

# Distributed Computing

at *rackspace*<sup>®</sup>

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**About: Me**

**ME**

## About: Me

- **09 Tech grad**
- **B.S. Computer Engineering**
- **4 years at rackspace**

## About: Rackspace



## About: Rackspace

- **Managed + Cloud hosting**
- **Cloud Applications:**
  - **Email**

## About: Rackspace

- **Office in Blacksburg**
- **100 best companies to work for**
- **We're hiring!**

## The Big Picture

Data is **VALUABLE**

Data is growing

- More sources + more data per source
- Faster than individual devices
- Years of information

## **The Big Picture: Rackspace**

# **At Rackspace e-mail**

- **2.5 Million mailboxes**
- **50-100 Million messages / day**
- **300-400 GB raw log data / day**
- **Hundreds of servers**
- **TBs of stored log data**



# The Big Picture: Rackspace

## How do we...

- **Aggregate**

- **Store**

- **Analyze**

- **Access**



# The Big Picture: Rackspace

**How do we...**

**Get Value?**

## **The Problem**

**With mail logs, we can:**

- **Help customers**
- **Diagnose the system**
- **Understand and plan**

## Aggregation

- **Multi-Source Single-Sink**
- **Realworld network**
- **Hardware Failure**



## Storage



- **Distributed**
- **Fault tolerant**
- **Horizontally scalable**
- **Easy**

## **Serving Logs**

**Make logs accessible for:**

- **Support to help customers**
- **Operations to diagnose errors**

## Serving Logs

### The challenge: Volume

- **400+ GB / day = 300 MB / min**
- **Must be timely**
- **Related log data may be disjoint**

## Serving Logs



- Index data with Hadoop MapReduce
- Serve indexes in Solr



## Serving Logs: Indexing



### Map Reduce:

- History on distributed systems:
  - Google
- Easily distributed
- Map step: key->value pair
- Reduce step: All values for a key

## Serving Logs: Indexing



### Map Reduce for mail logs:

- **Map step:**
  - Parse raw log
- **Reduce step:**
  - Aggregate related log lines
  - Generate relevant structure for queries
  - Output as Solr index

# Serving Logs: Indexing

Nov 12 17:36:54 gate8.gate.sat.mlsrvr.com postfix/smtpd[2552]: connect from hostname

Nov 12 17:36:54 relay2.relay.sat.mlsrvr.com postfix/qmgr[9489]: 1DBD21B48AE: from=<mapreduce@mailtrust.com>, size=5950, nrcpt=1 (queue active)

Nov 12 17:36:54 relay2.relay.sat.mlsrvr.com postfix/smtpd[28085]: disconnect from hostname

Nov 12 17:36:54 gate5.gate.sat.mlsrvr.com postfix/smtpd[22593]: too many errors after DATA from hostname

Nov 12 17:36:54 gate2.gate.sat.mlsrvr.com postfix/smtp[15928]: 732196384ED: to=<mapreduce@mailtrust.com>, relay=hostname[ip], conn\_use=2, delay=0.69, delays=0.04/0.44/0.04/0.17, dsn=2.0.0, status=sent (250 2.0.0 Ok: queued as 02E1544C005)

Nov 12 17:36:54 gate5.gate.sat.mlsrvr.com postfix/smtpd[22593]: disconnect from hostname

Nov 12 17:36:54 gate10.gate.sat.mlsrvr.com postfix/smtpd[10311]: connect from hostname

Nov 12 17:36:54 relay2.relay.sat.mlsrvr.com postfix/smtp[28107]: D42001B48B5: to=<mapreduce@mailtrust.com>, relay=hostname[ip], delay=0.32, delays=0.28/0/0/0.04, dsn=2.0.0, status=sent (250 2.0.0 Ok: queued as 1DBD21B48AE)

Nov 12 17:36:54 gate20.gate.sat.mlsrvr.com postfix/smtpd[27168]: disconnect from hostname

Nov 12 17:36:54 gate5.gate.sat.mlsrvr.com postfix/qmgr[1209]: 645965A0224: removed

Nov 12 17:36:54 gate2.gate.sat.mlsrvr.com postfix/qmgr[13764]: 732196384ED: removed

Nov 12 17:36:54 gate1.gate.sat.mlsrvr.com postfix/smtpd[26394]: NOQUEUE: reject: RCPT from hostname 554 5.7.1 <mapreduce@mailtrust.com>: Client host rejected: The sender's mail server is blocked; from=<mapreduce@mailtrust.com> to=<mapreduce@mailtrust.com> proto=ESMTP helo=<mapreduce@mailtrust.com>

# Serving Logs: Indexing

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proto=ESMTP helo=<mapreduce@mailtrust.com>

## Serving Logs: Searching



- **Full text search + advanced search features**
- **Supports distributed operation**
- **Horizontally scalable**

### **Our Solr cluster:**

- **Separate from hadoop**
  - **Pulls indexed data and merges into memory**
- **Subset of logs searchable**
- **Shard data based on time**

# **Hadoop Map Reduce**

- **Large sets of data**
  - **100s of GBs per job; potentially TBs**
- **Full power of Map Reduce**
- **Hadoop Streaming**

## Challenges

# Building on top of HDFS

- Easy, but simple
- Custom organization on top of filesystem



## Challenges

# In Flight Refactor

- Original design assumed perfect information
- Redesign around delayed logs/events

# Challenges

- **Parsing Application Logs Requires Domain Knowledge**
- **Develop services based on distributed systems for solutions to use rather than solutions build around technology**

## The Future

- **Streaming vs Batching**
- **Solr Cloud**
- **New Logging solution**

## Takeaway

- **Use of Hadoop + Map Reduce to solve our data problem**
- **Solutions must be created to extract value from growing data**
- **Example of a realworld distributed system**

## **Distributed Systems**

**Big Data is only one of the areas of  
growth in distributed systems**

**We need YOU**

**RackerTalent.com**

# Resources

- [lucene.apache.org/solr](http://lucene.apache.org/solr)
- [hadoop.apache.org](http://hadoop.apache.org)
- [Hadoop: The Definitive Guide](#)

