Learning with Error and GSW's Homomorphic Encryption

June 26, 2019

Intuition of LWE

$$14s_1 + 15s_2 + 5s_3 + 2s_4 \approx 8 \pmod{17}$$
 $13s_1 + 14s_2 + 14s_3 + 6s_4 \approx 16 \pmod{17}$
 $6s_1 + 10s_2 + 13s_3 + s_4 \approx 3 \pmod{17}$
 $10s_1 + 4s_2 + 12s_3 + 16s_4 \approx 12 \pmod{17}$
 $9s_1 + 5s_2 + 9s_3 + 6s_4 \approx 9 \pmod{17}$
 $3s_1 + 6s_2 + 4s_3 + 5s_4 \approx 16 \pmod{17}$
 \vdots
 $6s_1 + 7s_2 + 16s_3 + 2s_4 \approx 3 \pmod{17}$

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- Output $(\vec{a}, \langle \vec{a}, \vec{s} \rangle + e)$

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- Both are difficult
- Decision isn't much easier than search

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- Check using the blackbox for decision version. Try another *k* until the guess is correct.



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- $A\vec{s} = \vec{e}$,

Allows secure communication by using the tools below:

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- $Dec_{sk} \circ Enc_{pk}(x, r) = x$ with overwhelming probability over r

Typical use of such a scheme:

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- Observe to Alice
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- Alice decrypts it using sk

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- Chosen plaintext attack (CPA): The "intuitive" definition. An (efficient) adversary who's able to encrypt anything shouldn't be able to decrypt anything.
- Ciphertext indistinguishability (TODO)

Homomorphic encryption

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- May involve an evaluation key.
- Application includes quantum computing

Intuitive idea as follows:

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- When plaintexts are booleans, $I_N C_1C_2$ encodes NAND.

Define the following functions on \mathbb{Z}_q^* . Easier to understand with examples. Take $q=2^4$.

• Powersof2 $(1_2, 11_2) = (1000_2, 100_2, 100_2, 10_2, 1_2, 1000_2, 1100_2, 110_2, 11_2)$

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- BitDecomp⁻¹ $(0,0,10_2,0,0,1,10_2,1) = (0100_2,1001_2)$

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- BitDecomp⁻¹ $(0,0,10_2,0,0,1,10_2,1) = (0100_2,1001_2)$
- Flatten = $BitDecomp \circ BitDecomp^{-1}$

$$\begin{aligned} \text{Flatten} \big(110_2, 101_2, 1_2, 11_2, \\ 110_2, 101_2, 1_2, 11_2 \big) \end{aligned}$$

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$$=(1,0,0,1,1,0,0,1)$$



GSW's tools cont.

Some basic properties

• $\langle \mathsf{BitDecomp}(\vec{a}), \mathsf{Powersof2}(\vec{b}) \rangle = \langle \vec{a}, \vec{b} \rangle$

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- = $\langle \mathsf{Flatten}(\vec{a}), \mathsf{Powersof2}(\vec{b}) \rangle$

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- $m \in O(n \log q)$

GSW's Construction - Secret Keygen

• Sample $\vec{s} \leftarrow \mathbb{Z}_q^n$ uniformly. This represents the solution of the LWE system of equations.

GSW's Construction - Secret Keygen

- **①** Sample $\vec{s} \leftarrow \mathbb{Z}_q^n$ uniformly. This represents the solution of the LWE system of equations.
- ② Output sk as 1 on the first coordinate, followed by $-\vec{s}$.

① Generate $B \leftarrow \mathbb{Z}_q^{m \times n}$ uniformly

- $\textbf{ 2 Sample } \vec{e} \leftarrow \chi^{\textit{m}}$

- **1** Generate $B \leftarrow \mathbb{Z}_q^{m \times n}$ uniformly
- ② Sample $\vec{e} \leftarrow \chi^m$
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- **4** Observe that $pk \cdot sk = \vec{e}$

GSW's Construction - Encryption

Input: μ

• Sample $R \in \{0,1\}^{N \times m}$

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- **②** Output Flatten $(\mu \cdot I + BitDecomp(R \cdot pk))$

GSW's Construction - Decryption

$$\mathsf{Flatten}(\mu \cdot I + \mathsf{BitDecomp}(R \cdot pk)) \cdot \mathsf{Powersof2}(sk)$$

GSW's Construction - Decryption

```
Flatten(\mu \cdot I + BitDecomp(R \cdot pk)) · Powersof2(sk) = (\mu \cdot I + BitDecomp(R \cdot pk)) · Powersof2(sk)
```

GSW's Construction - Decryption

```
Flatten(\mu \cdot I + BitDecomp(R \cdot pk)) · Powersof2(sk) = (\mu \cdot I + BitDecomp(R \cdot pk)) · Powersof2(sk) = \muPowersof2(sk) + R \cdot pk \cdot sk
```

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- Similar for all other bits of μ .
- Decryption breaks down when the error reaches q/4.

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- BitDecomp⁻¹(C) = μ · BitDecomp⁻¹(I) + R · A
- Fact: The joint distribution $(A, R \cdot A)$ is indistinguishable from uniform, if m > 2nl

GSW's Construction - NAND

•
$$(I - C_1 \cdot C_2)\vec{v} = (1 - \mu_1\mu_2)\vec{v} - \mu_2\vec{e}_1 - C_1\vec{e}_2$$

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- Final error increase by a factor of $(N+1)^L$

```
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- Error increases by a factor of N

GSW's Construction - Addition

Simply add the ciphertexts

GSW's Construction - Addition

- Simply add the ciphertexts
- Error increases by a factor of 2

GSW's Construction - Multiplication

•
$$C_1 \cdot C_2 \vec{v} = C_1(\mu_2 \vec{v} + \vec{e}_2) = \mu_1 \mu_2 \vec{v} + \mu_2 \vec{e}_1 + C_1 \vec{e}_2$$

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- Error increase depends on what's being encrypted
- May need to assume bounds on the values being computed

References

- O. Regev. The Learning with Errors Problem.
- C. Gentry, A. Sahai, B. Waters. Homomorphic Encryption from Learning with Errors: Conceptually-Simpler, Asymptotically-Faster, Attribute-Based.