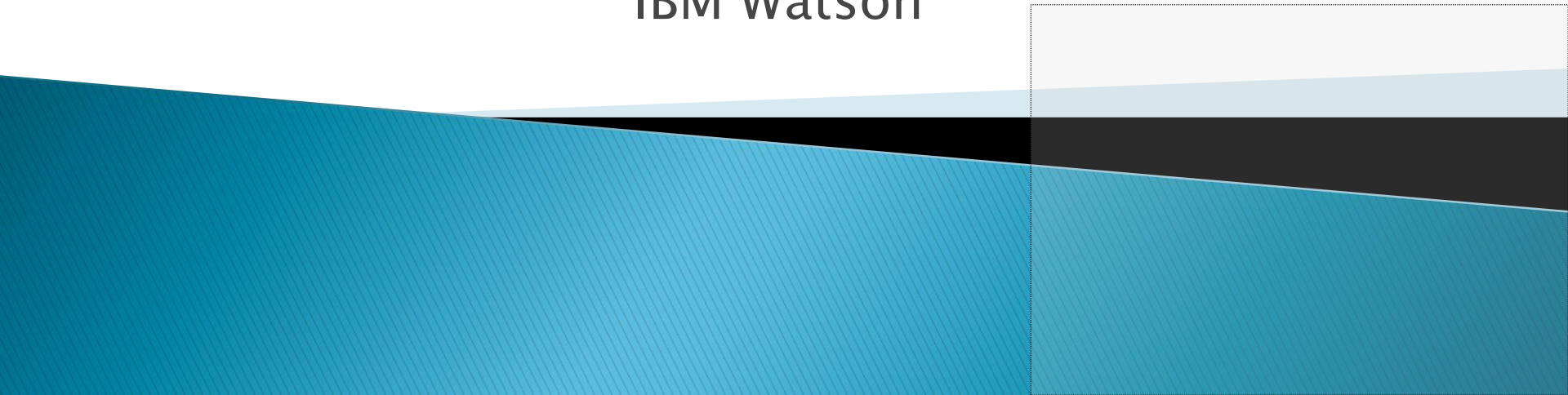




Fully Homomorphic Encryption

Craig Gentry
IBM Watson



Outline for Today



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- ▶ Optimizations of Somewhat Homomorphic Encryption (SWHE)
- ▶ Constructions of Fully Homomorphic Encryption (FHE)



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SWHE for Bounded *Depth* Circuits [BGV12]

And Better Management of Ciphertext
Noise...



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Review of [BV11b]: SWHE Based on LWE

»» Focusing on the “noise
problem”...

The LWE Problem

- ▶ Noisy Polly Cracker Version:
 - Let χ be an error distribution.
 - Distinguish these distributions:
 - Generate uniform $s \leftarrow Z_q^n$. For many i , generate $e_i \leftarrow \chi$ and a linear polynomial $f_i(x_1, \dots, x_n) = f_0 + f_1 x_1 + \dots + f_n x_n$ (from Z_q^{n+1}) such that $[f_i(s_1, \dots, s_n)]_q = e_i$.
 - For many i , generate and output a uniformly random linear polynomial $f_i(x_1, \dots, x_n)$ (from Z_q^{n+1}).

SWHE Based on LWE [BV11b]

- ▶ **Parameters**: q such that $\gcd(q, 2) = 1$.
- ▶ **KeyGen**: Secret = uniform $\mathbf{s} \in \mathbb{Z}_q^n$. Public key: linear polys $\{f_i(x_1, \dots, x_n)\}$ s.t. $[f_i(\mathbf{s})]_q = 2e_i$, $|e_i| \ll q$.
- ▶ **Encrypt**: Set $g(x_1, \dots, x_n)$ as a random subset sum of $\{f_i(x_1, \dots, x_n)\}$. Output $c(x_1, \dots, x_n) = m + g(x_1, \dots, x_n)$.
- ▶ **Decrypt**: $[c(\mathbf{s})]_q = m + s \text{ even}$. Reduce mod 2.
- ▶ **ADD and MULT**:
 - ▶ Output sum or product of ciphertext polynomials.
- ▶ **Relinearize / Key-Switch**

The Noise Problem

- ▶ **ADD:** $c(\mathbf{x}) = c_1(\mathbf{x}) + c_2(\mathbf{x})$.
 - Noise of $c(\mathbf{x})$ – namely, $[c(\mathbf{s})]_q$ – is sum of noises.
- ▶ **MULT:** $c(\mathbf{x}) = c_1(\mathbf{x}) \cdot c_2(\mathbf{x})$.
 - Noise $[c(\mathbf{s})]_q$ is product of noises.
 - Sort of... After MULT, there is “relinearization” step that adds a small amount to the noise.
- ▶ **Function F:** $c(\mathbf{x}) \approx F(c_1(\mathbf{x}), \dots, c_t(\mathbf{x}))$.
 - Noise $[c(\mathbf{s})]_q \approx f(c_1(\mathbf{s}), \dots, c_t(\mathbf{s}))$ – i.e., F applied to noises.
 - Rough approximation:
 - If F has degree d and fresh noises are bounded by B, $c(\mathbf{x})$ has noise B^d .
 - Noise magnitude increases exponentially with degree.

The Noise Problem Hurts Efficiency. Why?



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- ▶ SWHE ciphertexts must be large to let noise “room to grow”.
- ▶ “Noise” grows exponentially with degree. To successfully evaluate degree- d poly, noise $B \rightsquigarrow B^d$ without “wrapping”.
- ▶ So, coefficients of lattice vectors have $> d$ bits.
- ▶ For security, we need it to be hard to $B^{d-1} > 2^d$ -approximate lattice problems in 2^k time.
 - Requires lattice $\dim > d \cdot k$.
 - Total ciphertext length $> d^2 \cdot k$ bits.

SWHE for Bounded *Degree*

- ▶ Since total ciphertext length $\approx d^2 \cdot k$ bits, we have SWHE for bounded degree:
- ▶ SWHE for bounded degree: A family of schemes $E^{(d)}$, $d \in \mathbb{Z}$, that for security parameter k ,
 - $E^{(d)}$ can homomorphically evaluate functions of degree d .
 - KeyGen, Enc, Dec, ADD, MULT are all $\text{poly}(k, d)$.
 - Eval has complexity polynomial in k , d , and circuit size.

This is the best we can hope for when noise grows exponentially with degree.



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SWHE for Bounded *Depth...*

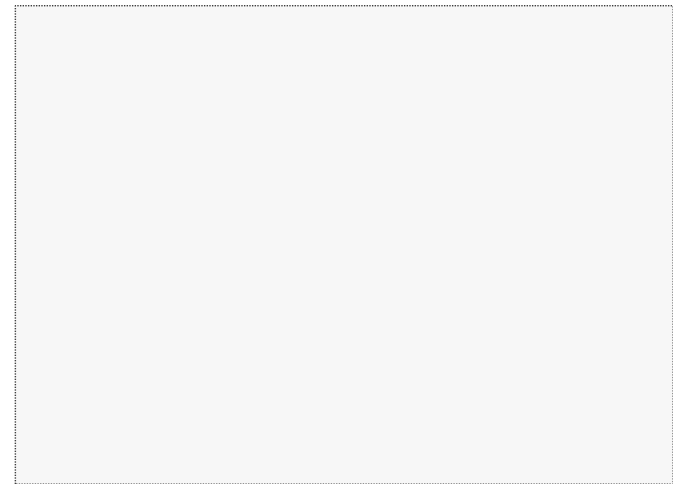


SWHE for Bounded Depth Circuits



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- ▶ “Leveled FHE” [Gen09]: Relaxation of FHE... A family of schemes $E^{(L)}$, $L \in \mathbb{Z}$, is “leveled fully homomorphic” if, for security parameter k ,
 - $E^{(L)}$ can homomorphically evaluate circuits of depth L ,
 - The Dec (decrypt) function is the same for all L ,
 - KeyGen, Enc, Dec, ADD, MULT are all $\text{poly}(k, L)$.
 - Eval has complexity polynomial in k , L , and circuit size.
- ▶ Humbler name for it: “SWHE for bounded *depth* circuits”.



Better Noise Management?



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- ▶ Our fantasy:
 - Noise doesn't grow exponentially with degree.
 - There is some *simple* trick to reduce noise after MULTs.
 - We get better noise management, hence shorter ciphertexts and SWHE for bounded depth.

Better Noise Management?

- ▶ Crazy Idea [BV11b, BGV12]:
 - Suppose c encrypts m – that is, $m = \llbracket c(s) \rrbracket_q$.
 - Let's pick $p < q$ and set $c^*(x) = (p/q) \cdot c(x)$, rounded.
 - Maybe it is true that:
 - $c^*(x)$ encrypts m : $m = \llbracket c^*(s) \rrbracket_p$ (new inner modulus).
 - $|\llbracket c^*(s) \rrbracket_p| \approx (p/q) \cdot |\llbracket c(s) \rrbracket_q|$ (noise is smaller).
 - This really shouldn't work...

Modulus Reduction Trick

- ▶ Scaling lemma: Let $p < q$ be odd moduli.
 - Given $\mathbf{c}$ with $m = \llbracket \langle \mathbf{c}, \mathbf{s} \rangle \rrbracket_q \rrbracket_2$. Set $\mathbf{c}' = (p/q)\mathbf{c}$. Set $\mathbf{c}''$ to be
 - the integer vector closest to $\mathbf{c}'$
 - such that $\mathbf{c}'' = \mathbf{c} \bmod 2$.
 - If $|\llbracket \langle \mathbf{c}, \mathbf{s} \rangle \rrbracket_q| < q/2 - (q/p) \cdot \ell_1(\mathbf{s})$, then $\mathbf{c}''$ is a valid encryption of m with possibly much less noise!
 - $m = \llbracket \langle \mathbf{c}'', \mathbf{s} \rangle \rrbracket_p \rrbracket_2$.
 - $|\llbracket \langle \mathbf{c}'', \mathbf{s} \rangle \rrbracket_p| < (p/q) \cdot |\llbracket \langle \mathbf{c}, \mathbf{s} \rangle \rrbracket_q| + \ell_1(\mathbf{s})$, where $\ell_1(\mathbf{s})$ is ℓ_1 -norm of $\mathbf{s}$.

Modulus Reduction Trick

Annotated Proof

- | | |
|---|--|
| <ol style="list-style-type: none"> 1. For some k, $[\langle \mathbf{c}, \mathbf{s} \rangle]_q = \langle \mathbf{c}, \mathbf{s} \rangle - kq$. 2. $(p/q)[\langle \mathbf{c}, \mathbf{s} \rangle]_q = \langle \mathbf{c}', \mathbf{s} \rangle - kp$. 3. $\langle \mathbf{c}'' - \mathbf{c}', \mathbf{s} \rangle < \ell_1(\mathbf{s})$. 4. Thus, $\langle \mathbf{c}'', \mathbf{s} \rangle - kp < (p/q) [\langle \mathbf{c}, \mathbf{s} \rangle]_q + \ell_1(\mathbf{s}) < p/2$. 5. So, $[\langle \mathbf{c}'', \mathbf{s} \rangle]_p = \langle \mathbf{c}'', \mathbf{s} \rangle - kp$. 6. Since $\mathbf{c}' = \mathbf{c}$ and $p = q \bmod 2$, we have $[\langle \mathbf{c}'', \mathbf{s} \rangle]_p]_2 = [\langle \mathbf{c}, \mathbf{s} \rangle]_q]_2$. | <ol style="list-style-type: none"> 1. Imagine $\langle \mathbf{c}, \mathbf{s} \rangle$ is close to kq. 2. Then $\langle \mathbf{c}', \mathbf{s} \rangle$ is close to kp. 3. $\langle \mathbf{c}'', \mathbf{s} \rangle$ close to kp if $\mathbf{s}$ is small. |
|---|--|

Scaling lemma: Let $p < q$ be odd moduli.

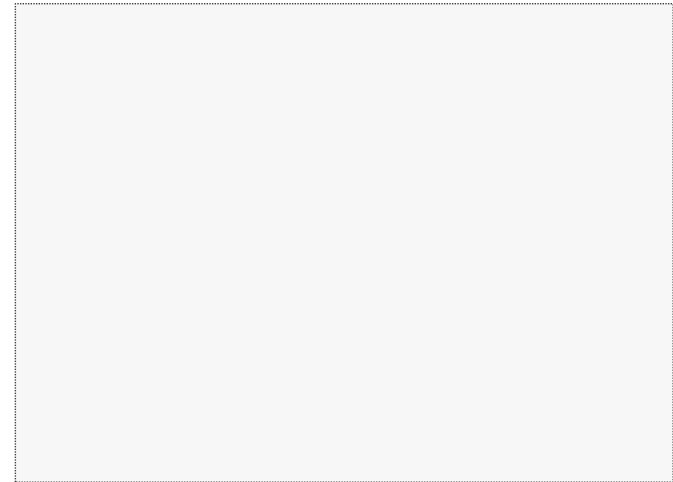
- Given $\mathbf{c}$ with $m = [[\langle \mathbf{c}, \mathbf{s} \rangle]_q]_2$. Set $\mathbf{c}' = (p/q)\mathbf{c}$. Set $\mathbf{c}''$ to be
 - the integer (ring) vector closest to $\mathbf{c}'$ such that $\mathbf{c}'' = \mathbf{c} \bmod 2$.
- If $|[\langle \mathbf{c}, \mathbf{s} \rangle]_q| < q/2 - (q/p) \cdot \ell_1(\mathbf{s})$, then:
 - $\mathbf{c}''$ is a valid encryption of m with possibly much less noise!
 - $m = [\langle \mathbf{c}'', \mathbf{s} \rangle]_p]_2$, and $|[\langle \mathbf{c}'', \mathbf{s} \rangle]_p| < (p/q) \cdot |[\langle \mathbf{c}, \mathbf{s} \rangle]_q| + \ell_1(\mathbf{s})$.

Modulus Reduction Example

- ▶ Example: $q=127$, $p=29$, $\mathbf{c}=(175,212)$, $\mathbf{s}=(2,3)$
- ▶ $\langle \mathbf{c}, \mathbf{s} \rangle \bmod q = 986 - 8 \cdot 127 = -30$
- ▶ $\mathbf{c}' = (p/q) \cdot \mathbf{c} = (39.9, 48.4)$
 - To get $\mathbf{c}''$, we round down both values (39, 48).
- ▶ $\langle \mathbf{c}'', \mathbf{s} \rangle \bmod p = 222 - 8 \cdot 29 = -10$
- ▶ $k=8$ in both cases, and $-30 \equiv -10 \pmod{2}$.
- ▶ The noise magnitude decreases from 30 to 10.
 - But relative magnitude increases:
 $10/29 > 30/127$.

Small Secret Key

- ▶ Recall $|[\langle \mathbf{c}'', \mathbf{s} \rangle]_p| < (p/q) \cdot |[\langle \mathbf{c}, \mathbf{s} \rangle]_q| + \ell_1(\mathbf{s})$.
- ▶ Luckily [ACPS 2009] proved that LWE is hard even when $\mathbf{s}$ is small
 - chosen from the error distribution χ .
 - So we use this distribution for the secret keys.



Modulus Reduction in RLWE-Based SWHE



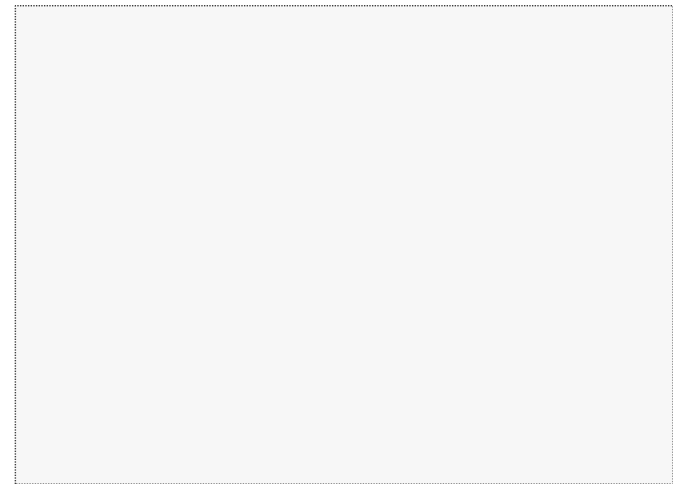
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- ▶ Scaling lemma also holds for LPR10, BV11a.
- ▶ [LPR10]: Ring-LWE encryption scheme can also have small secret keys, from the error distribution χ .

How Does Modulus Switching Help?

To evaluate a circuit of depth L ...

- ▶ Start with a large modulus q_L and noise $\eta \ll q_L$.
- ▶ After first MULT, noise grows to η^2 .
- ▶ Switch the modulus to $q_{L-1} \approx q_L/\eta$.
 - Noise reduced to $\eta^2/\eta \approx \eta$.
- ▶ After next MULT, noise again grows to η^2 . Switch to $q_{L-2} \approx q_{L-1}/\eta$ to reduce the noise to η .
- ▶ Keep switching moduli after each layer.
 - Setting $q_{i-1} \approx q_i/\eta$. (“Ladder” of decreasing moduli.)
 - Until the last modulus just barely satisfies $q_1 > \eta$.



How Does Modulus Switching Help?



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- ▶ Example: $q_9 \approx n^9$ with modulus reduction.

	Noise	Modulus
Fresh ciphertexts	η	$q_9 = \eta^9$
Level-1, Degree=2	η	$q_8 = \eta^8$
Level-2, Degree=4	η	$q_7 = \eta^7$
Level-3, Degree=8	η	$q_6 = \eta^6$
Level-4, Degree=16	η	$q_5 = \eta^5$
Level-5, Degree=32	η	$q_4 = \eta^4$
Level-6, Degree=64	η	$q_3 = \eta^3$
Level-7, Degree=128	η	$q_2 = \eta^2$
Level-8, Degree=256	η	$q_1 = \eta$

How Does Modulus Switching Help?



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- ▶ Example: $q_9 \approx n^9$ with no modulus reduction.

	Noise	Modulus
Fresh ciphertexts	η	$q_9 = \eta^9$
Level-1, Degree=2	η^2	$q_9 = \eta^9$
Level-2, Degree=4	η^4	$q_9 = \eta^9$
Level-3, Degree=8	η^8	$q_9 = \eta^9$
Level-4, Degree=16	η^{16}	$q_9 = \eta^9$
Level-5, Degree=32	η^{32}	
Level-6, Degree=64	η^{64}	
Level-7, Degree=128	η^{128}	
Level-8, Degree=256	η^{256}	

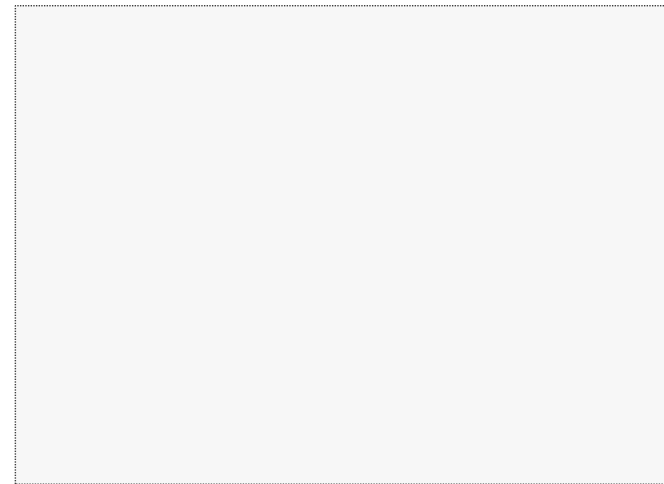
Decryption
error

Performance

- ▶ To evaluate circuit of depth L ;
 - Largest modulus is $q_L \approx q_1^L \approx \eta^L$.
 - Largest ciphertext is $O(k \cdot \text{poly}(L))$ bits, where k is the security parameter.
- ▶ Compare: without modulus reduction:
 - ciphertext was $O(k \cdot d^2)$ bits, where d was the *degree* (not the *depth*) of the circuit.
- ▶ *Depth* is logarithmic in *degree*.
- ▶ Exponential improvement.

The Final Ciphertext

- ▶ Final ciphertext (at output level) is small
 - q_1 is small.
 - Use key-switching to reduce dimension of the ciphertext if needed (“dimension reduction” [BV11b]).
 - Final ciphertext can be as small as a normal (non-homomorphic) Regev’05 ciphertext.
- ▶ We have SWHE for bounded depth circuits.



Security



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- ▶ Based on (R)LWE, but for what approx factor?
- ▶ Approx factor = $\text{modulus} / |\text{noise}| = (\text{poly}(k))^{\text{depth}}$.
 - Previously, $\text{modulus} / |\text{noise}| = (\text{poly}(k))^{\text{degree}}$.

SWHE over the Integers for Bounded Depth Circuits



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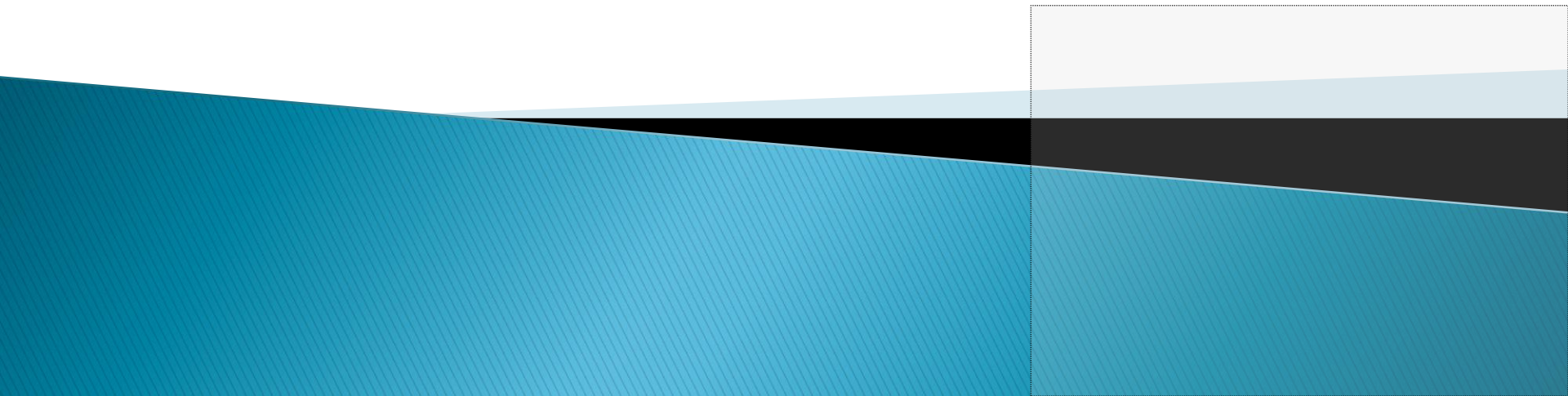
- ▶ [CNT12] extends the modulus reduction trick to the integer scheme.



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Batched Computation on Encrypted Data [SV11]

Each ciphertext is “packed” with an array of
plaintexts...

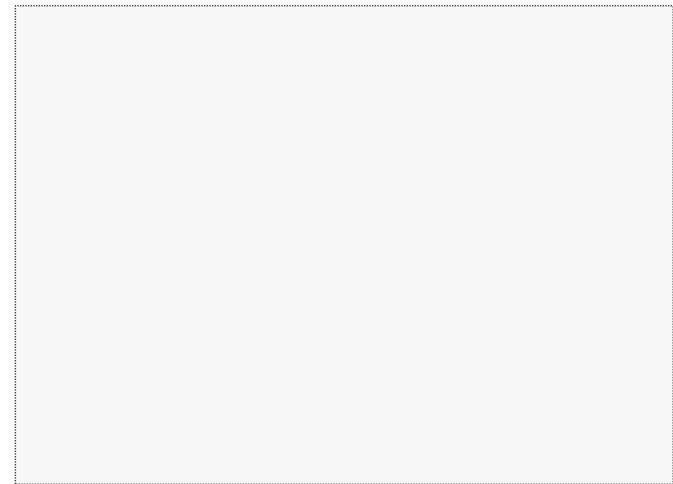


The Setting



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- ▶ Ciphertexts are long, plaintexts are often short.
- ▶ Wasteful!
- ▶ Overhead of homomorphic encryption
 - = (encrypted comp. time)/(unencrypted comp. time)
 - > (ciphertext length)/(plaintext length)



Batching / Packing Ciphertexts



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- ▶ Each ciphertext has an *array* of “plaintext slots”.
- ▶ An operation $(+, \times)$ on a ciphertext acts separately, in parallel, on each “plaintext slot” (each index in array).
 - Suppose two ciphertexts c and c' have (b_1, b_2, b_3) and (b_1', b_2', b_3') respectively in their “slots”
 - $3\text{-ADD}(c, c') \rightarrow (b_1 + b_1', b_2 + b_2', b_3 + b_3')$.
 - $3\text{-MULT}(c, c') \rightarrow (b_1 \cdot b_1', b_2 \cdot b_2', b_3 \cdot b_3')$.
 - 3-ADD , 3-MULT cost same as ADD , MULT .
- ▶ Think Chinese Remainder Theorem.

LWE-Based SWHE [BV11b]

- ▶ **Parameters:** q such that $\gcd(q, 2) = 1$.
- ▶ **KeyGen:** Secret = uniform $\mathbf{s} \in \mathbb{Z}_q^n$. Public key: linear polys $\{f_i(x_1, \dots, x_n)\}$ s.t. $[f_i(\mathbf{s})]_q = 2e_i$, $|e_i| \ll q$.
- ▶ **Encrypt** ($m \in \mathbb{Z}_2$): Set $g(x_1, \dots, x_n)$ as a random subset sum of $\{f_i(x_1, \dots, x_n)\}$. Output $c(x_1, \dots, x_n) = m + g(x_1, \dots, x_n)$.
- ▶ **Decrypt:** $[c(\mathbf{s})]_q = m + s_{\text{even}}$. Reduce mod 2.
- ▶ **ADD and MULT:**
 - ▶ Output sum or product of ciphertext polynomials.

LWE-Based SWHE [BV11b]

- ▶ **Parameters:** q and **small** p_1, p_2, p_3 s.t. $\gcd(q, p_1 p_2 p_3) = 1$.
- ▶ **KeyGen:** Secret = uniform $s \in \mathbb{Z}_q^n$. Public key: linear polys $\{f_i(x_1, \dots, x_n)\}$ s.t. $[f_i(s)]_q = p_1 p_2 p_3 e_i$, $|e_i| \ll q$.
- ▶ **Encrypt** ($m \in \mathbb{Z}_{p_1 p_2 p_3}$): Set $g(x_1, \dots, x_n)$ as a random subset sum of $\{f_i(x_1, \dots, x_n)\}$. Output $c(x_1, \dots, x_n) = m + g(x_1, \dots, x_n)$.
- ▶ **Decrypt:** $[c(s)]_q = m + (\text{mult of } p_1 p_2 p_3)$. Reduce mod $p_1 p_2 p_3$.
- ▶ **ADD and MULT:**
 - ▶ Output sum or product of ciphertext polynomials.
 - ▶ By CRT, ADD and MULT operate separately on $\{m \bmod p_i\}$.

Batching in RLWE-Based SWHE



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- ▶ Motivation: Better efficiency:
 - RLWE more efficient than LWE even in non-batched setting.
 - Batching works very well in RLWE-based SWHE.

CRT over Polynomial Rings

- ▶ Let $R = \mathbb{Z}[y]/h(y)$, p prime, $R_p = \mathbb{Z}_p[y]/h(y)$.
- ▶ Suppose $h(y) = \prod h_i(y) \bmod p$.
- ▶ Then $R_p \equiv$ Direct product of $\{\mathbb{Z}_p[y]/h_i(y)\}$.
- ▶ Example:
 - $R = \mathbb{Z}[y]/(y^4+1)$, $p=17$.
 - $(y^4+1) = (y-2)(y-8)(y-15)(y-9) \bmod 17$
 - $2, 8=2^3, 15=2^5, 9=2^7$ are the primitive 8-th roots of unity mod 17.
 - $\mathbb{Z}_{17}[y]/(y^4+1) \equiv$ Direct product of $\mathbb{Z}_{17}[y]/(y-2), \mathbb{Z}_{17}[y]/(y-8), \dots$
 - $m(y) \in \mathbb{Z}_{17}[y]/(y^4+1)$ is determined by its evaluations at 2, 8, 15, 9.

Recall SWHE from RLWE [BV11a]



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- ▶ **Parameters**: q with $\gcd(q, 2) = 1$, $R = \mathbb{Z}[y]/(y^n + 1)$, $R_2 = \mathbb{Z}_2[y]/(y^n + 1)$, $R_q = \mathbb{Z}_q[y]/(y^n + 1)$.
- ▶ **KeyGen**: Secret = uniform $s \in R$. Public key: linear polys $\{f_i(x)\}$ s.t. $f_i(s) = 2e_i$, $|e_i| \ll q$.
- ▶ **Encrypt**($m \in R_2$): : Set $g(x)$ as a random subset sum of $\{f_i(x)\}$. Output $c(x) = m + g(x)$.
- ▶ **Decrypt**: $c(s) = m + s \text{ mod } 2$. Reduce mod 2.
- ▶ **ADD** and **MULT**: Add or multiply the ciphertext polynomials.

Recall SWHE from RLWE [BV11a]



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- ▶ **Parameters:** p , q with $\gcd(q, p) = 1$, $R = \mathbb{Z}[y]/(y^n + 1)$, $R_p = \mathbb{Z}_p[y]/(y^n + 1)$, $R_q = \mathbb{Z}_q[y]/(y^n + 1)$.
- ▶ **KeyGen:** Secret = uniform $s \in R$. Public key: linear polys $\{f_i(x)\}$ s.t. $f_i(s) = pe_i$, $|e_i| \ll q$.
- ▶ **Encrypt** ($m \in R_p$): : Set $g(x)$ as a random subset sum of $\{f_i(x)\}$. Output $c(x) = m + g(x)$.
- ▶ **Decrypt:** $c(s) = m + (p \text{ multiple})$. Reduce mod p .
- ▶ **ADD** and **MULT:** Add or multiply the ciphertext polynomials.

SWHE from RLWE [BV11a]

- ▶ **Parameters:** p, q with $\gcd(q, p) = 1, R = \mathbb{Z}[y]/(y^n + 1), R_p = \mathbb{Z}_p[y]/(y^n + 1), R_q = \mathbb{Z}_q[y]/(y^n + 1).$
- ▶ **KeyGen:** Secret = uniform $s \in R$. Public key: linear polys $\{f_i(x)\}$ s.t. $f_i(s) = pe_i, |e_i| \ll q.$
- ▶ **Encrypt** ($m \in R_p$): : Set $g(x)$ as a random subset sum of $\{f_i(x)\}.$ Output $c(x) = m + g(x).$
- ▶ **Decrypt:** $c(s) = m + (p \text{ multiple}).$ Reduce mod $p.$

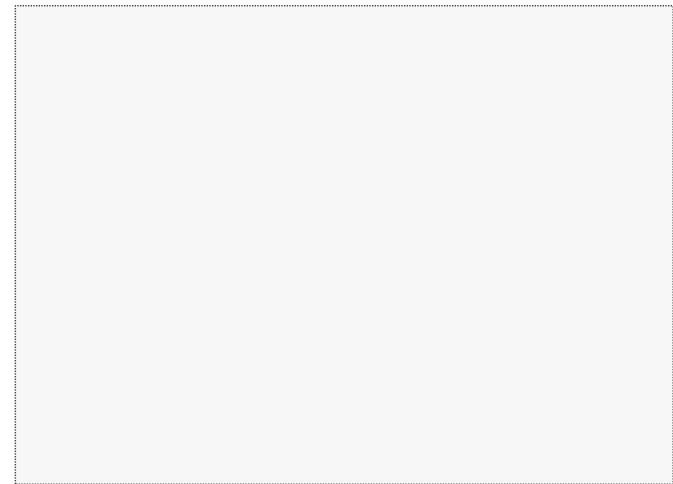
Set $p = 1 \bmod 2n,$
so p has n primitive
 $2n$ -th roots of unity.
Then, R_p splits.

Message $m(y)$ in R_p
has n "plaintext slots"
for m 's evaluations at
primitive n -th roots of
unity mod $p.$

Forget Encryption for a Moment...

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- ▶ Plaintexts are $m(y) \in R_p = \mathbb{Z}_p[y]/(y^n+1)$, represented by evaluations $m(\alpha_i)$, where α_i 's are primitive n -th roots of unity mod p .
- ▶ $m_1(y) + m_2(y) \rightarrow m_1(\alpha_1) + m_2(\alpha_1), \dots, m_1(\alpha_n) + m_2(\alpha_n)$.
- ▶ $m_1(y) \times m_2(y) \rightarrow m_1(\alpha_1) \times m_2(\alpha_1), \dots, m_1(\alpha_n) \times m_2(\alpha_n)$.
- ▶ $F(m_1(y), \dots, m_t(y))$
 $\rightarrow F(m_1(\alpha_1), \dots, m_t(\alpha_1)), \dots, F(m_1(\alpha_n), \dots, m_t(\alpha_n))$.
- ▶ Compute F on n inputs $\{(a_{1i}, \dots, a_{ti}) : i \in [n]\}$ *in parallel* by setting $\{m_i(y)\}$ so that $m_i(\alpha_j) = a_{ij}$.



SIMD (Single Instruction Multiple Data): Working on Data *Arrays*



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Array of length n

2	1	9	5	0	7	3	6	...	1	2
8	2	0	9	3	8	0	1	...	4	4
10	3	9	14	3	15	3	7	...	5	6

n -ADD

SIMD (Single Instruction Multiple Data): Working on Data *Arrays*



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Array of length n

2	1	9	5	0	7	3	6	...	1	2
8	2	0	9	3	8	0	1	...	4	4
16	2	0	45	0	56	0	6	...	4	8

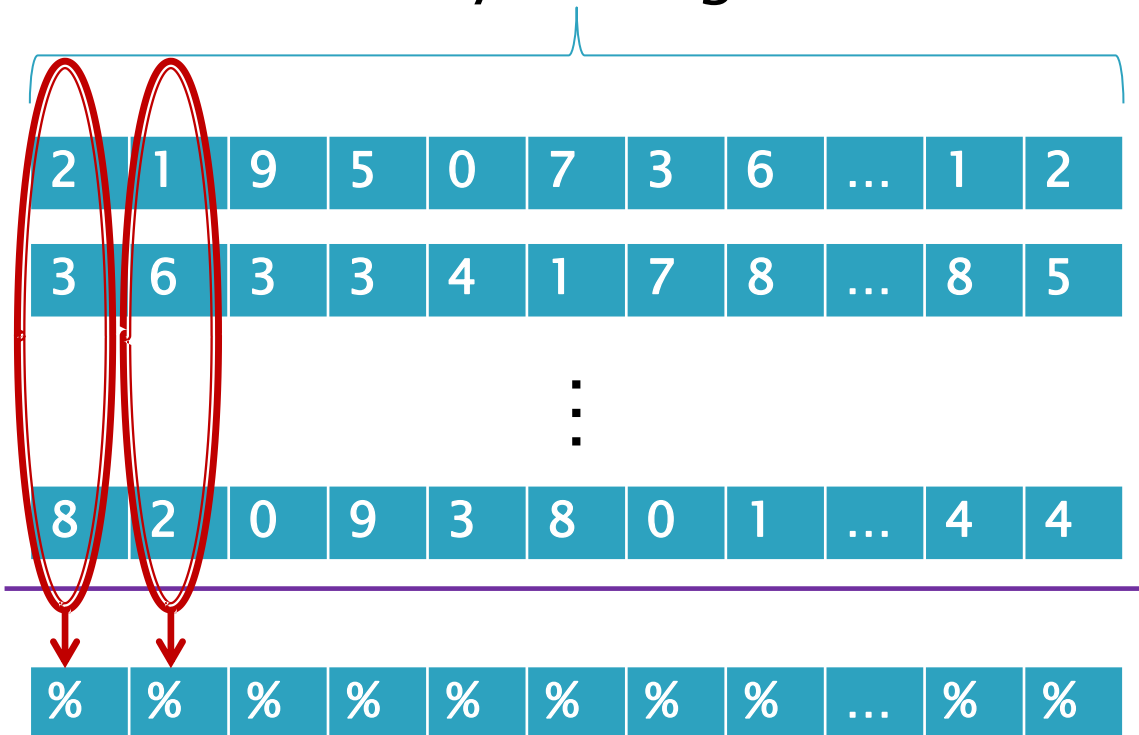
n -MULT

SIMD (Single Instruction Multiple Data): Working on Data *Arrays*

Array of length n



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Function F

- ▶ Great for computing same function F on n different input strings.
- ▶ We can do SIMD homomorphically.



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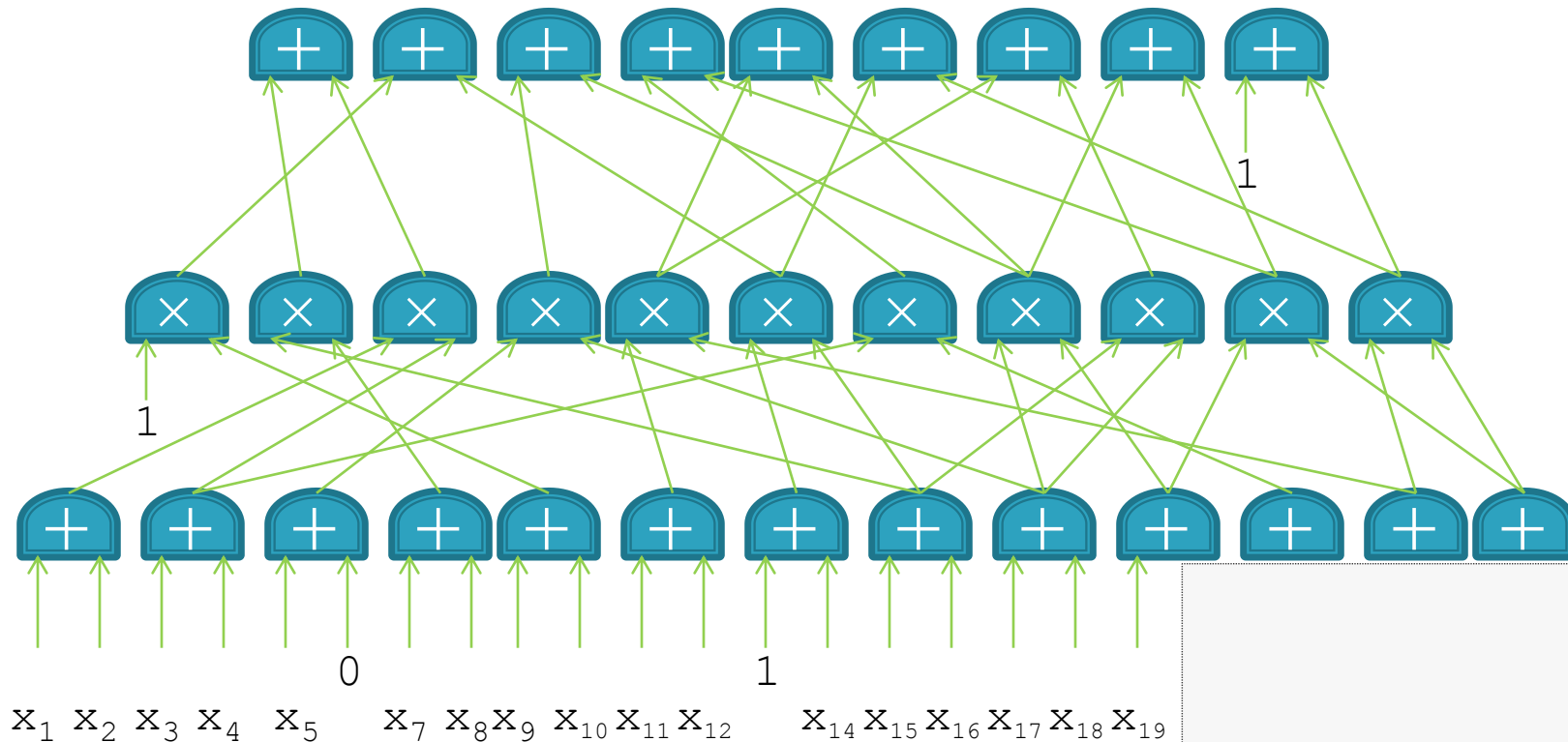
More Complex Computation on Encrypted Arrays [GHS12]



So you want to compute some function... Not Using SIMD



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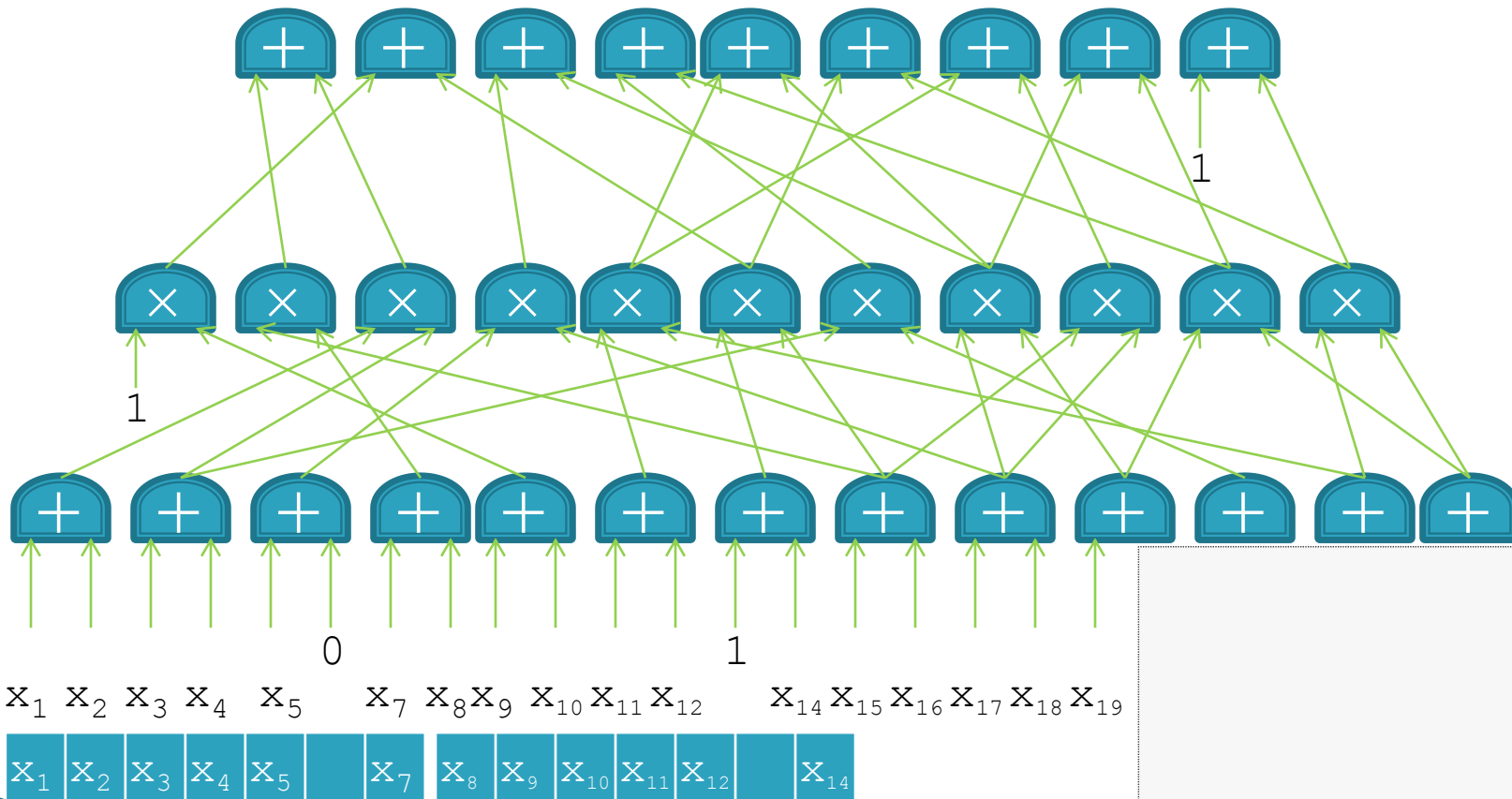


ADD and MULT are a
complete set of operations.

So you want to compute some function... Using SIMD...



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n-ADD and n-MULT are *NOT*
a *complete* set of operations.

n-ADD, n-MULT, n-PERMUTE: a complete set of SIMD ops



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n-MULT

x_1	x_2	x_3	x_4	x_5		x_7
1	0	1	0	0	0	0

x_1	x_2	x_3	x_4	x_5		x_7
0	1	0	1	0	0	0

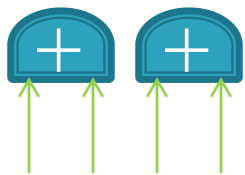
n-PERMUTE(π)



x_1	0	x_3	0	0	0	0
x_1	x_3	0	0	0	0	0

n-ADD

0	x_2	0	x_4	0	0	0
x_2	x_4	0	0	0	0	0



x_1 x_2 x_3 x_4

Ring Automorphisms!

How do we Evaluate n -Permute(π) homomorphically, without “decompressing” the packed ciphertexts?

Ring Automorphisms

Map $a(y) \rightarrow b(y) = a(y^i) \bmod (y^n + 1)$,
where $i \in \mathbb{Z}_{2n}^*$.

$$a(x) = \begin{array}{|c|c|c|c|c|} \hline a(\alpha_1) & a(\alpha_2) & \dots & a(\alpha_{n-1}) & a(\alpha_n) \\ \hline \end{array}$$

$$b(x) = \begin{array}{|c|c|c|c|c|} \hline a(\alpha_1^i) & a(\alpha_2^i) & \dots & a(\alpha_{n-1}^i) & a(\alpha_n^i) \\ \hline \end{array}$$

$$= \begin{array}{|c|c|c|c|c|} \hline a(\alpha_{\pi(1)}) & a(\alpha_{\pi(2)}) & \dots & a(\alpha_{\pi(n-1)}) & a(\alpha_{\pi(n)}) \\ \hline \end{array}$$

$b(y)$ has the same evaluations
as $a(y)$, but permuted!

Can We Evaluate These Automorphisms Homomorphically?



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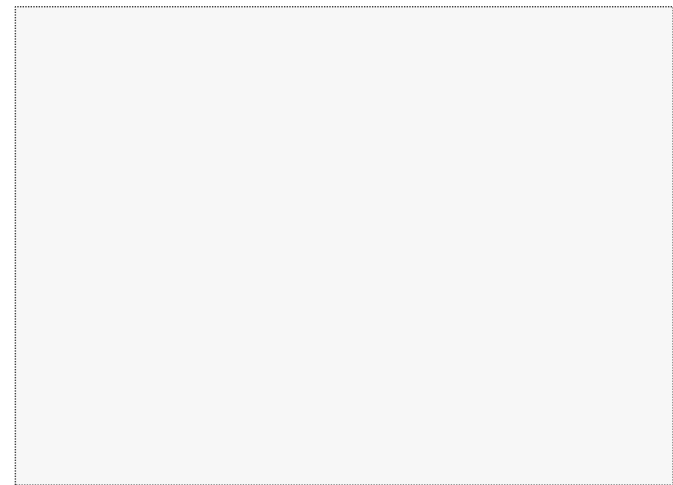
- ▶ Given ciphertext $c_1(y) \cdot x + c_0(y)$ with
$$c_1(y) \cdot s(y) + c_0(y) = m(y) + p \cdot e(y) \pmod{q, y^n + 1}$$
- ▶ $c_1(y^i) \cdot s(y^i) + c_0(y^i) = m(y^i) + p \cdot e(y^i) \pmod{q, y^{in} + 1}, i \in \mathbb{Z}_{2n}^*.$
- ▶ $c_1(y^i) \cdot s(y^i) + c_0(y^i) = m(y^i) + p \cdot e(y^i) \pmod{q, y^n + 1}, i \in \mathbb{Z}_{2n}^*.$
- ▶ $c_1(y^i) \cdot x + c_0(y^i)$ is an encryption of $m(y^i)$ under key $s(y^i)$.
- ▶ Key switch $s(y) \rightarrow s(y^i)$ to get encryption of $m(y^i)$ under “normal” key $s(y)$.

Which Permutations Do the Automorphisms Give Us?



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- ▶ The “Basic” Permutations ($b(y) = a(y^i)$):
 - Only n (out of $n!$) of the possible permutations.
 - Automorphism group $\text{Gal}(Q(\alpha)/Q) \equiv Z_{2n}^*$.
 - Think of the automorphisms as $n\text{-ROTATE}(i)$, which rotates the n items i steps clockwise, like a dial.
- ▶ Claim: For any permutation π , we can build $n\text{-PERMUTE}(\pi)$ “efficiently” from $n\text{-ADD}$, $n\text{-MULT}$, and $n\text{-ROTATE}(i)$.



n -PERMUTE(π) from n -ADD, n -MULT, and n -ROTATE(i). (Sketch)



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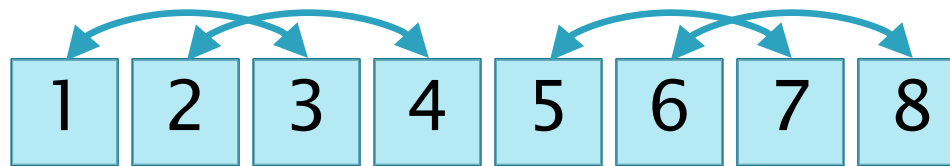
- ▶ Butterfly network: assume $n = 2^k$.
 - n -PERMUTE(π) can be realized by a butterfly network of $2k-1$ levels of n -SWAP(i, s) ops, $i \in \{1, \dots, 2k-1\}$, $s \in \{0, 1\}^{n/2}$.
 - At level i , the 2^k items are partitioned into $n/2$ pairs, each pair with k -bit indices differing only in $|i-k|$ -th bit.
 - n -SWAP(i, s) swaps the j -th pair iff $s_j = 1$.

n -PERMUTE(π) from n -ADD, n -MULT, and n -ROTATE(i). (Sketch)



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► 8-SWAP(2,0110)



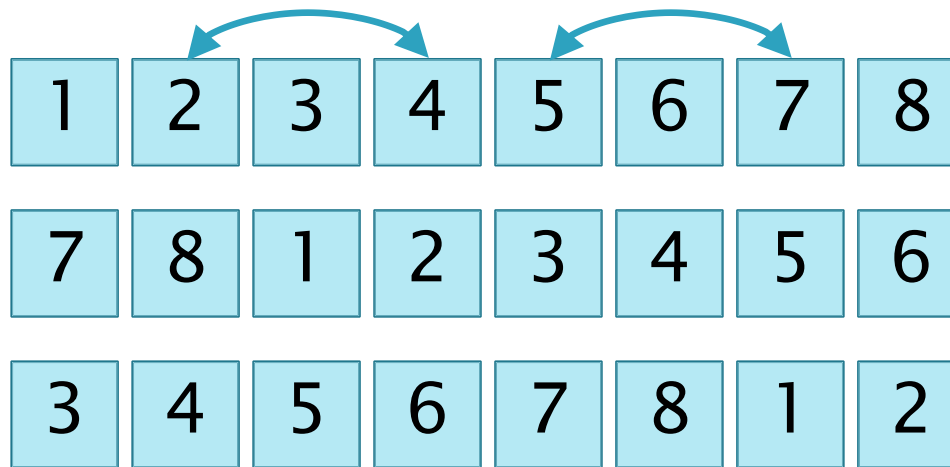
Potential Swaps

n -PERMUTE(π) from n -ADD, n -MULT, and n -ROTATE(i). (Sketch)



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► 8-SWAP(2,0110)



Actual Swaps

8-ROTATE(2)

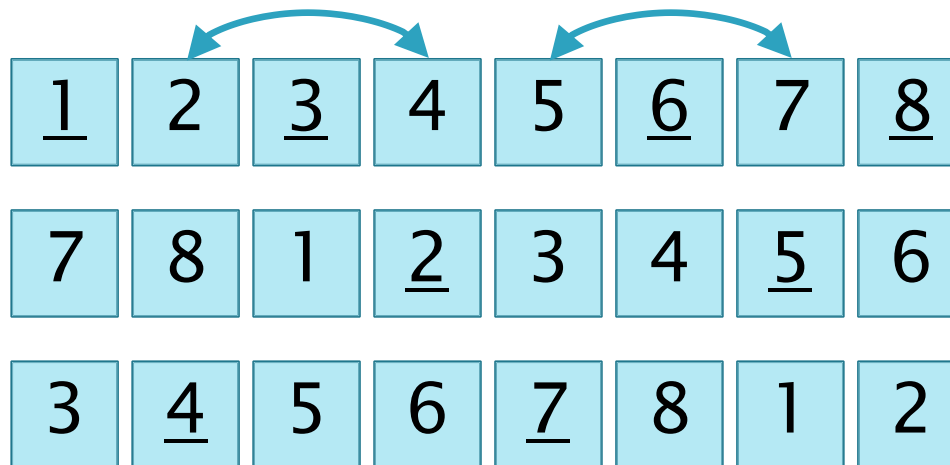
8-ROTATE(-2)

n -PERMUTE(π) from n -ADD, n -MULT, and n -ROTATE(i). (Sketch)



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► 8-SWAP(2,0110)



Actual Swaps

8-ROTATE(2)

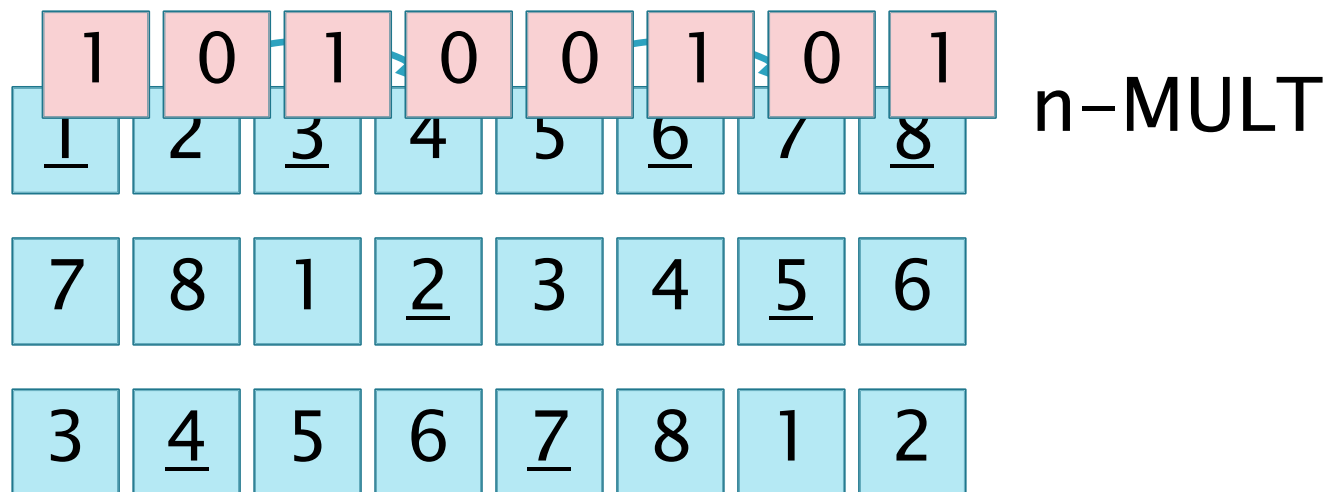
8-ROTATE(-2)

n -PERMUTE(π) from n -ADD, n -MULT, and n -ROTATE(i). (Sketch)



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► 8-SWAP(2,0110)

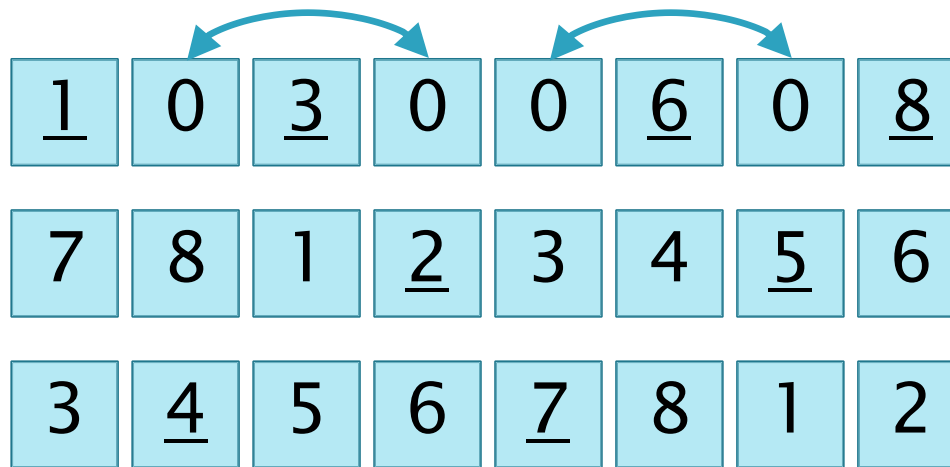


n -PERMUTE(π) from n -ADD, n -MULT, and n -ROTATE(i). (Sketch)



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► 8-SWAP(2,0110)

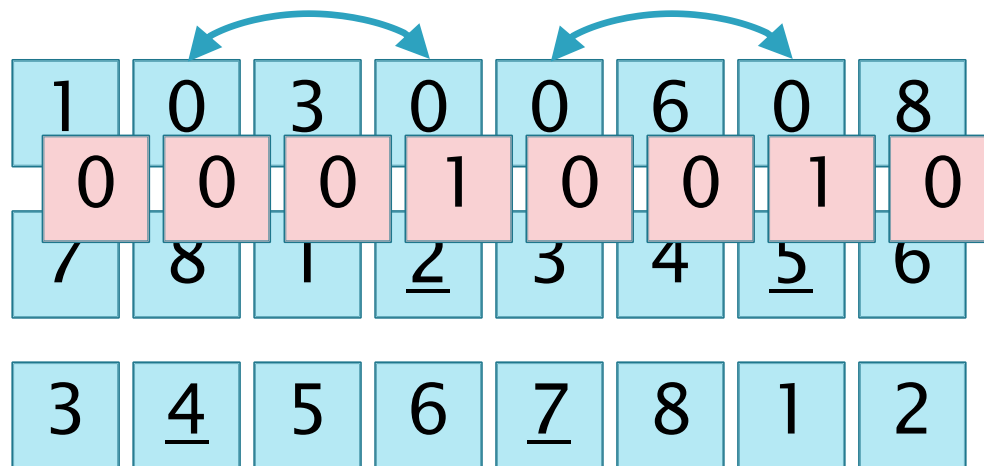


n -PERMUTE(π) from n -ADD, n -MULT, and n -ROTATE(i). (Sketch)



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► 8-SWAP(2,0110)



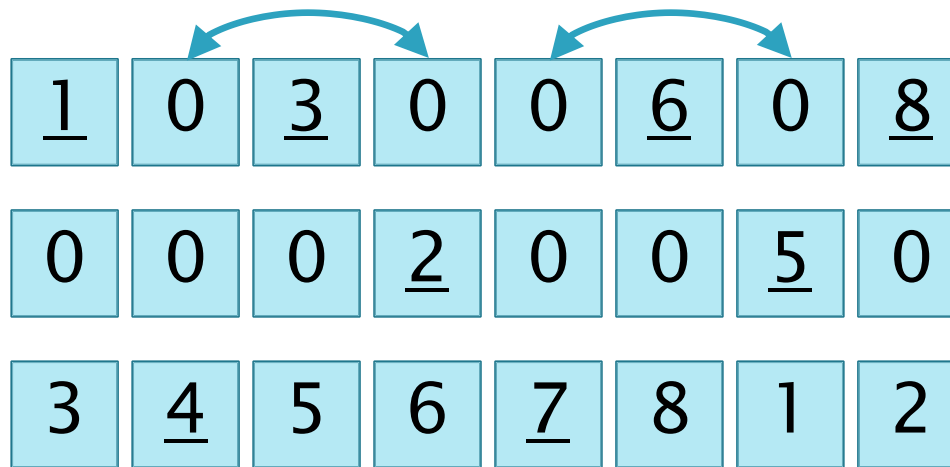
n -MULT

n -PERMUTE(π) from n -ADD, n -MULT, and n -ROTATE(i). (Sketch)



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► 8-SWAP(2,0110)

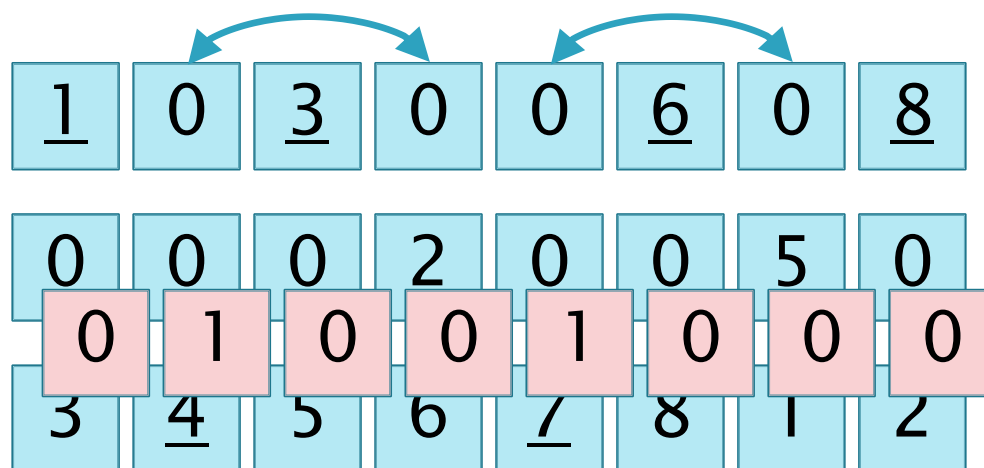


n -PERMUTE(π) from n -ADD, n -MULT, and n -ROTATE(i). (Sketch)



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► 8-SWAP(2,0110)



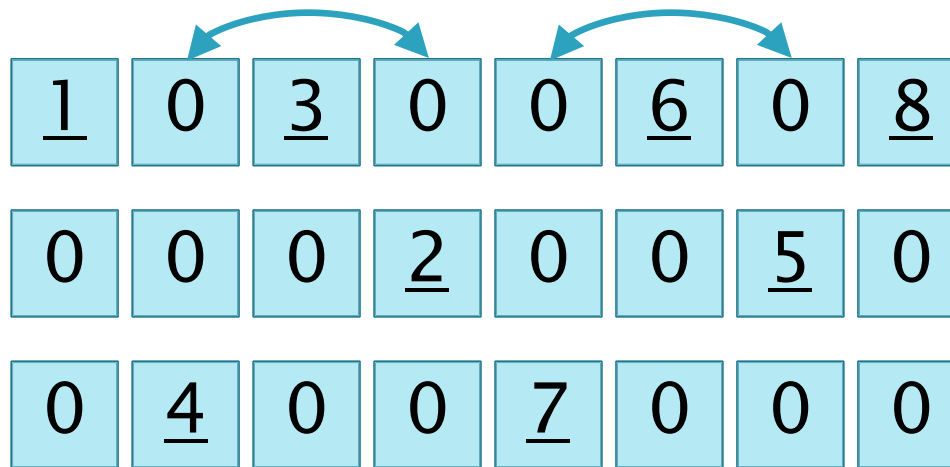
n -MULT

n -PERMUTE(π) from n -ADD, n -MULT, and n -ROTATE(i). (Sketch)



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► 8-SWAP(2,0110)



n -PERMUTE(π) from n -ADD, n -MULT, and n -ROTATE(i). (Sketch)



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► 8-SWAP(2,0110)

<u>1</u>	0	<u>3</u>	0	0	<u>6</u>	0	<u>8</u>
----------	---	----------	---	---	----------	---	----------

0	0	0	<u>2</u>	0	0	<u>5</u>	0
---	---	---	----------	---	---	----------	---

0	<u>4</u>	0	0	<u>7</u>	0	0	0
---	----------	---	---	----------	---	---	---

n -ADD

<u>1</u>	<u>4</u>	<u>3</u>	<u>2</u>	<u>7</u>	<u>6</u>	<u>5</u>	<u>8</u>
----------	----------	----------	----------	----------	----------	----------	----------

Batching Summary



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- ▶ Overhead of batched RLWE-based BGV12 SWHE for security parameter k :
 - = (encrypted comp. time)/(unencrypted comp. time)
 - = $\text{poly}(\log q_L, \log w) = \text{poly}(L, \log k, \log w)$, where w is the maximum width of circuit being evaluated.



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Fully Homomorphic Encryption [Gen09]

and the bootstrapping step...

Bootstrapping: What Is It?

- ▶ So far, we can evaluate bounded depth F :

x_1
 x_2
 $\dots$
 x_t

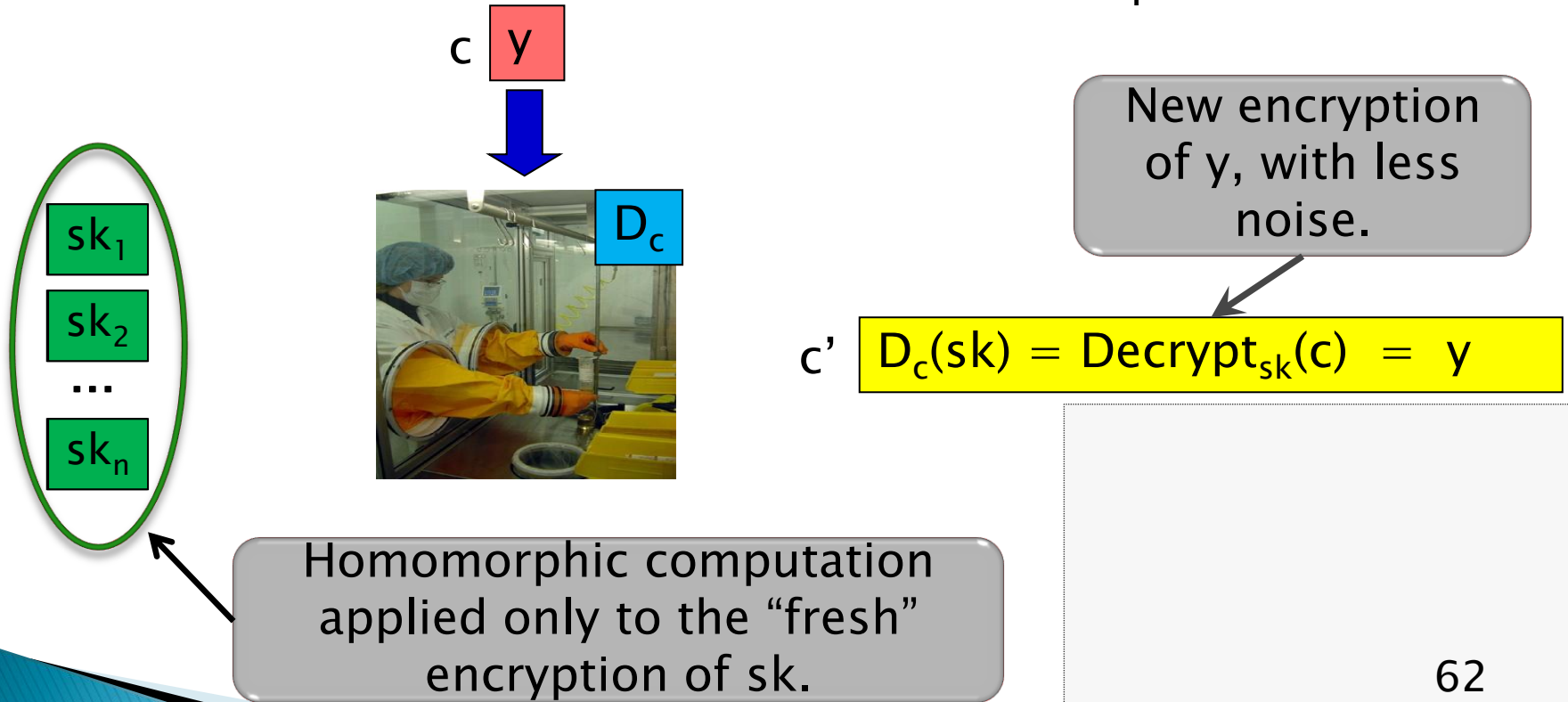


c $F(x_1, x_2, \dots, x_t)$

- ▶ We have a noisy evaluated ciphertext c .
- ▶ We want to get a less noisy c' that encrypts the same value, but with less noise.
- ▶ Bootstrapping *refreshes* ciphertexts, using the *encrypted secret key*.

Bootstrapping: What Is It?

- ▶ For ciphertext c , consider $D_c(sk) = \text{Decrypt}_{sk}(c)$
 - Suppose $D_c(\cdot)$ is a low-depth polynomial in sk .
- ▶ Include in the public key also $\text{Enc}_{pk}(sk)$.

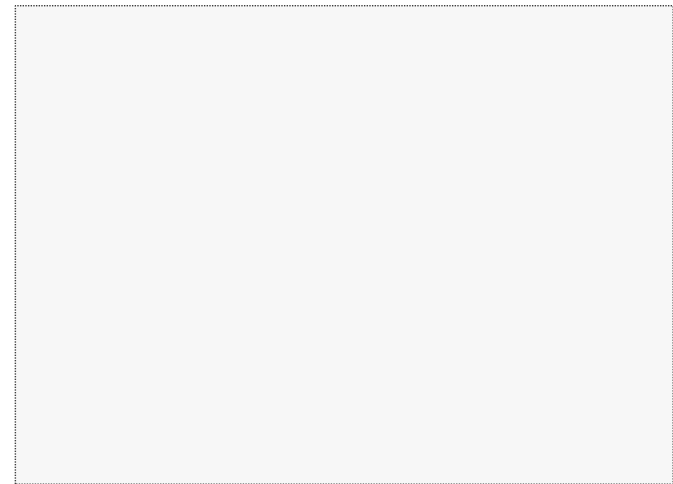


Bootstrapping in [BV11b, BGV12] (LWE-Based Scheme)



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- ▶ Recall: Complexity of BGV12 (and BV11b) decryption is independent of L , the depth it can evaluate.
- ▶ Set $L > 1 + \text{depth needed to evaluate } D_C$.
- ▶ Then, homomorphic decryption reduces the noise level. (Use recursively.)
 - We now have FHE (modulo a circular security issue).



Bootstrapping BGV12

- ▶ Decryption function computable in depth $O(\log k)$.
 - Our “somewhat homomorphic” scheme only needs to compute circuits of depth $O(\log k)$.
- ▶ BGV12 performance with bootstrapping:
 - Ciphertext size can be quasi-linear in k .
 - ADD and MULT take $\bar{O}(k)$ time.
 - Bootstrapping takes $\bar{O}(k^2)$ time.
 - Actually, with *batching*, we can reduce it to $\bar{O}(k)$ amortized.
 - Overhead is $\text{poly}(L, \log k, \log w) = \text{poly}(\log k, \log w)$, where w is the maximum width of circuit being evaluated.
- ▶ Security can be based on quasi-polynomial factors:
 $2^{\bar{O}(\log^2 k)}$ versus 2^{k^c} (R)LWE.



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Chimeric FHE [GH11b]

A hybrid FHE scheme that combines lattices
and Elgamal...

Main Idea



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Goal: Construct a bootstrappable SWHE scheme.

Problem

SWHE schemes don't handle multiplication well, it amplifies the “noisiness” of ciphertexts.

But Elgamal cannot alternate between additions and multiplications...

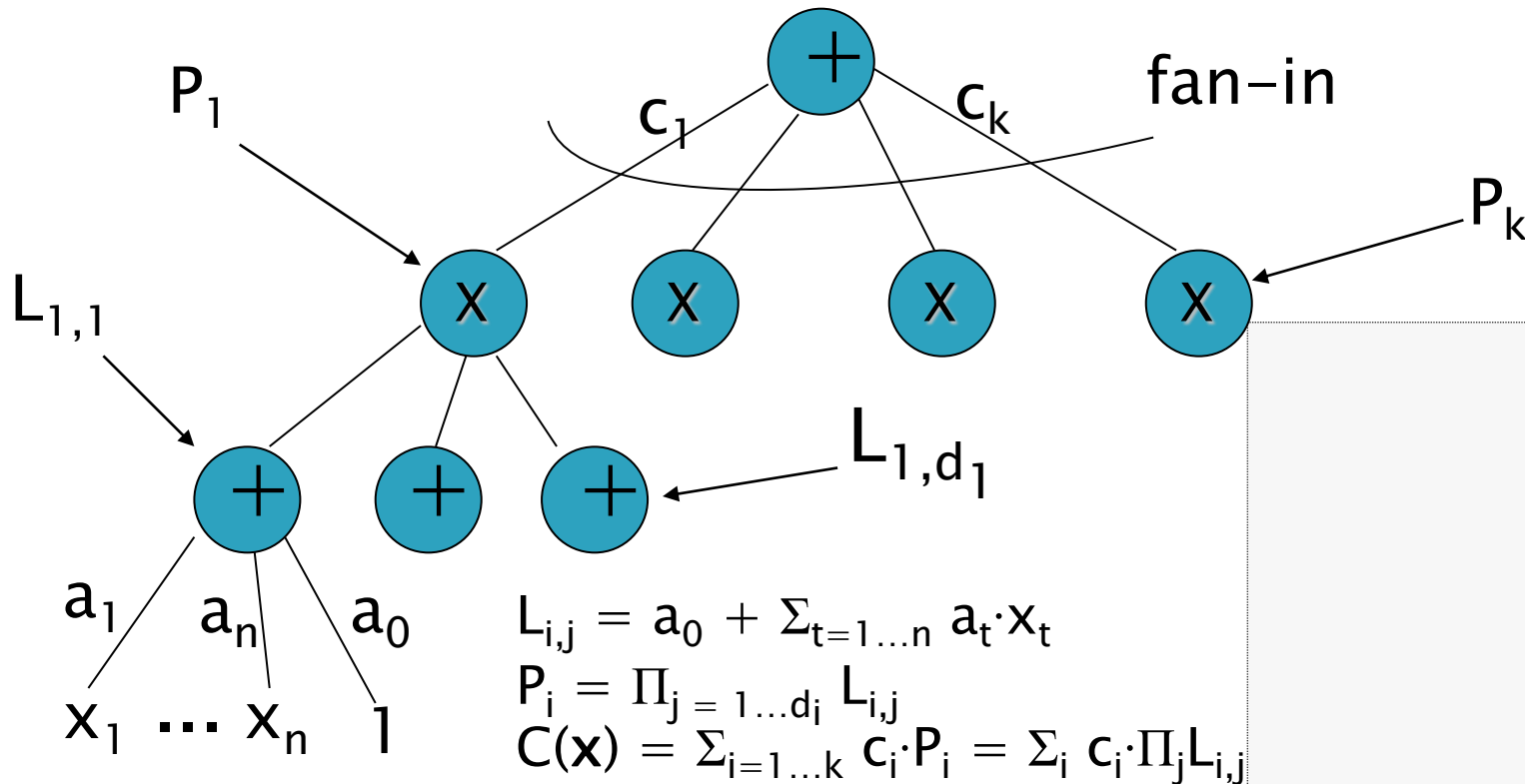
Solution?

Elgamal handles multiplication well!
Maybe Elgamal can help!

Suppose the decryption function puts all of the mults *together*, without alternation? Can Elgamal help with the “product part”?

“Chimeric FHE”

- ▶ SWHE: Use a lattice-based SWHE scheme, as before.
- ▶ Express SWHE decryption as a ciphertext-dependent **depth-3 ($\Sigma\Pi\Sigma$) arithmetic circuit** applied secret key.



“Chimeric FHE”

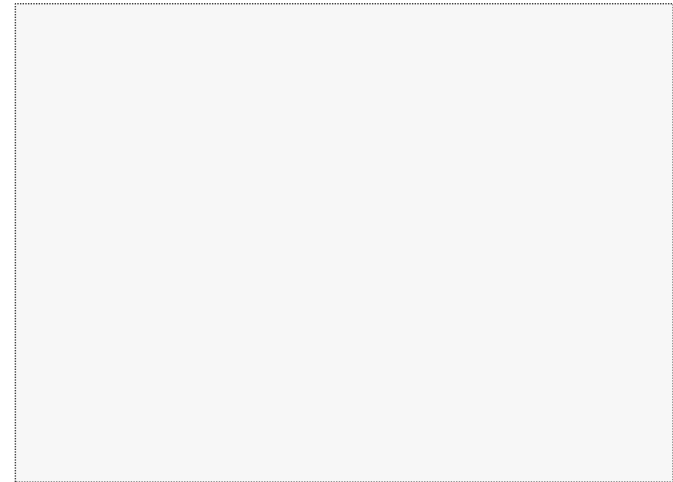
- ▶ Bootstrapping: Evaluate depth-3 circuit homomorphically by combining a **SWHE scheme with a “helper” MHE (multiplicative homomorphic enc.) scheme**, like Elgamal:
 - Bottom Sums: Get MHE encryptions of the bottom sums.
(Can put all needed MHE ciphertexts in public key.)
 - Products: Evaluate them homomorphically using MHE scheme.
 - Translation: Translate each ciphertext $\text{Enc}_{\text{MHE}}(m)$ to $\text{Enc}_{\text{SWHE}}(m)$ by evaluating MHE decryption homomorphically.
 - Top Sum: Evaluate top sum under the SWHE scheme.

“Chimeric FHE”



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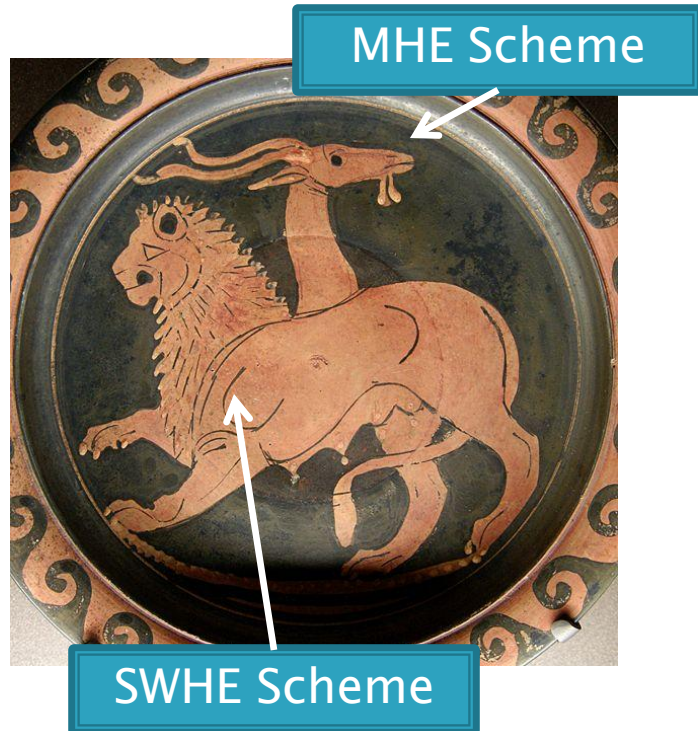
- ▶ Main high-level idea: The SWHE scheme only needs enough “homomorphic capacity” to evaluate the MHE scheme’s decryption, not its *own* decryption.
 - Breaks the “self-referentiality” of bootstrapping.



“Chimeric” FHE?



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Chimera (mythology):

- 1) A monstrous fire-breathing female creature composed of the parts of multiple animals: upon the body of a lioness with a tail that ended in a snake's head, the head of a goat arose on her back.
- 2) The term *chimera* has also come to mean, more generally, an impossible or foolish fantasy, hard to believe.



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Lattice-Based Decryption As a Depth-3 Circuit



Lattice-Based Decryption Functions



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- ▶ Typically, they can be computed using “restricted” depth-3 circuits.
- ▶ Proven already for Regev’s cryptosystem by Klivans and Sherstov.

Elementary Symmetric Polynomials

- ▶ Elementary symmetric polynomial $e_k(x_1, \dots, x_n)$: sum of all monomials that are products of exactly k distinct variables.
- ▶ Cool fact: $e_k(\mathbf{x}) \bmod p$ can be computed by a depth-3 arithmetic circuit (for large enough p)
- ▶ How? If $P(z) = \prod_i (z + x_i)$, then $e_k(\mathbf{x})$ is the coefficient of z^{n-k}
- ▶ Computing $P(z)$: evaluate $P(z)$ in $n+1$
 - Let $A = \{a_1, \dots, a_{n+1}\}$ be some subset of
 - Bottom Sums: Compute $a_j + x_i$ for all x_i 's and a_j 's.
 - Products: Compute $\lambda_j \cdot P(a_j) = \prod_i (a_j + x_i)$ for all j .
 - Top Sum: Interpolate $\sum_j \lambda_j \cdot P(a_j)$ to get desired coefficient of $P(z)$.

Observe: the bottom sums are "restricted".

Multilinear Symmetric Polynomials



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- ▶ Multilinear symmetric polynomials (MSPs):
 - MSPs are symmetric, and each variable has degree 1
 - MSPs are linear combinations of elementary symmetric polynomials (ESPs)
 - MSPs can be computed by restricted depth-3 circuits.
- ▶ Lattice-based decryption functions can be expressed as “restricted” MSPs.



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An Elgamal Instantiation



Elgamal Example

- ▶ MHE scheme: Elgamal over $QR(p)$
 - $p = 2q+1$ be a safe prime
- ▶ SWHE scheme: Plaintext space = Z_p .
Decryption is a restricted depth-3 arithmetic circuit over Z_p .

Elgamal Example

► FHE.KeyGen:

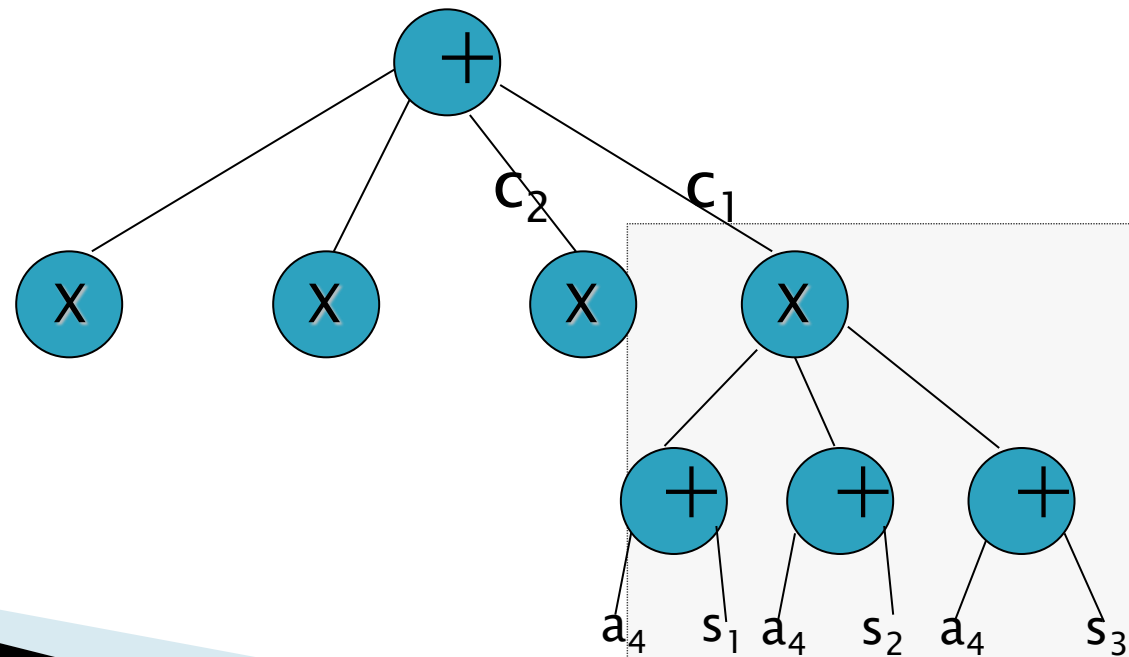
- Generate Elgamal key (e_L, g^{e_L}) , SWHE key $(\{s_{iL}\}, pk_i)$, for every level L in the circuit
- Encrypt individual bits of e_L under k_{L+1} .
- Encrypt values $a_j + s_i$ (in Z_p) under Elgamal for a_j in A .
 - Note: A is our set of “interpolation points” in our MSP.
 - Technicality: the a_j ’s must be chosen so that a_j and $a_j + 1$ are both in $QR(p)$, the plaintext space of Elgamal.
- Publish the public keys and encrypted secret keys.

Elgamal Example: Refreshing a ciphertext



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- ▶ To “refresh” a level- i ciphertext $\mathbf{c}$:
 - First, express $\text{SWHE.Dec}(\mathbf{c}, \mathbf{s})$ as a $\mathbf{c}$ -dependent restricted depth-3 circuit taking key $\mathbf{s}$ as input.

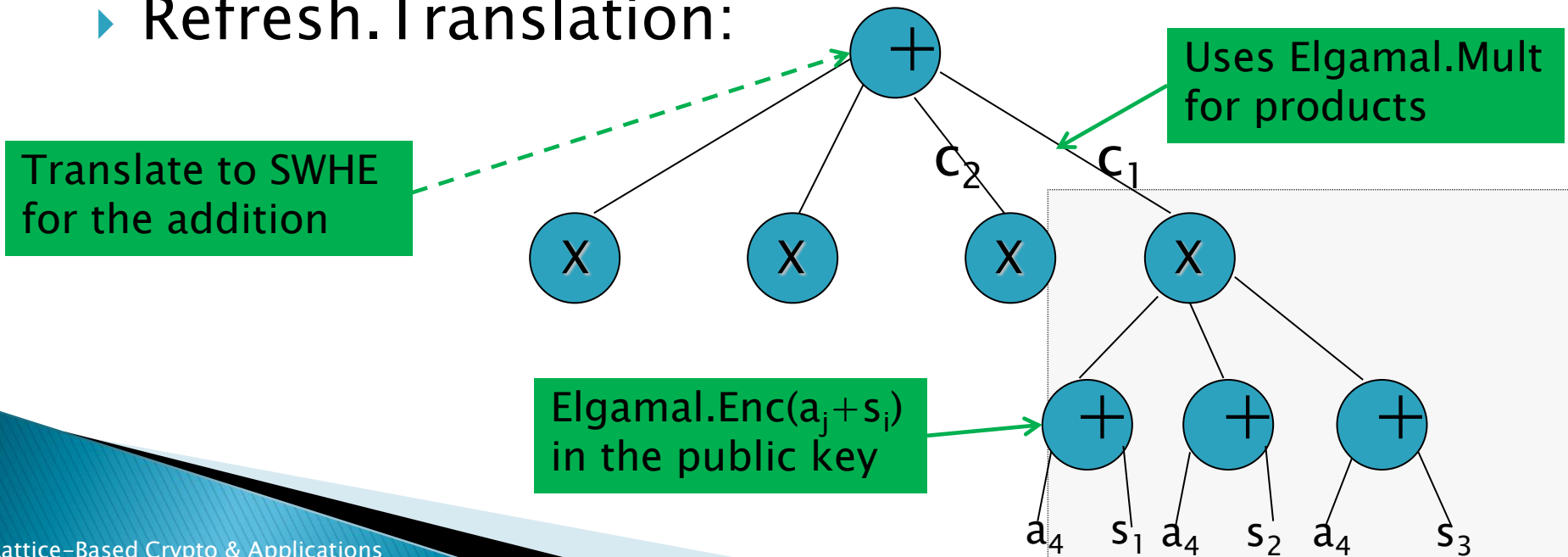


Elgamal Example: Refreshing a ciphertext



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- ▶ Refresh.BottomSums:
 - Pick up the Elgamal encryptions of $a_j + s_i$ from PK.
 - The bottom sums have been “precomputed”.
- ▶ Refresh.Products:
 - Compute $c_j \cdot P(a_j) = c_j \cdot \Pi_i(a_j + s_i) \bmod p$ homomorphically using Elgamal.
- ▶ Refresh.Translation:



Elgamal Example (continued)

► Refresh.Translation:

- Goal: Convert $(y, z) = (g^r, mg^{-er})$ to a SWHE ciphertext.
- Precompute $y_i = y^{2^i} \bmod p$ for all i up to $\log q$.
- “Inside” SWHE, compute $y^{e[i]2^i} = e[i] \cdot y^{2^i} + (1 - e[i])y^0 \bmod p$.
- Inside SWHE, compute product of $y^{e[i]2^i}$ ’s to get y^e .
 - The degree of this product is $\log q$.
- Inside SWHE, compute product of y^e and z to get m .

► Refresh.TopSum:

- Just do it inside the SWHE scheme.

Elgamal Example (continued)

- ▶ Required homomorphic capacity of SWHE scheme:
 - Evaluate Elgamal decryption, plus an ADD or MULT.
 - Overall degree = $2 \log q$.
 - Set SWHE parameters large to evaluate polynomials of degree $2 \log q$.
 - Done!

Thank You! Questions?



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An Optimization

- ▶ We can “compress” the entire FHE ciphertext down to a single MHE (e.g., Elgamal) ciphertext
- ▶ Choose a_j 's cleverly so that all products $P(a_j)$ can be computed just from $P(a_1)$
 - Recall: $P(z) = \prod_i (z + s_i)$ where s_i is a secret key bit.
 - We only “store” $P(a_1)$ – e.g., a single Elgamal ciphertext!
- ▶ Note: $P(a_j)$ can be computed homomorphically from $P(a_1)$ within the MHE scheme.
- ▶ Set a_j such that we know (w_j, e_j) such that
 - $a_j = w_j \cdot a_1^{e_j} \pmod p$, and
 - $a_j + 1 = w_j \cdot (a_1 + 1)^{e_j} \pmod p$
 - How? Choose e_j and set $a_j = a_1^{e_j} / ((a_1 + 1)^{e_j} - a_1^{e_j})$ and $w_j = a_j / a_1^{e_j}$.
- ▶ Then, $P(a_j) = w_j^d \cdot P(a_1)^{e_j} \pmod p$

Twin Quadratic Residues

Lemma: Let p be a prime. Let

$$S = \{(u,v): u \neq 0, v \neq 0, u^2 - v^2 = 1 \pmod{p}\}$$

Then, $|S| = p-3$ or $p-5$, depending on whether $p \equiv 3$ or $1 \pmod{4}$.

Proof: For each pair (u,v) in S , let $a_{uv} = u+v$. Then $a_{uv}^{-1} = u-v$, and we have:

$$u = (a_{uv} + a_{uv}^{-1})/2 \text{ and } v = (a_{uv} - a_{uv}^{-1})/2$$

implying that a_{uv} determines u and v uniquely. So, for

$$T = \{a \neq 0 : a+a^{-1} \neq 0, a-a^{-1} \neq 0\},$$

we have $|S| = |T|$.

We have that a is in T unless $a = 0$, $a^2 = -1$, or $a^2 = \pm 1$.

If $p \equiv 1 \pmod{4}$, then -1 is a QR, and there are 5 prohibited values.

If $p \equiv 3 \pmod{4}$, then -1 is not a residue, and there are 3 prohibited values.