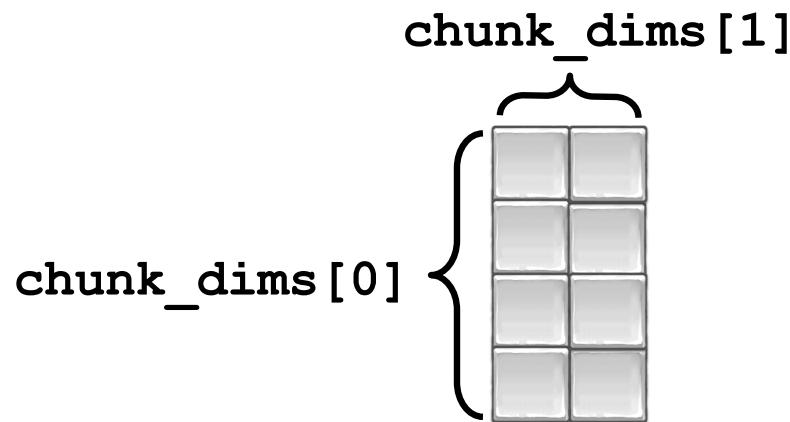
# Example 4: Writing dataset by chunks



# Example - viewing multiple chunks

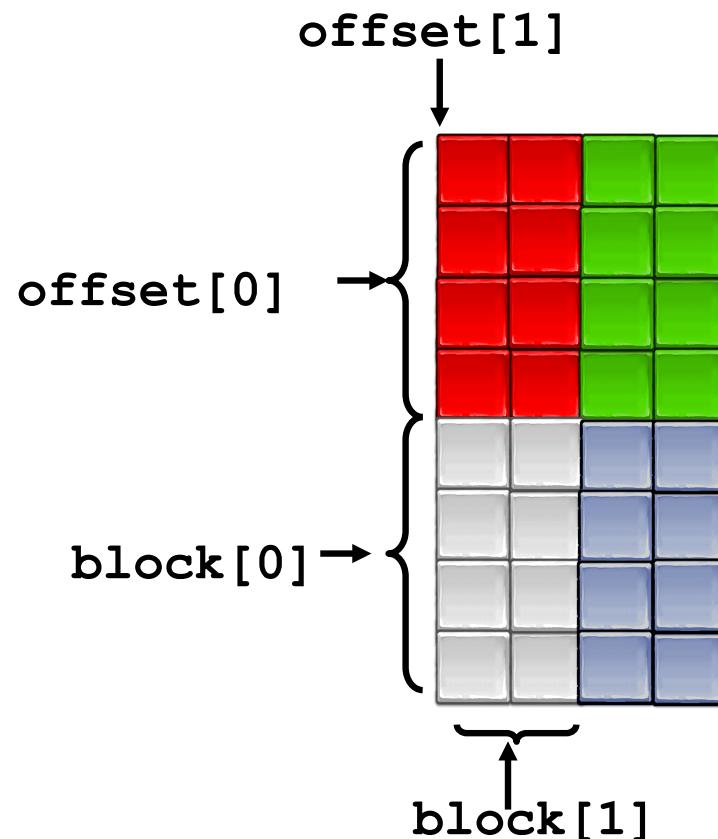
## Process P2

### Memory



```
block[0] = chunk_dims[0];
block[1] = chunk_dims[1];
offset[0] = chunk_dims[0];
offset[1] = 0;
```

### File



# Example 4: Writing by chunks

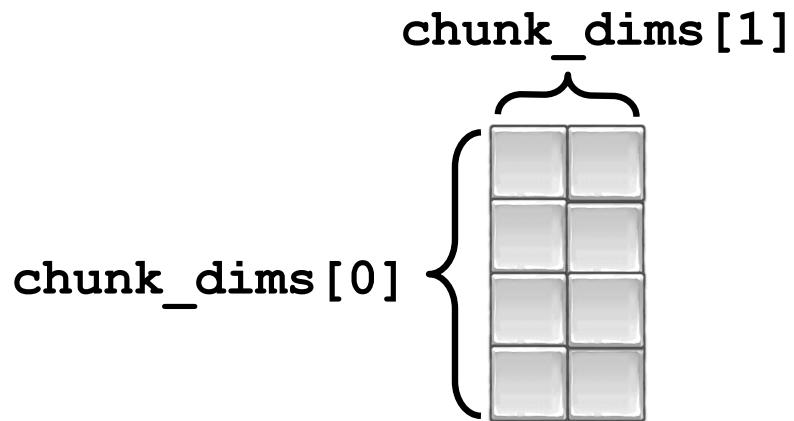
```
97     count[0] = 1;
98     count[1] = 1 ;
99     stride[0] = 1;
100    stride[1] = 1;
101    block[0] = chunk_dims[0];
102    block[1] = chunk_dims[1];
103    if(mpi_rank == 0) {
104        offset[0] = 0;
105        offset[1] = 0;
106    }
107    if(mpi_rank == 1) {
108        offset[0] = 0;
109        offset[1] = chunk_dims[1];
110    }
111    if(mpi_rank == 2) {
112        offset[0] = chunk_dims[0];
113        offset[1] = 0;
114    }
115    if(mpi_rank == 3) {
116        offset[0] = chunk_dims[0];
117        offset[1] = chunk_dims[1];
118    }
```



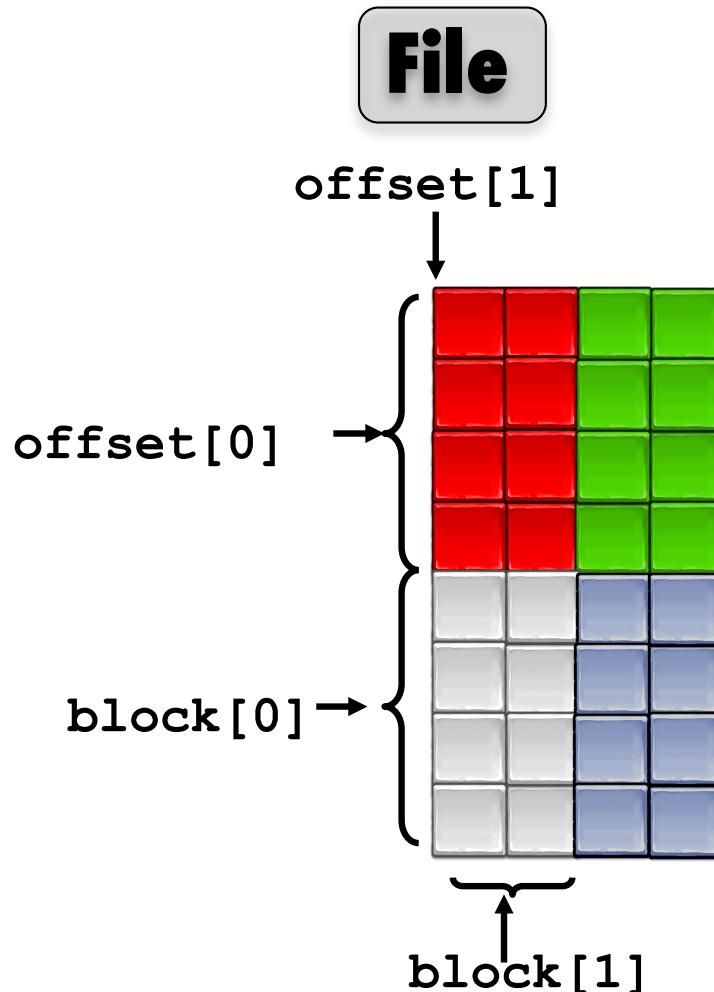
# Writing by Chunks: Output of h5dump

```
HDF5 "SDS_chnk.h5" {
GROUP "/" {
    DATASET "IntArray" {
        DATATYPE H5T_STD_I32BE
        DATASPACE SIMPLE{ ( 8, 4 ) / ( 8, 4 ) }
        DATA {
            1, 1, 2, 2,
            1, 1, 2, 2,
            1, 1, 2, 2,
            1, 1, 2, 2,
            3, 3, 4, 4,
            3, 3, 4, 4,
            3, 3, 4, 4,
            3, 3, 4, 4
        }
    }
}
}
```

## Memory

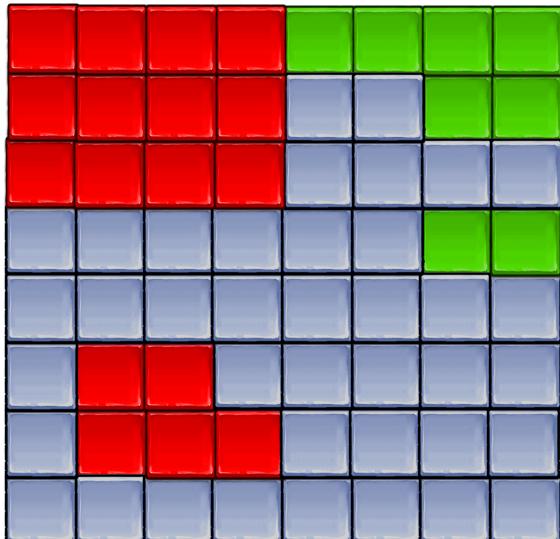
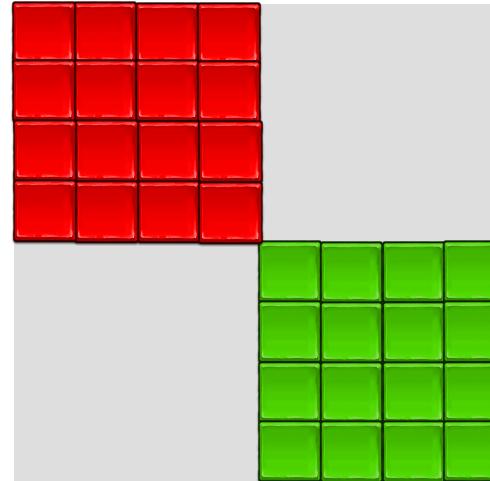
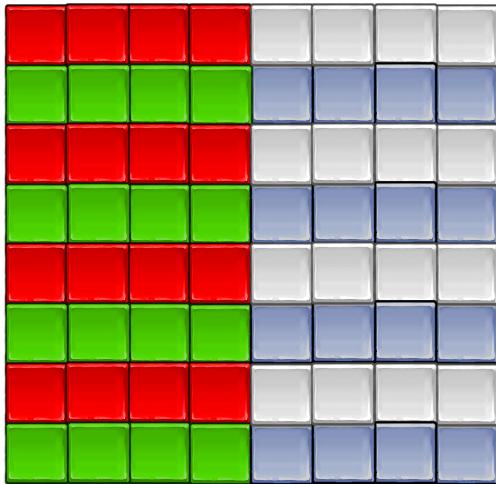


```
block[0] = chunk_dims[0];
block[1] = chunk_dims[1];
offset[0] = chunk_dims[0];
offset[1] = 0;
```



# Complex data patterns

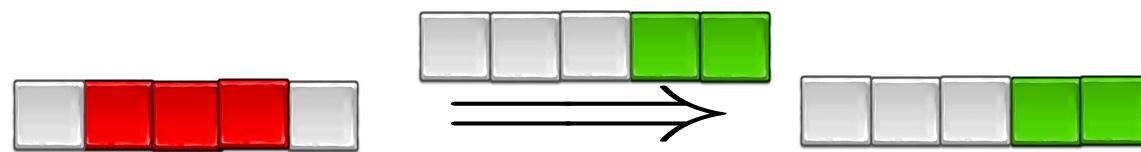
HDF5 doesn't have restrictions on data patterns and balance



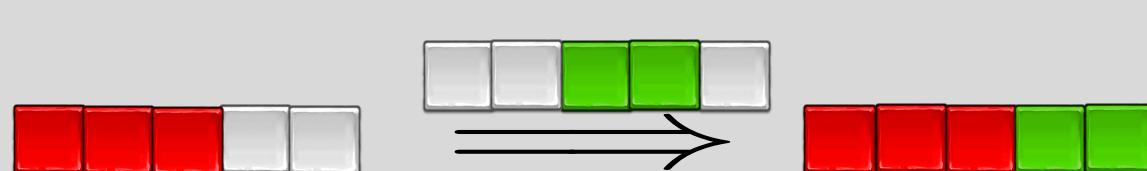
- Irregular hyperslabs created by union operators

`H5Sselect_hyperslab(space_id, op, start, stride, count, block )`

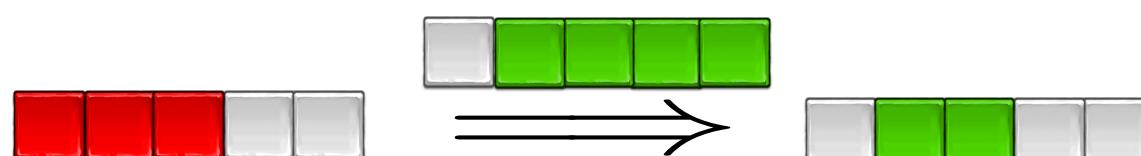
H5S\_SELECT\_SET



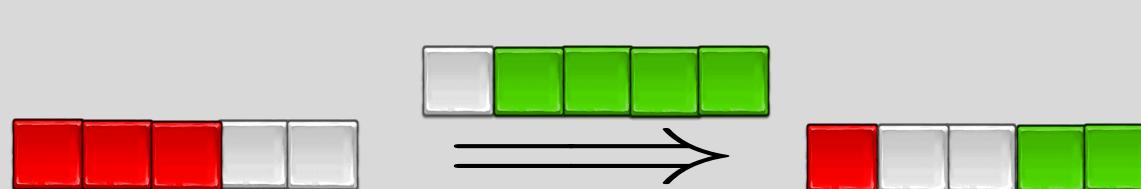
H5S\_SELECT\_OR



H5S\_SELECT\_AND



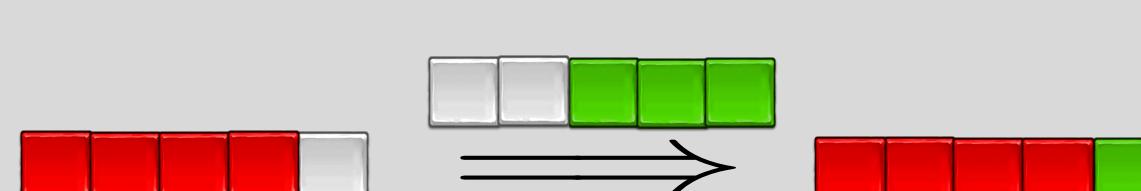
H5S\_SELECT\_XOR



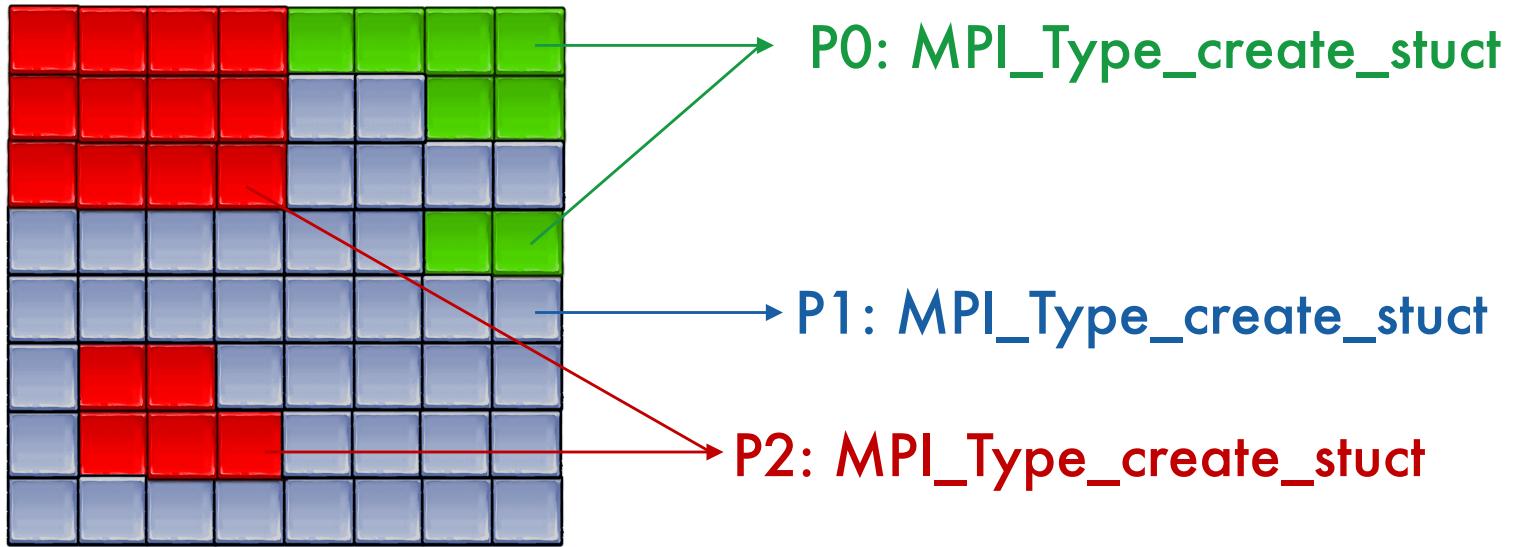
H5S\_SELECT\_NOTB



H5S\_SELECT\_NOTA



# Examples of irregular selection



Internally...

1. The HDF5 library creates an MPI datatype for each lower dimension in the selection
2. It then combines those types into one giant structured MPI datatype



---

# PERFORMANCE ANALYSIS

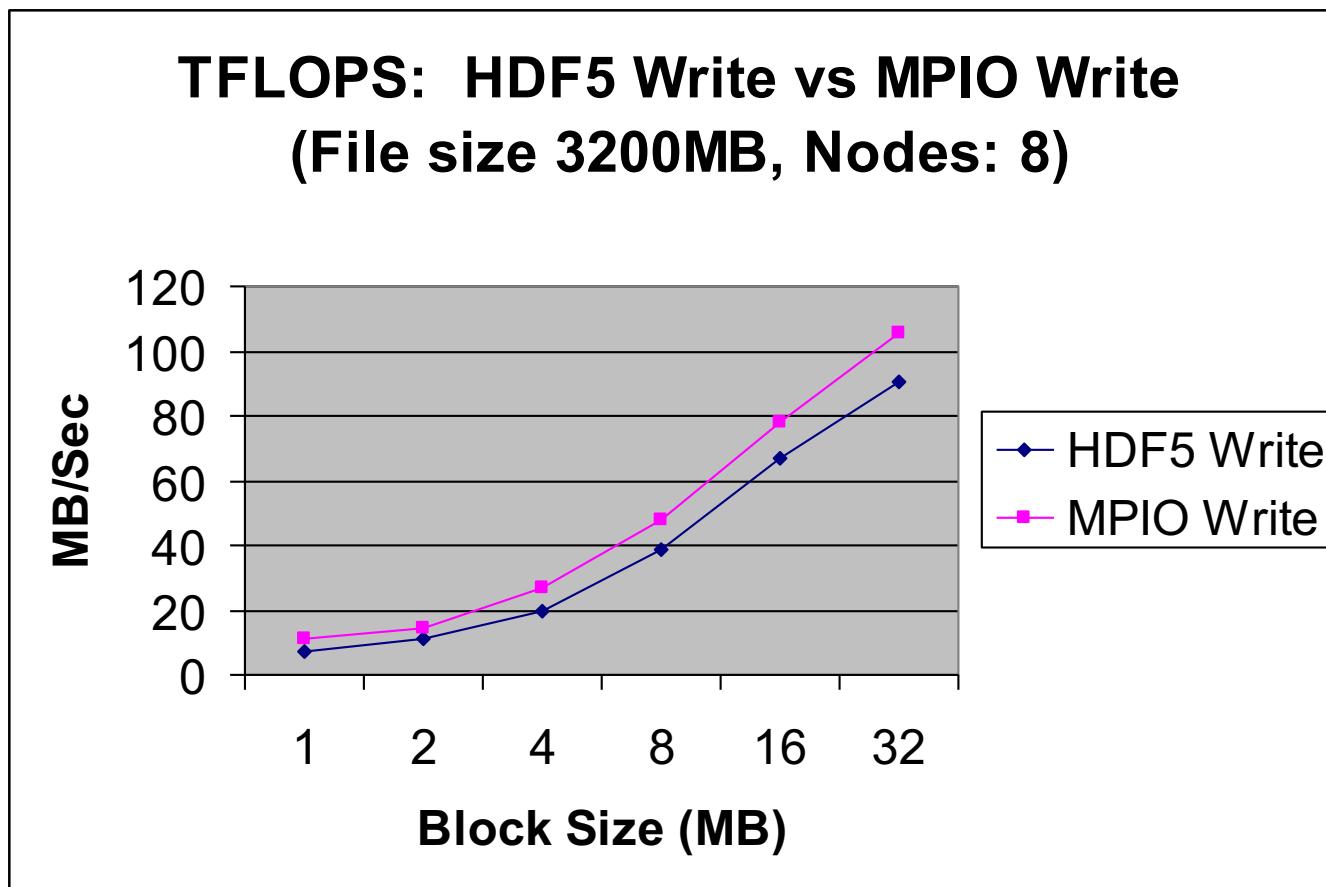


# My HDF5 Application I/O is slow

## Common Solutions to poor performance

- Use larger I/O data sizes
- Independent vs. Collective I/O
- Specific I/O system hints

# Write Speed vs. Block Size



**Tip:** Minimize I/O calls by performing large data I/O



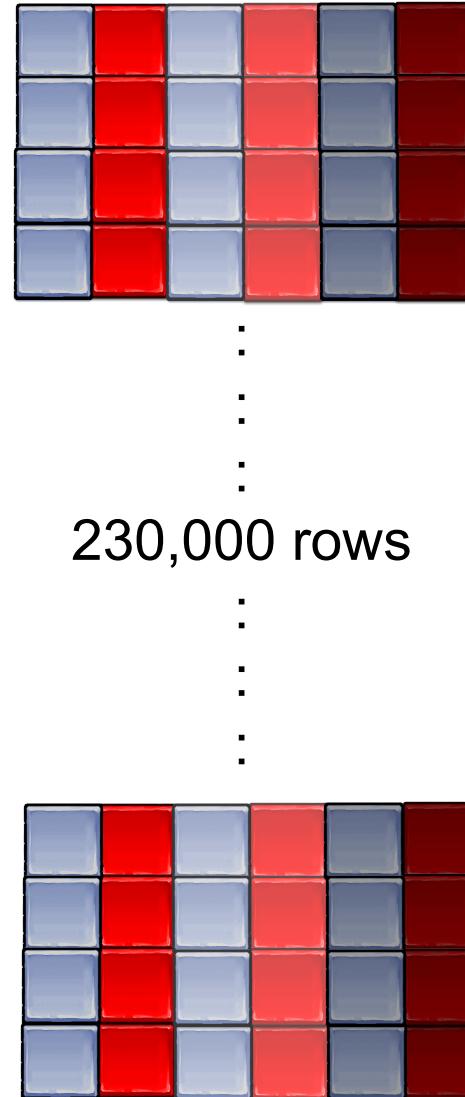
# My PHDF5 Application I/O is slow

---

- Use larger I/O data sizes
- **Independent vs. Collective I/O**
- Specific I/O system hints

## User Report

- Independent data transfer mode is much slower than the Collective data transfer mode
- Data array is tall and thin:  
230,000 rows by 6 columns



- Writing to one dataset
  - Using 4 processes == 4 columns
  - Datatype is 8-byte float (doubles)
  - 4 processes x 1000 rows x 8 bytes = 32,000 bytes

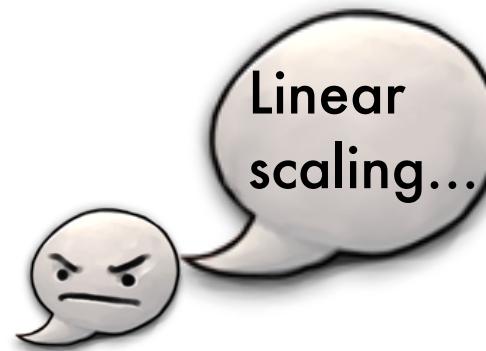
```
> mpirun -np 4 ./a.out 1000
```

- Execution time: 1.783798 s

```
> mpirun -np 4 ./a.out 2000
```

- Execution time: 3.838858 s

- 2 seconds for 1000 more rows = 32,000 bytes.



Speed of 16KB/sec!!! Way too slow.



# Debug slow parallel I/O speed(2)

- Build a version of PHDF5 with

```
 ./configure --enable-build-mode=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`

- To trace

```
 setenv H5FD_mpi_Debug "rw"
```

The report will look something like this...



# Debug slow parallel I/O speed(3)

```
> 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
```

...

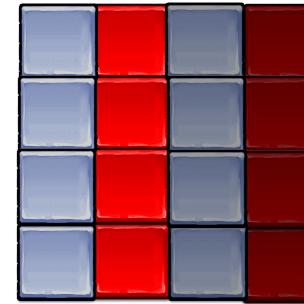
- Total of 4000 of these little 8 bytes writes == **32,000 bytes.**

## Diagnosis

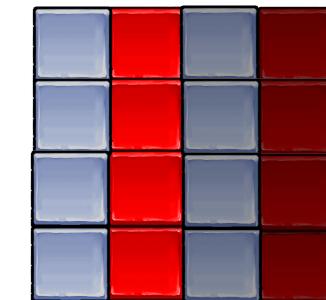
- Each process writes one element of one row, skips to next row, writes one element, and so on...



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

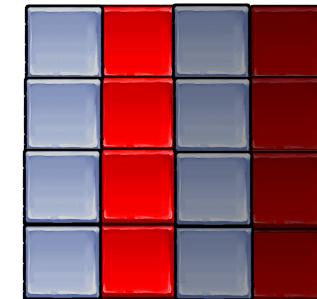


230,000 rows



## Remedy

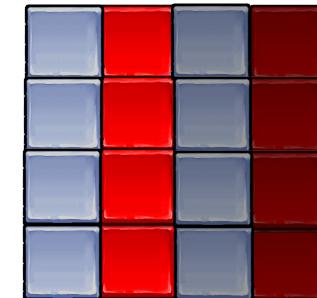
- Collective I/O mode will combine many small independent calls into few but bigger calls
- Chunks of columns speeds up too



⋮

230,000 rows

⋮





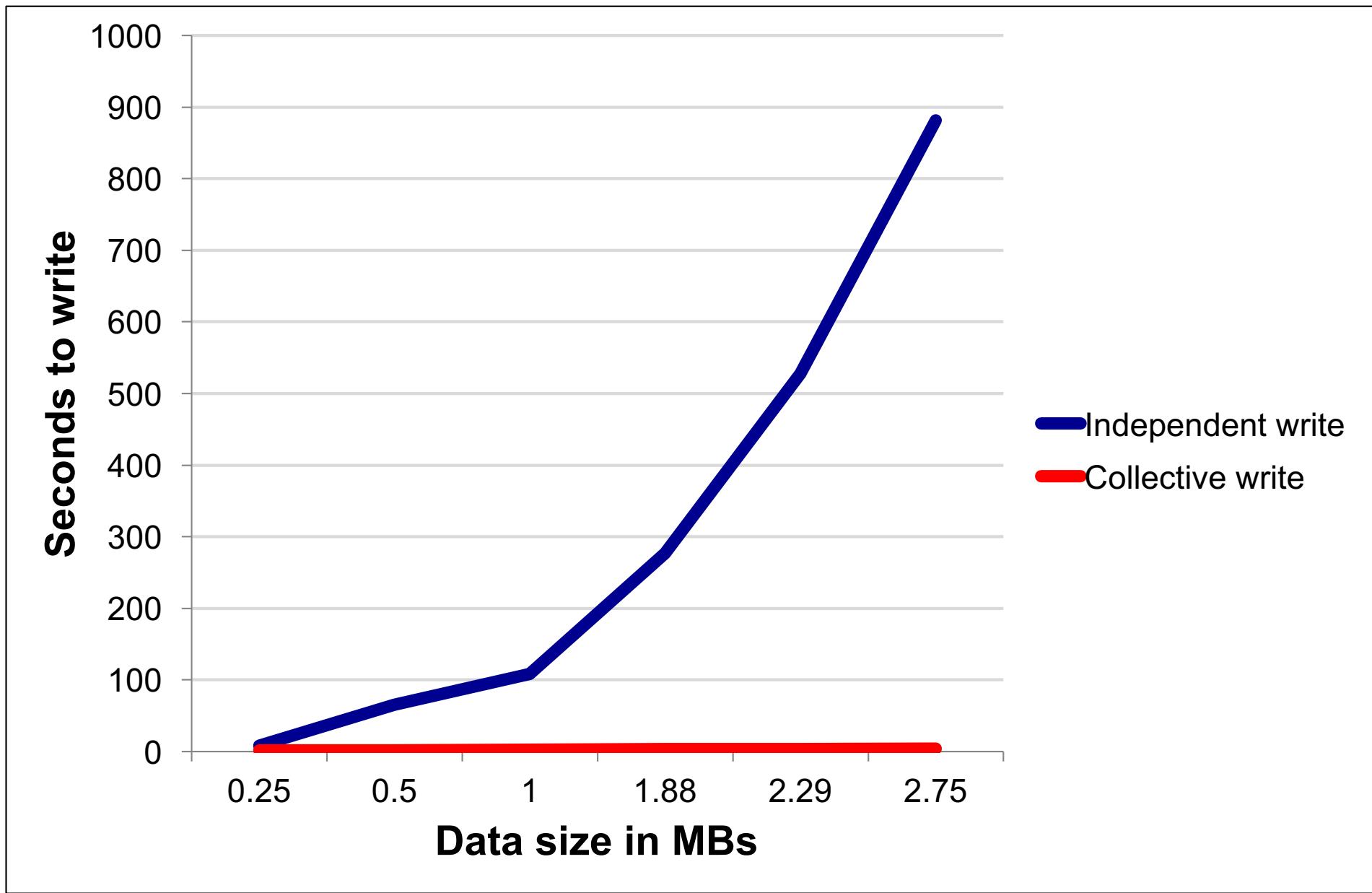
# Debug slow parallel I/O speed (4)

```
> setenv H5FD_mpio_Debug 'rw'  
> mpirun -np 4 ./a.out 1000      # Indep., Chunked by column.  
in H5FD_mpio_write mpi_off=0  
in H5FD_mpio_write mpi_off=0  
in H5FD_mpio_write mpi_off=0  
in H5FD_mpio_write mpi_off=0  
in H5FD_mpio_write mpi_off=3688  
in H5FD_mpio_write mpi_off=11688  
in H5FD_mpio_write mpi_off=27688  
in H5FD_mpio_write mpi_off=19688  
in H5FD_mpio_write mpi_off=96  
in H5FD_mpio_write mpi_off=136  
in H5FD_mpio_write mpi_off=680  
in H5FD_mpio_write mpi_off=800  
...  
size_i=96  
size_i=96  
size_i=96  
size_i=96  
size_i=8000  
size_i=8000  
size_i=8000  
size_i=8000  
size_i=40  
size_i=544  
size_i=120  
size_i=272
```



Execution time: 0.011599 s.





- Set-up using a Data Transfer Property List (DXPL)
- All processes must participate in the I/O call (H5Dread/write) with a selection (**which could be a NULL selection**)
- Some cases where collective I/O is not used even when the user asks for it:
  - Data conversion
  - Compressed Storage
  - Chunking Storage:
    - When the chunk is not selected by a certain number of processes

- Can query Data Transfer Property List (DXPL) after I/O for collective I/O status:
  - *H5Pget\_mpio\_actual\_io\_mode*
    - Retrieves the type of I/O that HDF5 actually performed on the last parallel I/O call
  - *H5Pget\_mpio\_no\_collective\_cause*
    - Retrieves local and global causes that broke collective I/O on the last parallel I/O call
  - *H5Pget\_mpio\_actual\_chunk\_opt\_mode*
    - Retrieves the type of chunk optimization that HDF5 actually performed on the last parallel I/O call. This is not necessarily the type of optimization requested



# Enabling Collective Parallel I/O

```
/* Set up file access property list w/parallel I/O access */
fa plist_id = H5Pcreate(H5P_FILE_ACCESS);
H5Pset_fapl_mpio(fa plist_id, comm, info);

/* Create a new file collectively */
file_id = H5Fcreate(filename, H5F_ACC_TRUNC,
                     H5P_DEFAULT, fa plist_id);

/* <omitted data decomposition for brevity> */

/* Set up data transfer property list w/collective MPI-IO */
dx plist_id = H5Pcreate(H5P_DATASET_XFER);
H5Pset_dxpl_mpio(dx plist_id, H5FD_MPIO_COLLECTIVE);

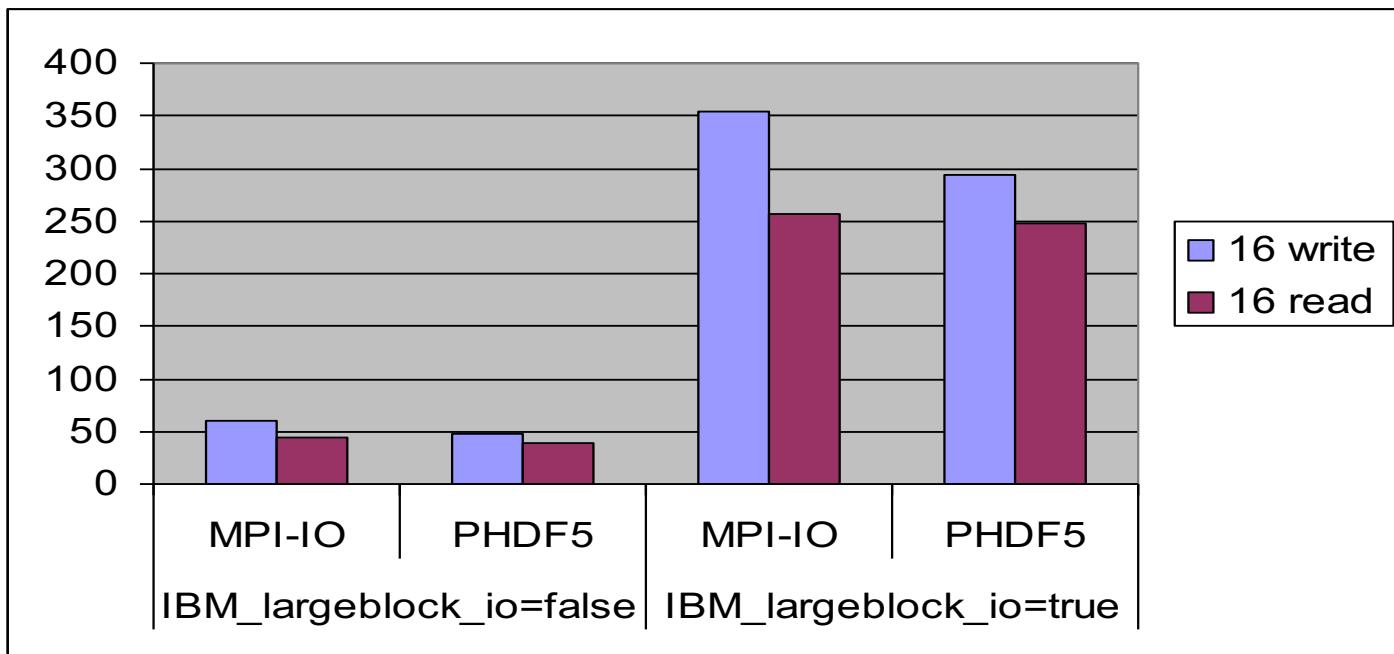
/* Write data elements to the dataset */
status = H5Dwrite(dset_id, H5T_NATIVE_INT,
                  memspace, filespace, dx plist_id, data);
```



# My HDF5 Application I/O is slow

- Use larger I/O data sizes
- Independent vs. Collective I/O
- **Specific I/O system hints**

- GPFS at LLNL ASCI Blue machine
  - 4 nodes, 16 tasks
  - Total data size 1024MB
  - I/O buffer size 1MB

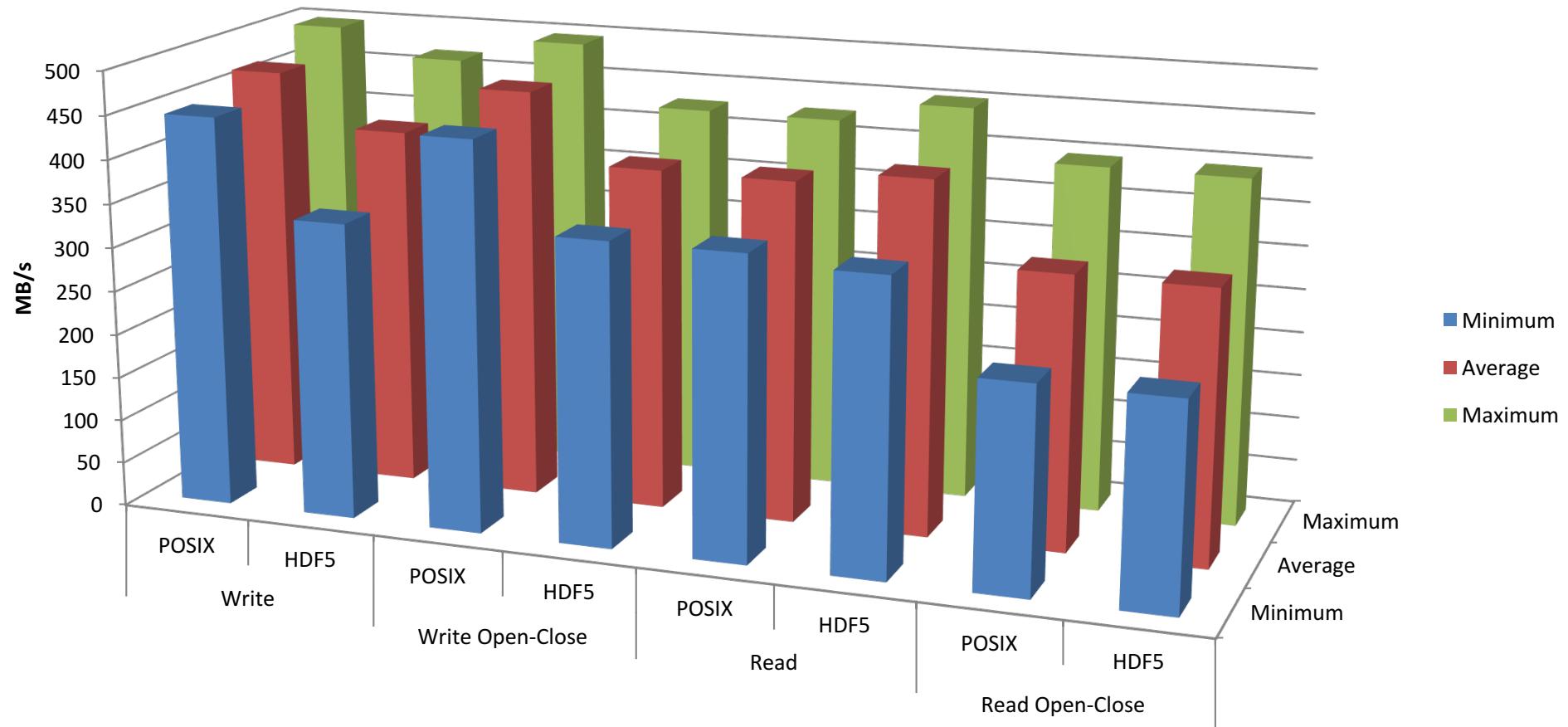


- Two kinds of tools
  - I/O benchmarks for measuring a system's I/O capabilities
  - I/O profilers for characterizing applications' I/O behavior
- Couple of examples
  - H5perf (in the HDF5 source code distro)
  - Darshan (from Argonne National Laboratory)
- Profilers have to compromise between
  - A lot of detail → large trace files and overhead
  - Aggregation → loss of detail, but low overhead

- Measures filesystem performance for different I/O patterns and APIs
- Three File I/O types in one convenient package
  1. POSIX I/O (`open/write/read/close...`)
  2. MPI I/O (`MPI_File_{open,write,read,close}`)
  3. PHDF5
- An indication of I/O speed ranges and HDF5 overhead

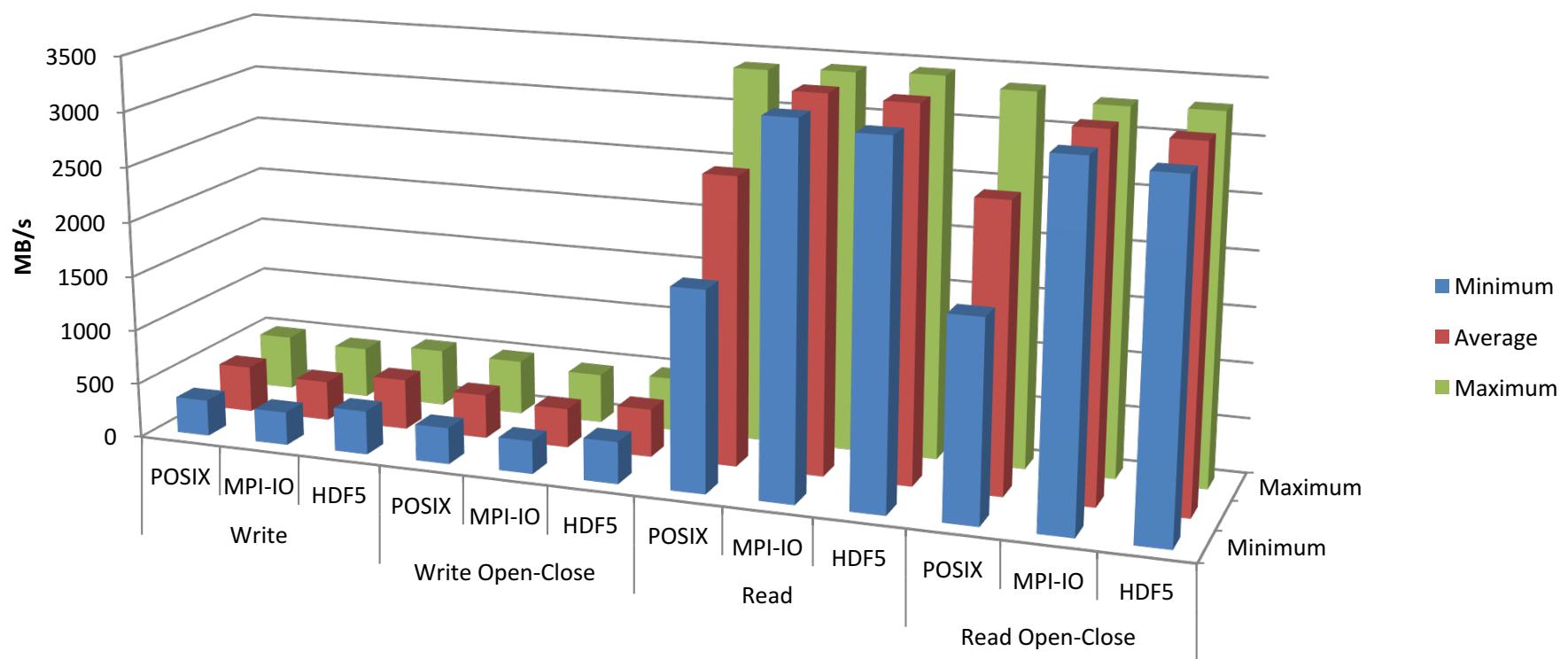
# A Serial Run

**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**





# h5perf: example output 1/3

```
> mpirun -np 4 h5perf      # Ran in a Linux system
Number of processors = 4
Transfer Buffer Size: 131072 bytes, File size: 1.00 MBs
# of files: 1, # of datasets: 1, dataset size: 1.00 MBs
IO API = POSIX
    Write (1 iteration(s)):
        Maximum Throughput: 18.75 MB/s
        Average Throughput: 18.75 MB/s
        Minimum Throughput: 18.75 MB/s
    Write Open-Close (1 iteration(s)):
        Maximum Throughput: 10.79 MB/s
        Average Throughput: 10.79 MB/s
        Minimum Throughput: 10.79 MB/s
    Read (1 iteration(s)):
        Maximum Throughput: 2241.74 MB/s
        Average Throughput: 2241.74 MB/s
        Minimum Throughput: 2241.74 MB/s
    Read Open-Close (1 iteration(s)):
        Maximum Throughput: 756.41 MB/s
        Average Throughput: 756.41 MB/s
        Minimum Throughput: 756.41 MB/s
```



# h5perf: example output 2/3

```
> mpiexec -np 4 h5perf
```

...

IO API = MPIO

Write (1 iteration(s)):

    Maximum Throughput: 611.95 MB/s

    Average Throughput: 611.95 MB/s

    Minimum Throughput: 611.95 MB/s

Write Open-Close (1 iteration(s)):

    Maximum Throughput: 16.89 MB/s

    Average Throughput: 16.89 MB/s

    Minimum Throughput: 16.89 MB/s

Read (1 iteration(s)):

    Maximum Throughput: 421.75 MB/s

    Average Throughput: 421.75 MB/s

    Minimum Throughput: 421.75 MB/s

Read Open-Close (1 iteration(s)):

    Maximum Throughput: 109.22 MB/s

    Average Throughput: 109.22 MB/s

    Minimum Throughput: 109.22 MB/s



# h5perf: example output 3/3

```
> mpirun -np 4 h5perf
```

...

IO API = PHDF5 (w/MPI-I/O driver)

Write (1 iteration(s)):

    Maximum Throughput: 304.40 MB/s

    Average Throughput: 304.40 MB/s

    Minimum Throughput: 304.40 MB/s

Write Open-Close (1 iteration(s)):

    Maximum Throughput: 15.14 MB/s

    Average Throughput: 15.14 MB/s

    Minimum Throughput: 15.14 MB/s

Read (1 iteration(s)):

    Maximum Throughput: 1718.27 MB/s

    Average Throughput: 1718.27 MB/s

    Minimum Throughput: 1718.27 MB/s

Read Open-Close (1 iteration(s)):

    Maximum Throughput: 78.06 MB/s

    Average Throughput: 78.06 MB/s

    Minimum Throughput: 78.06 MB/s

Transfer Buffer Size: 262144 bytes, File size: 1.00 MBs

# of files: 1, # of datasets: 1, dataset size: 1.00 MBs

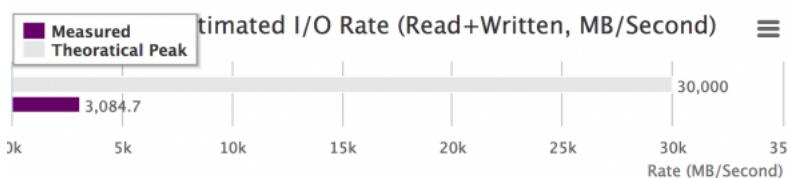
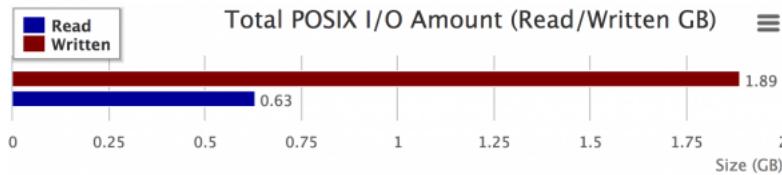


# Darshan (ANL)

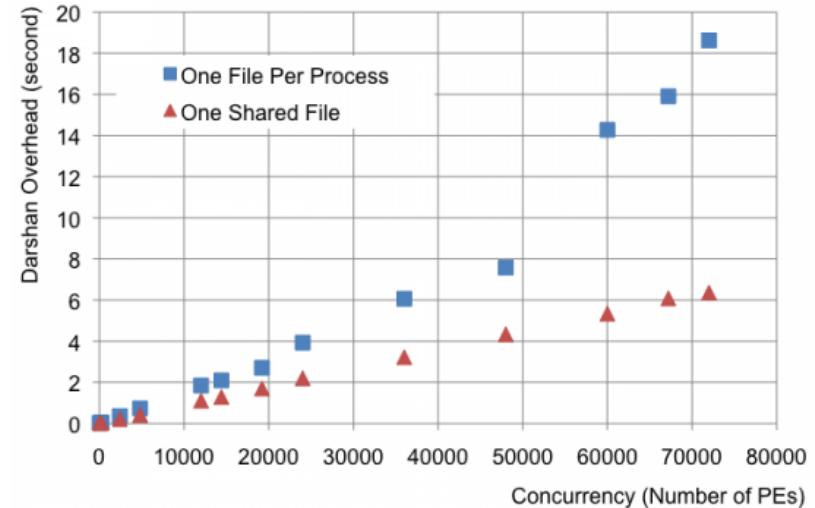
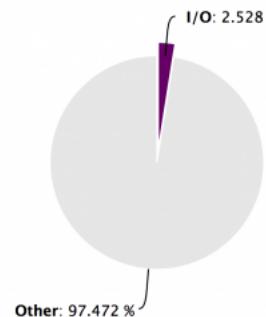
---

- 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, sequentially, 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

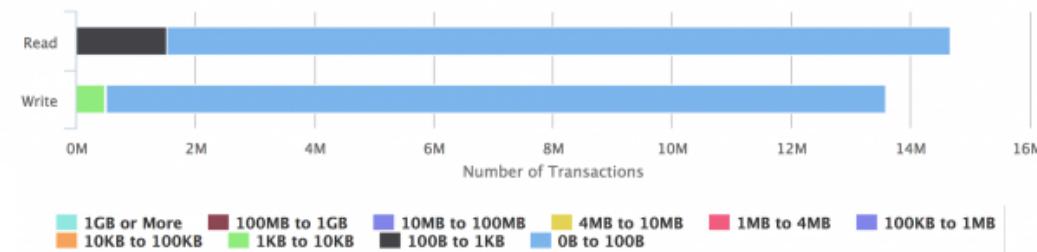
# Darshan Sample Output



Percentage time spent on I/O

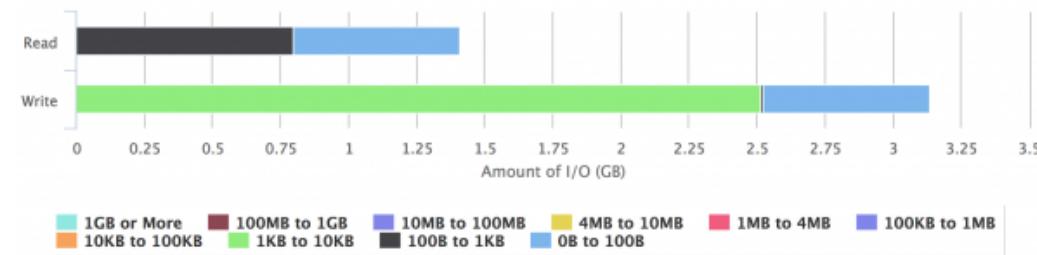


Number of Transaction in Each Size Range



Highcharts.com

Amount Written with Different Transaction Sizes



Source: [NERSC](#)



# Lastly, Don't reinvent the wheel...

- Make use of libraries which utilize HDF, but represent the scientific data using a set of conventions, i.e., standard way for
  - Representing meshes
  - Variable definitions
  - Multiple datasets
  - Component definitions
- Some high-level parallel formats by field using HDF
  - Computation Fluid Dynamics: CGNS
  - Meshless/Particle Methods: H5Part
  - Finite element method: MOAB
  - Earth science: NetCDF
- Hides the complexity of PHDF5, but still must know concepts of parallel I/O and the underlying file systems



Examples

**CGNS**

**Reference:**

Parallel and Large-scale Simulation Enhancements to CGNS, By Scot Breitenfeld, The HDF Group, 2015.



# CFD Standard

- CGNS = Computational Fluid Dynamics (CFD) General Notation System
- An effort to standardize CFD input and output data including:
  - Grid (both structured and unstructured), flow solution
  - Connectivity, boundary conditions, auxiliary information.
- Two parts:
  - A standard format for recording the data
  - Software that reads, writes, and modifies data in that format.
- An American Institute of Aeronautics and Astronautics Recommended Practice





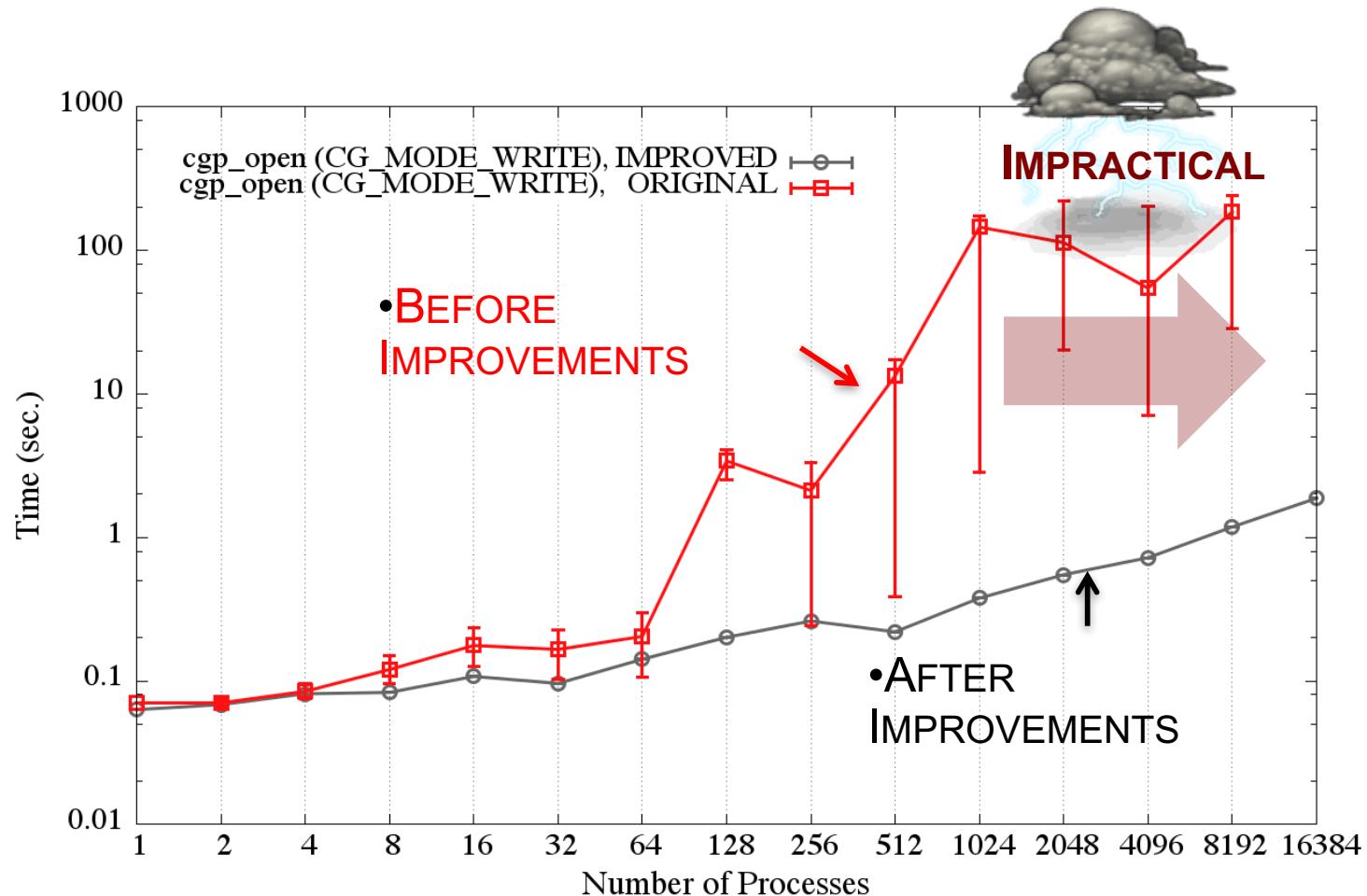
# CGNS Storage Evolution

- CGNS data was originally stored in ADF ('Advanced Data Format')
  - ADF lacks parallel I/O or data compression capabilities
  - Doesn't have HDF5's support base and tools
- HDF5 superseded ADF as the official storage mechanism for CGNS
- CGNS introduced parallel I/O APIs w/ parallel HDF5 in 2013
  - However, poor performance of the new parallel APIs in most circumstances
  - In 2014, NASA provided funding for The HDF Group with the goal to improve the under-performing parallel capabilities of the CGNS library

- Opening an existing file
  - CGNS reads the entire HDF5 file structure, loading a lot of (HDF5) metadata
  - Reads occur independently on ALL ranks competing for the same metadata  
→ Termed “Read Storm”
- Closing a CGNS file
  - Triggers HDF5 flush of a large amount of small metadata entries
  - Implemented as iterative, independent writes, an unsuitable workload for parallel file systems



# Opening CGNS File ...





# 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 not required to be collective:

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



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



- 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.

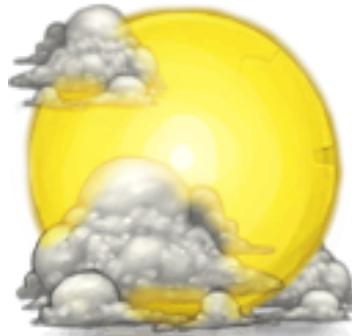
All processes...

- 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.



# Avoiding a Read Storm

- Application sets hint that metadata access is done collectively
  - A property on an access property list
  - 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
- If set, MPI rank 0 will issue the read for a metadata entry to the file system and broadcast to all other ranks

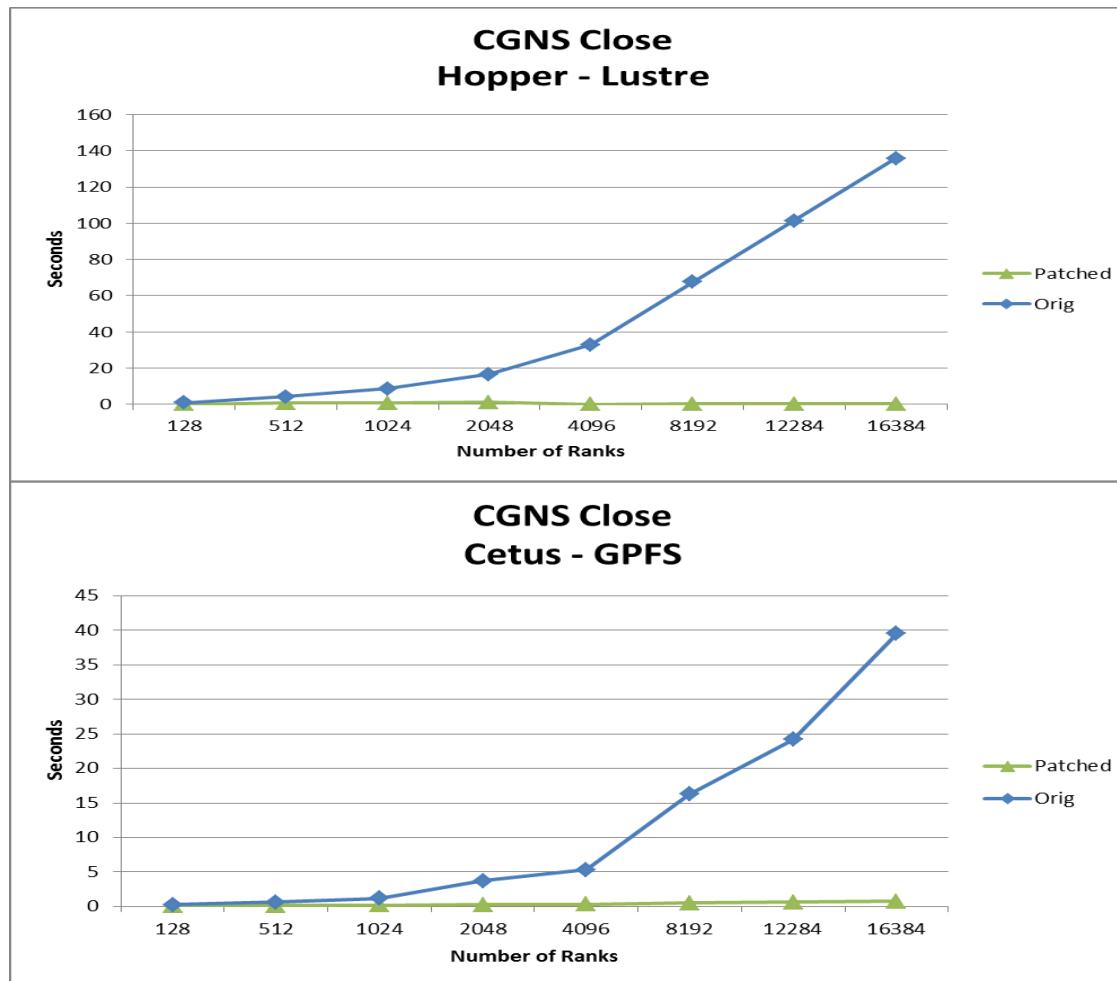




# Write Metadata Collectively!

- **Symptoms:** Many users reported that `H5Fclose()` is very slow and doesn't scale well on parallel file systems.
- **Diagnosis:** HDF5 metadata cache issues very small accesses (one write per entry). We know that parallel file systems don't do well with small I/O accesses.
- **Solution:** Gather up all the entries of an epoch, create an MPI derived datatype, and issue a single collective MPI write.

# Closing a CGNS File ...





# Useful parallel HDF5 links

- Parallel HDF information site  
<http://www.hdfgroup.org/HDF5/PHDF5/>
- Parallel HDF5 tutorial available at  
<http://www.hdfgroup.org/HDF5/Tutor/>
- HDF Help email address  
help@hdfgroup.org



# Questions?

## Acknowledgements

Support: Lawrence Berkeley Nation Lab – SCIDAC

Graphics: Buuf, CC BY-NC-SA 2.5