

# DESIGN AND IMPLEMENTATION OF LATTICE-BASED CRYPTOGRAPHY

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École Normale Supérieure & Université du Luxembourg  
Thèse CIFRE effectuée au sein de CryptoExperts

Soutenance de thèse de doctorat – 30 juin 2014

# Outline

1. Introduction
2. Fully Homomorphic Encryption
3. Cryptographic Multilinear Maps
4. Conclusion

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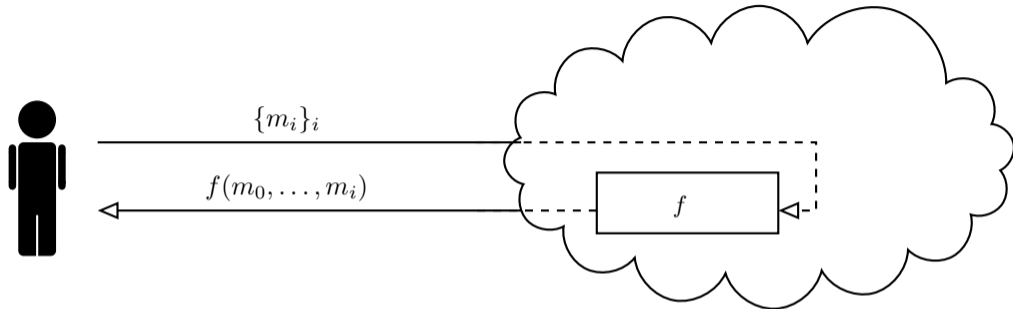
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# Cloud Computing

Program or application on  
**connected server(s)**  
rather than locally

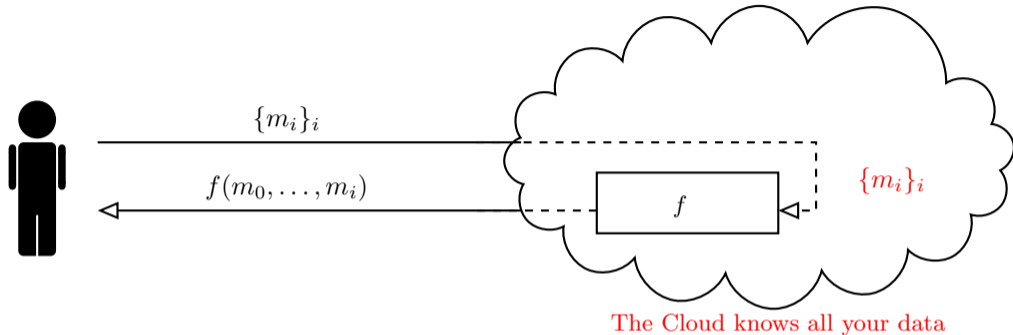


# Modelization



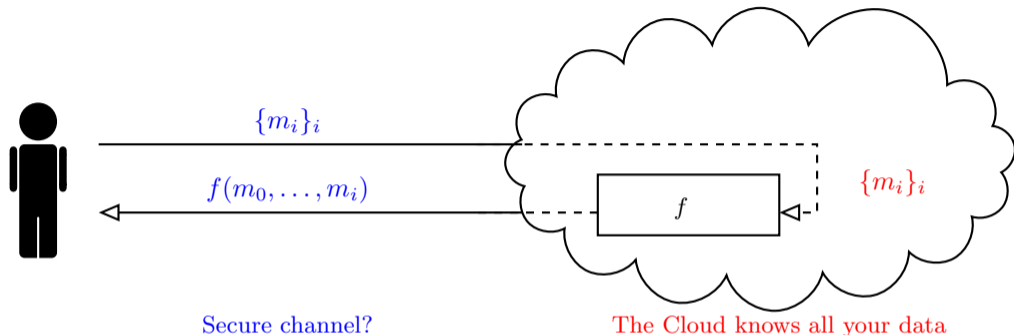
$f$  is the service provided by the Cloud on your data  $m_i$

# Confidentiality of Your Data



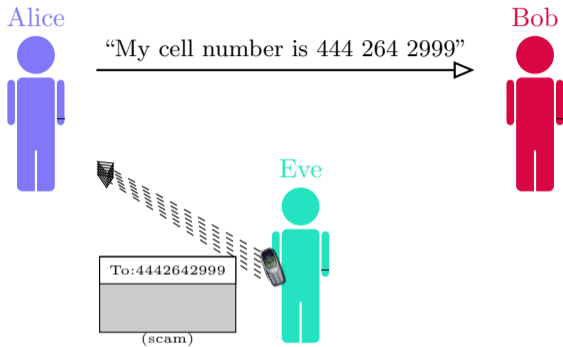
1. Confidentiality of your data in the Cloud?

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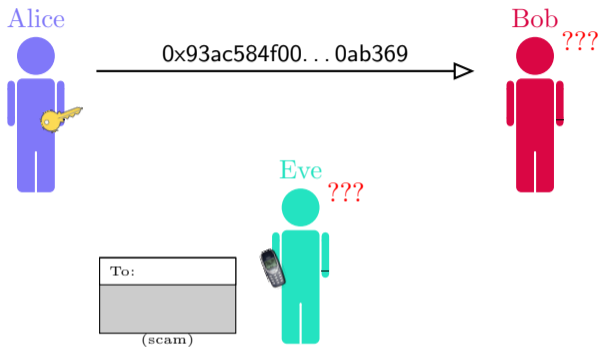
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# Encryption

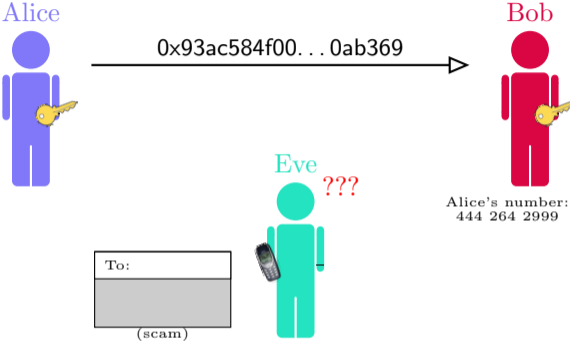




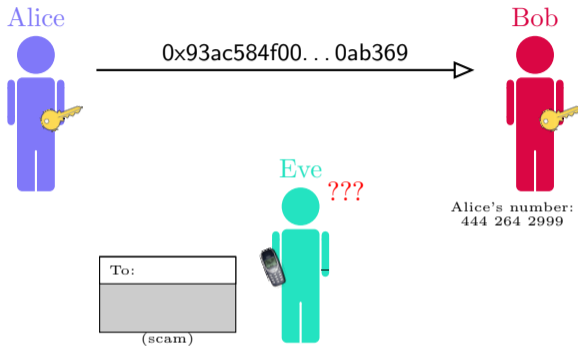
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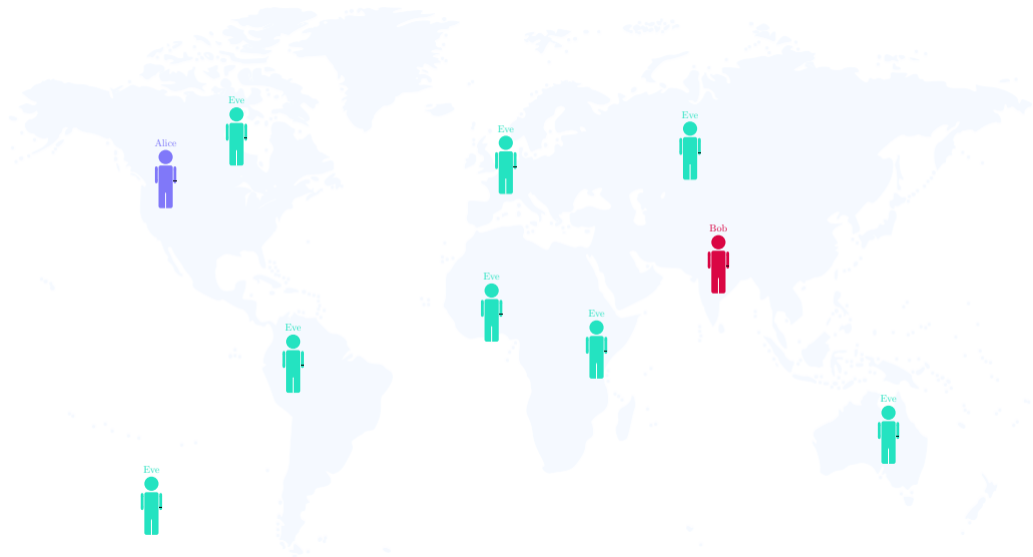
# Encryption



But...

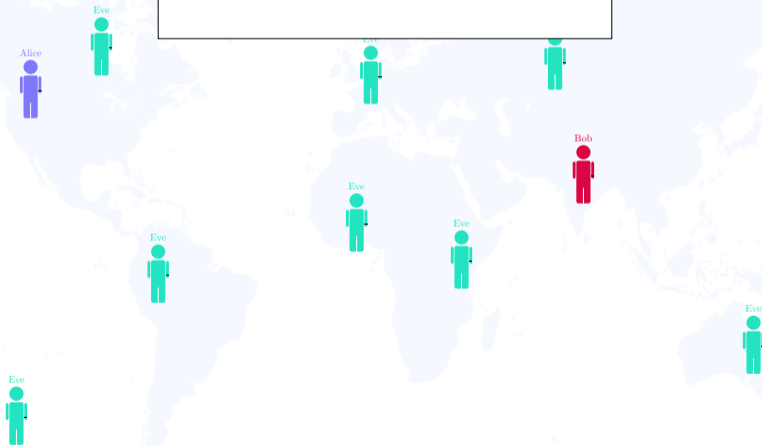
They need to share a secret key 🗝️!

# Key Exchange (Diffie-Hellman)

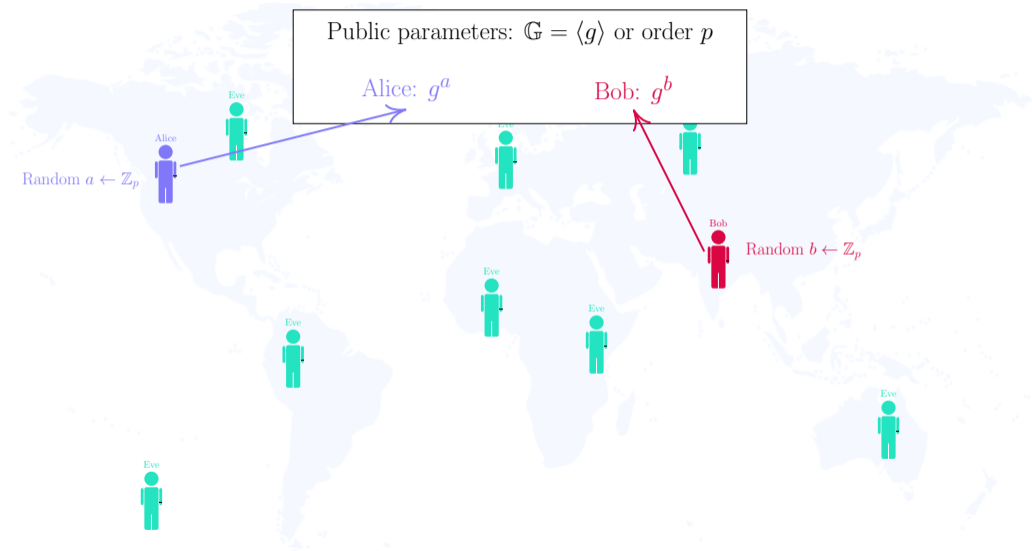


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Public parameters:  $\mathbb{G} = \langle g \rangle$  or order  $p$



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Alice:  $g^a$

Bob:  $g^b$

Random  $a \leftarrow \mathbb{Z}_p$



=  $(g^b)^a = g^{ab}$

Random  $b \leftarrow \mathbb{Z}_p$

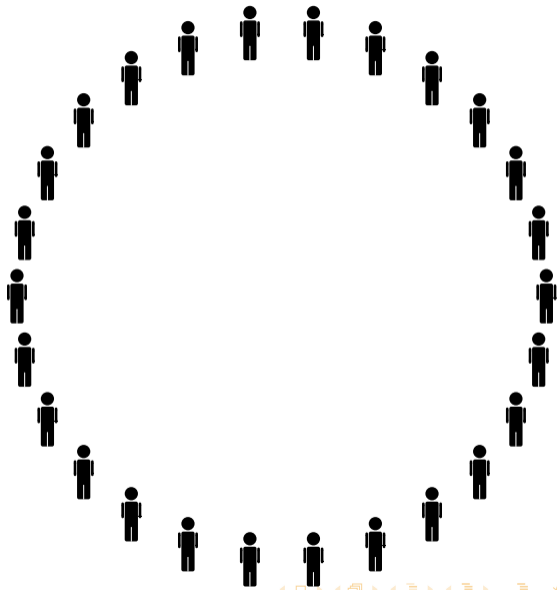


=  $(g^a)^b = g^{ab}$



# Contribution #1: [CLT-C13]

- ▶ New construction of **MULTILINEAR MAPS**
  - ▶ Extension of Bilinear Maps
  
- ▶ **First** implementations of:
  - ▶ Multilinear Maps
  - ▶ A 26-parties one-round key exchange





# Contribution #1: [CLT-C13]

Only one other construction 😊!

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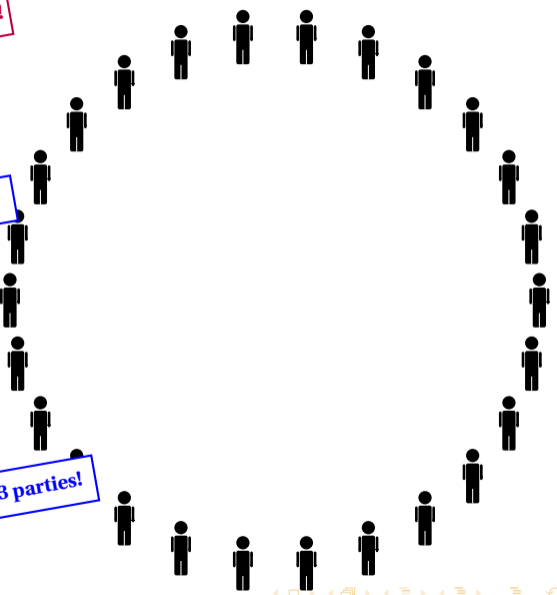
- ▶ Extension of Bilinear Maps

Lots of exciting applications!!

- ▶ **First** implementations of:

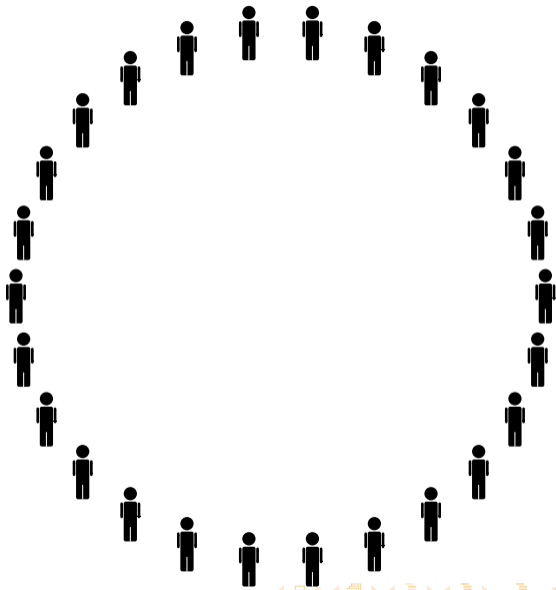
- ▶ Multilinear Maps
- ▶ **A 26-parties one-round key exchange**

Only implemented for 2 and 3 parties!



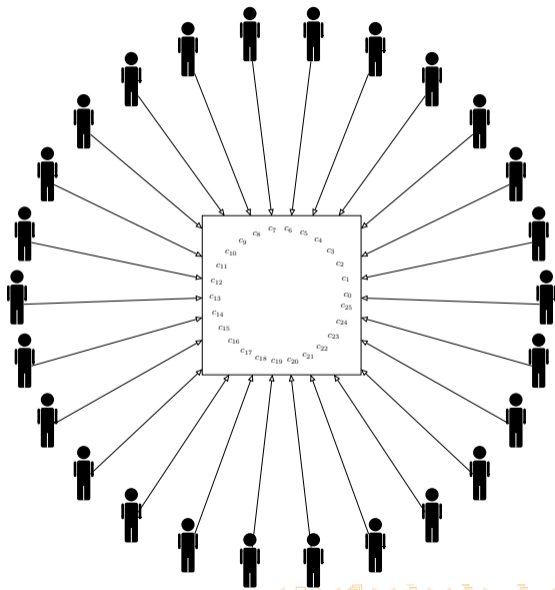
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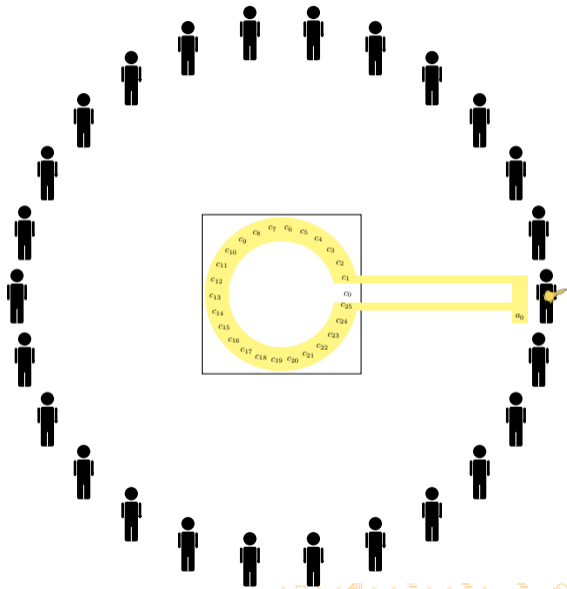
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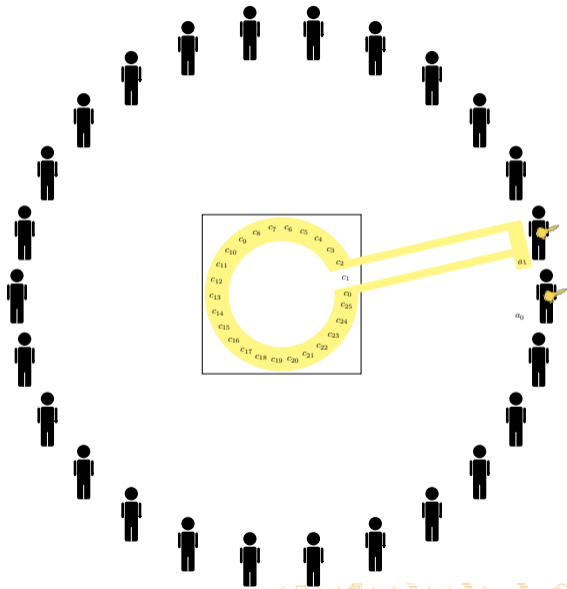
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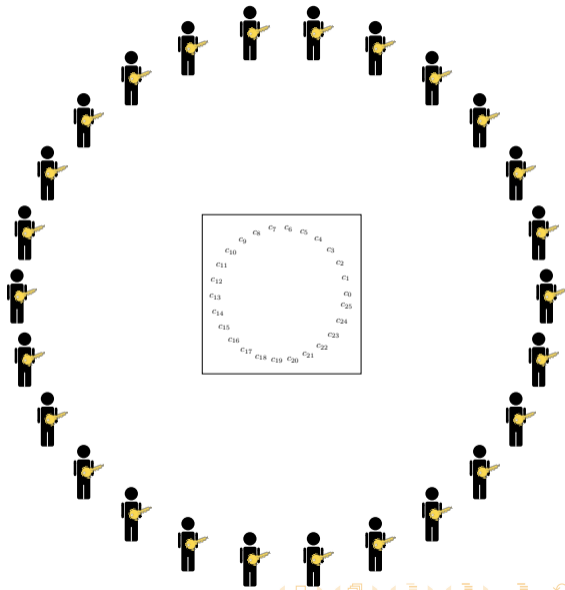
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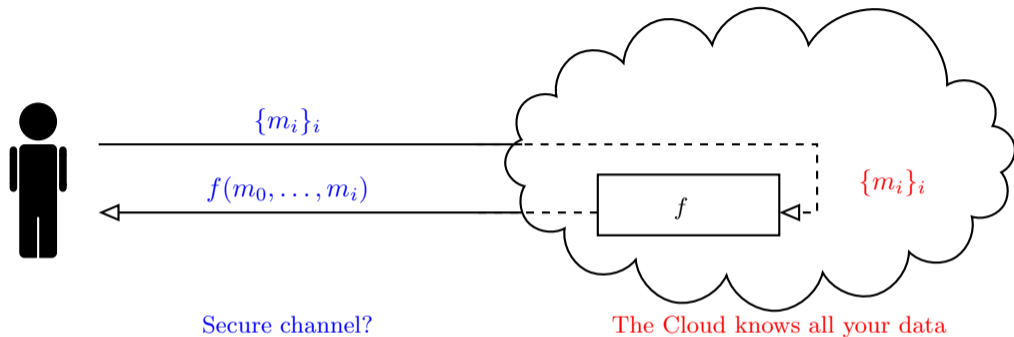


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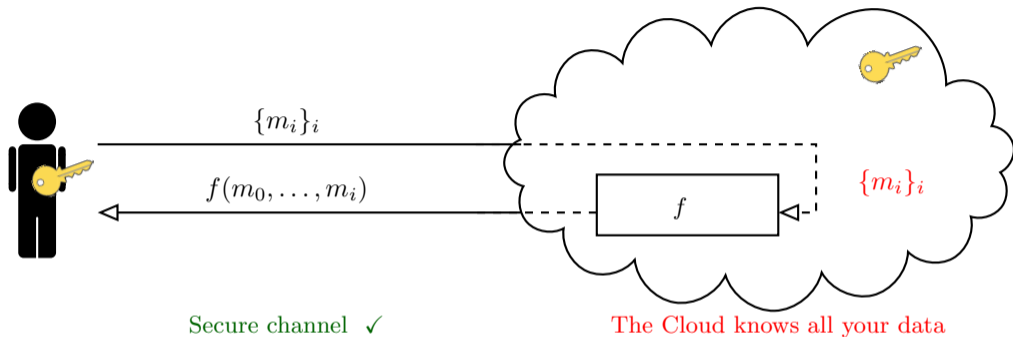


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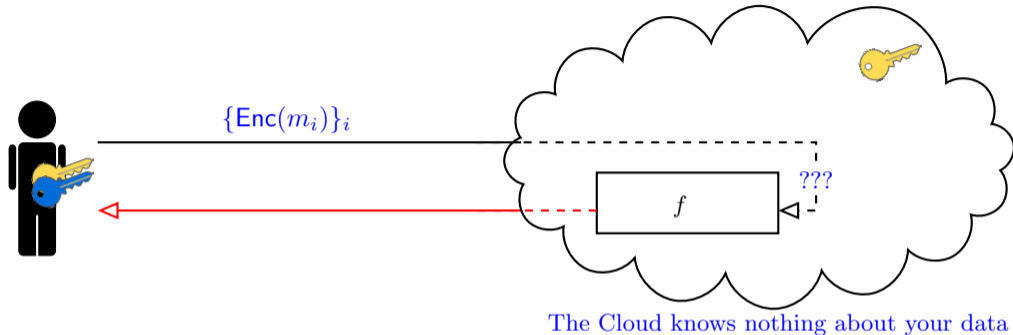


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This is the current situation

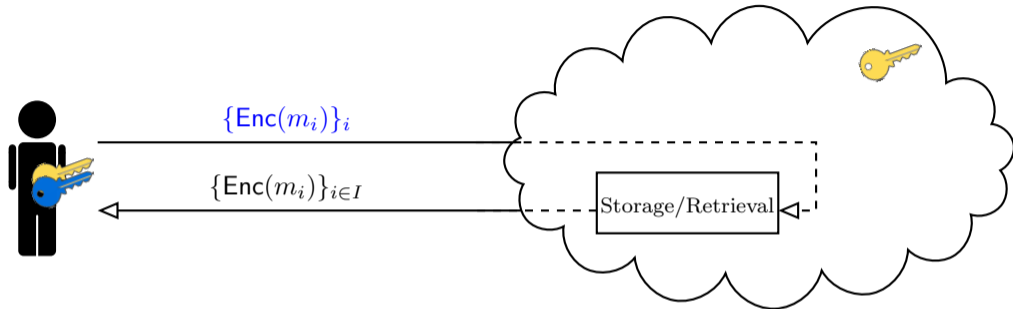


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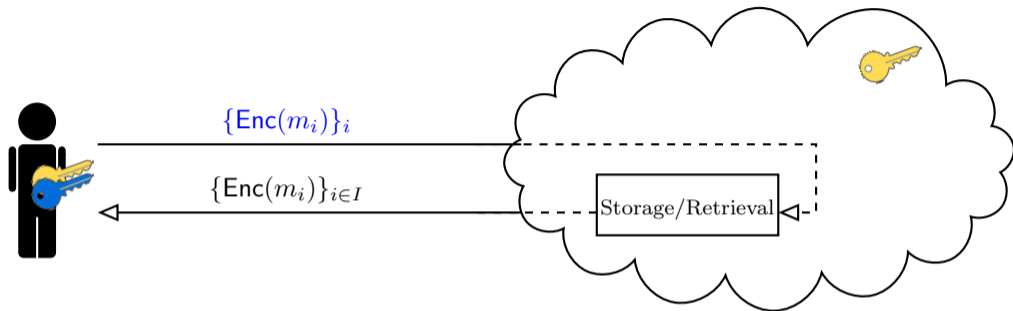


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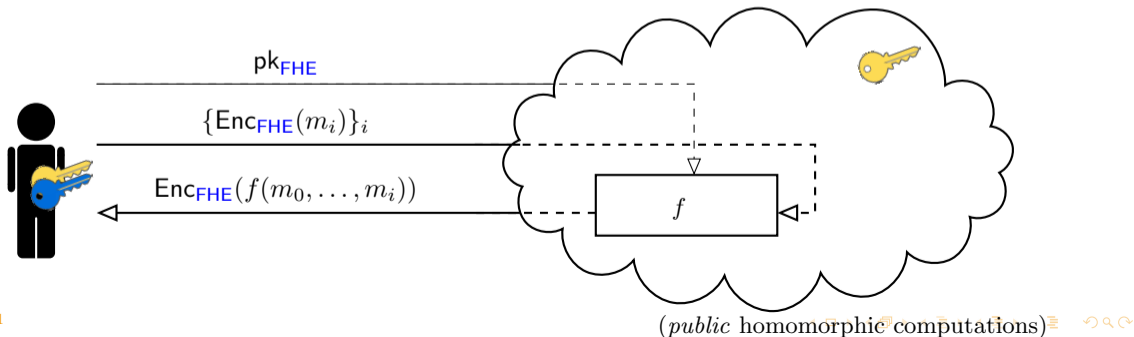
- ▶ For confidentiality, we use **encryption**
  - ▶ Now... limited to **storage/retrieval**
  - ▶ This is not even what Dropbox/Google Drive/Microsoft OneDrive/Amazon S2/iCloud Drive/etc. are doing
    - ▶ Allow access control and sharing, interaction with whole app universe, etc.

# Fully Homomorphic Encryption

[RivestAdlemanDertouzos78]

Going beyond the storage/retrieval of encrypted data by permitting **encrypted data to be operated on** for interesting operations, **in a public fashion?**

- ▶ Enable **unlimited computation on encrypted data**  
(w.l.o.g.  $m_i$ 's are bits and  $f$  Boolean circuit)



## Contribution #2

- ▶ Theoretical improvements of the DGHV scheme
  - ▶ Packing several plaintexts in one ciphertext [CCKLLTY-EC13]
  - ▶ Adaptation of a technique to manage noise growth [CLT-PKC14]
    - ▶ Exponential improvement!
- ▶ Fine analysis of the constraints to select concrete parameters
- ▶ Implementations of the schemes and benchmark on  $f = \text{AES}$

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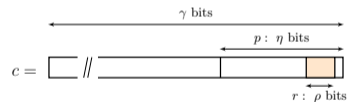
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where  $q$  large random,  $r$  small random



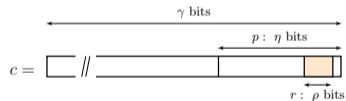


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- ▶ Decryption of  $c$ :

$$m = (c \bmod p) \bmod 2$$

# Homomorphic Properties

- ▶ How to Add and Multiply Encrypted Bits:

- ▶ Add/Mult two near-multiples of  $p$  gives a near-multiple of  $p$

- ▶  $c_1 = q_1 \cdot p + 2 \cdot r_1 + m_1, \quad c_2 = q_2 \cdot p + 2 \cdot r_2 + m_2$

- ▶  $c_1 + c_2 = p \cdot (q_1 + q_2) + \underbrace{2 \cdot (r_1 + r_2) + m_1 + m_2}_{\text{mod } 2 \rightarrow m_1 \text{ XOR } m_2}$

- ▶  $c_1 \cdot c_2 = p \cdot (c_2 q_1 + c_1 q_2 - q_1 q_2) + \underbrace{2 \cdot (2r_1 r_2 + r_2 m_1 + r_1 m_2) + m_1 \cdot m_2}_{\text{mod } 2 \rightarrow m_1 \text{ AND } m_2}$

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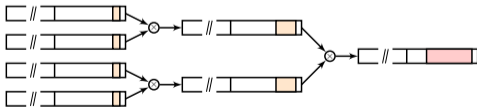
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Correctness for multiplicative depth of  $L$ :  $\log_2 p = \eta \approx 2^L \cdot (\rho + 1)$

# Our Contributions

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  - ▶ Proved equivalent to the computational AGCD problem of [vDGHV10] in [CLT-PKC14]
  - ▶ Proofs are simpler!

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4. **Implementations**
  - ▶ Benchmark on AES circuit [CCKLLTY-EC13,CLT-PKC14]

# Semantic Security of the Scheme

Consider

$$D = \{q \cdot p + r : q \leftarrow [0, q_0), r \leftarrow [0, 2^p)\}$$

Security of the scheme based on:

## (Error-Free) Decisional Approximate-GCD

Given  $x_0 = q_0 \cdot p$  and polynomially many  $x_i \in D$ , decide whether  $z$  is uniformly generated in  $[0, x_0)$  or in  $D$



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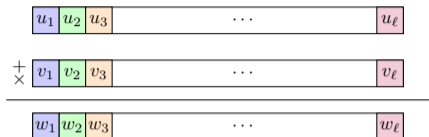
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- ▶ Therefore ciphertext of  $m$  indistinguishable from uniform

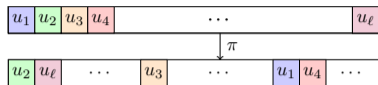
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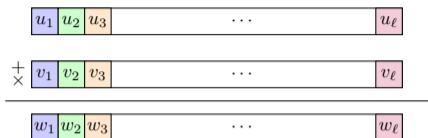
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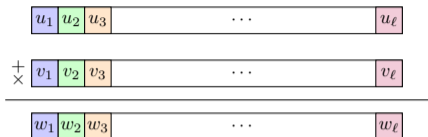
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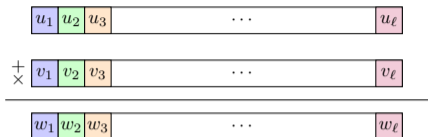
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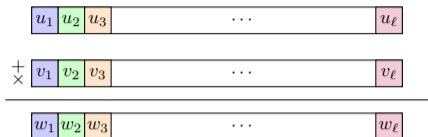


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$$\begin{aligned} \text{▶ } c \bmod p &= 2r + m & ; & & c \bmod q_0 &= & \underbrace{q}_{\text{uniform in } [0, q_0)} \cdot p + 2r + m \bmod q_0 \end{aligned}$$

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- ▶ We can write

$$c = \text{CRT}_{q_0, p}(q, 2r + m)$$



## Batching (2): Extend the Chinese Remainder Theorem

$$c = \text{CRT}_{q_0, p}(\mathcal{d}, 2r + m)$$

- ▶ Generalization to several slots is easy!
- ▶ Ciphertext of  $\vec{m} = (m_1, \dots, m_\ell) \in \{0, 1\}^\ell$ :

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- ▶ Thanks to the structure of the CRT:
  - ▶ **Addition:** the addition is performed modulo each  $p_i$  similarly to DGHV
  - ▶ **Multiplication:** the multiplication is performed modulo each  $p_i$  similarly to DGHV

# Security of the Batch Scheme BDGHV

## (Error-Free) Decisional Approximate-GCD

Given  $x_0 = q_0 \cdot p$  and polynomially many  $x_i \in D = \{q \cdot p + r : q \leftarrow [0, q_0), r \leftarrow [0, 2^{\rho})\}$ ,  
decide whether  $z$  is uniformly generated in  $[0, x_0)$  or in  $D$

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Sketch:

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- ▶ With proba  $1/\ell$ , you can place  $p$  at the position  $j_0$  (generate the  $\ell - 1$  other  $p_i$ 's yourself), and you use the challenge  $z$  for this slot

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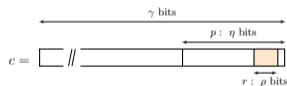
Security based on same problem as before!

# Advantages of the Batch Variant

- ▶ Parallelization:



- ▶ Use the fact that  $q \gg p$  to pack elements



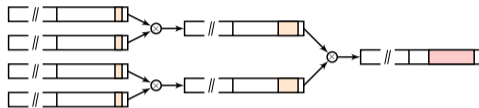
- ▶ (Also asymptotic reduction of overhead per gate with permutations)

[CCKLLTY13]

With **essentially same complexity costs** and **same security**, operations over  $\ell \geq 1$  bits!

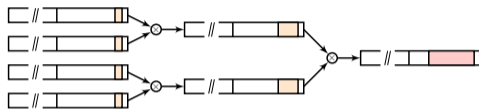
# Mitigating Noise Growth: Scale-Invariance

- ▶ Even with batch variant, exponential growth of the noise

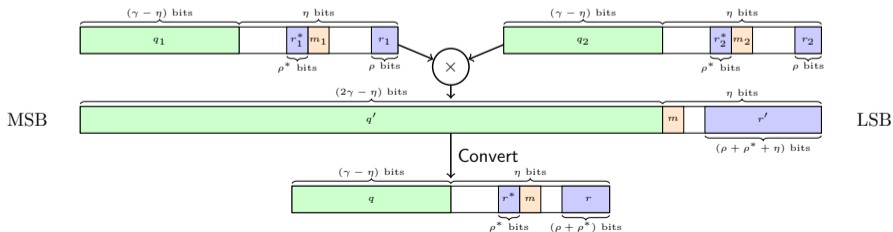


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- ▶ New technique introduced by Brakerski: **scale-invariance**
  - ▶ Instead of encrypting in the LSB of  $c \bmod p$ , encrypt in the MSB
  - ▶ Adapted for DGHV [CLT-PKC14]



# Contributions to Scale-Invariance

- ▶ Design of a new scheme based on Brakerski's idea
- ▶ Quantification of the noise growth:

## Lemma (simplified) [CLT-PKC14]

Let  $c_1$  and  $c_2$  be ciphertexts of  $m_1$  and  $m_2$  with noises  $\leq 2^\rho$ . Then

$$c_3 = \text{Convert}(c_1 \cdot c_2)$$

is a ciphertext of  $m_1$  AND  $m_2$  with noise  $\leq 2^{\rho+\theta}$  for a fixed  $\theta = \mathcal{O}(\log_2 \lambda)$

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- ▶ Noise growth is **linear in multiplicative depth**
  - ▶ Correctness for multiplicative depth of  $L$ :

$$\log_2 p = \eta \approx \rho + \theta \cdot L$$

instead of  $\approx 2^L \cdot \rho$  of the previous scheme

Exponential improvement!



# Fully Homomorphic Encryption Scheme

- ▶ Only way to get **fully** homomorphic encryption: select parameters to evaluate decryption circuit

Bootstrapping

- ▶ If  $c = \text{Enc}(m)$ , run **homomorphically Dec**:

$$c_{\text{result}} = \text{Enc}(\text{Dec}(c)) = \text{Enc}(\text{Dec}(\text{Enc}(m))) = \text{Enc}(m)$$

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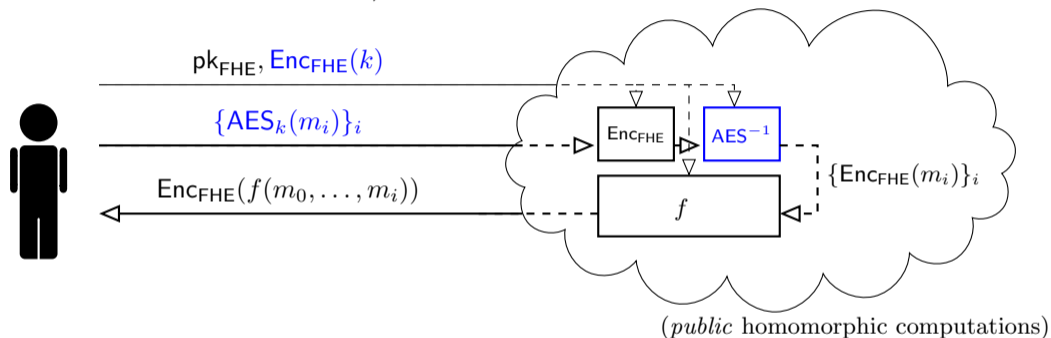
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- ▶ Adaptation to batch scheme BDGHV in [CCKLLTY-EC13] and to **scale-invariant** scheme in [CLT-PKC14]
  - ▶ for scale-invariant scheme:  
linear noise growth  $\Rightarrow$  bootstrapping **not** required for many levels

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- ▶ Benchmark on a nontrivial, not astronomical circuit: AES



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- ▶ Lattice-Based Scheme [GHS12]

$\lambda$	Ciphertext size	$\ell$	AES	Relative time
80	0.3 MB	720	65 h	300 s

# Future Work

- ▶ Assessment of advantages/disadvantages of existing schemes
- ▶ Optimizing cloud communications
- ▶ Prototypes of real-world applications?
- ▶ FHE outside “noisy” framework?



# Outline

1. Introduction
2. Fully Homomorphic Encryption
3. Cryptographic Multilinear Maps
4. Conclusion

# Starting Point: DDH and Bilinear Maps

- ▶ “The **DDH** assumption is a gold mine” (Boneh, 98)
  - ▶ Given  $(g^a, g^b, z)$  hard to decide if  $z = g^{ab}$  or random
  - ▶ We “hide” values  $a_i$ ’s in  $g^{a_i}$ 
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  - ▶ Lots of new capabilities
- ▶ Can we do better **multilinear maps**?
  - ▶ i.e. give possibility to compute polynomials **up to degree  $k$**  in the exponents, but no more?
  - ▶ Considered by [BS03]: very fruitful, but unlikely to be constructed similarly to bilinear maps

# MMaps vs. HE

- ▶ Wanted: add and multiply (bounded # times) encodings...  $\Rightarrow$  looks like HE

Multilinear Maps	Homomorphic Encryption
Encoding $e_a = g^a$	Encrypting $c_a = \text{Enc}(a)$
Computing low-degree polynomials of the $e_a$ 's is easy	Computing low-degree polynomials of the $c_a$ 's is easy
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Can we modify the existing HE schemes to get MMaps?

- ▶ First construction of approximate MMaps: Garg, Gentry, Halevi in 2013

# Our Contributions [CLT-C13]

## 1. Start from (B)DGHV and transform it into approximate MMaps!

- ▶ Only 1 other known construction of MMaps: the initial one
- ▶ All  $(\kappa + 1)$ -degree functions seem hard
  - ▶ Some attacks in the original scheme have no equivalent here

## 2. Optimizations and (first!) implementation

- ▶ Open-Source implementation of multilinear maps (Github)
- ▶ Implementation of a 26-partite Diffie-Hellman Key Exchange



# MMaps from DGHV?

Ciphertext of  $m \in \{0, \dots, g-1\}$  using DGHV:

$$c = \text{CRT}_{q_0, p}(q, g \cdot r + m)$$

- ▶ **Problem:**  $q$  was used as a **mask** to hide everything
  - ▶ But we need a deterministic extraction procedure to construct protocols
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- ▶ Let us consider Batch DGHV instead!

# From Batch DGHV to MMaps (1)

Ciphertext of  $\vec{m} \in \{0, \dots, g-1\}^\ell$  using BDGHV:

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  - ▶ Use a secret mask  $z$  with  $x'_i = x_i/z!$



## From Batch DGHV to MMaps (2)

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- ▶ Compute  $\omega = c \cdot p_{zt} \bmod x_0$

$$\text{isZero}(\omega) = \begin{cases} 1 & \text{if } \omega \ll x_0 \\ 0 & \text{otherwise} \end{cases}$$

# Zero Test

$$c = \frac{\text{CRT}_{p_1, \dots, p_\ell}(g \cdot r_1 + m_1, \dots, g \cdot r_\ell + m_\ell)}{z} = \sum_{i \in S} x'_i$$

and

$$p_{zt} = \sum_{i=1}^{\ell} h_i \cdot (z^k \cdot g^{-1} \bmod p_i) \cdot \prod_{j \neq i} p_j$$

- ▶ If  $c$  encodes  $\vec{0}$ , we have

$$c \cdot p_{zt} \bmod x_0 = \sum_{i=1}^{\ell} h_i r_i \cdot \prod_{j \neq i} p_j \ll x_0 = \prod_{i=1, \dots, n} p_i$$

- ▶ If  $c$  encodes  $\vec{m} \neq \vec{0}$ , we have

$$c \cdot p_{zt} \bmod x_0 = \sum_{i=1}^{\ell} h_i (r_i + m_i \cdot g^{-1} \bmod p_i) \cdot \prod_{j \neq i} p_j \approx x_0$$

# Zero Test

$$c = \frac{\text{CRT}_{p_1, \dots, p_\ell}(\mathbf{g}_1 \cdot r_1 + m_1, \dots, \mathbf{g}_\ell \cdot r_\ell + m_\ell)}{z} = \sum_{i \in S} x'_i$$

and

$$p_{zt} = \sum_{i=1}^{\ell} h_i \cdot (z^k \cdot g_i^{-1} \bmod p_i) \cdot \prod_{j \neq i} p_j$$

- ▶ If  $c$  encodes  $\vec{0}$ , we have

$$c \cdot p_{zt} \bmod x_0 = \sum_{i=1}^{\ell} h_i r_i \cdot \prod_{j \neq i} p_j \ll x_0 = \prod_{i=1, \dots, n} p_i$$

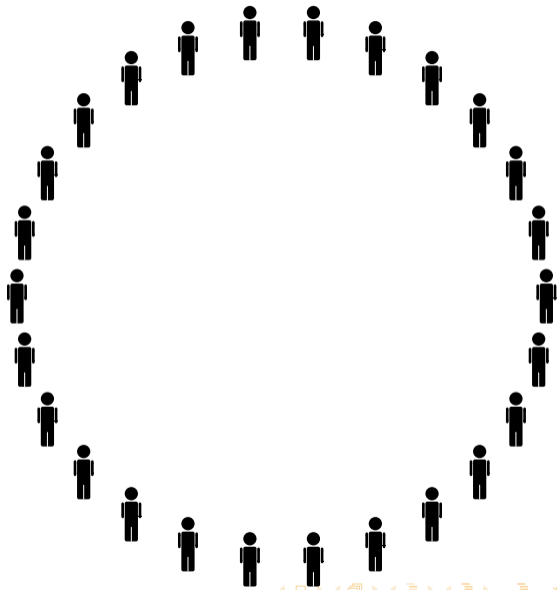
- ▶ If  $c$  encodes  $\vec{m} \neq \vec{0}$ , we have

Actually we need distinct  $g_i$ 's to avoid another attack

$$c \cdot p_{zt} \bmod x_0 = \sum_{i=1}^{\ell} h_i (r_i + m_i \cdot g_i^{-1} \bmod p_i) \cdot \prod_{j \neq i} p_j \approx x_0$$

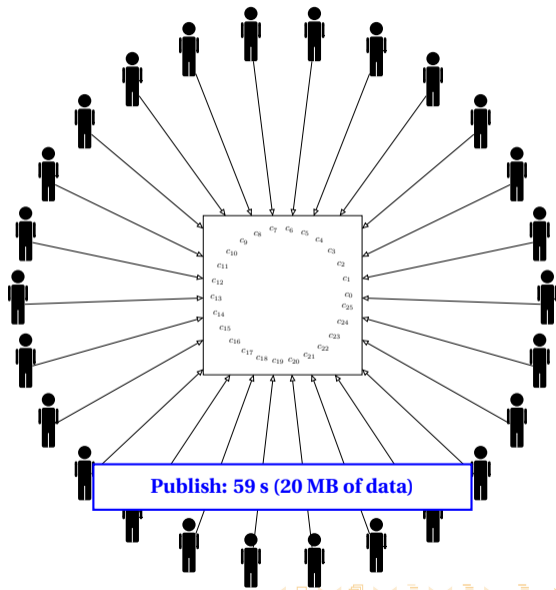
# Implementation: 26-partite Key Exchange

- ▶ Implementation of a 26-partite one-round Diffie-Hellman key exchange
- ▶ Public parameters of multilinear maps for  $\kappa = 25$  levels



# Implementation: 26-partite Key Exchange

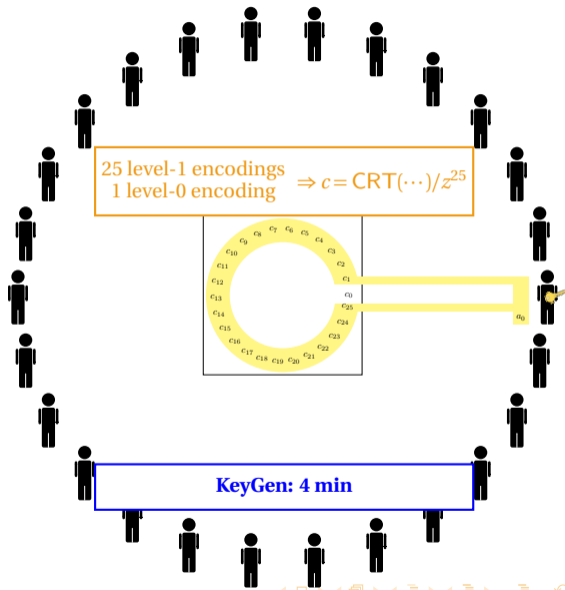
- ▶ Implementation of a 26-partite one-round Diffie-Hellman key exchange
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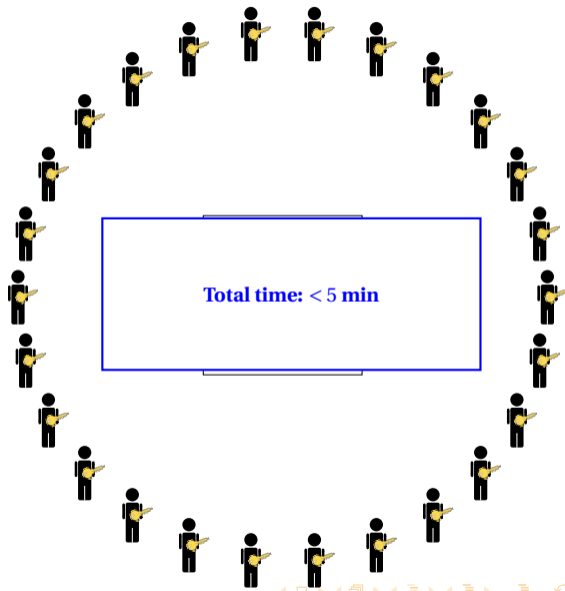
# Implementation: 26-partite Key Exchange

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# Implementation: 26-partite Key Exchange

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# Future Work

- ▶ Explosion of multilinear maps in cryptography (and of obfuscation, built on multilinear maps)
- ▶ Improve the practicality of multilinear maps
  - ▶ akin to what has been done for FHE, and beyond
- ▶ Applications with reasonable number of multilinearity level
- ▶ Cryptanalysis to build confidence in the multilinear maps proposals

# Outline

1. Introduction
2. Fully Homomorphic Encryption
3. Cryptographic Multilinear Maps
4. Conclusion

# Contributions to Fully Homomorphic Encryption



On the Minimal Number of Bootstrappings in Homomorphic Circuits.

L., Paillier

[WAHC 2013]



Batch Fully Homomorphic Encryption over the Integers.

Cheon, Coron, Kim, Lee, L., Tibouchi, Yun [EUROCRYPT 2013]



Scale-Invariant Fully Homomorphic Encryption over the Integers.

Coron, L., Tibouchi [PKC 2014]



A Comparison of the Homomorphic Encryption Schemes FV and YASHE.

L., Naehrig

[AFRICACRYPT 2014]



Implementation: <https://github.com/tlepoint/homomorphic-simon>

# Contributions to Multilinear Maps



Practical Multilinear Maps over the Integers.

Coron, L., Tibouchi

[CRYPTO 2013]



Implementation: <https://github.com/tlepoint/multimap>

# Other Areas

*Most efficient existing lattice-based signature scheme!*

## ▶ Lattice-Based Signature



Lattice Signatures and Bimodal Gaussians.

Ducas, Durmus, L., Lyubashevsky

[CRYPTO 2013]



Implementation: <http://bliss.di.ens.fr>

## ▶ White-Box Cryptography



Two Attacks on a White-Box AES Implementation.

L., Rivain, De Mulder, Roelse, Preneel

[SAC 2013]



White-Box Security Notions for Symmetric Encryption Schemes.

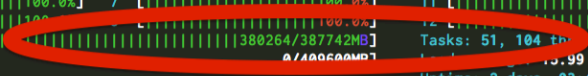
Delerablée, L., Paillier, Rivain

[SAC 2013]





```
1 [|||||100.0%] 5 [|||||98.7%] 9 [|||||100.0%] 13 [|||||100.0%]
2 [|||||100.0%] 6 [|||||99.4%] 10 [|||||100.0%] 14 [|||||100.0%]
3 [|||||100.0%] 7 [|||||100.0%] 11 [|||||100.0%] 15 [|||||100.0%]
4 [|||||100.0%] 12 [|||||100.0%] 16 [|||||100.0%]
Mem [|||||380264/387742MB] Tasks: 51, 104 thr: 254 kthr: 17 running
Swp [|||||0/409600MB] Uptime: 2 days, 03:49:23
```



NO RAM LEFT ON THE COMPUTER  
(generation of public parameters)

```
PID PPID CPU MEM VSZ RSS STATE CTIME TIME COMMAND
6130 20 0 363G 363G 1484 R 99.0 96.0 2h41:41 ./multimap24
6139 20 0 363G 363G 1484 R 99.0 96.0 2h44:50 ./multimap24
6134 20 0 363G 363G 1484 R 99.0 96.0 2h44:41 ./multimap24
6140 20 0 363G 363G 1484 R 99.0 96.0 2h40:32 ./multimap24
6131 20 0 20008 1784 1236 R 1.0 0.0 3:43.71 htop
6136 20 0 205M 8216 3856 S 0.0 0.0 0:53.39 /opt/dell/srvadmin/sbin/dsm_sa_datamgrd
6142 20 0 205M 8216 3856 S 0.0 0.0 0:33.73 /opt/dell/srvadmin/sbin/dsm_sa_datamgrd
6133 20 0 21600 1380 960 S 0.0 0.0 0:05.96 /usr/sbin/ntpd -p /var/run/ntpd.pid -g -u 106:114
6141 20 0 47704 4948 2180 S 0.0 0.0 3:14.83 /usr/sbin/snmpd -Lsd -Lf /dev/null -u snmp -g snmp -I -smux -p /var/run/snmpd
6132 20 0 8272 644 504 S 0.0 0.0 0:03.07 portmap
6138 20 0 130M 4632 2852 S 0.0 0.0 0:10.07 /opt/dell/srvadmin/sbin/dsm_sa_snmpd
```