#### Auditing Big Data for Privacy, Security and Compliance

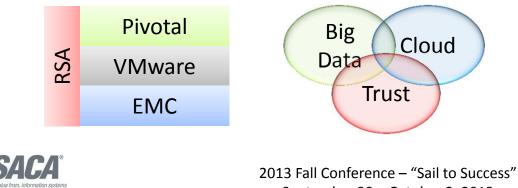
#### Davi Ottenheimer @daviottenheimer Senior Director of Trust, EMC In-Depth Seminars – D21



## Introduction

- Davi Ottenheimer (@daviottenheimer)
  - 19<sup>th</sup> Year InfoSec
  - CISM, Platinum ISACA (1997)
  - Ex-Big 5 Auditor, Ex-PCI QSA/PA-QSA
  - Co-Author "Securing the Virtual Environment"
- @EMCTrustedIT

San Francisco Chapte



## Agenda

- Big Data
- Operations
- Auditing



#### **BIG DATA**



## The Big Data Dilemma

"We have massive amounts of data. We know who you are. We know what your history has been on the airline. We can customize our offerings."

- Delta CEO

"Airlines have yet to find the right balance between being helpful and being creepy."

- Associated Press

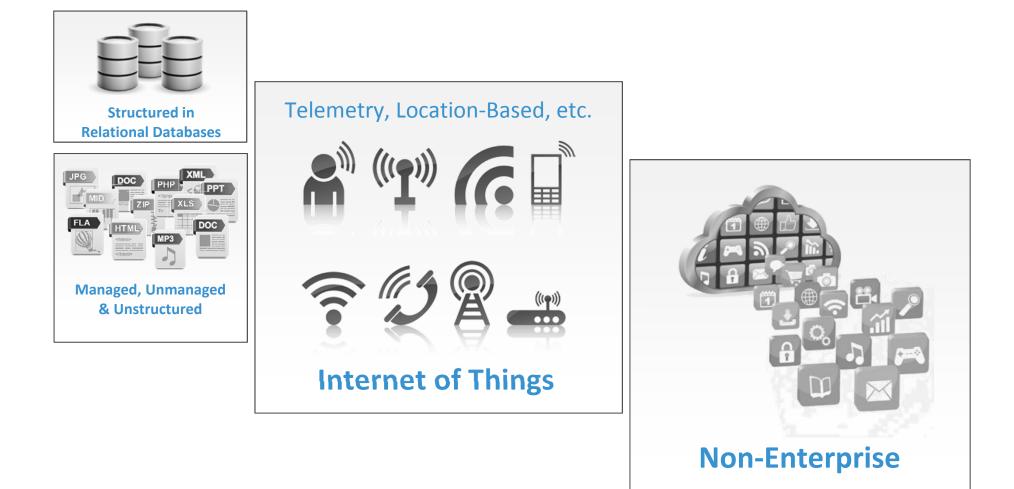
http://m.apnews.com/ap/db\_289563/contentdetail.htm?contentguid=InpMBxrL



**Big Data Definitions Many Long-Standing Examples** - Astronomy ("Billions and billions") - Meteorology (Storms) Geology (Quakes) - Anatomy (Disease) - Economics (Fraud) - Espionage (Echelon SIGINT, PRISM...) Three V's (Volume, Variety, Velocity)

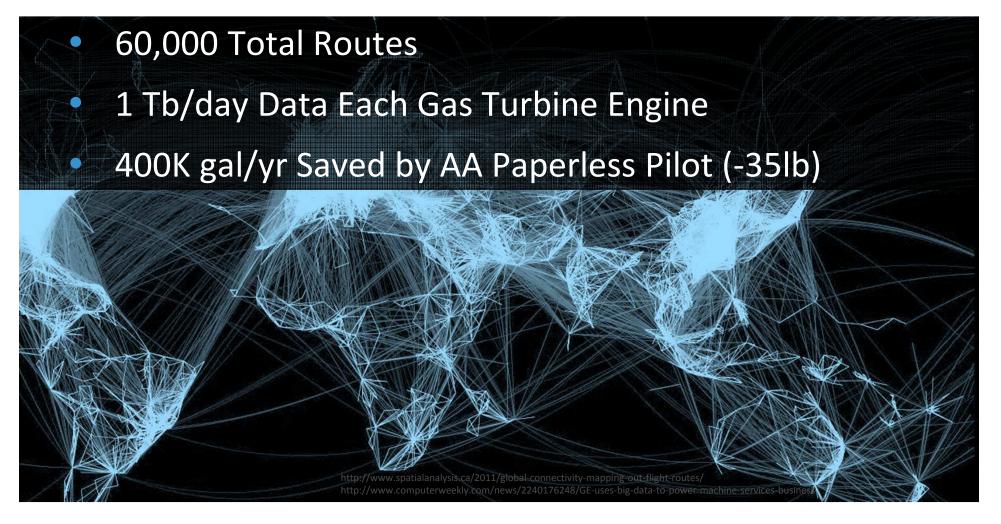


#### Structured + Unstructured Data = Big





# **Global Flight Analysis**





# What is So Pinterest-ing?

Stored and Ready on Login for 70m Users

- Lists
  - Users you follow
  - Boards (and related users) you follow
  - Your followers

user followed by user implicitly

followed

- People who follow your boards
- Boards you follow
- Boards you unfollowed after following a user
- Followers and unfollowers of each board

http://blog.gopivotal.com/case-studies-2/using-redis-at-pinterest-for-billions-of-relationships, http://engineering.pinterest.com/post/55272557617/building-a-follower-model-from-scratch



board unfollowed by user explicitly

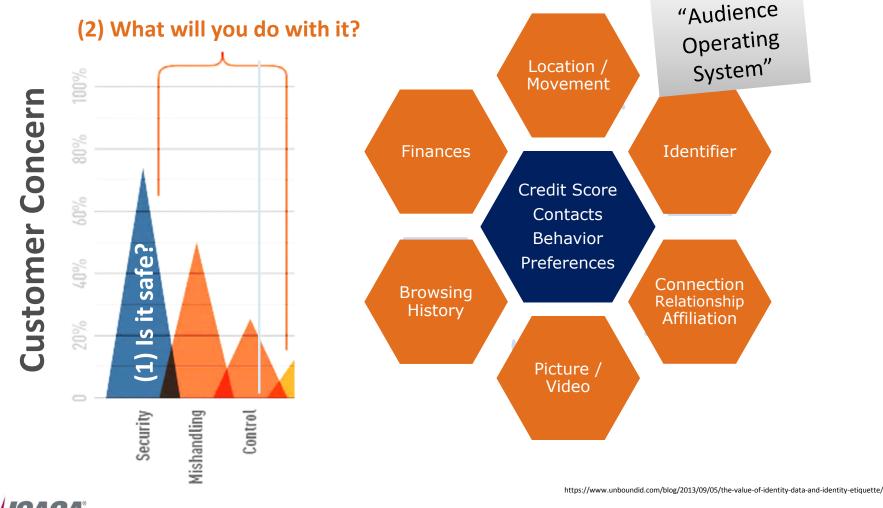
### What Makes Data "Ready"?



#### Where's the Line for Service and Surveillance?



## Should Users Trust?





## Should Users Trust?

"a 26-year-old mother of two teenagersis just about biologically impossible"			"Audience Operating System"
			RIGHT or WRONG?
Age Range	i	Age 26 - 27	<ul> <li>Image: A second s</li></ul>
Gender	i	Female	
Ethnicity Based on Surname		American	
Education	i	Completed College	
College Graduate	1	True	Image: A start of the start
Marital Status	i	Married	×
Presence of Children	i	Children Present	×
Number of Children	i	2 Children	×
Children's Age	1	14 Years old,17 Years old	×
Children's Gender by Age	i	Unknown Gender 11 - 15, Unknown Gender 16 - 17	X

FROM: ABOUTTHEDATA.COM

http://money.cnn.com/2013/09/05/pf/acxiom-consumer-data/index.html



#### Finding Value in Data

Chicago and suburbs = 1.5b • Disease gal/day wastewater Drugs • Environmental Risk

...we know the estimated numbers of people being served by each waste water treatment plant, we can back-calculate daily [drug] loads..."

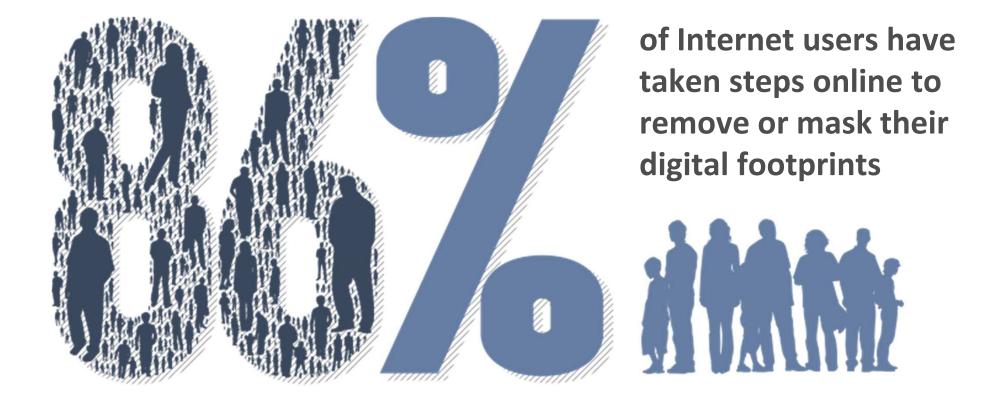
- Dr Kasprzyk-Hordern

http://www.treehugger.com/natural-sciences/fish-near-water-treatment-plants-are-harmed-by-human-drugs

nt-plant-is-the-crappiest-place-on-earth, http://planetearth.nerc.ac.uk/news/story



### **Finding Errors in Data**



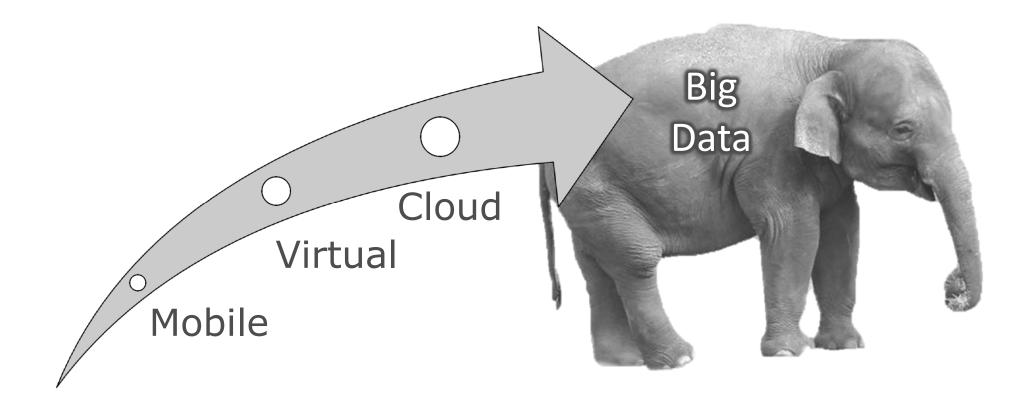
http://pewinternet.org/Reports/2013/Anonymity-online.aspx, http://www.connecture.com/the-connecture-difference/



#### **OPERATIONS**

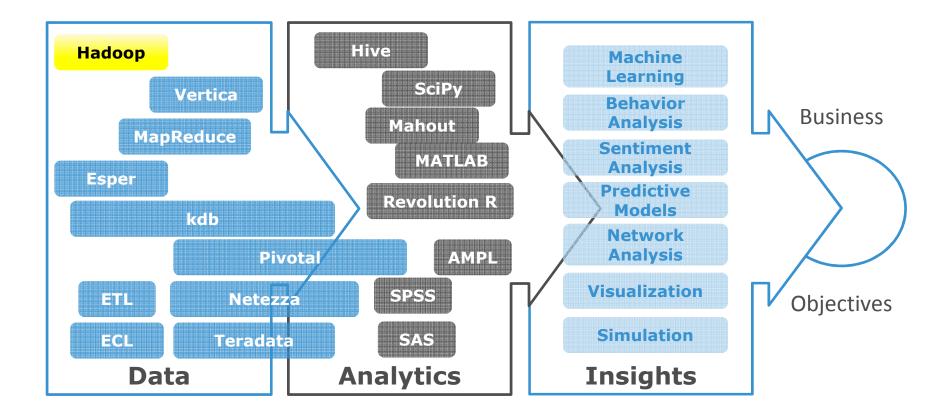


## Transformation of IT





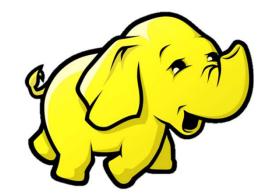
# New Wave of Big Data Technology





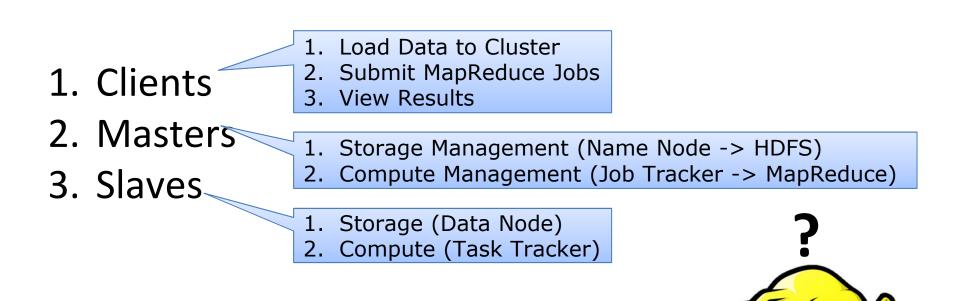
# (Over?) Emphasis on Performance

- Nodes Distributed
- Data Shared
- Access Controls Open
- Networks Open
- Clients Unauthenticated
- Web Services Open



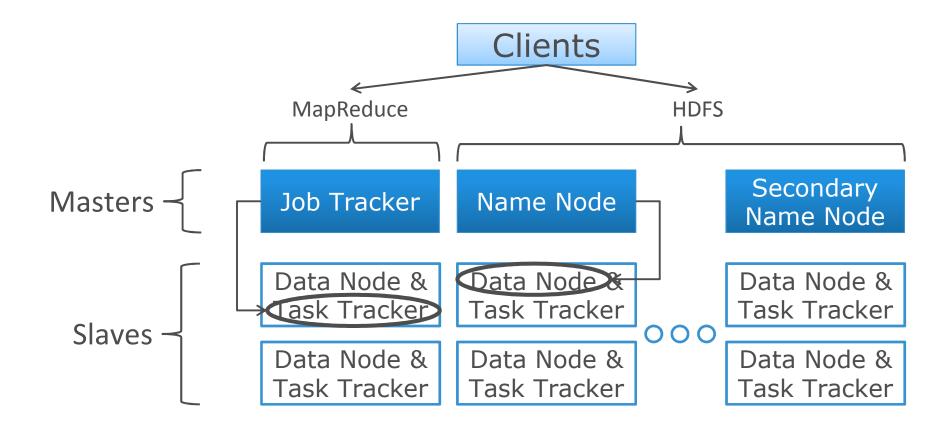


## Hadoop Machine Roles



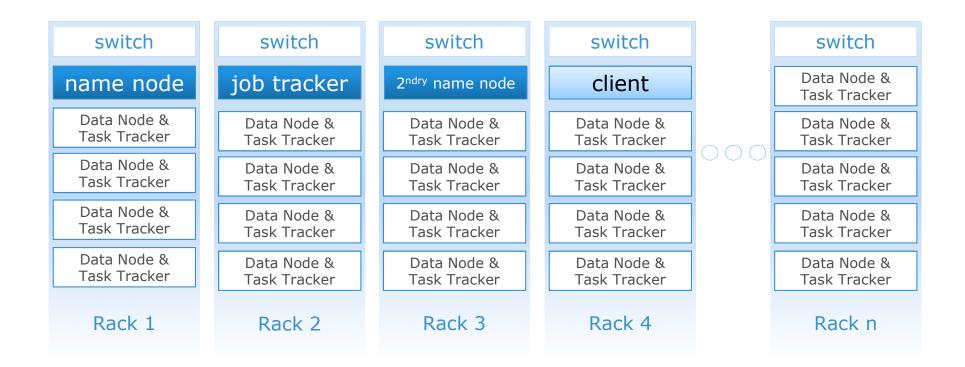


# Hadoop Machine Roles





## Hadoop Cluster



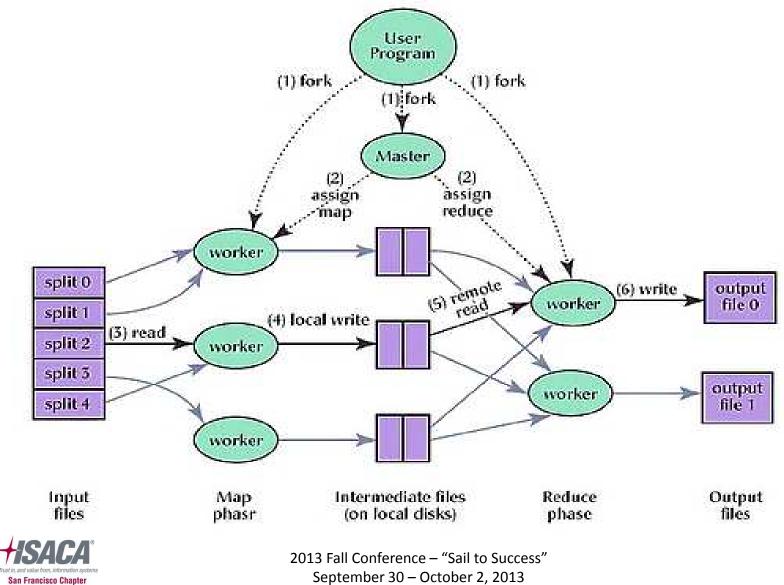


# **Typical Cluster Environment**

- Petabytes
- 10,000s Slots Per Cluster
  - Shared or Dedicated
- Production and Non-Production
  - Mixed Software and Uses

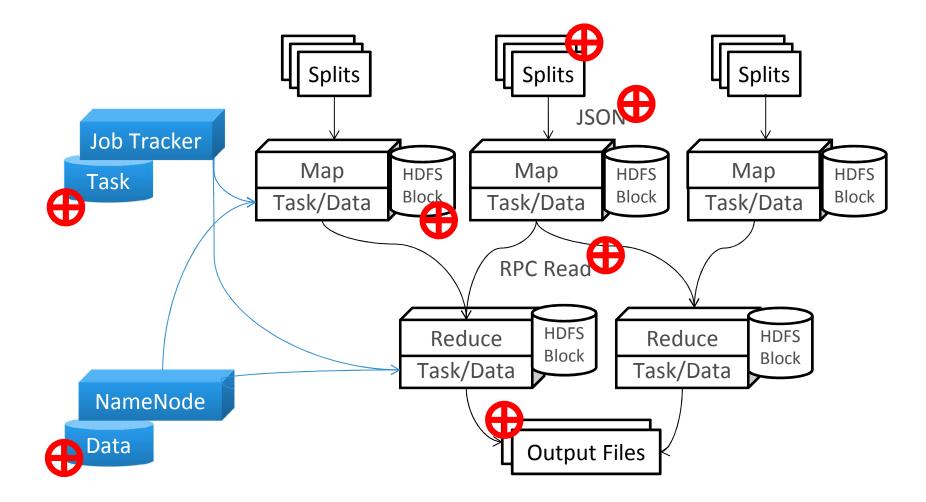


### **Google MapReduce: 2004**



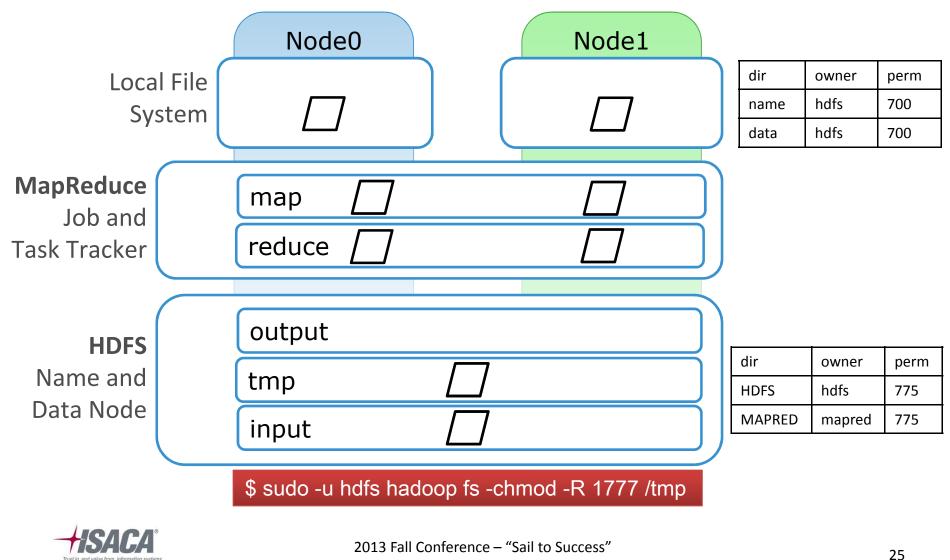
September 30 – October 2, 2013

## MapReduce Today





## MapReduce Today



September 30 – October 2, 2013

nust in and value from

San Francisco Chapter

# Job Perimeter

#### Ad-Hoc

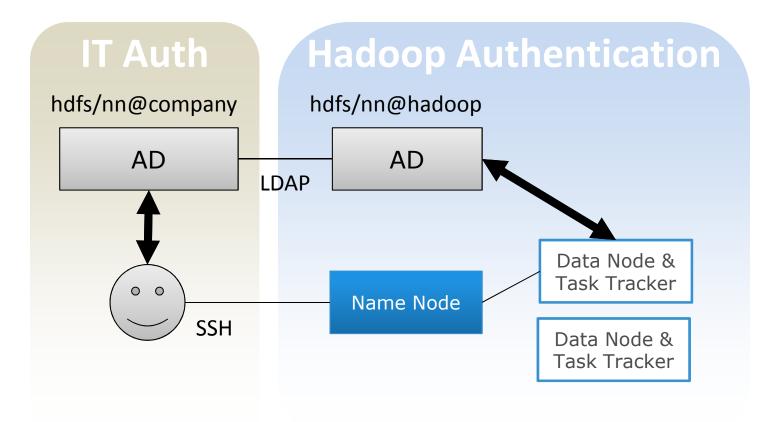
- User Accounts
- Ticket at Login
- Tickets Expire

#### Production

- Batch Accounts
- Tickets from Keytab
- Tickets AutoRenew

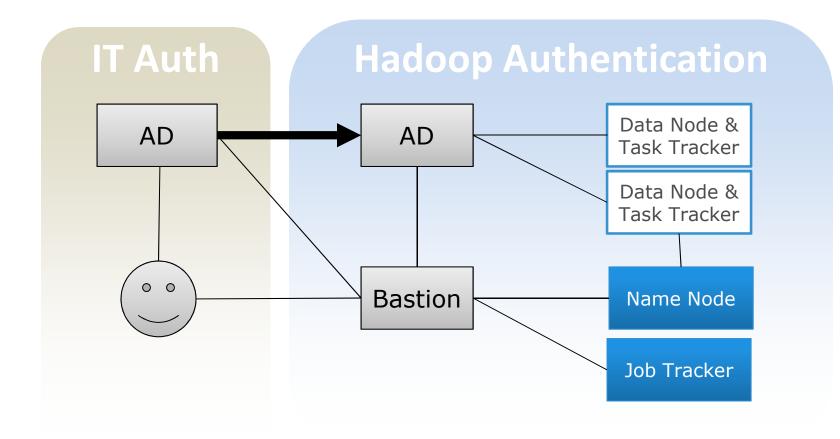


#### **Domain Perimeter**



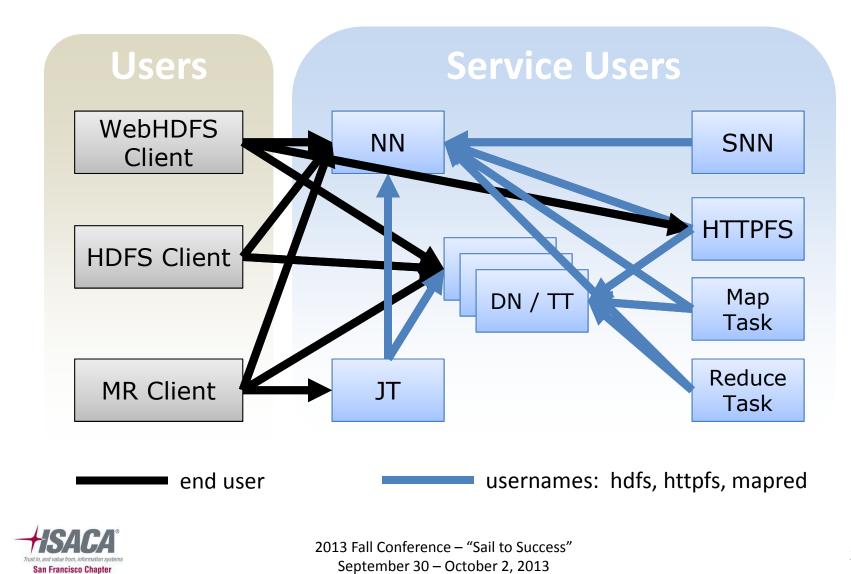


#### **Domain Perimeters**

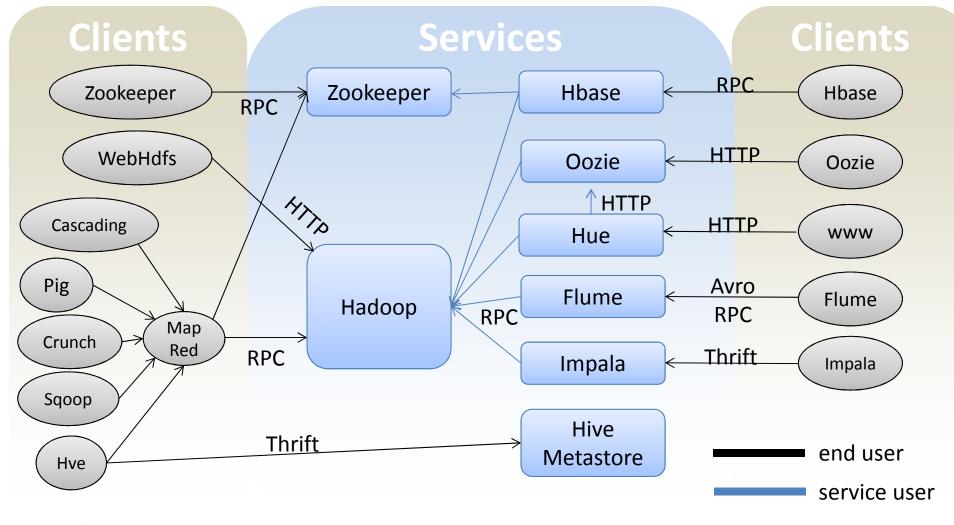




## **Authentication Perimeters?**



## **Authentication Perimeters?**



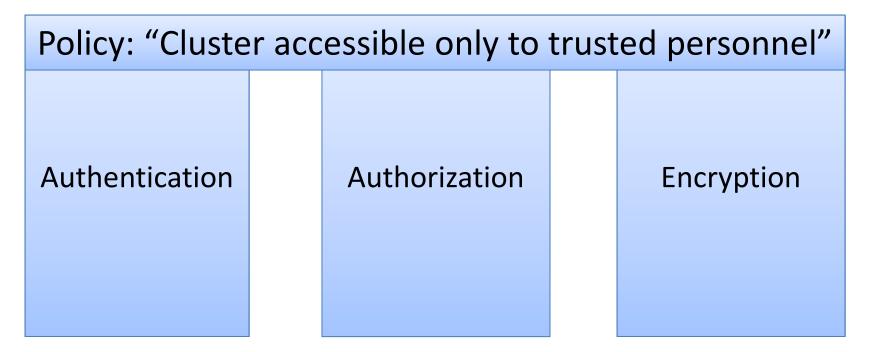


## **Moment of Reflection**

#### **AUDITING**



# **Big Data Security Today**



#### Caveats

- All or Nothing: Nodes without security cannot communicate with secure nodes
- Rolling upgrades to enable cluster security are impossible



## Authentication

- End User to Service
- Service to Service
- Service to Service, for a User
- Job Task to Service, for a User

"Big Data Security Configuration is a PITA. Do only what you really need."

-- 2013 Hadoop Summit



## Authorization

Data

HDFS, Hbase, Hive Metastore, Zookeeper

- obs Hadoop, MR, Pig, Oozie, Hue... <sup>Secure</sup> Impersonation? • Jobs
- Queries

Impala, Drill

https://hadoop.apache.org/docs/stable/Secure Impersonation.html



# Encryption

- Stored Data (Emerging)
  - Data Nodes Only
  - Keys Stored Separate from Data Node Storage
  - Keys for "Secure Process" Not Users
- Transmitted Data
  - RPC Supports Only SASL
  - HTTPS



## Typical "Security" Setup

**Access Controls** 

- 1. Authentication (Kerberos)
- 2. Role Based Authorization (ACLs)
- 3. Identity Management (AD or LDAP)



## **Strong Authentication?**

Older versions ran all daemons as single user (hadoop)

user	process	
hdfs	namenode, datanode, secondary namenode	
mapred	jobtracker, tasktracker, child tasks	

group	users
hadoop	hdfs, mapred

\$ sudo -u hdfs hadoop fs -chmod -R 1777 /tmp



#### Trying to Get to Compliance

- 1. Node Access (Authentication)
- 2. Node API Authentication
- 3. Store Data (Disk Encryption)
- 4. Transmit Data (Net Encryption)
- 5. RBAC (Job ACLs)
- 6. Logs

sudo -u hdfs hadoop fs -rmr /

MitM? root? NIC control?



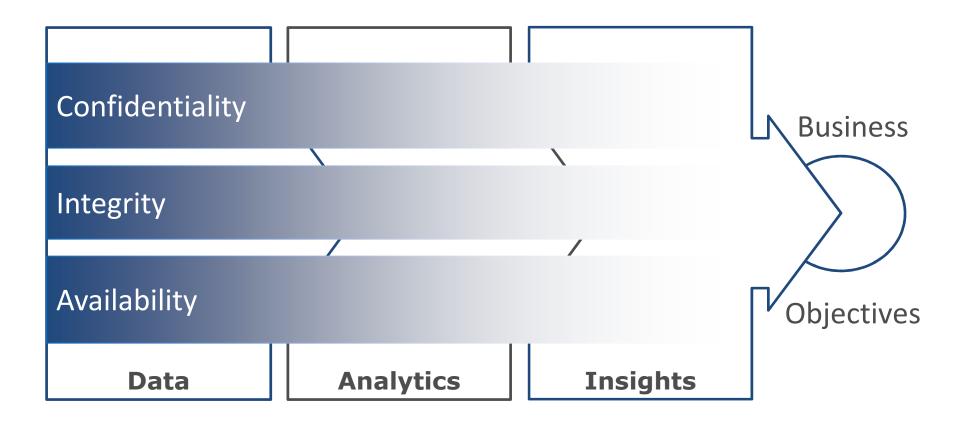
Ease

## **Threat Model Thoughts**

- Confidentiality
  - Regulated Data
  - Intellectual Property
- Integrity
  - Analysis
  - Output
- Availability
  - Data Load
  - Jobs, Analysis



#### Future





#### **Regulated Data Example**

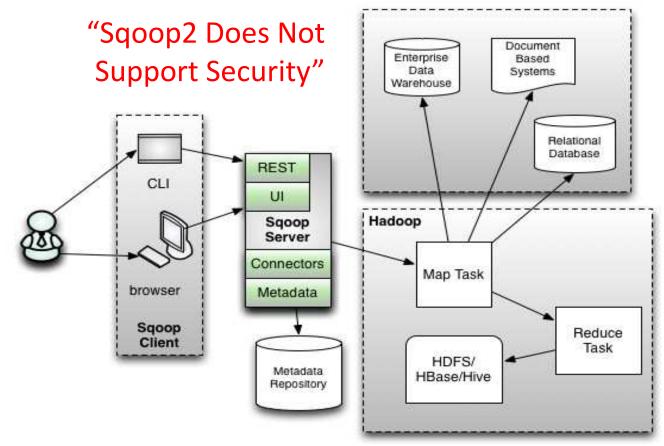
- Confidentiality
  - Stored
  - Transmitted
- Integrity
  - Backup
  - Restore
- Availability

#### **Cost Calculations**

- Error
- Load Time
- Drop Time
- Re-Load Time



#### Regulated Data Example: Sqoop2 Bulk Data Transfer Tool – Import/Export



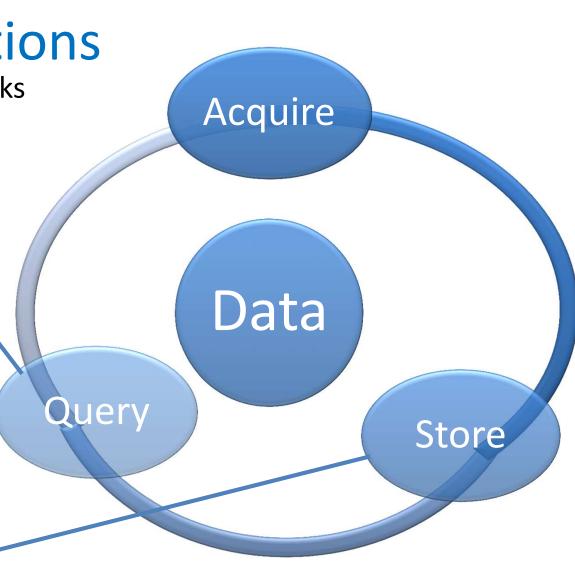
https://blogs.apache.org/sqoop/entry/apache\_sqoop\_highlights\_of\_sqoop



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#### Future Directions Building Controls for Risks • MapReduce

- Pig (simple query language)
- Hive (SQL queries)
- Cascading (workflow)
- Mahout (machine learning)
- Hama (scientific compute)
- Drill (ad-hoc query)
- Hbase (column-orient DB)
- Zookeeper (coordination)
- HDFS

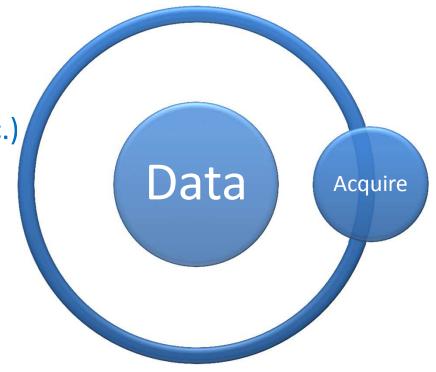




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#### Acquire

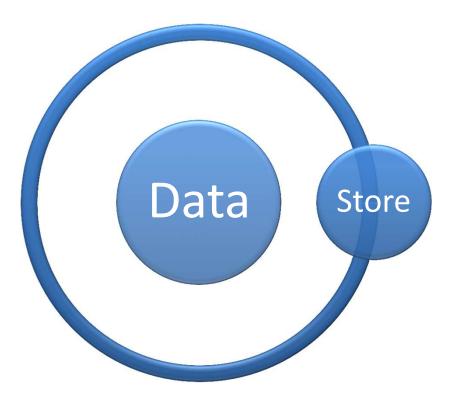
- Data Validation
- Aggregation
  - DOB
  - Age Group (18-24, 25-36, etc.)
- Salt (Noise)
- Imitation (Synthetic)
- Replacement (Swapping)
- Wiping (Suppression)





#### Store

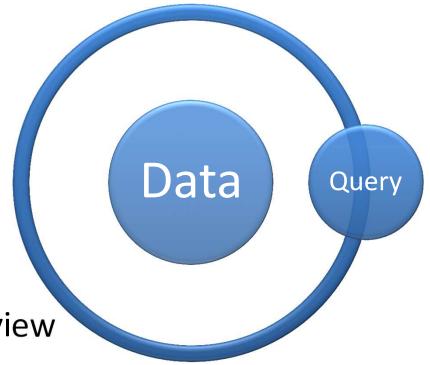
- Encryption
- Unique Users (RBAC)
- API Authentication
- "Hardened Clusters"
- Logs
- Forensics





#### Query

- Encryption
- Unique Users (RBAC)
- Load Restrictions
- Add, Remove, Change Jobs
- Job Alerts
- Scheduling
- Secure Code Practices / Review





### CSA "Securing Big Data"

SQL Security – Old	NoSQL Security –
Config Management	Cell-Level Access Labels
Multi-Factor Authentication	Keberos-Based Authentication
Data Classification	ACLs
Data Encryption	
Consolidated Audit/Report	
Database Firewall	
Vulnerability-Scanner	



#### Example: Accumulo

Cell-Level Access – Distributed Key/Value Store

- NoSQL (HBase) perf...with security
- Timeline
  - 2006 Google BigTable
  - 2008 NSA
  - 2011 accumulo.apache.org

// specify which visibilities we are allowed to see
Authorizations auths = new Authorizations("public");
Scanner scan =

```
conn.createScanner("table", auths);
scan.setRange(new Range("alexander", "snowden"));
scan.fetchFamily("attributes");
for(Entry<Key,Value> entry : scan) {
   String row = entry.getKey().getRow(); Value
   value = entry.getValue();
```



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#### Conclusions

- Big Data
  - Performance Pressure
  - Customer Concern / Backlash
- Operations Risks
  - Perimeter Holes
  - Business Logic Error
  - Weak Policies
- Auditing
  - Trusted Personnel
  - Perimeters



# THANK YOU!

Auditing Big Data for Privacy, Security and Compliance

Davi Ottenheimer @daviottenheimer Senior Director of Trust, EMC In-Depth Seminars – D21

