# AirMettle

Real-Time Smart Data Lake for Accelerated In-Place Analytics of Scientific Data

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HDF5 User Group Meeting August 2023



AirMettle has developed a real-time smart data lake solution that simplifies big data analytics and accelerates processing by an order of magnitude, or more.

It is implemented in the data lake storage layer and performs basic analytics tasks that:

- Reduce network traffic Extract only what is needed before returning
- Improve data freshness All data can be rapidly queried
- Enable real-time operation Sub-second queries on GByte objects from storage



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https://www.nsf.gov/awardsearch/showAward?AWD\_ID=2135007&HistoricalAwards=false

https://techpartnerships.noaa.gov/sbir/awards/

# **Traditional Data Lake**



# **Traditional Data Lake:**

Data generally arrives semi-structured



# **Traditional Data Lake:**

Data must be moved to gain value from it



# Smart Data Lake: Get only what is needed 100x Faster

Delegate simple processing to storage thereby eliminating the need to move 90%+ of the data



# Accelerated analytics of classic tabular data

#### Security Information & Event Management



- Scan historical data to diagnose current events
  - Determine how many records might be relevant before retrieving any

#### Natural Language Processing



- Search for key-words
  - Gather statistics of usage
  - Extract text if required for further analysis

# Accelerated analytics of classic tabular data (S3 Select API)

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#### AirMettle Accelerates

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# 5x Acceleration on Complete Queries, today... just by using a different storage



c5n.18xlarge





Star Schema Benchmark, Scale Factor 1 with 1 object per table

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S3 Select API enables comparison vs. major cloud's object storage

# Resiliency 101: How do storage solutions protect data?

RAID:







#### Data protection algorithms designed for HDD

**Erasure Coding:** 

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### What that means for data reliably placed in storage: First 4 devices shown...

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#### Simple Table:

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Bytes of data divided evenly across SSDs!

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Data protection and streaming performance!

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#4

#### Supports data protection algorithms designed for HDD!



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#### Simple Table

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3/13/96

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Bytes of data divided evenly across SSDs!

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67310

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Data protection and streaming performance!

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3/22/96 DELIVER\_IN\_PERSON TRUCK

4/20/96 TAKE BACK RETURN MAIL

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#### HDD-centric RAID/Erasure Coding prevent in-storage analytics

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#### AirMettle: Data partitioning for processing AND protecting data



#### AirMettle internal metadata enables parallel in-storage analytics FIG. 4B



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#### AirMettle: Data partitioning for processing AND protecting data



AirMettle protection algorithms are designed for our non-uniform data segments

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AirMettle

be processed in parallel

AirMettle Patented IP

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# AirMettle Accelerates Multi-dimensional data



- Complex data format!
- Even the coordinates are multi-dimensional
- Scientific analysis also requires:
  - Sampling of different subsets for each query
  - Gathering statistical properties

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- Data is stored in partitions, based on semi-structural boundaries & size of segment
  - Enables distributed in-place parallel processing
- Validated in

Phase I

- Queries are more complex than events w/ SQL
  - 2-3 Stage queries typical, but each stage can be executed in parallel

# Initial Support: Selection & Simple Aggregations via REST APIs



- Selection returned as "smaller" NetCDF4
- Partitioned tensor data can be efficiently scanned in parallel
- Multi-stage processing:
  - Check coordinates
    - Bounding box & potential mask
    - Identifies components holding relevant data
  - Scan / Filter desired data
  - Integrate result for return

# Initial Support: Selection & Simple Aggregations via REST APIs



- Selection returned as "smaller" NetCDF4
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- Challenges included:
  - User-transparent partitioning
    - Internal data placement was more complex than originally anticipated
    - Typical internal overhead <0.3%
      - Dwarfed by data protection overheads
        - Erasure coding typically 20% to 35%
  - HDF5 does not have a re-entrant library
    - Developed support for concurrent analytics
    - Enables massive parallelism required for a shared storage service
  - Query engine required extensions for multistage execution & tensors

# **NOAA Phase II: Regridding**



- Very common operation to convert from higher-resolution to lower-resolution.
  - When combining data from different sources, the final result can only be the lowest common resolution among the different sources.
- Project formally commenced Aug 1st
  - Developing parallel re-gridding on internal partitions
- Coming Summer '24
  - Multi-dimensional in-place analytics
- Plan to explore alternative aggregation functions (Min/Max/Std. Dev) to enable faster analysis
  - Potential storm fronts, etc.

Precipitation on 1º/1º and 5 º/5 º grids

#### Roadmap: Hierarchical support & User Defined Functions! AI in-place



#### Acknowledgement

This work was supported with government support under

- 2135007 awarded by the National Science Foundation
- NA22OAR0210591 awarded by the National Oceanic and Atmospheric Administration
- NA23OAR0210342 awarded by the National Oceanic and Atmospheric Administration

# AirMettle

Backups follow...

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TM

August 2023

#### **Unified Data Infrastructure (2.0)**



Source: https://future.a16z.com/emerging-architectures-modern-data-infrastructure/

#### **Unified Data Infrastructure (2.0)**



Source: https://future.a16z.com/emerging-architectures-modern-data-infrastructure/

#### Contemporary **Unified Data Infrastructure** (3.0)

Eliminate Data Warehouse for simple queries Real-time analytics from semi-structured data



Source: https://future.a16z.com/emerging-architectures-modern-data-infrastructure/