Privacy Preserving Protocol for Iris Recognition Based on Somewhat Homomorphic Encryption

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Introduction

Fully and Somewhat Homomorphic Encryption DGHV Cryptosystem New Cryptosystem

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Iris Recognition Protocol

Validation

Biometric signals often used in access control systems



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Motivation

Biometric signals often used in access control systems



Need of privacy protection of both the biometric gallery and the probe

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Our solution: Somewhat Homomorphic encryption

It allows to perform operations on plain texts while they are encrypted.

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Somewhat Homomorphic: can perform a limited number of operations.

Fully Homomorphic: can perform a virtually infinite number of operation.

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We extend the Somewhat homomorphic scheme of Van Dick et al.¹ usualy called DGHVIn DGHV scheme the message is encrypted by hiding it in the additional noise of a multiple of an odd integer p.

¹Van Dijk, M., Gentry, C., Halevi, S., and Vaikuntanathan, V. (2010) Fully homomorphic encryption over the integers. Advances in Cryptology -EUROCRYPT 2010, 24-43. We extend the Somewhat homomorphic scheme of Van Dick et al.¹ usualy called DGHVIn DGHV scheme the message is encrypted by hiding it in the additional noise of a multiple of an odd integer p.

$$c = p \cdot q + 2r + m$$

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$$c = p \cdot q + 2r + m$$

Until c mod p < p/2 the message can be recovered easily.

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The previous symmetrical scheme can be modified into an asymmetric one. Let:

 $\lambda\,$ be an integer referred to as the security parameter;

- η be the bit length of the secret key p;
- $\tau\,$ be the number of elements composing the public key, each of which has bit length $\gamma;$

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 ρ and ρ' be respectively the bit lengths of the noise in the public key and in a fresh ciphertext.

Keys :

Secret Key : a η -bit random odd integer p.



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Public Key : \tau integers x_i such that x_i = p \cdot q_i + r_i.

for i = 0, \dots \tau. x_0 is the largest, it is

odd and [x_0]_p is even.
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Details continue

Keys : Secret Key : a η -bit random odd integer p. Public Key : τ integers x_i such that $x_i = p \cdot q_i + r_i$. for $i = 0, \dots \tau$. x_0 is the largest, it is odd and $[x_0]_p$ is even. encryption : given $m \in \{0, 1\}$ $c = m + 2r + 2 \sum_{S \subseteq \{1, \dots, \tau\}} x_i \mod x_0$

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decryption : $[c \mod p]_2$

Details continue

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evaluate : Given $C(x_1, \ldots x_t)$ and t ciphertexts c_i , apply the addition and multiplication gates of C to the ciphertexts and return the resulting ciphertext.

- * The schemes proposed thus far work on the integer ring \mathbb{Z}_2 .
- * We propose to work in the ring \mathbb{Z}_b $(b \in \mathbb{Z})$
- * We choose an integer $b = 2^k \ (k > 0)$,
- * We modify the original scheme so that it can encrypt and decrypt integer numbers in the interval [0, b).

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Our Cryptosystem

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*

$$c = m + p \cdot q + br$$

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Negative Numbers

The scheme we are going to propose can also encode negative numbers. Given the base $b = 2^k \Rightarrow$ we can encrypt number in the interval (-b/2, b/2]. The decryption function is performed as:

 $([c]_p \mod b)$

The result is:

positive if
$$\left[[c]_{p} \right]_{b} < b/2$$

negative if $\left[[c]_{p} \right]_{b} > b/2 \Rightarrow \left[[c]_{p} \right]_{b} - b$

In this case the *base* should be twice the maximum integer that needs to be computed.



- The Secret Key: is an odd η -bit integers $p \in \mathbb{Z}$ such that $p \equiv 1 ($ mod b) in other words $p = n \cdot b + 1$.
- Public key: Choose a random set of odd integers $q_i \in \mathbb{Z}$. For all $1 \le i \le \tau$ we define $x_i = q_i \cdot p + r_i$ and a noise-free element $x_0 = q_0 \cdot p$ with $q_0 > q_i$ for all *i*. The public key is $\mathbf{pk} = \{x_0, x_1, \dots, x_{\tau}\}$.

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Encrypt(**pk**, *m*). Given a integer message $m \in [0, b)$, choose a random integer $r \in (-2^{\rho'}, 2^{\rho'})$ and let S be a sparse subset of indexes in $\{1, \ldots, \tau\}$. The ciphertext c is:

$$c = \left[m + br + b\sum_{i \in S} x_i\right]_{x_0}$$
(1)

Decrypt(p, c). Given a ciphertext c, the decryption function is:

$$m = [c]_p \mod b, \tag{2}$$

The integer x_0 of the public key is an exact multiple of pThis choice permits the reduction modulo x_0 after every operation Add (c_1, c_2, \mathbf{pk}) . To perform addition, given two cipher texts c_1, c_2 :

$$c_s = [c_1 + c_2]_{x_0} \tag{3}$$

 $Mult(c_1, c_2, \mathbf{pk})$ To perform multiplication, given two cipher texts c_1, c_2 :

$$c_m = [c_1 \cdot c_2]_{x_0} \tag{4}$$

Parameters

The sets of parameters chosen to test the performance of the stand-alone scheme

Security level	λ	ρ	η	γ	au
Тоу	42	27	1026	150000	158
Small	52	41	1558	830000	572
Medium	62	56	2128	4200000	2110

Table : Parameter sets of the proposed scheme as a function of λ .

The sets of parameters used are the same as in Coron et al. paper²

²Coron, J. S., Mandal, A., Naccache, D., and Tibouchi, M. (2011). Fully homomorphic encryption over the integers with shorter public keys. Advances in Cryptology - CRYPTO 2011, 487-504.

Since the scheme is somewhat Homomorphic it is important to know how many operations we can perform.

$$\mu \le \frac{\eta - 1}{\log_2 \tau + k + \rho + 2}.\tag{5}$$

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base		lambda 42	lambda 52	lambda 62
2	Practical average	25.41	27.29	28.54
	theoretical	26.76	28.75	29.94
2048	Practical average	19.00	22.02	24.02
	theoretical	22.14	25.05	26.91
4096	Practical average	18.12	21.58	24.02
	theoretical	21.22	24.27	26.25

Table : Maximum number of multiplications. We compare theoretical limit with practical. They are shown in Table 1.

Among all the iris matching protocols proposed in the past, we rely on the one described by $Daugman^3$.



 $D(q, x_i) = ||(q \oplus x_i)|| < \epsilon$

The result is a 2048 bit vector

³Daugman, J. (2004). How iris recognition works. Circuits and Systems for Video Technology, IEEE Transactions on, 14(1), 21 - 30.

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$$egin{aligned} D(q,x_i) &= \|(q\oplus x_i)\| < \epsilon \ && D(q,x_i) < \epsilon \ && \downarrow \ D(q,x_i) - \epsilon < 0 \end{aligned}$$

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The protocol can be divided into three parts: We assume client have already provided Pk in a registration phase

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One: The client sends to the server

• A binary probe $(q_1 \ldots q_n)$

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Two: The server

 $1. \ \mbox{Encrypts}$ all database iris vectors with pk

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- 2. Starts computing
- 3. Sends back a integer vector

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if there exists an index I in $\{1...,N\}$ for which $D(q, x_I) < \epsilon$ the user is enrolled in the database.

Server Computing

$$D(q, x_i) = \|(q \oplus x_i)\|$$

 \oplus is XOR between binary vectors \oplus is addition modulus *b*, in our case. So the result could be either 0, 1, 2

dataBase (D)	1	0	1	1	1	0	0
probe (P)	0	1	1	0	1	0	0

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dataBase (D)	1	0	1	1	1	0	0
probe (P)	0	1	1	0	1	0	0
D + P = A	1	1	2	1	2	0	0

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$$D(q, x_i) = \|(q \oplus x_i)\|$$

In order to transform 2's in zeros, we after perform $(q \cdot x_i)$ where \cdot stands for multiplication.

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probe (P)	0	1	1	0	1	0	0
D + P = A	1	1	2	1	2	0	0
$D \cdot P = B$	0	0	1	0	1	0	0

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probe (P)	0	1	1	0	1	0	0
D + P = A	1	1	2	1	2	0	0
$D \cdot P = B$	0	0	1	0	1	0	0
2 · B	0	0	2	0	2	0	0

Server Computing

$$D(q, x_i) = \|(q \oplus x_i)\|$$

Finally we compute

$$D(q, x_i) = \|(q + x_i) - 2 \cdot (q \cdot x_i)\| = \|q \cdot (1 - 2x_i) + x_i\|.$$

dataBase (D)	1	0	1	1	1	0	0
probe (P)	0	1	1	0	1	0	0
D + P = A	1	1	2	1	2	0	0
$D \cdot P = B$	0	0	1	0	1	0	0
2 · B	0	0	2	0	2	0	0
$A - 2 \cdot B$	1	1	0	1	0	0	0

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So in the end we compute

$$D(q, x_i) = \|(q + x_i) - 2 \cdot (q \cdot x_i)\| = \|q \cdot (1 - 2x_i) + x_i\|.$$

$$\mathcal{E}_{\mathsf{pk}}[D(q, x_i)] = \|\mathcal{E}_{\mathsf{pk}}[q] \cdot \mathcal{E}_{\mathsf{pk}}[1 - 2x_i] + \mathcal{E}_{\mathsf{pk}}[x_i]\|$$

Server Computing Continue

$$\mathcal{E}_{pk}[D(q, x_i) - \epsilon] = \mathcal{E}_{pk}[D(q, x_i)] + \mathcal{E}_{pk}[-\epsilon] = \mathcal{E}_{pk}[d_i]$$

$$\mathcal{E}_{pk}[D(q,x_i)-\epsilon] = \mathcal{E}_{pk}[D(q,x_i)] + \mathcal{E}_{pk}[-\epsilon] = \mathcal{E}_{pk}[d_i].$$

The number $\mathcal{E}_{pk}[d_i]$ is multiplied by a random number in $(0, 2^{k-1}]$

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$$\mathcal{E}_{pk}[D(q, x_i) - \epsilon] = \mathcal{E}_{pk}[D(q, x_i)] + \mathcal{E}_{pk}[-\epsilon] = \mathcal{E}_{pk}[d_i].$$

The number $\mathcal{E}_{pk}[d_i]$ is multiplied by a random number in $(0, 2^{k-1}]$ The resulting vector is randomly permutated

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Communication Complexity - Cipher size.

λ	Secret Key (KB)	Public Key (MB)	Ciphertext (KB)
42.00	0.13	2.83	18.31
52.00	0.19	56.60	101.32
62.00	0.26	1056.43	512.70

Table : Size of the cipthertext and of the public and secret keys.

- PK varies from 3MB to 1GB. We assume Client already provided it.
- Each Ciphertext varies from 18KB to 513KB
- Each query sent to server needs 6.59 MB, 202.44MB and 1GB
- The sever sends back a ciphertext of the same size for each element of the data base.

Validation - Crypto System

Base	λ	Cif	Dec	PubKey	PrivKey	Add	Mult
2	42	0.37	0.75	133.73	154.44	0.00	88.75
	52	6.43	4.05	665.94	3662.76	0.25	2653.98
	62	97.77	2.40	1883.80	65784.24	0.50	68518.53
2048	42	0.12	0.75	134.82	139.87	0.12	85.18
	52	5.28	3.70	564.36	33192.42	0.18	2588.43
	62	94.37	28.56	1856.56	83778.98	0.88	66570.42
4096	42	0.50	0.37	141.94	104.17	0.06	86.48
	52	5.88	4.29	580.28	4204.64	0.06	2575.74
	62	90.46	27.54	1828.22	62273.04	0.62	67112.76

Table : Average execution time (ms) of the proposed scheme as a function of the *base b* and of the system parameters.

lambda	Client(s) part 1	Server (s) part 2	Client (s) part 3
42.00	0.062	22.288	0.00042
52.00	0.377	68.422	0.00260
62.00	2.317	17034.959	0.02263

Table : Average time (s) of execution for each part of the proposed protocol. Times in parts 2 and 3 are relative to a single iris template in the database.

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Future Works

- Security demonstration
- Parallelize server computing

Change of bases