

# Supporting Joins and Numerical Computations over Encrypted Databases

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# Background

- The system considers :
  - A cloud Server (SQL database)
  - Many Clients (users)
  - Key Management Authority

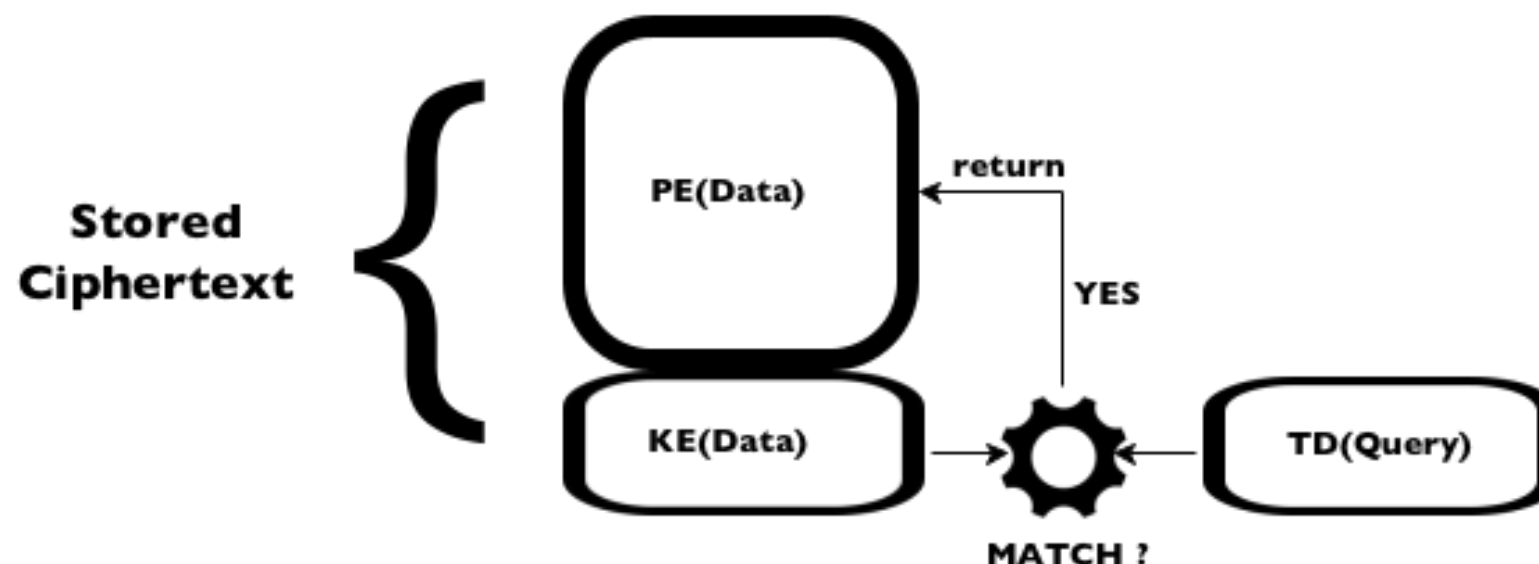
# Encryption Schemes

- Discrete Logarithm Problem
- Data Retrieval
  - Proxy Encryption (PE)
- Data Search
  - Keyword Encryption (KE) :: Data searchable
  - Trapdoor Encryption (TD) :: Query (read) Encryption

# Encrypted Match

```
function PE[] SEARCH( $TD(Q)$ ,  $Data$ )  
   $PE[]$   $matching \leftarrow new PE[Data.size]$ ;  
  for all  $D$  in  $Data$  do:  
    if MATCH(  $TD(Q)$ ,  $KE(D)$ ):  
       $matching.append(PE(D))$ ;  
    end if  
  end for  
  return  $matching$ ;  
end function
```

$Match(KE(D), TD(Q)) \rightarrow \{0, 1\}$



# Goals

- Support computations between numerical ciphertexts
- Evaluate range SQL encrypted queries on encrypted databases
- Combine encrypted records to join tables

# Numerical Data

- Introduction of Integer(s) data type.
- Probabilistic Homomorphic Encryption (HE)
  - Adapted Paillier Cryptosystem
- PE is replaced with HE for numerical data

# HE : Encryption

- $x$  : secret key from  $Z_q^*$   
 $n$  : product of two large primes  
 $g$  : an  $n$ th-residue of  $Z_{n^2}^*$   
 $D$  : numerical value  
 $r_D$  : random number
- Compute :  
$$C_{D_i} = \{ c'_i = g^{r_{D_i}}, c''_i = g^{xr_{D_i}}(1 + D_i n) \}$$

# HE : Sum

- $C_{D_2} = \{ c'_2 = g^{r_{D_2}}, c''_2 = g^{x r_{D_2}}(I + D_2 n) \}$
- Sum (element-wise product):  

$$C_D = C_{D_1} C_{D_2} = \{ c' = c'_1 c'_2, c'' = c''_1 c''_2 \} =$$

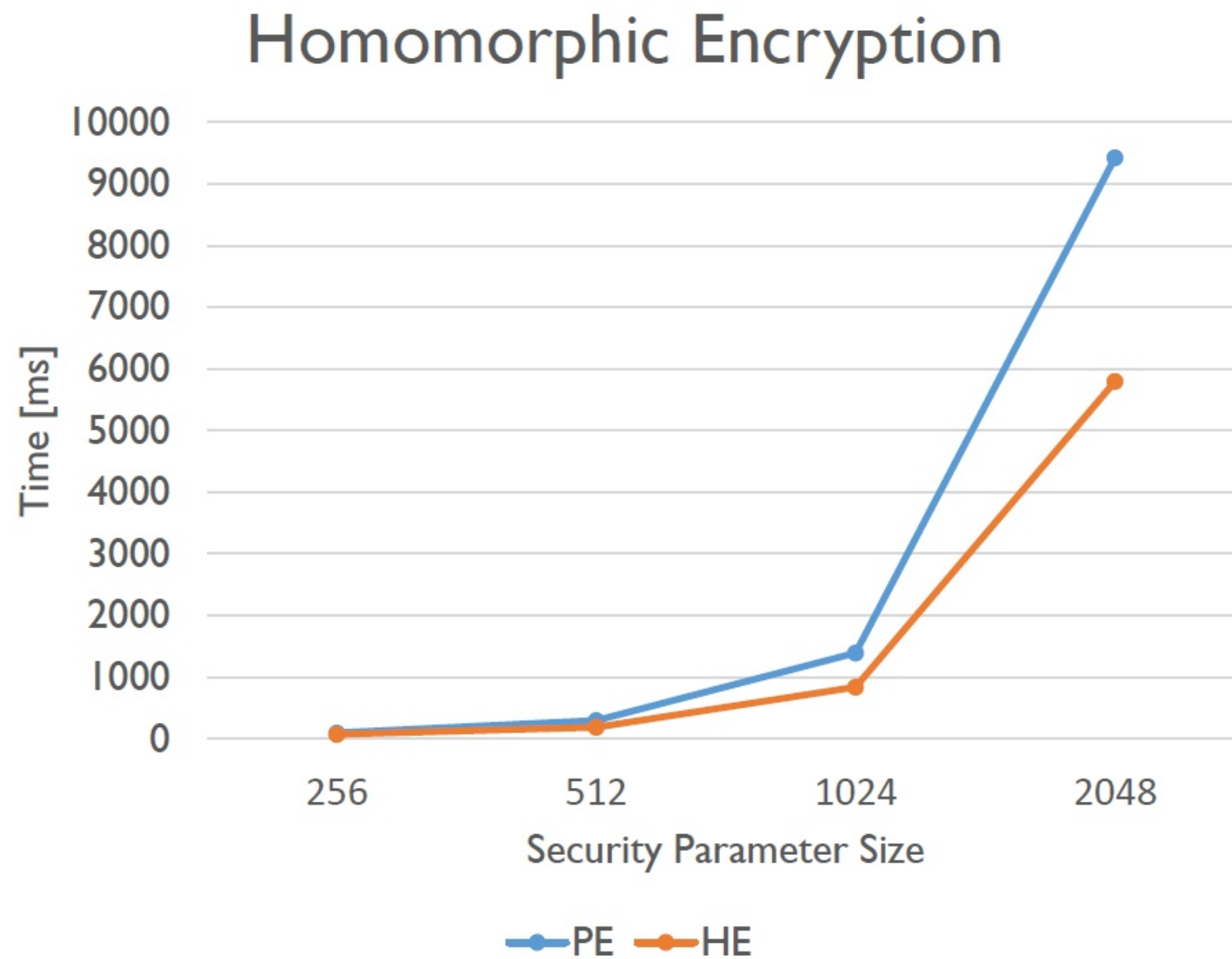
$$\left\{ \begin{array}{l} c' = g^{r_{D_1} + r_{D_2}}, \\ c'' = g^{x(r_{D_1} + r_{D_2})}(I + D_1 n + D_2 n + D_1 D_2 n^2) \end{array} \right\}$$



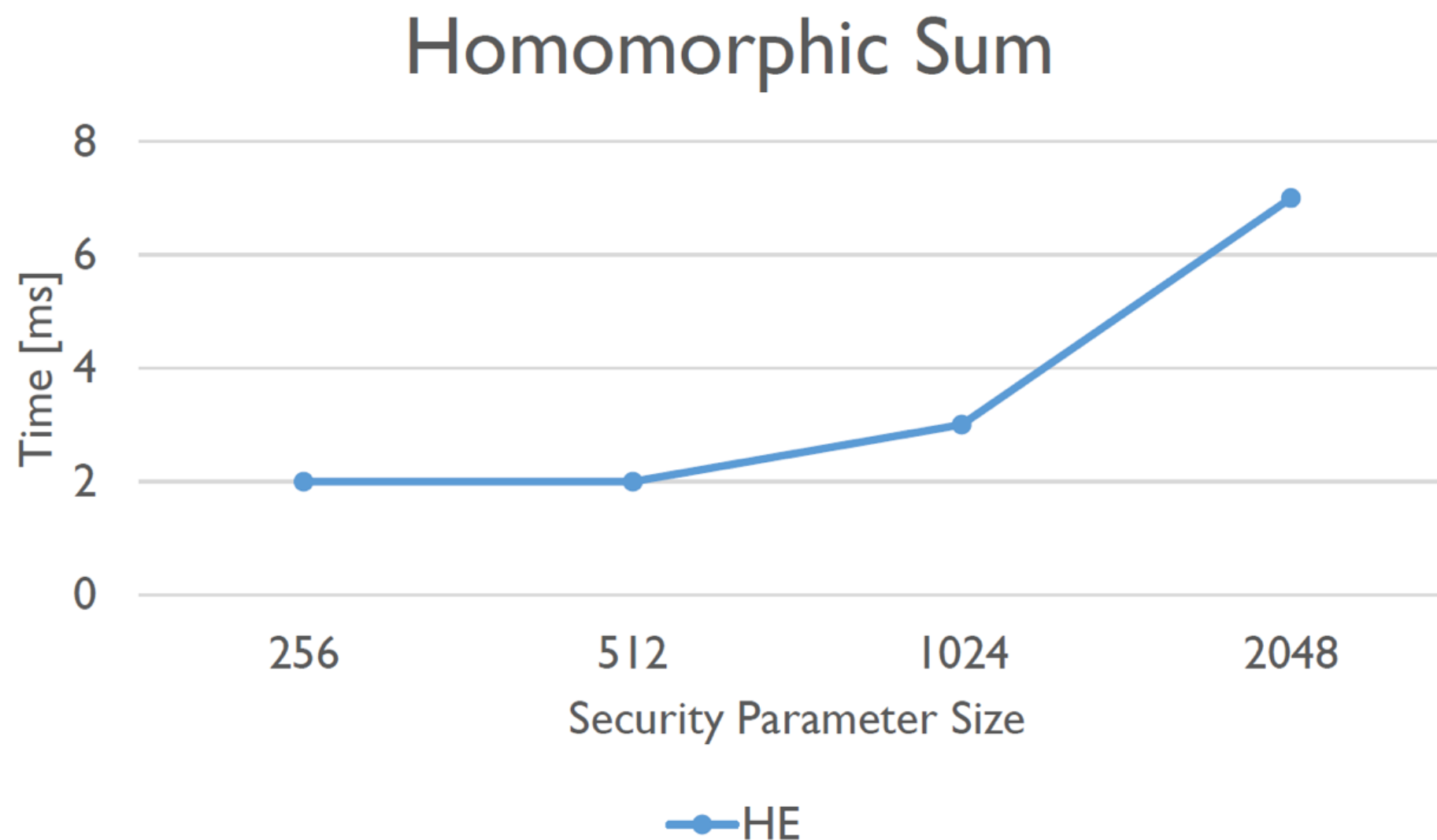
# HE : Decryption

- Decrypt  $C_D = \{ c', c'' \}$ :  
$$\lambda = c''(c')^{-x} = (1 + D_1n + D_2n + D_1D_2n^2)$$
- Compute  $D$  :  
$$(\lambda - 1) / n \bmod n = D_1 + D_2 = D$$

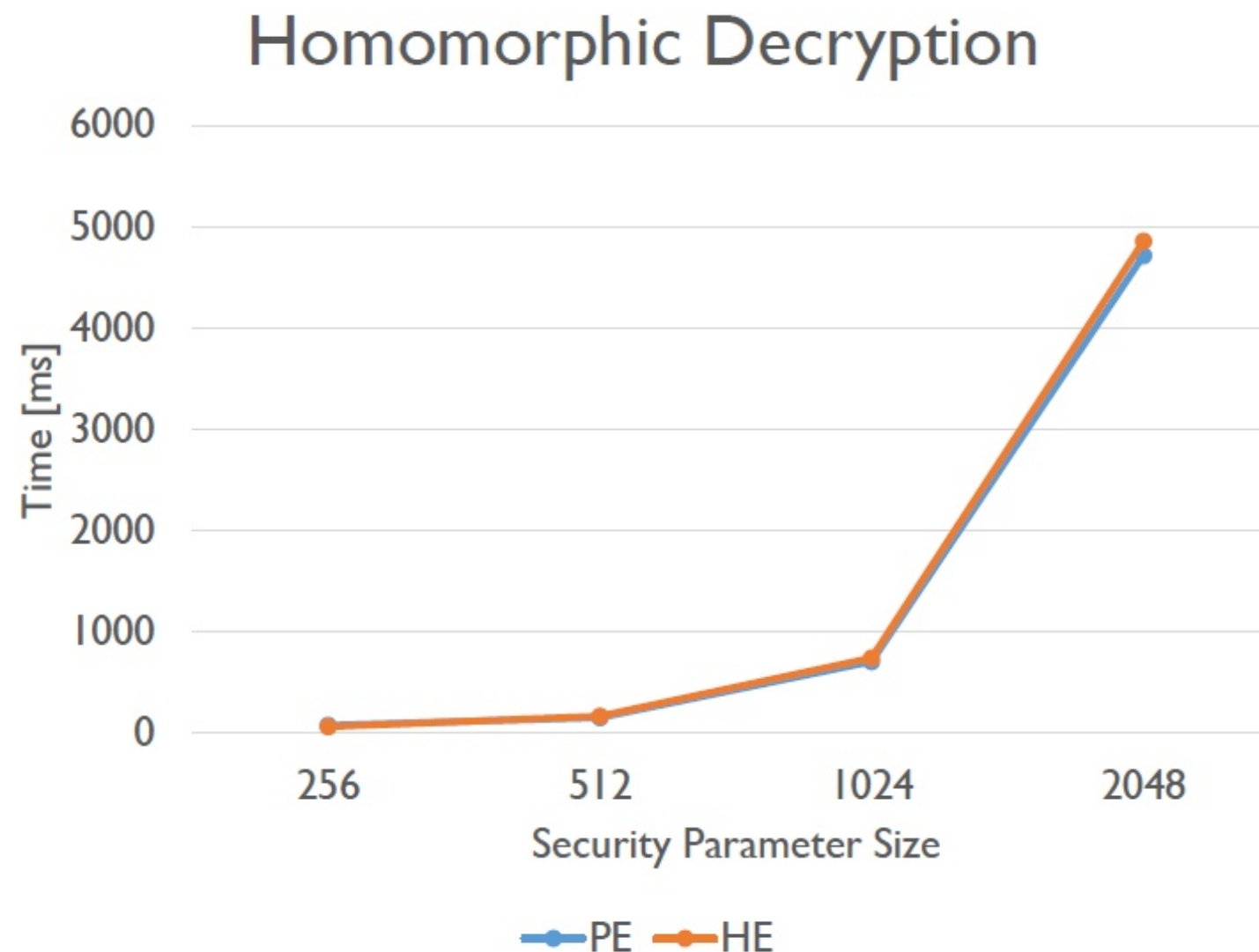
# HE : Encryption Performances



# HE Sum Performances



# HE : Decryption Performances



# Range Queries Evaluation

- Requirements :
  - Numerical columns' bit length known a priori
  - A supplementary table related to numerical columns
  - The Bag of Bits approach

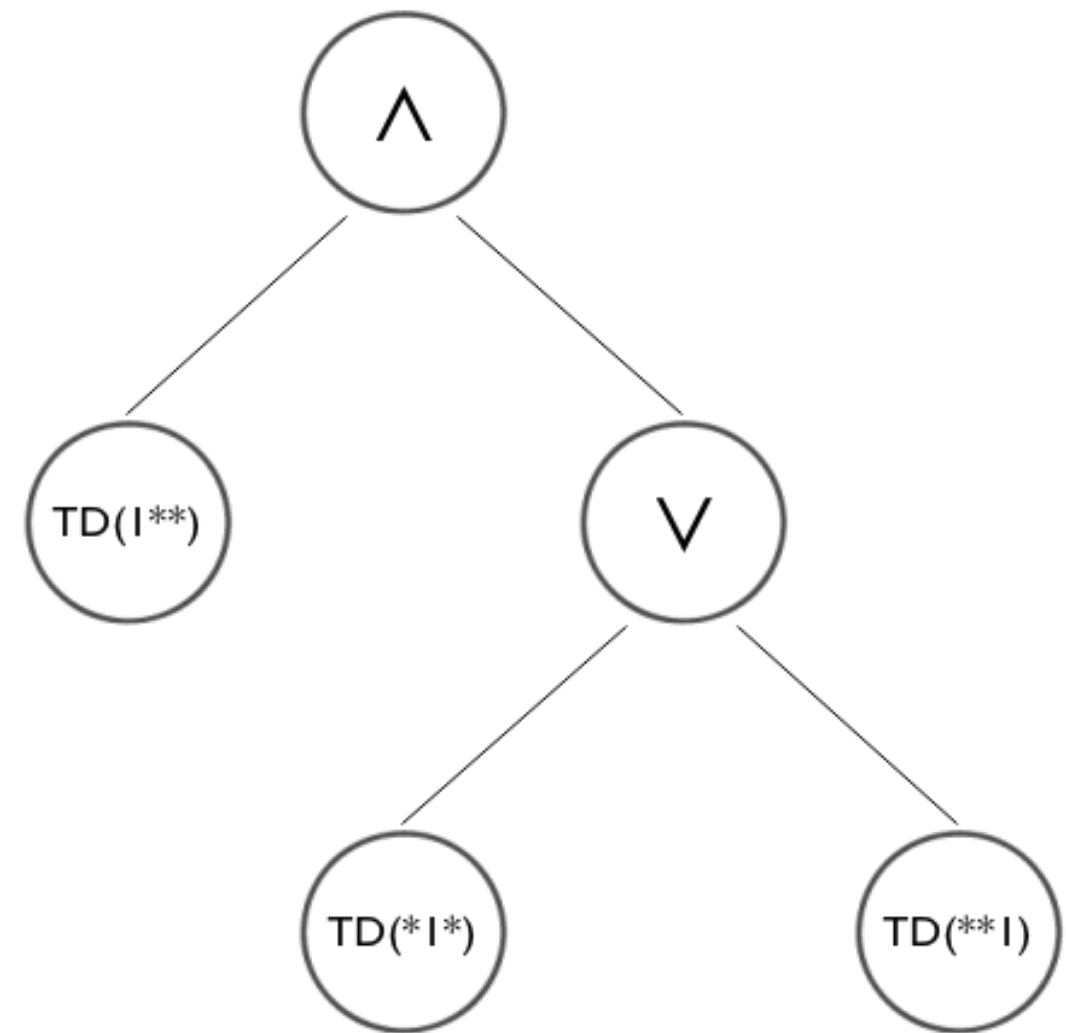
# Bag of Bits

- A set (for each value) made up by strings composed by every bit of the value and filled up with \*
- $n = 5, n_2 = 101$   
 $k = 3$
- Bag of Bits for  $n$  is then made up by :  
 $\{ KE(1**), KE(*0*), KE(**1) \}$

# Policy Tree

- $n > 4;$
- $5 = 101,$   
 $6 = 110,$   
 $7 = 111$

$1** \text{ AND } (*1* \text{ OR } **1)$



# Join

- Data Stored as PE/HE and KE (probabilistic)
- No way to compare stored data.



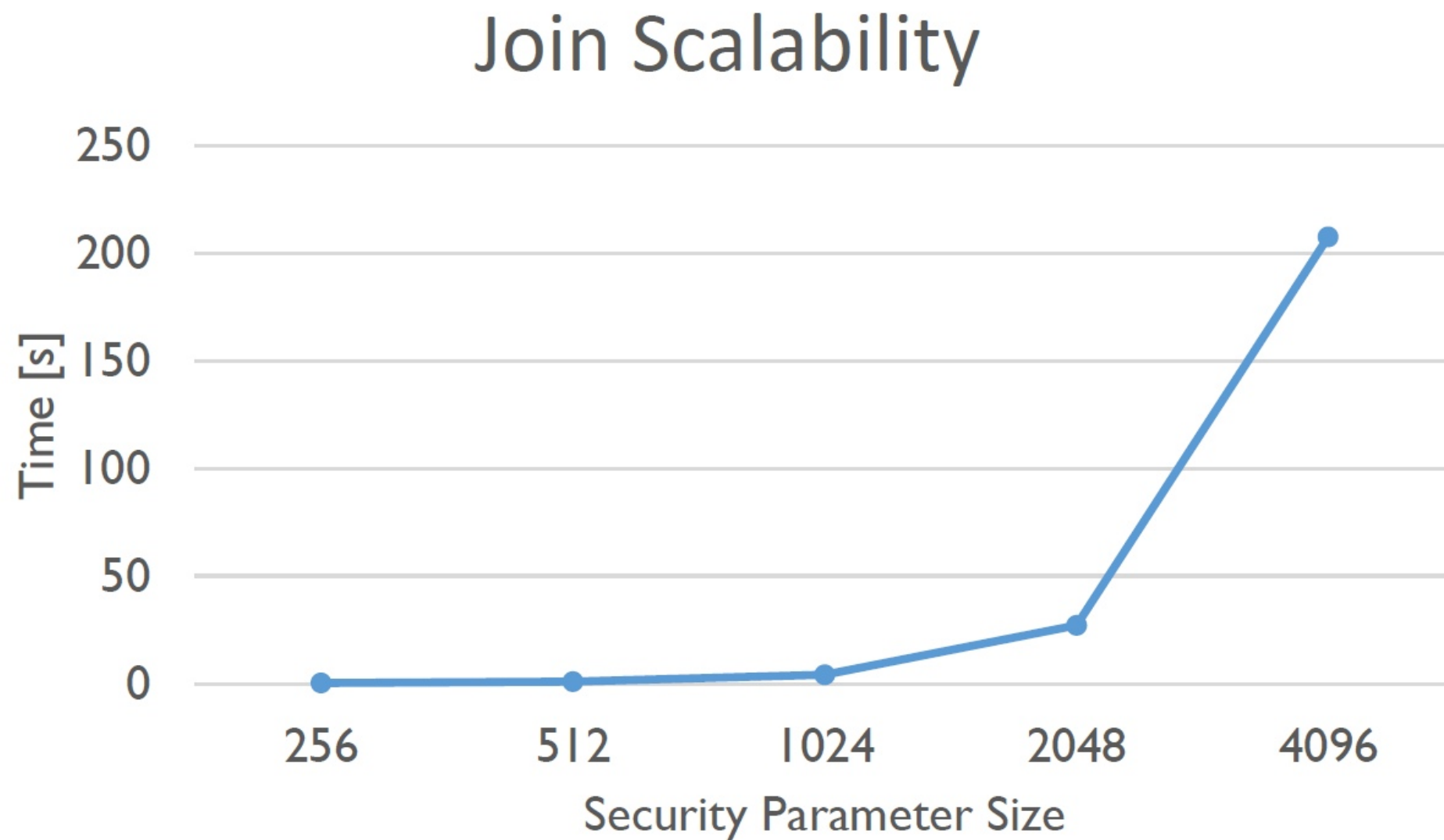
# Cross Join

- No constraints on field values
- Combine records of a table with records of other tables (Cartesian Product)
- The DBMS can do the work.

# ON Policy

- Joinable columns known a priori
- Store values in joinable columns as PE and TD ciphertexts
  - No need of Match function evaluation
  - String equality comparison

# Join Performances



# Conclusions

- Relatively fast Paillier Cryptosystem adaption
- Bag of Bits approach for numerical range queries
- Performant Join solution

That's it !  
Thank you for paying attention.

*Alex*