#### DataMods

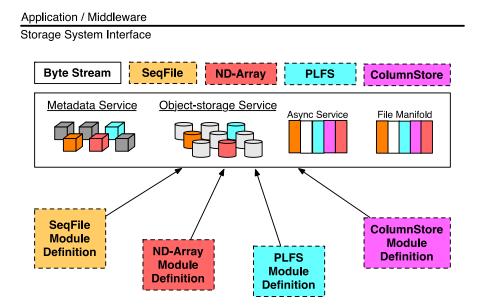
#### Programmable File System Services

Noah Watkins\*, Carlos Maltzahn, Scott Brandt UC Santa Cruz, \*Inktank

> Adam Manzanares California State University, Chico

## Talk Agenda

- 1. Middleware and modern IO stacks
- 2. Services in *middleware* and *parallel file systems*
- 3. Avoid duplicating work with DataMods
- 4. Case study: Checkpoint/restart

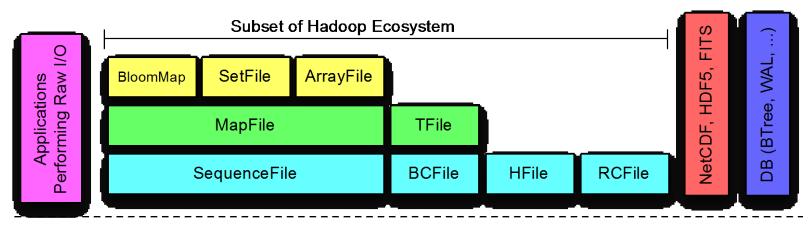


## Why DataMods?

- Applications struggle to scale on POSIX I/O
- Parallel FS rarely provide other interfaces
   POSIX I/O designed to prevent lock-in
- Open-source PFS are now available
   Ability to avoid lock-in
- Can we generalize PFS services to provide new behavior to new users?

## **Application Middleware**

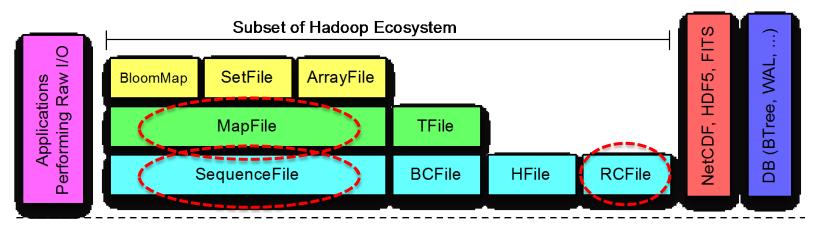
- Complex data models and interfaces
- Difficult to work directly with simple byte stream
- Middleware maps the complex onto the simple



Byte Stream Interface

#### Middleware Complexity Bloat

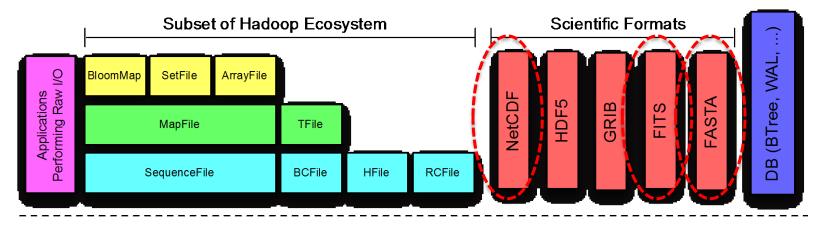
- Hadoop and "Big Data" data models
  - Ordered key/value pairs stored in file
  - Dictionary for random key-oriented access
  - Common table abstractions



Byte Stream Interface

#### Middleware Complexity Bloat

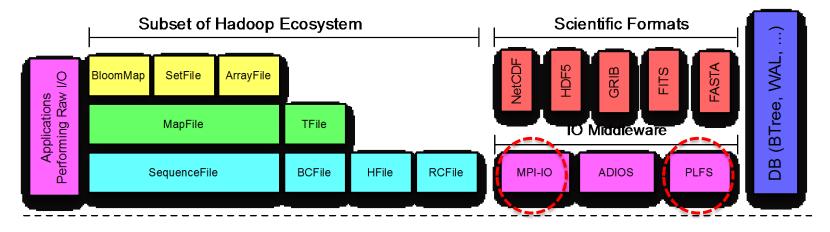
- Scientific data
  - Multi-dimensional arrays
  - Imaging
  - Genomics



**Byte Stream Interface** 

#### Middleware Complexity Bloat

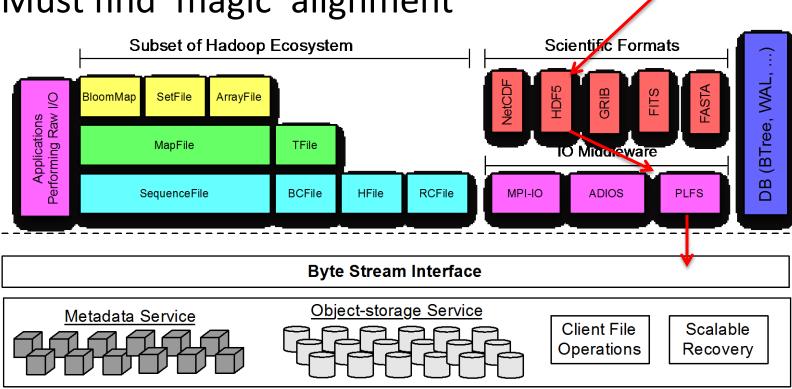
- IO Middleware
  - Low-level data models and I/O optimization
  - Transformative I/O avoids POSIX limitations



Byte Stream Interface

#### Middleware Scalability Challenges

- Scalable storage system
- Exposes one data model
- Must find 'magic' alignment



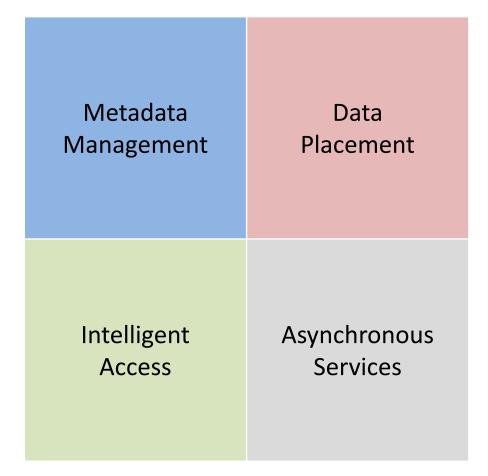
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#### Data Model Modules

- Plugin new "file" interfaces and behavior
- Native support; atop existing scalable services

New behavior>	Application / Middleware		
	Storage System Interface		
Generalized	Byte Stream     SeqFile     ND-Array     PLFS     ColumnStore       Metadata Service     Object-storage Service       Image: Column Store     Image: Scalable Recovery     Client File Operations		
Pluggable customization (new programmer role)	SeqFile Module Definition ND-Array Module Definition PLFS Module Definition 9		

#### What does middleware do?



#### Middleware: Metadata Management

Header Info



- Data type information
- Data model attributes
- Example: Mesh Data Model
  - How is the mesh represented?
  - What does it represent?

File

Header

#### Middleware: Data Placement

- Serialization ......
- Placement index.
- Physical alignment — Including the metadata
- Example: Mesh Data Model
  - Vertex lists
  - Mesh elements
  - Metadata

Header

Data

Met

а

Data

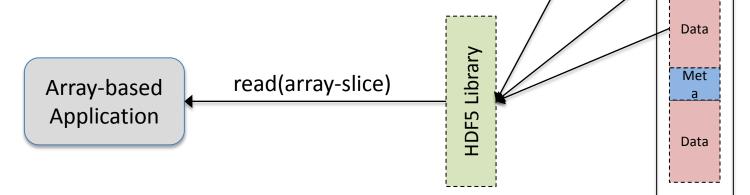
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Data

## Middleware: Intelligent Access

- Data model specific interfaces
- Rich access methods

   Views, subsetting, filtering
- Write-time optimizations
- Locality and data movement



Header

Data

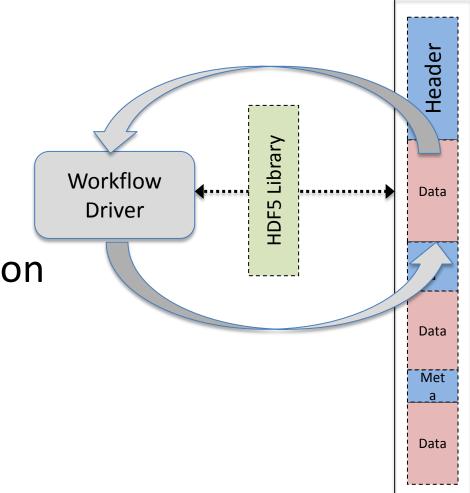
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read (2)

#### Middleware: Asynchronous Services

- Workflows
  - Regridding
- Compression
- Indexing
- Layout optimization
- Performed online



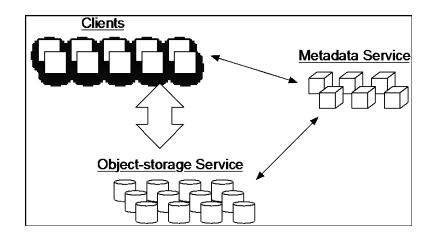
## Middleware Challenges

- Inflexible byte stream abstraction
- Scalability rules are simple
   But middleware is complex
- Applying 'magic number'
  - Unnatural and difficult to propogate
- Loss of detail at lower-levels
  - Difficult for in-transit / co-located compute

## **Storage System Services**

- Scalable meta data
  - Clustered service
  - Scalability invariants
- Distributed object store
  - Local compute resources
  - Define new behavior
- File operations

   POSIX
- Fault-tolerance
  - Scrubbing and replication



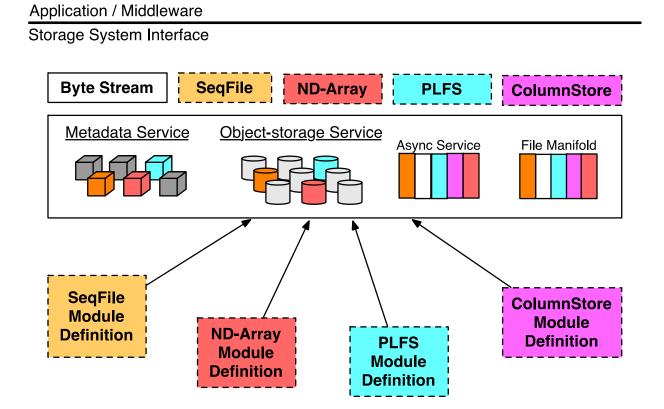
#### **DataMods Abstraction**

#### File Manifold (Metadata and Data Placement)

Typed and Active Storage Asynchronous Services

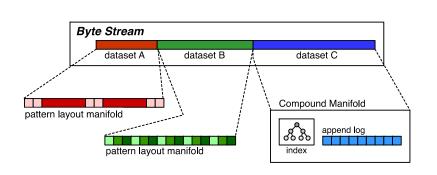
#### DataMods Architecture

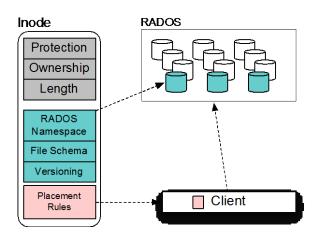
- Generalized file system services
- Exposed through programming model



#### File Manifold

- Metadata management and data placement – Flexible, custom layouts
- Extensible interfaces
- Object namespace managed by manifold
- Placement rules evaluated by system





## Typed and Active Storage

- Active storage adoption has been slow
  - Code injection is scary

– Security and QoS

- Reading, writing, and checksums are not free
- Exposing scalable services is tractable
  - Well-defined data models supports optimization
  - Programming model support data model creation
  - Indexing and filtering

#### Asynchronous Services

- Re-use of active / typed storage components
- Temporal relationship to file manifold
  - Incremental processing
  - After file is closed
  - Object update trigger
- Scheduling
  - Exploit idle time
  - Integrate with larger ecosystem
  - Preempted or aborted

#### Case Study: PLFS Checkpoint/Restart

- Long-running simulations need fault-tolerance
   Checkpoint simulation state
- Simulations run on expensive machines
   Very expensive machines. Really, very expensive.
- Decrease cost (time) of checkpoint/restart
- Translation: increase bulk I/O bandwidth

## **Overview of PLFS**

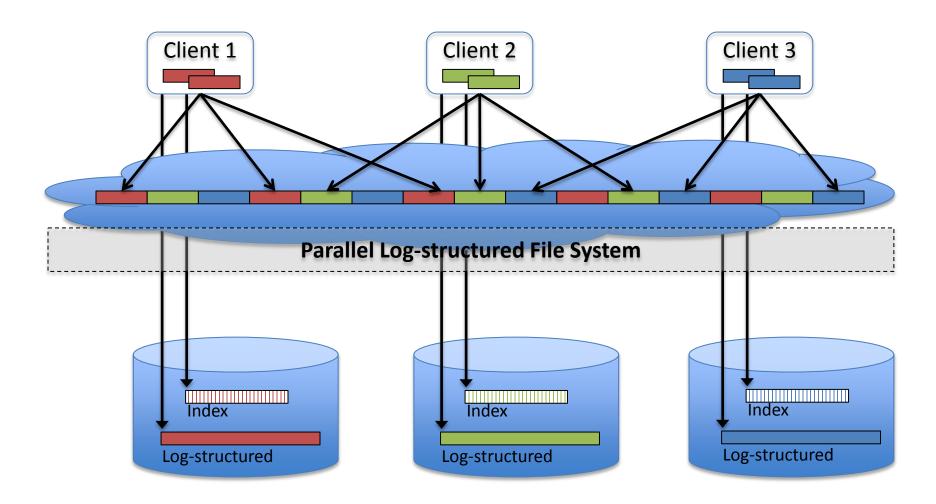
• Middleware layer

– Transforms I/O pattern

- IO Pattern: N-1
  - Most common
- IO Pattern: N-N
  - File system friendly
- Convert N-1 into N-N
- Applications see the same logical file

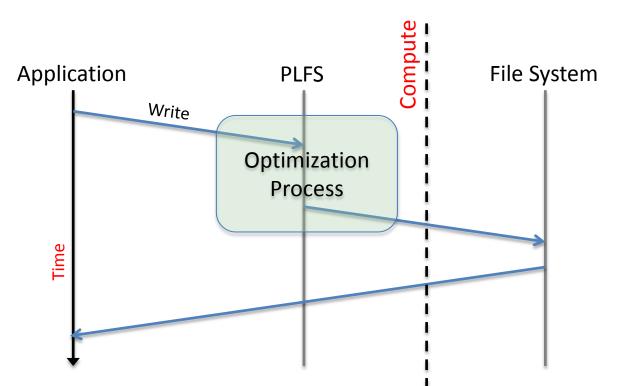
Application / Client		
PLFS	MPI-IO	
POSIX File System		

## Simplified PLFS I/O Behavior



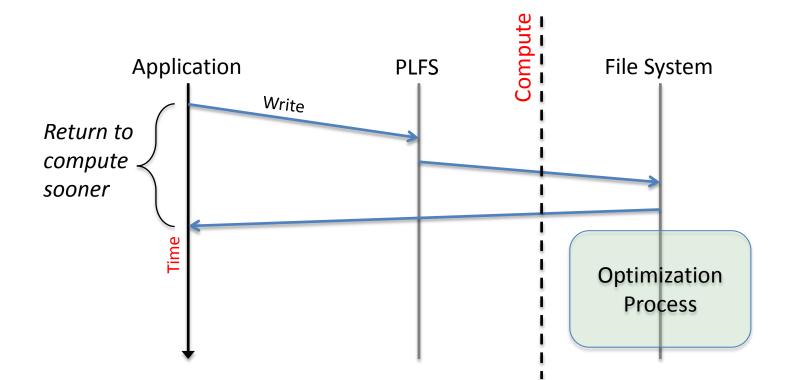
#### PLFS Scalability Challenges

- Index maintenance and volume
- Optimization above file system
  - Compression and reorganization



#### Moving Overhead to Storage System

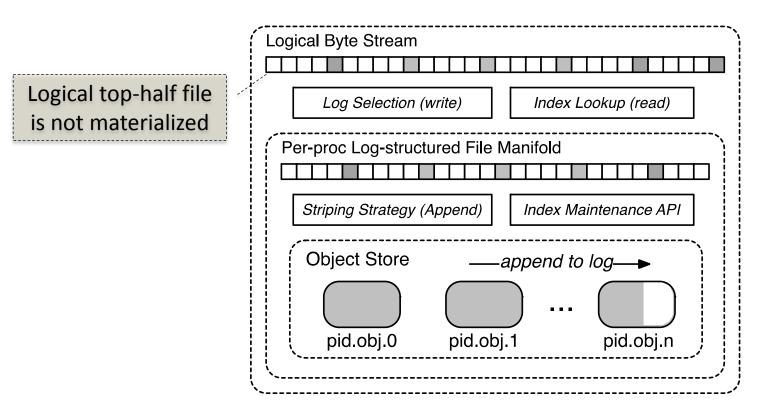
- Checkpoints are not read immediately (if at all)
  - Index maintenance and optimization in storage



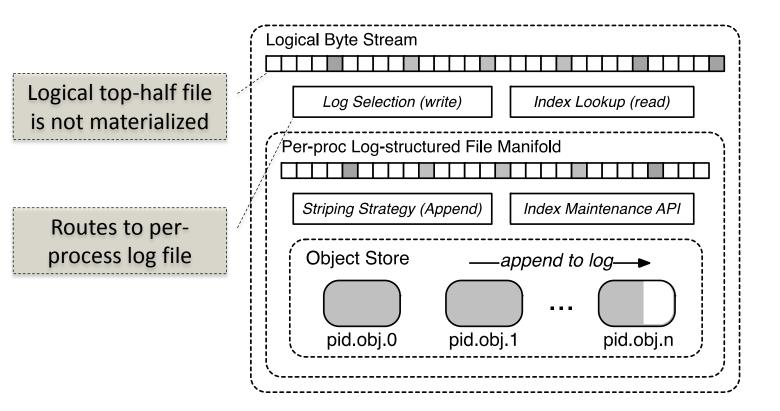
## DataMods Module for PLFS

- File Manifold
  - Logical file view
  - Per-process log-structured files
  - Index
- Hierarchical Solution
  - Top-level manifold routes to logs
  - Inner manifold implements log-structured file
  - Automatic namespace management (metadata)

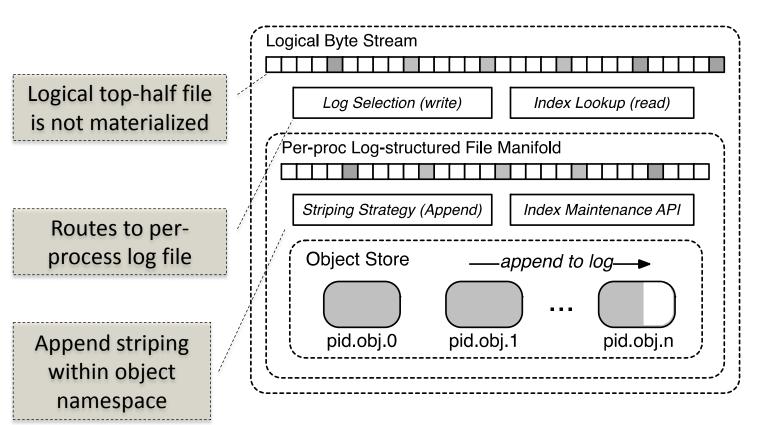
#### PLFS Outer File Manifold



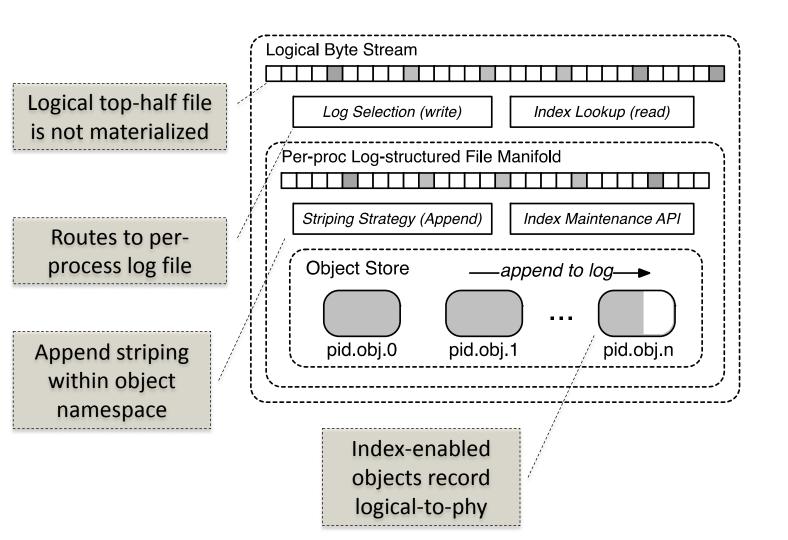
#### PLFS Outer File Manifold



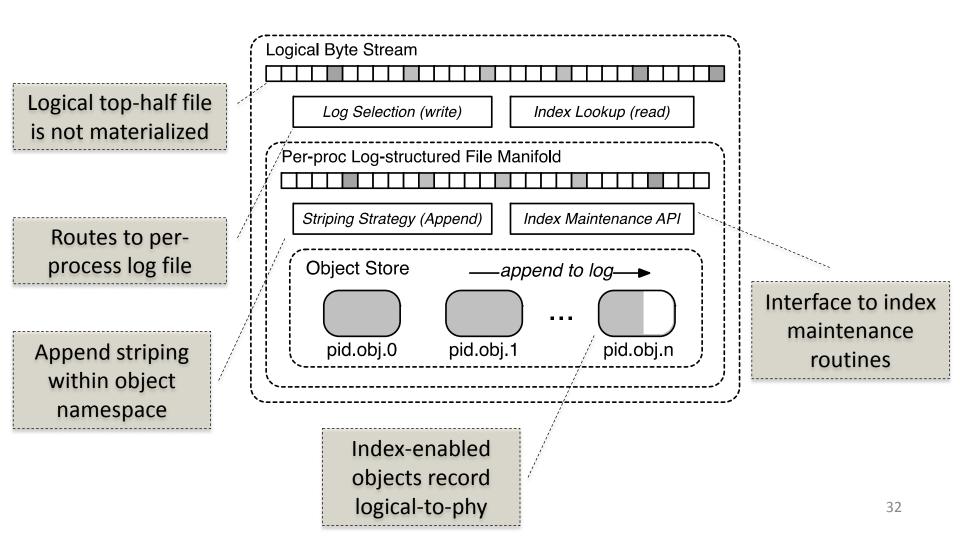
#### PLFS Inner File Manifold



#### PLFS Inner File Manifold

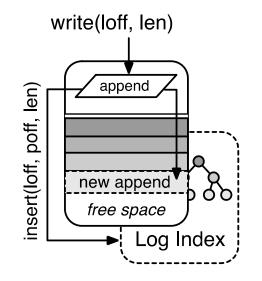


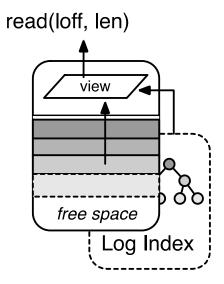
#### PLFS Inner File Manifold



## Active and Typed Objects

- Append-only object
- Automatic indexing
- Managed layout
- Built on existing services
- Logical view at lowest level
- Index maintenance interface



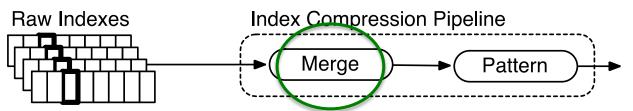


## **Offline Index Optimization**

- Extreme index fragmentation (per-object)
- Exploit opportunities for optimization
  - Storage system idle time
  - Re-use of analysis I/O
  - Piggy-backed on scrubbing / healing
- Index Compression
  - Merging contiguous entries
  - Pattern discovery and replacement
  - Consolidation

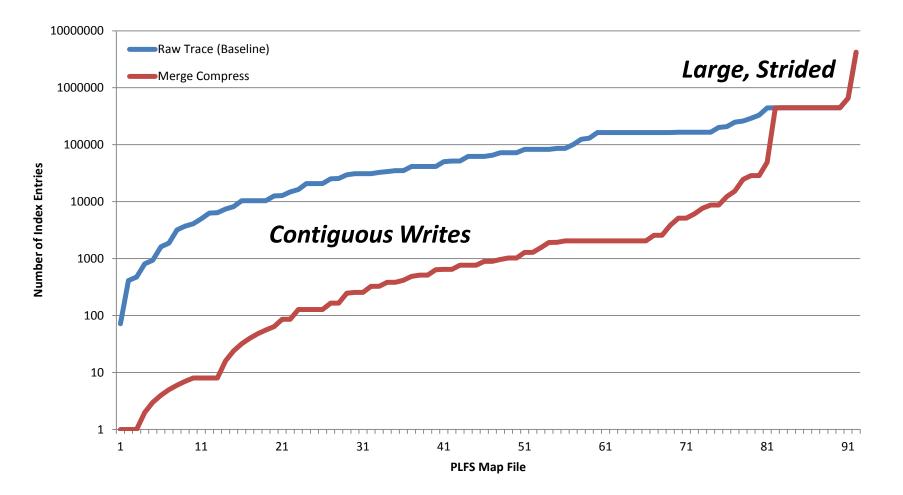
## **Offline Index Optimization**

- Three stage pipeline
  - Incremental compression and consolidation
- Incremental compression
  - 1. Merging physically contiguous entries (in PLFS)
    - Not subject to buffer size limits



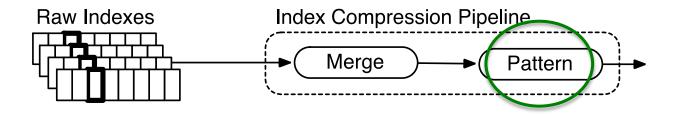
 Applied technique to 92 PLFS indexes published by LANL

#### Merging Reduces PLFS Index Size

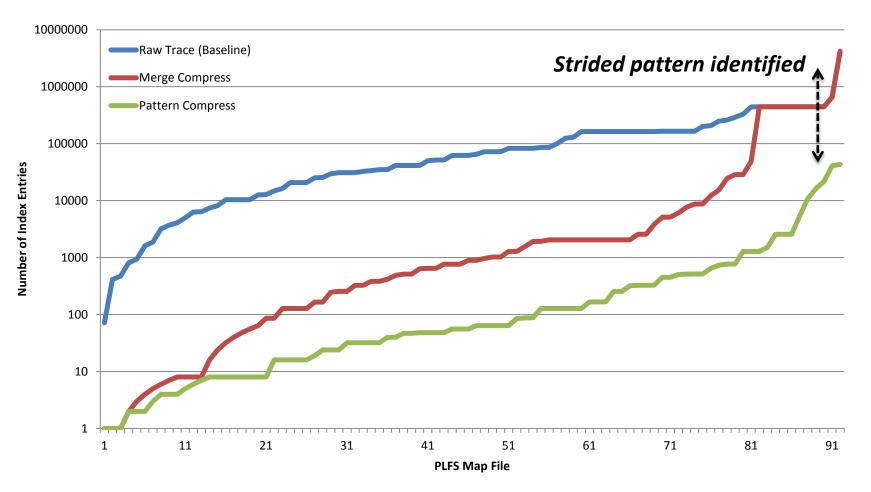


#### Index Compression: Pattern

- Compactly represent extents using patterns
- Example pattern template
   offset + stride \* i, low < i < high</li>
- Fit data to this pattern to reduce index size
- Linear algorithm; parallel across logs

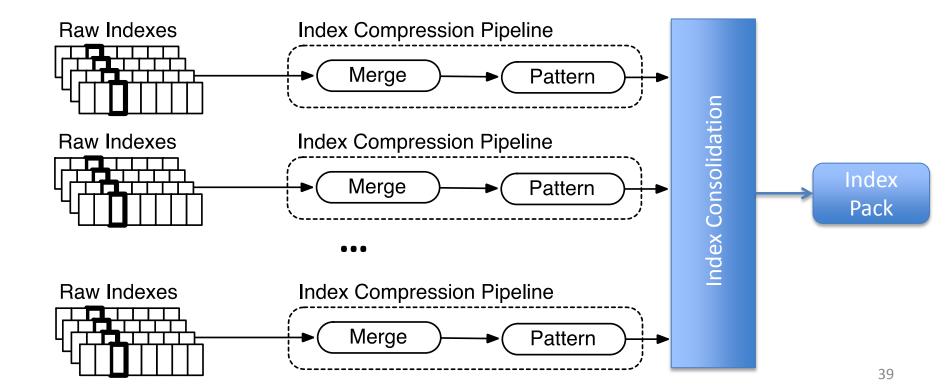


#### Pattern Compression Improves Over Merging



#### Index Consolidation

- Combines all logs together (in PLFS)
- Increases index read efficiency



# Wrapping Up

- Implementing new data model plugins
  - Hadoop and Visualization
  - Refining API with more use cases
  - Constructing specification language
- Thank you to supporters
  - DOE funding (DE-SC0005428), Gary Grider
     John Bent, James Nunez
- Questions? --- jayhawk@cs.ucsc.edu
- Poster session

#### Extra Slides

#### Index Reduction Improvements

