

http://crypto.cs.stonybrook.edu

# **Secure Data Outsourcing**

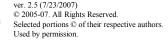
Tutorial @ VLDB 2007

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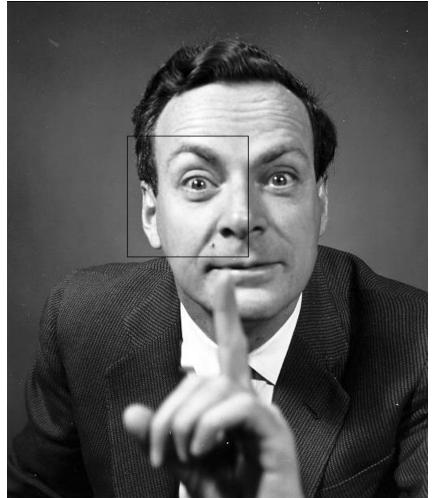


National Science Foundation





# **Feynman moment**



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"I have much experience only in teaching graduate students [...] and as a result [...] I know that I don't know how to teach."

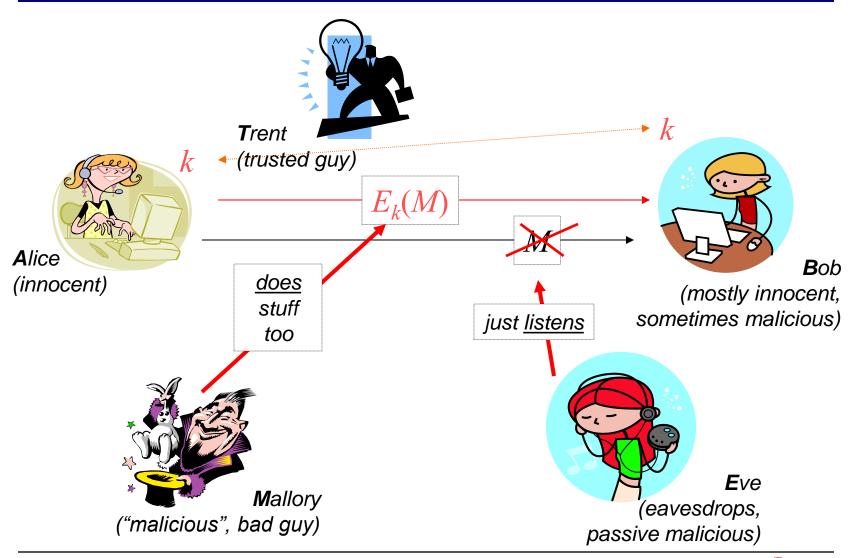
- Crypto Crash Course
- Data Outsourcing
- Query Correctness
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- Trusted Hardware



- Randomness
- Crypto Hashes
- Encryption
- Public key encryption
- Signatures
- Ciphers
- Semantic Security
- Forward Secrecy
- Performance
- Merkle/Hash trees

# **Crypto: Meet the cast**

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Secure Data Outsourcing (VLDB, September 2007)

*Cryptographically random numbers*: a sequence of numbers  $X_1, X_2, \ldots$  such that for any integer k > 0, it is **impossible** for an observer to predict  $X_k$  even if all of  $X_1, \ldots, X_{k-1}$  are known.

**Problem:** True RNGs cannot be deterministically algorithmic in a closed system. "Anyone who considers arithmetic methods ... is in a state of sin" (von Neuman)

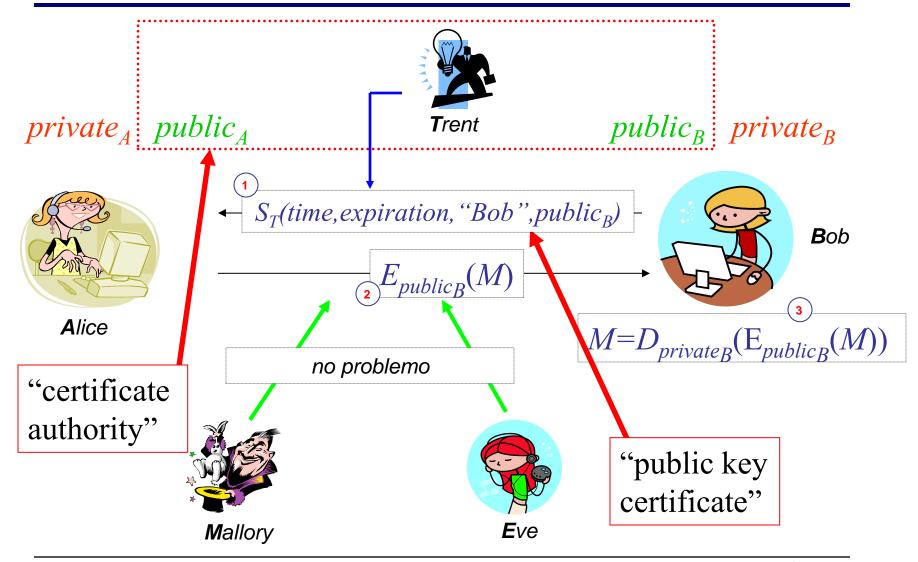
**Being creative:** simulate a sequence of cryptographically random numbers but generate them by an algorithm.

*Pseudo-random numbers*: a sequence of numbers  $X_1, X_2, ...$  such that for any integer k > 0, it is **hard** for an observer to predict  $X_k$  even if all of  $X_1, ..., X_{k-1}$  are known.

- A hash is a one-way, non-invertible function of that produces unique (with high likelihood), fixed-size outputs for different inputs.
- The probability of any bit "flipping" in the output bit-string should be always ½ for any change (even one bit) in the input ("randomness").



# **Crypto: PKI**

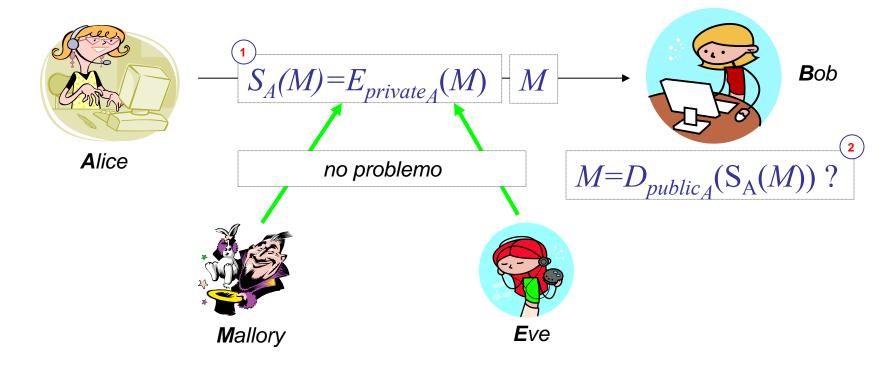


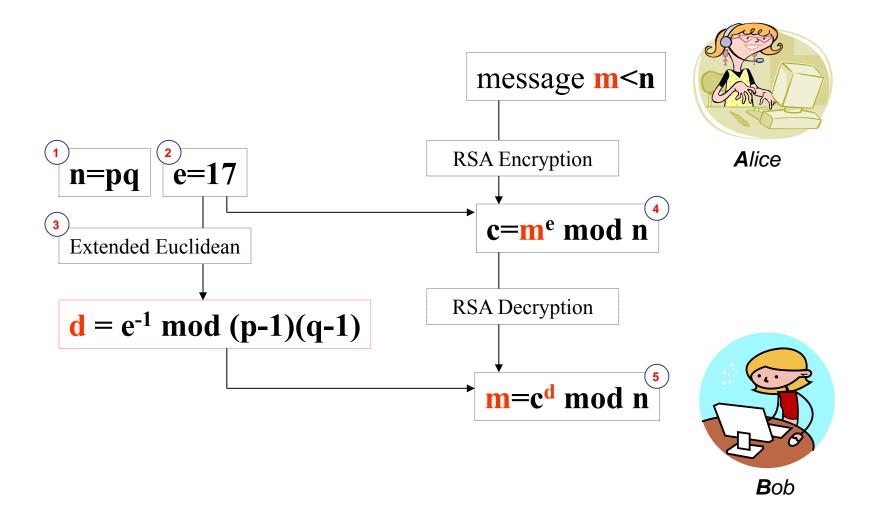
Secure Data Outsourcing (VLDB, September 2007)

 $M = D_{private_A}(E_{public_A}(M)) = D_{public_A}(E_{private_A}(M))$ 

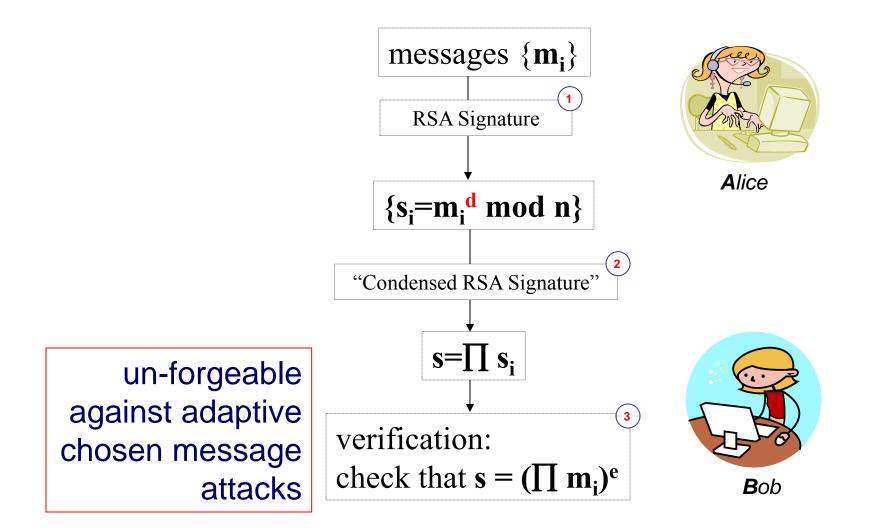
 $private_A public_A$ 

 $public_B private_B$ 



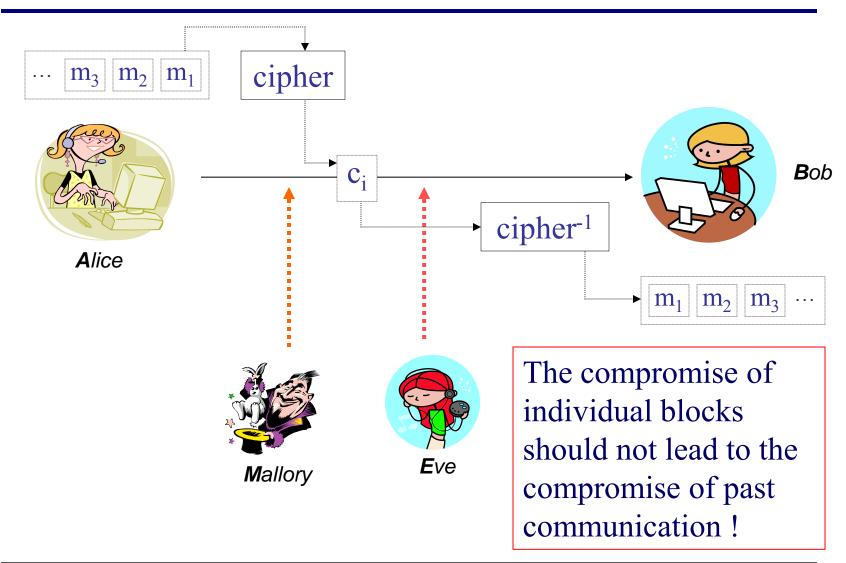


# **Crypto: Condensed RSA**

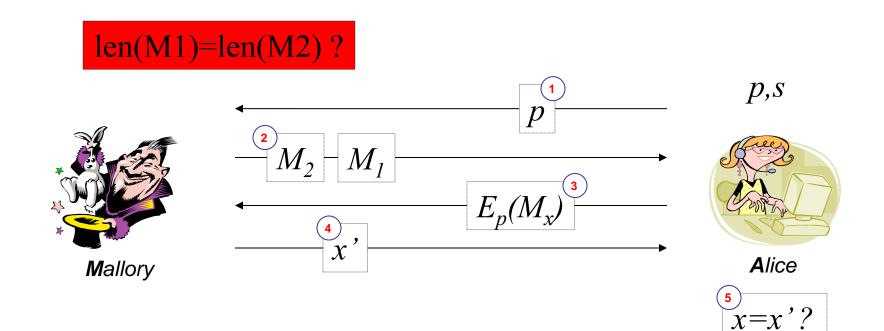


# **Crypto: Ciphers**

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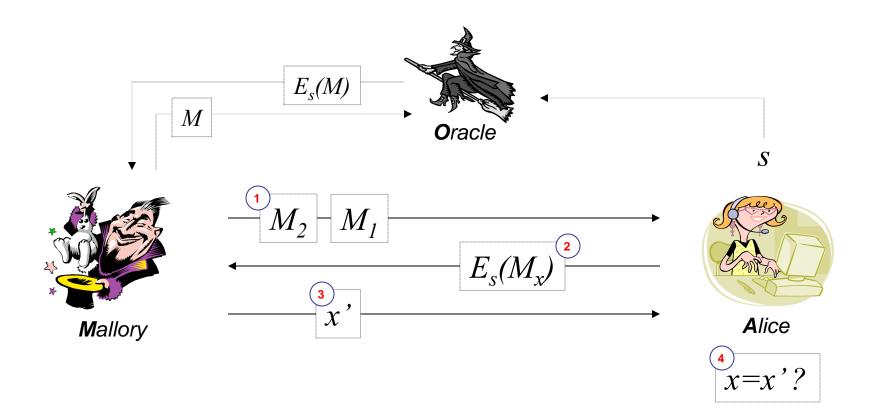
12



E() is **indistinguishable under a chosen plaintext attack** (IND-CPA, "semantically secure") if no probabilistic polynomial time-bounded Mallory can succeed in finding x', significantly better than guessing.

# **Crypto: Semantic Security**

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- Deterministic + stateless = insecure !
- Semantic security implies *bit security* !
- RSA : not semantically secure ! Why ?!
- RSA + padding (e.g., RSA-OAEP): ok

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# Future compromise (e.g., of PK secrets) should not propagate backwards in time.



# **Crypto: Performance**

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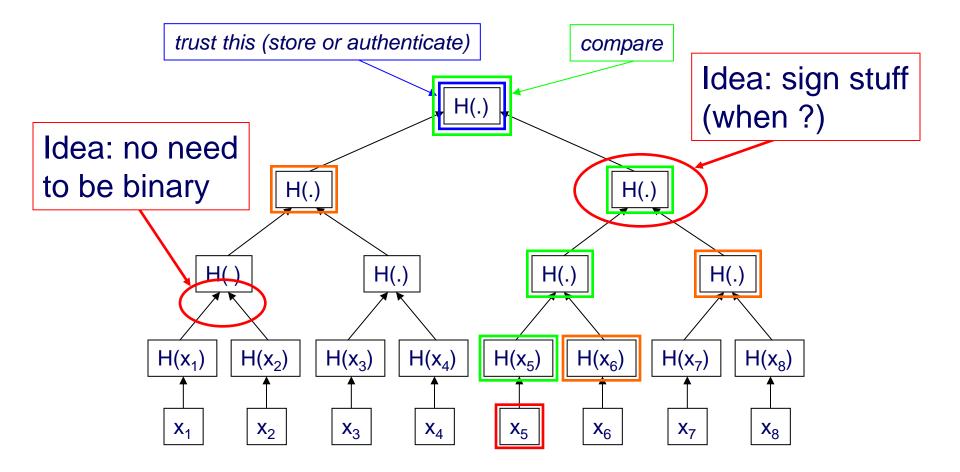


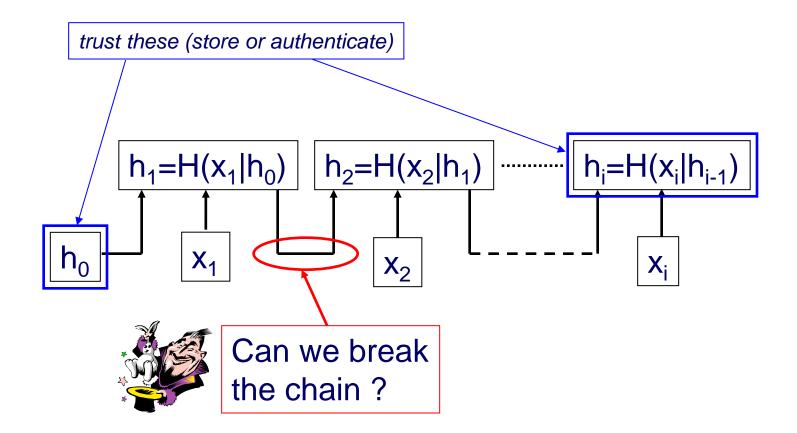
#### Illustrative baseline. approx. Pentium 4. 3.6GHz. 1GB RAM. 11000 MIPS. OpenSSL 0.9.7f

DES/CBC: **70MB/sec** RC4: **138MB/sec** MD5: **18-615MB/sec** SHA1: **18-340MB/sec**  Modular MUL 1024: **273000/sec** RSA1024/2048 sign/s: **261/50** RSA1024 verify/s: **5324/1600** 3DES: **26MB/sec** Paillier1024 enc/dec:**12/30 / sec** 



# **Crypto: Merkle/Hash trees**



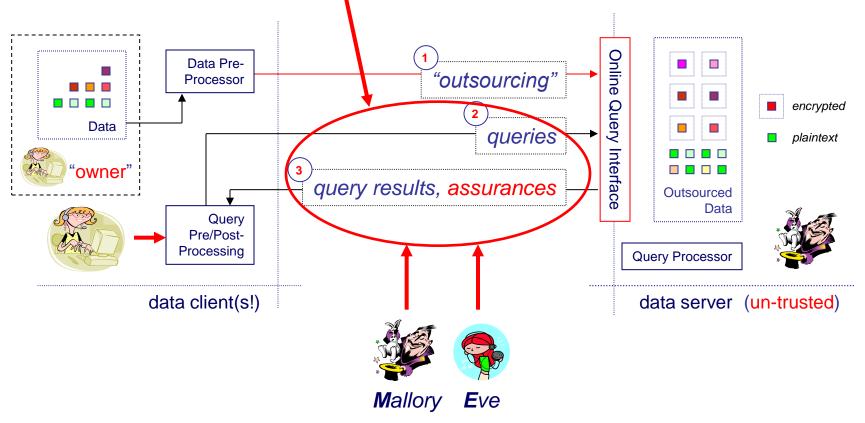




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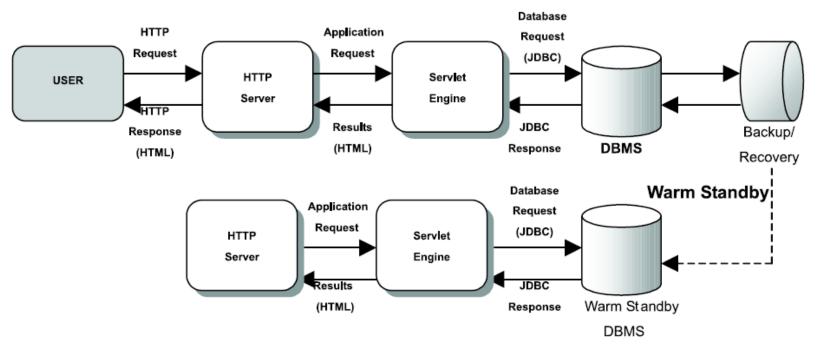


Un-trusted server: • lazy: incentives to perform • curious: incentives to acqui • malicious: • denial of service	nation			
<ul><li>incorrect results</li><li>possibly compromised</li></ul>	Why is this hard • how ?		nard ?	
		<ul><li> arbitrary expressivity</li><li> overheads</li></ul>		
What do we do ? • query assurances		• neti • com	work Iputational costs	
<ul> <li>full privacy</li> <li>of queries (even encli- of access patterns</li> <li>data confidentiality</li> </ul>	rypted)			



# Hacigumus (2002)

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System architecture of NetDB2

#### Stored Data Confidentiality

```
SELECT decrypt(discount,key)
FROM lineitem
WHERE custid = 300
```

H. Hacigumus, B. R. Iyer, and S. Mehrotra. Providing database as a service, ICDE 2002.

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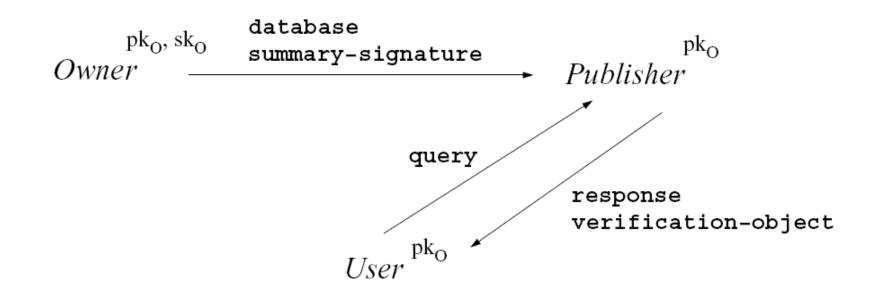


Client requires quantifiable assurances that query results are correct, for <u>arbitrary</u> query types in the presence of a server that could be ...

... lazy

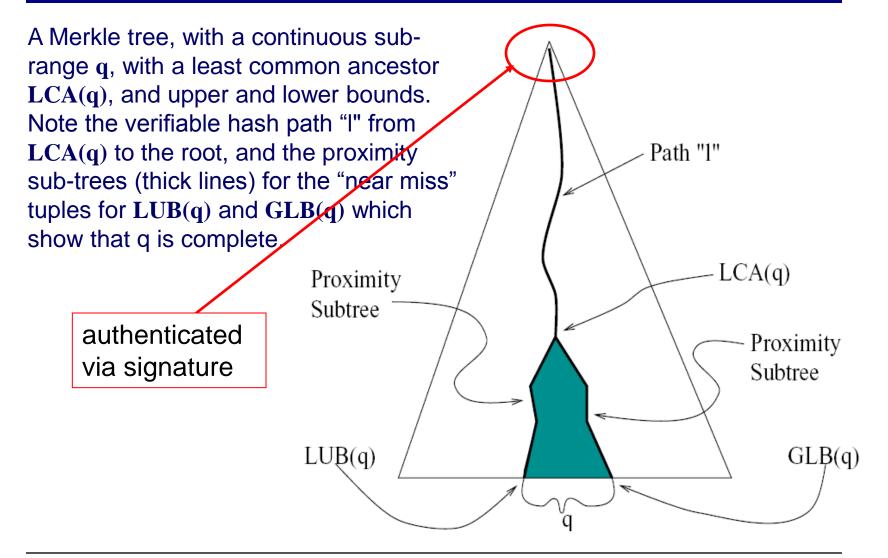
... and/or fully malicious (!)





The owner provides database updates and summary signatures to the un-trusted publisher. When users make inquiries with the publisher, they get responses which can be verified using a returned verification-object. Only  $\mathbf{sk}_{o}$  is secret,  $\mathbf{pk}_{o}$  is authenticated.

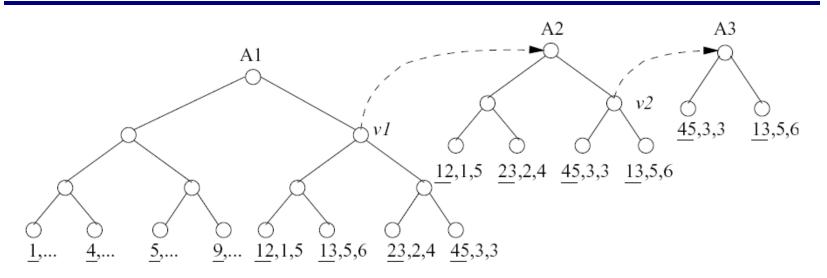
# Devanbu et. al. (2000)



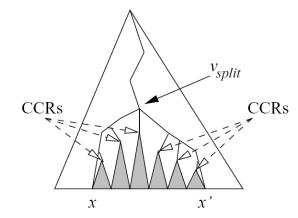
Supported claimed operations:

- selections
- projections
  - (1) maintaining VOs before duplicate elimination
  - (2) pre-computing VOs for common projections
- equiJOIN
  - (1) keep materialized cartesian product S x R
    - construct VO on sorted version of product (according to difference (S.A-R.A)) – this yields 3 types of leaf nodes ("0","<",">") in Merkle tree
  - (2) all kinds of other tricks
- set operations
  - union (client does it and verifies VOs for input sets)
  - intersection (?)
  - multi-dimensional range queries (generalizing hash tree to "multi-dimensional range tree")

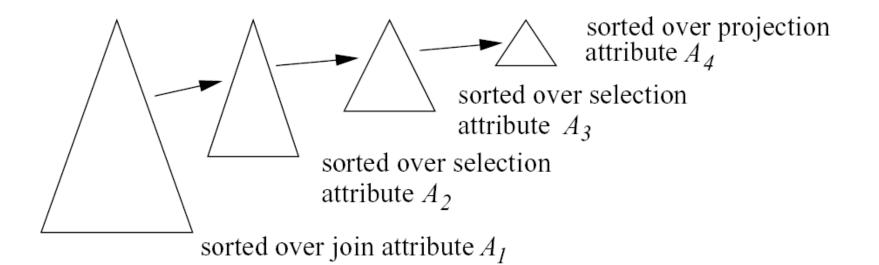
# Devanbu et. al. (2000)



Excerpt of a 3-dimensional range tree, sorted by attributes  $A_1, A_2$  and  $A_3$ 



Covering canonical roots (**CCR**): roots of the canonical sub-trees precisely covering the leaves with values in the interval.







# Issues:

- query expressiveness
- query flexibility
  - works only on data with VOs
- "universe split" phenomenon
  - use timestamps, expiration times
- expensive operations (!)



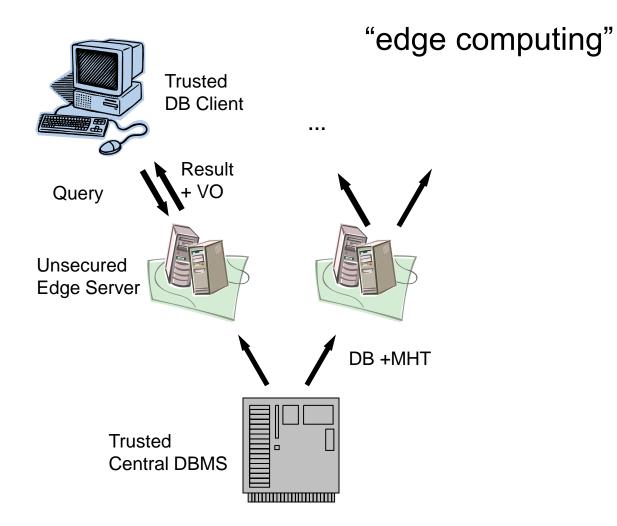
Discusses the use of batch verification of signatures and similar techniques (condensed RSA) to authenticate results.

		Condensed-RSA	Batch-DSA	BGLS
Sign	1 signature	6.82	3.82	3.54
	1 signature	0.16	8.52	62
Verify	t = 1000, k = 1	44.12	1623.59	184.88
	t = 100, k = 10	45.16	1655.86	463.88
	t = 1000, k = 10	441.1	16203.5	1570.8

Cost comparison (in msecs): verification and signing. Notation: t - # signatures, k - # signers

# Pang et. al. (ICDE 2004)

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Claimed problems with [Devanbu 2000]

- A hash tree is needed for every sort-order
- VOs need to contain links all the way to the root,
  - VOs grow linearly to query result and logarithmic to base table size
- Projections may have to be performed by clients
- No provision for dynamic updates on the database

# Aim 1: VO size just linear in query result Aim 2: do not push projections to client

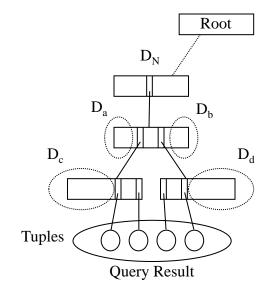
# Idea: use different hash function

- $h(x) = g^x \mod q$
- h is commutative, h(x+y) = h(y+x)
  - Digests can be combined arbitrarily
  - Projection can be performed at the edge servers
  - Facilitates insertion of new tuples with minimal effect on other digests
  - but: significantly (1000-10000 times) slower
  - trade-off: computation vs. communication

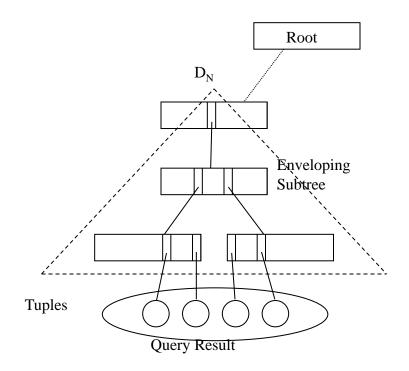


# Pang et. al. (ICDE 2004)

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Verification object =  $D_N + D_S$ where  $D_S = \{D_a, D_b, D_c, D_d\}$ 



# Verifying Selection

(no need to go up to the root

as everything is also signed)



Similar expressiveness. But ...

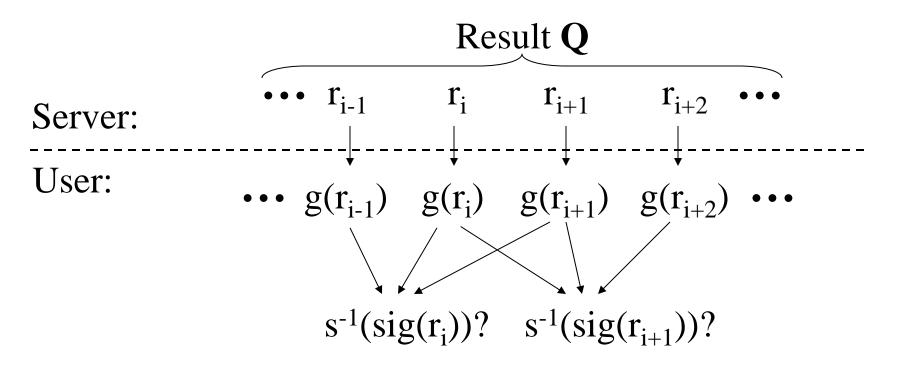
Pang et. al. (SIGMOD 2005)

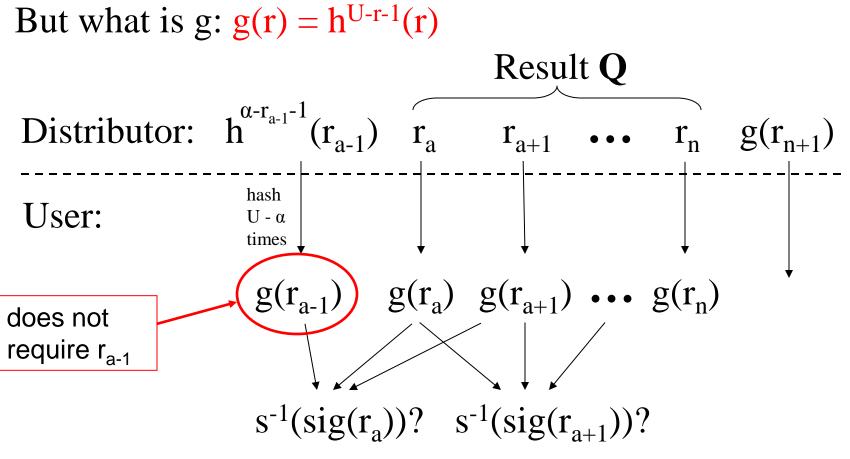
Asks: what about access control rules ? (Devanbu seems to reveal too much: boundary tuples)

Also claims: lower overheads for queries and updates.

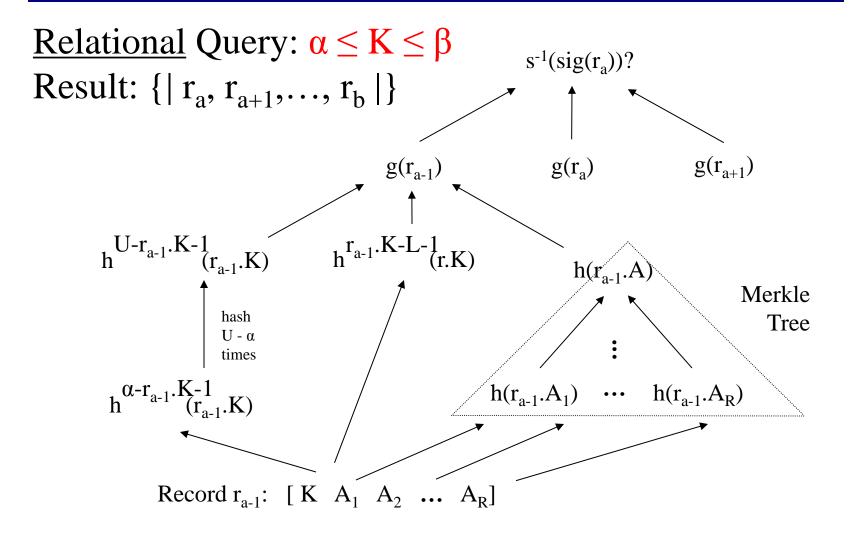
Introduces "precision" (only data matching the query should be returned)

# Idea: use signature chains – thus no need to reveal boundary elements. $sig(r_i) = s(h(g(r_{i-1}) | g(r_i) | g(r_{i+1})))$



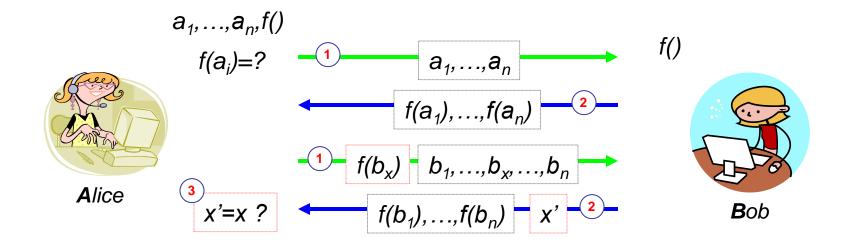


### Query: $\alpha \leq r$



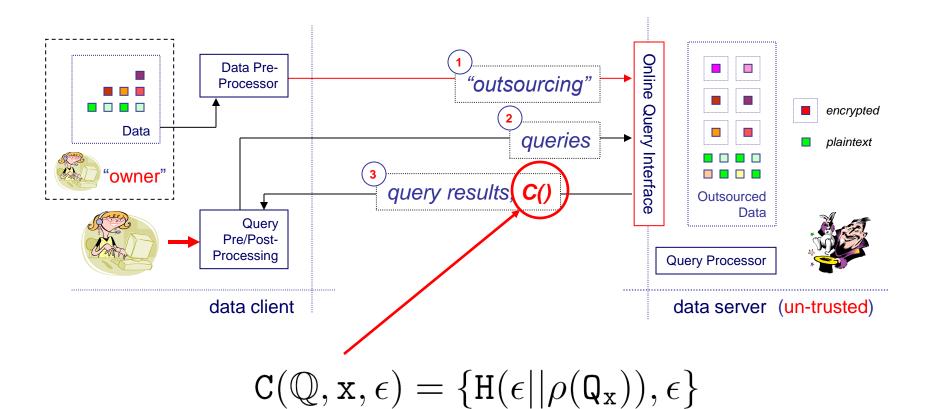
### Sion (VLDB 2005)

### Asks: What about arbitrary queries ?

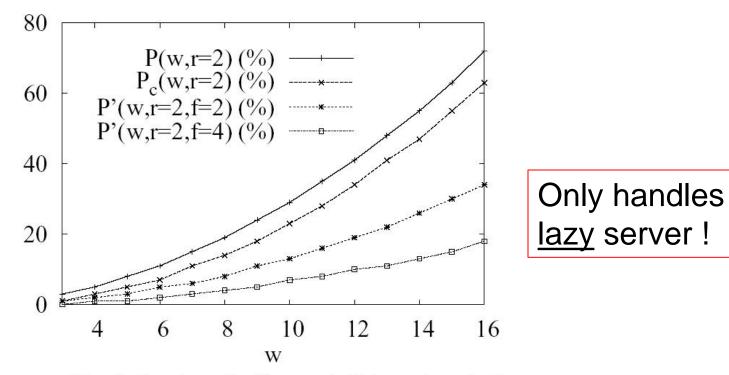


# P. Golle and I. Mironov, "Uncheatable Distributed Computations", RSA 2001 (Cryptographer's track)

### **Sion: Execution Proofs**



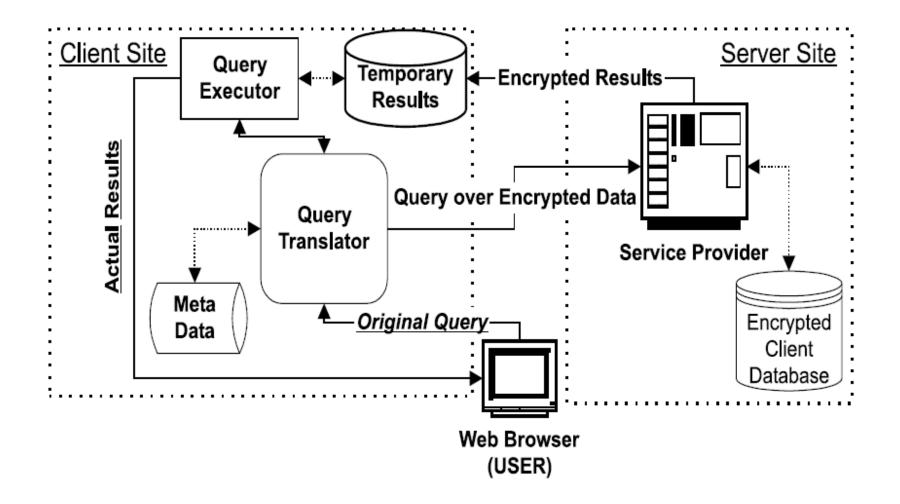
A challenge token (computed by client) is sent together with the batch of queries. Upon return, batch execution is proved if x=x'.



The behavior of P'(w, r, f) (fake tokens) plotted against  $P_c(w, r)$  (client-side result checking mechanism) showing that the query execution proof mechanism (with fake tokens) significantly decreases the ability to "get away" with less work.

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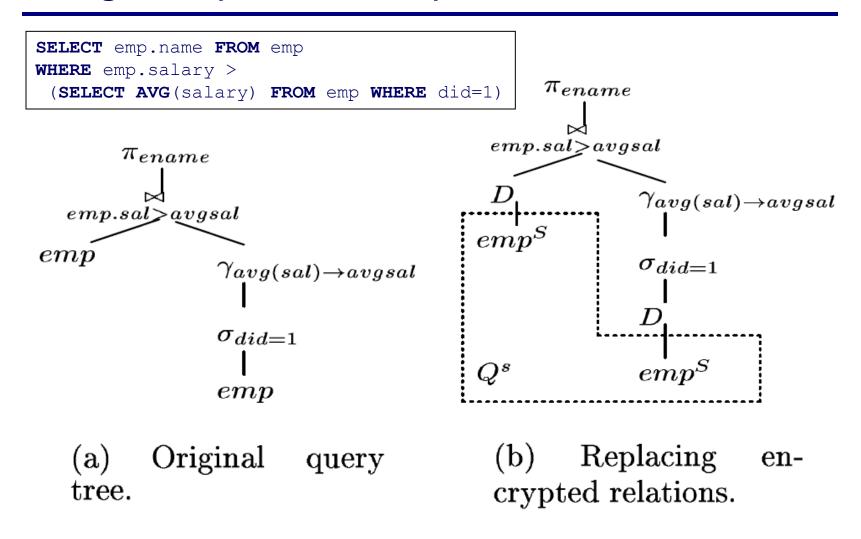


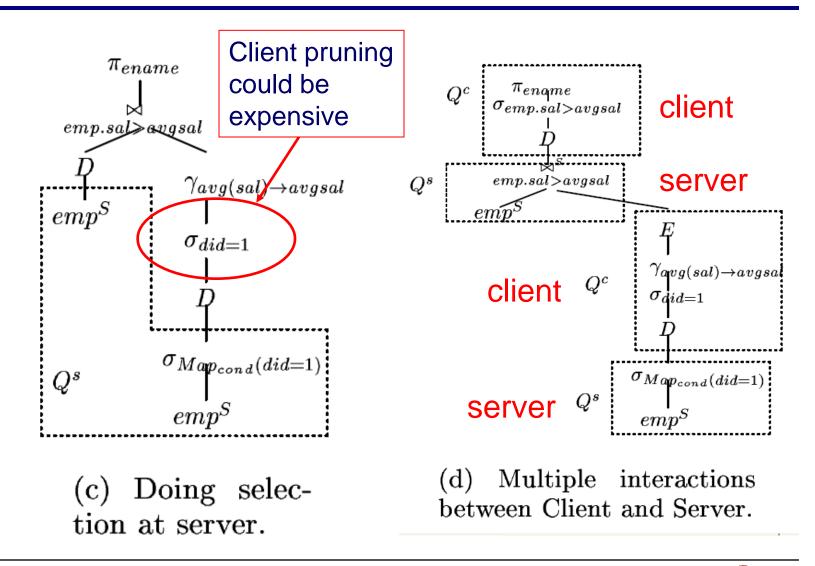
# Main Steps:

- 1. Partition sensitive domains
  - Order preserving: supports comparison
  - Random: query rewriting becomes hard
- 2. Rewrite queries to target partitions
- 3. Execute queries and return results
- 4. Prune/post-process results on client



Hacigumus (SIGMOD 2002)





# Confidentiality-Overhead Trade-off

# Larger segments == increased privacy == increased overheads

Goal: For a <u>uniform</u> distribution of queries - minimize any leaks to any adversaries (even) knowing segmentation parameters.

Idea 1: Maximize variance of distribution of values in segment Idea 2: Increase segment entropy

## Issue: What about performance ?



# Solution: "Controlled Diffusion"

# Idea: 1. design for efficiency, then ... 2. ... diffuse (re-distribute) elements inside the segments to increase per-segment entropy and variance

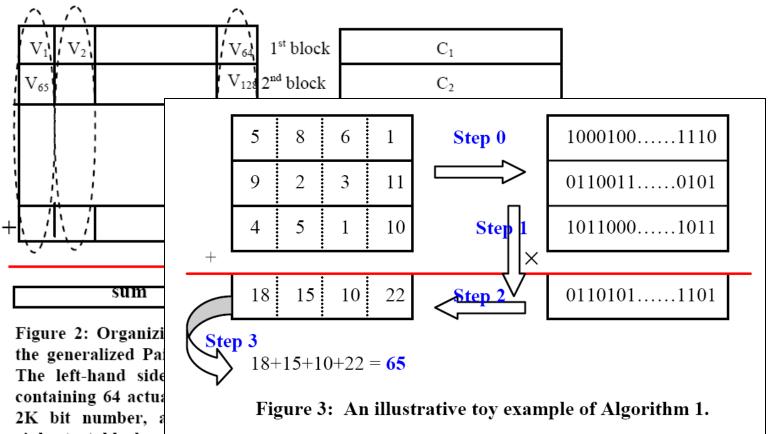


Asks: Similarly, how to structure <u>query</u> <u>trees</u> to optimally balance the securityefficiency trade-off in [Hacigumus 2002].

Idea: client generates optimal partitioned query execution plans given statistics and metadata input from the server.



### **Tingjian and Zdonik (2007)**

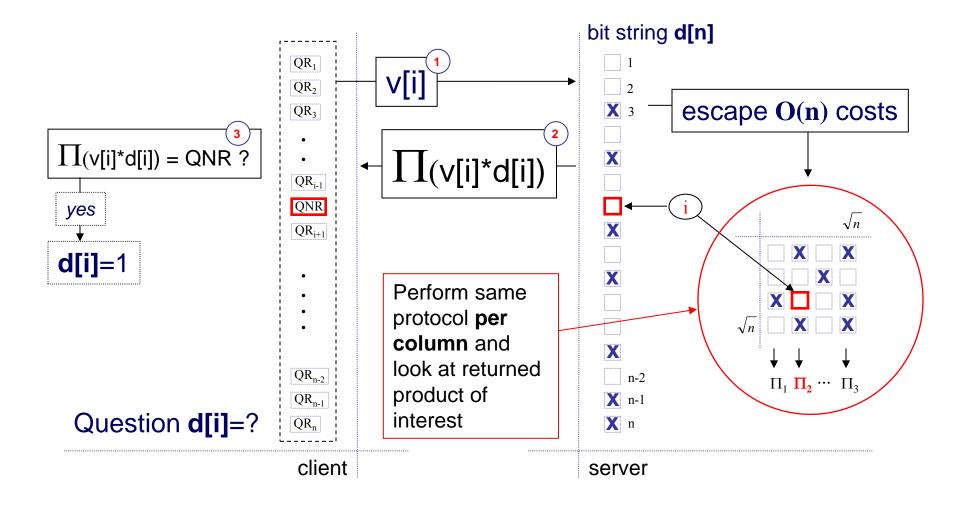


ciphertext blocks on the right-hand side. The product of the 32K ciphertext large numbers, when decrypted back, corresponds to the sum of the 32K plaintext large (2K-bit) numbers.

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### **QR PIR**



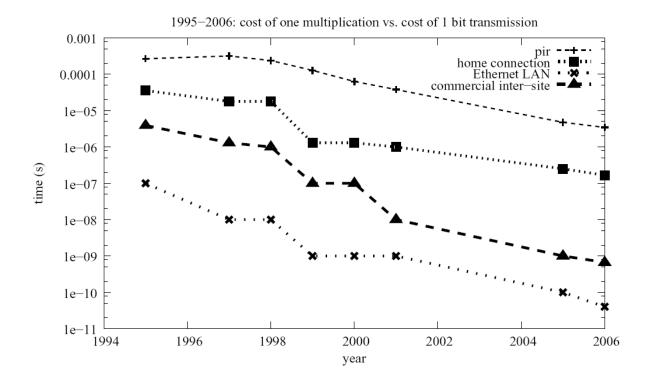
The *n* bits of the database are organized logically at the server as a bi-dimensional matrix M of size  $\sqrt{n} \times \sqrt{n}$ . To retrieve bit M(x, y) with computational privacy, the client:

- randomly chooses two prime numbers p and q of similar bit length, computes their product, N = pq and sends it to the server.
- generates  $\sqrt{n}$  numbers  $s_1, s_2, \ldots, s_{\sqrt{n}}$ , such that  $s_x$  is a quadratic non-residue (QNR) and the rest are quadratic residues (QR) in  $\mathbb{Z}_N^*$ .
- sends  $s_1, s_2, \ldots, s_{\sqrt{n}}$  to the server.

For each "column"  $j \in (1,\sqrt{n})$  in the  $\sqrt{n} \times \sqrt{n}$  matrix, the server:

- computes the product  $r_j = \prod_{0 < i < \sqrt{n}} q_{ij}$  where  $q_{ij} = s_i^2$  if M(i,j) = 1 and  $q_{ij} = s_i$  otherwise <sup>2</sup>.
- sends  $r_1, \ldots, r_{\sqrt{n}}$  to the client

The client then simply checks if  $r_y$  is a QR in  $\mathbb{Z}_N^*$  which implies M(x, y) = 1, else M(x, y) = 0.



Comparison between the time required to perform PIR and the time taken to transfer the database, between 1995 and 2005. (logarithmic)

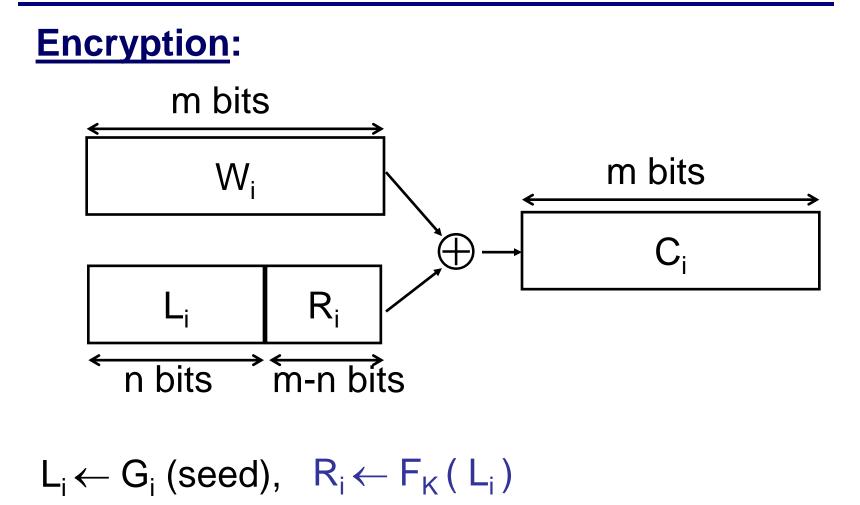
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- Sequential Scan
- Index-based

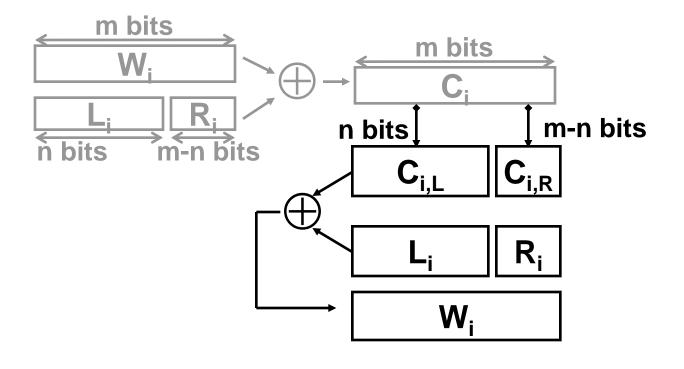


Song (2000)

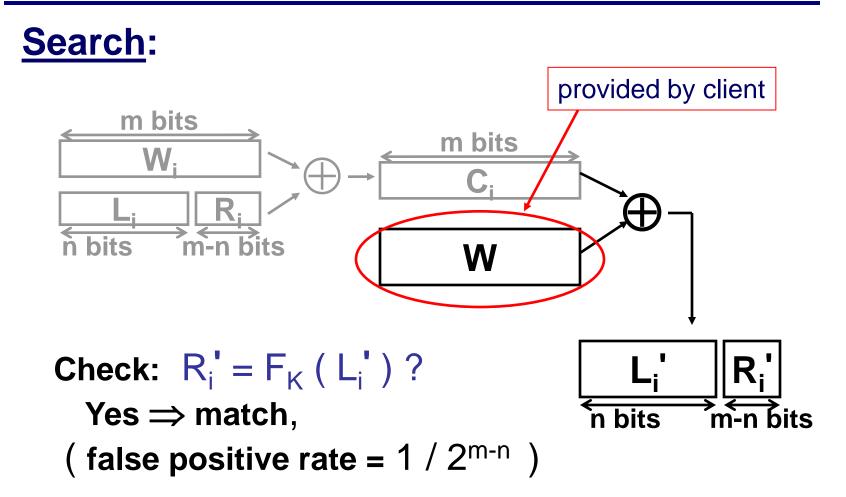


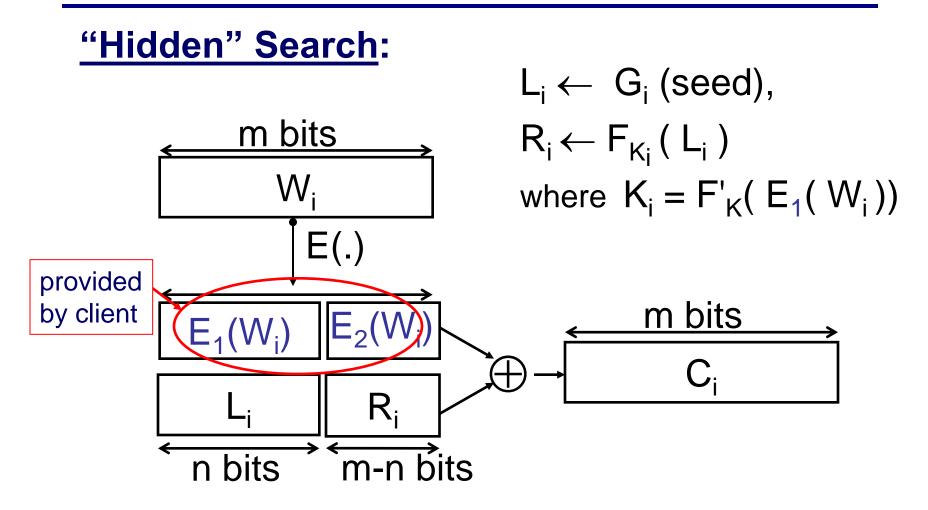


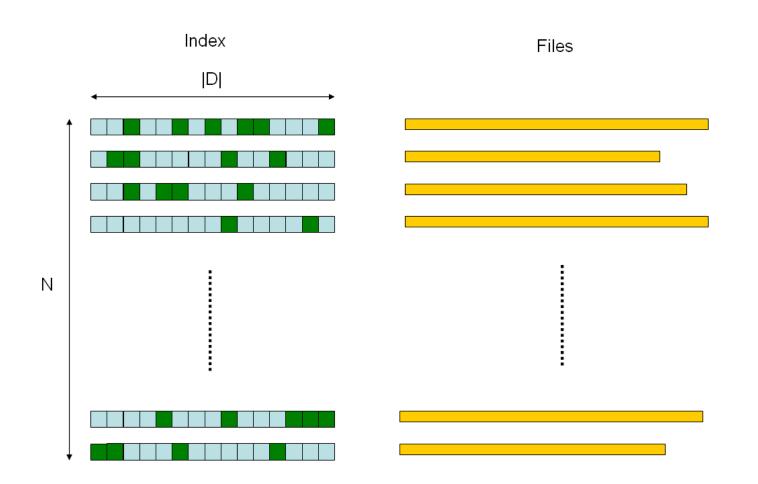
### **Decryption**:



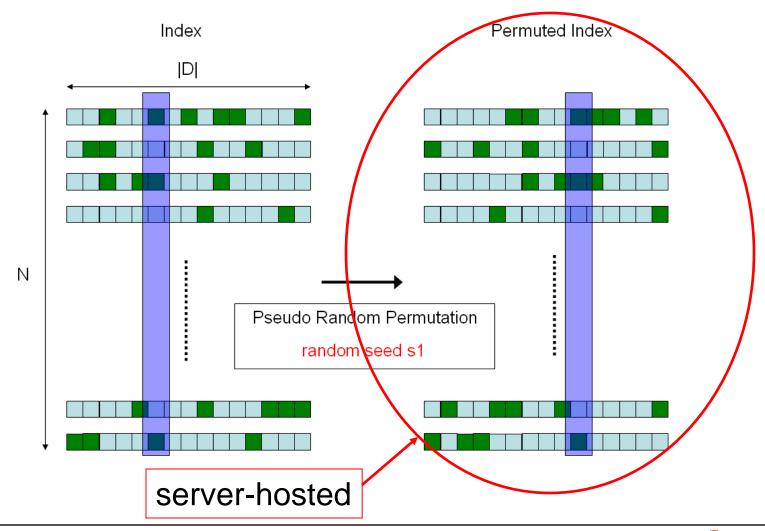
 $L_i \leftarrow G_i \text{ (seed)}, R_i \leftarrow F_K (L_i)$ 

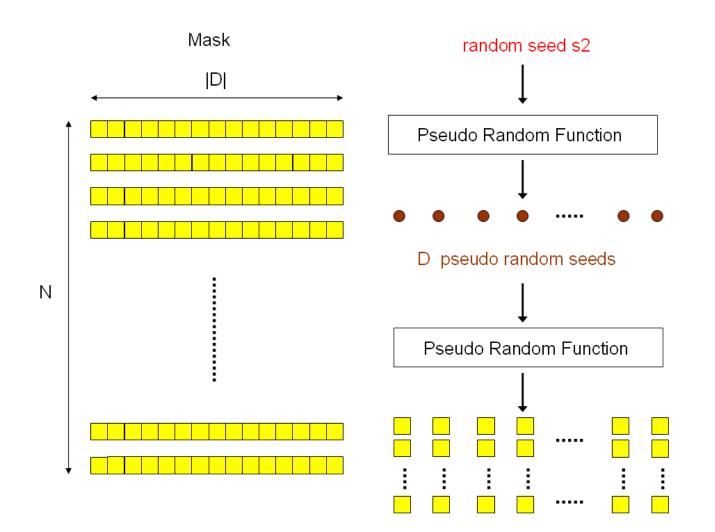


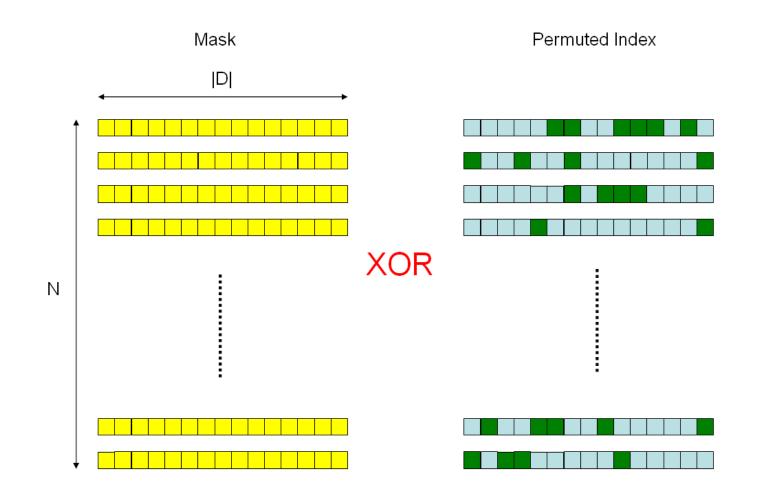




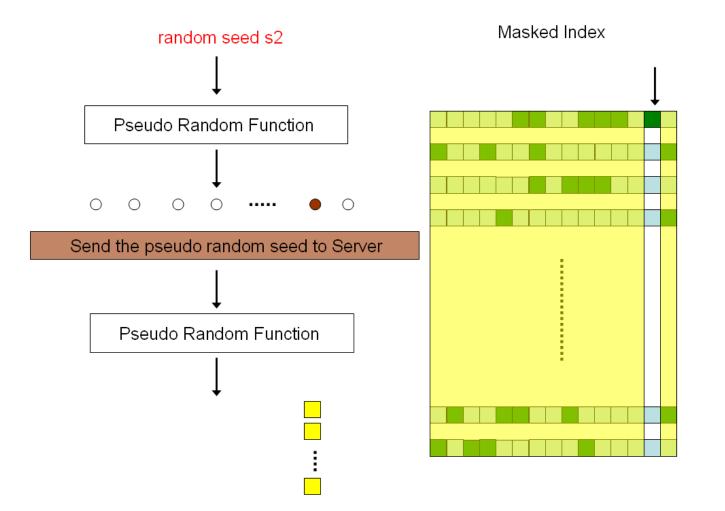












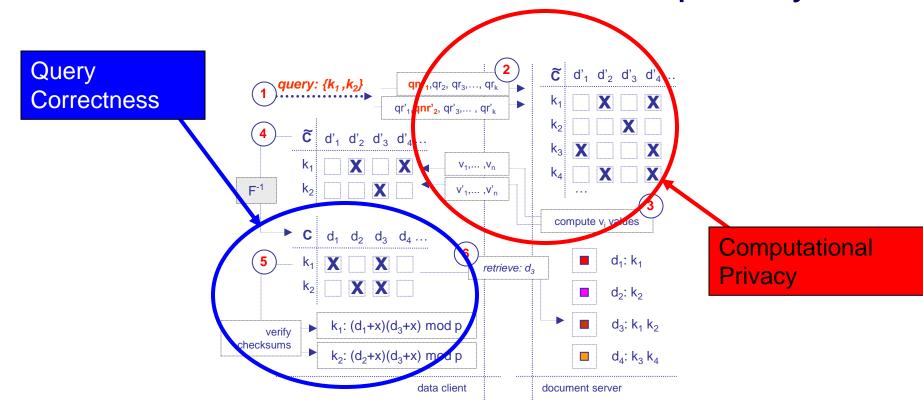
Server stores **capabilities** for conjunctive queries (linear in the total number of documents). These can be transferred offline.

The client is required to know before-hand future conjunctive queries.

**Query** part is sent online at the time of search. It is of constant size (number of keyword fields per documents).

### Sion (2005)

Asks: What about correctness + privacy ?



Idea: Deploy modified version of computational PIR targeted at a server-side index. Augment with "multiplicative checksums".

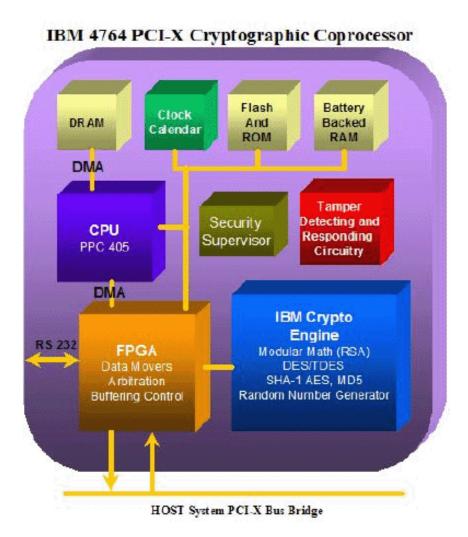
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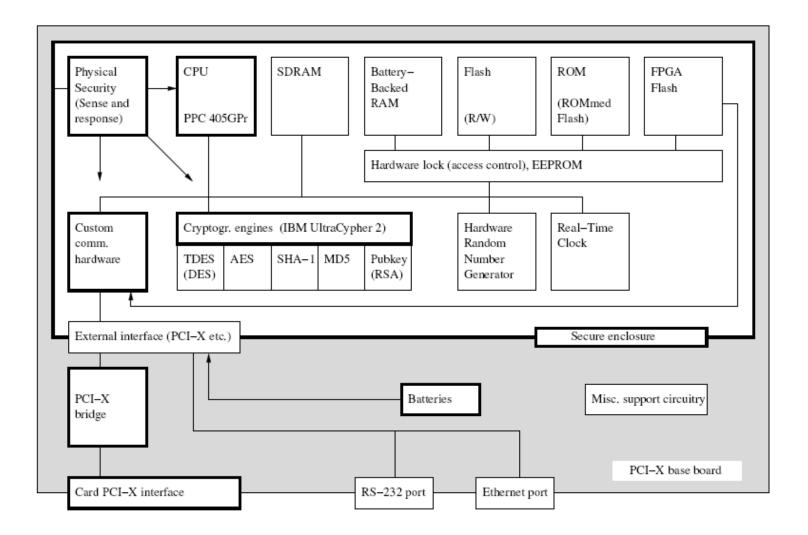


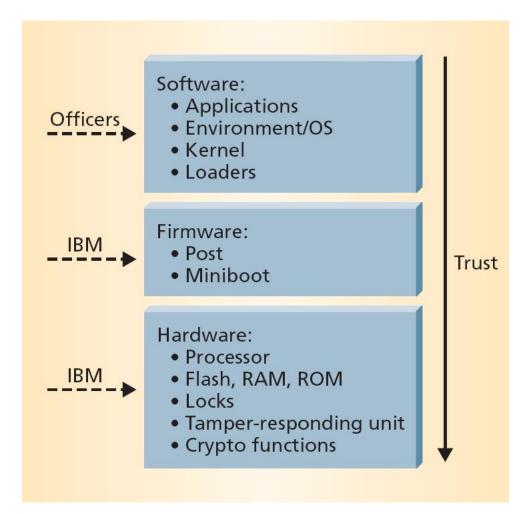


### **IBM 4764 Architecture**













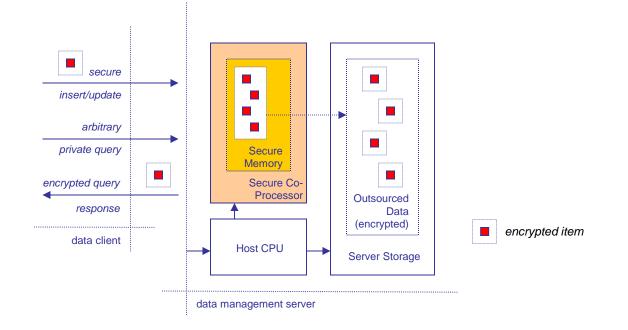
RSA1024 Sign: **848/sec** RSA1024 Verify: **1157/sec** 3DES: **1-8MB/sec** DES: **1-8MB/sec** SHA1: **1-21MB/sec** 

IBM 4764-001: 266MHz PowerPC. 64KB battery-backed SRAM storage. Crypto hardware engines: AES256, DES, TDES, DSS, SHA-1, MD5, RSA. FIPS 140-2 Level 4 certified.



### **Possible Benefits**

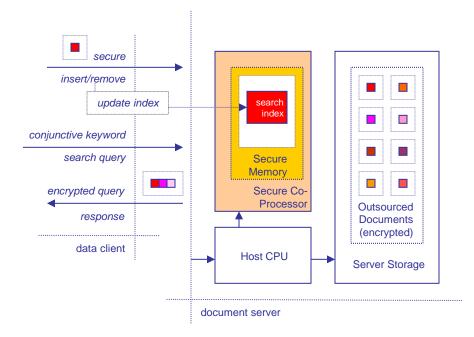
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A secure co-processor on the data management side may allow for significant leaps in expressivity for queries where privacy and completeness assurance are important.

## Searching

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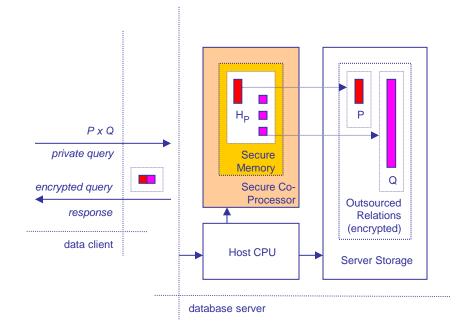


For conjunctive keyword searches on document (email, files) servers, oblivious search index structures could be queried in secure memory achieving a novel zero-leak query model.



## Hash-JOIN

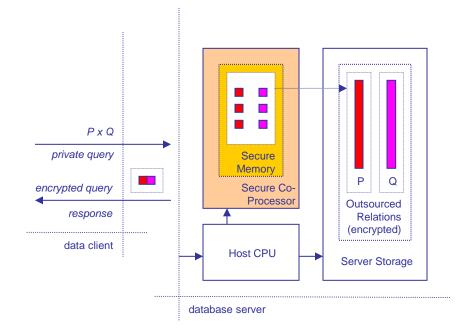
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#### Hash-JOIN could be naturally accommodated.



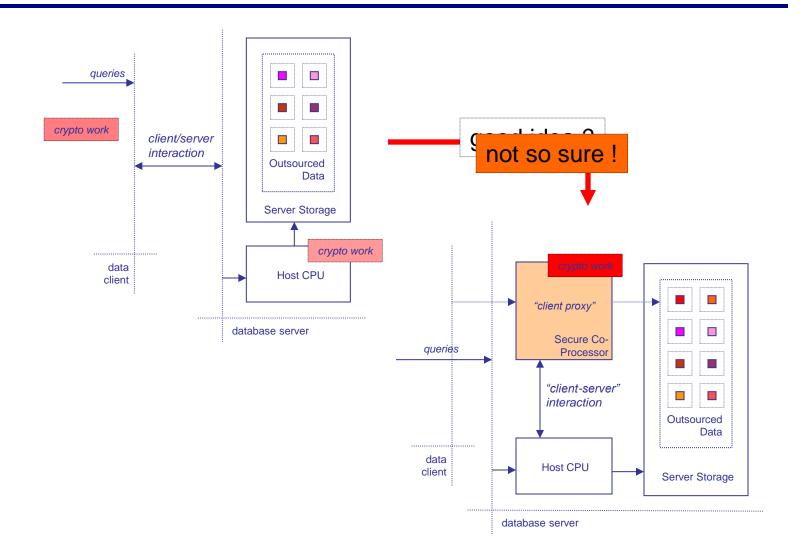
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#### For Merge-JOIN, order-preserving encryption primitives could be deployed to minimize the amount of data parsing required in the sorting phase.

## Sample DON'T

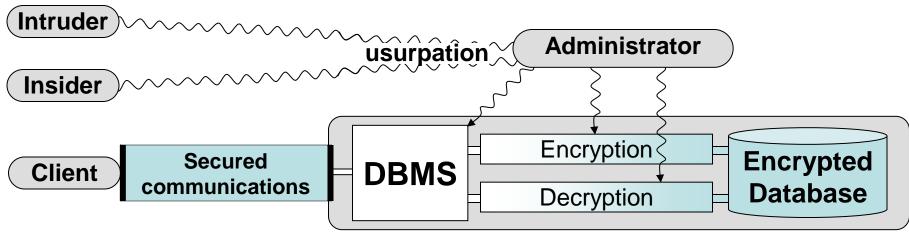
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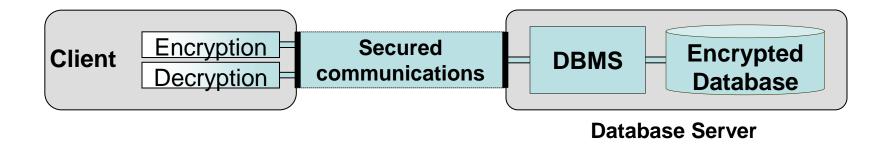
- Process entire queries on SCPU (!)
- Dedicate (one) SCPU per query or equivalent
  e.g., limit TPS by SCPU TPS
- Synchronize CPU with SCPU
  e.g., block main CPU until SCPU completes
- Transfer >= O(n) on SCPU-CPU bus (!)
- Anything else un-smart ©



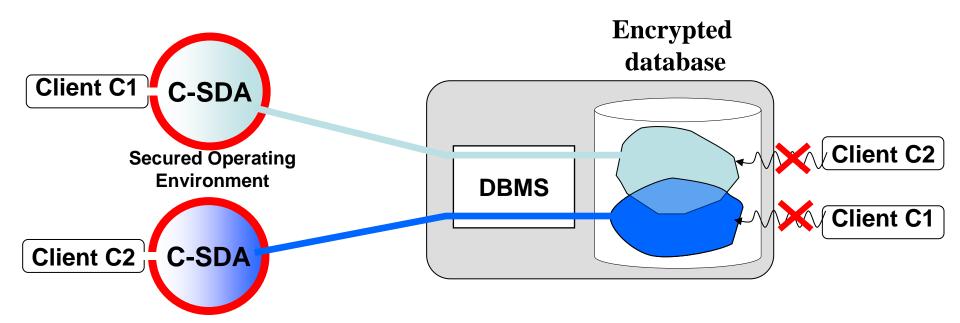
### Bouganim (VLDB 2002)



**Database Server** 

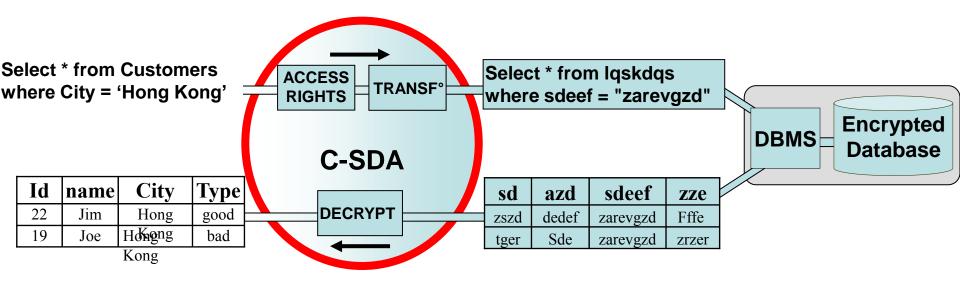


# **Chip-Secured Data Access:**



Smartcard: 32 bit RISC processor ( $\approx$  40Mips), limited communication bandwidth (10 to100 Kbps), tiny RAM, writes in EEPROM very costly.

# **Equi-predicate-only Queries:**

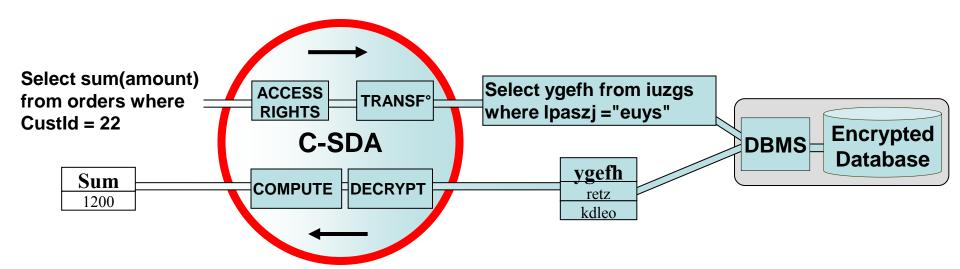


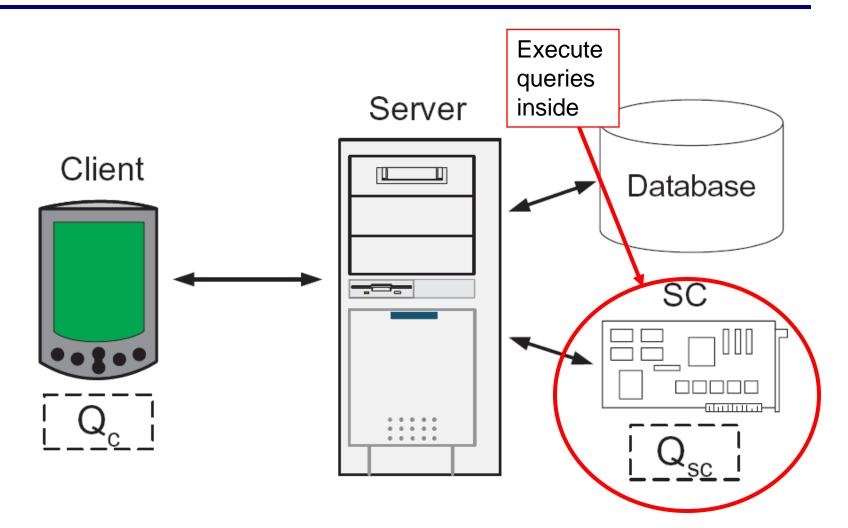




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# **General queries**:





Practical maturity: in infancy, barely crawling. <u>Very</u> hard problems remain to be tackled:

- operators with integrated assurances
  - confidentiality
  - privacy of access
  - correctness
- scalable protocols for secure hardware
  - massive data
  - good utilization of host CPUs
- areas
  - relational data
  - file systems
  - streaming data



### /bin/yes > /dev/lunchtime

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