

# An Overview of Pivotal HD/HAWQ and its Applications

VEERA MARNI<sup>1</sup>

<sup>1</sup>School of Informatics and Computing, Bloomington, IN 47408, U.S.A.

\*Corresponding authors: vmarni@umail.iu.edu

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**Pivotal HDB is the Apache Hadoop native SQL database powered by Apache HAWQ for data science and machine learning workloads. It can be used to gain deeper and actionable insights into data with out the need from moving data to another platform to perfrom advanced analytics.**

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<https://github.com/narayana1043/sp17-i524/blob/master/paper2/S17-IR-2017/report.pdf>

## 1. INTRODUCTION

Pivotal-HAWQ[1] is a Hadoop native SQL query engine that combines the key technological advantages of MPP database with the scalability and convenience of Hadoop. HAWQ reads data from and writes data to HDFS natively. HAWQ delivers industry-leading performance and linear scalability. It provides users the tools to confidently and successfully interact with petabyte range data sets. HAWQ provides users with a complete, standards compliant SQL interface.

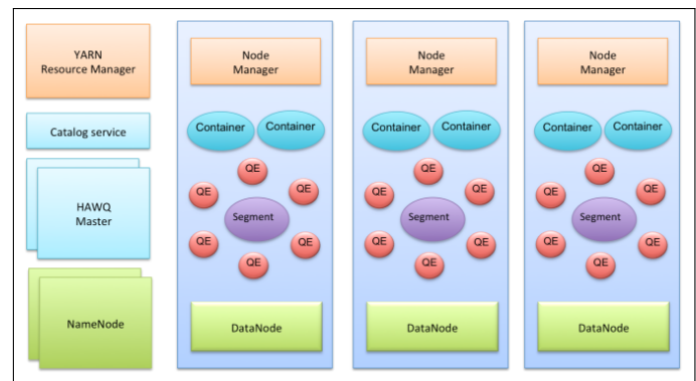
An MPP database is a database that is optimized to be processed in parallel for many operations to be performed by many processing units at a time.[2] HAWQ breaks complex queries into small tasks and distributes them to MPP query processing units for execution. HAWQ's basic unit of parallelism is the segment instance. Multiple segment instances on commodity servers work together to form a single parallel query processing system. A query submitted to HAWQ is optimized, broken into smaller components, and dispatched to segments that work together to deliver a single result set. All relational operations - such as table scans, joins, aggregations, and sorts - simultaneously execute in parallel across the segments. Data from upstream components in the dynamic pipeline are transmitted to downstream components through the scalable User Datagram Protocol (UDP)[3] interconnect.

Based on Hadoop's distributed storage, HAWQ has no single point of failure and supports fully-automatic online recovery. System states are continuously monitored, therefore if a segment fails, it is automatically removed from the cluster. During this process, the system continues serving customer queries, and the segments can be added back to the system when necessary.

## 2. ARCHITECTURE OF HAWQ

In a typical HAWQ deployment, each slave node has one physical HAWQ segment, an HDFS DataNode and a NodeManager[4]

installed. Masters for HAWQ, HDFS and YARN are hosted on separate nodes.[5]. HAWQ is tightly integrated with YARN, the Hadoop resource management framework, for query resource management. HAWQ caches containers from YARN in a resource pool and then manages those resources locally by leveraging HAWQ's own finer-grained resource management for users and groups.



**Fig. 1.** The following diagram provides a high-level architectural view of a typical HAWQ deployment.[6].

### 2.1. HAWQ Master

The HAWQ master is the entry point to the system. It is the database process that accepts client connections and processes the SQL commands issued. The HAWQ master parses queries, optimizes queries, dispatches queries to segments and coordinates the query execution. End-users interact with HAWQ through the master and can connect to the database using client programs such as psql or application programming interfaces (APIs) such as JDBC[7] or ODBC[8]. The master is where the

global system catalog resides. The global system catalog is the set of system tables that contain metadata about the HAWQ system itself. The master does not contain any user data; data resides only on HDFS.

## 2.2. HAWQ Segment

In HAWQ, the segments are the units that process data simultaneously. There is only one physical segment on each host. Each segment can start many Query Executors (QEs) for each query slice. This makes a single segment act like multiple virtual segments, which enables HAWQ to better utilize all available resources.

## 2.3. HAWQ Interconnect

The interconnect is the networking layer of HAWQ. When a user connects to a database and issues a query, processes are created on each segment to handle the query. The interconnect refers to the inter-process communication between the segments, as well as the network infrastructure on which this communication relies.

## 2.4. HAWQ Resource Manager

The HAWQ resource manager obtains resources from YARN and responds to resource requests. Resources are buffered by the HAWQ resource manager to support low latency queries. The HAWQ resource manager can also run in standalone mode. In these deployments, HAWQ manages resources by itself without YARN.

## 2.5. HAWQ Catalog Service

The HAWQ catalog service stores all metadata, such as UDF/UDT[9] information, relation information, security information and data file locations.

## 2.6. HAWQ Fault Tolerance Service

The HAWQ fault tolerance service (FTS) is responsible for detecting segment failures and accepting heartbeats from segments.

## 2.7. HAWQ Dispatcher

The HAWQ dispatcher dispatches query plans to a selected subset of segments and coordinates the execution of the query. The dispatcher and the HAWQ resource manager are the main components responsible for the dynamic scheduling of queries and the resources required to execute them.

# 3. KEY FEATURES OF PIVOTAL HDB/HAWQ

## 3.1. High-Performance Architecture

Pivotal HDB's parallel processing architecture delivers high performance throughput and low latency (potentially, near-real-time) query responses that can scale to petabyte-sized datasets. Pivotal HDB also features a cutting-edge, cost-based SQL query optimizer and dynamic pipelining technology for efficient performance operation.

## 3.2. Robust ANSI SQL Compliance

Pivotal HDB complies with ANSI SQL-92, -99, and -2003 standards, plus OLAP[10] extensions. Leverage existing SQL expertise and existing SQL-based applications and BI/data visualization tools. Execute complex queries and joins, including roll-ups and nested queries.

## 3.3. Deep Analytics and Machine Learning

Pivotal HDB integrates statistical and machine learning capabilities that can be natively invoked from SQL and applied natively to large data sets across a Hadoop cluster. Pivotal HDB supports PL/Python, PL/Java and PL/R programming languages.

## 3.4. Flexible Data Format Support

HDB supports multiple data file formats including Apache Parquet and HDB binary data files, plus HBase and Avro via HDB's Pivotal Extension Framework (PXF) services. HDB interfaces with HCatalog, which enables you to query an even broader range of data formats.

## 3.5. Tight Integration with Hadoop Ecosystem

Pivotal HDB plugs into the Apache Ambari[11] installation, management and configuration framework. This provides a Hadoop-native mechanism for installation and deployment of Pivotal HDB and for monitoring cluster resources across Pivotal HDB and the rest of the Hadoop ecosystem.

# 4. ECOSYSTEM

HAWQ uses Hadoop ecosystem[12] integration and manageability and flexible data-store format support. HAWQ is natively in hadoop and requires no connectors. Hadoop Common contains libraries and utilities needed by other Hadoop modules. HDFS is a distributed file-system that stores data on commodity machines, providing very high aggregate bandwidth across the cluster. Hadoop YARN is a resource-management platform responsible for managing computing resources in clusters and using them for scheduling of users applications. Hadoop MapReduce is an implementation of the MapReduce programming model for large scale data processing.

# 5. APPLICATIONS OF PIVOTAL HD/HAWQ

The Pivotal HD Enterprise product enables you to take advantage of big data analytics without the overhead and complexity of a project built from scratch. Pivotal HD Enterprise is Apache Hadoop that allows users to write distributed processing applications for large data sets across a cluster of commodity servers using a simple programming model.

## 5.1. Content-Based Image Retrieval using Pivotal HD with HAWQ

Manual tagging is infeasible for image databases of this size, and is prone to errors due to users' subjective opinions. Given a query image, a CBIR[13] system can be potentially used to auto-tag (label) similar images in the collection, with the assigned label being the object category or scene description label. This technology also has an important role to play within a number of non-consumer domains. CBIR systems can be used in health care contexts for case-based diagnoses. A common example is image retrieval on large image databases such as Flickr[14].

## 5.2. Transition of Hulu from Mysql to Pivotal-HD/HAWQ

Hulu is a leading video company that offers TV shows, clips, movies and more on the free, ad-supported Hulu.com service and the subscription service Hulu Plus. It serves 4 billion videos. It has used HAWQ to gain performance improvement to handle queries from users. It's main challenge was inability to scale MySQL and Memcached to improve performance which was handled by Pivotal HAWQ[15].

## 6. DISADVANTAGES

There are also some drawbacks that needs attention before one choose to use Pivotal-HD/HAWQ. Since most of these are used with the help public cloud providers there is a greater dependency on service providers, Risk of being locked into proprietary or vendor-recommended systems, Potential privacy and security risks of putting valuable data on someone else's system. Another important problem what happens if the supplier suddenly stops services. Even with this disadvantages the technology is still used greatly in various industries and many more are looking forward to move into cloud.

## 7. EDUCATIONAL MATERIAL

Pivotal offers an portfolio of role-based courses and certifications to build your product expertise[16]. These courses can get someone with basic knowledge of hadoop ecosystem to understand how to deploy, manage, build, integrate and analyze Pivotal HD/HAWQ applications on clouds.

## 8. CONCLUSION

Pivotal HD/HAWQ is the Apache Hadoop native SQL database for data science and machine learning workloads. With Pivotal HDB we can ask more questions on data in Hadoop to gain insights into data by using all the available cloud resources without sampling data or moving it into another platform for advanced analytics. Its fault tolerant architecture can handle node failures and move the workload around clusters.

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