# **Query-private DB Query Processing Technique**

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1차워크샵@암호연구회, May 20, 2016

- System model
- 2 Private query
- Problem statement
- Idea sketch
- On-going works

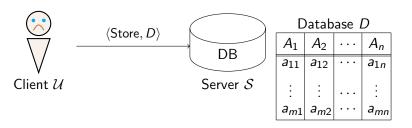
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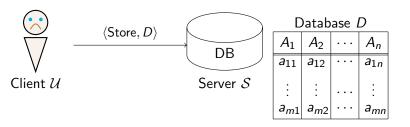
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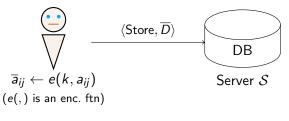
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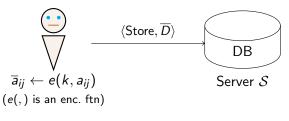


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  - \* Client  $\mathcal{U}$ : 암호화한 DB  $\overline{D}$ 를 Server  $\mathcal{S}$ 에 저장
  - \* Technical issue: How to get  $\alpha = \sum_{i=1}^{m} a_{ij}$ ?



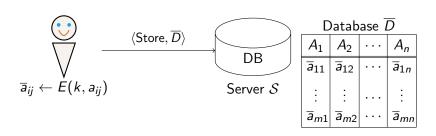
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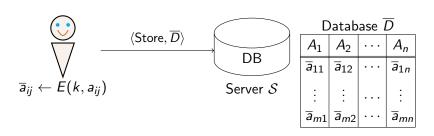


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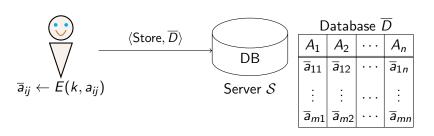
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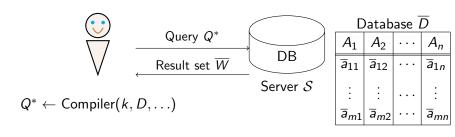


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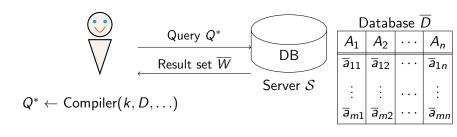


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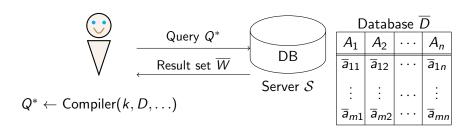




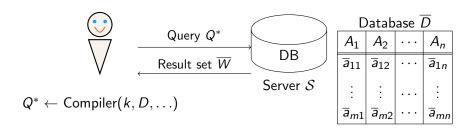
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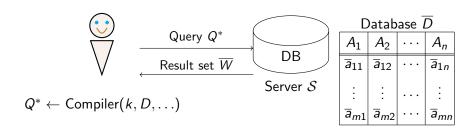
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  - \* An example
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    - $-\overline{a}_1 \leftarrow E(k, 'A')$  and  $\overline{a}_2 \leftarrow E(k, 'M')$
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  - \* Construct a circuit  $C_{Q^*}$ :  $\forall i$ , Name $[i] \cdot (EQ(Grd[i], \overline{a}_1) \cdot EQ(Sex[i], \overline{a}_2))$
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## **Problem statement**

### Why "No"?

- ullet S can learn the logical operators (e.g., and/or) from  $Q^*$
- Our problem

How to hide the operators from the suspicious server?

## An Example

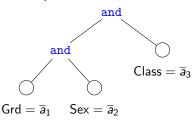


Figure 1: A Query Tree

```
SELECT Name, Depart, Address FROM STUDENT WHERE Grd = \overline{a}_1
AND Sex = \overline{a}_2
AND Class = \overline{a}_3;
```

Figure 2: An SQL Statement

## Our goals

- Hide the select condition clause
  - ⇒ Protect private constants & logical operators
- 2 Harmonize security and performance
  - ← Reveal the select-statement & the from-statement
  - SIMD, Automorphism, Dynamic programming, Heuristics

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- ① Underlying encryption: (leveled) Fully homomorphic encryption
- Primitive: EQ circuit
  - \*  $\operatorname{depth}(EQ) = \lceil \log n \rceil$  for two *n*-bit inputs
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#### Main observations

- Using EQ, target queries can be expressed into the same circuit
  - \*  $\mathbb{F}_{2^{\ell}}$ : the plaintext domain
  - \*  $a_i, b, c, d \in \mathbb{F}_{2^\ell}$  and  $A_i \in \mathbb{F}_{2^\ell}$
  - \* Circuit C\* defined by

$$C^{\star} = \overline{d} + \prod_{i=1}^{n} \left( \overline{b} + \operatorname{EQ} \left( \overline{A}_{i}, \overline{a}_{i} \right) \cdot \overline{c} \right)$$

2 Evaluation table

Query type		С	d	Result of C*
Conjunction	0	1	0	0/1
Disjunction		1	1	0/1
Threshold Conjunction		1+t	0	$t^{\kappa}$

 $t \in \mathbb{F}_{2^{\ell}}^*$  and  $\kappa$ : # of threshold conditions

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- Our technique
  - \*  ${\mathcal S}$  is required to evaluate an encrypted polynomial  $\overline{g}(X)$  regardless of query types

$$g(X) = \begin{cases} h(X) & \text{if threshold queries} \\ X & \text{otherwise} \end{cases}$$

where  $h(t^{\kappa})=1$  if  $\kappa>T$  for a threshold  $T\in\mathbb{N};\ h(t^{\kappa})=0$  otherwise

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- Security modeling
  - \* Security definition
  - \* Security proof
- Proof-of-concept implementation
  - \* HElib [HElib] library for the BGV encryption scheme [BGV12], NTL library [NTL]
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- [BGV12] Zvika Brakerski, Craig Gentry, and Vinod Vaikuntanathan: (Leveled) fully homomorphic encryption without bootstrapping. ITCS2012:309-325.
- [HElib] Shai Halevi and Victor Shoup: *Algorithms in HElib*, Eurocrypt 2014.
- [NTL] NTL: A Library for doing Number Theory, http://http://www.shoup.net/ntl/.