Simple Threshold Fully Homomorphic Encryption from LWE with Polynomial Modulus

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Katharina Boudgoust Peter Scholl

Aarhus University



Simple Threshold **Fully Homomorphic Encryption** from LWE with Polynomial Modulus

Fully Homomorphic Encryption (FHE)

FHE scheme:

•
$$\mathsf{KGen}(1^{\lambda}) \to (\mathsf{pk}, \mathsf{sk})$$

$$\bullet \; \operatorname{Enc}(\operatorname{pk},m) \to \operatorname{ct}$$

$$ullet$$
 Eval $(\mathsf{pk},f,\mathsf{ct}_1,\mathsf{ct}_2) \to \mathsf{ct}'$

•
$$Dec(sk, ct') \rightarrow m'$$

 λ security parameter $\mathcal M$ message space

$f: \mathcal{M} \times \mathcal{M} \to \mathcal{M}$

Properties:

- Correctness
- Semantic security

$$\mathsf{Dec}(\mathsf{Eval}(f,\mathsf{Enc}(m_1),\mathsf{Enc}(m_2))) = f(m_1,m_2)$$

IND-CPA

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IND-CPA

Problem:

sk single point of failure

2

Simple **Threshold** Fully Homomorphic Encryption from LWE with Polynomial Modulus

Threshold FHE

t-out-of-n Threshold FHE scheme:

- $\mathsf{KGen}(1^{\lambda}) \to (\mathsf{pk}, \mathsf{sk}_1, \dots, \mathsf{sk}_n)$
- \bullet Enc(pk, m) \rightarrow ct
- Eval(pk, f, ct₁, ct₂) \rightarrow ct'
- PartDec($\operatorname{sk}_i,\operatorname{ct}'$) $\to d_i$
- Combine($\{d_i\}_{i\in S}$) $\to m'$

$$i \in \{1, \dots, n\}$$

 $S \subset \{1, \dots, n\}$

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Properties:

- Correctness
- Partial decryption security
- Semantic security

for |S|>t recover correct message for $|S|\leq t$ no information is leaked

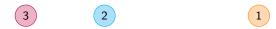
FHE is IND-CPA

Applications:

- Storing sensitive data
- Electronic voting protocols
- Multiparty computations

Yash's talk

I ennart's talk



Simple Threshold Fully Homomorphic Encryption from LWE with Polynomial Modulus

linear function in enc randomness and sk

Ingredients:

- 1) FHE with β nearly linear decryption:
 - ullet $\langle \mathsf{ct}, \mathsf{sk}
 angle = f(m_1, m_2) + \mathit{e}_{\mathsf{ct}}$
 - $\bullet \ \|e_{\mathsf{ct}}\|_{\infty} \leq \beta$

linear function in enc randomness and sk

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2) t-out-of-n linear secret sharing scheme:

$$\bullet \; \mathsf{Share}(\mathsf{sk}) \to \mathsf{sk}_1, \dots, \mathsf{sk}_n \\$$

$$\bullet \ \operatorname{Rec}(\{\langle y,\operatorname{sk}_i\rangle\}_{i\in S}) = \langle y,\operatorname{sk}\rangle$$

|S| > t

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1st Trial construction:

- $\bullet \ \mathsf{KGen:} \ \mathsf{compute} \ \mathsf{Share}(\mathsf{sk}) \to (\mathsf{sk}_1, \dots, \mathsf{sk}_n) \\$
- PartDec: compute $d_i = \langle \mathsf{ct}, \mathsf{sk}_i \rangle$
- Combine: compute $Rec(\{d_i\})$

linear function in enc randomness and sk

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- Combine: compute $\operatorname{Rec}(\{d_i\}) = \operatorname{Rec}(\{\langle \mathsf{ct}, \mathsf{sk}_i \rangle\}) = (2) \langle \mathsf{ct}, \mathsf{sk} \rangle = (1) f(m_1, m_2) + e_{\mathsf{ct}}$

Problem:

- Corrupted parties learn e_{ct}
- After enough decryptions, can recover sk

Ingredients:

- 1) FHE with nearly linear decryption:
 - $\langle \mathsf{ct}, \mathsf{sk} \rangle = f(m_1, m_2) + e_{\mathsf{ct}}$

 $e_{\rm ct}$ ciphertext noise

- 2) t-out-of-n linear secret sharing scheme:
 - $\bullet \ \operatorname{Rec}(\{\,\langle y,\operatorname{sk}_i\rangle\,\}) = \langle y,\operatorname{sk}\rangle$

2nd Trial Construction:

- PartDec: compute $d_i = \langle \mathsf{ct}, \mathsf{sk}_i \rangle + e_{flood,i}$
- Combine: compute $Rec(\{d_i\})$

 e_{flood} flooding noise

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• Combine: compute $Rec(\lbrace d_i \rbrace)$ = $Rec(\lbrace \langle \mathsf{ct}, \mathsf{sk}_i \rangle + e_{flood,i} \rbrace) = f(m_1, m_2) + e_{\mathsf{ct}} + Rec(\lbrace e_{flood,i} \rbrace)$

Problem:

- Is $Rec(\{e_{flood,i}\})$ still small? Needed for correctness!
- For Shamir secret sharing: no

Ingredients:

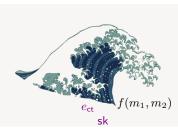
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Simple Threshold FHE, Final [BD10]

Ingredients:

- 1) FHE with β nearly linear decryption:
 - $\langle \mathsf{ct}, \mathsf{sk} \rangle = f(m_1, m_2) + e_{\mathsf{ct}}$

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- 2) t-out-of-n linear secret sharing scheme with small reconstruction:
 - $Rec(\{\langle y, \mathsf{sk}_i \rangle\}) = \langle y, \mathsf{sk} \rangle$
 - if e_i small, then $Rec(\{e_i\})$ also small

Construction:

 \bullet PartDec: compute $d_i = \langle \mathsf{ct}, \mathsf{sk}_i \rangle + e_{flood,i}$

 e_{flood} flooding noise

• Combine: compute $Rec(\{d_i\})$

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Partial Decryption Security

Two worlds:

ullet Real: e_{ct} and e_{flood}

• Simulated: only e_{flood}

How close are they? [BD10] measures with statistical distance Δ

$$\Delta(\mathsf{Real},\mathsf{Sim}) \leq \Delta(e_{flood} + e_{\mathsf{ct}},e_{flood}) \leq \mathsf{negl}(\lambda)$$

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- ullet $\|e_{flood}\|$ needs to be super-polynomially larger than $\|e_{\mathsf{ct}}\|$
- LWE-based constructions: $\|e_{flood}\|\sim$ LWE modulus q and $\|e_{\rm ct}\|\sim$ LWE noise e, thus super-polynomial modulus-noise ratio
 - Larger parameters
 - ► Easier problem



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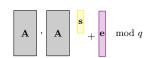


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3 2

Simple Threshold Fully Homomorphic Encryption from LWE with Polynomial Modulus



Improved Noise Flooding via Rényi Divergence 1/2

Let P,Q be discrete probability distributions

In [BD10]: Statistical Distance
$$\Delta(P,Q) = \frac{1}{2} \sum_{x \in \operatorname{Supp}(P)} \lvert P(x) - Q(x) \rvert$$

In our work: Rényi Divergence

$$\mathsf{RD}(P,Q) = \sum_{\substack{x \in \mathsf{Supp}(P) \\ \subset \mathsf{Supp}(Q)}} \frac{P(x)^2}{Q(x)}$$

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Both fulfill the **probability preservation property** for an event E:

$$\begin{array}{lll} \hbox{[BD10]:} & P(E) & \leq & \Delta(P,Q) + Q(E) & \hbox{(additive)} \\ \hbox{Our work:} & P(E)^2 & \leq & \hbox{RD}(P,Q) \cdot Q(E) & \hbox{(multiplicative)} \end{array}$$

- ullet Q(E) negligible $\Rightarrow P(E)$ negligible
- $\bullet \ \Delta(P,Q) = ^! \ \mathsf{negligible} \quad \ \mathsf{and} \quad \ \mathsf{RD}(P,Q) = ^! \ \mathsf{constant}$

Improved Noise Flooding via Rényi Divergence 2/2

Two worlds:

- ullet Real: e_{ct} and e_{flood}
- ullet Simulated: only e_{flood}

How close are they?

$$\begin{split} &\Delta(\mathsf{Real},\mathsf{Sim}) \leq \Delta(e_{flood} + e_{\mathsf{ct}},e_{flood}) \leq \mathsf{negl}(\lambda) \\ &\mathsf{RD}(\mathsf{Real},\mathsf{Sim}) \leq \mathsf{RD}(e_{flood} + e_{\mathsf{ct}},e_{flood}) \leq \mathsf{constant} \end{split}$$

Advantage:

- ullet $\|e_{flood}\|$ only needs to be polynomially larger than $\|e_{\mathsf{ct}}\|$
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Disadvantage:

- 1) Rényi divergence depends on the number of issued partial decryptions
 - → from simulation-based to game-based security notion
- 2) Works well with search problems, not so well with decision problems

3 2

Simple Threshold Fully Homomorphic Encryption from LWE with Polynomial Modulus

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5 Challenges on the way

Our Approaches

- 1) Rényi divergence depends on the number of issued partial decryptions
 - → IND-CPA security notion for Threshold FHE [JRS17]
 - → a priori bound on partial decryption queries
- 2) Works well with search problems, not so well with decision problems
 - → one-way security notion for Threshold FHE
 - → lift one-way security to IND-CPA security for Threshold FHE use Goldreich-Levin hardcore bits

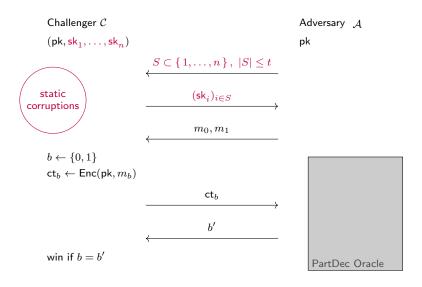
Our Approaches

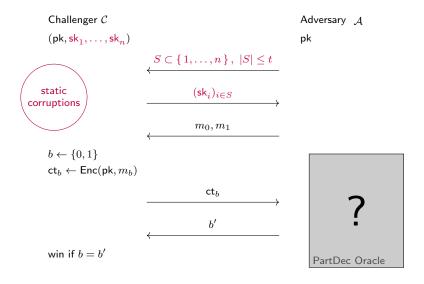
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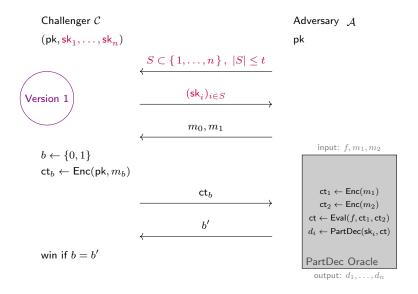
Challenger C (pk, sk)

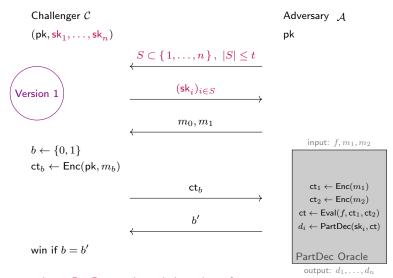
Adversary \mathcal{A} pk

 $\begin{matrix} & & & & & \\ & & & & \\ b \leftarrow \{0,1\} \\ \mathsf{ct}_b \leftarrow \mathsf{Enc}(\mathsf{pk},m_b) \end{matrix} \\ & & & & \\ & & &$

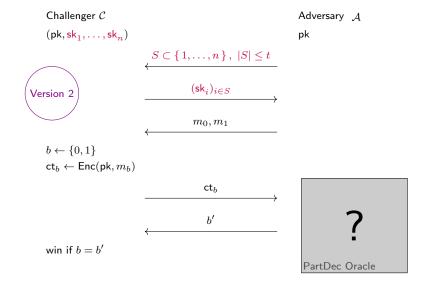


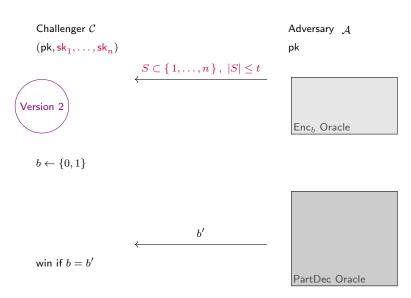


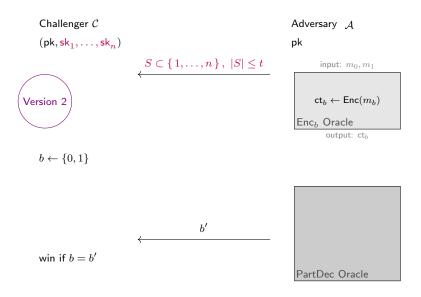


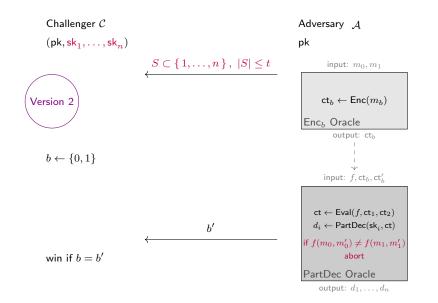


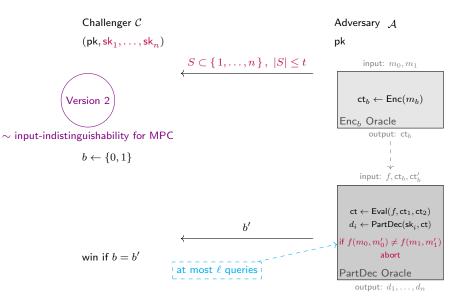
Problem: queries to PartDec oracle are independent of ct_b











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Conclusion

Wrapping Up

My intuition on Rényi divergence:

- In search problems always beneficial
- In decision problems depends on your setting

Related Works:

- [CSS⁺22] Use Rényi divergence directly for IND-CPA, but much weaker model
- [LMSS22] Use Rényi differential privacy for IND-CPA, but much worse parameters

Open Problems:

- ullet Adaptive corruptions o Master project Michael & Magdalena
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Thank you.



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