

Drifting Towards Better Error Probabilities in Fully Homomorphic Encryption Schemes

Motivation

Challenges in FHE Deployments

- Performance overhead due to **noise accumulation**
- **Decryption failure probability** must be minimized
- Trade-offs between **efficiency, security, and correctness**

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Questions

- How do **decryption failures** impact practical security?
- Can we develop **low-overhead solutions** to reduce failure probability?
- How do our techniques improve **theoretical and applied security**?

Ciphertext Drift

Definition and Impact

What is Ciphertext Drift?

- Ciphertext drift refers to the **accumulation of small errors** introduced during modulus switching in FHE
- It occurs due to **rounding effects** when converting ciphertexts between different moduli

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Why Does Ciphertext Drift Matter?

- Drift increases **failure probability**, which can be exploited in certain adversarial scenarios
- Reducing drift often requires **larger cryptographic parameters**, increasing computational cost

Security Models in FHE

IND-CPA Standard security against chosen-plaintext attacks

IND-CPA^D Attacker has [very restricted] access to a decryption oracle

-  only decryption queries for which corresponding plaintext is known to the attacker are allowed

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Why Standard IND-CPA May Be Insufficient

- **FHE decryption failures** may reveal information about secret keys
- Attacks leveraging failure probabilities can break **security assumptions**

Noise Growth and Decryption Failures

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- **Practical impact on IND-CPA^D security**

- Attacker can craft (honestly generated or evaluated) ciphertexts to probe decryption failures
- Failure probabilities must be controlled at all computation steps

Ciphertext Drift & Modulus Switching

Ciphertext drift

- Accumulated error from rounding during modulus switching
- Leads to decryption failures and security vulnerabilities

Modulus switching

- Converts ciphertext modulus from q to q' through rescaling and rounding
- Essential step for bootstrapped FHE [FHEW, TFHE, FINAL, ...]
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- 👁 Increased drift raises failure probability
- 👁 Failure-aware adversaries can extract secret key information

Conventional IND-CPA parameters may not ensure IND-CPA^D security!

Our Techniques and Results

New Theoretical Insights

- Separation between **IND-CPA^D** and **sIND-CPA^D** security
- **Characterization** of failure probability in practical FHE schemes

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New Modulus Switching Methods

- **Controlled noise management** reducing failure probability
- Requires **no significant parameter inflation**

Illustration: The Case of LWE

Modulus Switching

Input: LWE-type ciphertext modulo q

$$\mathbf{C} \leftarrow (a_1, \dots, a_n, b) \in (\mathbb{Z}/q\mathbb{Z})^{n+1}$$

with $b = \sum_{i=1}^n a_i s_i + \Delta m + e_{in}$ and
where e_{in} is some input noise error

Output: LWE-type ciphertext modulo $2N$

$$\tilde{\mathbf{C}} \leftarrow (\tilde{a}_1, \dots, \tilde{a}_n, \tilde{b}) \in (\mathbb{Z}/2N\mathbb{Z})^{n+1}$$

with

$$\begin{cases} \tilde{a}_i = \lfloor \frac{a_i}{q} 2N \rfloor & \text{for } i \in \{1, \dots, n\} \\ \tilde{b} = \lfloor \frac{b}{q} 2N \rfloor \end{cases}$$

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Ciphertext Drift

Write

$$\begin{cases} a_i = \tilde{a}_i \frac{q}{2N} - \alpha_i \\ b = \tilde{b} \frac{q}{2N} - \beta \end{cases}$$

for some $\alpha_i, \beta \in \llbracket -\frac{q}{4N}, \frac{q}{4N} \rrbracket$

Then

$$(\tilde{b} - \sum_{i=1}^n \tilde{a}_i s_i - \frac{2N}{p} m) \bmod 2N =$$

$$\frac{\underbrace{(e_{in} + (\beta - \sum_{i=1}^n \alpha_i s_i))}_{e_{drift}} \bmod q}{q/2N}$$

Two Important Observations

- 1 An LWE ciphertext $(a_1, \dots, a_n, b)$ can be **publicly** re-randomized
 - simply add an encryption 0
- 2 The drift vector $(\alpha_1, \dots, \alpha_n, \beta)$ can be **publicly** computed
[Drift error cannot]

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Introducing Drift-Aware Modulus Switching (Public by Design)

- **Select a ciphertext representative**
 - by adding an encryption of 0 to the input ciphertext
- Use the **drift vector** to test the '**quality**' of the representative

(Repeat until a 'good' ciphertext is found)

Controlling the Drift

Probabilistic Approach

- For a **fixed** ciphertext $\mathbf{C} = (a_1, \dots, a_n, b)$ with drift vector $(\alpha_1, \dots, \alpha_n, \beta)$, corresponding drift error is $e_{\text{drift}} = \beta - \sum_{i=1}^n \alpha_i s_i$

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- We have

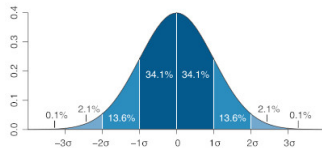
$$\begin{aligned}\mu &:= \mathbb{E}[e_{\text{drift}}] = \beta - \sum_{i=1}^n \alpha_i \mathbb{E}[s_i] \\ &= \beta - \frac{1}{2} \sum_{i=1}^n \alpha_i \\ \sigma^2 &:= \text{Var}(e_{\text{drift}}) = \sum_{i=1}^n \alpha_i^2 \text{Var}(s_i) \\ &= \frac{1}{4} \sum_{i=1}^n \alpha_i^2\end{aligned}$$

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$$p = \Pr[X \in [\mu - r\sigma, \mu + r\sigma]]$$

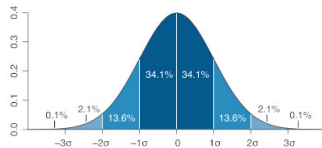
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9.16	2^{-64}
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Proposed 'Quality' Test

Check that

$$|\mu| + r\sigma \stackrel{?}{\leq} T$$

where T is a bound to the maximum allowed drift error

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Application

Parameter set	q	n	N	k	p_{err}	T	# trials	$p_{\text{err}}^{(\text{new})}$
$\mathfrak{Z}_b^{64}$	2^{64}	739	512	3	2^{-64}	$2^{59.67}$	50	$2^{-128.83}$
							100	$2^{-130.41}$
							1000	$2^{-134.75}$
$\mathfrak{Z}_{4b}^{64}$	2^{64}	834	2048	1	2^{-64}	$2^{57.76}$	50	$2^{-128.44}$
							100	$2^{-129.94}$
							1000	$2^{-134.02}$

Validation & Results

- Without our techniques
 - Failure probability is of $2^{-\kappa}$
- **With our techniques**
 - Failure probability is reduced to roughly $2^{-2\kappa}$



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Implications

- 👉 Exponential improvement in failure rate
- 👉 Unnoticeable performance penalty
- 👉 Enables stronger correctness guarantees for existing FHE schemes

Conclusion

Summary of Key Contributions

- Studied **ciphertext drift in FHE**
- Developed **novel modulus switching methods** reducing **failure probability**
- Strengthened FHE security models with **sIND-CPA^D refinements**

📖 Read the full paper at [ePrint 2024/1718](#)

Contact and Links

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- _____ Community

