

Backtesting in the Cloud

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STAC A-3 Results: Backtesting w/ Spark Dataframes on Levyx' Xenon on Google Cloud

- Google Cloud 5 node cluster (4 workers) (STAC Audited SUT ID: LEVX170603)
 - √ 32.7x improvement in speed compared to previous record on Hadoop Streaming from Intel/Cloudera (SUT ID INTC141220-VI) running on 14 Dell PowerEdge Servers

| | INTC141220-VI | SPRK170603 | Improvement |
|-----------------------------------|---------------|------------|-------------|
| STAC-A3.ß1.SWEEP.MAX60 | 25 | 200 | 8x |
| STAC-A3.β1.SWEEP.SPEED | 0.43 | 14.08 | 32.7x |
| Max instrument simulations/second | 2.5 | 12.6 | 5.0x |
| | | | |

 Levyx STAC-A3 - Results on Amazon Cloud testing in the process of being released to the STAC Vault



www.STACresearch.com/backtesting

Backtesting Everything ...

- Trading Algos (like STAC-A3)
- Compliance Models
- Fraud detection models
- Marketing Models
- Operational Risk Models
- Cybersecurity Models

The popular toolset ...

- Languages: Python (PANDAS and scikit) & R
- Dataframe Formats: Apache Arrow & Feather
- Compute Frameworks: TensorFlow, Apache Spark (SparkSQL, SparkML, SparkR, pySpark) and Hadoop
- Distributed Times Series DB and Tick Stores: Quasardb, TickSmith,
- Compute Offload: FPGA & GPU

To keep costs under control most Fintech firms are using cloud service providers for machine learning model exploration and training as well as for on-demand backtesting compute needs.

Most backtesting processes revolve around getting time series data into MEMORY as a DATAFRAME & then running parallel calculations to train and/or test the model.

But there is a better way ... use SSD or SCM in place of RAM.

Xenon™ Offload Analytics Engine Backtesting Based Solution

Backtesting Framework written in Python, R or Scala [Example: STAC A-3]



Xenon Spark Connector

Ultra-High Performance Indexing Distributed Storage Class Memory API Code
Optimization &
Partitioning

Just-in-Time Compilation Xenon Run-Time System

User Define

Functions

Direct Interface To Hardware

NIC/RDMA

Flash/Optane SSD

System Cores

FPGA or GPU Accelerators

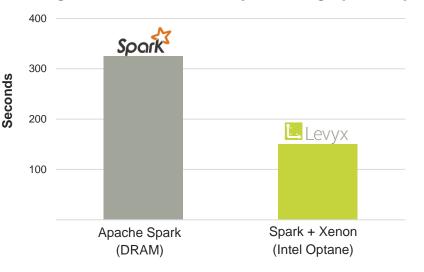
- Levyx's Xenon, offered as a cluster service
 - Native C/C++ API may be used directly by big-data applications
 - ✓ Seamlessly integrates with Apache Spark / HDFS / QuasarDB
- Provides a <u>live persistent</u><u>DataFrame</u> abstraction
- Works with off the shelf valuation libraries eg Intel Finlib 1.0 for FPGA
 - Provides <u>indexed</u> <u>operations</u> as well as efficient scan support

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XENON TM

Xenon Applications: TPC/H-DS Benchmarking

Large Scale Real-Time Analytics Using Apache Spark



| Characteristic | DRAM | Optane drives + Xenon |
|--|---------------|------------------------------------|
| Price of capacity (750GB) | >\$11,000 | \$3,000 |
| Analytics processing performance (TPCH, TPCDS) | 650 MB/sec | 1.3 GB/sec Analytics Processing |
| Time to load (sec) | 89 | 1.3 |
| Execution time (sec) | 330 | 150 |

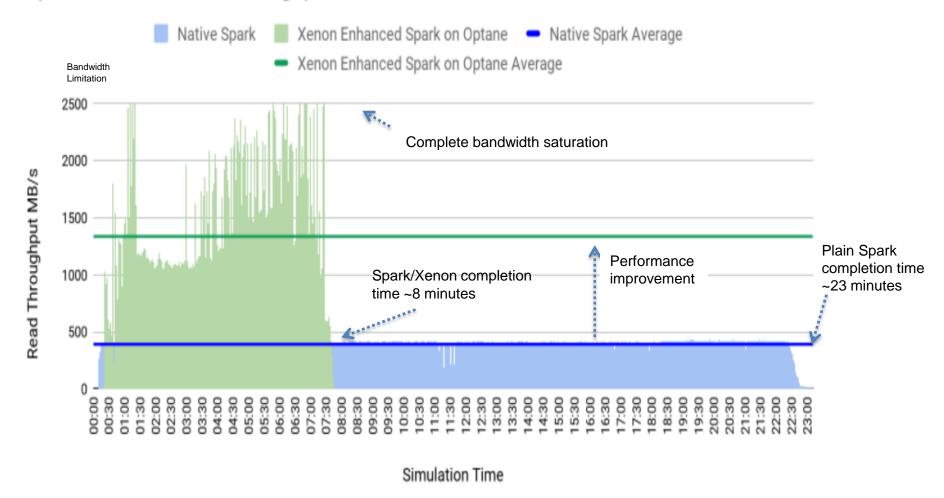
Note: Intel Optane-based solution (750GB) vs. DRAM (750GB), both running Apache Spark

- On all Platforms tested Spark/Xenon showed 2-3X advantage over plain Spark
 - ✓ Google Cloud
 - ✓ Amazon Cloud
 - √ X-IO Axellio single 2U 2 node cluster
 - ✓ Dell with Intel P3700's



Levyx' Optimal Bandwidth Utilization Improves Spark-based Backtesting Programs

Optane Drive Read IO Throughput





T A S T

Flash-Optimized, Kernel Bypass Data Stack

Big Data Applications

XENON Dataset & Analytics API

Query/Analytics Parsing

Query/Analytics Optimization & Partitioning Engine

Query/Analytics Code Generator & Just-in-time Compiler

Distributed Storage Class Memory (DSCM) Abstraction & API

HELIUM Key/Value Store API

Network & RDMA Manager (Synchroni zation & Data Movement)

High Performance Indexer Lock Free
Object
Caching &
Write
Buffering

Core Key/Value Store Logic (PQ, RQ, GC & Transactions)

Native Key/Value (NKV) Abstraction & API

Flash SCM Multi-core CPU



Ultra Low Latency — 10X Faster

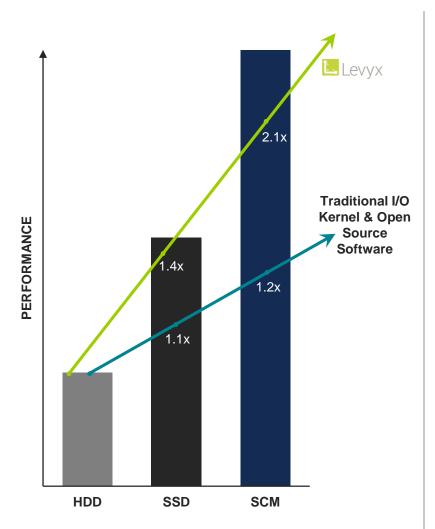


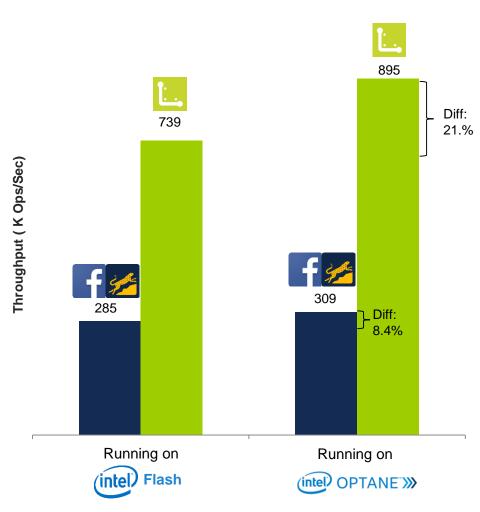
Index Billions of Objects on a Single Node



Unmatched Price/Performance

Cost Challenge: Taking Advantage of New Technology





New Levyx Features Since June

- Community Version of He-RocksDB:
 - RocksDB users can download today by emailing herocks@levyx.com.
- Xenon Support for User Defined Functions: Allows Xenon to push down calculations to FPGA's, GPU's and C/C++ libraries.
- Locality-Aware: A new feature in Xenon which enables Spark to assign jobs to proper nodes based on hints about data locality. For example, assigning a symbol's P&L job to the node where most of its time series data is resident. Reduces network shuffle overhead drastically.
- Efficient DataFrame Read Path: Improved the performance of DataFrame materialization within Spark-Xenon.
- Support for multiple Spark jobs accessing the same Xenon
 DataFrame: eg 10 machine learning models can be training on the same data set in parallel without loading the data set into memory 10 times.

Please Tick the Box and Download! Thank You!

- A free version of the Levyx' He-RocksDB allows users to easily install and experience
 the benefits of our implementation with just a few clicks and non-disruptively
 improve the customer's underlying RocksDB deployment. RocksDB users can
 download today by contacting herocks@levyx.com.
- Levyx's HeRocks solution is ideal for data center environments that run RocksDB to process extensive key-value sets (billion-plus) in real-time.
- Using dbbench, RocksDB's own benchmarking tool, and running on a system with 88 cores and Intel's NVMe DCP3700 SSDs, HeRocks test results were more than an order of magnitude better than the latest open-source version of RocksDB. Value sizes of 100 bytes were used representing workloads such as system logs or network logs for data centers and cybersecurity applications, stock quotes for high-frequency trading and analysis, Facebook status updates or Twitter messages. For a mixed load of 70% read/ 30% write, RocksDB could achieve 330K operations/second (ops/sec) and HeRocks could achieve 5.1 million ops/sec. For random reads, RocksDB topped at 1.3 million ops/sec while HeRocks numbers were at 16 million ops/sec. For "Read while Writing" test RocksDB was at 2.0 million ops/sec, and HeRocks was at 16.4 million ops/sec.