# Advanced cryptography module: <u>Paper presentation</u>

#### Presented by:

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#### **Supervised:**

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### **Generic Attacks on Secure Outsourced Databases**

#### **Authors:**

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- George Kollios
- Kobbi Nissim
- Adam O'Neil

### Outline

- 1. General context
  - a. Problematic
    - i. Outsourced databases
  - b. Solutions
  - c. The idea of the paper
  - d. Related work
- 2. The model: Set up
- 3. Attacks:
  - a. Attack using the communication volume
- 4. Experiments
- 5. Conclusion

### **General context - Problematic**

#### **Outsourced databases model**

**Example:** Big companies with strong customer base:

- o e-commerce websites.
- o banks.
- o ensurance.

### **General context - Problematic**

#### **Problematic:**

Potential move to the cloud?



### **General context - Problematic**

#### **Questions:**

>>> Security VS Efficiency <<<



#### **General context - Solutions**

#### Cryptographic solutions:

- FHE
- ORAM
- Searchable encryption

#### **Practical solutions:**

- Deterministic encryption | Order preserving encryption
  - CryptDB | CipherBase
  - >> More practical but leaks information <<</li>

### **General context - Down sides**

Most of these systems do <u>leak information</u>



• Which leads to Attacks



### **General context - The paper**

- Generic Approach for outsourced DB system
  - Implementation free

Present an attack depending on the leakage mode.

## **Leakages Types**

- Access pattern:
  - Which "encrypted" records are returned as the result of a query

encrypted query 1	id1, id5, id7,
encrypted query 2	id3, id5 , id1,



What the attacker sees

### **Leakages Types**

- Communication volume:
  - We know learn how many encrypted records are returned as a result of a query

# of records	# of queries
0	u0
1	u1
2	u2 = 13
3	u3
4	u4



What the attacker sees

#### Related work

- Previous work exploiting the <u>access pattern</u> leakage:
  - M. S. Islam, M. Kuzu, and M. Kantarcioglu.
    - Access pattern disclosure on searchable encryption:Ramification, attack and mitigation.
  - J. L. Dautrich Jr and C. V. Ravishankar:
    - Compromising privacy in precise query protocols.
      - Assumptions?
  - M. Naveed, S. Kamara, and C. V. Wright.
    - Inference attacks on property-preserving encrypted databases.
      - Assumptions?
- First Attack considering the communication volume leakage...

### The paper main tool

- Reconstruction Attack (of the search keys):
  - Type 1: Based on access pattern
  - Type 2: Based on communication volume

- Assumptions and limitations:
  - No required information on queries or answers
  - Range queries
  - Uniform queries

### General context - Range queries

#### Queries Types:

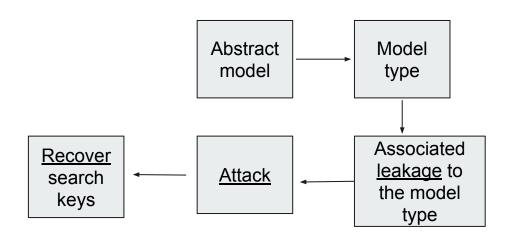
- Point queries
- Range queries

ID	First Name	Last Name	Email	Year of Birth
1	Peter	Lee	plee@university.edu	1992
2	Jonathan	Edwards	jedwards@university.edu	1994
3	Marilyn	Johnson	mjohnson@university.edu	1993
6	Joe	Kim	jkim@university.edu	1992
12	Haley	Martinez	hmartinez@university.edu	1993
14	John	Mfume	jmfume@university.edu	1991
15	David	Letty	dletty@university.edu	1995

**Table: Students** 

Students born between 91 -- 96 ??

### General Road Map of the paper



The setting

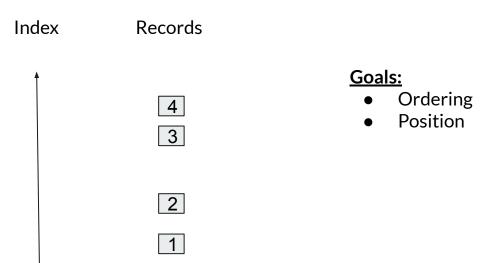
Index

The setting

Records

4
3

#### The setting



#### The setting

Records

Goals:

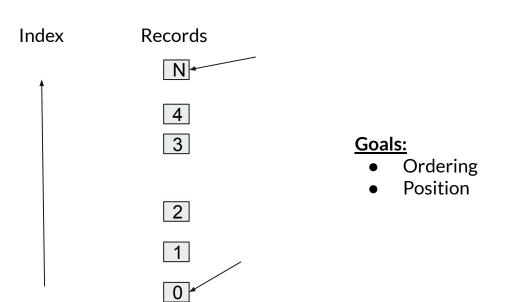
Ordering
Position

2

1

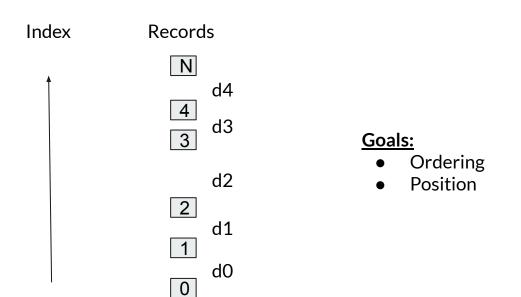
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#### The setting

Index	Records N	# of records	# o
<b>†</b>	d4	0	u0
	3 d3	1	u1
	d2	2	u2
	2 d1	3	u3
	d0	4	u4
	0	L	-

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Knowing di for i: 0 -> N

Knowing the **positions** and ordering

Knowing <u>di</u> for i: 0 -> N

Knowing the **positions** and **ordering** 

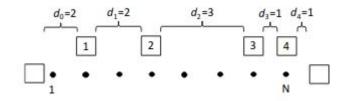
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How can we do it starting from ui ??!!

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How can we do it starting from ui ??!!





We can see that:

• N = 8

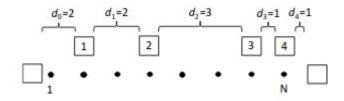
#### We have this system:

$$d_0 \cdot d_n = u_n$$

$$d_0 \cdot d_{n-1} + d_1 \cdot d_n = u_{n-1}$$

$$d_0 \cdot d_{n-2} + d_1 \cdot d_{n-1} + d_2 \cdot d_n = u_{n-2}$$
...
$$d_0 \cdot d_1 + d_1 \cdot d_2 + \dots + d_{n-1} \cdot d_n = u_1$$

$$(d_0)^2 + \dots + (d_n)^2 = 2 \cdot u_0 + N + 1$$



We can see that:

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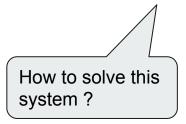
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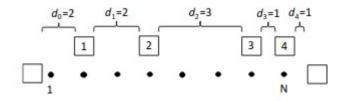
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$$(d_0)^2 + \dots + (d_n)^2 = 2 \cdot u_0 + N + 1$$

#### We define these two polynomials:

$$d(x) = d_0 + d_1 x + d_2 x^2 + \dots + d_n x^n$$

$$d^R(x) = d_n + d_{n-1} x + d_{n-2} x^2 + \dots + d_0 x^n,$$

$$F(x) = d(x) \cdot d^R(x)$$

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$$(d_0)^2 + \dots + (d_n)^2 = 2 \cdot u_0 + N + 1$$

Turns out that, F(x) equals:

$$F(x) = u_n x^{2n} + u_{n-1} x^{2n-1} + \dots + u_0 x^n + \dots + u_{n-1} x + u_n$$

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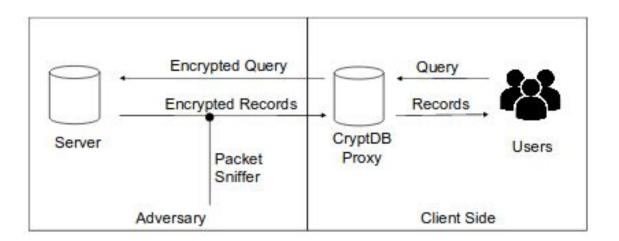
## Complexity

#### T is the domain size:

- For order recovery:
  - O((T^2)\* log(T)) queries are needed

- For full reconstruction:
  - o O(T^4) queries are needed

## **Experiments - Set up**



## **Experiments - Datasets**

Source	Datasets	Index	N	$n(\max)$	n(avg)
PUDF	518	Mortality Risk	4	55,605	5,612
		Age (<18)	6	20,454	1,170
		Age (≥ 18)	16	34,162	4,130
		Age (All)	22	50,626	5,300
		Length of Stay	365	55,605	5,612
NIS	1049	Age (<18)	18	16,954	1,195
		Age $(\geq 18)$	107	106,252	6,240
		Age (All)	125	121,663	7,435
		Length of Stay	365	121,663	7,435

# **Experiments - Attack 1**

Source	Index	Ordering	Positions	Dense
PUDF	Mortality Risk	1 ms	1 ms	85%
	Age (<18)	1 ms	1 ms	34.1%
	Age $(\geq 18)$	1 ms	1 ms	67.3%
	Age (All)	1 ms	1 ms	32.2%
	Length of Stay	43 ms	4.2 sec	0%
NIS	Age (<18)	1 ms	1 ms	31.5%
	Age (≥ 18)	1 ms	202 ms	0%
	Age (All)	1 ms	356  ms	0%
	Length of Stay	5 ms	3.4 sec	0%

## **Experiments - Attack 2**

Source	Index	Factor $(n \leq 150)$	BruteForce
PUDF	Mortality Risk	11 min	22 ms
	Age (<18)	39 sec	1.7 ms
	Age (≥ 18)	4.3 min	15  ms
	Age (All)	4.1 min	390 ms
	Length of Stay	3 min	22 ms
NIS	Age (<18)	3.3 min	2 ms
	Age $(\geq 18)$	6 min	34  ms
	Age (All)	5.1 min	189 ms
	Length of Stay	4 min	44  ms

### Conclusion

- Generic model to capture outsourced databases.
- Two attacks depending on the type of leakage
  - Pattern access
  - Communication volume
- Their efficiency on real life databases
- Outsourced databases should avoid:
  - Being static non storage inflating
  - Being with fixed communication overhead

### **Open questions**

• The case of non-uniform queries.

Models that leaks communication volume.

• The case where communication volume is perturbed:

# Thank you