

MapReduce and Parallel DBMSs: Together at Last

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Today's Talk

- SIGMOD '09
 - *A Comparison of Approaches to Large-Scale Data Analysis*
- CACM '10
 - *MapReduce and Parallel DBMSs: Friends or Foes?*
 - *Compare/Contrast with Jeffrey Dean & Sanjay Ghemawat (Google)*

contributed articles

MapReduce complements DBMSs since databases are not designed for extract-transform-load tasks, a MapReduce specialty.

MapReduce and Parallel DBMSs: Friends or Foes?

THE MAPREDUCE (MR) PARADIGM has been hailed as a revolutionary new platform for large-scale, massively parallel data access.¹³ Some proponents claim the extreme scalability of MR will relegate relational database management systems (DBMSs) to the status of legacy technology. At least one enterprise, Facebook, has implemented a large data warehouse system using MR technology rather than a DBMS.¹⁴ ... More, we argue, that MR tends to perform

DBMS, as it quickly loses large amounts of data in an ad hoc manner. As such, we believe DBMS technology should compete with it. We also believe that the differences in the architectures of MB systems and DBMSs are significant and provide insight into the systems that should compete.

The methodology section

Outline

- **Introduction**
- **Benchmark Study & Results**
- **Sweet Spots**
- **Together At Last**
- **Concluding Remarks**



Benchmark Environment

- Tested Systems:
 - *Hadoop (MapReduce)*
 - *Vertica (Column-store DBMS)*
 - *DBMS-X (Row-store DBMS)*
- 100-node cluster at Wisconsin
- Additional configuration information is available on our website.



Benchmark Tasks

- Original MR Grep Task:
 - *Find 3-byte pattern in 100-byte record*
 - *Dean et al. (OSDI '04)*
- Analytical Tasks:
 - *Web Log Aggregation*
 - *Table Join with Aggregation*
 - *User-defined Function*

Results Summary

| | Hadoop | DBMS-X | Vertica |
|-----------|----------|---------|---------|
| Grep Task | 284 sec | 194 sec | 108 sec |
| Web Log | 1146 sec | 740 sec | 268 sec |
| Join | 1158 sec | 32 sec | 55 sec |

- Full results are available in our SIGMOD & CACM papers.

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Extract-Transform-Load

- “Read Once” data sets:
 - *Read data from several different sources.*
 - *Parse and clean.*
 - *Perform complex transformations.*
 - *Decide what attribute data to store.*
 - *Load the information into a DBMS.*
- Allows for quick-and-dirty data analysis.

Semi-Structured Data

- MapReduce systems can easily store semi-structured data since no schema is needed:
 - *Typically key/value records with a varying number of attributes.*
- Awkward to store in relational DBMS:
 - *Wide-tables with many nullable attributes.*
 - *Column store fairs better.*

Limited Budget Operations

- MapReduce frameworks:
 - *Community supported and driven.*
 - *Attractive for projects with modest budgets and requirements.*
- Parallel DBMSs are expensive:
 - *No open-source option.*

Together At Last?

- What can *MapReduce* learn from *Databases*?
 - *Fast query times.*
 - *Schemas.*
 - *Supporting tools.*
- What can *Databases* learn from *MapReduce*?
 - *Ease of use, “out of box” experience.*
 - *Attractive fault tolerance properties.*
 - *Fast load times.*



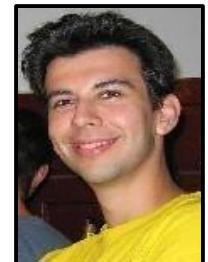
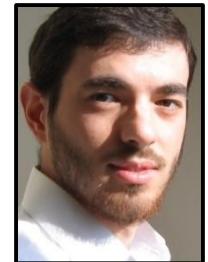
MR+DBMS Integration

- Vertical now integrates directly with Hadoop:
 - *Hadoop jobs can use Vertical as input source.*
 - *Push Map/Reduce tasks down directly into DBMS nodes.*
- Other notable commercial MR integrations:
 - *Greenplum*
 - *AsterData*
 - *Sybase IQ*



MR+DBMS Integration

- HadoopDB (Yale+Brown):
 - *Replace Hadoop's distributed file system with multiple database instances.*
 - *Rewrite Hive query plans into localized SQL for each execution node.*
- Position available for HadoopDB @ Yale



Other Work

- MRI (Wisconsin):
 - *Improving Hadoop by adding DBMS technologies that are transparent to users.*
 - *Ported GiST Search Trees to Hadoop.*
- SQL Server 2008 R2 (Microsoft):
 - ~~*Including “MapReduce-like” functionality into parallel data warehouse version of MSSQL (Project Madison)*~~



Conclusion

- Complete benchmark information and source code is available at our website:
 - *<http://database.cs.brown.edu/sigmod09/>*
- Questions/Comments?