



# Techniques in Cryptography and Cryptanalysis

Brice Minaud

email: brice.minaud@ens.fr







# **Fully Homorphic Encryption**







#### Over:

- Keyspace K.
- Plaintext domain P.
- Ciphertext domain C.

Define a triplet of PPT algorithms:

- decryption key sk.

• Enc: on input  $m \in P$  and ek, produce an encryption  $c \in C$  of m. **Dec**: on input  $c \in C$  and sk, produce a decryption  $m \in P \cup \{\bot\}$  of c.

**KeyGen**: on input  $1^{\lambda}$ , generates an encryption key ek, and a

Public-Key Encryption Scheme



### IND-CCA1: indistinguishability under Chosen-Ciphertext Attacks

#### Adversary



Challenger



## IND-CCA2: indistinguishability under adaptive Chosen-Ciphertext Attacks







# Public-key encryption: "proper" definition

#### Public-Key Encryption.

space **M**, ciphertext space **C**, key space **K**.

- **KeyGen**: on input  $1^{\lambda}$ , generates an encryption key ek, and a decryption key sk.
- **Enc**: on input  $m \in P$  and ek, produce an encryption  $c \in C$  of m. **Dec**: on input  $c \in C$  and sk, produce a decryption  $m \in P \cup \{\bot\}$  of c.

**Correctness:** for all  $M \in M$ , Dec<sub>k</sub>(E

**Security:** IND-CCA (for instance

Defined by triplet of alogrithms (KeyGen, Enc, Dec) over message

$$Enc_{\kappa}(M)) = M.$$

Caveat: "security" above only covers confidentiality, not integrity.



### Homomorphic Schemes

# Domains

# Algorithms

**KeyGen**: on input  $1^{\lambda}$  ouputs ek, sk, evk.

- ek may be public.
- sk is private.
- evk is public (e.g. bootstrapping key). **Enc(ek,.)**:  $M \rightarrow C$ .

**Dec(sk,.)**:  $C \rightarrow M \cup \{\bot\}$ .

**Eval(evk,.)**:  $F \times C^* \rightarrow C$ .

- KeyGen and Enc are PPT.

Next few slides adapted from Renaud Sirdey (CEA).

Plaintext domain M, ciphertext domain C and function class F.

Eval and Dec may be deterministic (and often are).



# For "any" function f, we want something like:



### Intuition

 $Dec(Eval(f,Enc(m_1),...,Enc(m_k))=f(m_1,...,m_k).$ 



# Intuition

# For "any" function f, we want something like:

- We want (at least) CPA security. *I.e.* reduction to a hard problem P.
- We want (at most) polynomial overhead. If f is in "O(g(n))" then Eval(f,  $\cdot$ ) is in "O(poly( $\lambda$ )g(n))".
- And... compactness, *I.e.* size(Eval( $f, \cdot$ )) should not depend on size(f).

 $Dec(Eval(f,Enc(m_1),...,Enc(m_k))=f(m_1,...,m_k).$ 





#### Can you imagine a (trivial) non-compact FHE scheme?

Can a deterministic FHE scheme be secure?

#### Questions



# Answer(s) to 2<sup>nd</sup> question

- If "secure" means "CPA": no!  $\bullet$ IND-CPA implies non-determinism, even for normal PKE.
- If "secure" means something weaker: still no for FHE!
  - Assume the scheme has plaintext domain  $Z_t$ .
  - Get  $c_0 = Enc(0)$  and  $c_1 = Enc(1)$ .
  - Assume we have c=Enc(x).
  - Eval( $\cdot \leq t/2$ ;c) and returns either c0 or c1. Then we can decrypt by dichomotic search...



- **CPA** is achieved by all mainstream FHE.
- **CCA1** is achievable. – In theory or in restricted cases (open question for research).
- **CCA2** is not achievable. lacksquare– Malleability contradicts CCA2.

FHE security

But there are also new notions and new security problems with FHE.



$$\mathbb{G} = \langle g \rangle, |\mathbb{G}| = p$$

Secret key:  $x \in \mathbb{Z}_p$ **Public key:**  $h = g^{x}$ 

**Enc**(*m*) = ( $g^r$ ,  $m \cdot h^r$ ), where  $r \leftarrow \mathbb{Z}_p$  $Dec(k,c) = c/k^{x}$ 

Security reduces to DDH assumption over G.

Multiplicatively homomorphic: given (k,c) = Enc(m), (k',c') = Enc(m'), (*kk*',*cc*') is an encryption of *mm*'.

# **Quick reminder: ElGamal Encryption**

# "Additively homorphic" ElGamal

#### ElGamal is multiplicatively homomorphic.

To build additively homomorphic scheme, use:

Works because  $m \mapsto g^m$  is homomorphism from  $(\mathbb{Z}_p, +)$  to  $(\mathbb{G}, \cdot)$ , and morphisms compose.

**Problem:** how to define MyDecrypt?

ElGamal-decrypt(MyEncrypt(m)) = g<sup>m</sup> But getting m from g<sup>m</sup> = Discrete Logarithm problem...\*

\*Still doable if m has low entropy, cf. voting protocols.

- MyEncrypt(m) = ElGamal-encrypt(g<sup>m</sup>)

# Making Discrete Logarithm easy

Let N = pq RSA modulus. Let  $G = \mathbb{Z}_N^2$ . Let g = N+1.

**Discrete log over** G in base g: Given g<sup>x</sup> mod N<sup>2</sup>, find x.

This is actually easy!

Indeed via the binomial formula (binôme de Newton in French):  $(N+1)^{x} = 1 + xN \mod N^{2}$ 

Let N = pq RSA modulus. Let  $\mathbb{G} = \mathbb{Z}_{\mathbb{N}^2}$ . Let  $g = \mathbb{N}+1$ .

**KeyGen.** Public Key: N, Secret Key:  $\phi(N)$ .

**Encryption.** Message  $m \in \mathbb{Z}_N$ , randomness  $r \leftarrow \$ \mathbb{Z}_N$  $Enc(m) = g^{m}r^{N} \mod N^{2}$ 

**Decryption.** Ciphertext  $c \in \mathbb{Z}_{N^2}$  $C^{\phi(N)} = Q^{m\phi(N)}r^{N\phi(N)} \mod N^2$  $= g^{m\phi(N)} \mod N^2$  $\Rightarrow$  Dec(c) = DL(c<sup> $\phi(N)$ </sup>)/ $\phi(N)$ 



Decisional composite residuosity assumption (DCRA) Cannot distinguish  $r^N$  mod  $N^2$  where  $r \leftarrow S \mathbb{Z}_N$  from uniform element of  $\mathbb{Z}_N^2$ .

Paillier encryption is a "one-time pad" of g<sup>m</sup> with r<sup>N</sup>  $\rightarrow$  CPA security follows immediately from DCRA.

DCRA = distinguish wether an element is an N-th power or not. Easy if factorization of N = pq is known (same as quadratic residuosity).

CCA security: requires non-standard assumptions, or small tweaks.

Security of Paillier cryptosystem

### Question

ullet

Can try it here: https://www.linksight.nl/en/content/homomorphic-encryption/

#### What are the homomorphic properties of the scheme?





# **Approximate GCD problem**

#### AGCD problem.

For large prime p and large integer B, distinguish: - oracle that outputs x = qp + r for uniform q < B, and  $r \ll p$ . - oracle that outputs uniform x < pB.

(For security, set  $p \approx 2^{\lambda + \log \lambda}$ ,  $B \approx 2^{\lambda \log \lambda}$ ,  $r \approx 2^{\lambda}$ .)



### A lattice attack



Adapted from Martin Albrecht, 2020.

- x = qp + r
- x' = q'p + r'
- $q'x qx' = q'r qr' \ll x$

 $\mathbf{B} = \begin{pmatrix} 2^{\lambda+1} & x_1 & x_2 & \cdots & x_t \\ & -x_0 & & & \\ & & -x_0 & & \\ & & & \ddots & \\ & & & & -x_0 \end{pmatrix}.$ 

 $\Rightarrow$  short vector in the lattice spanned by rows of B.



#### AGCD problem.

For large prime p and large integer B, distinguish: - oracle that outputs x = qp + r for uniform q < B, and  $r \ll p$ . - oracle that outputs uniform x < pB.

(For security, set  $p \approx 2^{\lambda + \log \lambda}$ ,  $B \approx 2^{\lambda \log \lambda}$ ,  $r \approx 2^{\lambda}$ .)

#### **Security:**

Efficient SVP algorithm  $\Rightarrow$  efficient AGCD algorithm. Conversely, efficient AGCD algorithm  $\Rightarrow$  efficient algorithm for LWE\*.

\*[CS16] https://eprint.iacr.org/2016/837



- KeyGen A large prime p.
- **Encryption** of  $m \in \{0,1\}$ : Randomly choose a large q and r and let c: = qp+2r+m.
- Decryption lacksquare

#### A simple cryptosystem

 $m := (c \mod p) \mod 2.$ 

This is CPA-secure assuming the hardness of the AGCD problem.



# Questions

- Is decryption of fresh ciphertexts correct?
- What are the homomorphic properties of the scheme?
- Under what condition does decryption remain correct?



### Learning with Errors (LWE)

Regev '05. Milestone result.

Pick s uniformly in  $\mathbb{Z}_{a}^{n}$ .

Oracle O<sub>\$</sub>: returns (*a*,*b*) for a uniform in  $\mathbb{Z}_q^n$ , *b* uniform in  $\mathbb{Z}_q^n$ .

**LWE.** Let  $s \in \mathbb{Z}_q^n$  be drawn uniformly at random. Given access to either  $O_{\$}$  or  $O_{\$}$ , distinguish between the two.

uniformly at random, and  $e \in \mathbb{Z}_q^m$  drawn according to  $\chi$ .

- Oracle O<sub>s</sub>: returns ( $a, a \cdot s + e$ ) for a uniform in  $\mathbb{Z}_a^n$ , e drawn from  $\chi$ .
- Typically,  $\chi$  is a discrete Gaussian distribution with std deviation  $\alpha q$ .

**LWE (bounded samples).** Let  $A \in \mathbb{Z}_q^{m \times n}$  and  $b, s \in \mathbb{Z}_q^n$  be drawn Distinguish between (A, As + e), and (A, b).



**LWE (decisional).** Let  $s \in \mathbb{Z}_q^n$  be drawn uniformly at random.

**LWE (search).** Let  $s \in \mathbb{Z}_q^n$  be drawn uniformly at random. Given access to either  $O_s$ , find s.

**Proposition 1:** the two problems are equivalent up to polynomial reductions ("hybrid" technique).

**Proposition 2:** given an efficient algorithm that solves SIS with parameters n, m, q,  $\beta$ , there is an efficient algorithm that solves LWE with the same parameters, assuming (roughly)  $\alpha\beta \ll 1$ .

### Search and Decision variants

Given access to either  $O_{s}$  or  $O_{s}$ , distinguish between the two.



# Secret-key encryption using LWE

Pick a secret s uniformly in  $\mathbb{Z}_{a}^{n}$ .

Secret key: s.

**Encrypt**: to encrypt one bit m: give  $(a, a \cdot s + m \lfloor q/2 \rfloor + e)$ .

to  $\lfloor q/2 \rfloor$  than to 0.

IND-CPA security sketch:  $(a, a \cdot s + e)$  is indistinguishable from uniform, hence so is  $(a, a \cdot s + m \lfloor q/2 \rfloor + e)$ .

- **Decrypt:** compute  $a \cdot s$  to retrieve  $m \lfloor q/2 \rfloor + e$ , output m = 1 iff closer



### A public sampler for LWE

To make previous scheme public-key, we'd like a public "sampler" for LWE. Should not require knowing the secret s.

#### Setup:

- Pick a secret s uniformly in  $\mathbb{Z}_{a}^{n}$ . - Publish *m* LWE( $q,n,\chi$ ) samples for large enough *m* (value TBD). That is, publish  $(A, A_{S}+e)$  for  $m \times n$  matrix A.

#### Now to get a fresh LWE sample:

- Pick x uniformly in  $\{0,1\}^n$ .
- Publish ( $^{t}xA$ ,  $^{t}x(As+e)$ ).

With the right parameters, this yields a distribution statistically close to LWE(q,n, $\chi$ '), where if  $\chi$  is Gaussian with variance  $\sigma^2$ ,  $\chi$ ' is Gaussian with variance  $m\sigma^2$ .

**Argument:** Leftover Hash Lemma. Example:  $m = 2n \log q$  suffices. *Remark:* recognize the Ajtai hash function from SIS.



## Public-key\* Regev encryption

Regev '05: Regev encryption. **Idea:** same as secret-key scheme, but with public sampler.

Pick a secret s uniformly in  $\mathbb{Z}_a^n$ , A uniformly in  $\mathbb{Z}_a^{m \times n}$ . Public key: (A, b = As + e). Secret key: s.

**Encrypt**: to encrypt one bit m: draw x in  $\{0,1\}^m$ , output:

**Decrypt:** upon receipt of ciphertext (c,d), output 0 if  $d-c \cdot s$  is closer to 0 than to  $\lfloor q/2 \rfloor$ , 1 otherwise.

**Proof argument.** Step 1: public key is indistinguishable from uniform. Step 2: assuming uniform public key, ciphertexts are statistically close to uniform.

\*malleability  $\rightarrow$  not IND-CCA.

Can be seen as generic SK→PK transform w/ homomorphism!

```
(^{t}xA, ^{t}xb + m[q/2]).
```





# Questions

- Is decryption of fresh ciphertexts correct?
- What are the homomorphic properties of the scheme?
- Under what condition does decryption remain correct?



### Magic trick 1: multiplicative homomorphism

An encryption of one bit *m* is essentially (up to leftover hash lemma):  $Enc(m) = (a, a \cdot s + m \lfloor q/2 \rfloor + e) = (a, b).$ 

Let c = (a,b) be the ciphertext, and s' = (-s,1), decryption is essentially:  $c \cdot s' = m [q/2] + e$ 

Given two ciphertexts c and c', define:\*  $mult(c,c') = \lfloor 2/q \ c \otimes c' \rfloor$ 

To decrypt, compute:  $mult(c,c')\cdot(s'\otimes s') \approx 2/q \ (c\otimes c')\cdot(s'\otimes s')$  $= 2/q (c \cdot s')(c' \cdot s')$ ≈ q/2 *mm*' + *m*e' + *m*'e + 2/q ee' = q/2 *mm*' + e".

\*Notation:  $(x_1,...,x_m) \otimes (y_1,...,y_n) = (x_1y_1,...,x_1y_n, x_2y_1,...,x_2y_n, ..., x_my_1,...,x_my_n).$ 



#### Full homomorphism?

#### Additive homomorphism:

add( Decrypted with s': add(c c').s' =

#### Multiplicative homomorphism: mult(c,c)Decrypted with $s'' = s' \otimes s'$ : $mult(c,c') \cdot s''$

But ciphertext size increases quadratically, cannot really go on...

- add(c,c') = c + c'
- $add(c,c') \cdot s' = (m+m') q/2 + noise.$

- $mult(c,c') = \lfloor 2/q \ c \otimes c' \rfloor$
- $mult(c,c') \cdot s'' = mm' q/2 + noise.$



### Magic trick 1 (part 2): relinearization via key switching

Sample fresh secret key t.

"Encrypt" every sisies with t: let (a<sub>ii</sub>,b<sub>ii</sub>) be such that

**Idea:** to decrypt mult(c,c'), use  $b_{ij} - a_{ij} \cdot t$  in place of  $s_i s_j$ :  $mult(c,c')\cdot(s'\otimes s') = mult(c,c')\cdot(s_is_i)_{1 \le i,j \le n}$  $\approx$  mult(c,c')·(b<sub>ii</sub> - a<sub>ii</sub>·t)<sub>1≤i,j≤n</sub> = mult(c,c')·(b - At) = mult(c,c')·((b|A)(1,-t))  $= ((b|A)^{T} mult(c,c')) \cdot (1,-t)$ 

 $\Rightarrow$  redefine mult'(c,c') = (b|A)<sup>T</sup>mult(c,c').  $\Rightarrow$  this gives encryption of mm' under key t' = (1, -t).

- $b_{ij} = a_{ij} \cdot t + s_i s_j + noise \approx a_{ij} \cdot t + s_i s_j$  $\Rightarrow$  **S**<sub>i</sub>**S**<sub>i</sub>  $\approx$  **b**<sub>ii</sub> - **a**<sub>ii</sub>  $\cdot$  **t** 
  - where b=vector with entries ( $b_{ii}$ ), A=matrix with rows  $(a_{ii})$





### Are we fully homomorphic yet?

Encrypt  $(s_is_i)_{1 \le i,j \le n}$  with secret t = s. Add (b|A) to public key.

# **Additive homomorphism:**

# **Multiplicative homomorphism:**

Size of ciphertext is unchanged, everything decrypts under s.

But the noise increases with every operation. Correctness is lost if the noise exceeds q/2.

- add(c,c') = c + c'
- $mult(c,c') = 2/q (b|A)^{T}(c \otimes c')$



# Somewhat Homomorphic Encryption

Right now: only limitation is noise increase.

What we have is:

Somewhat Homomorphic Encryption.

∀ circuit C, ∃ FHE scheme powerful enough to compute C.

How?

Sketch: for given C, can upper-bound max noise at the output.  $\rightarrow$  Pick initial noise of fresh ciphertexts small enough that C is guaranteed to compute correctly.

The deeper C is (especially multiplicative depth), the smaller the noiseto-modulus ration, & the more expensive every FHE operation...



# Fully Homomorphic Encryption

Somewhat Homomorphic Encryption (SWHE).

∀ circuit C, ∃ FHE scheme that can compute C.

The dream:

**Fully** Homomorphic Encryption (FHE).

∃ **FHE scheme**, ∀ **circuit C**, FHE can compute C.

 $\rightarrow$  Fixed cost for FHE regardless of C.  $\rightarrow$  Unbounded computation, without need to know C in advance.



# "Bootstrapping" SWHE into FHE

#### Groundbreaking idea by Craig Gentry (2009). Add to public key: **K' = Enc**<sub>FHE</sub>(**K**<sub>FHE</sub>) ["circular security"]



high-noise ciphertext, want to reduce noise

low-noise ciphertext = fresh ciphertext <u>of c</u>

fixed-noise ciphertext ("low" noise) noise = noise generated by decryption circuit of FHE = fixed noise

SWFHE that can correctly compute its own decryption circuit + at least 1 operation  $\Rightarrow$  FHE.







## Going back to the computation model







# Models of computation

#### **Algorithms**



In theory: Turing machines.

Usually **RAM** machines.





Pure circuits: no notion of **memory**.





#### **Algorithms (with RAM)**



#### FHE with RAM function: https://eprint.iacr.org/2022/1703

Conversely, ORAM w/ O(1) communication overhead via FHE: https://eprint.iacr.org/2019/736

\*except when combined with ORAM (in a non-trivial way).

# **ORAM vs FHE/MPC/ZK**

#### Circuits

Fully Homorphic Encryption\*

**Multi-Party Computation\*** 

zk-SNARKS

Neural networks

No notion of "memory".\*



# The "strange" FHE computer

Some basic implications of computing in the circuit model...

No proper "if"/no proper branching.

#### No notion of memory.

Everything potentially computed on is a circuit input. No notion of pointer.

Always performs worst-case complexity.

See e.g. https://github.com/CEA-LIST/Cingulata



# Main FHE flavors

- **BFV, BGV**:
  - Large plaintext domain.
  - Heavy SIMD //-ism => competitive amortized performances.
  - Some support for non linear ops (beyond polynomial approx.).
  - No efficient bootstrapping.
  - Multiplicative depth dependency.
  - Multikey and threshold variants.
- CKKS:
  - Approximate computations (no message scaling).
  - Large plaintext domain.
  - Heavy SIMD //-ism => competitive amortized performances. No support for non linear ops (beyond poly. Approx).

  - No efficient bootstrapping.
  - Multiplicative depth dependency.
  - Weaker than BFV or BGV with respect to passive attackers.
  - Multikey and threshold variants.
- **TFHE** (aka CGGI):
  - Efficient bootstrapping.
  - Functionnal bootstrapping => easy non linear ops.
  - Multiplicative-depth independance. \_\_\_\_
  - Small plaintext domain (32 values max).
  - No batching.
  - Multikey and threshold variants are WIP.

Slide content by Renaud Sirdey (CEA). Some sample performance for TFHE on ML tasks: https://www.zama.ai/post/making-fhe-faster-for-ml-beating-our-previous-paper-benchmarks-with-concrete-ml







# More magic tricks

- Hide to the server what circuit is computed. Use universal circuit. Then encode desired circuit as data (FHE ciphertexts).
- Hide to the client what circuit was computed. Simplest way: noise flooding.
- Reduce client  $\rightarrow$  server ciphertext expansion to nothing! Use *transciphering*: at setup, server receives K = Enc<sub>FHE</sub>(AES-key).\* Then client can send all ciphertexts in the form c = AES-encrypt(m). Server computes Enc<sub>FHE</sub>(c), then decrypts *within* FHE using K.  $\Rightarrow$  Server gets Enc<sub>FHE</sub>(m).

\*Best realized with specialized symmetric encryption schemes (not AES).





