I/O Profiling



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I/O Stack: Moving Data To Disk

Productivity Interface is a thin layer on top of existing high performance I/O libraries, for productive big data analytics

Python, Spark, TensorFlow

High Level I/O Libraries map application abstractions onto storage abstractions and provide data portability.

HDF5, Parallel netCDF, ADIOS

Parallel file systems maintain a logical file model and provide efficient access to data.

Lustre, GPFS, PVFS, PanFS

Application

pd.read_csv("/pscratch/.../data.csv")

Productivity Interface

High-Level I/O Library

I/O Middleware

I/O Forwarding

Parallel File System

I/O Hardware

Scratch: /pscratch/sd/y/youruser CFS: /global/cfs/cdirs/yourprj Home: /global/homes/y/youruser I/O Middleware organizes accesses from many processes, especially those using collective I/O.

MPI-IO, GLEAN, PLFS

I/O Forwarding transforms I/O from many clients into fewer, larger requests; reduces lock contention; and bridges between the HPC system and external storage.

Cray DVS, IBM CIOD, IOFSL







I/O Pattern Analysis

How to describe your I/O

- Number of Processes
- Number of Files
- Size per file
- Frequency of I/O
- Size per I/O
- Read, Write, Metadata?
- Shared File or not
- I/O Libraries
- Contiguous (Sequential) vs Non-contiguous
 (Random) access pattern
- Data alignment



Contiguous I/O

Read time: 0.1ms



Noncontiguous I/O

- Seek time: 4ms
- Rotation time: 3ms
- Read time: 0.1 ms
- Total time = 7.1ms



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I/O Profiling: Darshan

- Darshan
 - Lightweight HDF5/MPI-IO/POSIX I/O profiling tool, developed by ANL
 - https://www.mcs.anl.gov/research/projects/darshan/
 - Loaded by default at NERSC: currently version 3.4.0
 - <u>https://docs.nersc.gov/tools/performance/darshan/</u>

module av -S darshan

darshan/3.4.0 (D) darshan/3.3.1 darshan/3.4.0-hdf5 darshan/3.3.1-hdf5





I/O Profiling: support for HDF5 et al.

- Darshan is available at NERSC with and without HDF5 support
- Darshan with HDF5 support
 - Makes all execs load HDF5 (latest cray-hdf5-parallel)
 - Dependency problems if you're using an old HDF5 (<1.10)
 - .. or when using different MPI libraries than Cray-MPI/MVAPICH
- You can build your own Darshan, see instructions in the docs <u>https://docs.nersc.gov/tools/performance/darshan/#hdf5-aware-darshan-build</u>
- parallel NetCDF profiling is also supported by Darshan, enable it at configure





I/O Profiling: Darshan

- Darshan log files produced at the end of <u>successful</u> executions of applications
 - All I/O calls are recorded, no sampling
 - I/O calls can spread several "layers"
 - i.e. NetCDF \rightarrow HDF5 \rightarrow MPI-IO \rightarrow POSIX \rightarrow Lustre (if I/O on scratch)
 - Log files can get very large depending on the number of process, I/O patterns used, etc





I/O Profiling: Darshan

- Darshan is a "post mortem" tool, no live profiling/debugging
 - Applications need to have darshan injected <u>at compile time</u> or manually loaded <u>at runtime</u> to profile I/O
- Cray Compiler wrappers (cc, CC, ftn) at NERSC inject Darshan into final exec
 - <u>https://docs.nersc.gov/tools/performance/compilers/wrappers</u>

```
$ cat hello.c; cc hello.c
int main() { return 0; }
```

\$ ldd a.out |grep darshan libdarshan.so => /path/.../lib/libdarshan.so





I/O Profiling: Darshan non-MPI

- <u>Only</u> MPI applications will trigger the tracing mechanism
 - Darshan overwrites MPI_Init and MPI_Finalize
 - Only applications that call MPI_Finalize will produce a darshan log file
 - For non-MPI applications, manually enable darshan with:

```
DARSHAN_ENABLE_NONMPI=1 \
LD_PRELOAD="$DARSHAN_BASE_DIR/lib/libdarshan.so" \
    your_application.py
```

 Warning: <u>do not</u> export darshan in LD_PRELOAD or you'll trace any application, including 1s

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- Impacts yours and other users' applications
- MPI error with non-MPI exec? Build your own Darshan --without-mpi







I/O Profiling: Darshan log files

- Darshan log files
 - o /global/cscratch1/sd/darshanlogs/<year>/<month>/<day>/
 - o /pscratch/darshanlogs/<year>/<month>/<day>/
 - More than 1000 logs/day (more expected when Perlmutter system in production)
- Filename format:

<username>_<jobname>_<jobid>_<time>_<date>-<uniqueid>-<timing>.darshan
elvis_vasp_id31418_231851_9-20-57716-76722841398621341237.darshan





I/O Profiling: parsing Darshan logs

- Darshan scripts available at NERSC with any darshan module
 - darshan-parser /input_file.darshan
 - Parse content of Darshan log file and output text
 - Can be very verbose
 - module load texlive darshan-job-summary.pl \ /input_file.darshan
 - Create a PDF report with useful I/O plots
 - More advanced plotting and analysis tools with DXT Explorer and Drishti







I/O Profiling: PyDarshan

- PyDarshan, new tool with Darshan 3.4.0
 - o <u>https://www.mcs.anl.gov/research/projects/darshan/docs/pydarshan/</u>
 - \$ pip install darshan
 - \$ python

>>> report = darshan.DarshanReport('example.darshan')

- >>> report.records['STDI0'].to_df()
- Version must match library available in LD_LIBRARY_PATH
- Useful to process/analyze log files programmatically or build API interface
- May segfault w/ Darshan <3.4.0 log files
 - Run darshan-convert /example.darshan{,.converted}







