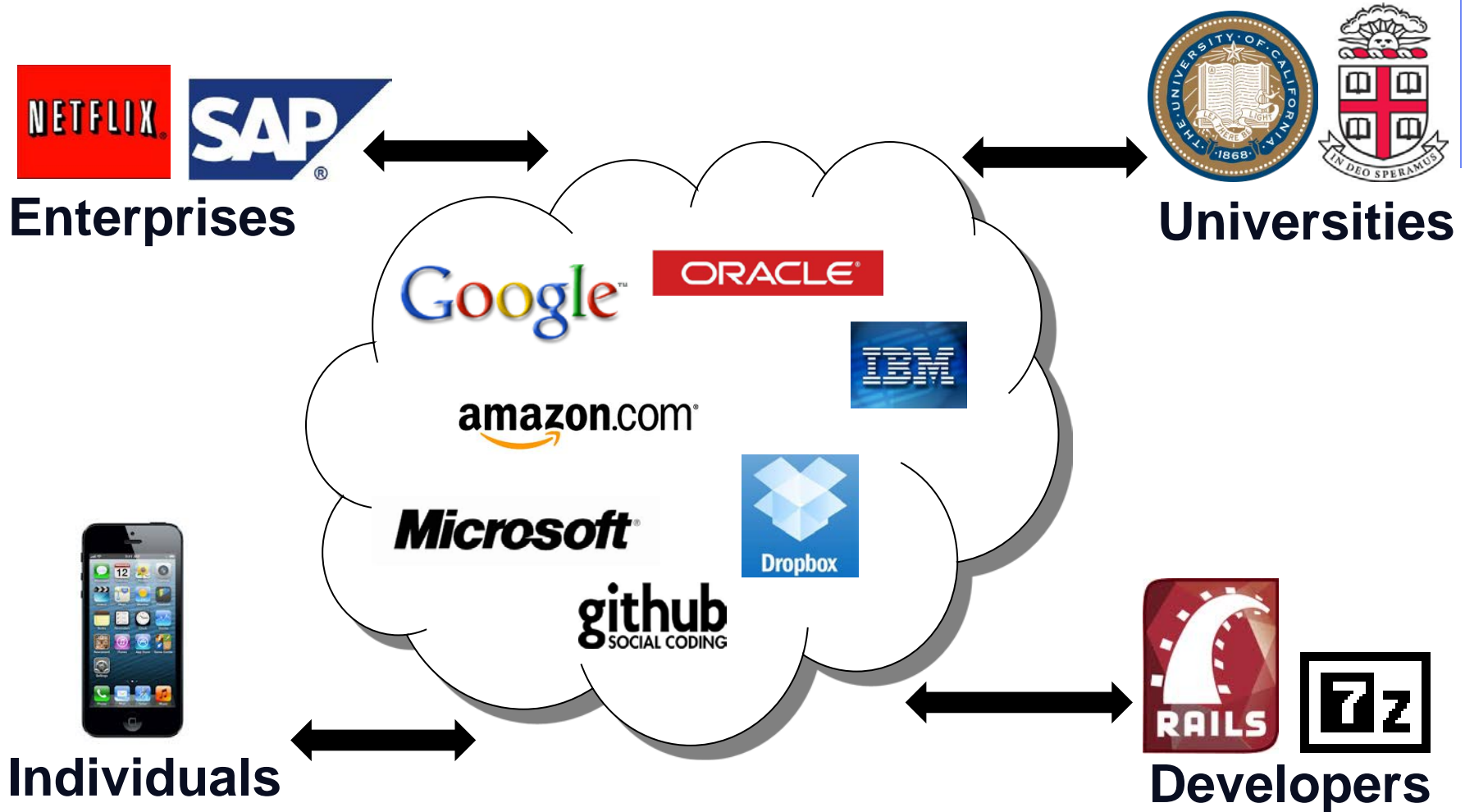


# Trustworthy and Private Computing in the Cloud

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# Cloud computing today



# Are there any threats?

- Cloud providers are untrusted
  - Can **lose** data
  - Can return **corrupted** results
  - Can **leak** information

*...we will have no liability to you for any unauthorized access or use, corruption, deletion, destruction or loss of any of your content or applications...*

Amazon web service customer agreement  
<http://aws.amazon.com/agreement/>

WEB & COMMUNICATION SOFTWARE security  
**Hotmail Data Loss Reveals Cloud Trust Issues**

By Keir Thomas, PCWorld

Jan 3, 2011 11:56 AM

News

**Amazon struggles to restore lost data to European cloud customers**

Developers vent frustration on Amazon support forum

By Jon Brodwin, Network World  
August 09, 2011 11:17 AM ET

**Gmail Corrupting Attachments**

I recently received a report that attachments sent to Gmail from some servers

« [Security Recommendation](#) | [Main](#) | [Solaris Security](#)

**Amazon S3 Silent Data Corruption**

By user12606733 on Jan 28, 2009

While catching up on my reading, I came across an inter...

01 August 2012, 12:39

**Dropbox confirms data leak**

Cloud storage service provider [Dropbox](#) has [acknowledged](#) that a file

**BPOS: a data leak in Microsoft's cloud**

December 28th, 2010 - 09:10 am ET by J. G.

**A configuration error in Microsoft's Business Productivity**

# Do people care?

- Customers are paying for the services
  - They want **reliable** storage
  - They want **correctness** guarantees
  - They want to keep their **privacy**

*...58% of the public and 86% of business leaders are excited about the possibilities of cloud computing. But more than 90% of them are worried about security, availability, and privacy of their data as it rests in the cloud...*

**Microsoft survey in 2010**

[http://news.cnet.com/8301-1009\\_3-10437844-83.html](http://news.cnet.com/8301-1009_3-10437844-83.html)

# What do I do?

- Enable people to use the cloud safely
- Verifiability in the cloud
  - **Verify** that the cloud did the work correctly
- Privacy in the cloud
  - Use the cloud in a **privacy-preserving** manner

efficient both in theory and in practice

provably secure

no assumptions at the server

# My work

practicality

fast  
crypto



Google Docs



my  
work



popular cloud applications

slow  
crypto

key/value store

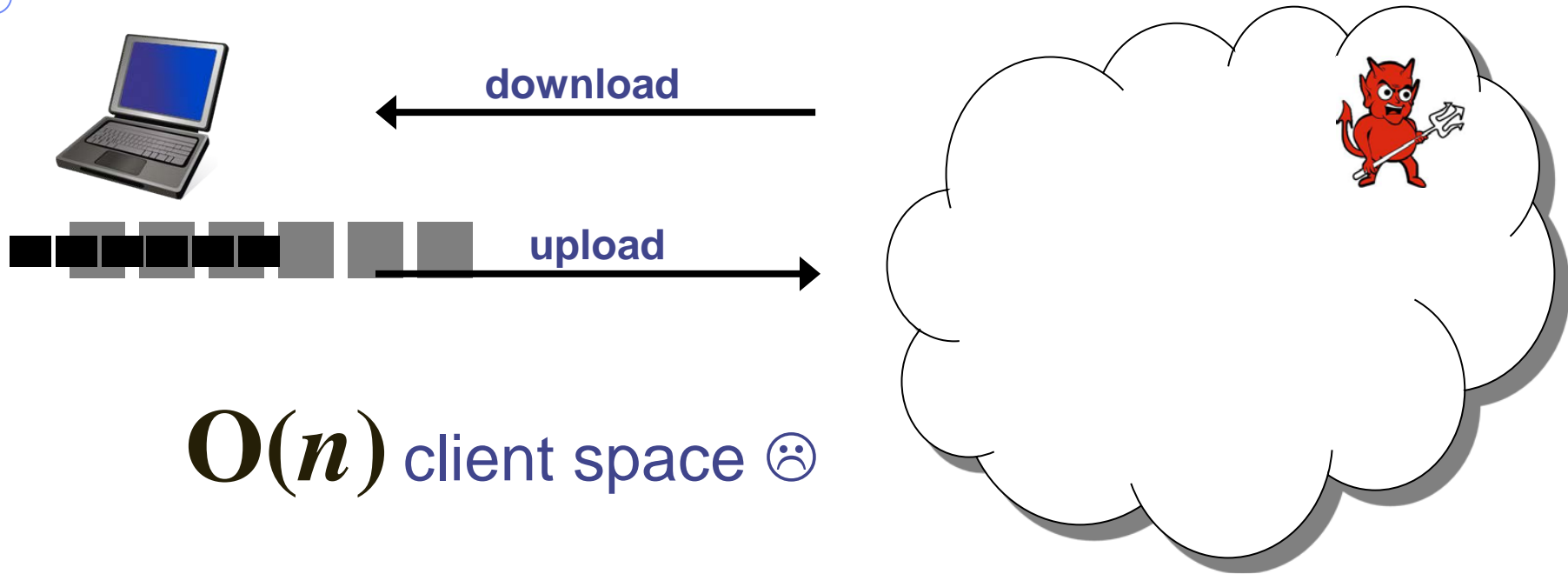
any application

expressiveness

# Roadmap

- **Motivation**
- **Verifiability in the cloud**
  - Storage applications [STORAGESS08, CCS09, CCS13]
  - Information retrieval applications [CRYPTO11, VLDB12]
- **Privacy in the cloud**
  - Searching encrypted data [CCS12, FC13]
- **Research agenda and vision**

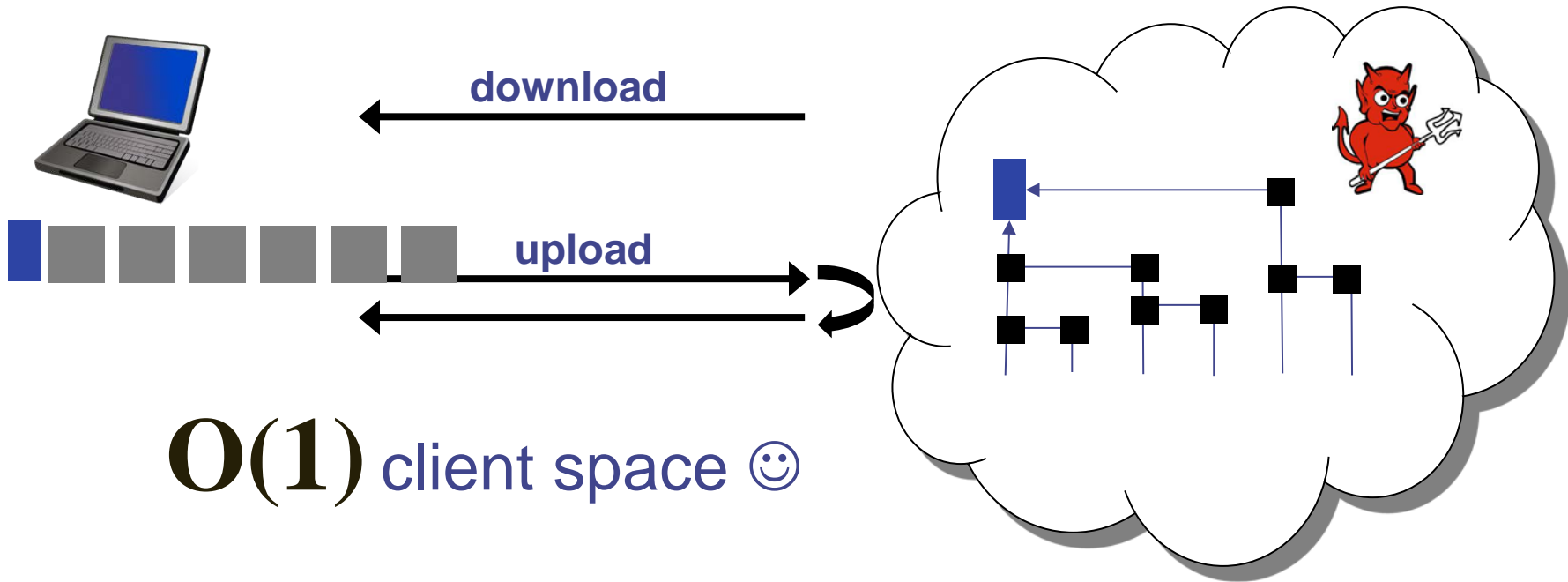
# Storing your files in the cloud



- How to verify that a file has **not** been corrupted?
  - Keep a hash (i.e., checksum) **locally** for each file
  - Download: **recompute** and **check**
  - Upload: **compute** and **store** new hash



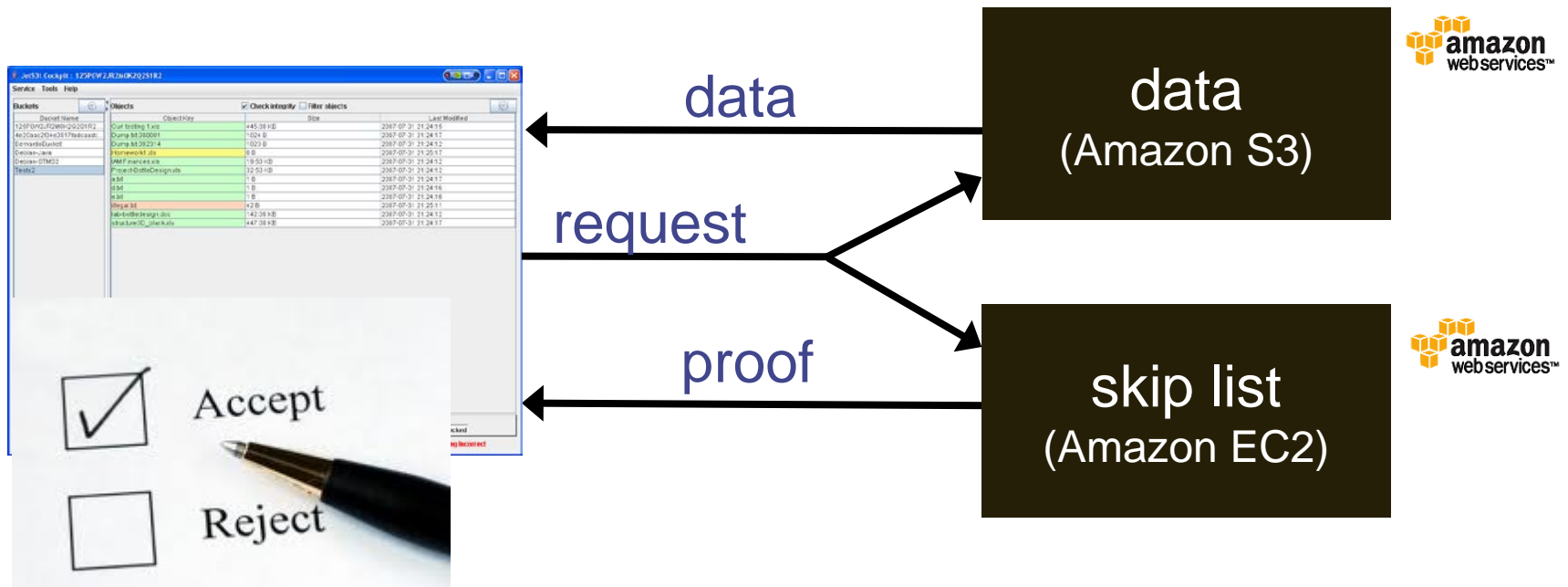
# A more efficient protocol



- Hashing over a skip list and store only the roothash
  - Download: Fetch  **$O(\log n)$**  hashes
  - Upload: An **interactive** protocol
- Technical contributions
  - **Parallel  $O(\log n)$**  update complexity

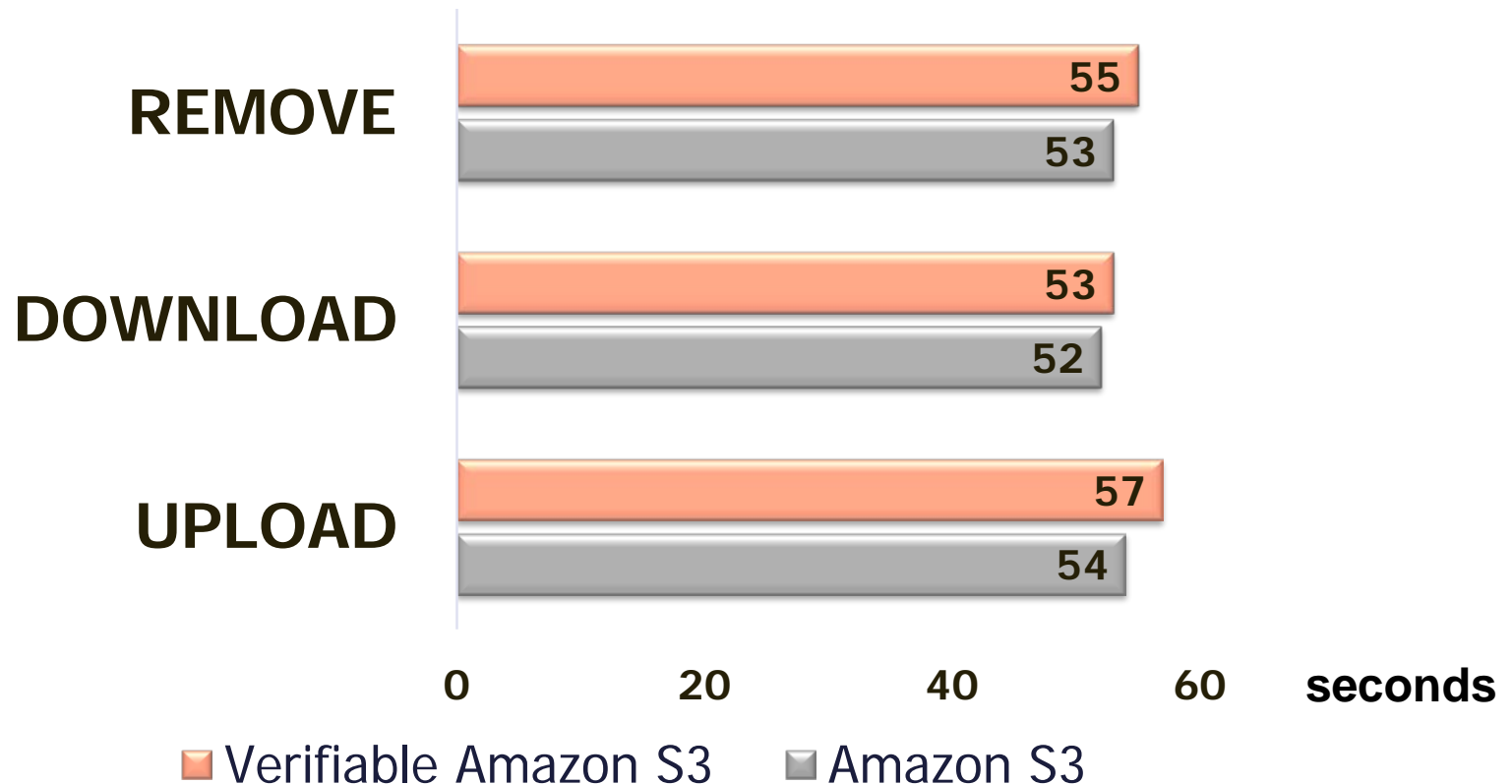
# Implementation with Amazon S3

- Extended an S3 client app (`Jets3t` `Cockpit`)
- Used Amazon EC2 and Amazon S3



# Performance

- Stored 80,000 1KB files on Amazon S3
- Used 1,000 1KB files as workload
- **Negligible** overhead



# Other considerations on storage

How can you verify **all the files more efficiently?**

- Dynamic proofs of retrievability [CCS09, CCS13]



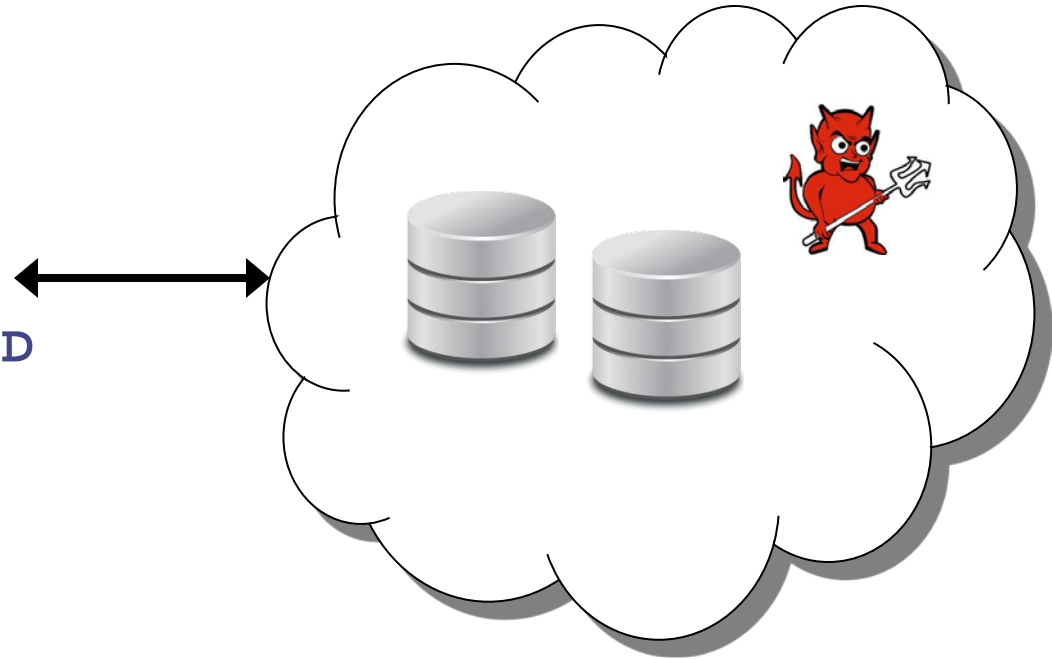
What happens **after a verification fails?**

- Provable data recovery [in progress]



# Querying a database in the cloud

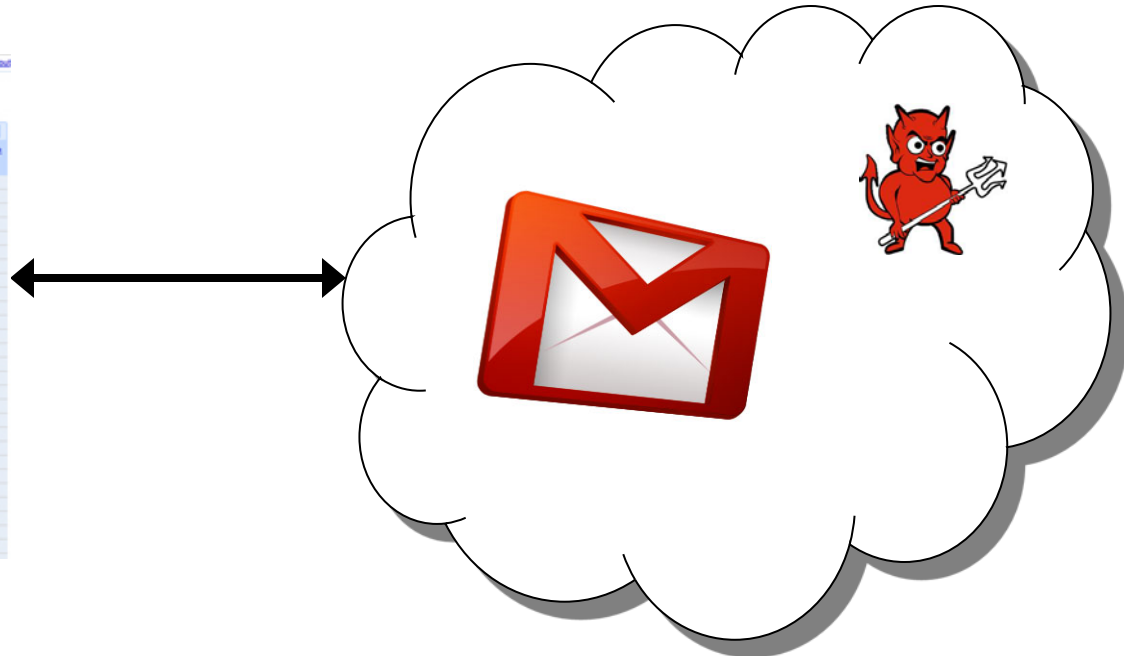
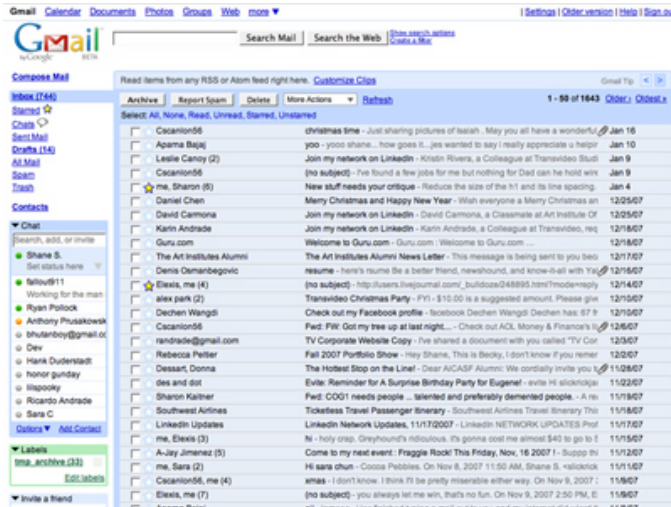
```
SELECT *  
FROM EMP, DEPT  
WHERE EMP.eID = DEPT.dID
```



- equi-join queries
- not-in queries

| eID | name   | dID | division    |
|-----|--------|-----|-------------|
| 1   | Alex   | 1   | Sales       |
| 22  | James  | 21  | Advertising |
| 34  | George | 22  | IT          |
|     |        | 76  | Sales       |
|     |        | 88  | Sales       |

# Searching my email inbox



- keyword search
- temporal queries

blue

1

3

sunny

1

hike

2

7

9

10

Rome

5

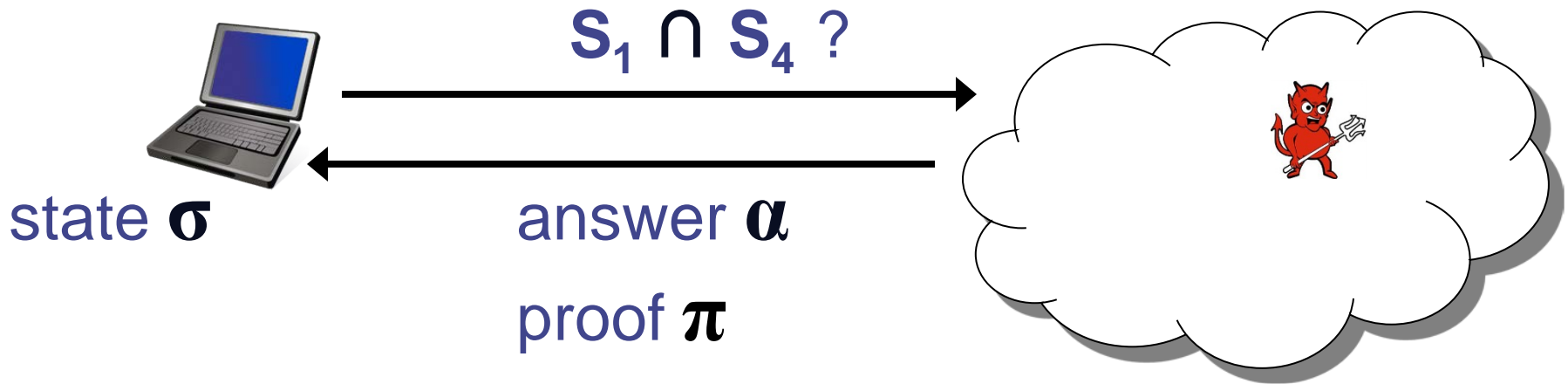
7

9

July12

7

# Verifiable set operations



verify( $\sigma, \alpha, \pi$ )?

| $S_1$ | $S_2$ | $S_3$ | $S_4$ |
|-------|-------|-------|-------|
| a     | c     | a     | d     |
| b     | e     | d     | l     |
| c     | h     | f     | m     |
| d     | z     |       | n     |
| e     |       |       | w     |
| f     |       |       |       |

Accepted

Reject

# My contribution

| in theory         |              |          |               |            |
|-------------------|--------------|----------|---------------|------------|
|                   | server comp. | proof    | client verif. | update     |
| CRYPTO11          | $n \log^2 n$ | $\delta$ | $\delta$      | <b>1</b>   |
| generic circuits* | $> N$        | <b>1</b> | $\delta$      | <b>N/A</b> |

$n$ : intersected sets size  $\delta$ : answer size  $N$ : collection size

**in practice:  $n = 10,000$ ,  $\delta = 100$ ,  $N = n$**

|                    | server comp.    | proof             | client verif.    | update        |
|--------------------|-----------------|-------------------|------------------|---------------|
| VLDB12             | <b>1.7 s</b>    | <b>5 KB</b>       | <b>20 ms</b>     | <b>0.2 ms</b> |
| generic circuits** | <b>37 hours</b> | <b>&lt; 40 KB</b> | <b>&lt; 1 ms</b> | <b>N/A</b>    |

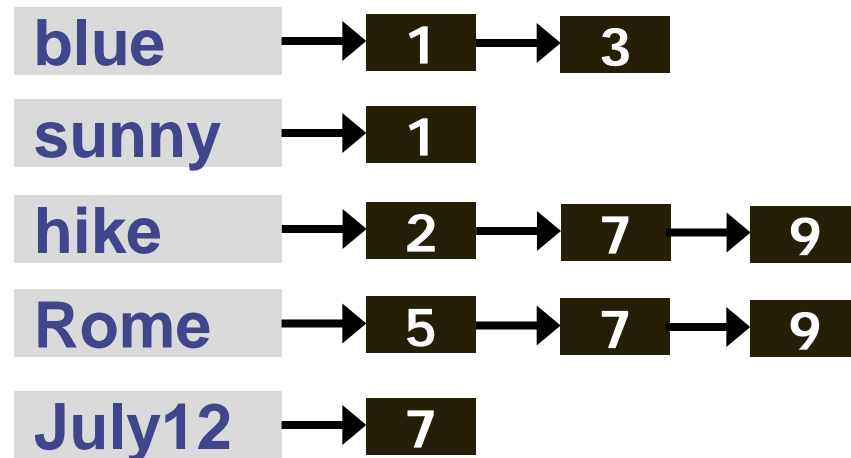
\*[Gennaro et al., EUROCRYPT13]

\*\*[Setty et al., EUROSYS13]



# Implementation & experiments

- C++
- NTL [1] and LiDIA [2] libraries for arithmetic ops
- DCLXVI [3] library for group operations
- Synthetic data
- Wall street journal corpus
  - Articles between 1987-1992
  - 173K articles & 135K terms

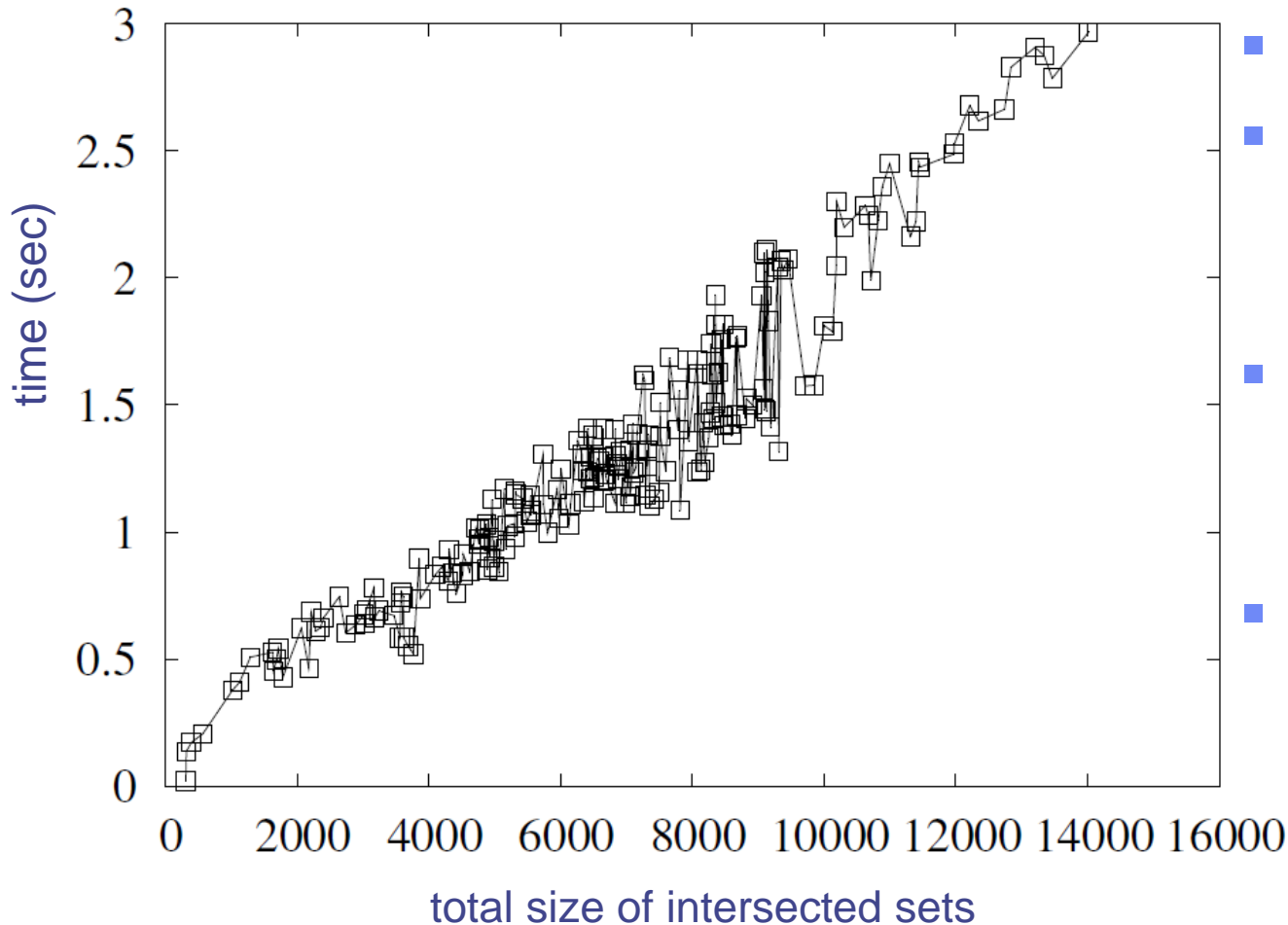


[1] [shoup.net/ntl](http://shoup.net/ntl)

[2] [cdc.informatik.tu-darmstadt.de/TI/LiDIA/](http://cdc.informatik.tu-darmstadt.de/TI/LiDIA/)

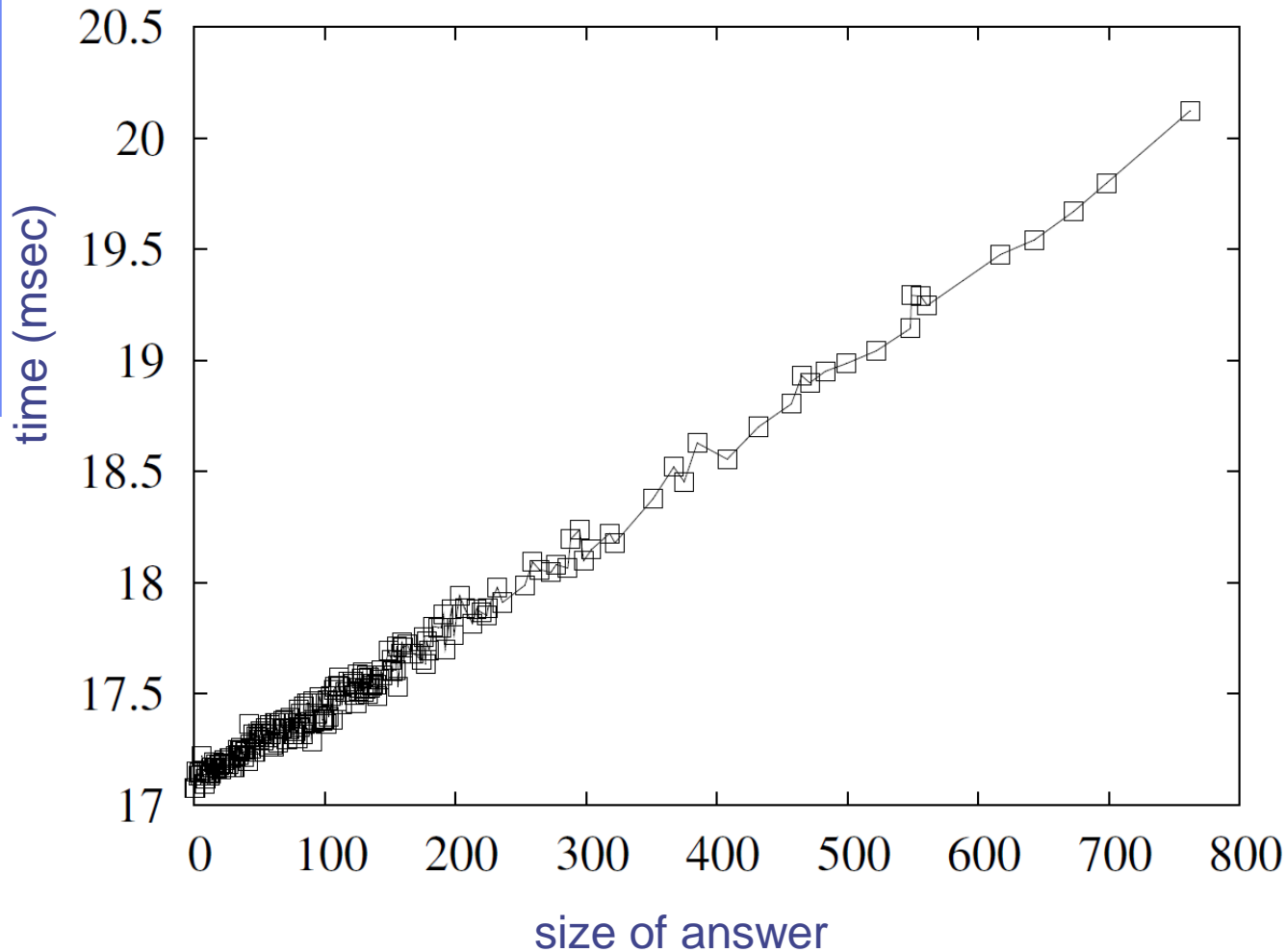
[3] [cryptojedi.org/crypto/](http://cryptojedi.org/crypto/)

# Time to compute proof (server)



- Two terms
- Answer mostly between 0-200 articles
- Scales even for popular keywords
- Parallelized when possible

# Time to verify proof (client)

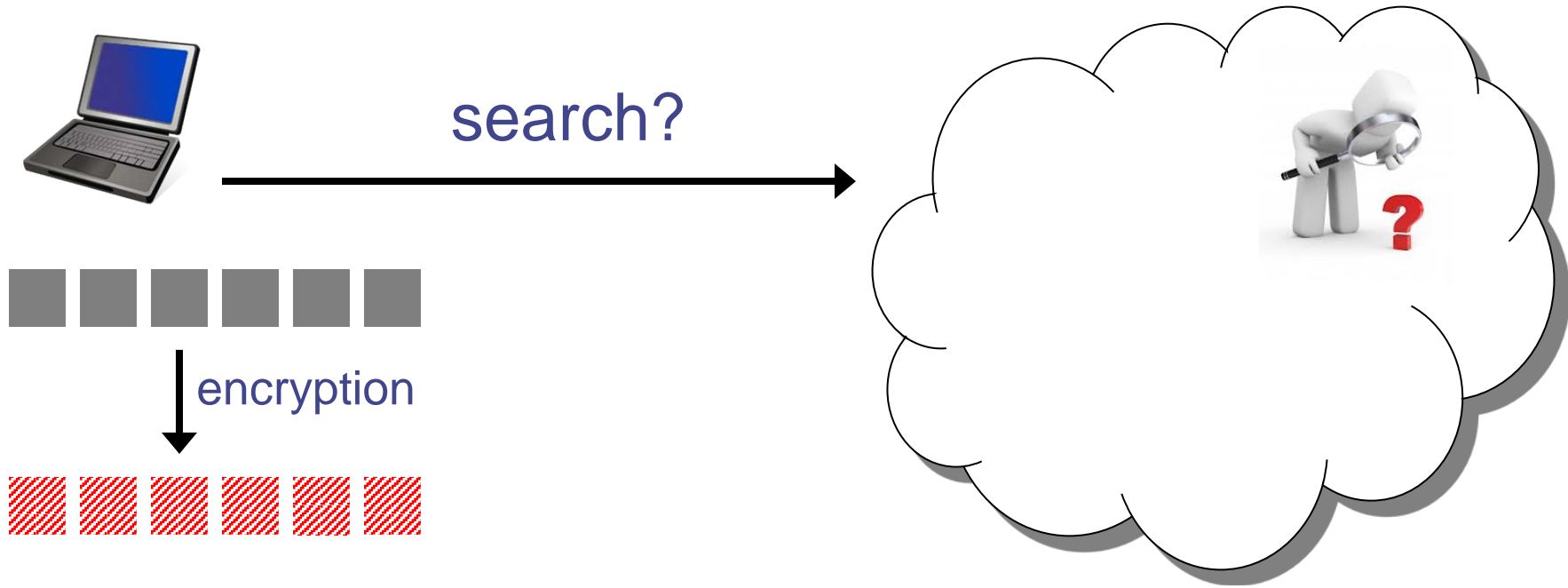


- Proportional to the size of the answer
- Order of milliseconds



**How about privacy?**

# Is encryption enough?



- How can you search your encrypted files?
  - Not feasible in principle
  - Encrypt with fully-homomorphic encryption (FHE)?
    - Not very practical

# Searchable encryption



search token



Searchable encryption since 2000



- Several algorithms
- **My work:** First dynamic efficient scheme, [CCS12]
  - Privately indexes keywords, not only files
  - Efficient system implementation
- **My work:** First parallel scheme, [FC13]
  - Uses a tree-based approach



# Research agenda

## Practical protocols

- Construct customized schemes, e.g., geometric/text processing queries
- Consider highly dynamic/streaming data

## Secure cloud computing in the age of big data

- Take advantage of multicore architectures, e.g., build parallel algorithms
- Implement on hardware

## Reconsider the model

- Relax assumptions, e.g., more efficiency with trusted hardware
- Consider multi-client settings

## Theoretical directions

- Cryptographic verification via certification algorithms
- Explore other crypto primitives (e.g., lattice-based cryptography)



**Thank you!**

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