



# Security and Privacy for Cloud Computing

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# Cloud Computing

- **Outsourcing**
  - Storage
  - Computation
- **High availability**
- **No maintenance**
- **Decreased Costs**
- **Elasticity & Flexibility**



# Security & Privacy Challenges

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## Outsourcing

- Potentially untrusted Service Provider
- Data storage and computations
  - ⇒ New requirements (PoR, verifiability, . . .)
  - ⇒ Crypto schemes dealing with untrusted partners
    - PIR
    - Secure multi-party computation
    - Computing with encrypted functions
    - Verifiability: proof of data possession, proof of execution

# Security & Privacy Challenges

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## Large scale

- Data
- Computations

### ⇒ Severely asymmetric scenarios

- Customer (verifier) << Service Provider (prover)
- “Quantum leap”: classical schemes don’t work, need for new approaches
- Example: integrity – customer cannot even keep a hash value per data split

### ⇒ Joint Crypto & Cloud schemes

# Security & Privacy Solutions

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- **Privacy**

- Privacy preserving word search
- Multi-user searchable encryption

- **Integrity**

- Proof of Retrievability
- Message-locked PoR

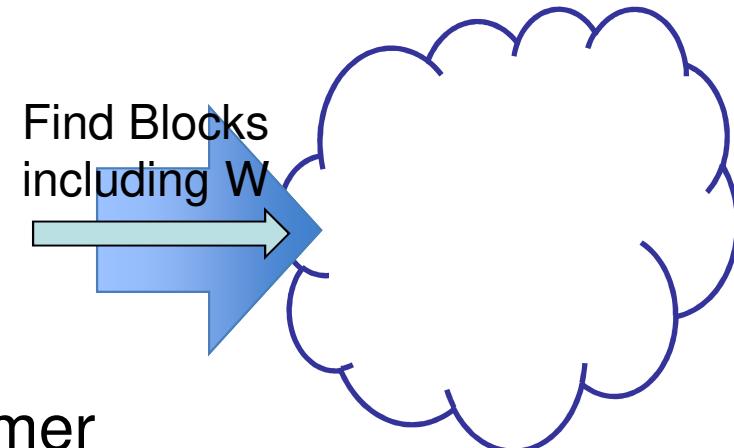
- **Verifiability**

- Verifiable computation
- Proof composition

# Privacy preserving word search

## Outsourced Backup Service

- several years' corporate data
- regularly stored in the Cloud
- Privacy  $\Rightarrow$  Encryption by the customer
- Query: only a small portion needs to be restored
- How to find it without downloading the entire DB?



Requirement for a new solution

- to **search words** in an **encrypted DB**
- with **privacy**

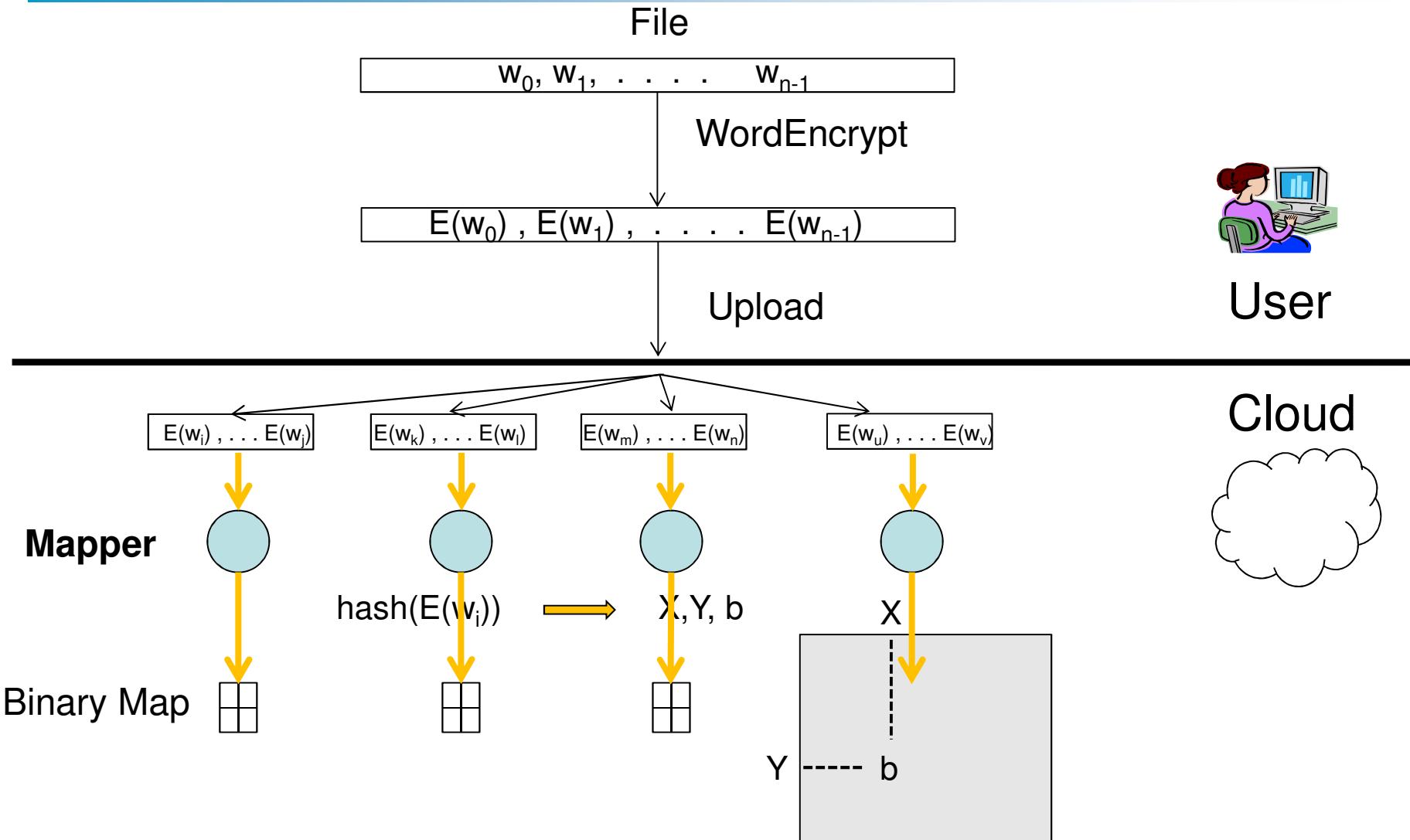
# Privacy preserving word search

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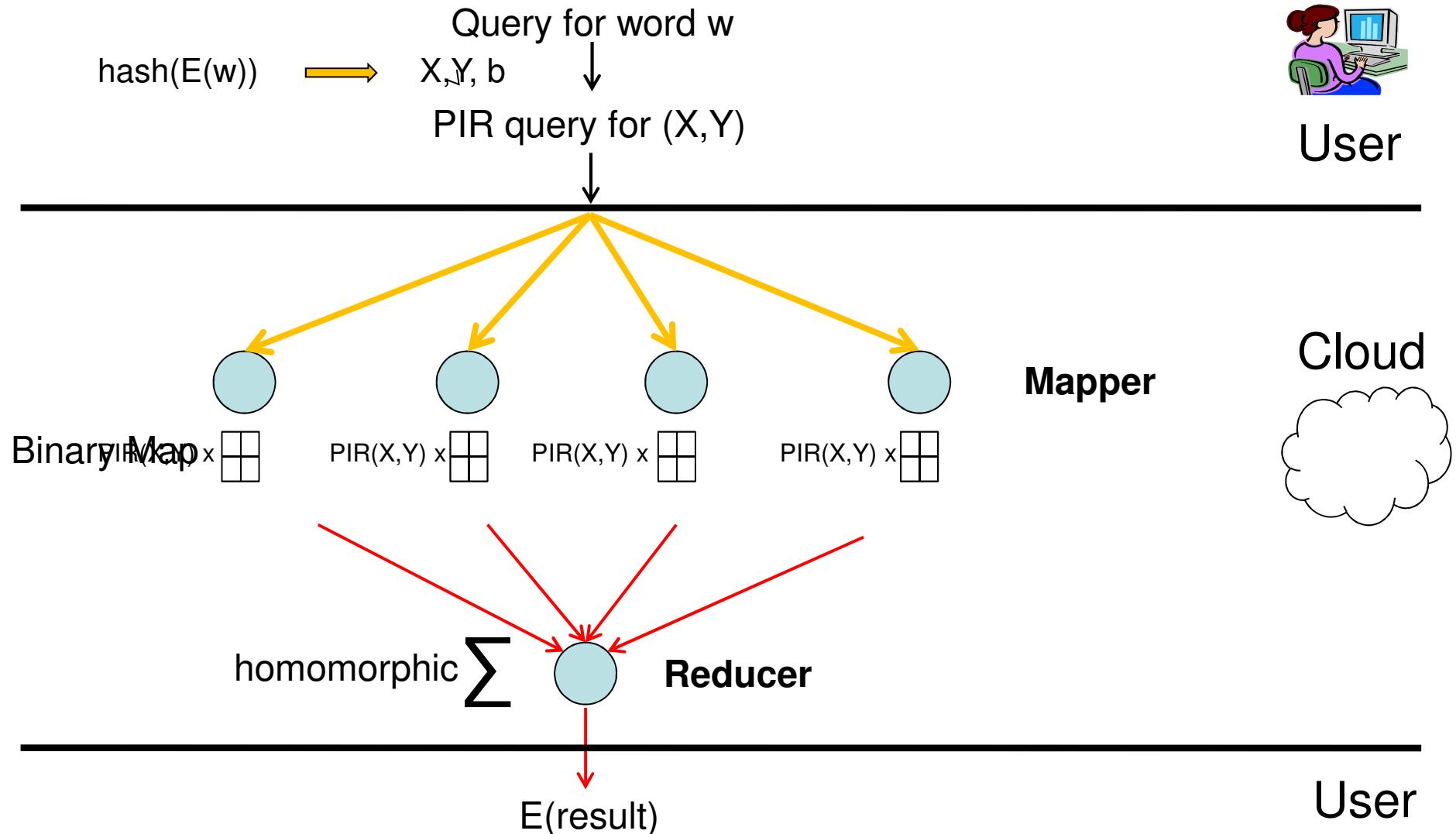
- **Existing solutions not scalable**
  - Encrypted keyword search algorithms
  - Private information retrieval (PIR)
  
- **PRISM: Privacy preserving search in MapReduce**
  - Data and query privacy
  - Idea: PIR on intermediate data maps
  - Advantage: parallelism with MapReduce

# PRISM - Upload

[PETS'12]

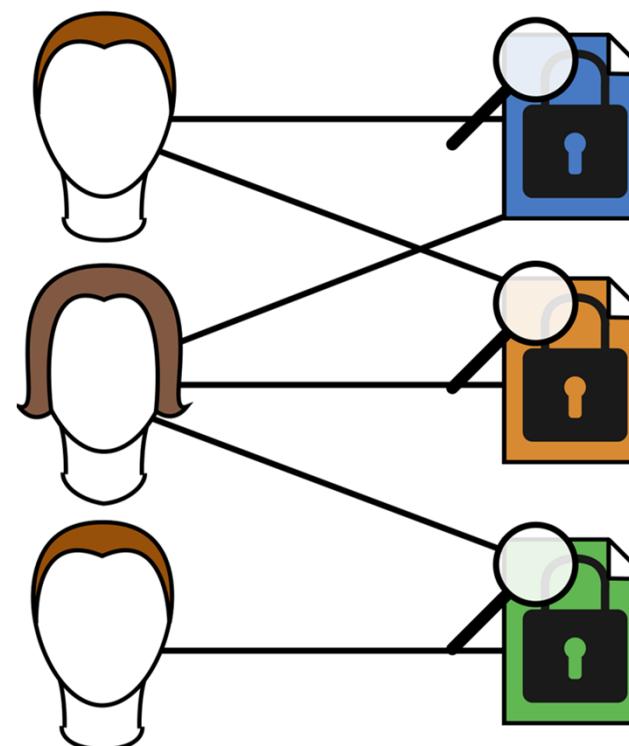


# PRISM – Word Search

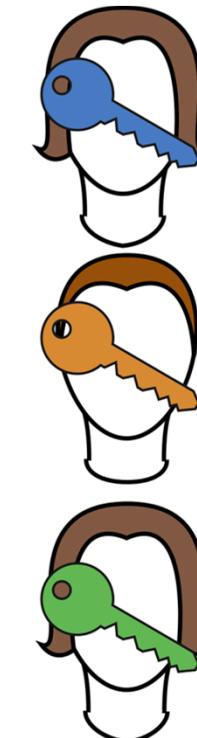


# Multi-user Searchable Encryption (MUSE)

Multiple Readers

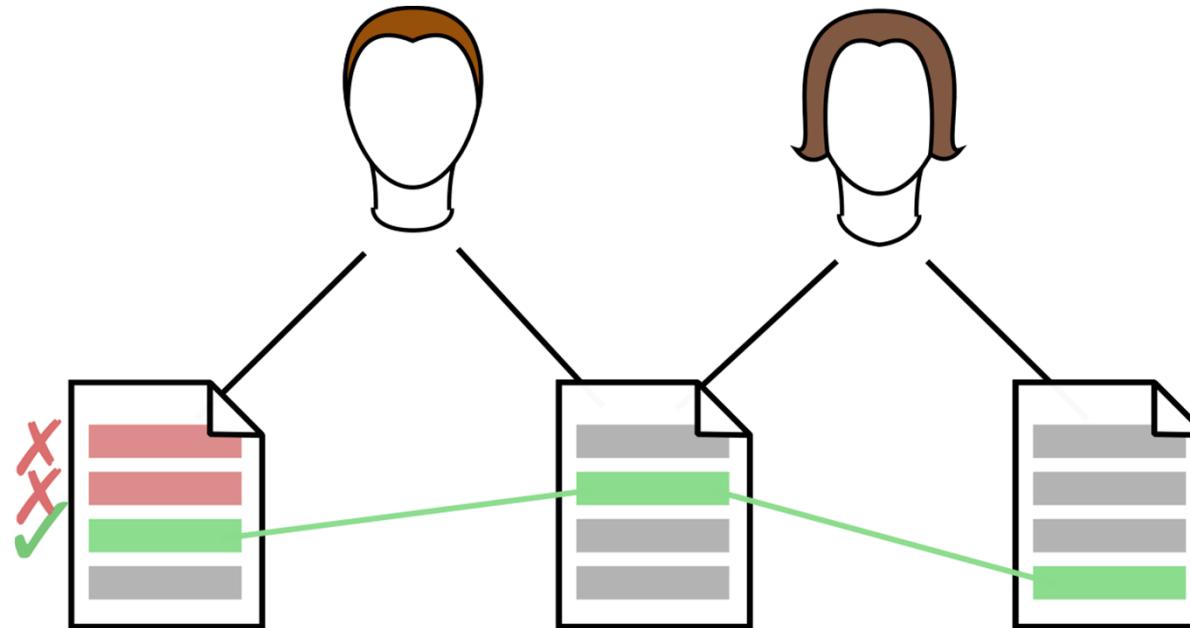


Multiple Writers



# SotA - Access pattern leakage [PETS'17]

- Iterative Testing

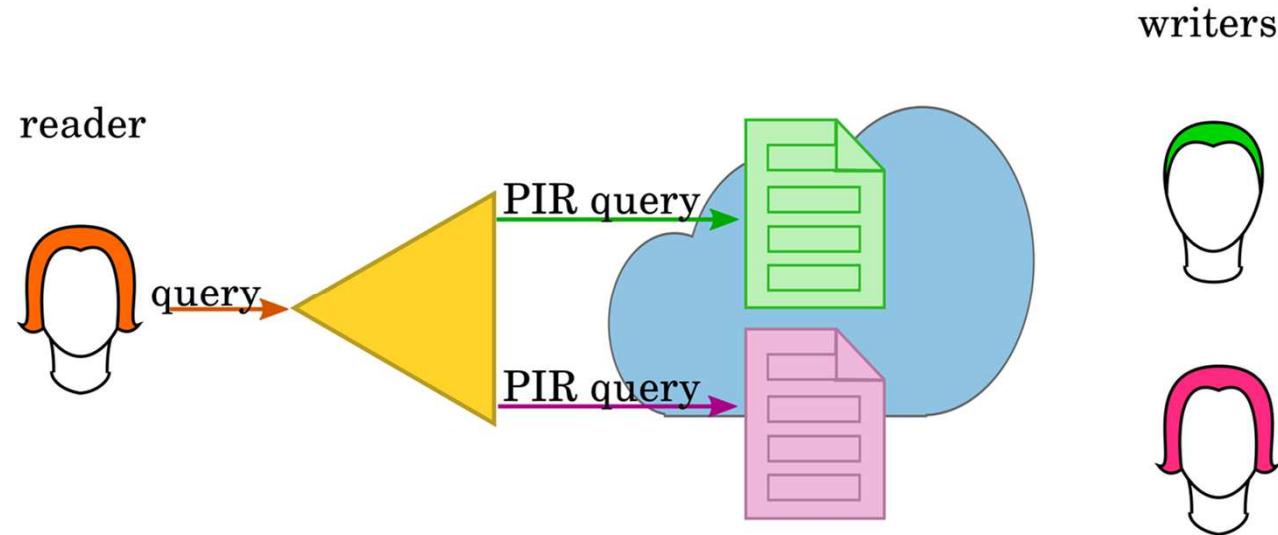


- *Each encrypted keyword is tested separately in all documents*
- *Similarities between documents & position of the keyword revealed*

**Collusion (CSP, User)  $\Rightarrow$  Privacy Breach**

# MUSE: Multi-User Searchable Encryption

[ISC'15]



*No collusion between Proxy and CSP*

# Cloud Security Research

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- **Privacy**

- Privacy preserving word search
- Multi-user searchable encryption

- **Integrity**

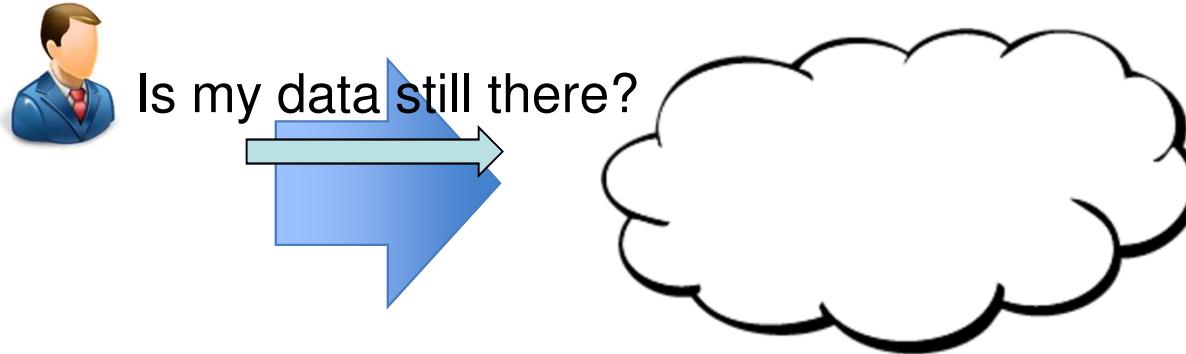
- Proof of Retrievability
- Message-locked PoR

- **Verifiability**

- Verifiable computation
- Proof composition

# Proof of Retrievability

- Motivating scenario: outsourced storage



- Requirements

- Integrity check by Client
- No data stored at Client
- No bulk data transfer

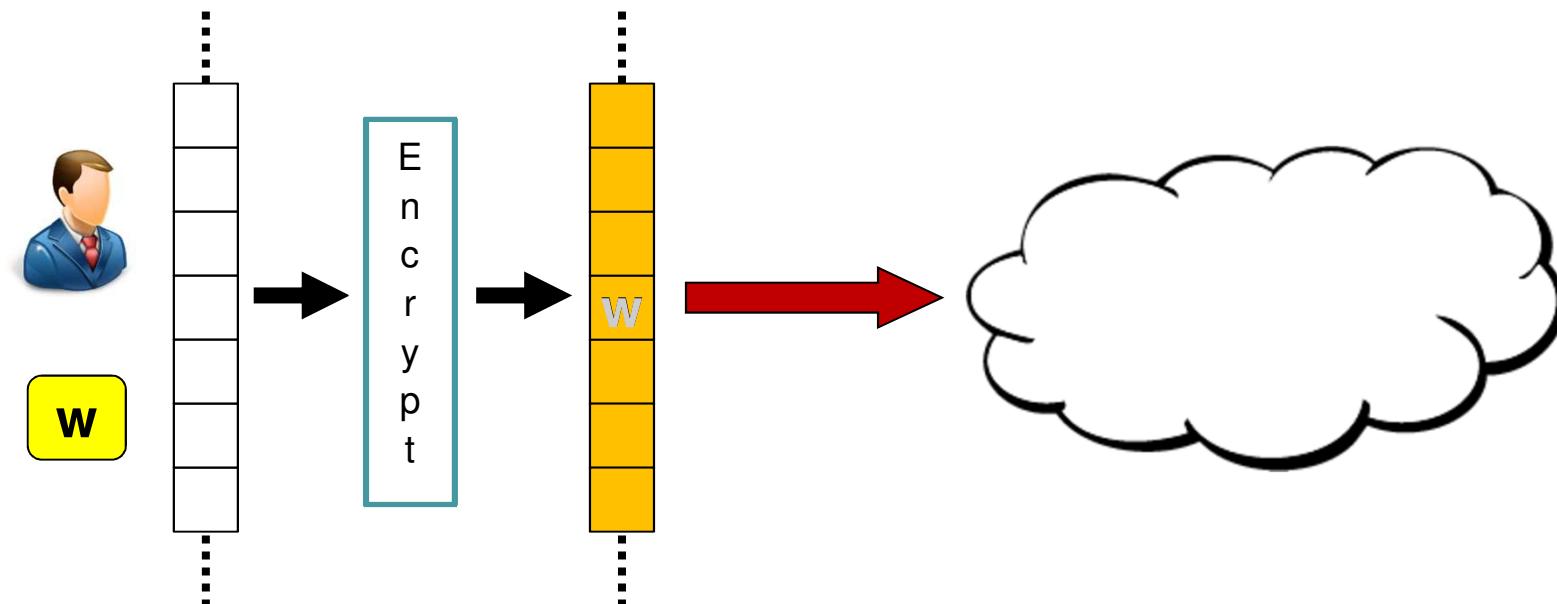
⇒ Proof of Retrievability (POR)

# Proof of Retrievability – Related Work

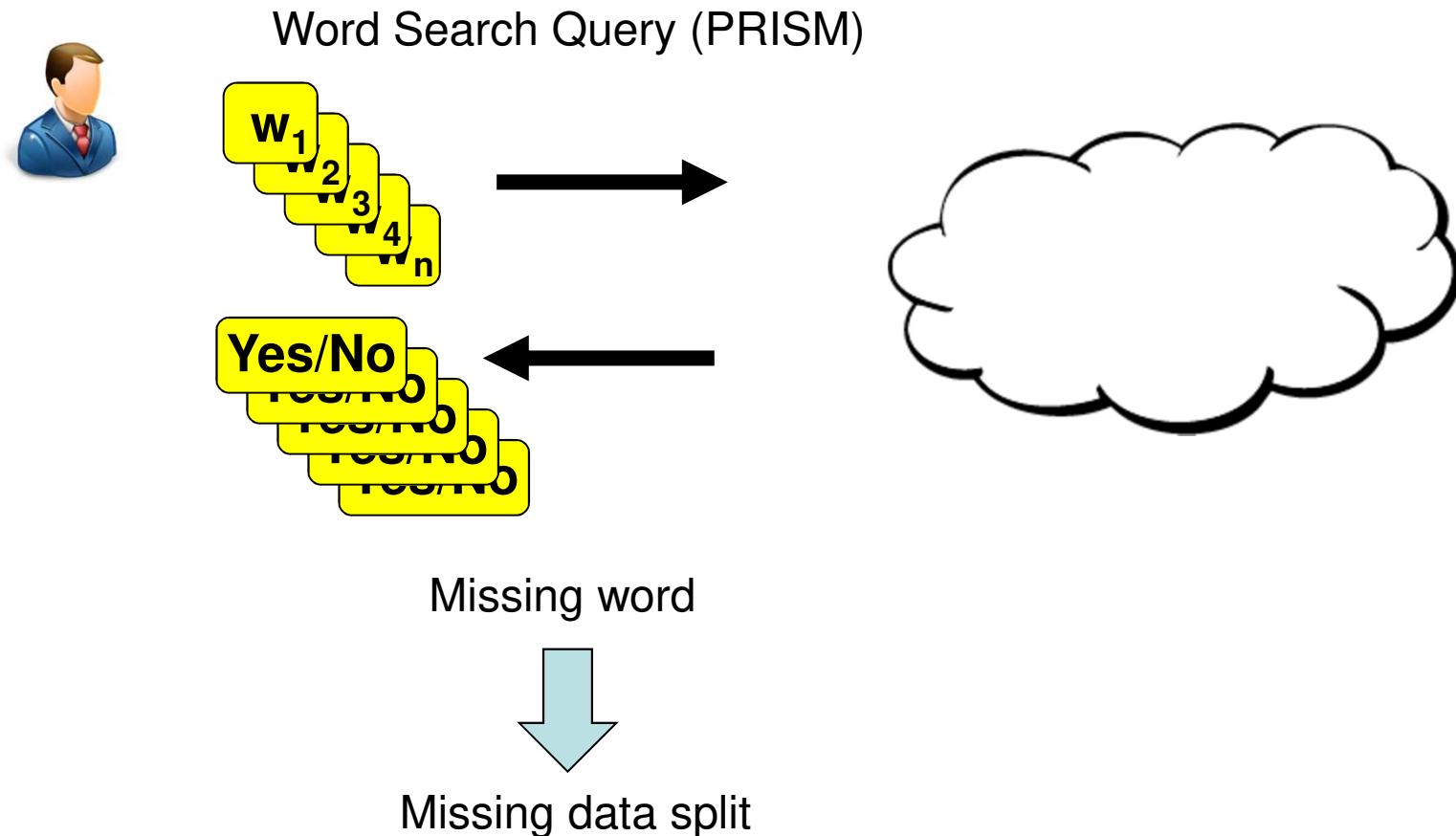
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- **Related work** [*Deswarthe et. al, Filho et. al, ...*]
  - Deterministic
    - ☞ Verification of the entire data  $\Rightarrow$  costly
  - Probabilistic    [*Ateniese et. al, Shacham et.al, Juels et al, ...*]
    - ☞ Tags for each block + random verification  $\Rightarrow$  cost of homomorphic ops
    - ☞ randomly located sentinels  $=>$  limited # of verifications
- **StealthGuard** [*ESORICS'14*]
  - privacy preserving search of watchdogs
  - Unbounded # of queries

# Proof of Retrievability - StealthGuard



# Proof of Retrievability – StealthGuard



# How many watchdogs to check?

or how to detect lack of retrievability?

Adversary Model:

Bernoulli processes  $\rho_{Adv}$

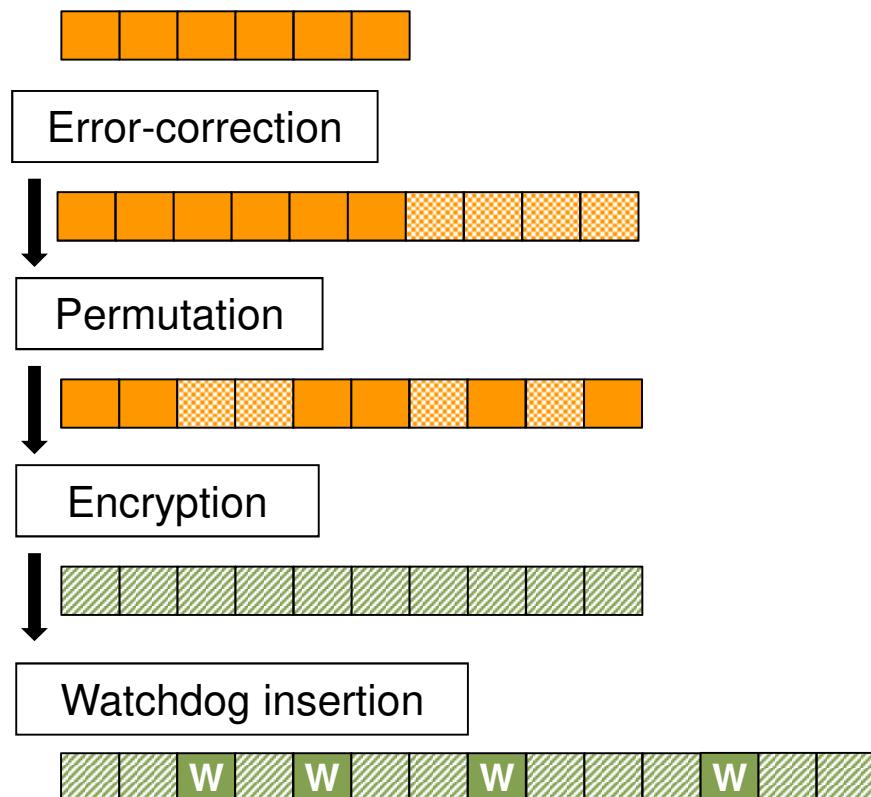
⇒ **Error-correction**  $\rho_n = f(\tau, \rho_{ECC}, m)$

Retrievability:  $\rho_{Adv} \leq \rho_n$

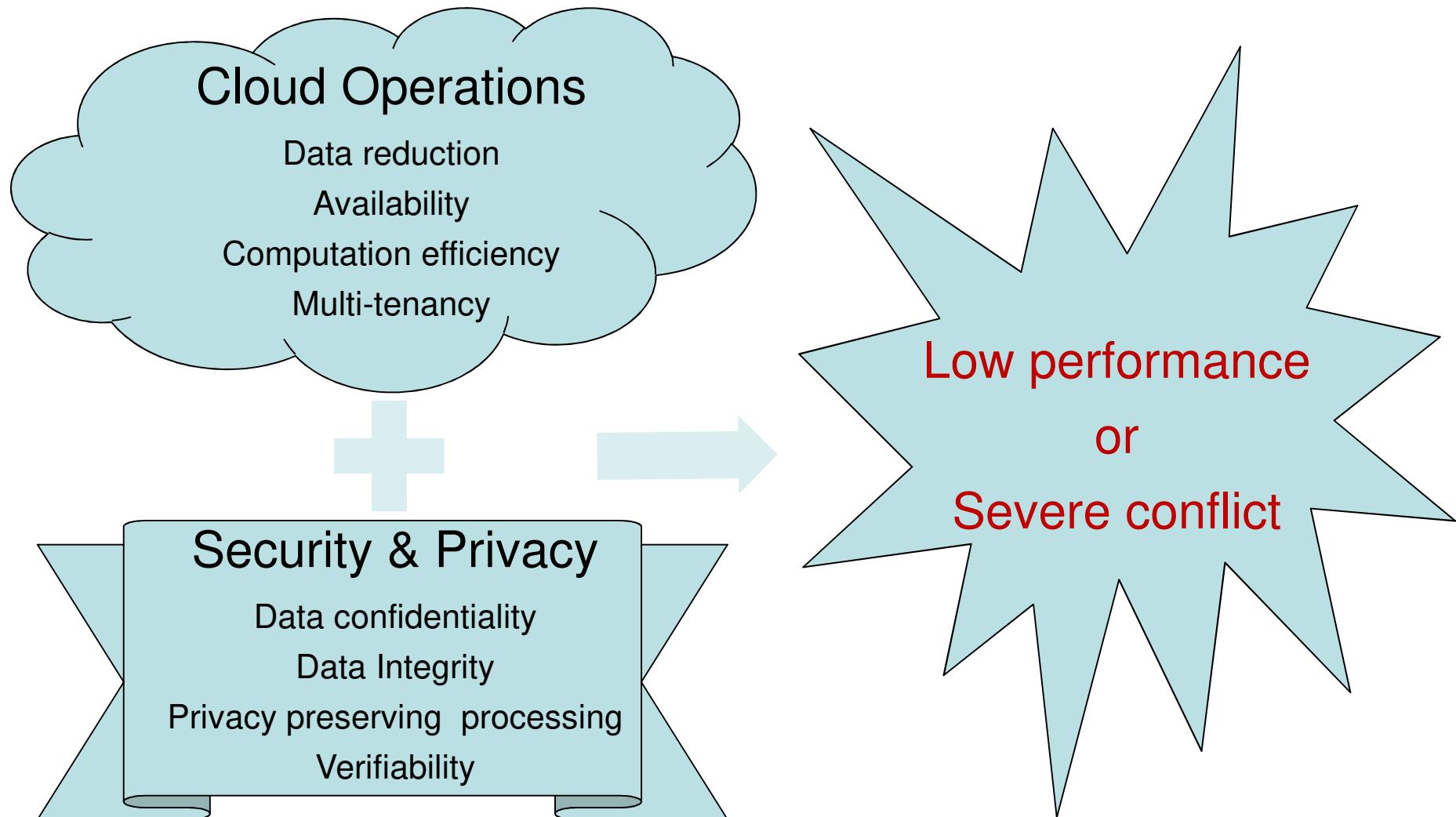
File not retrievable:  $\rho_{Adv} > \rho_n$

Detection:  $\gamma = f(\tau, \rho_n)$

## Setup by Client

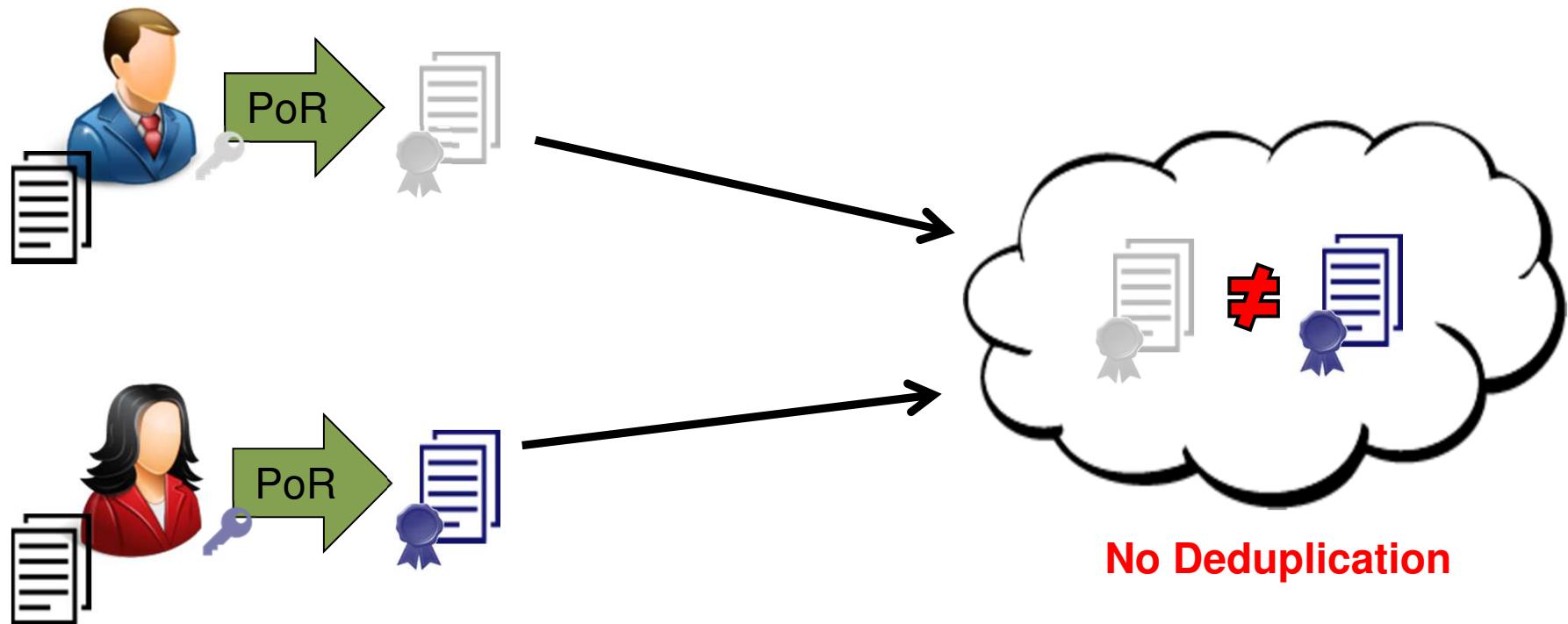


# The Integration Problem



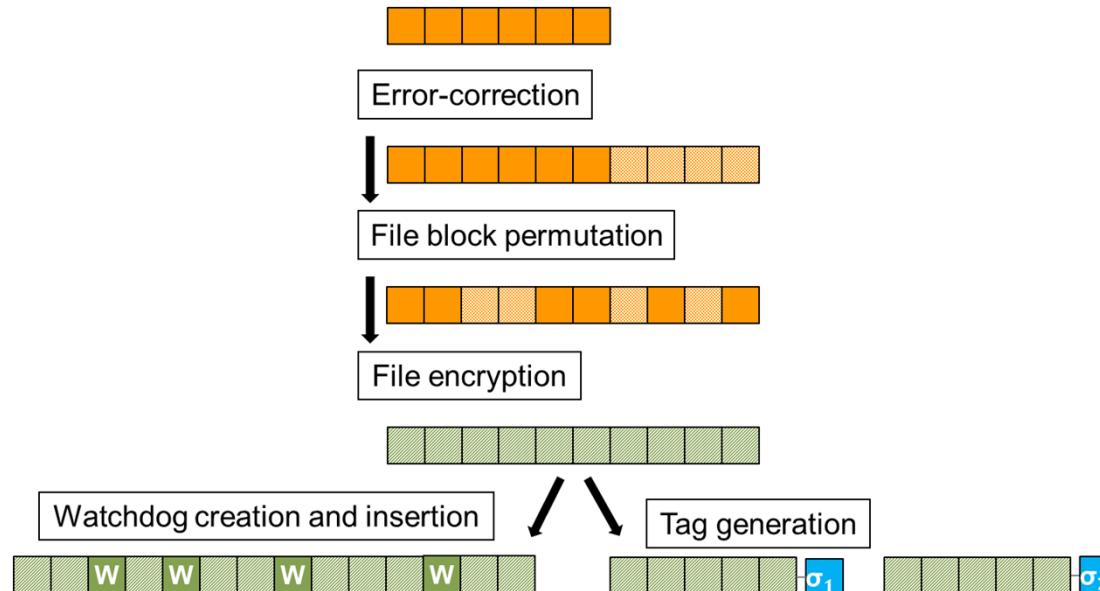
# Conflict between PoR & deduplication

- PoR → User specific encoding
- Deduplication → Keep a unique copy in storage



# Message-locked PoR - Idea

- PoR setup (Tags and Watchdogs)



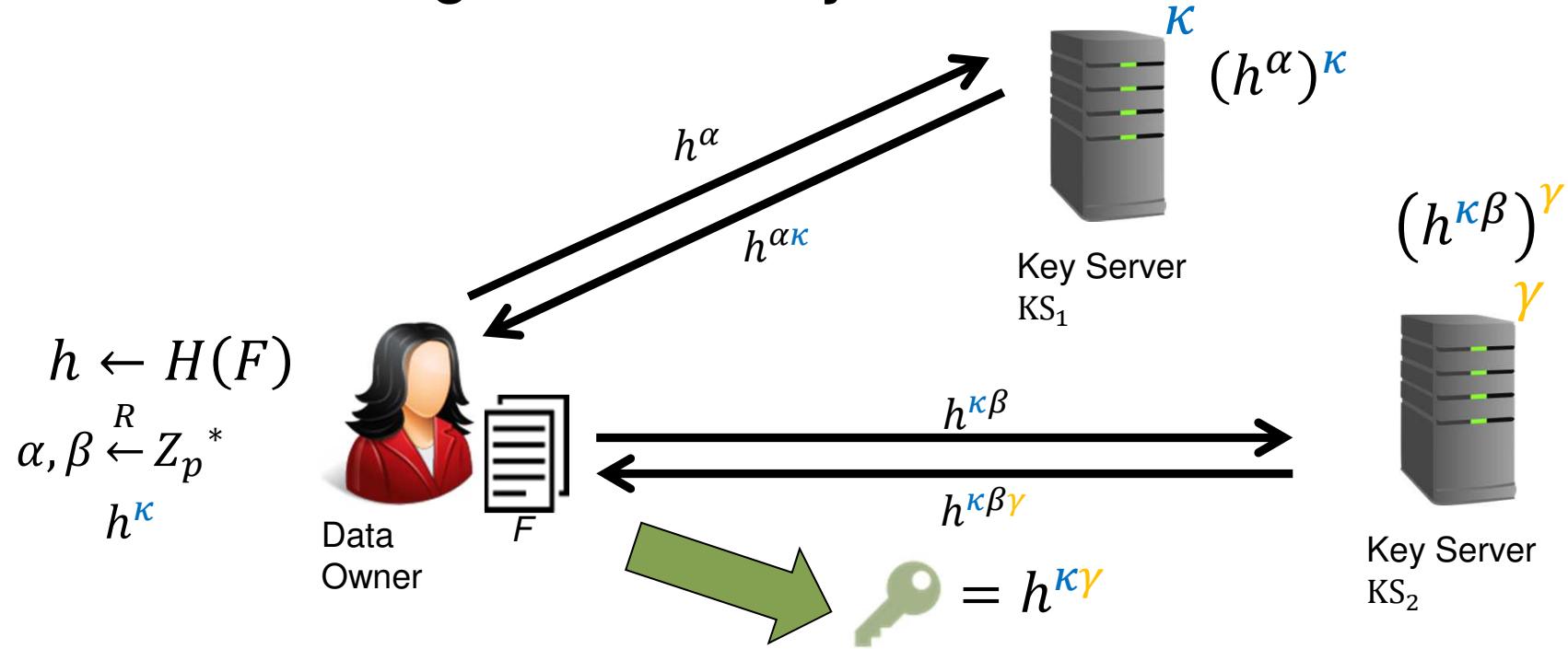
- PoR can be represented by  $P(F, K)$
- Derive  $K$  from file content

Convergent Encryption ( $K = H(F)$ ) suffers from dictionary attacks

⇒ **Secure Message-Locked Key Generation**

# Message-locked PoR [CCSW'16]

- Secure Message-Locked Key Generation



- Message-locked PoR = PoR using in  $P(F, K)$ 
  - StealthGuard – watchdogs
  - Private Compact PoR - tags [Shacham et al 2008]

# Cloud Security Research

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- **Privacy**

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- De-duplication on encrypted data

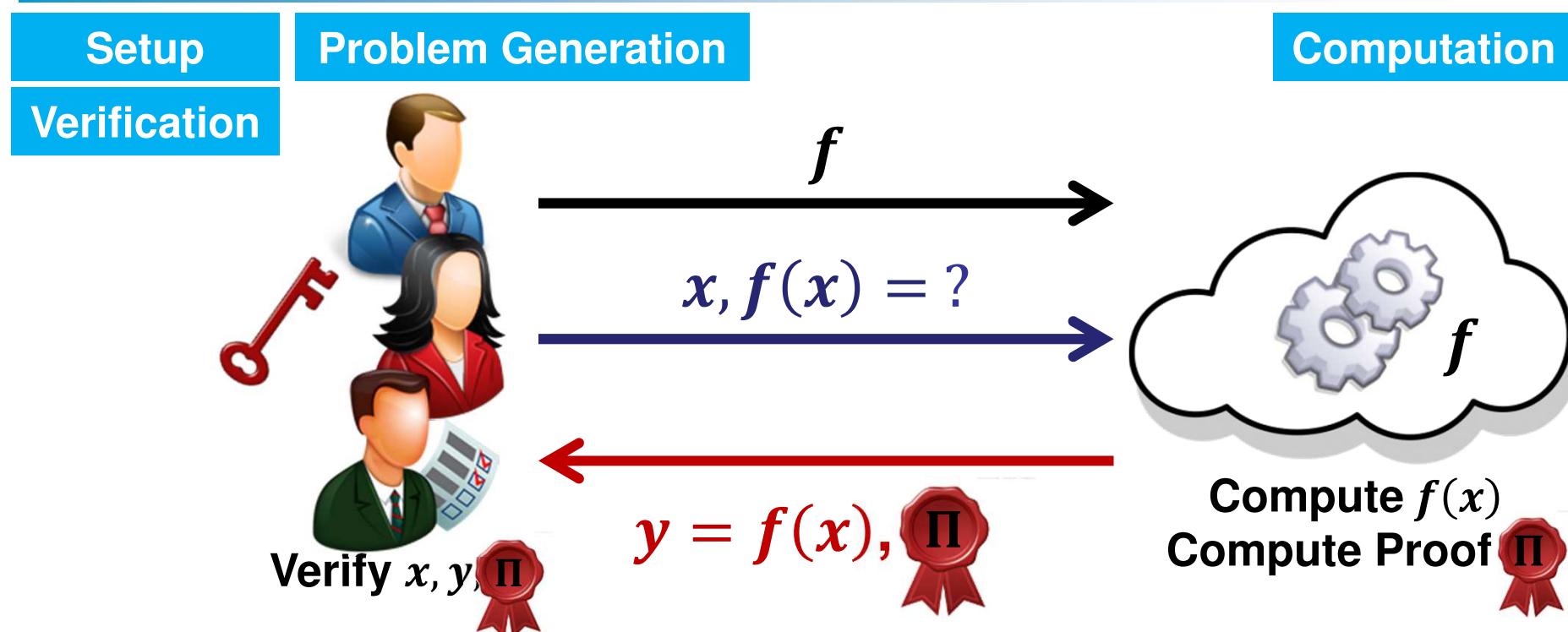
- **Integrity**

- Proof of Retrievability

- **Verifiability**

- Verifiable computation
- Proof composition

# Verifiable Computation



**R1: Cost(Verify) << Cost(Compute)**

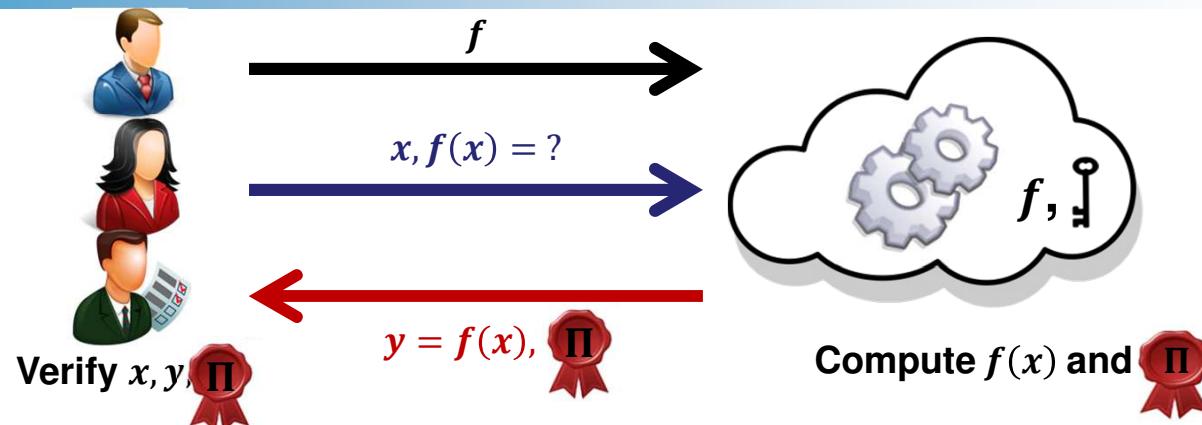
**R2: Public delegatability** [Parno et al. 2012]

Anyone can submit a computation request

**R3: Public verifiability** [Parno et al. 2012]

Anyone can verify a computation result

# Verifiability for 3 Operations



**High-Degree  
Polynomial Evaluation**

$f$

$$A(X) = \sum_{i=0}^d a_i X^i \in \mathbb{F}_p[X]$$

**Large Matrix  
Multiplication**

$$\mathbf{M} \cdot \vec{x} \text{ with } \mathbf{M} = [M_{ij}] \in \mathbb{F}_p^{n \times m}$$

**Conjunctive  
Keyword Search**



$x$

$$x \in \mathbb{F}_p$$

$$\vec{x} = (x_1, x_2, \dots, x_m)^\top \in \mathbb{F}_p^m$$

$$\textbf{Keywords } \mathbb{W} = \{\omega_1, \omega_2, \dots, \omega_n\}$$

$y$

$$y = A(x) \in \mathbb{F}_p$$

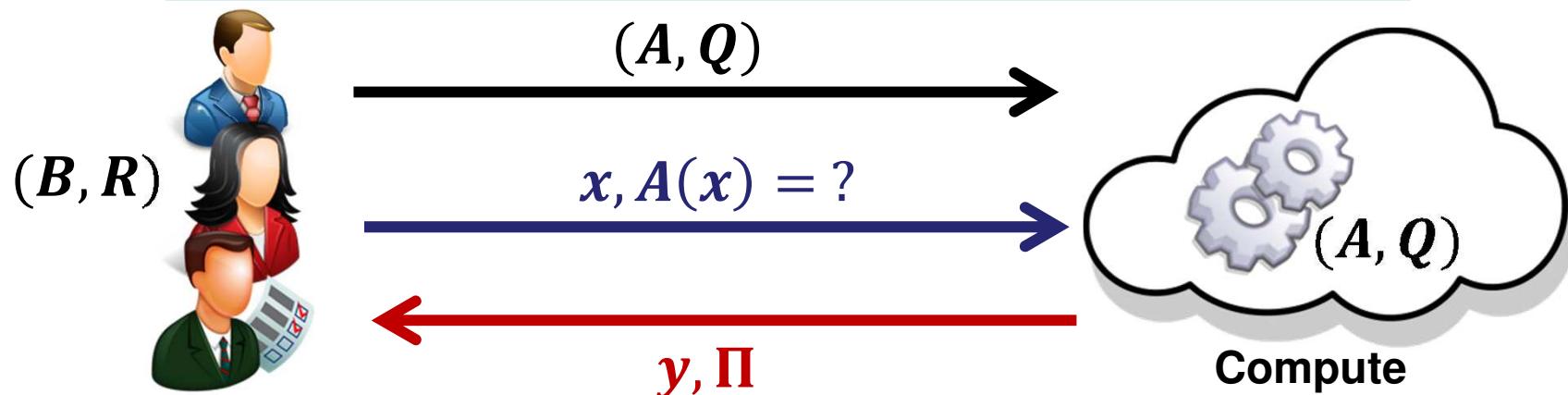
$$\vec{y} = (y_1, y_2, \dots, y_n)^\top = \mathbf{M} \vec{x} \in \mathbb{F}_p^n$$

**ID of files  $F_i$  such that  $\mathbb{W} \subset F_i$**

# Verifiable Polynomial Evaluation – Idea

## Euclidean Division of Polynomials

$$A = QB + R$$



**Verify**  
 $y = \Pi B(x) + R(x) ?$

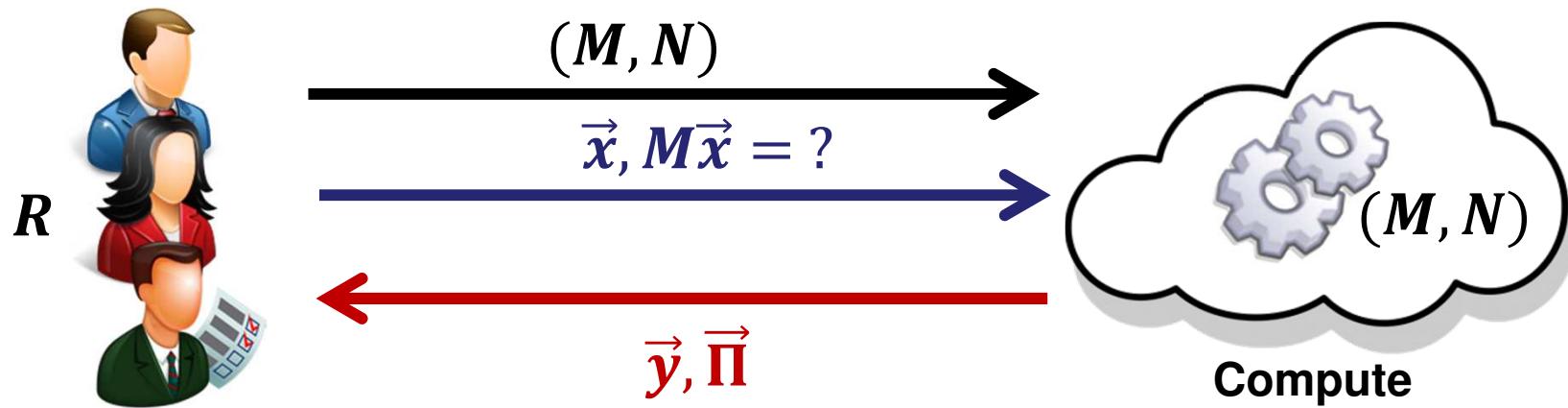
$B, R$  small degree

# Verifiable Matrix Multiplication – Idea

## Auxiliary Matrices

$$N = \delta M + R$$

*R pseudo-random*



Compute  
 $\vec{y} = M\vec{x}$   
 $\vec{\Pi} = N\vec{x}$

Projection  $\vec{\lambda} \cdot \vec{\Pi} = \vec{\lambda} \cdot \delta\vec{y} + \vec{\lambda} \cdot (R\vec{x})$

# Cloud Security Research

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- **Integrity**

- Proof of Retrievability

- **Verifiability**

- Verifiable computation
- Proof composition

# Proof Composition Problem

## Verifiability of general purpose programs

- Efficient methods for handling sequence of operations  
**Pinocchio** [Parno et al]
- Efficient schemes for a single very complex operation
- No technique achieving both purposes

*program P(x)*  
 $a := A(x)$   
 $b := B(a)$   
⋮  
 $z := Z(y)$

### Example:

*program NN2(x)*  
 $a := M_1 \cdot x$   
 $b := \text{relu}(a)$   
 $c := M_2 \cdot b$

# Proof Composition - Problem

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*program P(x)*

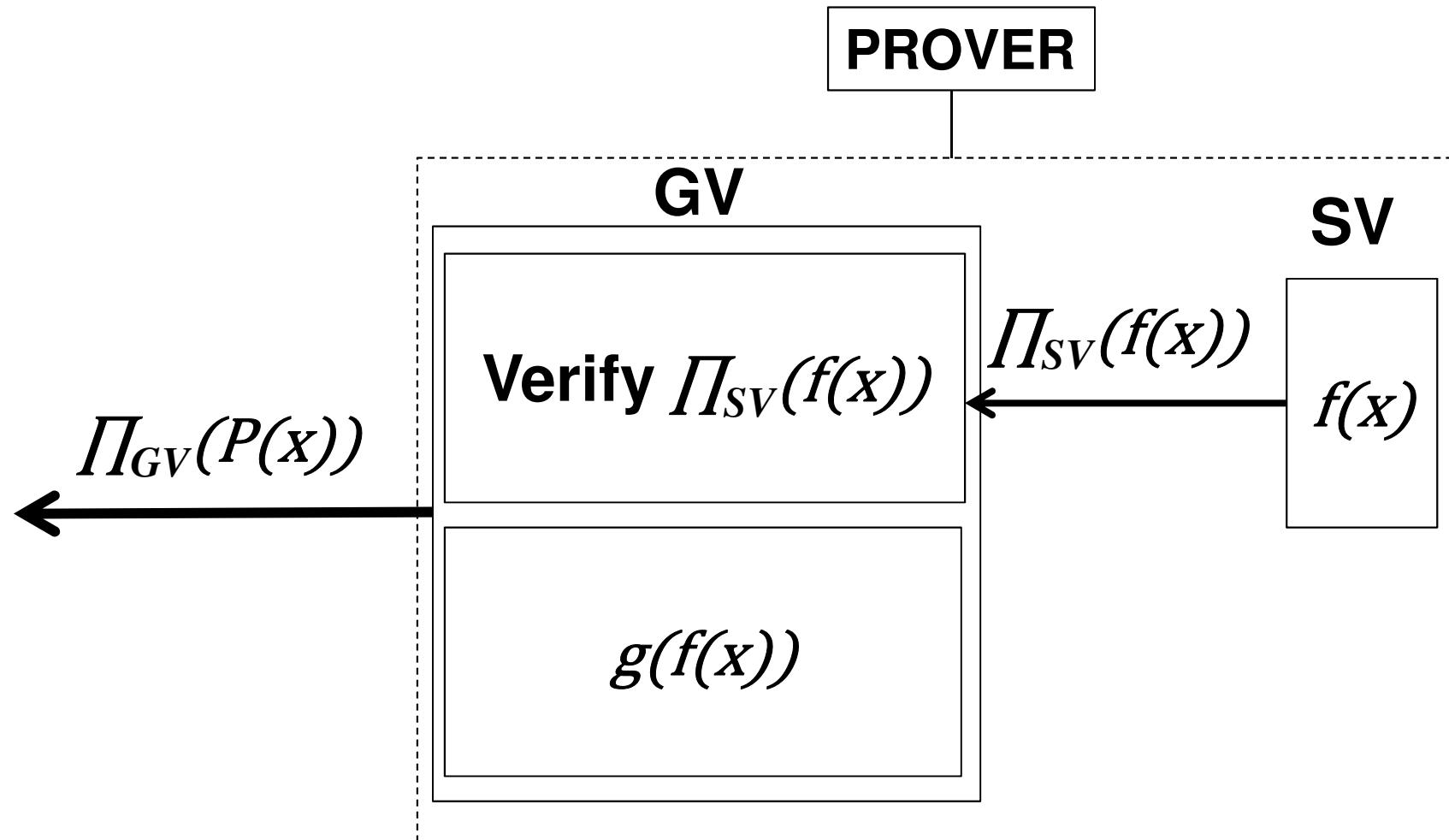
*a := f(x)*

*b := g(a)*

- *f* : high complexity
- *g* : low complexity
- GV : verifiability for a sequence of operations  
(Pinocchio)
- SV : verifiability for a complex function (product of very large matrices)

# Proof Composition - Idea

## Outsourced proof generation



# Conclusion

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- **Privacy**
- **Integrity**
- **Verifiability**



Outsourcing



Big Data

## Outlook

- **Efficient & practical**
- **Integration - S&P with Cloud, DB**
- **“New topics”**
  - Secure deletion
  - Proof of reliability
  - Verifiability / location, physical memory

# Acknowledgments

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- EU Projects



- Collaborators

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- Monir Azraoui, Erik Blass, Roberto Di Pietro, Kaoutar Elkhiyaoui, Melek Önen

# Papers

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- *A leakage-abuse attack against multi-user searchable encryption*, C. Van Rompay, R. Molva, M. Önen, PETS 2017
- *Reconciling security and functional requirements in multi-tenant clouds*, G. Karame, M. Neugschwandtner, M. Önen, H. Ritzdorf, SCC 2017
- *Message-locked proofs of retrievability with secure deduplication*, D. Vasilopoulos, M. Önen, Melek; K. Elkhiyaoui, R. Molva, CCSW 2016
- *Efficient Techniques for Publicly Verifiable Delegation of Computation*, M. Azraoui, K. Elkhiyaoui, M. Önen, R. Molva, ASIACCS 2016
- *PUDA- Privacy and Unforgeability for Data Aggregation*, I. Leontiadis, K. Elkhiyaoui, M. Önen, R. Molva, in CANS 2015
- *Publicly verifiable conjunctive keyword search in outsourcing databases*, M. Azraoui, K. Elkhiyaoui, M. Önen, R. Molva, SPC 2015,
- *Multi-user searchable encryption in the cloud*, C. Van Rompay, R. Molva, M. Önen, ISC'15
- *PerfectDedup*, P. Puzio, R. Molva, M. Önen, S. Loureiro, DPM 2015
- *StealthGuard: Proofs of Retrievability with hidden watchdogs*, M. Azraoui, K. Elkhiyaoui, R. Molva, M Önen, ESORICS 2014

# Papers (cont'd)

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- *Privacy preserving delegated word search*, K. Elkhiyaoui, M. Önen, R. Molva, SECRYPT 2014
- *A-PPL: An accountability policy language*, M. Azraoui, K. Elkhiyaoui, M. Önen, K. Bernsmed, A. Santana de Oliveira, J. Sendor, DPM 2014
- *Private and dynamic time-series data aggregation with trust relaxation*, I. Leontiadis, K. Elkhiyaoui, R. Molva, CANS 2014
- *Privacy preserving statistics in the smart grid*, I. Leontiadis, R. Molva, M. Önen, DASEC 2014
- *ClouDedup: Secure deduplication with encrypted data for cloud storage*, P. Puzio, R. Molva, M. Önen, S. Loureiro, CLOUDCOM 2013
- *Privacy preserving delegated word-search in the cloud*, K. Elkhiyaoui, M. Önen, R. Molva, TCLOUDS 2013
- *PRISM- Privacy preserving Search in Map Reduce*, E.-O. Blass, R. Di Pietro, R. Molva, M. Önen, PETS 2012



**THANK YOU**