# Optimal Verification of Operations on Dynamic Sets 

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## Data in the cloud

- Data privacy
- Server wants to learn our data
- Can we enable the server use encrypted data in a meaningful way?
- Computing on encrypted data
- Data and computations integrity
- Server wants to tamper with our data
- Are answers to queries the same as if

Google
 the data were locally stored?

- Authenticated data structures
- Verifiable delegation of computation



## Verifying outsourced computation



- Conjunctive queries
" Emails that have the terms "Brown" and "Berkeley"
- Disjunctive queries
- Emails that have the terms "thesis" or "publication"
- All these queries boil down to set operations!


## Authenticated data structures model

- Complexity
- Update at source and server
- Query at server
- Verification at client
- Size of proof
- Space
- Security
- A poly-bounded adversary cannot construct invalid proofs except with negligible probability
- Need for computational assumptions



## Authenticated sets collection



## Queries on sets

- m: number of sets (e.g., m = 4)
- $M$ : sum of sizes of all the sets (e.g., $M=6+4+3+5=18$ )
- t: number of queried sets (e.g., $\mathrm{t}=2$ )
- $\delta$ : number of elements contained in the answer (e.g., $\delta=1$ )
- n : the sum of sizes of the queried sets (e.g., $\mathrm{n}=6+5=11$ )



## Related work and comparison

- Optimal proof size and verification time: $\mathrm{O}(\bar{\delta})$
- Linear space: O(m + M)
- Efficient queries and updates
- Performance comparison for the intersection of $\mathrm{c}=\mathrm{O}(1)$ sets

|  | space | query | proof | assumption |
| :---: | :---: | :---: | :---: | :--- |
| D+04 YP09 | $m+M$ | $n+\log m$ | $n+\log m$ | Generic CR |
| M+04 | $m+M$ | $n$ | $n$ | Strong RSA |
| PT04 | $m^{c}$ | 1 | $\delta$ | Discrete log |
| PTT10 | $m+M$ | $n \log ^{3} n+$ <br> $m^{\varepsilon} \log m$ | $\delta$ | Bilinear q- <br> strong DH |

## Our solution: Sets and polynomials

- Set $X$ with $n$ elements

$$
X=\left\{x_{1}, \ldots, x_{n}\right\}
$$

- Set $Z$ is the intersection of $X$ and $Y$
- The intersection of $X$ and $Y$ is empty, i.e., $X \cap Y=\varnothing$
- Polynomial $X(s)$ in Zp

$$
X(s)=\left(s+x_{1}\right) \ldots\left(s+x_{n}\right)
$$

- Polynomial $Z(s)$ is the GCD of $X(s)$ and $Y(s)$
- X(s) and Y(s) have GCD equal to 1, i.e., $\operatorname{gcd}(\mathrm{X}(\mathrm{s}), \mathrm{Y}(\mathrm{s}))=1$
- There are polynomials P(s) and $\mathrm{Q}(\mathrm{s})$ such that

$$
P(S) X(s)+Q(s) Y(s)=1
$$

## Cryptographic tools we use

- Two multiplicative groups G and T of prime order p
- $g$ is a generator of G
- A bilinear map e(...) from G to T such that
- $\mathrm{e}\left(\mathrm{g}^{\mathrm{a}}, \mathrm{g}^{\mathrm{b}}\right)=\mathrm{e}(\mathrm{g}, \mathrm{g})^{\mathrm{ab}}$ for all $\mathrm{a}, \mathrm{b}$ in Zp
- $\mathrm{e}(\mathrm{g}, \mathrm{g})$ generates $T$
- Bilinear q-strong Diffie Hellman Assumption
- Pick a random s in Zp
- $s$ is the trapdoor
- Compute $\mathrm{g}^{\mathrm{s}}, \mathrm{g}^{\mathrm{s}^{2}}, \mathrm{~g}^{\mathrm{s}^{3}}, \ldots, \mathrm{~g}^{\mathrm{s}}$
- The public key pk are the values $\mathrm{g}^{\mathrm{s}}, \mathrm{g}^{\mathrm{s}^{2}}, \mathrm{~g}^{\mathrm{s}^{3}}, \ldots, \mathrm{~g}^{\mathrm{s}}{ }^{9}$
- The probability that a PPT Adv can find an a in Zp and output the tuple ( $\left.\mathrm{a}, \mathrm{e}(\mathrm{g}, \mathrm{g})^{1 /(\mathrm{s}+\mathrm{a})}\right)$ is negligible


## Bilinear-map accumulator

- G and T of order p have a map e(...)
- $X=\{x, y, z, r\}$ in $Z_{p}$
- Base $\mathrm{g} \in \mathrm{G}$, generator of $G$
- Secret $s \in Z_{p}$
- Digest
- $\mathbf{D}=\mathbf{g}^{(x+s)(y+s)(z+s)(r+s)}$
- Witness for $x$
- $\mathbf{W}_{\mathrm{x}}=\mathbf{g}^{(\mathrm{y}+\mathrm{s})(\mathrm{z}+\mathrm{s})(\mathrm{r}+\mathrm{s})}$
- Verification
- $e(D, g)=e\left(W_{x}, g^{(x+s)}\right)$ ?
- Security: q-strong Diffie-Hellman assumption
- [Nguyen (05)]


## Our construction

- Compute the accumulation value for every set



## Our construction

- Compute the accumulation value for every set
- Build an accumulation tree on top [CCS 2008]
- $O(1 / \varepsilon)$ levels and $O\left(m^{\varepsilon}\right)$ internal degree
- $\mathrm{O}\left(\mathrm{m}^{\varepsilon} \operatorname{logm}\right)$ query, $\mathrm{O}(1)$ update and $\mathrm{O}(1)$ proof
- The accumulation values protect the integrity of the set elements
- The accumulation tree protects the integrity of the acc. values



## Proof of intersection $I=S_{1} \cap S_{2}$



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- Elements of intersection $\{\mathrm{c}, \mathrm{e}\}$



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- Proof of accumulation values $A_{1}$ and $A_{2}$
- Let $\Pi_{1}$ and $\Pi_{2}$ be such proofs



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- Proof of accumulation values $A_{1}$ and $A_{2}$
- Let $\Pi_{1}$ and $\Pi_{2}$ be such proofs
- Values along the path of the tree
- Construction of proofs: $\mathrm{O}\left(\mathrm{m}^{\varepsilon} \operatorname{logm}\right)$
- Size of proofs: O(1)



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- $\mathrm{I} \subseteq \mathrm{S}_{2}$ : Subset witness $\mathrm{W}_{2}=\mathrm{g}^{(s+h)(s+z)}=\mathrm{g}^{\mathrm{Q}(\mathrm{s})}$
- Complexity
- Construction: O(nlog n) (polynomial interpolation)
- Size: O(1) (2 group elements)



## Proof of intersection $I=S_{1} \cap S_{2}$

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- $\left(\mathrm{S}_{1}-\mathrm{I}\right) \cap\left(\mathrm{S}_{2}-\mathrm{I}\right)$ is empty



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- Recall $W_{1}=g^{P(s)}$ and $W_{2}=g^{Q(s)}$



## Proof of intersection $I=S_{1} \cap S_{2}$

## - Completeness condition:

- $\left(S_{1}-I\right) \cap\left(S_{2}-I\right)$ is empty
- Recall $\mathrm{W}_{1}=\mathrm{g}^{\mathrm{P}(\mathrm{s})}$ and $\mathrm{W}_{2}=\mathrm{g}^{\mathrm{Q}(\mathrm{s})}$
- Completeness witness $F_{1}=g^{A(s)}$ and $F_{2}=g^{B(s)}$
- $A(s) P(s)+B(s) Q(s)=1$
- Complexity: O(nlog²nlog log n) (ext. Euclidean algorithm)



## Recap

- $\mathbf{t}$ sets are intersected and $\boldsymbol{\delta}$ is the size of the answer
- $\mathbf{N}$ is the sum of sizes of intersected sets
element of the proof complexity ..... size
Intersection elements N ..... б


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| Intersection elements | N | $\overline{0}$ |
| Accumulation values proofs | $\mathrm{tm}=\log \mathrm{m}$ | t |

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| :---: | :---: | :---: |
| Intersection elements | N | $\delta$ |
| Accumulation values proofs | tm ${ }^{\text {l }}$ og m | t |
| Subset witnesses | $N \log \mathrm{~N}$ | t |
| Completeness witnesses | N $\log ^{2}$ Nloglog N | t |
| TOTAL | $N^{2} \log ^{2}{ }^{2} \log \log N$ tm ${ }^{\varepsilon} \log m$ | $t+\delta$ |

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| Intersection elements | N | $\delta$ |
| Accumulation values proofs | $\mathrm{tm}^{\text {s }} \log \mathrm{m}$ | t |
| Subset witnesses | $N \log \mathrm{~N}$ | t |
| Completeness witnesses | N $\log ^{2}$ Nloglog N | t |
| TOTAL almost optimal | $N^{2} \log ^{2}{ }^{2} \log \log N$ $+$ tmºg m | $t+\delta$ |

## Size of proof for $\mathrm{X} \cap \mathrm{Y}$ in practice

| $\|X\|$ | $\|Y\|$ | $\|X \cap Y\|$ | KBytes <br> $[M+04]$ | KBytes <br> this work |
| :--- | :--- | :--- | :--- | :--- |
| 1000 | 1000 | 10 | 3.34 | $\mathbf{1 . 7 3}$ |
| 1000 | 100 | 1 | 1.68 | $\mathbf{1 . 5 5}$ |
| 1000 | 10 | 0 | $\mathbf{1 . 0 1}$ | 1.53 |
| 1000 | 1 | 0 | $\mathbf{0 . 4 6}$ | 1.53 |
| 10000 | 10000 | 100 | 26.88 | 3.53 |
| 10000 | 1000 | 10 | 12.15 | $\mathbf{1 . 7 3}$ |
| 10000 | 100 | 1 | 6.86 | $\mathbf{1 . 5 5}$ |
| 10000 | 10 | 0 | 3.08 | $\mathbf{1 . 5 3}$ |
| 100000 | 100000 | 1000 | 263.25 | $\mathbf{2 1 . 5 3}$ |
| 100000 | 10000 | 100 | 116.13 | $\mathbf{3 . 5 3}$ |
| 100000 | 1000 | 10 | 63.18 | $\mathbf{1 . 7 3}$ |
| 100000 | 100 | 1 | 26.29 | $\mathbf{1 . 5 5}$ |

## Thank you!

## Application: Supporting timestamps

- For timestamped documents, use segment tree over the time dimension ( N timestamps)
- Search interval covered by $\mathrm{O}(\log \mathrm{N})$ canonical intervals in the segment tree, each corresponding to a set of documents $T_{j}$
- Timestamped keyword search equivalent to $O(\log N)$ set intersections
- $\mathrm{T}_{1} \cap \mathrm{~S}_{1} \cap \mathrm{~S}_{2} \ldots \cap \mathrm{~S}_{\mathrm{t}}$
- $\mathrm{T}_{2} \cap \mathrm{~S}_{1} \cap \mathrm{~S}_{2} \ldots \cap \mathrm{~S}_{\mathrm{t}}$



## Verifying outsourced computation

- Computation "on demand"
- E.g., Google docs
- 


" Find the pattern comput* in my document

- Is the result correct?
- Need for efficient computations


## First solution: hashing

- [Devanbu et al., Algorithmica 2004; Yang and Papadias, SIGMOD 2009]
- Two-level tree structure and hierarchical cryptographic hashing
- Space: O(m + M), update: O(log m + log n)
- Intersection of two sets: O(n + log m) proof size and verification time
- Security: Cryptographic hashing
- Same complexities: Morselli et al., INFOCOM 2004



## Second solution: precomputation

- [Pang and Tan, ICDE 2004]
- Sign the answer to every possible query
- Space: O(m² + M) for a 2-intersection
- For any possible intersection space is
- O(2m)
- Proof size and verification: $O(\delta)$
- Update: O(m²) for a 2-intersection
- Security: discrete log

Signatures of

$$
\begin{aligned}
& \mathrm{S}_{1} \cap \mathrm{~S}_{2} \\
& \mathrm{~S}_{1} \cap \mathrm{~S}_{3} \\
& \mathrm{~S}_{1} \cap \mathrm{~S}_{4} \\
& \mathrm{~S}_{2} \cap \mathrm{~S}_{3} \\
& \mathrm{~S}_{2} \cap \mathrm{~S}_{4} \\
& \mathrm{~S}_{3} \cap \mathrm{~S}_{4}
\end{aligned}
$$

