

# High-Performance Computing Storage System Challenges for Theoreticians

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Laboratory Directed Research & Development

# Outline/Intro

- Caveat: I'm not a filesystems person
- This talk is about challenges I've learned about by discussions with Sandia experts
- I'll conclude with some motivations for data structures research



Laboratory Directed Research & Development

- **Scientific Computing HPC Applications**

- Primary motivation: modeling and simulation
- Style of computing: Single Program/Multiple Data (SPMD)
- Programming model: C/C++/Message Passing Interface (MPI)
- Primary emphasis: Network, Compute nodes
- Storage: Parallel Distributed Filesystems
- Storage challenge: ***Checkpoint/restart***

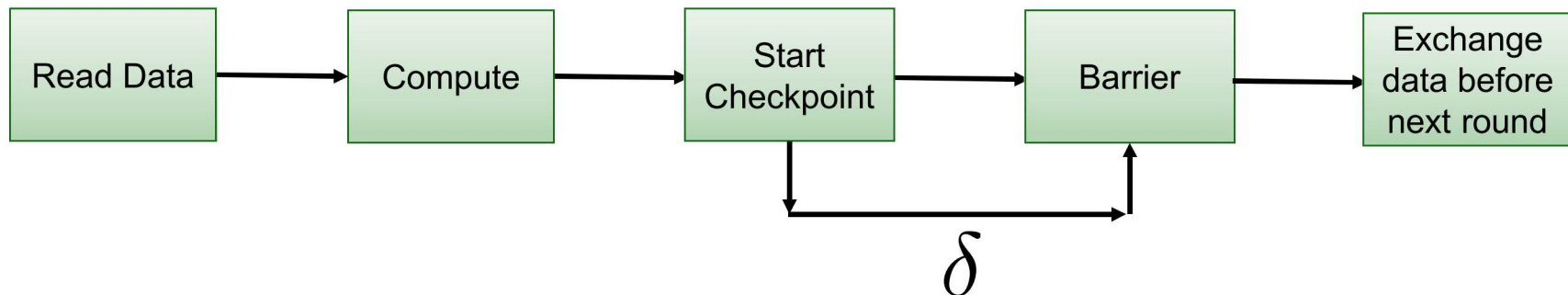
- **Data Analysis Applications**

- Primary motivation: graph algorithms, machine learning, etc.
- Style of computing: shared-memory
- Programming model: (e.g. PGAS)
- Storage challenge: ***Stream and load the data***

- ***Caveat: Vendor emphasis is not HPC (think: Gaming!)***

# I/O Challenges: Scientific Computing

- Warning: decades of HPC I/O literature out there
- Checkpoint/restart:** the once and future problem



- All processes tend to slam the filesystem at the same time.
- Challenge:  $\delta \rightarrow 0$
- Interesting result from Loncaric (Los Alamos N.L.):

$$\frac{\text{JMMTI}}{\delta} \geq 200 \text{ is a good regime} \quad (\text{"Job Mean Time To Interrupt"})$$



# I/O Challenges: Scientific Computing

- ***Launch***: another pain point
  - “copying the binaries can take 12 minutes (1500 nodes); we want 0s” - Lee Ward (Sandia National Labs)
  - But this might be a vendor problem rather than a systems/algorithms problem
- ***Typical I/O-relevant acceptance tests (there are many)***
  - “***clobber-create***” : create new files with unique fnames
  - “***IOR (Interleaved or Random)***” : random access
  - “***Bonnie++***” : file system benchmarking tool for measuring I/O performance
- ***How to have more impact in HPC (e.g.)***
  - ***Lustre*** (parallel & distributed filesystem) is open-source. BetrFS-style write-optimization ideas in Lustre would have much more HPC impact here than stand-alone

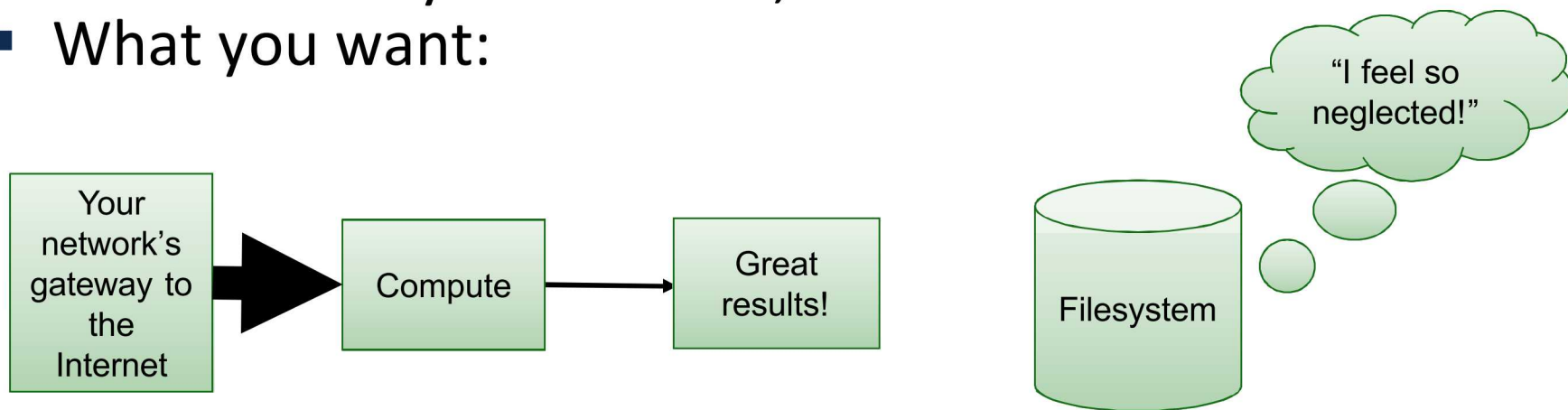
# HPC Filesystems: Lab Expert POC's



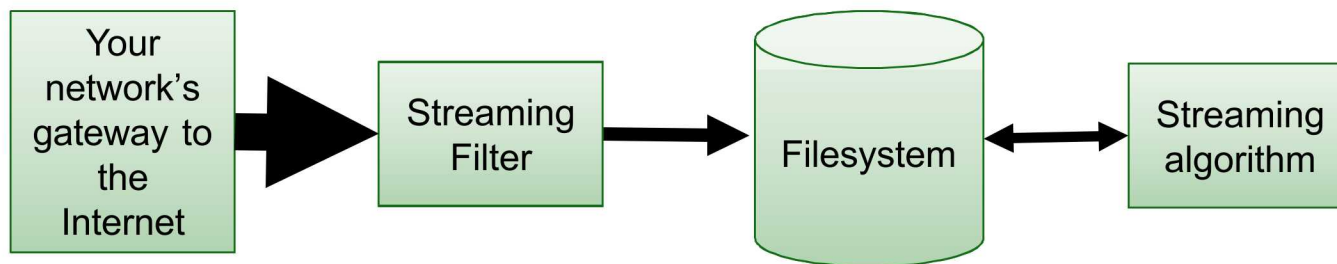
- Matthew Curry (Sandia National Labs)
- Robin Goldstone (Lawrence Livermore National Labs)
- Gary Gryder (Los Alamos National Labs)
- Glenn Lockwood (Lawrence Berkeley National Labs)
- Jay Lofstead (Sandia National Labs)
- Robert Ross (Argonne National Labs)
- Brad Settlmeyer (Los Alamos National Labs)
- Lee Ward (Sandia National Labs)

# I/O Challenges: HPC Data Analysis

- Motivation: cyber streams, etc.
- What you want:

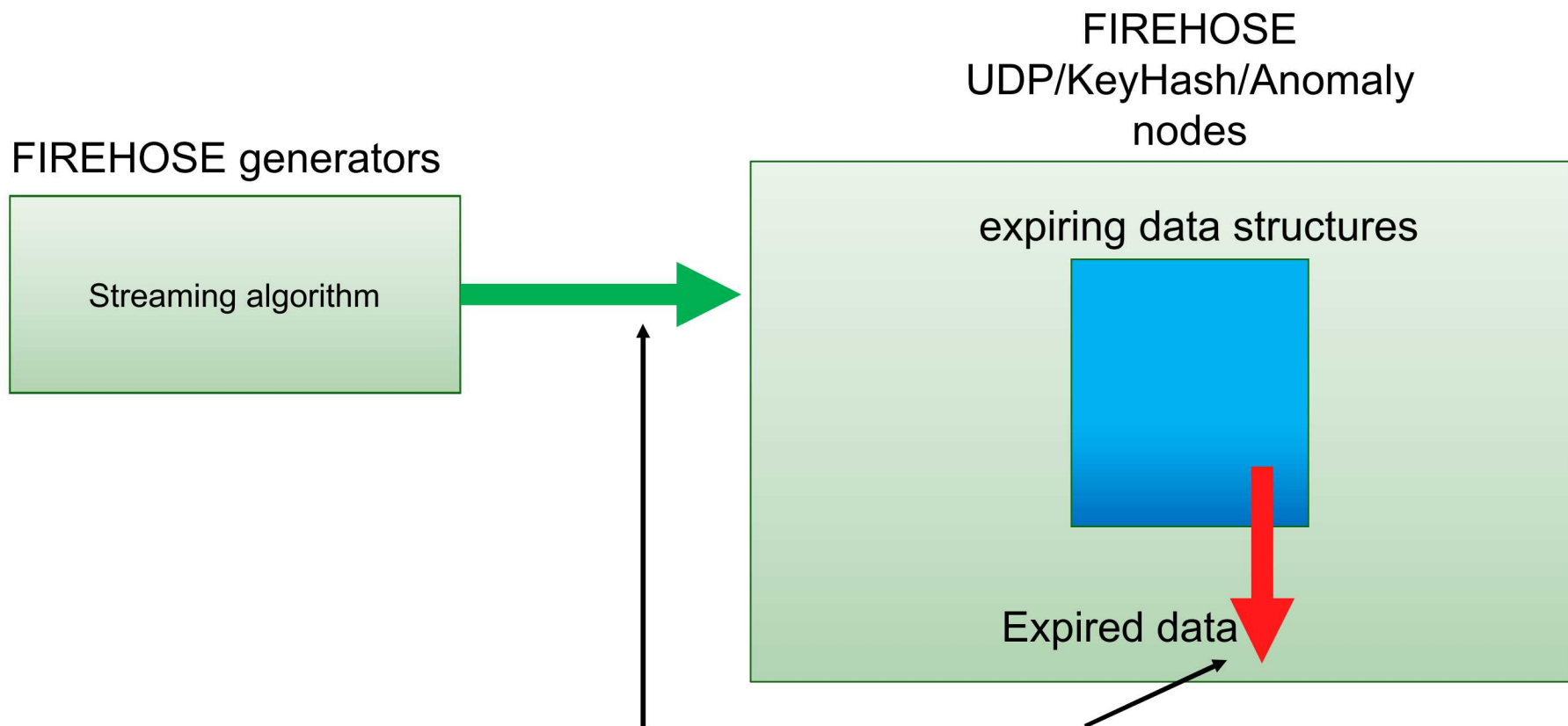


- What you're probably stuck with:



# FIREHOSE “Active” Generator

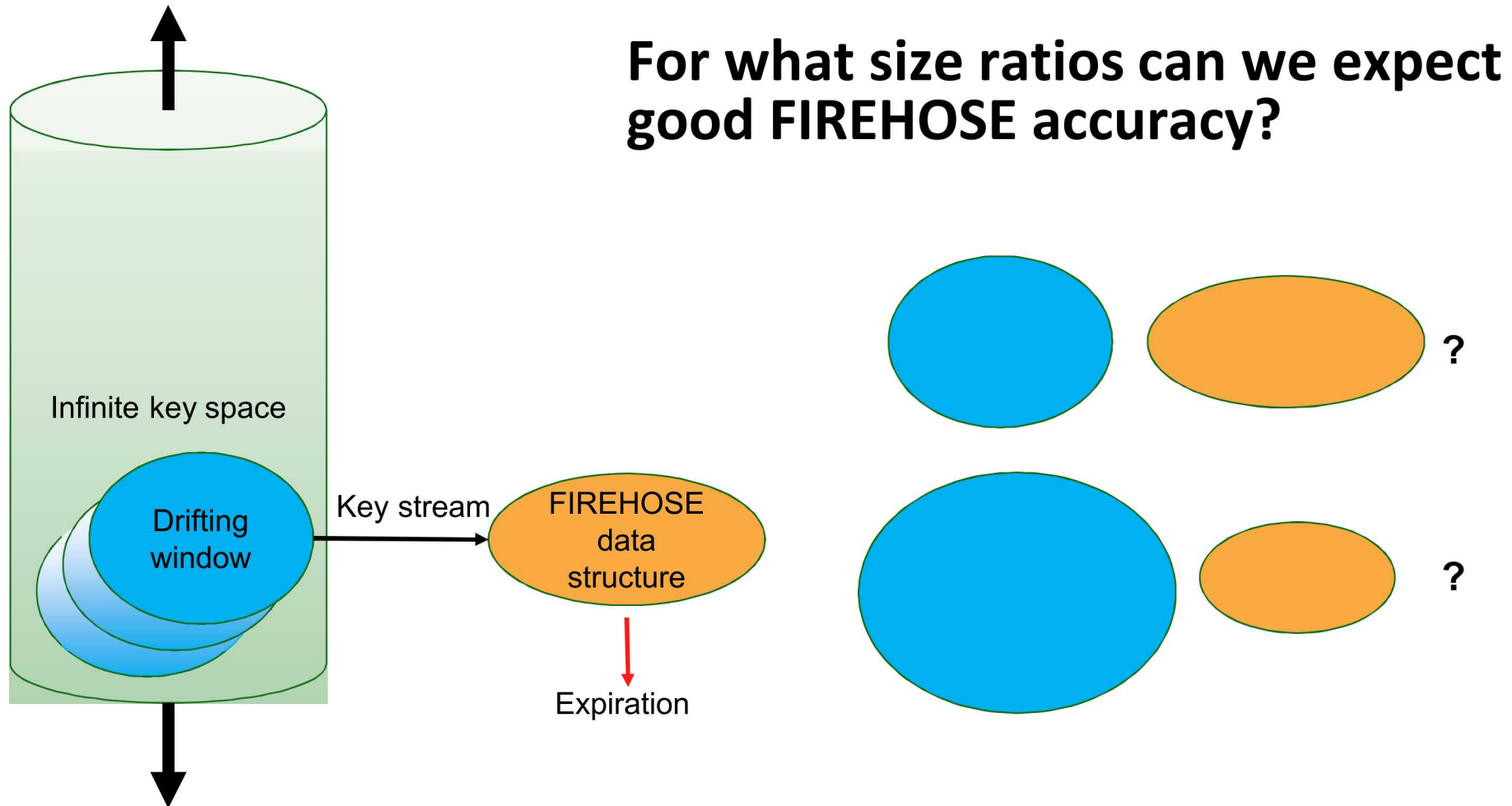
With an infinite key space, we have been forced to ask different questions



“We drop the data involuntarily *here* and/or intentionally *here*?”



# Active Generator Window Size



# Waterslide: Where do We “Drop?”

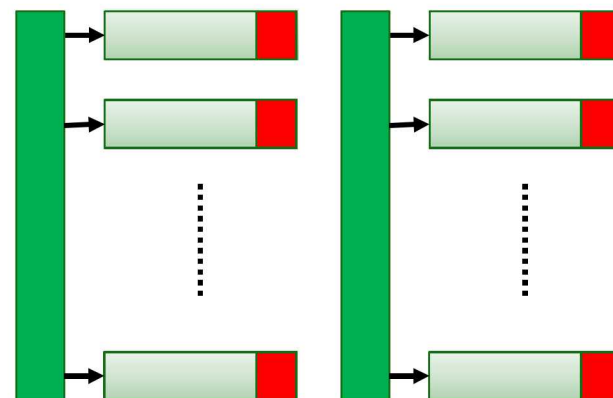
- Run FIREHOSE reference impl. in **waterslide** (open source)
- Look at “confusion matrix” (result) of FIREHOSE
- How many packets did we drop (generator->analytic)?
- How many reportable keys ( $\geq 24$  occurrences) did we report (50M keys generated)

Table Size	Generator Window Size	Reportable keys	Reported keys	Packet drops
2 <sup>20</sup>	2 <sup>20</sup>	94,368	62,317	0
2 <sup>20</sup>	2 <sup>21</sup>	63,673	15,168	0
2 <sup>20</sup>	2 <sup>22</sup>	17,063	9	0

<https://github.com/waterslideLTS/waterslide>

# What is Happening?

- Waterslide uses 'd-left hashing'
  - Two rows of buckets
  - Constant-size
  - Fast
  - Waterslide adds LRU expiration *per bucket*
  
- **1/16 of all data is always subject to immediate expiration in steady state**
  
- **As active generator window grows, FIREHOSE accuracy quickly goes to zero**



Broder, Andrei, and Michael Mitzenmacher. "Using multiple hash functions to improve IP lookups." *INFOCOM 2001*

*Even when window size is only 4x data structure size, most reportable data are lost before being reported on.*

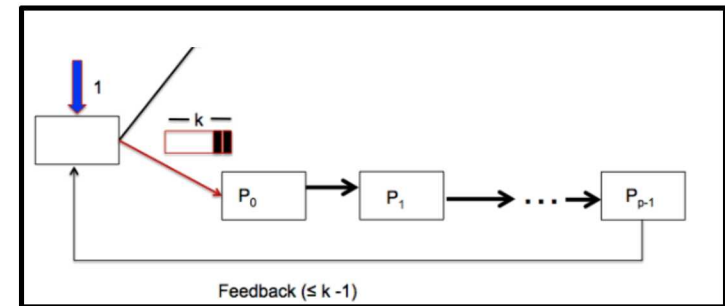
# Motivation for Data Structure Research

## ■ Premises

- Global key space often greater than data structure size
- Data structure insertion time is not the bottleneck in distributed FIREHOSE
- A working global expiration strategy could preserve accuracy for larger ratios of generator window size to data structure size

## ■ Approaches

- You'll hear about "**Popcorning**"
- You'll also hear about the "**x-stream**" model



Berry, et al. "Maintaining connected components for infinite graph streams." *Proceedings of the 2nd International Workshop on Big Data (KDD)*, ACM 2013

# Conclusions

- Go forth and help the HPC community!
- Thank you!

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