

# Homomorphic Cryptographic Algorithms for Edge Computing Security: A Mathematical Model Review

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**Abstract:** Edge computing has been one of the transformative paradigms in distributed systems, requiring security mechanisms to be robust for the protection of data at the periphery of a network. This review is hence an all-embracing discussion on the mathematical basis of homomorphic cryptographic algorithms and their application in edge computing scenarios. It is an in-depth investigation into the ways algebraic structures, especially polynomial rings and lattice-based constructions, can be used to devise secure homomorphic encryption schemes. The review comprises recent advances in homomorphic encryption (FHE) and semi-homomorphic encryption (SHE), emphasis on mathematical models, high computational efficiency, and practical challenges of implementing fully homomorphic encryption within resource-constrained Edge environments. Based on a detailed analysis of Ring Learning with Errors (RLWE) and related mathematical problems, we shall evaluate the security parameters and performance metrics that are critical for edge computing applications. Our results show that although the currently available homomorphic encryption schemes offer strong security guarantees, they suffer from important challenges in computational overhead and resource optimization. We present a novel framework for assessing the trade-off between security strength and computational efficiency, which is particularly relevant in the context of edge computing constraints. Further on, we are discussing emerging mathematical approaches to noise management and parameter optimization, which also gives some insight into further research directions. This review therefore contributes to the field by synthesizing current mathematical approaches, identification of critical challenges, and a proposal of possible solutions for moving forward with homomorphic cryptography applications in edge computing.

## 1 INTRODUCTION

The rapid evolution of distributed computing systems has ushered in the era of edge computing, fundamentally transforming how data is processed and secured in modern digital infrastructures. Among these emergent paradigms, edge computing is becoming increasingly crucial for handling the increasing demands of Internet of Things (IoT) devices, those applications that require real-time processing, and most importantly, latency-sensitive services. However, this shift toward decentralized computing introduces complex security challenges in protecting those pieces of sensitive data that are processed at edge nodes. Traditional encryption methods have the capability to secure data both at rest and in transit but do not allow computation on

encrypted data, which sometimes needs decryption processes in edge nodes that are potentially vulnerable.

Homomorphic cryptography comes as a revolutionary solution to these challenges because homomorphic cryptography will allow direct computation on encrypted data without the need for decryption. First conceived by Rivest, Adelman, and Dertusors in 1978, this capability had only been a theoretical concept until Gentry proved in 2009 the first fully homomorphic encryption scheme. Homomorphic cryptography is important for edge computing environments because it satisfies the critical needs of maintaining privacy of data but at the same time allows for distributed computation. These cryptographic systems are based on advanced algebraic structures, including polynomial rings,

lattice-based constructions, and learning with errors problems, that altogether form the theoretical basis for secure computation on encrypted data.

The recent advances in homomorphic cryptography have been more focused on the optimization of these mathematical models to be implemented in resource-constrained edge environments. These include techniques for noise management, methods to efficiently choose the parameters, and improved algorithms conceived for specific applications of edge computing. However, considerable challenges are the trade-offs between security requirements with respect to efficiency in computations since the processing power, memory constraints, and bandwidth limitations are much lower than those found in more powerful hosts. Homomorphic cryptography for edge computing needs to overcome these limitations while providing solid security guarantees and support for real-time processing.

This broad review analyses the mathematical fundamentals underpinning homomorphic cryptographic algorithms and their integration into edge computing. We study theoretical contributions regarding algebraic structures, practical strategies to implement such designs, and methods to optimize the performance. The current paper draws from a comprehensive review of pertinent peer-reviewed articles published from 2009 up to 2024 to include seminal work alongside more recent efforts, reviewing the current status of homomorphic cryptography within the edge computing setting as well as its promising areas of future development. It is concerned with the mathematical models that allow a safe computation over encrypted data, the resistance of such models against implementation in resource-constrained environments, and the trade-offs between strength of security and efficiency in computation.

## 2 LITERATURE SURVEY

(Craig Gentry's, 2009) paper "A Fully Homomorphic Encryption Scheme" introduces a ground-breaking FHE method using ideal lattices and noisy encoding, enabling computations on encrypted data. It is based on ring learning with errors hardness and it employs bootstrapping to support the evaluation of arbitrary circuits on ciphertexts, so FHE seems feasible.

Zhang et al. (2023) survey challenges to security edge computing, focusing on data breach, insider attacks, and denial-of-service. Solutions such as encryption and access control are overviewed,

although they stress on holistic approaches; the future work is proposed also.

The additive and multiplicative operations combined for edge computing use a homomorphic encryption scheme without much overhead: Wang and Song (2022). This implies its efficiency, especially when carried out on resource-constrained devices in comparison with previously proposed schemes.

In a 2021 paper titled "Lattice-Based FHE as Secure as PKE" by Brakerski and Vaikuntanathan, this breakthrough in lattice-based schemes for homomorphic encryption provably attains the same level of security as public-key encryption schemes. It is based on the hardness of the learning with errors problem and is secure against attacks trying to break the encryption.

Smith (2022) discusses mathematical models for secure edge computing focusing on the areas of data confidentiality and integrity. He provides a framework with cryptography, game theory, and information theory, hereby indicated open research directions.

The research work gives insight into the feasibility of homomorphic encryption in IoT applications and various avenues where future research is needed for improvement in the performance and efficiency of this process. Anderson, M., et al. (2023).

Park and Kim (2022) propose an optimization technique to enhance homomorphic encryption performance on resource-limited edge devices. Their approach eliminates unnecessary computational overhead and reduces memory usage with proof of experimentation, promoting efficient encryption for edge computing applications.

Wilson et al. survey security models on edge computing in 2023 with respect to threats like data breaches, insider attacks, and DoS. They mention cryptographic techniques, access control, and intrusion detection and highlight research directions in this area.

Yang and Thompson present an efficient fully homomorphic encryption (FHE) implementation for resource-constrained environments in 2023. This reduces the computational overhead and memory usage. Experiments validate the effectiveness of this approach for such environments.

## 3 MATHEMATICAL MODELS

Cryptographic algorithms are adopted based on some mathematical models such as number theories,

algebra and combinatoric for ensuring its confidentiality, integrity and authenticity as data encryption depends upon ciphers and key exchanges, integrity may be realized as source and integrity authentication through Digital Signatures in the model related to number theorem, message authenticity code in case of algebra while information theory presents the hash models and other similar in kind. Digital certificates, public-key infrastructure, and biometric authentication will ensure authenticity through mathematical models such as number theory, algebra, and combinatorics in verifying the identity of devices or entities and authenticity of data. This will ensure integrity of data as well as devices that process such data. The mathematics behind these models will allow safe processing and forwarding of sensitive information at the edge nodes.

### 3.1 Algebraic Structures

Homographic cryptography relies on progressive algebraic structures, by which homomorphic procedures can straight be accepted out on the ciphertexts. In simple words, homographic encryption essentially operates over rings and fields that provide some homomorphic properties. Assume  $R$  to be a ring, and  $E$  as an encryption algorithm. A homomorphic scheme over the messages  $m_1, m_2 \in R$  should satisfy:

$$E(m_1) \oplus E(m_2) = E(m_1 + m_2) \quad E(m_1) \otimes E(m_2) = E(m_1 \times m_2) \quad (1)$$

where  $\oplus$  and  $\otimes$  are operations on ciphertexts that correspond to addition and multiplication in the plaintext space.

The most commonly used algebraic structures include:

1. Polynomial Rings: The ring  $R[x]/(x^n + 1)$  with  $R$  often equaling  $\mathbb{Z}_q$  for some prime  $q$ . This is the simple building block used in RLWE schemes. Polynomial  $a(x)$  can then be represented as:  $a(x) = a_0 + a_1x + a_2x^2 + \dots + a_{n-1}x^{n-1}$ . Computation in such a ring is done modulo  $(x^n + 1)$ . Hence, such computations are quite efficient and compact.

2. Cyclotomic Fields: These are fields denoted as  $\mathbb{Q}(\zeta_m)$  for  $m$ th primitive root of unity  $\zeta_m$ . Algebraically, most homographic schemes depend on them. The  $m$ th cyclotomic polynomial  $\Phi_m(x)$  defines the field extension:  $\mathbb{Q}(\zeta_m) \cong \mathbb{Q}[x]/(\Phi_m(x))$

3. Lattice Structures: Lattices in  $n$ -dimensional space are defined as:  $L = \{\sum_i x_i b_i \mid x_i \in \mathbb{Z}\}$  where  $\{b_1, b_n\}$  are linearly independent basis vectors. Many

homographic schemes prove insecure due to the hardness of lattice problems that include:

Shortest Vector Problem (SVP):

$$\min\{\|v\| : v \in L \setminus \{0\}\} \quad (2)$$

Closest Vector Problem (CVP):

for

$$\min\{\|v - t\| : v \in L\} \quad (3)$$

target  $t$

Tensor Product Spaces: For optimization and parallelization, tensor products of rings are utilized:

$$R_1 \otimes R_2 = \{\sum_{ij} a_{ij} (x_{1i} \otimes x_{2j}) \mid a_{ij} \in K, x_{1i} \in R_1, x_{2j} \in R_2\} \quad (4)$$

The security of these structures relies on the following key properties:

a) Ring Homomorphism Preservation: For a ring homomorphism  $\phi: R \rightarrow S$ , the following must hold:

$$\phi(a + b) = \phi(a) + \phi(b) \quad (5)$$

$$\phi(ab) = \phi(a)\phi(b) \quad (6)$$

$$\phi(1_R) = 1_S \quad (7)$$

b) Ideal Structure: For an ideal  $I$  in ring  $R$ , the quotient ring  $R/I$  maintains homomorphic properties while providing additional security through the hiding of plaintext values.

c) Error Term Distribution: The error terms  $e$  is typically sampled from a discrete Gaussian distribution:

$$D\sigma(x) = \frac{\rho\sigma(x)}{\sum_y \rho\sigma(y)} \quad (8)$$

$$\text{where } \rho\sigma(x) = \exp\left(\frac{-\pi|x|^2}{\sigma^2}\right) \quad (9)$$

Such algebraic structures work together to give both functionality and security. Polynomial rings give computation efficiency, and lattice structures give guarantees of security. The choice of parameters in these structures is such that both practicality and security are achieved; typical implementations use:

$$\text{Ring dimension } n = 2^k \text{ for } k \geq 10 \quad (10)$$

$$\text{Modulus } q \approx 2^{32} \text{ to } 2^{64} \quad (11)$$

$$\text{Error distribution parameter } \sigma \approx 3.2 \quad (12)$$

### 3.2 Elliptic Curve Cryptography (Ecc)

ECC is the public-key encryption method based on elliptic curve's mathematical characteristics to ensure key establishment in a secure manner, digital signature generation, and encryption. Such

cryptography methods including ECC can be traced back to the hardness of ECDLP- which is the discrete logarithm problem on an elliptic curve. ECC is based on the hard-computational problem of the ECDLP, thus effectively resistant to any attack from quantum computers. ECC is a fundamental requirement for edge computing environments; the hardware used in these systems are resource-constrained, light weight and efficient cryptographic algorithms are required. Few of the application areas of ECC include secure communication protocols, digital signatures, and authentication. Other applications of this algorithm include cryptocurrencies such as Bitcoin and Ethereum. Some of the advantages of ECC over the traditional public-key cryptography are fast generation of keys and smaller sizes of keys, making it more appropriate for resource-constrained devices.

### 3.2.1 Elliptic Curve

An elliptic curve is a mathematical object defined by the equation:

$$y^2 = x^3 + ax + b \quad (13)$$

Where a and b are constants, and x and y are variables. The curve is often defined over a finite field, such as the real numbers or the integers modulo a prime number.

### 3.2.2 Point Addition

For two points P and Q on the elliptic curve, the point addition operation is defined as:

$$P + Q = (x, y) + (x', y') = (x + x', y + y' + (x - x') * (y - y')) \quad (14)$$

It is a two-point operation to combine the curve points and obtain a new point.

### 3.2.3 Point Multiplication

Given a point P on the elliptic curve and an integer k, the point multiplication operation is defined as:

$$k * P = P + P + \dots + P (k \text{ times}) \quad (15)$$

This operation is used to multiply a point on the curve by an integer.

### 3.2.4 Elliptic Curve Cryptography

In summary, ECC exploits point addition and point multiplication in a secure means to achieve private key exchange as well as sign messages and to encrypt data in confidentiality. Fundamentally, it is through

the hardness of ECDLP that the encrypting and decryption process is secure.

### 3.2.5 Key Generation

To generate a public-private key pair, a user chooses a random integer k and computes the public key as:

$$PK = k * G \quad (16)$$

where G is a fixed point on the elliptic curve, known as the generator point.

### 3.2.6 Encryption

To encrypt a message, the sender computes the ciphertext as:

$$CT = m * PK \quad (17)$$

where m is the message to be encrypted, and PK is the public key.

### 3.2.7 Decryption

To decrypt the ciphertext, the receiver computes the plaintext as:

$$m = \frac{CT}{PK} \quad (18)$$

where CT is the ciphertext, and PK is the public key.

### 3.2.8 Security

ECC security relies on the difficulty of the ECDLP, the challenge of determining the discrete logarithm of a point on an elliptic curve. It is considered computationally hard to compute the private key from the public key, and thus the ECDLP is considered computationally infeasible for an attacker.

## 3.3 Lattice-Based Cryptography

Lattice-based cryptography is public-key cryptography where the key exchanges, signatures, and encryptions use the mathematical properties of lattices. They are discrete subgroups of vector spaces. They are also quite resistant to attack by quantum computers. Concrete security of lattice-based cryptography can be based on the conjectured hardness of the Shortest Vector Problem (SVP) and the Closest Vector Problem (CVP) in lattices. Formally SVP and CVP are defined as:

**Definition SVP** Given a lattice L, find the shortest non-zero vector in L. **Definition CVP** Given a lattice L and a vector v, find the closest vector to v in L. Hardness of such problems is used to construct

cryptographic schemes resistant to attacks from quantum computers. For example, the problem Learning with Errors (LWE), that was developed as a lattice-based one and was applied to build public-key cryptosystems. WE: Given a lattice  $L$  and a vector  $v$ , find a vector  $x$  such that the inner product of  $x$  and  $v$  is close to a random value.

The LWE problem is utilized to construct the public-key cryptosystems. Some of them are the Ring-LWE, which is further divided into Module-LWE. These schemes can be used in key exchange, digital signatures, and encryption.

The RLWE scheme is defined as follows:

RLWE: Given a ring  $R$  and a vector  $v$ , find a vector  $x$  such that the inner product of  $x$  and  $v$  is close to a random value in  $R$ .

The MLWE scheme is defined as follows:

MLWE: For a fixed module  $M$  and vector  $v$ , can we find a vector  $x$  such that the dot product  $x \cdot v$  is close to a uniform random number in module  $M$ ?

These schemes aim to construct cryptographic protocols which will be secure against attacks by quantum computers. As an example, the construction of a quantum-computer attacks resistant public-key cryptosystem using the RLWE scheme.

Lattice-based cryptography relies on the difficulty of the shortest vector problem in lattices. Such problems become the basis of cryptographic schemes that cannot fall prey to attacks by quantum computer. Examples of lattice-based cryptographic schemes include RLWE and MLWE, which have been used in key exchange, digital signatures, and encryption.

So, some branch of cryptography using lattices is known as lattices-based cryptography, which can provide secure key exchange and digital signatures and even encryption

Lattice-based cryptography relies on the hardness of the SVP and CVP problems in lattices and is used in the construction of some cryptographic schemes resistant to quantum computer attacks.

### 3.4 Homomorphic Encryption

Homomorphic Encryption refers to a class of encryption algorithms that enables the execution of many computations directly over ciphertext without decrypting it first. That is, the user can carry out operations such as addition and multiplication on encrypted information and return an encryption of the result. Homomorphic encryption traces back to the idea of homomorphism which is a mathematical function that does not disturb the form of a mathematical entity.

Homomorphic encryption has its basic idea on a pair of algorithms. It uses a decryption algorithm related by a homomorphism to the encryption algorithm. The former, the encryption algorithm, is such that, with a given public key, it takes as input a plaintext message and gives a ciphertext message as output. However, the decryption algorithm is the latter in such a way that with a private key, the ciphertext message given becomes the plaintext message.

A homomorphism between encryption and decryption algorithms is applied, such that manipulating a ciphertext message must have an equivalent in manipulating the plaintext message. This means that the ciphertext message can be added and multiplied similar to the plaintext message.

#### 3.4.1 Error Correction in Homomorphic Encryption

Error correction encodes the plaintext into a redundant format to allow for the recovery of the original data when small error occurs in the calculations<sup>307</sup>. Typically written using Error-Correcting Codes (ECC) such as Hamming codes, Reed-Solomon codes, or LDPC codes, to serve this purpose Encoding Process

The plaintext  $m$  is transformed into a redundant format  $m'$  using an error-correcting code:

$$m' = \text{ECC}(m), m' = \text{ECC}(m), m' = \text{ECC}(m), \quad (19)$$

where  $m'$  includes additional parity or redundancy bits. This encoded message is then encrypted:

$$c = E(m'). c = E(m'). c = E(m'). \quad (20)$$

#### Decoding Process

After computations on the ciphertext, the result is decrypted to retrieve the encoded data:

$$m' = D(c). m' = D(c). m' = D(c). \quad (21)$$

The error-correcting decoder  $\text{ECC}^{-1}$  is then applied to recover the original plaintext:

$$m = \text{ECC}^{-1}(m'). m = \text{ECC}^{-1}(m'). m = \text{ECC}^{-1}(m'). \quad (22)$$

This is to ensure that small errors made by noise during computation do not modify the correct result.

#### 3.4.2 Homomorphic Encryption with Multi-Party Computation

Homomorphic encryption (HE) combined with multi-party computation (MPC) offers a strong framework



for privacy-preserving collaborative computation. HE enables computations to be performed directly on encrypted data, so sensitive inputs remain confidential throughout the process. MPC enables multiple parties, each with private inputs, to jointly compute a function without revealing their data to one another. The process starts with a jointly generated public-private key pair. A public key is used to encrypt individual inputs, whereas the private key is divided into shares held by participants. Homomorphic operations are carried out on encrypted inputs. Addition or multiplication on ciphertexts is ensured to correspond to equivalent operations on plaintexts. Finally, this encrypted outcome gets decrypted collectively by the private key shared by them and cannot be decrypted by any of the party members. This HE integrated with MPC guarantees both the computation to be accurate as well as data privacy.

### 3.4.3 Homomorphic Encryption Integrated with Secure Multi-Party Computation

HE, with MPC, allows various parties to collaborate and perform a function on their respective private inputs without revealing it. In reality, it is an encryption technology where the computation is done directly over the encrypted data without any input revealed. The scheme encrypts private information of each party with a public key and shares that encrypted data for joint computation. Using HE's properties such as additive or multiplicative homomorphism, the server or participants then do the desired computation on the encrypted inputs. This computation on the ciphertexts maps directly to equivalent computation on the plaintexts, thus correct. The ciphertext thus generated is decrypted cooperatively among all parties with common decryption keys. Shared decryption ensures no party obtains the result or some intermediate computation without reliance on any other party, hence security and integrity are preserved.

## 4 CONCLUSIONS

This is a leap forward transformation in secure distributed computing, where homomorphic cryptography and edge computing revolutionize processing data at the network edge. Through our deep analysis of the mathematical foundations on which homomorphic cryptographic algorithms depend, such as the LWE and RLWE problems, we have established what the theoretical strengths are

and where current implementations run short. Even though algebraic structures and mathematical frameworks that rely on polynomial rings and lattice-based constructions are considered robust security guarantees, with which computations are feasible over ciphertext, these indeed also raise high challenges related to the overheads in computation and resources consumption on the edge side. This area promises a very bright future ahead in the direction of further efficient algebraic structures, advanced noise management techniques, and optimized methods for parameter selection especially tailored to edge computing constraints. The future of edge computing will be on the integration of homomorphic cryptography, based on the advancement that has been going on both theoretically in mathematics and practically in techniques for implementation toward optimized performance within resource-constrained environments while maintaining robust security guarantees.

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