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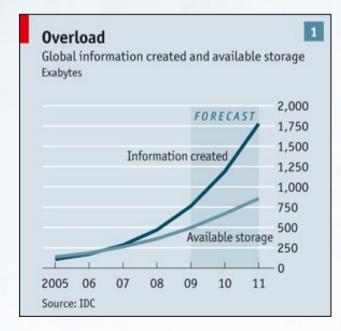
Big Data

Big Data defined

- Scale beyond the limits of conventional data storage solutions today either in terms of capacity or of the sustainable cost of the solution
 - Trillions (10^12) of data items
 - Petabytes (10^15 bytes) of data volume
- Google encountered Big Data in their operations and devised architectural solutions for it, including BigTable
- BigTable is the inspiration for HBase

The Big Data Age

- According to one estimate, globally the world created 150 exabytes of data in 2005
- This year, the world may create more than 1,500 exabytes of data



Medium Data

• "What about Medium Data? We like to say that Facebook doesn't run Hadoop because it has a lot of data, but that Facebook has a lot of data because it runs Hadoop. Businesses that use Hadoop find that keeping data is worthwhile because Hadoop helps them process it in new ways."

Mike Olson, CEO, Cloudera

http://www.cloudera.com/

- Many business, even small ones, during the course of their normal operations can generate petabytes of data per year
- If they retain it, they can mine it and gain insights
- Open source analytics enablers like the Hadoop software ecosystem – of which HBase is a part – make this an emerging reality

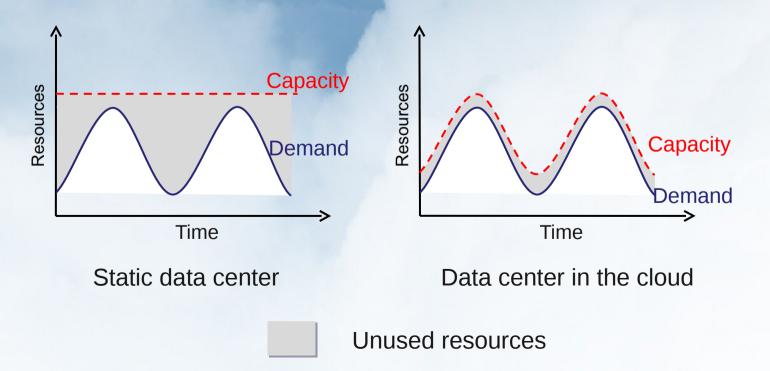
Cloud Computing

- "Internet-based access to highly scalable pay-per-use IT capabilities"
 - Ynema Mangum, SUN Microsystems
- An evolution of network computing

 - Cloud computing is client-server computing that abstracs the details of the server away
 - Scale free
 - Resources anywhere/everywhere
 - Loosely coupled computing
 - Decentralized, open standards
 - Open technologies
 - New ownership model

Cloud Computing

- Scale free computing
- A limitless pool of on demand resources is a game changer
 - Pay by use instead of provisioning for peak
 - Elastic scaling up and down, scale up very large
 - Optimize costs to actual service demand
 - Worry only about the application or service, not about infrastructure

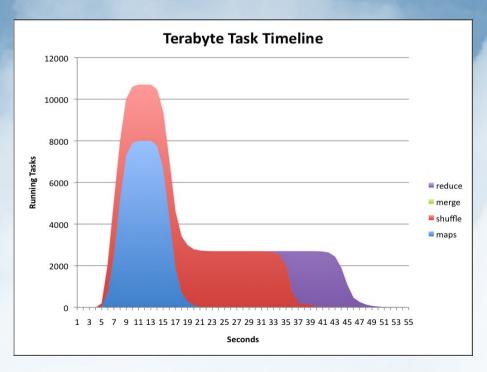


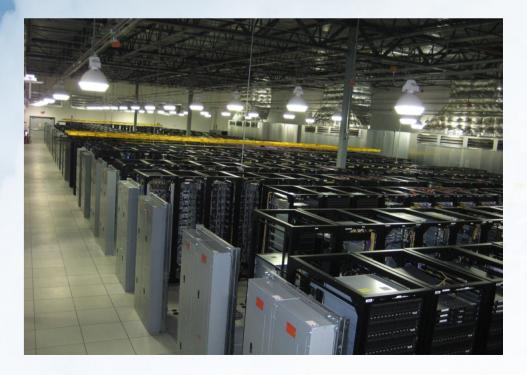
Convergence

- As we enter the age of Big Data we have the scale (and scale-free computational nature) of the Cloud to manage it
- The Cloud is a driver of Big Data even as it is a means to deal with it
- Hadoop and HBase are Cloud scale architectures
 - → Container for Big (and Medium) Data
 - → Scale free computational framework for managing it

Hadoop – The Platform

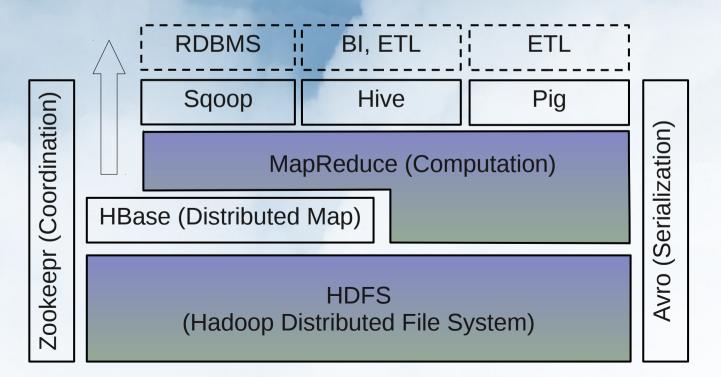
- An elastic and scalable computing platform
- "Cloud scale" grid data processing
 - 10K nodes, 100 million files, 10 petabytes
- 2009 Gray Sort winner: 0.578 terabytes/minute, a new world record
 - Sort a terabyte (1,000,000,000,000 bytes) in 62 seconds
 - Sort a petabyte (1,000,000,000,000,000 bytes) in 16.25 hours





Hadoop – The Ecosystem

- MapReduce framework (Core)
- Pluggable cluster task scheduler (Core)
- Distributed replicated fault tolerant file system (HDFS)
- Horizontally scalable distributed fault tolerant database (HBase)
- Various value adds: Add on packages (analytics, management), distributions, dashboards, etc.



Seek Versus Sort and Merge

- At scale, disk time dominates storage and computation
 - CPU, RAM, and disk size double every 18-24 months
 - Seek time remains nearly constant (~5% per year)
- Two database paradigms
 - Seek dominant: Indexed (B-Tree) seek and replace (RDBMS)
 - Transfer dominant: sort/merge (MapReduce, Bigtable)
- Seek is inefficient compared to transfer at scale
 - Given:
 - 10 MB/second transfer bandwidth
 - 10 milliseconds disk seek time
 - 100 bytes per entry (10 billion entries)
 - 10 kB per page (1 billion pages)
 - Updating 1% of entries (100,000,000) takes:
 - 1,000 days with random B-Tree updates
 - 100 days with batched B-Tree updates
 - 1 day with sort and merge

→ Log structured data access on streaming filesystem

HBase – The Hadoop Database

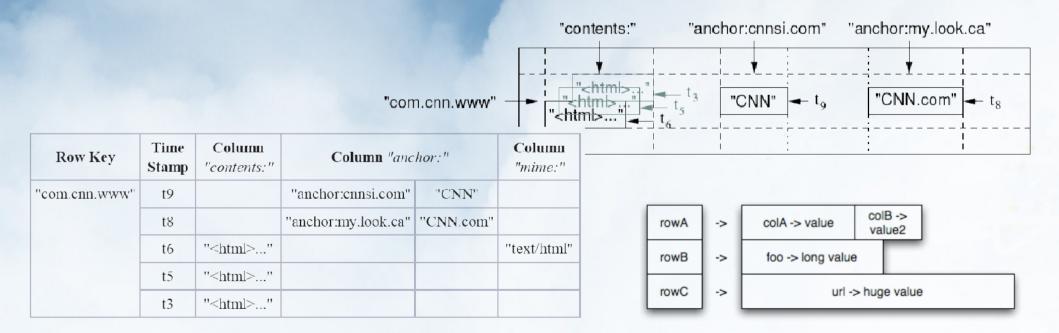
- A persistent distributed hash map
 - ... and separate namespaces
 - → Tables
 - ... and an index
 - → Rows
 - ... and locality of I/O references
 - → Column families
 - ... and time ranges
 - → Timestamps

HBase – The Hadoop Database

- Google: "BigTable is a distributed storage system for managing structured data that is designed to scale to a very large size: petabytes of data across thousands of commodity servers"
- Goal: Store billions of rows * millions of columns * thousands of versions
- An open source version of BigTable, enhanced with additional features developed by the community
- A Hadoop subproject
 - The usual ASF things apply (license, JIRA, etc)
- To handle Big Data, we discard transactions and relational data models
 - No distributed transactions
 - No complex locking
 - No waits or deadlocks
 - Update through sort and merge instead of seek and replace

Data Model

- Distributed persistent sparse map
- Multidimensional keys <row>, <column>:<qualifier>, <timestamp>
- Keys are arbitrary strings
- Data grouped by columns
- Access to row data is atomic
- Multiversioning and timestamps avoid edit conflicts caused by concurrent decoupled processes

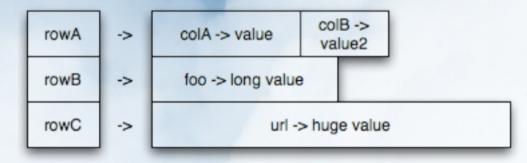


Grouped by Columns?

• Not a spreadsheet

	COLA	colB	colC	colD
rowA				
rowB				
rowC			NULL?	
rowD				

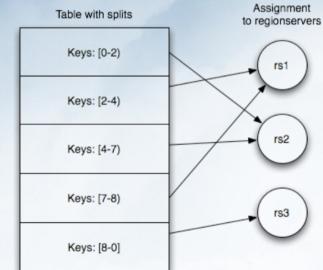
Instead, think of tags

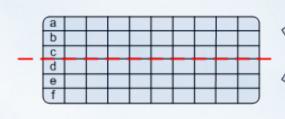


Values of any length, no predefined names or widths

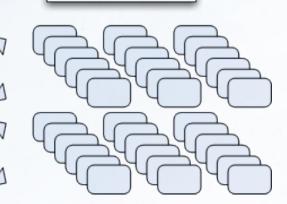
Tables And Regions

- Rows are stored in byte-lexographic sorted order
- Tables are dynamically split into regions
- Regions are hosted on a number of regionservers
- As regions grow, they are split and distributed evenly among the storage cluster to level load
 - Splits are "almost" instantaneous
 - Fine grained load balancing
 - Regions are migrated away from highly loaded nodes
 - Enables fast recovery
 - Master rapidly redeploys regions from failed nodes to others









Integration with Hadoop

- With HDFS
 - HBase relies on DFS replication for data durability and availability
 - WAL uses append feature
 - Without HDFS, regions could not be migrated
 - HBase compaction interacts favorably with HDFS block placement
- With ZooKeeper
 - Track cluster membership and detect dead servers
 - Supports master election and recovery in multi-master deployments
 - Automatic Master failover
 - Rolling upgrades of point releases
 - Modify some cluster configuration without full cluster restart

Integration with Hadoop

- With MapReduce
 - TableInputFormat
 - TableOutputFormat
 - Splits correspond to regions for optimal I/O
 - Tasks scheduled on RegionServers hosting the table regions
- This is first class integration into the Hadoop stack

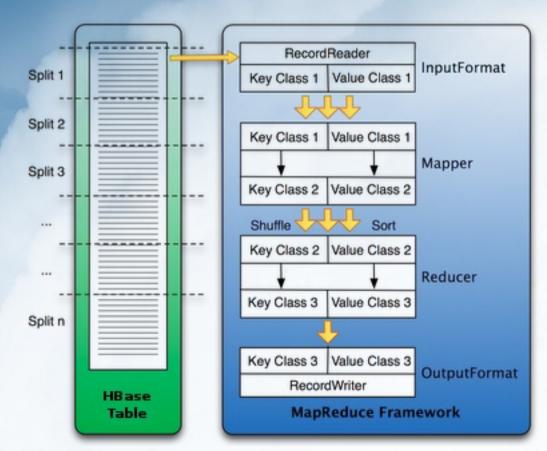


Image credit: Lars George

Integration with Hadoop

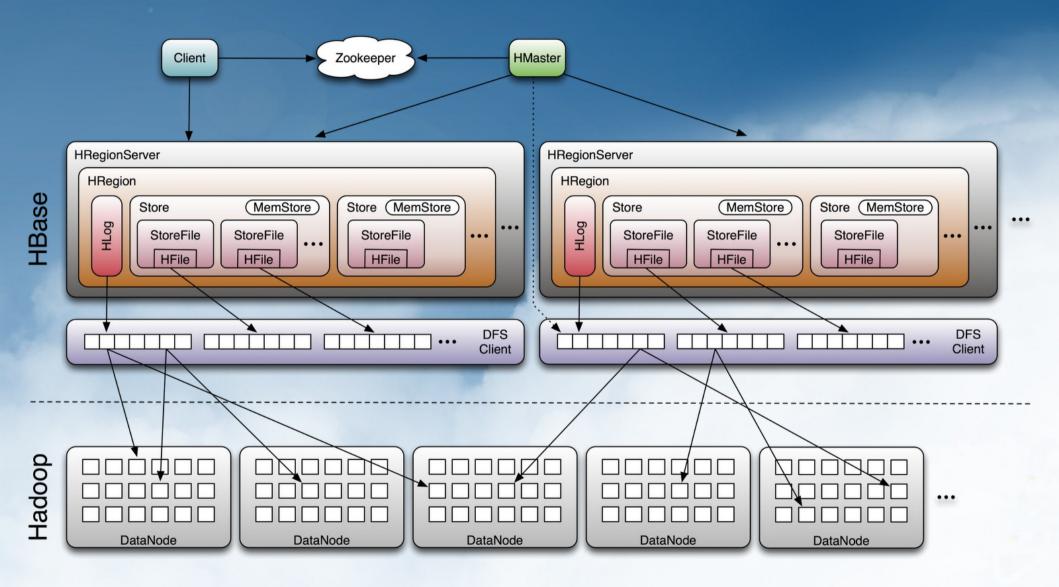


Image credit: Lars George

The End

- Q&A
- Contact info:

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HBase Coprocessors

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BigTable Coprocessors

- Inspired by Google Bigtable Coprocessors (Jeff Dean's keynote talk at LADIS 09)
 - Arbitrary code that runs at each tablet in table server
 - High-level call interface for clients
 - Calls addressed to rows or ranges of rows. coprocessor client library resolves to actual locations
 - Calls across multiple rows automatically split into multiple parallelized RPC
- Very flexible model for building distributed services
 - Automatic scaling, load balancing, request routing for app
- Example use cases
 - Scalable metadata management for Colossus
 - Distributed language model serving for machine translation system
 - Distributed query processing for fulltext indexing support
 - Regular expression search support for code repository





HBase Coprocessors

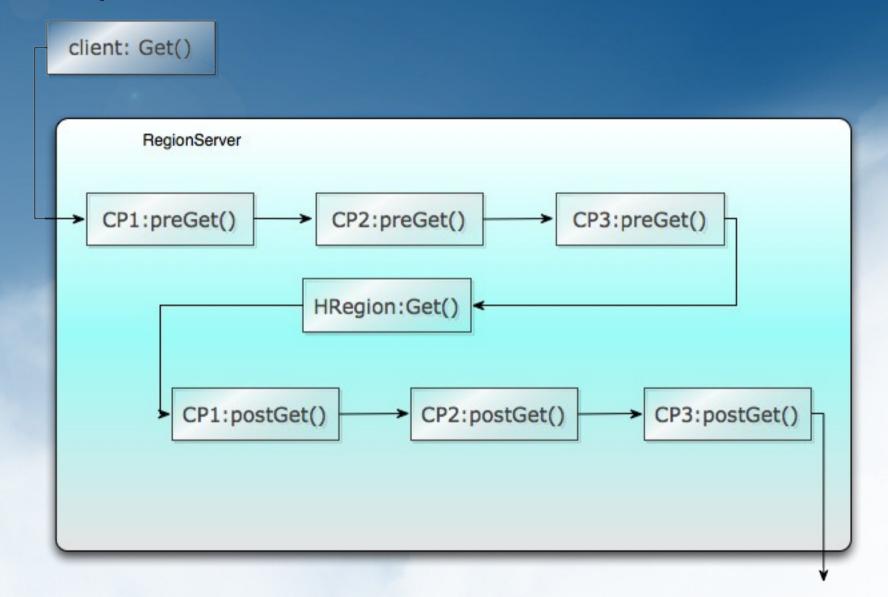
- Inspired by BigTable Coprocessors
 - Also a generic extension mechanism
 - But reimagined as a server extension framework
- Coprocessors extend base HBase function
 - In the site configuration (system coprocessors)
 - Using a table attribute (table coprocessors)
 - Table attribute is a path (e.g. HDFS URI) to jar file
 - Jar is loaded into the regionservers when table regions are opened
 - New functionality becomes part of the regionserver implementation and runs in process
 - Lifecycle methods
 - RegionObserver: Watch or change when clients interact with regions
 - Endpoint: Provide a new service via dynamic RPC
- No more mutually exclusive subclassing of RegionServer implementation and RPC interfaces!







Example



client response







Extension Interfaces

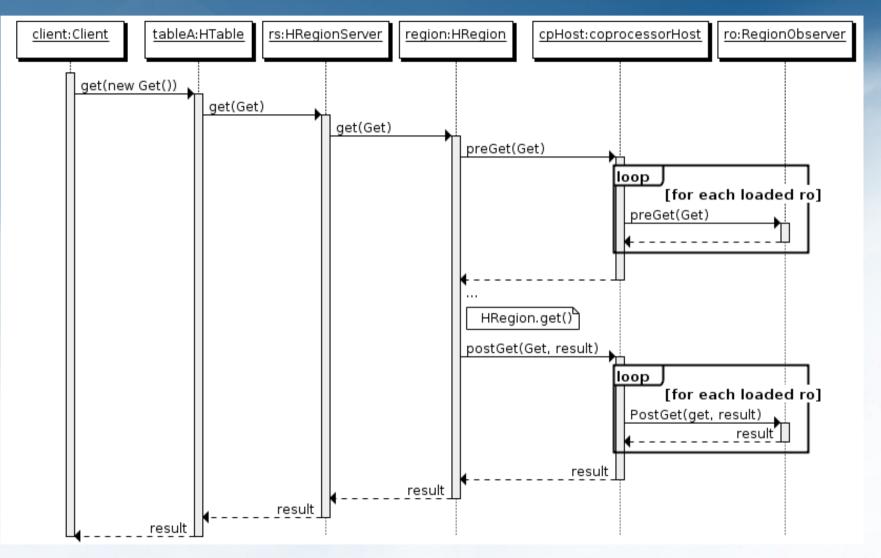
- Coprocessor
 - Basic lifecycle events: Start, stop
 - Region housekeeping: Open, flush, compact, split, close
- Observer
 - RegionObserver
 - If a coprocessor implements this interface, it will be interposed in all region actions via upcalls
 - Provides hooks for client side requests: get, put, delete, etc.
 - Chaining of multiple observers by priority; mediators can be chained ahead of watchers to implement security policy extensions
 - MasterObserver
 - If a coprocessor implements this interface, it can intercept administrative actions taken at the master for a region (load balance, enable/disable, etc.)
 - How to develop an Observer
 - Implement interface and override upcall methods





Extension Interfaces (cont.)

Observer

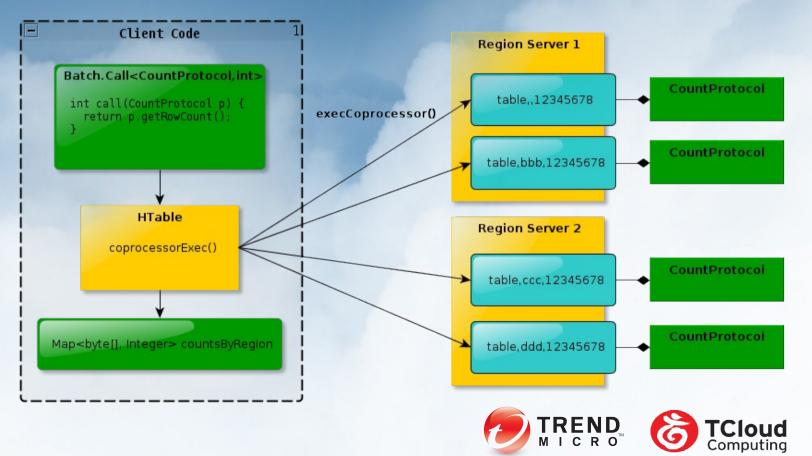






Extension Interfaces (cont.)

- Endpoint
 - Provides a way to define one's own protocol communicated between client and RegionServer, and execute arbitrary code in the RegionServer process
 - The communication protocol between the HBase client and RegionServer is extended at runtime without recompilation





Extension Interfaces (cont.)

- Endpoint
 - How to develop an Endpoint
 - Define the protocol interface (extends CoprocessorProtocol)
 - Implement this protocol interface
 - Extend BaseCommandTarget so protocol will be automatically registered at coprocessor load
 - On client side, the Endpoint can be triggered by:
 - HTable.proxy() single region
 - HTable.exec() region range





Current Projects

Access control

- Build access control into HBase using the Coprocessor framework
 - Fine grained execute permissions by table, role, creating user/role, executing user/role
 - Different security models can be implemented as coprocessors
- Meta JIRA is HBASE-1697
- Some early work as HBASE-3025
 - Reject data access by nonauthorized user according to ACL
 - Keep ACLs in META table
 - Use ZooKeeper to propagate ACL changes made to META via put() or delete() to permissions caches on all RegionServers
- Remaining work
 - Add Kerberos plugin to ZooKeeper so ZK auth and ACLs can be managed in a seamless manner with HBase ones
 - Master side coprocessor hooks to get control over admin ops



Current Projects

- Aggregate operators
 - HBASE-1512
 - Add aggregate table ops as dynamic RPC extensions via Endpoint
 - count(), sum(), average(), etc.
 - Preliminary patch on issue
 - If you have interest, we encourage you to participate in the design of this feature via the JIRA



Interesting Ideas

- Computational frameworks
 - Cascading (cascading.org) execution target: Compiler and runtime support for partitioning work over HBase cluster and executing assemblies in parallel where the data is located
 - Streaming data processing framework
- HDFS-DNN
 - Proof-of-concept code for replacing the HDFS NameNode with HBase
 - This is roughly the architecture of Google's GFS2
 - Scalable nameservice, no more NameNode singleton reliability, availability, and scalability concerns
- FuzzyTable
 - Fuzzy matching against keys that encode high dimensional data
 - Application domain is low latency biometrics search





Future Direction

- Code weaving
 - Start with allowing arbitrary code
 - Use a rewriting framework like ASM to weave in policies at load time
 - Build policies over time which improve fault isolation and system integrity protections
 - Wrap heap allocations to enforce limits
 - Insert monitor code in loop headers to detect and throw execeptions if CPU time limits are exceeded, e.g. Infinite loops
 - Reject APIs considered unsafe
- Parallel computation framework
 - Hadoop MapReduce API (mappers, reducers, partitioners, intermediates) but parallel region MapReduce ?
 - Stream processing paradigm
 - Cascading or S4



The End

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Secure HBase

Hadoop Group @ Trend Micro: Andrew Purtell, Gary Helmling, Joshua Ho, Eugene Koontz, Mingjie Lai





Background

- No real security in Hadoop 0.20.x and prior
 - User impersonation trivial
 - No mutual client/server authentication
 - File permission enforcement assumes good actors
 - Instead clusters secured at the perimeter
 - With no FS security, HBase security would make no sense
- Security features in Yahoo Hadoop 0.20.S and ASF Hadoop 0.21+
 - Strong authentication using Kerberos
 - Mutual authentication of RPC connections
 - Data isolation at HDFS level
 - Multiple groups can share the same cluster
 - HBase security now a possibility



Overview

- Why?
 - User isolation (control over your data)
 - Multi-tenancy: private and public cloud
- What is it?
 - Client access to HBase is authenticated
 - User data is private unless access has been granted
 - Access to data can be granted at a table or per column family basis
- What is it not?
 - Row-level or per value (cell)
 - Push down of file ownership to HDFS
 - Full Role Based Access Control



Concepts

- Authentication
 - Who are you?
- Authorization
 - Can user A do action X within context Y?
- Isolation
 - System-wide concern
 - Requires enforcement of authorization internally
 - Authorization useless if system leaks data in other ways
 - Observability of storage files
 - Eavesdropping on data in transit



Authentication

- Need to be able to confirm identities
- Building on Secure Hadoop RPC
 - Client authentication based on Kerberos
 - allows servers to verify client credentials with trusted third party
 - Secure RPC based on SASL
 - can provide confidential communications between HBase clients and servers via GSSAPI/Kerberos
 - also supports DIGEST-MD5 authentication, allowing Hadoop delegation token use for MapReduce



Authorization

- Default deny policy full user isolation
- Permissions
 - Read, Write, Execute, Create, Admin
- Permission Grants
 - Principal: user or group
 - Scope: table, optional column family
 - Permissions
- Built-in Roles
 - Superuser: full access
 - Table owner: full access to table, plus delegation



Isolation

- Optional RPC encryption with SASL
- Secure Hadoop
 - HDFS permissions to restrict access
 - Table HFiles owned by HBase system user
- HBase mediates access to table data
 - column family granularity
 - -ROOT- and .META. readable by all
 - potential leakage of row key data



How?

- Access Control Lists (ACLs)
 - Store combination of principal, scope, permissions
- Coprocessors
 - Intercept data operations to perform authorization checks
- Permission Synchronization : .META. to ZK to RegionServers
 - Reflects ACL changes across entire cluster



Access Control Lists

Canonical Storage : .META.'s acl: column family

Logical							
Principal	Table:ColumnFamily	Permissions					
humphrey	foo:*	{READ,WRITE}					
.META. acl:							
Row	Qualifier	Value					
foo,,1286569	humphrey	RW					

Client interface

hbase shell 'grant' command:

```
hbase> create 'foo', 'f1'
hbase> grant 'herbert', 'RW', 'foo'
hbase> scan '.META.'
ROW COLUMN+CELL
foo,,1286569... column=acl:herbert, timestamp=1286569..., value=RW
```



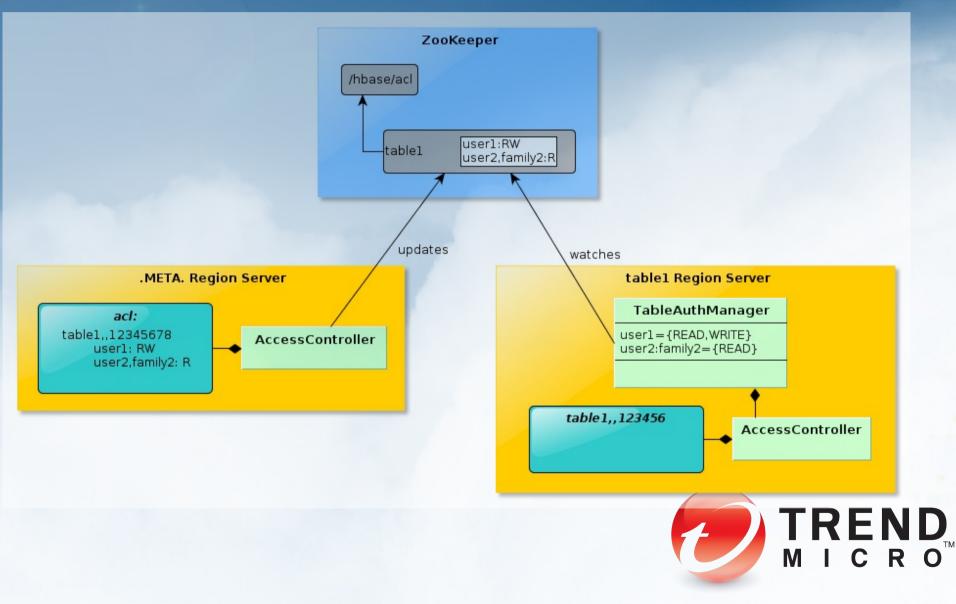
Coprocessors

- AccessController: the "checking" in permissions checking
 - Anatomy of a client request

	Component	User	Action	Class	Method
1	client	U	sends IPC call C: <u,'get',t> to regionserver.</u,'get',t>	HTable	get()
2	regionserver	S	Receives C: <u,'get',t>.</u,'get',t>	HBase	processData()
3	regionserver	$S \to U$	U.doAs('get',T)	Server	run()
4	regionserver	U	<pre>Check in-memory Permission Mirror: UserPerms = getUserPermissions(UserGroupInformati on.getCurrentUser(),T)</pre>	Access Controll er	preGet()
5	regionserver	U	<pre>if (UserPerms imply Get) then return; else throw AccessDeniedException;</pre>		
6	client	U	Receives either get() return value or AccessDeniedException	HTable	get()
				t	

Synchronizing ACLs

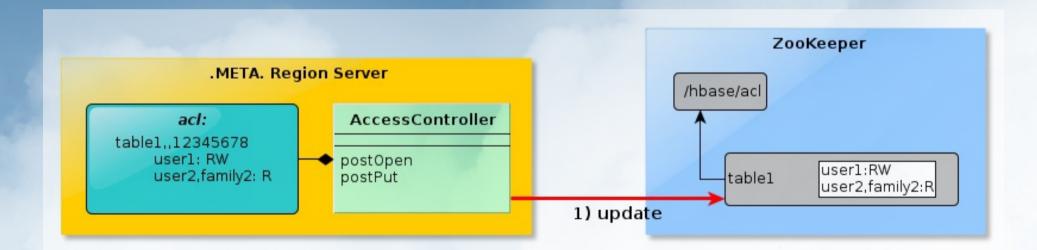
.META. -> ZK -> Region servers



Synchronizing ACLs

1).META. To ZooKeeper

- On initial load populates ZK znode per table
- · Grant updates to .META. also update ZK
- 2)ZooKeeper to RegionServers

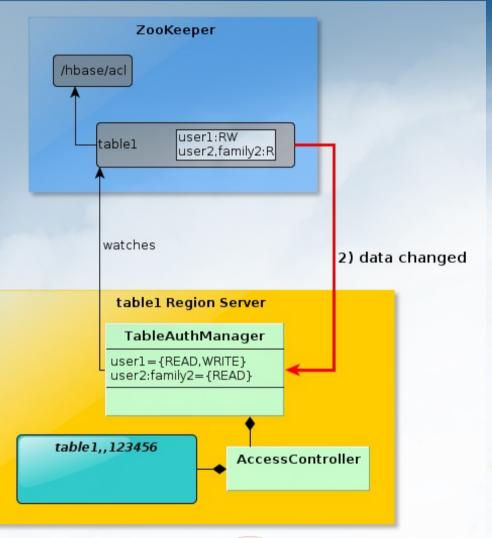




Synchronizing ACLs

META. To ZooKeeper ZooKeeper to RSs

- · Znode watcher notified of data change
- New permissions loaded into local cache





Next Steps

- Handling of Master Operations
 - Create and Admin permissions
- Delegation token authentication for MapReduce
- Additional permissions
 - Execute, Create, Admin
- Roles
 - Current implementation is really ACL not RBAC
- ZooKeeper Kerberos auth plugin
- Audit logging
- More granular access control
 - Per row or per KV?
 - Would be implemented via meta-columns



For More Information

- HBase blog: Secure HBase by Eugene Koontz
- HBase JIRA
 - HBASE-1697: Discrentionary access control (umbrella issue)
 - HBASE-3025: Coprocessor based access control
- Code
 - http://github.com/trendmicro/hbase/tree/security

