#### **Replicating HPC I/O Workloads With Proxy Applications**



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#### Motivation

- I/O investigation goals?
  - Benchmarking systems
  - Tuning application behaviour
  - Tuning software stack
  - Changing paradigm
  - Changing hardware technology

#### Motivation

- Working with a mini application or proxy is less cumbersome and more streamlined, not to mention more portable
- Developing and maintaining a representative proxy for every application is time consuming and probably redundant
- Ideally we would like to experiment while minimising time spent making code changes and writing new implementations

#### Outline

Background: Proxy app and I/O library

- Replication Components
- Case Study
- Conclusion

## Background: MACSio

- "Multi-purpose Application-Centric, Scalable I/O Proxy Application"
- Two key characteristics:
  - Level of Abstraction: POSIX, MPI-IO, SILO, HDF5 and beyond...
  - Degree of Flexibility: dump type, dataset composition, user defined data objects
- Multi-purpose achieved through plugin based design, if you have a library or interface to work with, write a plugin!

#### **Background: TyphonIO**



# Background: TyphonIO

- Overlays a hierarchical data model on the parallel I/O interface
- Designed to use HDF5 in a consistent way that can be optimised for the data model, e.g. efficient use of chunking in the mesh structure



### **Replication: Profiling**

- Darshan I/O characterisation chosen for lightweight profiling
- Instrumentation overhead indistinguishable from machine noise in our experiments
- Profiling produces counters for POSIX, MPI-IO, HDF5

Runtime (seconds)	1 Node	64 Nodes
Uninstrumented	309.25	352.33
Instrumented	307.43	352.29

#### **Replication: Parameter Generation**



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Filesize =

Processors (PartSize (  $\alpha$  Variables +  $\beta$  ) + $\gamma$  Variables +  $\delta$  ) +  $\psi$  Variables +  $\eta$ 

- MACSio currently weak scales, so increasing processor count increases the file size linearly
- Similarly, part size and dataset variable count give a linear increase in total bytes written
- Combining the linear equations gives the equation above to calculate a good estimate for the resultant file size based on dataset composition
- Constants α, β, γ, δ, ψ, η are derived experimentally from a dataset composition scaling study

#### **Replication: Parameter Generation**

bookleaf\_1536\_3880532.darshan.gz.yaml ×

– CHARACTERISTICS: ACCESS MODE: w MPIIO OPEN TIME: 133.3700639999999 MPIIO READ TIME: 0.0 MPIIO\_WRITE\_TIME: 58.72207 POSIX OPEN TIME: 133.36487499999998 POSIX\_READ\_TIME: 0.0 POSIX WRITE TIME: 133.302945 FILE: initial\_dump.h5 MPI COUNTERS: MPIIO ACCESS1 ACCESS: '10672' MPIIO\_ACCESS1\_COUNT: '1280' MPIIO ACCESS2 ACCESS: '10080' MPIIO ACCESS2 COUNT: '1280' MPIIO ACCESS3 ACCESS: '5336' MPIIO ACCESS3 COUNT: '2302' MPIIO ACCESS4 ACCESS: '5152' MPIIO ACCESS4 COUNT: '612' MPIIO BYTES READ: '0' MPIIO BYTES WRITTEN: '133534106' MPIIO COLL OPENS: '1536' MPIIO\_COLL\_READS: '0' MPIIO COLL WRITES: '0' MPIIO\_FASTEST\_RANK: '1450' MPIIO FASTEST RANK BYTES: '63720' MPIIO F CLOSE TIMESTAMP: '186.644951'

- Extracting counters such as BYTES\_WRITTEN, NUM\_PROCS, COLL\_WRITES, [OPEN/ CLOSE]\_TIMESTAMP is enough to generate an input to MACSio for a similar dataset composition and I/O pattern
- In particular, using timestamps to distribute load across the simulation runtime is important to give an accurate representation of typical 'bursty' I/O hotspots spread out across runtime

# Case Study: Bookleaf



- 2D unstructured Lagrangian hydrodynamics application
- Fixed checkpoint scheme: two per simulation
- The input deck used solves the Noh verification problem for ideal gases
- I/O is handled by TyphonIO

#### **Experimental Setup**

- ARCHER
  - 4920 node CRAY XC30
  - Two 12-core Ivy Bridge processors per node (118,080 cores total)
  - Three Lustre filesystems:
    - 12 OSSs
    - 4 OSTs/OSS
    - 10 4TB Discs/OST (RAID6)
    - 1 MDS + 1 MDT with 14 600GB discs (RAID1+0)
    - 10 LNet Router nodes with overlapping routing paths





#### **Experimental Setup: Input Parameters**

- Part size represents the volume of data written from each rank
- Wait time is a basic time buffer between consecutive file accesses

Nodes	Part Size (Bytes)	Wait Time (s)
1	404320	266
2	202205	120
4	101148	53
8	50619	22
16	25355	11
32	12723	7
64	6407	5

#### **File Access Pattern**

- File access times are offset by the initial setup in Bookleaf
- Accounting for this overhead is not necessary to accurately represent the I/O pattern so we don't factor it in, but this could easily be introduced



### **Results: I/O Time**

Absolute I/O Time



#### Cumulative I/O Time across all ranks



# **Results: I/O Time**

- Total, cumulative and slowest individual I/O time remain consistent for the original and replicated runs
- Looking at a wider range of Darshan counters, access sizes and frequencies are also consistent

#### Slowest Individual MPIIO Operation



#### **Results: Testing Independent vs Collective I/O with MACSio**

- Using the MACSio replication, a parameter tweak can be used to manipulate I/O library behaviour
- The switch to use collective buffering has a very predictable effect, reducing the number of small write operations and lowering the overall I/O time



#### Conclusion

- We use a proxy application and high level library to mimic an I/O pattern based off as lightweight profiling as possible
- I/O characterisation and a small amount of application familiarity is enough to produce a proxy that is workable
- Once a parameter set has been identified, we can chop and change strategy, library and platform with a reasonable amount of simplicity

#### **Next Steps**

- More irregular I/O patterns from range of applications
- Exercise different parallel interfaces
- Multiple concurrent workloads

# Acknowledgements

UK Atomic Weapons
Establishment Technical
Outreach Programme



UK Engineering and Physical Sciences Research Council





#### Thank You Any Questions?

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