

# SEAL<sup>1</sup>: Mitigating Attacks on Encrypted Databases via Adjustable Leakage

<sup>1</sup> Searchable Encryption with Adjustable Leakage

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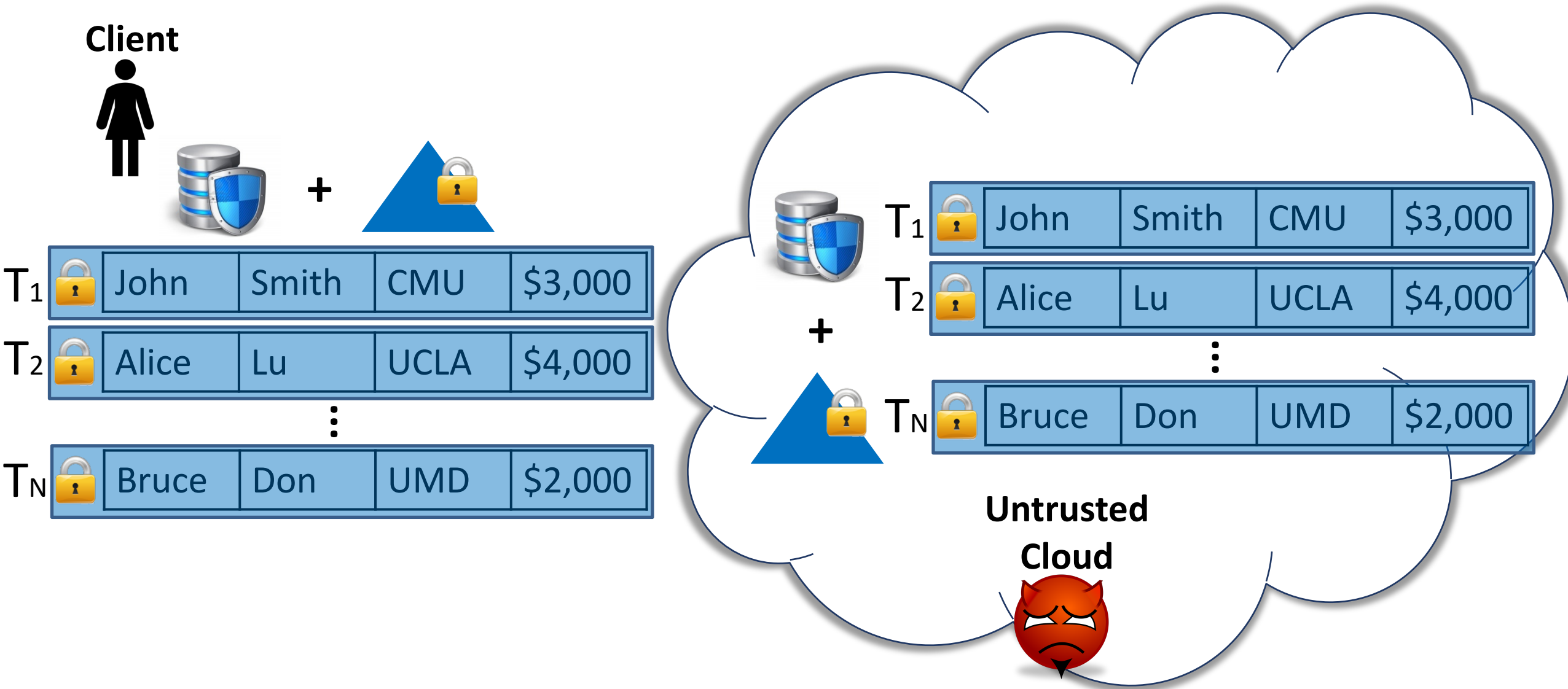
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# What is Searchable Encryption (SE)?



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Client



**Search pattern:**  
whether a search query is repeated

search query:  Bruce



$T_1$

	John	Smith	CMU	\$3,000
---	------	-------	-----	---------

$T_2$

	Alice	Lu	UCLA	\$4,000
---	-------	----	------	---------

⋮

$T_N$

	Bruce	Don	UMD	\$2,000
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**Setup leakage:** total leakage prior to query execution, e.g. size of the encrypted database



**Access pattern:** encrypted tuples that satisfy the search query

**Leakage** is the amount of information that the untrusted cloud learns

Untrusted Cloud ?



# What is Searchable Encryption (SE)?

Client



**Search pattern:**  
whether a search query is repeated

search query:  Bruce

**Overlapping pattern:** the tuple overlaps between previous queries

\$2,000

**Access pattern:** encrypted tuples that satisfy the search query

**Volume pattern:**  
result size

**Setup leakage:** total leakage prior to query execution, e.g. size of the encrypted database



T<sub>1</sub>

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---	------	-------	-----	---------

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---	-------	----	------	---------

⋮

Untrusted

Cloud



**Security (informal):** The adversary does not learn anything beyond the above leakages!

# Attacks on SE

**Search/ Overlapping  
Pattern**

+

**Volume Pattern**  
**Keyword/Email Search**

Islam et al. NDSS 2012  
Cash et al. CCS 2015



Assume that the adversary  
knows a fraction  $N^\gamma$  ( $\gamma \in [0,1]$ )  
of the plaintext input

**Search/ Overlapping**

**Keyword/Email Search**

Zhang et al. USENIX 2016

**Range Search**

Dautrich et al. EDBT'13  
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Grubbs et al. S&P 2019

**kNN queries**

Kornaropoulos et al. S&P 2019

**Volume Pattern**

**Range Search**

Kellaris et al. CCS 2016  
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Kornaropoulos et al. S&P 2020

# Attacks on SE

Search/ Overlapping  
Pattern

Search/ Overlapping

Volume Pattern

## Limitations of prior attacks:

- i) Do not attack state-of-the-art schemes (e.g., range attacks)
- ii) Assume that the attacker knows a great percentage of the input distribution
- iii) Assume that the query distribution is known to the attacker
- iv) Assume that the input database has a specific structure

Kornaropoulos et al. S&P 2019

# Attacks on SE

# ?? Defenses ??

**Search/ Overlapping  
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**kNN queries**

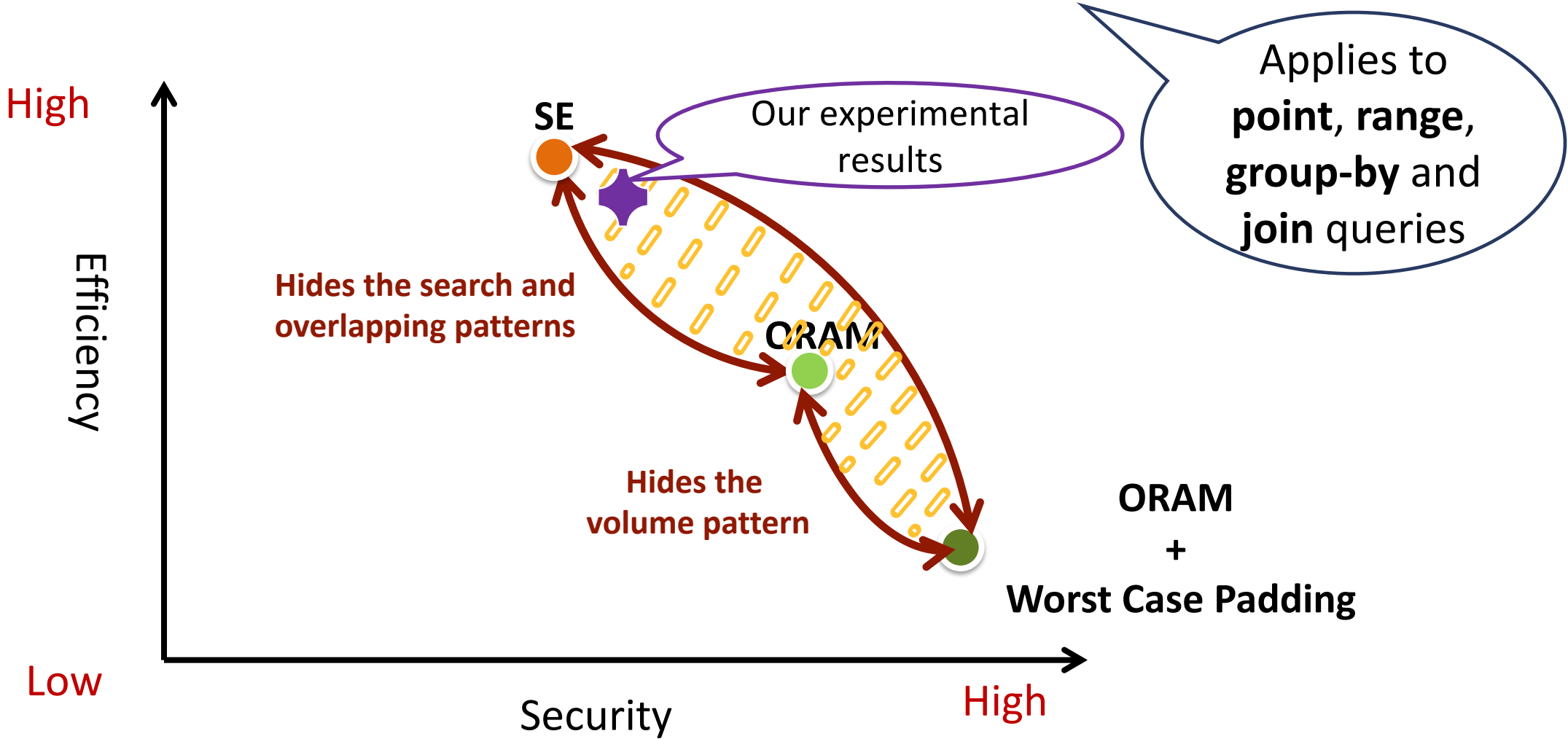
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**Volume Pattern**

**Range Search**

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# SEAL: Searchable Encryption with Adjustable Leakage





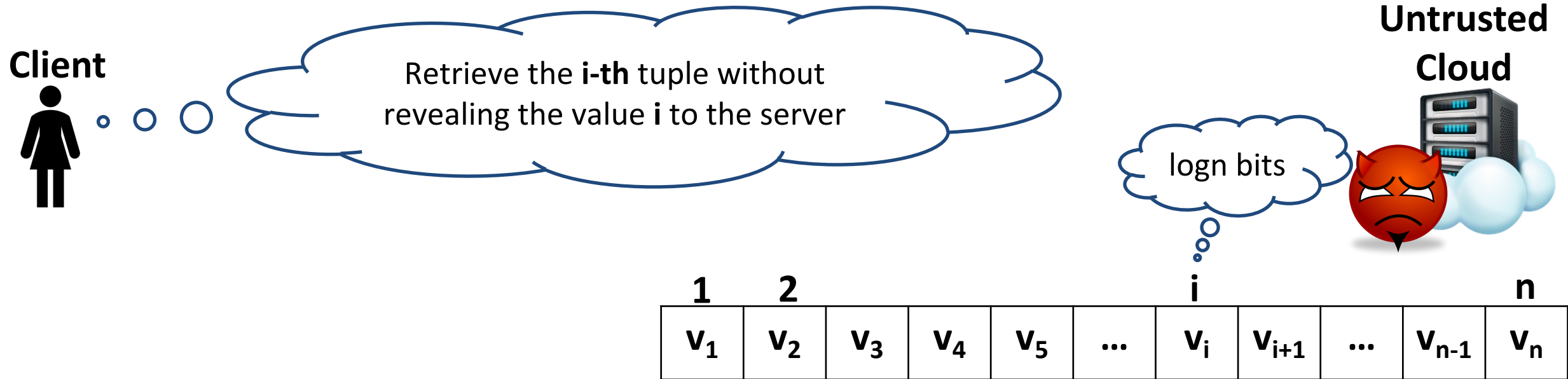
# Contribution

- **SEAL: Searchable Encryption with Adjustable Leakages**
  - ADJable-ORAM- $\alpha$  (hides search and overlapping leakages)
  - ADJable-Padding-x (hides volume leakage)
- Attacks for point, range, join and group-by queries
  - First attack sketch for state-of-the-art range schemes
- New constructions for point, range, join, group-by queries
  - Using SEAL as black-box
- New customized Range Scheme, robust against attacks
- Experimental adjustment of search/overlapping/volume leakages

# Focus of this talk

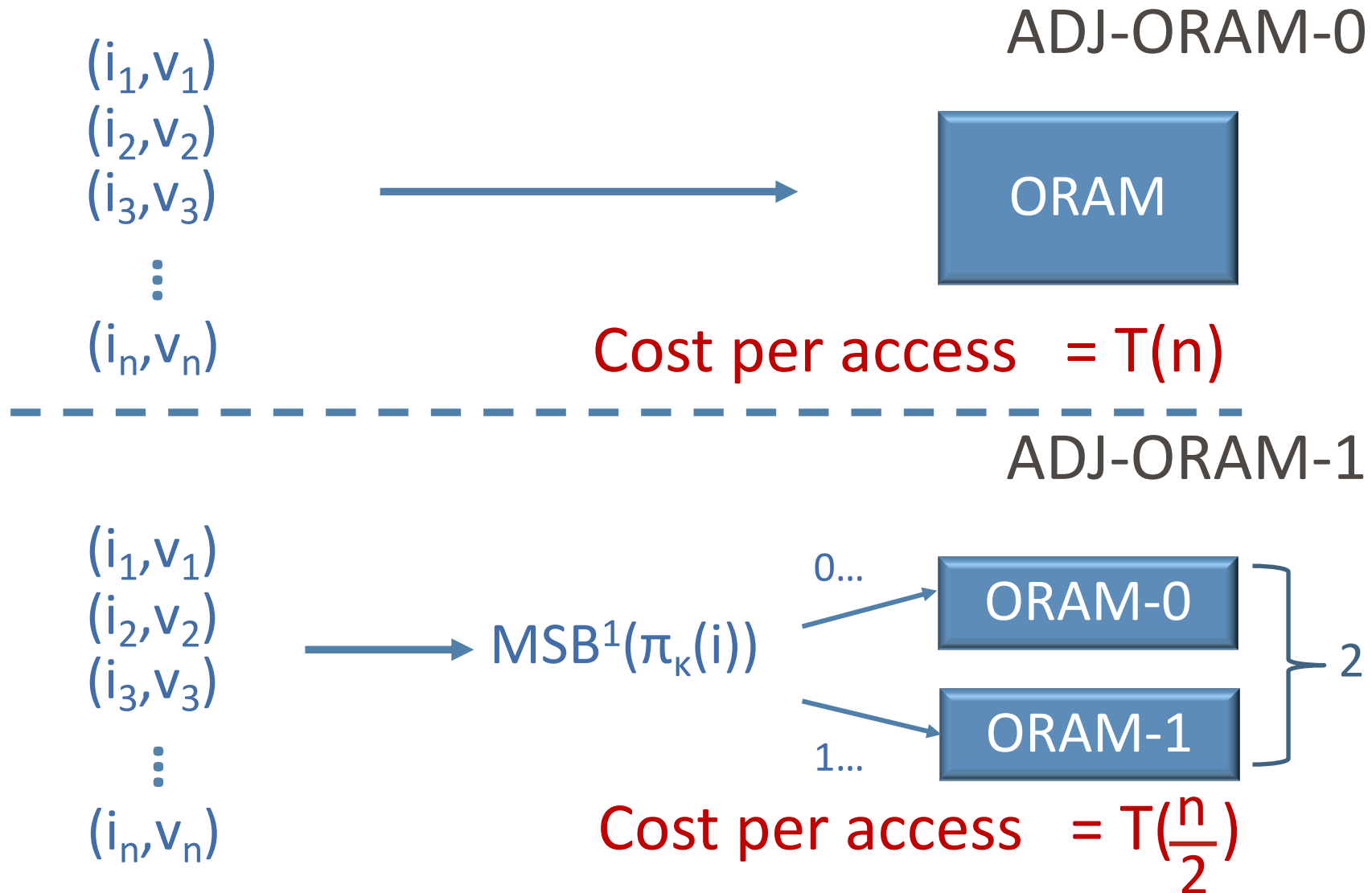
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# Adjustable-ORAM- $\alpha$ (ADJ-ORAM- $\alpha$ )

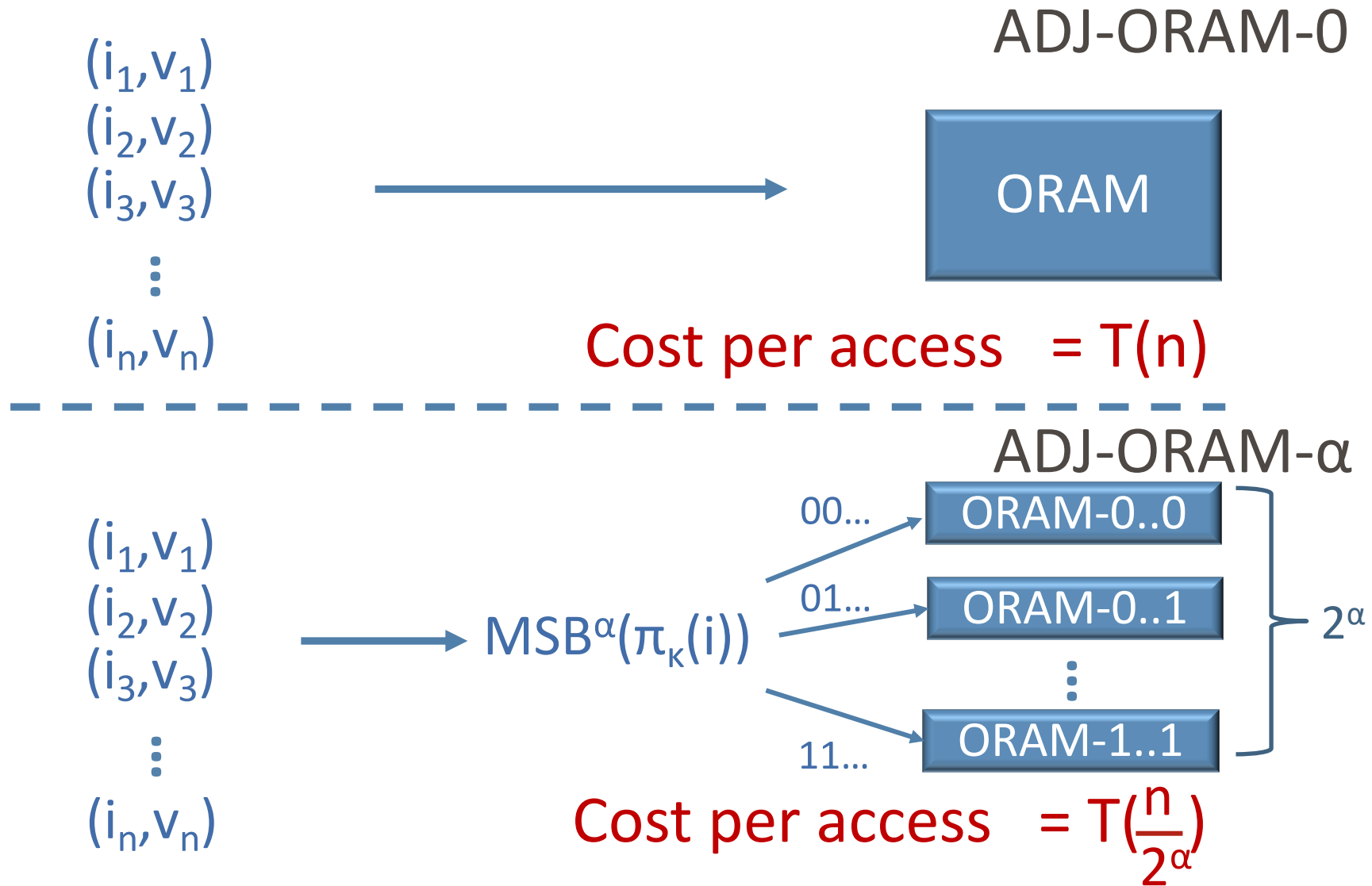


**ADJ-ORAM- $\alpha$ :** Leak  $\alpha$  bits of the accessed memory locations!

# ADJ-ORAM- $\alpha$



# ADJ-ORAM- $\alpha$



# Adjustable-Padding-x

- **Observation 1:** In a dataset of size  $N$  a query result can have up to  $N$  different sizes
- **Observation 2:** We can perform worst-case padding to eliminate the volume pattern leakage (1 unique size)
- Adjustable Padding: Pad all the query results to the closest power of  $x$ .
  - The server can observe up to  $\log_x N + 1$  different sizes
  - Volume Pattern leakage  $\log \log_x N + 1$  bits
- At the end, we pad the dataset to have  $x*N$  entries to avoid leaking extra information

# SEAL( $\alpha, x$ )

- Uses ADJ-ORAM- $\alpha$ , ADJ-Padding- $x$  and an oblivious dictionary as black-boxes
- Parameter  $\alpha$  is defined in the range  $[0, \log N]$ 
  - $\alpha=0$  all the search/overlapping pattern bits are protected
  - $\alpha=\log N$  all the search/overlapping pattern bits are leaked
- For larger  $x$  values less volume pattern bits are leaked
  - $x=N$  no volume pattern bits are leaked
- SEAL( $\alpha, x$ ) can be used as a building block for point/range/join/group-by queries providing a security/efficiency trade-off

# Outline

- SEAL: Searchable Encryption with Adjustable Leakages
  - ADJable-ORAM- $\alpha$  (hides search and overlapping pattern leakages)
  - ADJable-Padding-x (hides volume pattern leakage)
- Attacks for point, range, join and group-by queries
  - First attack-sketch for the state-of-the-art range schemes
- New constructions for point, range, join, group-by queries
  - Using SEAL as black-box
- New more efficient customized Range Scheme robust against attacks
- **Experimentally adjusting these leakages**



# Threat Model and Attacks

Client



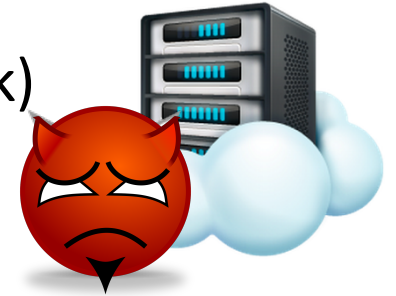
## Attacker's Goals:

- (i) Decrypt the client's encrypted queries (Query Recovery attack)
- (ii) Decrypt the encrypted database (Database Recovery attack)

## Attacker's Power:

- Has access to the server observing all the possible encrypted queries
  
- Has plaintext access to the input dataset

Untrusted  
Cloud



**Query Recovery-Success Rate ( $QR_{SR}$ ) =**  
Correctly Decrypted Queries /  $|Q|$

**Database Recovery-Success Rate ( $DR_{SR}$ ) =**  
Correctly Decrypted Tuples /  $N$

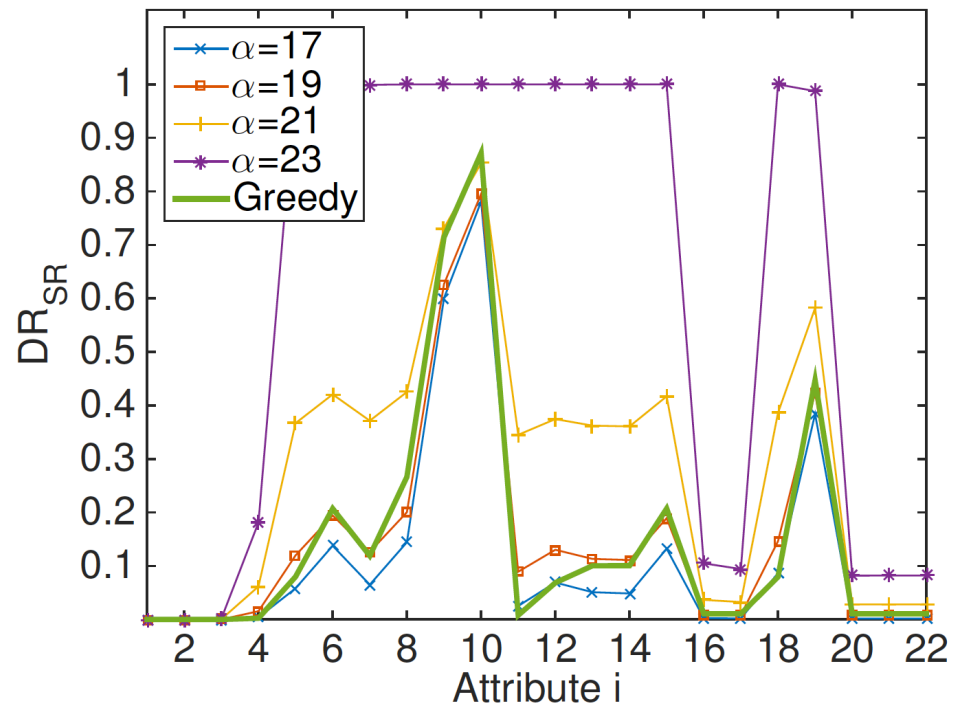
# Attack Configuration

- Modified Frequency Analysis Attack proposed by Naveed et al. [CCS2016]
- 1 real dataset with 6,123,276 records of reported crime incidents
  - 22 attributes with different distributions:
    - ID, Case Number, Date, Block, ICR, Primary Type, Description, Location Description, Arrest, Domestic, Beat, District, Ward,
    - Community Area, FBI Code, X Coordinate, Y Coordinate, Year,
    - Updated On, Latitude, Longitude, Location.
- TPC-H Benchmark
  - 8 tables (61 different attributes)
    - PART, SUPPLIER, PARTSUPP, CUSTOMER, NATION, LINEITEM, REGION, ORDERS

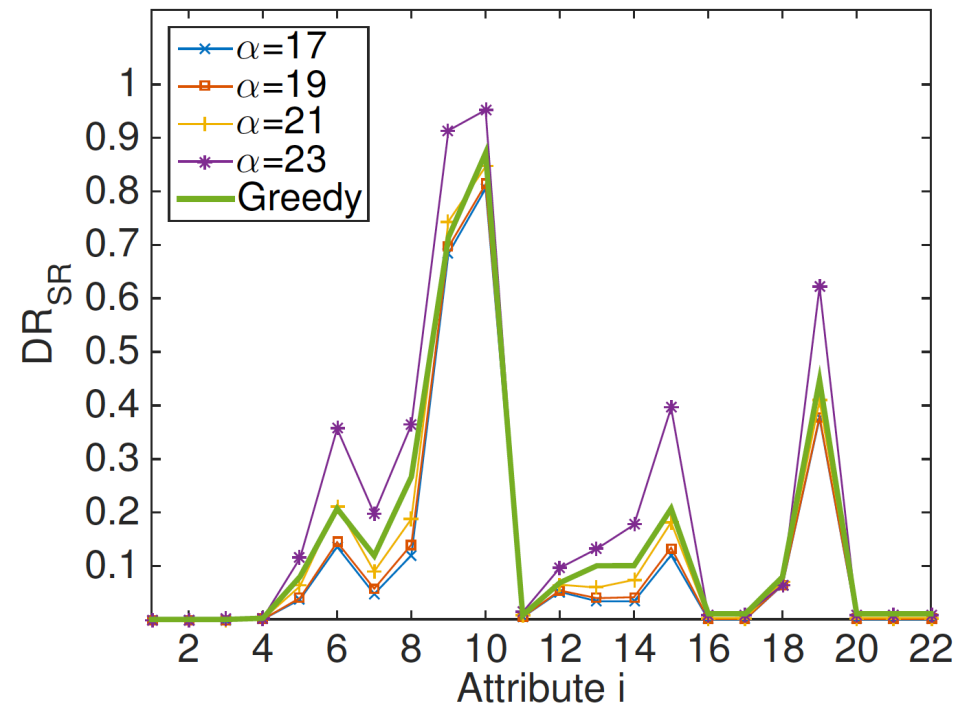
# Database Recovery Attack for Point Queries (Crime Dataset)

Parameter  $\alpha$  controls the search/overlapping pattern leakage ( $\alpha=[0 \dots \log N]$ )

Parameter  $x$  controls the volume pattern leakage ( $x=[\text{No padding}, 2, \dots N]$ )



(a)  $x = \perp$

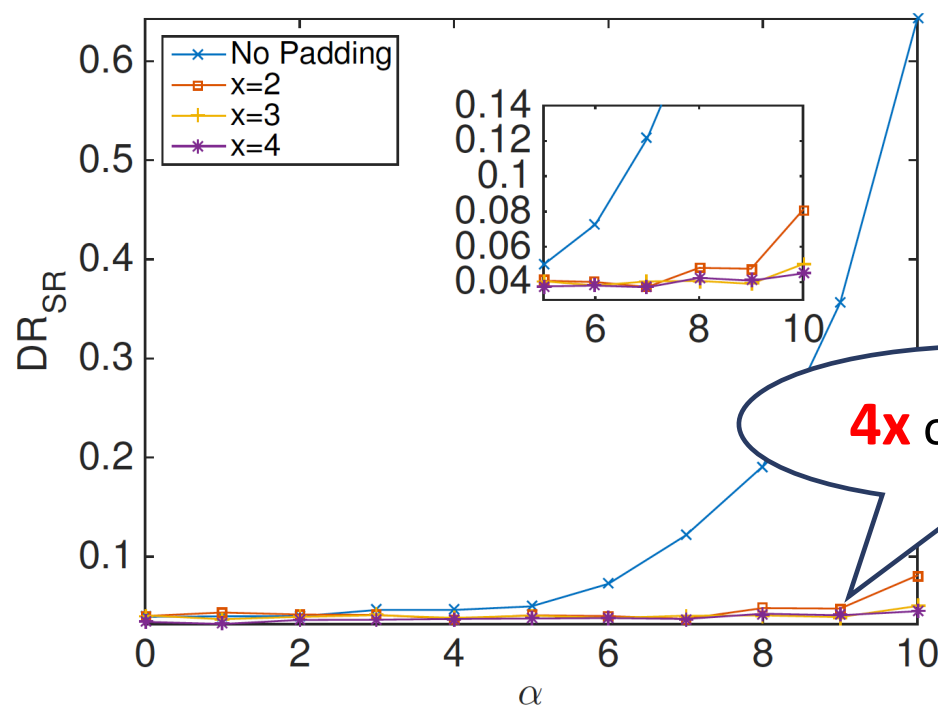


(b)  $x = 2$

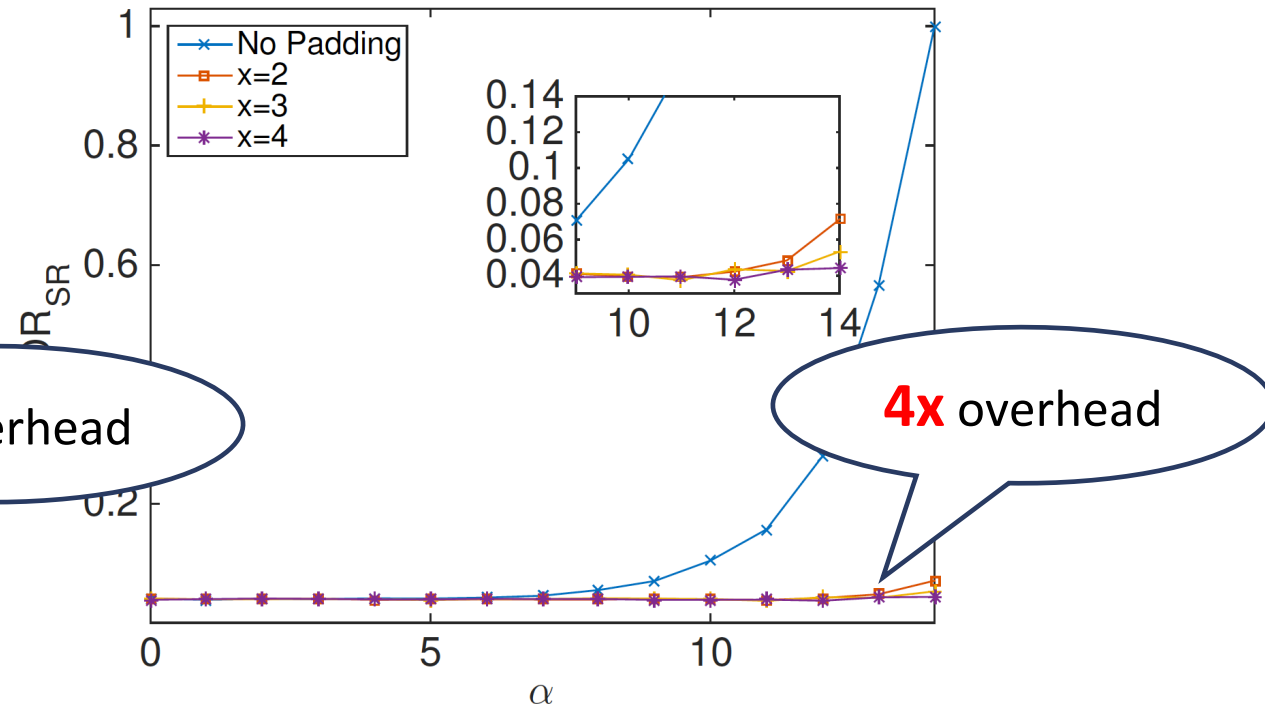
# Database Recovery Attack for Join Queries

Parameter  $\alpha$  controls the search/overlapping pattern leakage ( $\alpha=[0 \dots \log N]$ )

Parameter  $x$  controls the volume pattern leakage ( $x=[\text{No padding}, 2, \dots N]$ )



(a) SUPPLIER  $\times$  NATION



(b) CUSTOMER  $\times$  NATION

# Adjusting Parameters “ $\alpha$ ” and “ $x$ ” in Practice

Finding appropriate parameter values is *data-dependent*:

- Size of the database
- Number of distinct values
- Distribution of the searchable attribute

**Approach:** Before outsourcing the database, for a given attribute, use existing/our all-powerful attacks and try different values of “ $a$ ” and “ $x$ ”

## **General Guidelines:**

- Point/Join/Group-by queries:  $\alpha = \log N - 3$  and  $x = 4$  (~**32x** overhead)
- Range Queries:  $x = 8$  (~**12x** overhead)

# Thank you!! Questions?

