Efficient Tamper-Evident Data Structures for Untrusted Servers

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Joint work with Scott A. Crosby

This talk vs. Preneel's talks

- Preneel: how hash functions work (or don't work)

- This talk: interesting things you can build with hash functions (assumption: "ideal" hash functions)

This talk isn't about…

- BitCoin and other blockchain currencies

- CA certificate revocation infrastructure

- Voting system "public bulletin boards"

All of these systems are built around similar hash-based data structure primitives.

Problem

- Lots of untrusted servers
  - Outsourced
    - Backup services
    - Publishing services
    - Outsourced databases
  - Insiders
    - Financial records
    - Forensic records
  - Hackers

Limitations and goals

- Limitation
  - Untrusted server can do anything

- Best we can do
  - Tamper evidence

- Goal:
  - Tamper-evident primitives
    - Efficient
    - Secure

Tamper-evident primitives

- Classic
  - Merkle tree [Merkle 88]
  - Digital signatures

- More interesting ones
  - Tamper-evident logs [Kelsey and Schneier 99]
  - Authenticated dictionaries [Naor and Nissim 98]
  - Graph and geometric searching [Goodrich et al 03]
  - Searching XML documents [Devanbu et al 04]

Tamper-evident logging

- ## Security model
  - Mostly untrusted clients
  - Untrusted log server
  - Trusted auditors
    - Detect tampering

- ## Useful for
  - Election results
  - Financial transactions
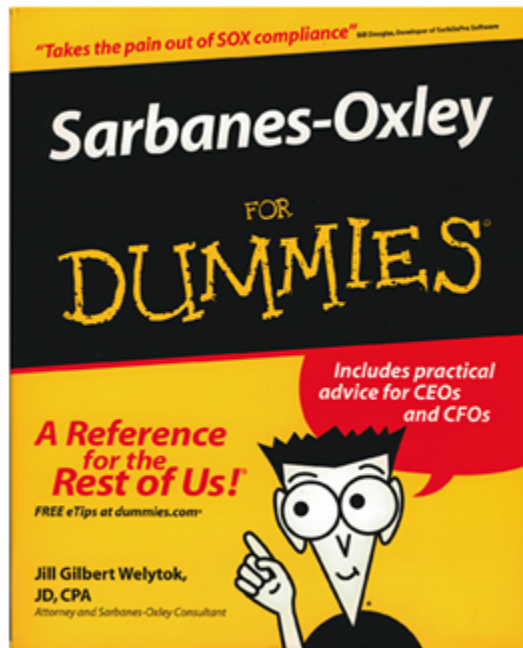 - General-purpose system logging

Authenticated dictionaries

- **Security model**
  - Data produced by trusted authors
  - Stored on untrusted servers
  - Fetched by clients
- **Key-value data store**
- **Useful for**
  - Price lists
  - Crypto key revocation
  - DNS / other databases

Our research

- Investigate two data structure problems
  - Persistent authenticated dictionary (PAD)
    - Efficiency improves from O(log n) to O(1)
  - Comprehensive PAD benchmarks
  - Tamper-evident log
    - Efficiency improves from O(n) to O(log n)
    - Newer work on fast digital signatures
- Code and papers online
  http://tamperevident.cs.rice.edu

Tamper Evident Logging

Everyone has logs

Current solutions

- 'Write only' hardware appliances
- Security depends on correct operation

- Would like cryptographic techniques
  – Logger **proves** correct behavior
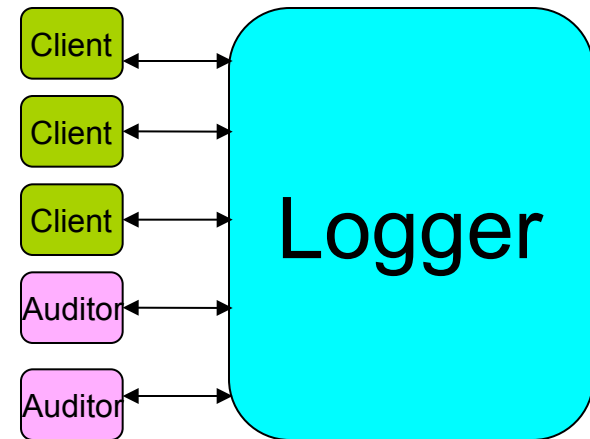 – Existing approaches too slow

Our solution

- ## History tree
  - Logarithmic for all operations
  - Benchmarks at >1,750 events/sec
  - Benchmarks at >8,000 audits/sec

  (on 2007 hardware!)

- ## In addition
  - Propose new threat model
  - Demonstrate the importance of auditing

Threat model

- ## Strong insider attacks
  - Malicious administrator
    - Evil logger
  - Users collude with administrator

- ## Prior threat model
  - Forward integity [Bellare et al 99]
  - Log tamper evident up to (unknown point), and untrusted thereafter

System design

- Logger
  - Stores events
  - Never trusted
- Clients
  - Little storage
  - Create events to be logged
  - Trusted only at time of event creation
  - Sends commitments to auditors
- Auditors
  - Verify correct operation
  - Little storage
  - Trusted, at least one is honest

Client

Client

Client

Auditor

Auditor

Logger

Hash chain log

- Existing approach [Kelsey and Schneier 98]
  - $C_n = H(C_{n-1} \| X_n)$
  - Logger signs C_n

Hash chain log

- Existing approach [Kelsey,Schneier]
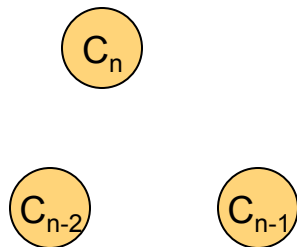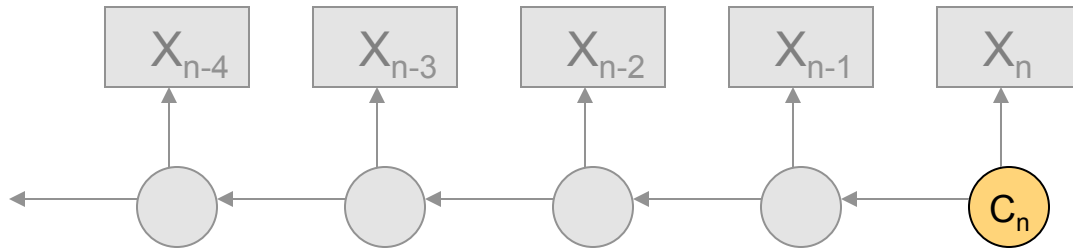 - $C_n = H(C_{n-1} \| X_n)$
  - Logger signs C_n

Hash chain log

- Existing approach [Kelsey,Schneier]
  - $C_n = H(C_{n-1} \| X_n)$
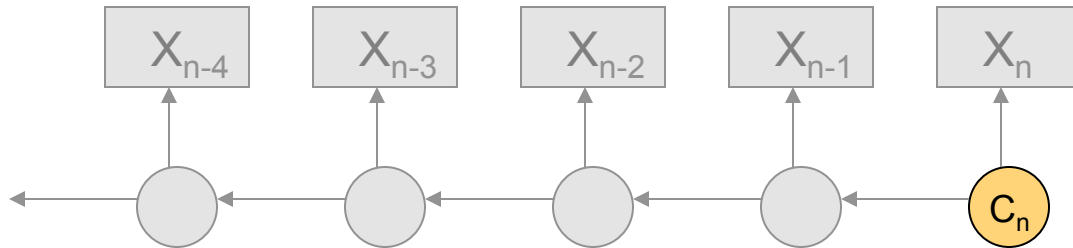 - Logger signs C_n

Problem

- We don't trust the logger!

Logger returns a stream of commitments

Each corresponds to a log

Problem

- We don't trust the logger!

Does C_n really contain the just inserted X_n ?

Do C_{n-2} and C_{n-1} really commit the same historical events?

Is the event at index i in log C_n really X_i ?

Solution

- Auditors check the returned commitments
  - For consistency $\quad C_{n-2} \equiv C_{n-1}$
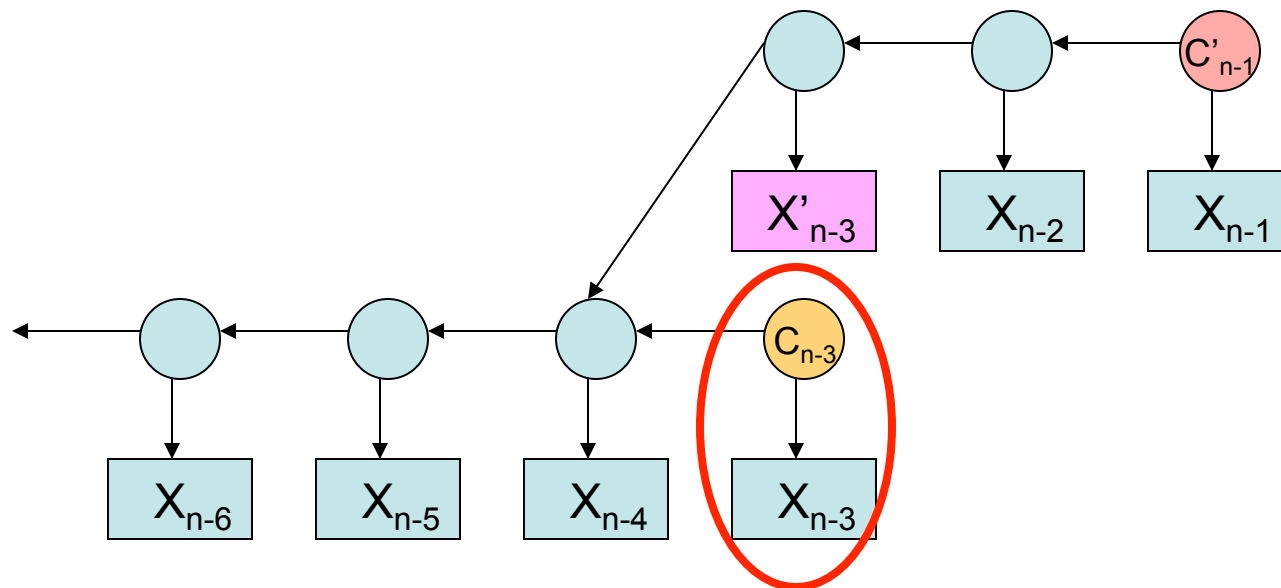 - For correct event lookup $\quad X_{n-3} \in C_{n-3}$

- Previously
  - Auditing = looking at historical events
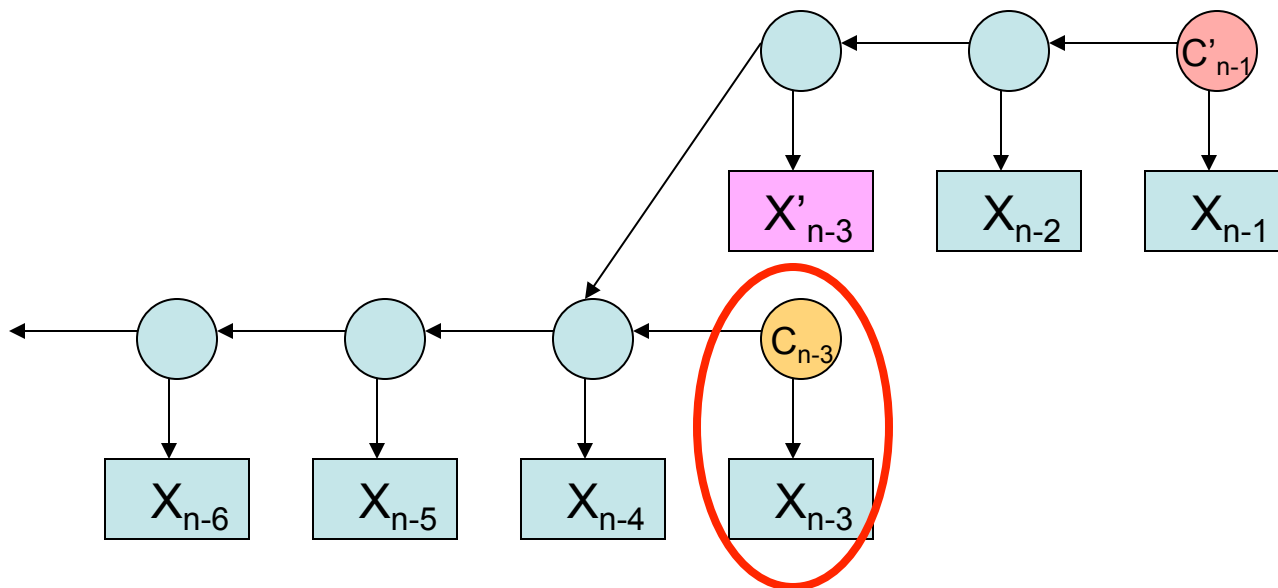   - Assumed to infrequent
    - Performance was ignored

Auditing is a frequent operation

- If the logger knows this commitment will not be audited for consistency with a later commitment.
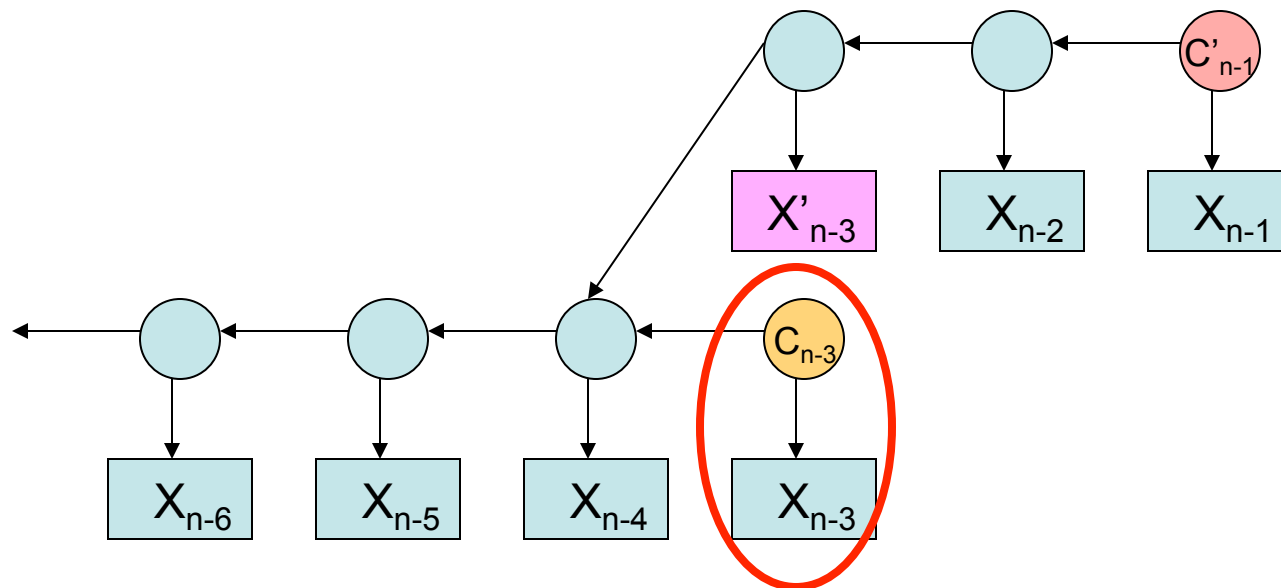
Auditing is a frequent operation

- Successfully tampered with a 'tamper evident' log

Auditing is a frequent operation

- Every commitment must have a non-zero chance of being audited

New paradigm

- Auditing cannot be avoided

- Audits should occur
  - On every event insertion
  - Between commitments returned by logger

- How to make inserts *and audits* cheap
  - CPU
  - Communications complexity
  - Storage

Two kinds of audits

- Membership auditing $\quad x_i \in c_n$
  - Verify proper insertion
  - Lookup historical events

- Incremental auditing $\quad c_i \equiv c_n$
  - Prove consistency between two commitments

Existing tamper evident log designs

- ## Hash chain [Kelsey and Schneier 98]
  - Auditing is linear time
  - Historical lookups
    - Very inefficient

- ## Skiplist history [Maniatis and Baker 02]
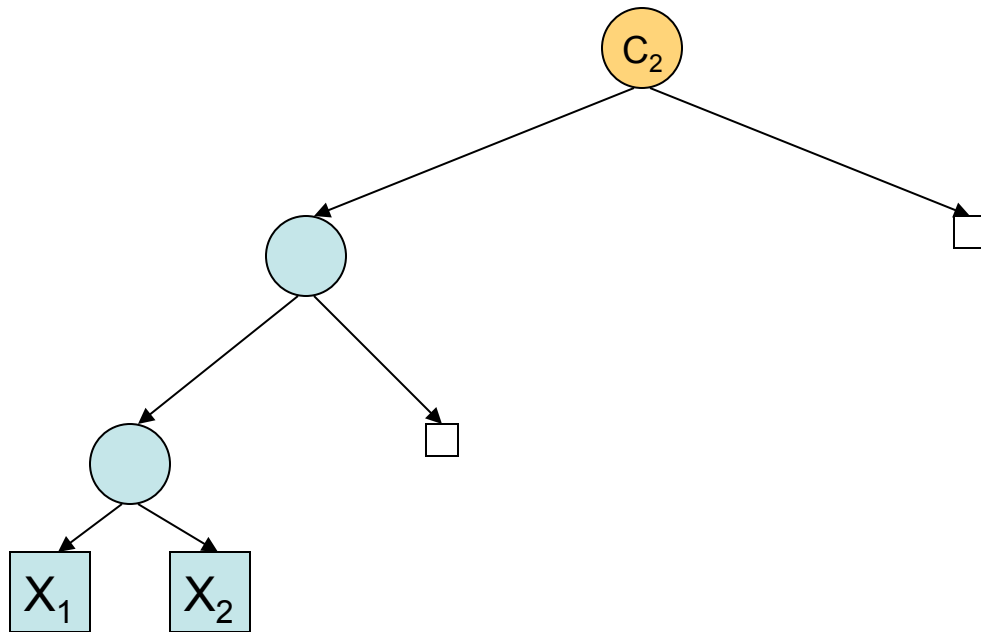 - Auditing is still linear time
  - $O(\log n)$ historical lookups

Our solution

- ## History tree

  - O($\log n$) instead of O(n) for all operations

  - Variety of useful features

    - Write-once append-only storage format

    - Predicate queries + safe deletion

    - May probabilistically detect tampering

      - Auditing random subset of events
      - Not beneficial for skip-lists or hash chains
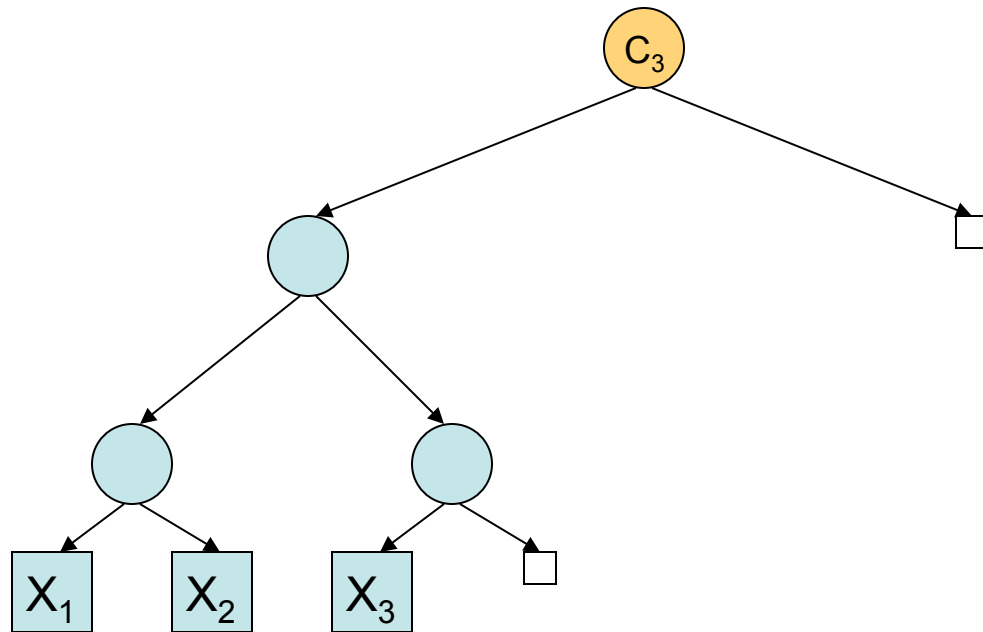
History tree

- Merkle binary tree
  - Events stored on leaves
  - Logarithmic path length
    - Random access
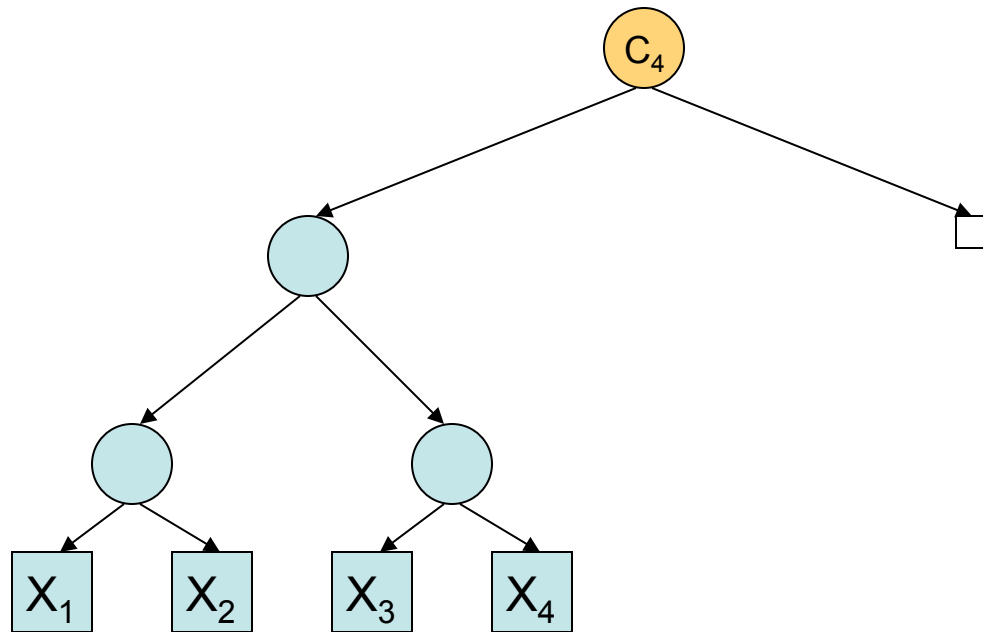 - Permits reconstruction of past version and past commitments
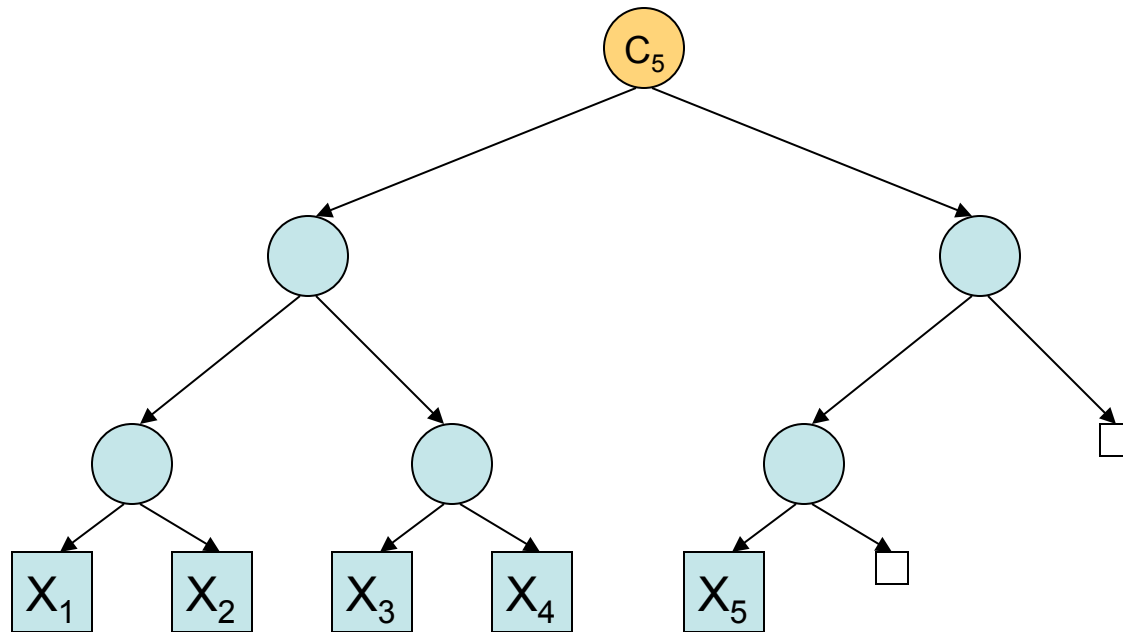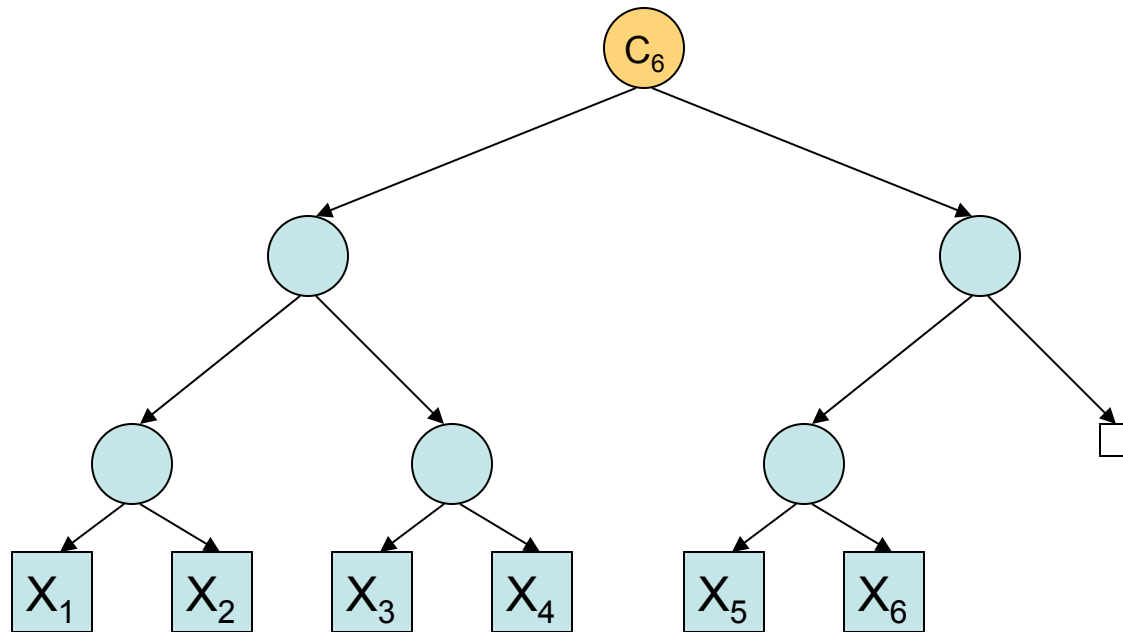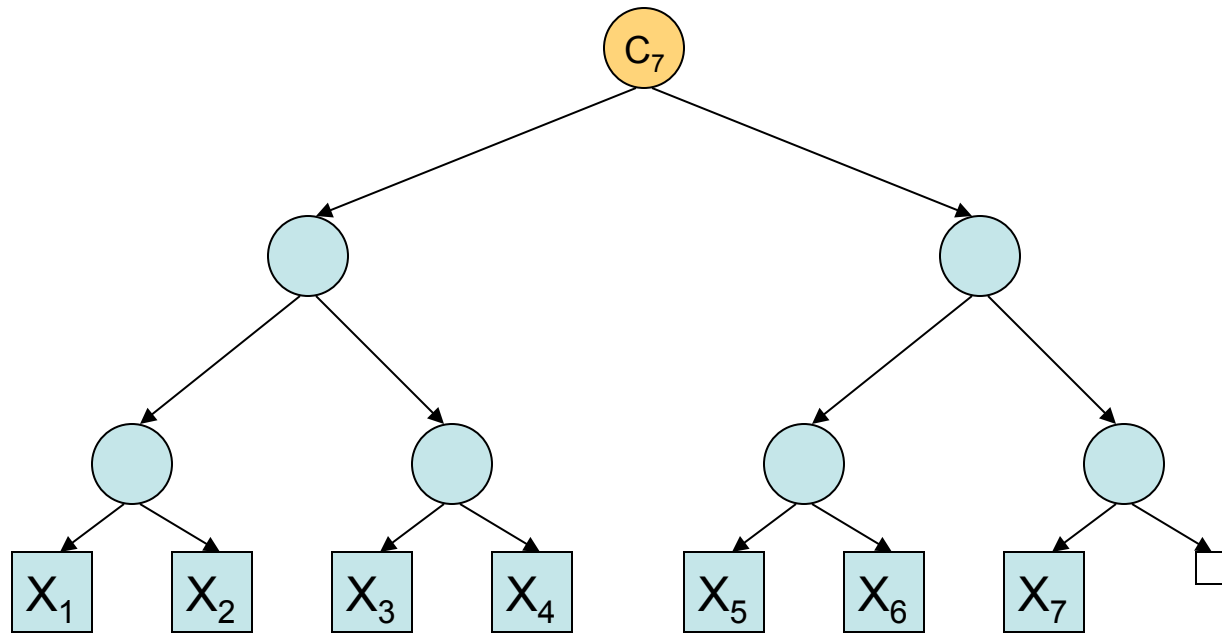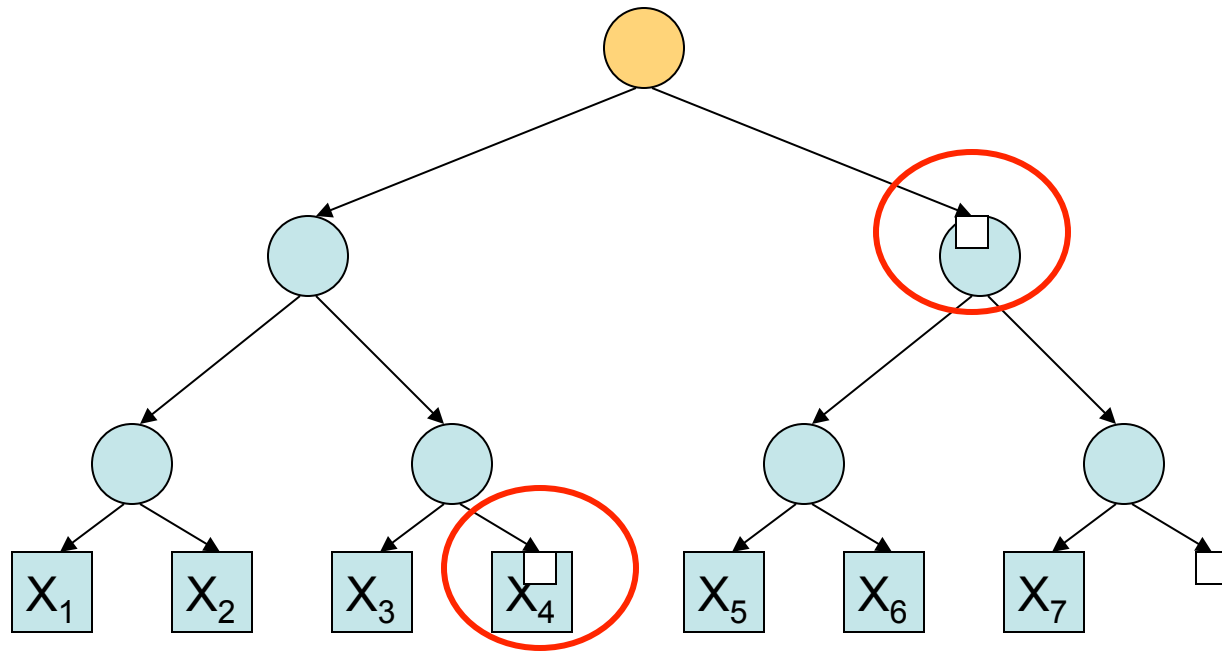
History tree

History tree

History tree

History tree

History tree

History tree

History tree

Incremental auditing

c_3

Auditor

X_1 X_2 X_3

Incremental proof

Incremental proof

$c_3 \equiv c_7$

Auditor
c_3
c_7

- P is consistent with c_7
- P is consistent with c_3
- Therefore c_7 and c_3 are consistent.

Incremental proof

- P is consistent with c_7
- P is consistent with c_3
- Therefore c_7 and c_3 are consistent.

Incremental proof

- P is consistent with c_7
- P is consistent with c_3
- Therefore c_7 and c_3 are consistent.

Incremental proof

- P is consistent with c_7
- P is consistent with c_3
- Therefore c_7 and c_3 are consistent.

Pruned subtrees

- Although not sent to auditor
  - Fixed by hashes above them
  - c_3 , c_7 fix the same (unknown) events

Membership proof that

- Verify that c''_7 has the same contents as P
- Read out event X_3

Evaluating the history tree

- Big-O performance
- Syslog implementation

Big-O performance

	$c_j \equiv c_i$	$x_i \in c_j$	Insert
History tree	O(log n)	O(log n)	O(log n)
Hash chain (e.g., BitCoin)	O(j-i)	O(j-i)	O(1)
Skip-list history [Maniatis and Baker]	O(j-i) or O(n)	O(log n) or O(n)	O(1)

Syslog implementation

- Syslog
  - Trace from Rice CS departmental servers
  - 4M events, 11 hosts over 4 days, 5 attributes per event
    - Repeated 20 times to create 80M event trace

Syslog implementation

- Implementation
  - Hybrid C++ and Python
  - Single threaded
  - `mmap()`-based append-only write-once storage
  - 1024-bit DSA signatures and 160-bit SHA-1 hashes
- Test platform
  - 2.4 GHz Core 2 Duo (circa 2007) desktop machine
  - 4GB RAM

Performance

- Insert performance: 1,750 events/sec
  - 83.3% : Sign commitment
- Auditing performance
  - With locality (last 5M events)
    - 10,000-18,000 incremental proofs/sec
    - 8,600 membership proofs/sec
  - Without locality
    - 30 membership proofs/sec
  - < 4,000 byte self-contained proof size

Tamper-evident logging

- New paradigm
  - Importance of frequent auditing

- History tree
  - Efficient auditing

  - Scalable

  - Offers other features

  - Proofs and more in the papers

Persistent authenticated dictionaries (PADs)

What is a PAD?

What is a PAD?

- What is an authenticated dictionary?
  - Tamper-evident key/value data store
  - Invented for storing CRLs [Naor and Nissim 98]
- Security model
  - Created by trusted author
  - Stored on untrusted server
  - Accessed by clients
    - Responses authenticated by author's signature
- **PAD adds the ability to access old versions**
  - [Anagnostopoulos et al 01]

PAD design

Author

Insert(key,val)
Remove(key)
Snapshot()

PAD Generator

Signed Stuff

Time per update
Size of update
Storage per update
Size of a proof

Server

PAD Repository

Clients

LookupV(version,key)

Result, Lookup Proof

Assume a single author

Assume snapshot after every update

Applications of PADs

- Outsource storage and publishing
  - CRL
  - Cloud computing
  - Remote backups
  - Subversion repository
  - Stock ticker
  - Software updates
  - Smart cards
- Want to look up historical data

PAD Designs

- **Tree-based PADs** [Anagnostopoulos et al., Crosby and Wallach]
  - O(log n) storage per update
  - O(log n) lookup proof size
- Tuple PADS [Crosby and Wallach]
  - O(1) storage per update
  - O(1) proof size

Tree-based authenticated dictionary

R

"Hello"

"Comp"

"World"

"Sci"

"ZZZ"

Proofs in a tree-based authenticated dictionary

R

"Hello"

"Comp" "World"

"Sci" "ZZZ"

Proof: Hashes of sibling
nodes on path to lookup key

Path copying

R_0	R_1	R_2	R_3	R_4	R_5

"Hello"

"Hello"

"Comp"

"World"

"World"

"Sci"

"ZZZ"

Storage: O(log n) per update

Building a PAD

- Other ways to make trees persistent
  - Versioned nodes [Sarnak and Tarjan 86]
    - O(1) amortized storage per update.
  - Our contribution:
    - Combining versioned nodes with authenticated dictionaries
    - Reduce memory consumption on the server

Sarnak-Tarjan tree

Add R
Add S
Del S
Add T
Add V
Add E

Note: 7 snapshots represented with 7 nodes.

Accessing snapshot 5

Add R
Add S
Del S
Add T
Add V
Add E

Sarnak-Tarjan node

- Each node has two sets of children pointers and a "time"

- Hash is not constant
  - Can be recomputed from tree at any "time"

- Storing vs. recomputing
  - Same semantics, different performance

Comparing caching strategies

	Storage	Lookup Proof Generation
	(Server)	(Server)
Cache nowhere	O(1)	O(n)
Cache everywhere	O(log n)	O((log n) *(log v))
Cache median layer	O(2)	O($\sqrt{n}$ * (log v))

- Logarithmic
  - Update time
  - Lookup size
  - Verification time

- Constant
  - Update size

Tuple PADs

- Our new PAD design
  - **Constant lookup proof size**
  - **Constant storage per update**

Tuple PADs

- Dictionary contents:
  - $\{\ k_1 = c_1,\ k_2 = c_2, k_3 = c_3, k_4 = c_4\ \}$
- Divide key-space into intervals
- Tuples:
  - $([MIN,k_1),■)$
  - $([k_1,k_2),c_1)$
  - $([k_2,k_3),c_2)$
  - $([k_3,k_4),c_3)$
  - $([k_4,MAX),c_4)$

$MIN \qquad k_1 \qquad k_2 \qquad k_3 \quad k_4 \quad MAX$

■	C_1	C_2	C_3	C_4

"Key k_1 has value c_1, and there is no key in the dictionary between k_1 and k_2"

Making it persistent

- $(v_1,[k_1,k_2),c_1)$
  - "In snapshot v_1, key k_1 has value c_1, and there is no key in the dictionary between k_1 and k_2"

	MIN	k_1	k_2	k_3	k_4	MAX	
V_1			■				Initial
V_2	■		C_1				Add (k_1,c_1)
V_3	■		C_1		C_3		Add (k_3,c_3)
V_4	■	C_1 ★	C_2		C_3		Add (k_2,c_2)
V_5	■	C_1		C_2			Del k_3
V_6	■	C_1		C_2	★ C_4		Add (k_4,c_4)
V_7	■		C_1		C_4		Del k_2

Observation

- Most tuples stay same between snapshots
- Every update
  - Creates ≤ 2 tuples not in prior snapshot

Tuple superseding

- Indicate a version range in each tuple
  - $([v_1, v_2+1], [k_1, k_2), c_1)$
    - Which replaces $([v_1, v_2], [k_1, k_2), c_1)$
    - At most 2 new tuples. Rest are replaced
  - Constant
    - Storage on server
  - Still have the same
    - Update time
    - Update size

Insight: Speculation

- ## Split PAD

  - ### Speculative tuples

    - Older generation

    - Signed in every epoch

  - ### Young generation

    - Correct mis-speculations

    - Signed every snapshot

    - Kept small, migrate keys into older generation

- ## O(G $n^{1/G}$) signatures per update

  - Combines with lightweight signatures

	MIN	k_1	k_2	k_3	k_4	MAX
V_1			■			
V_2	■			C_1		
V_3	■		C_1		C_3	
V_4	■	C_1	C_2		C_3	
V_5	■	C_1		C_2		
V_6	■	C_1	C_2			C_4
V_7	■		C_1			C_4

Speculation: Updating the PAD

- $(g_0, [v_1, v_2], [k_1, k_2), c_1)$
  - "In generation g_0 and snapshots v_1 through v_2 key k_1 has value c_1, and there is no key in the dictionary between k_1 and k_2"

Old generation g_1

Young generation g_0

Reducing update costs

- Currently $O(G\, n^{1/G})$ update size
  - Requiring $O(G\, n^{1/G})$ work

- RSA accumulators [Benaloh and de Mare 93]
  - $O(1)$
    - Work on author
    - Update size
    - Lookup proof size
  - $O((G+1)\, n^{1/G} (\log n))$
    - Computation on server
    - Large constant factors

Comparing techniques

		Tree-based			Tuple-based		
		Path Copying	Cache Everywhere	Cache Median	Speculating+ Superseding	Superseding	Accumulators + Speculating
Updates	Time (Author)	$O(\log n)$			$O(G * n^{1/G})$	$O(n)$	$O(1)$
	Time (Server)						$O(G * \log(n) * n^{1/G})$
	Size						$O(1)$
Storage	(per update)	$O(\log n)$		$O(1)$	$O(G)$	$O(1)$	
Lookup	Time (Server)	$O(\log n)$	$O(\log n * \log v)$	$O(\sqrt{n})$	$O(G * \log n)$	$O(\log n)$	
	Size	$O(\log n)$			$O(G)$	$O(1)$	

What about the real world?

		Tree-based		Tuple-based	
				...perseding	Accumulators + Speculating
Updates	Time (Author)				O(1)
	Time (Server)			O(n)	O(G * log(n) * n^{1/G})
	Size				
Storage	(per update)			O(1)	O(1)
Lookup	Time (Server)				O(log n)
	Size	O(log n)		O(G)	O(1)

Benchmarking PADs

Comprehensive implementation

- 21 algorithms
- Including all earlier designs
  - Path copy skiplists and path copy red-black trees [Anagnostopoulos et al.]

- Analysis also applies to non-persistent authenticated dictionaries

Algorithms

- Tree PADs – 12 designs
  - (4) Path copying, 3 caching strategies
  - (3) Red-black, Treap, and Skiplist
- Tuple PADs – 6 algorithms
  - (2) With and without speculation
  - (3) No-superseding, superseding, lightweight signatures
- Accumulator PADs – 3 algorithms

Implementation

- Hybrid of Python and C++
  - GMP for bignum arithmatic
  - OpenSSL for signatures
- Core 2 Duo CPU at 2.4 GHz
  - 4GB of RAM
  - 64-bit mode

  (Not bad for circa 2007 hardware!)

Benchmark

- 'Growing benchmark'
  - Insert 10,000 keys with a snapshot after every insert
- Play a trace of price changes of luxury goods
  - 27 snapshots
  - 14000 keys
  - 39000 updates

Tree PADs

- ## Comparing algorithms
  - Red-black
    - Smallest proofs, least RAM, highest performance
  - Skiplists do the worst
- ## Comparing repositories
  - Path copying
  - Sarnak-Tarjan nodes cache everywhere
    - Same performance
    - 40% of the RAM

Cache median vs Cache everywhere

- 100,000 keys

	Update Size	Update Rate	Lookup Size	Lookup Rate	Memory usage
Cache median	.15kb	730/sec	1.5kb	196/sec	205MB
Cache everywhere	.15kb	730/sec	1.5kb	7423/sec	358MB

The costs of an algorithm

$$$

- Care about the monetary costs
- Use prices from cloud computing providers
  - In 2007, 200kb was worth 1sec of CPU time
    - Worth about $ .000030 = 3000μ¢

Monetary analysis

- Evaluate
  - Absolute costs per operation
    - CPU time and bandwidth
  - Relative contribution of
    - CPU
    - Bandwidth

Tree PAD caching strategies

- 37x slower, but only costs 2x as much
  - Sending a lookup reply
    - 1.5kb, costing **18μ¢**
  - Generating a lookup reply
    - Cache median: 5ms, costing **16μ¢**
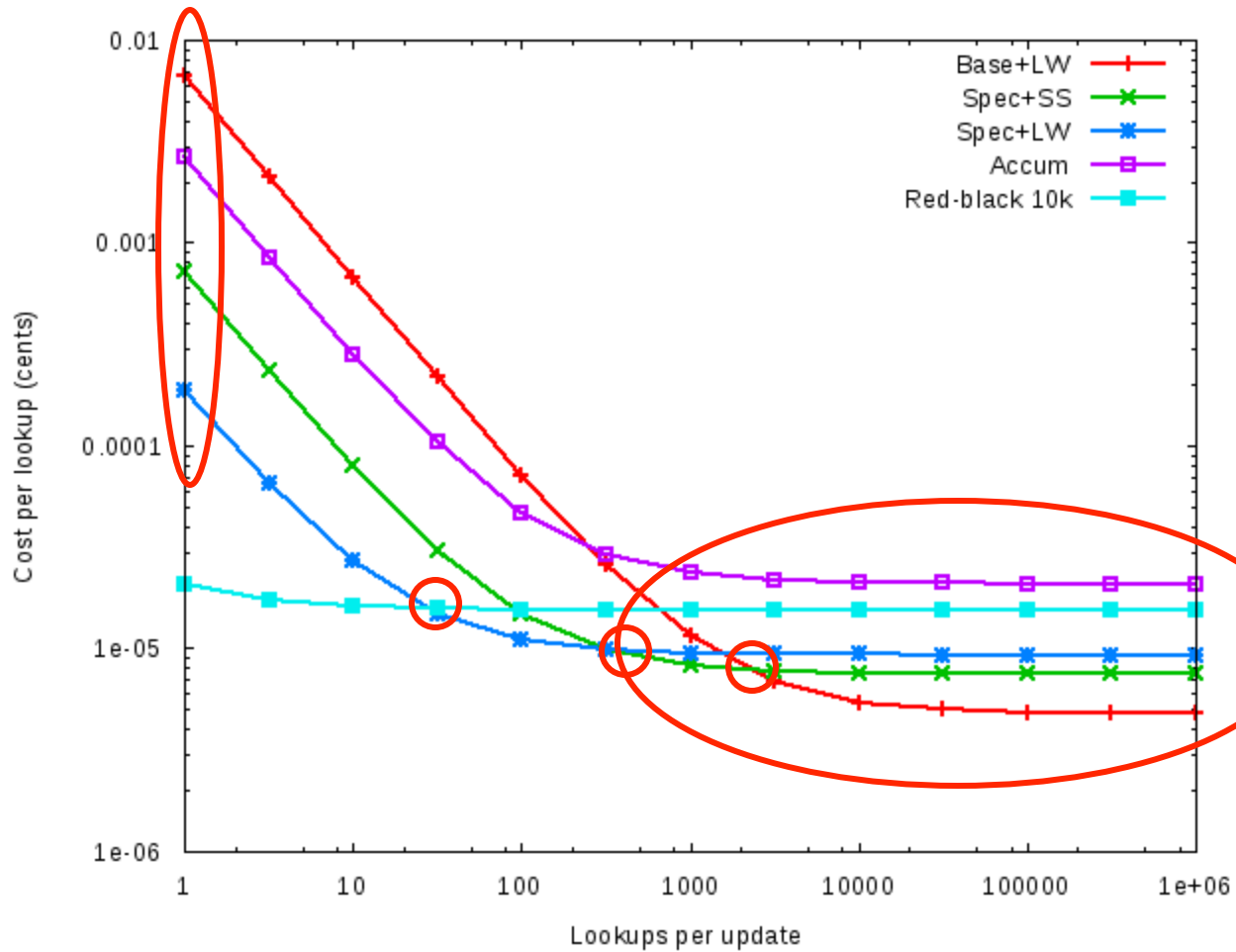   - Cache everywhere .13ms : **.4μ¢**

	Lookup size	Lookup rate	Cost per lookup	Memory usage
Cache median	1.5kb	196/sec	34 μ¢	205MB
Cache everywhere	1.5kb	7423/sec	18 μ¢	358MB

Evaluating the monetary costs of updates and lookups

- Tuple PADs
  - Extremely cheap lookups
  - Expensive updates

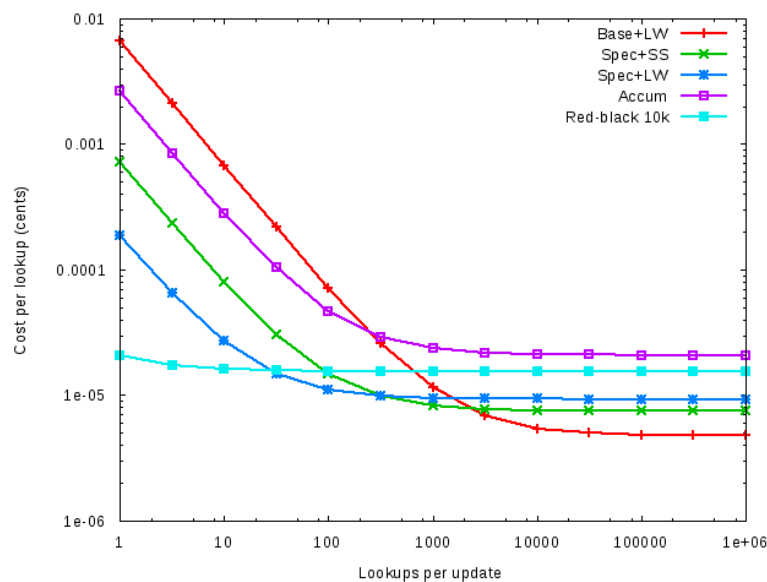- Tree PADs
  - Cheap lookups
  - Cheap updates

"What is the cost per lookup if there are k lookups for each update for different values of k."

Costs per lookup on growing benchmark

These results

- Could not be presented without looking at costs of bandwidth and CPU time

- Constant factors matter

- Accumulators
  - Lookup proof >1kb
    - Just as big as red-black
  - Expensive updates

PAD designs

- Presented
  - New PAD designs
    - Improved tree PAD designs
    - New tuple PAD designs
      - Constant storage and constant sized lookup proofs
  - Comprehensive evaluation of PAD designs
    - Monetary analysis

- Focused on efficiency and the real-world

Conclusion

- Presented two tamper evident algorithms
  - New PAD designs
    - Comprehensive evaluation
    - Monetary analysis
  - Tamper-evident history
    - New extensions for fast digital signatures
- Focused on efficiency in the real-world
- Code and technical reports

  http://tamperevident.cs.rice.edu