BeeHive: Double Non-interactive Secure Multi-party Computation

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Abstract

In this paper, we focus on the research of non-interactive secure multi-party computation (MPC). At first, we propose a fully homomorphic non-interactive verifiable secret sharing (FHNVSS) scheme. In this scheme, shareholders can generate any-degree polynomials of shared numbers without interaction, and the dealer can verify whether shareholders are honest without interaction. We implemented the FHNVSS scheme in Python with a detailed performance evaluation. According to our tests, the performance of FHNVSS is satisfactory. For instance, when the request is a 10-degree polynomial of secret value, generating a response takes about 0.0017263 s; verifying a response takes about 0.1221394 s; recovering a result takes about 0.0003862 s. Besides, we make a extension on the FHNVSS scheme to obtain a double non-interactive secure multi-party computation, called BeeHive. In the BeeHive scheme, distrustful players can jointly calculate a any-degree negotiated function, the input of which are inputs of all players, without interaction, and each player can verify whether other players calculate honestly without interaction. To the best of our knowledge, it is the first work to realize that players can jointly calculate any-degree function, the input of which are inputs of all players, without interaction.

Keywords: MPC, verifiable secret sharing, non-interactive, homomorphism.

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## 1. Introduction

Secure multi-party computation (MPC) [1] is a significant technology, where distrustful players compute an agreed function of their inputs in a secure way. Even if some malicious players cheat, MPC can guarantee the correctness of output as well as the privacy of players' inputs.

There is a long-term problem that all existing information-theoretic secure MPCs have large round and communication complexity [2, 17, 3, 7, 8, 9, 10, 11, 12, 13, 14, 15]. In these constructions, it is the case that multiplication gates require communication to be processed (while addition/linear gates usually do not). In CRYPTO 2016, Damgård et al. [17] proposed that the number of rounds should be at least the (multiplicative) depth of the circuit, and the communication complexity is O(ns) for a circuit of size s (n and s are the number of participants and the number of multiplication gates respectively).

Specifically, the issue of round and communication complexity existed because all such protocols follow the same typical "gate-by-gate" design pattern [17]: Players work through an arithmetic (boolean) circuit on secretly shared inputs, such that after they execute a sub-protocol that processes a gate, the output of gate is represented as a new secret sharing among these players. In particular, a Multiplication Gate Protocol (MGP) basically takes random shares of two values a, b from a field as input and random shares of ab as output.

In this paper, we mainly focus on non-interactive secure MPC, where players can jointly calculate a negotiated function, the input of which are inputs of all players, without interaction.

## 1.1. Our Results

- Our contributions are summarized as follows:
  - We present a fully homomorphic non-interactive verifiable secret sharing (FHNVSS) scheme. In the scheme, shareholders can generate any-degree polynomial of shared numbers without interaction, and the dealer can

verify whether shareholders are honest without interaction. A security analysis of FHNVSS schem is presented.

- We present detailed performance evaluation of FHNVSS scheme by deploying it on a Ubuntu 16.04 environment laptop in Python. According to our tests, the performance of FHNVSS is satisfactory. For instance, when the request is a 10-degree polynomial of shared numbers, generating a response takes about 0.0017263 s; verifying a response takes about 0.1221394 s; recovering a result takes about 0.0003862 s.
- We propose a *Double Non-interactive Secure Multi-party Computation*, called BeeHive. In this BeeHive scheme, distrustful players can jointly calculate an any-degree negotiated function, the input of which are inputs of all players, without interaction, they can verify correctness of responses sent by other players without interaction. A security analysis of BeeHive is given.

# 1.2. Related Work

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The round complexity and communication complexity of secure MPC have been two fundamental issues in cryptography. There are many studies about these two aspects. In this subsection, we will present related work about our study at first, then some comparisons between our previous paper [26] and this paper will be presented.

Round complexity. The round complexity of an ordered gate-by-gate protocol must be at least proportional to the multiplicative depth of the circuit [7]. The work of constant-round protocols for MPC was initially studied by Beaver et al. [18]. Subsequently, a long sequence of works constructed constant-round MPCs (e.g., 2-round [19, 15, 27, 3], 3-round [20], 4-round [21, 7, 12], 5-round [22, 16, 8] and 6-round [22]). In particular, in Eurocrypt 2004, Katz and Ostrovsky [16] established the exact round complexity of secure two-party computation with respect to blackbox proofs of security. In CRYPTO 2015, Ostrovsky et al. [12] provided a 4-round secure two-party computation protocol

based on any enhanced trapdoor permutation, and Ishai et al. [15] obtained several results on the existence of 2-round MPC protocols over secure point-to-point channels, without broadcast or any additional setup. In Ecrypt 2017, Garg et al. [8] proposed several 5-rounds protocols by assuming quasi-polynomially-hard injective one-way functions (or 7 rounds assuming standard polynomially-hard collision-resistant hash functions). However, our scheme can solve any request of any-degree polynomial of secret numbers in 1-round.

Communication complexity. Initially, Rabin et al. [23] proposed that: To securely compute a multiplication of two secretly shared elements from a finite field based on one communication round, players have to exchange  $O(n^2)$  field elements since each of n players must perform Shamir's secret sharing as part of the protocol. After that, Cramer et al. [24] further proposed a twist on Rabin's idea that enables one-round secure multiplication with just O(n) bandwidth in certain settings, thus they reduced the communication complexity from quadratic to linear. Recently, in CRYPTO 2016, Damgård et al. [17] further presented that: In the honest majority setting, as well as for dishonest majority with preprocessing, any gate-by-gate protocol must communicate O(n) bits for every multiplication gate, where n is the number of players. While, servers (shareholders) of our scheme can generate responses of any-degree polynomial of secret numbers without any interaction.

Comparisons with [26]. Recently, in Ref.[26], we proposed a secure multi-party computation scheme, where shareholders can generate shares of two-degree polynomials of secret numbers without interaction. Temporarily, the secure MPC scheme proposed in [26] is called Pre-Scheme, and it has the following limitations:

Servers (shareholders) can only generate shares of two-degree polynomial
of secret numbers. In other words, servers cannot get any shares of kdegree (k > 2) polynomial of secret numbers.

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• Pre-Scheme used the pairing (pairing is an expensive computation) to verify the correctness of responses (these responses are shares of two-degree

polynomial of secret numbers) sent by servers.

- [26] did not include a complete security analysis of Pre-Scheme.
- 90 Compared with the Pre-Scheme, improvements of BeeHive are as follows:
  - Theoretically, distrustful players can jointly calculate any-degree negotiated function, the input of which are inputs of all players, without interaction.
  - Each player can verify other players compute honestly. In this verification process, BeeHive does not use pairing to verify responses of players, while Pre-Scheme used.
    - We will present a complete security analysis of BeeHive. Moreover, this proof is also valid for the Pre-Scheme [26].

Organization. The remainder of the paper is organized as follows. An overview of FHNVSS and BeeHive is shown in Sec.2. Sec.3 briefly presents preliminaries. We introduce the FHNVSS scheme without verifiability and the verifiability of FHNVSS in Sec.4.1 and Sec.4.2, respectively. A detailed performance evaluation is shown in Sec.5. A security analysis of FHNVSS is presented in Sec.6. Construction and security analysis of BeeHive are studied in Sec.7. Finally, a short conclusion is presented in Sect.8.

# 2. An Overview of fully homomorphic non-interactive verifiable secret sharing and BeeHive

In a fully homomorphic non-interactive verifiable secret sharing (FHNVSS) scheme, components include a dealer and a certain number of shareholders (servers). A (t, n) FHNVSS scheme works as follows:

• Step 1: The dealer generates n core-shares and a verification key (VK). After that, he opens VK, then anyone (including servers) can verify whether VK is correctly computed by dealer. If VK is invalid, then the dealer has

to regenerate the core-shares and VK, else the participants join in the next step.

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- Step 2: The dealer secretly sends these *n* core-shares to *n* servers respectively. After receiving a core-share, a server can verify whether his core-share is valid by using VK. If the server's core-share is invalid, then he can ignore it and ask dealer to resend a core-share to him.
- Step 3: The dealer encrypts secret numbers into encrypted numbers, then he sends the encrypted numbers to servers.
  - Step 4: When the dealer needs to get a result that is a polynomial of secret numbers, he will send a query to n servers.
  - Step 5: According to the query sent by dealer, an active server will independently generate a response with his core-share (this process has no interaction with other servers), then the server will send his response to dealer securely.
    - Step 6: After receiving responses, the dealer can verify whether responses are correctly computed by corresponding servers. These verifications do not need interaction with other servers. If a response is invalid, then the dealer can ignore this response or ask the corresponding server to resend a response to him. Finally, the dealer can recover the desired result if he can collect at least t correct responses.

The FHNVSS scheme mainly has the following features:

- Full homomorphism. Servers can perform efficient homomorphic additions and multiplications on encrypted numbers without decrypting them.
  - Confidentiality. Secret numbers shared by dealer are always confidential as long as less than t servers are malicious.
  - Verifiability. Verification key, core-shares and responses are verifiable.

 Verification key. When the verification key (VK) is opened, anyone can verify its validity.

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- Core-shares. When a server receives a core-share, he can verify whether this core-share is correctly computed by the dealer. Moreover, in this method, the malicious dealer and incorrect core-shares can be checked out.
- Responses. When the dealer gets a response sent by a server, the dealer would verify whether this response is correctly computed by the server. In this way, malicious servers and incorrect responses can be checked out.

By making an extension on the (n, n) FHNVSS scheme, we obtain a (n, n) BeeHive scheme, where n players can jointly calculate a negotiated function, the input of which are numbers shared by all players. Each player independently works as a dealer of (n, n) FHNVSS scheme to share his input among the n players, and he also works as a server of (n, n) FHNVSS scheme to jointly compute the negotiated function. The work process of a (n, n) BeeHive scheme is as follows:

- Step 1: Each player executes a (n, n) FHNVSS scheme independently. He generates n core-shares and a verification key (VK). In these n core-shares, one belongs to this player, and other n−1 will be sent to other n−1 players respectively in the next step. Each player opens his VK. Anyone (including other players) can verify whether the VK is correctly computed by its generator. If a VK is invalid, its generator has to regenerate his VK. Once all VKs are valid, all players join in the next step.
- Step 2: Each player secretly sends his n-1 core-shares (except his own core-share) to other n-1 servers respectively. After receiving a core-share, each player can verify whether this core-share is correctly computed by the sender via sender's VK. If a core-share is invalid, the receiver can ignore it and request corresponding sender to re-send it. Once all core-shares are

valid, all players join in the next step.

- Step 3: Each player encrypts his input into encrypted numbers, then he broadcasts these encrypted numbers.
  - Step 4: Players negotiate a function, which will be jointly calculated by players. Inputs of the negotiated function are inputs of all players.
  - Step 5: According to the negotiated function, each player can generate a response with his core-shares and encrypted numbers shared by players, then he broadcasts his response.
    - Step 6: After receiving a response, each player can verify whether this response is correctly computed via this sender's VK. This verification process does not need interaction. If a player receives an invalid response, then he can ignore it or request the corresponding player to re-send it.
    - Once a player collects n valid responses, he will recover the correct result of negotiated function.

## 3. Preliminaries

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In this section, we hope to present basic cryptography techniques of BeeHive and the adversary model.

# 3.1. Shamir's (t, n) Secret Sharing

Alice wants to secretly share a secret value s with n participants, and arbitrary t of the n participants can recover s, but less than t participants cannot get anything. In order do this, Alice needs to generate n shares of s, then secretly sends the n shares to the n participants respectively. After that, if someone can collect at least t correct shares, then he can recover the secret value s. This problem can be resolved by Shamir's (t,n) secret sharing (SSS) [28]. In this subsection, we will present the working process of the SSS.

Firstly, Alice randomly samples a polynomial f(x) of degree t-1 from  $\mathbb{F}_p[x]$ of p is a big prime number) as the following polynomial:

$$f(x) = a_{t-1}x^{t-1} + a_{t-2}x^{t-2} + \dots + a_1x + s,$$

where s is the secret value as well as  $a_1, \dots, a_{t-1} \in \mathbb{F}_p$ ,  $a_{t-1} \neq 0$ .

Secondly, let  $P_1$ ,  $P_2$ ,..., $P_n$  be the n participants and  $ID_i$  (i = 1, 2, ..., n) denote  $P_i$ 's address. Alice generates  $P_i$ 's share as follow:

$$Share_i = f(ID_i),$$

where i=1, 2, ...,n. Then, Alice secretly sends  $Share_1, Share_2, ..., Share_n$  to the n participants, respectively.

Finally, if someone collects t correct shares, then he can use the *lagrange* interpolation to reconstruct the polynomial f(x). Without loss of generality, let the t shares be  $Share_1$ ,  $Share_2$ , ..., $Share_t$ . He can reconstruct the polynomial f(x) as follow:

$$f(x) = \sum_{i=1}^{t} Share_i \prod_{j=1, j \neq i}^{t} \frac{x - ID_j}{ID_i - ID_j}.$$

Consequently, he can get s = f(0).

Addition homomorphism of SSS. SSS naturally has the additional homomorphism. It means that the sum of shares is the share of the sum of corresponding secrets. Moreover, the threshold number is always immutable during this process since the degree of the sum of shared polynomials is equal to the degree of shared polynomials. Therefore, if a dealer can collect threshold number of sum shares, he can reconstruct the corresponding polynomial and then get the sum of secrets. Consequently, SSS naturally has the additional homomorphism.

Multiplication homomorphism of SSS. Similarly, SSS naturally also has the multiplicative homomorphism. It denotes that the product of shares is the share of the product of corresponding secrets. However, the multiplicative homomorphism has a big limitation that is, with the degree growth of product of secrets, the degree result polynomial will become larger and larger. Under this process, it will eventually arrive at a threshold larger than n so that the

final result cannot be reconstructed. Finally, the multiplicative homomorphism of SSS is restricted.

## 3.2. Pairing

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In BeeHive, the pairing computation is only used in the verification process of verification key. After that, pairing will not be used anymore. Namely, it however will not be used in the verification processes of core-shares and responses.

Let  $\mathbb{G}$  and  $\mathbb{G}_T$  be the cyclic groups of a large prime order q. G is the generator of  $\mathbb{G}$ . A cryptography pairing [29] e (bilinear map):  $\mathbb{G} \times \mathbb{G} \to \mathbb{G}_T$  is a map that has a property of bilinearity. The bilinearity means that

$$e(aG, bG) = e(G, G)^{ab},$$

where  $a, b \in \mathbb{Z}_q$ .

Remark 1. In the proposed scheme, pairing is only used in verifying VK.

## 3.3. Adversary Model

In this subsection, we present the adversary models of FHNVSS and BeeHive. For a (t, n) FHNVSS scheme, which includes a dealer and n shareholders, we have the following assumptions:

- The dealer could generate the verification key (VK) and core-shares dishonestly, but he does not reveal any secret data to servers.
  - A server could generate a response dishonestly, but the number of dishonest players is less than t.

For a (n, n) BeeHive scheme, which includes n players, we have the following assumptions:

- A player could generate the verification key (VK) and core-shares dishonestly, but he does not reveal any secret data to other players.
- A player could generate responses dishonestly, but he does not reveal his input to other players.

# 4. Construction of Fully Homomorphic Non-interactive Verifiable Secret Sharing Scheme

In this section, we will present a fully homomorphic non-interactive verifiable secret sharing (FHNVSS) scheme. To clearly present the work process of FHNVSS, we will present the FHNVSS scheme without verifiability at first. Then we will give out the verifiability of FHNVSS. Finally, basic applications of FHNVSS combined with blockchain will be illustrated.

## 4.1. FHNVSS without verifiability

In this subsection, we will present the FHNVSS without verifiability, where data-senders (dealer and servers) are all honest. Namely, all data-recepients (servers and dealer) do not need to verify data received. While, in the next section, we will specifically show the verification processes of FHNVSS, where the dealer and servers could be dishonest, and a (t,n) FHNVSS will be taken as an example to present the scheme without verifiability. It contains a dealer and n servers. Let  $Sr_i$  denote the i-th server and  $ID_i$  be the ID of  $Sr_i$ .

## 4.1.1. Generation of Core-share, Request, Response and Result

Dealer randomly samples  $f_1(x), f_2(x), ..., f_k(x)$ , which are t-1-degree polynomials over  $\mathbb{F}_q$  as follows:

$$f_1(x) = w_{1,t-1}x^{t-1} + w_{1,t-2}x^{t-2} + \dots + w_{1,1}x + s$$
  

$$f_2(x) = w_{2,t-1}x^{t-1} + w_{2,t-2}x^{t-2} + \dots + w_{2,1}x + s$$
  
......

$$f_k(x) = w_{k,t-1}x^{t-1} + w_{k,t-2}x^{t-2} + \dots + w_{k,1}x + s$$

i from 1 to n, dealer computes core-share for server  $Sr_i$  as follows:

$$core - share_i = f_1(ID_i), f_2(ID_2), ..., f_k(ID_i).$$

Request Assume that the dealer wants to get the result  $V = \sum_{i=0}^{k} b_i s^i$ .

Therefore, he will send a request to n servers, then servers will generate responses for him. Specifically, the request includes the following numbers:

$$\{b_k, b_{k-1}, ..., b_1, b_0\}$$

According to the request, a server will know that the dealer wants to get  $\sum_{i=1}^{k} b_i s^i + b_0$ , but the server does not know the secret value s.

Responses If  $Sr_i$  is willing to respond the request, he will use his core 
share<sub>i</sub> to generate a response  $Resp_i$  as follow:

$$Resp_i = \sum_{j=1}^k b_j f_j(ID_i) + b_0.$$

Then,  $Sr_i$  sends  $Resp_i$  to the dealer secretly.

**Result** If the dealer can collect t valid responses like  $Resp_i$  from t servers, then he can use the Lagrange Interpolating to recover a t-1-degree polynomial H(x). Finally, the dealer can get the desired result  $\sum_{i=0}^{k} b_i s^i$  by computing  $H(x)|_{x=0}$ .

Remark 2. The value k of  $\sum_{i=0}^{k} b_i s^i$  is unlimited. Specifically, the dealer can purposefully set the k according to his requirements by providing enough coreshares to servers. Theoretically, servers of FHNVSS can process any-degree polynomials of secret numbers in theoretically as long as the dealer can provide enough core-shares to servers. For instance, servers can generate responses of 50-degree polynomials of secret number if their core-shares are similar to  $f_1(ID_i), f_2(ID_i), ..., f_{50}(ID_i)$ .

## 4.1.2. FHNVSS with Sharing Encrypted Numbers

The dealer has a set of secret numbers that are  $d_1, d_2, ..., d_m$ . After randomly sampling  $f_1(x)$  (f(x) is a (t-1)-degree polynomial and  $f_1(0) = s$ ), the dealer performs as follows:

• Encrypt  $d_1, d_2, ..., d_m$  into  $a_1, a_2, ..., a_m$  as follows:

$$a_j = d_j - s, j = 1, 2, ..., m.$$

- Generate core-shares  $(core share_1, core share_2, ..., core share_k)$ .
- Secretly sending  $core share_i$  to  $Sr_i$ , i from 1 to n.
- Open  $a_1, a_2, ..., a_m$ .

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After that, the dealer can send a request about the encrypted numbers  $a_1, a_2, ..., a_m$ , then servers can generate corresponding responses according to the request. According to this request and encrypted numbers, a server cannot get any information about the result desired by dealer since the server cannot get the key secret s. Next, we will present how dealer and servers work with  $a_1, a_2, ..., a_m$ .

At first, assume that: i) the maximum degree of addressable request is k, ii) the dealer has secretly sent  $core - share_i$  to  $Sr_i$ , i = 1, 2, ..., n, and iii) he has also opened  $\{a_1, a_2, ..., a_m\}$ . Then, servers can help the dealer to get any result like the following formula:

$$\sum_{t=1}^{w} \prod_{j=1}^{v_t} \mu_{t,d} d_{j_{t,d}},$$

where  $v_t \leq k$  and  $\mu_{t,d} \in \mathbb{F}_q$ ,  $j_{t,d} \in \{1, 2, ..., m\}$ . The dealer sends a string to servers like the following one:

$$\sum_{t=1}^{w} \prod_{j=1}^{v_t} \mu_{t,d}(X + a_{j_{t,d}}),$$

due to  $d_{j_{t,d}} = s + a_{j_{t,d}}$ .

After receiving the above request,  $Sr_i$  can transmit the string into a polynomial of x as follow:

$$W(x) = \sum_{t=1}^{w} \prod_{j=1}^{v_t} \mu_{t,d}(x + a_{j_{t,d}}) = \sum_{j=0}^{k} b_j x^j.$$

At this moment, the polynomial W(x) can be seen as the request mentioned in Sec. 4.1.1. Therefore, servers can use W(x) to generate responses, and the work of generating responses is the same as the corresponding work mentioned in Sec. 4.1.1.

# 4.2. Verifiability of FHNVSS

In Sec. 4.1, we described the FHNVSS without verification, and we assumed that data-senders (dealer and servers) are honest. However, in practical applications, data-senders might incorrectly compute data which would lead to the corresponding data-recepients generates wrong results. Therefore, data-recepients (servers or dealer) should verify whether received data (core-shares

or responses) are correctly computed by corresponding data-senders. In this way, malicious data-senders and incorrect data can be checked out. Therefore, in this section, we will present how data-recepients verify received data.

Specifically, compared with the FHNVSS without verifiability mentioned in Sec.4.1, the full FHNVSS scheme adds four parts: (i) the dealer generates and opens the verification key (VK); (ii) anyone can verify the correctness of VK; (iii) the server can verify the correctness of his core-share; (iv) the dealer can verify the correctness of responses sent by servers.

Without loss of generality, we take the (t,n) FHNVSS as an example to present the work process of verification. The (t,n) FHNVSS scheme contains a dealer and n servers as well as a server can respond at most k-degree request. Let  $Sr_1, Sr_2, ..., Sr_n$  denote the three servers. Furthermore, the dealer can recover the desired result if at least two servers generate valid responses to the dealer. Moreover,  $ID_i$  is the ID of  $Sr_i$ , i = 1, 2, ..., n. Furthermore, let g denote a generator of a cyclic group. We will use  $g^a$  to compute a commitment of g to hide g. In the next text, we will present how to verify verification key (VK), core-shares and responses.

#### 4.2.1. Verify Verification Key

Before the dealer sends the core-shares to servers, he would generates a verification key (VK) that will be used in the future verifications. The VK is constructed as follows:

• The dealer randomly samples  $f_1(x), f_2(x), ..., f_k(x)$  from  $\mathbb{F}_p[x]$ .  $f(x), f_2(x), ..., f_k(x)$  are polynomials of degree t-1 as follows:

$$f_{1}(x) = w_{1,t-1}x^{t-1} + w_{1,t-2}x^{t-2} + w_{1,1}x + s$$

$$f_{2}(x) = w_{2,t-1}x^{t-1} + w_{2,t-2}x^{t-2} + w_{2,1}x + s^{2}$$
.....
$$f_{k}(x) = w_{k,t-1}x^{t-1} + w_{k,t-2}x^{t-2} + w_{k,1}x + s^{k}$$
(1)

• Let  $CM_{\{f(x)\}}$  denote the commitments of coefficients of f(x). For in-

stance, when  $f(x) = w_3 x^3 + w_2 x^2 + w_1 x + w_0$ , then

$$CM_{\{f(x)\}} = \{g^{w_3}||g^{w_2}||g^{w_1}||g^{w_0}\}.$$

• The verification key (VK) is as follow:

$$VK = (CM_{\{f_1(x)\}}, CM_{\{f_2(x)\}}, ..., CM_{\{f_k(x)\}})$$

Let  $CM_X$  denote a commitment of X, which is a scalar. For instance,  $CM_a = g^a$ . According to constructions of VK,  $CM_s, CM_{s^2}, ..., CM_{s^k}$  are included in the VK. Therefore, a VK is valid iff j from 2 to k, if the following equation holds

$$e(CM_s, CM_{s^{j-1}}) = e(CM_{s^j}, g).$$

### 5 4.2.2. Verify Core-shares

Assume that the VK is valid and has been opened. The core-share of  $Sr_i$  is as follow:

$$core - share_i = (f_1(ID_i), f_2(ID_i), ..., f_k(ID_i)).$$

Because commitments of coefficients of  $f_1(x)$ ,  $f_2(x)$ , ...,  $f_k(x)$ , have been provided in VK as well as VK is valid, so  $Sr_i$  can verify his core-share<sub>i</sub> with VK and  $ID_i$ . Moreover, the verification processes of  $f_1(ID_i)$ ,  $f_2(ID_i)$ ,  $f_3(ID_i)$ , ...,  $f_k(ID_i)$  are similar to each other. i from 1 to n, j from 1 to k, if the following equation holds, then the  $f_j(ID_i)$  is valid.

$$g^{f_j(ID_i)} = \prod_{t=1} (CM_{w_{j,t}})^{ID_i^t} CM_{s^j}.$$

#### 4.2.3. Verify Responses

In FHNVSS, the dealer can verify whether a response is correctly computed by the corresponding server. In this subsection, we will take the case of request being  $\sum_{i=1}^{k} b_i s^i + b_0$  as an example to present the process of verifying response. Specifically, the dealer verifies the response  $Resp_i$  generated by  $Sr_i$  (i = 1, 2, ..., n) as follows:

According to Sec. 4.1.1, we know

$$Resp_j = \sum_{r=1}^k b_t(f_j(ID_i)) + b_0.$$

Consequently, the dealer can verify the  $Resp_i$  as follows:

• j = 1, 2, ..., k, compute  $CM_{f_i(ID_i)}$  as follows:

$$CM_{f_j(ID_i)} = \prod_{r=1}^{t-1} (CM_{w_{j,r}})^{ID_i^r} CM_{s^j}.$$

• j = 1, 2, ..., k, if the following equation holds, then the response  $Resp_i$  is valid.

$$g^{Resp_i} = \prod_{r=1}^{k} [CM_{f_r(ID_i)}^{b_r}CM_{b_0}.$$

## 5. Performance Evaluation of FHNVSS

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In this section, we will present a performance evaluation of FHNVSS by deploying it on a Ubuntu 16.04 environment laptop. Specifically, the FHNVSS was implemented in Python on a two core of a 2.60GHz Intel(R) Core (TM) i7-6500U CPU with 8G RAM. We used high-speed Python Pairing-Based Cryptography (PBC) library [30] to compute point multiplication of elliptic curve and pairing, and utilized Python GNU Multiple Precision (GMP) Arithmetic Library [31] to calculate big number computation.

In the our experiments, FHNVSS was divided into seven algorithms:

These algorithms are used as follows:

- Gen\_VK: Dealer uses Gen\_VK to generate verification key (VK).
- Ver\_VK: Servers can use Ver\_VK to verify the validation of VK.
- Gen\_CS: Dealer uses Gen\_CS to generate core-shares for servers.
- Ver\_CS: Servers can use Ver\_CS and VK to verify core-shares sent by dealer.

- Gen\_Resp: Servers can use Gen\_Resp to generate responses according to the request sent by dealer.
- Ver\_Resp: Dealer can use Ver\_Resp and VK to verify the validation of responses sent by servers.
  - Recover: Dealer can use Recover to recover desired result with the threshold number of valid responses.

In practical applications, these functions belong to different participants (dealer and servers). The affiliation of these functions is shown in Table 1.

Table 1: Functions of Participant

Participant	Functions of Participant	
Dealer	Gen_VK, Gen_CS	
	Ver_Resp, Recover	
Server	Ver_VK, Ver_CS, Gen_Resp	

We performed two types of tests as follows:

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- **Test 1:** We deployed (3,7) FHNVSS (a total 7 servers, and the desired result can be recovered with at least 3 valid responses) on our laptop. Let k be the largest degree of addressable request, we set k from 4 to 10. We tested the performance of  $Gen\_core\_share$ ,  $Gen\_VK$ ,  $Ver\_core\_share$  and  $Ver\_VK$ . The results of Test 1 are shown in Table 2.
- Test 2: We also deployed (3,7) FHNVSS on our laptop. Let the largest degree of addressable request be constant 10. We set the degree of request from 2 to 10. We tested the performance of *Rec\_result*, *Gen\_response* and *Ver\_response*. The results of Test 2 are shown in Table 3.

Table 2: Performance of algorithms of FHNVSS with the change of the largest degree of addressable request (second)

k	Gen_CS	Ver_CS	Gen_VK	Ver_VK
4	0.000329733	0.003045559	0.127948046	0.148387432
5	0.000474215	0.004627943	0.155535466	0.237745762
6	0.000656843	0.005952125	0.201929808	0.368674755
7	0.000918154	0.007400751	0.259971857	0.536798954
8	0.001402143	0.010572672	0.317357063	0.766717434
9	0.001489878	0.012337208	0.375114679	1.056947708
10	0.002088308	0.014226913	0.435570243	1.331381321
11	0.002505302	0.017073154	0.493043661	1.681715012
12	0.003757325	0.021838427	0.572894812	2.194091082

We deployed (3,7) FHNVSS to show the performance of algorithms Gen\_CS, Gen\_VK, Ver\_CS, Ver\_VK. **k** denotes the largest degree of addressable request. The finite field is based on a 256-bit big prime number.

## 6. Security Analysis of FHNVSS

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In this section, we will take the (t,n) FHNVSS as an example to discuss the confidentiality of the proposed FHNVSS, and the maximum degree of polynomial that the dealer can query is k. Because the FHNVSS is a threshold cryptography scheme, its confidentiality denotes that t-1 malicious servers cannot jointly recover the key secret value s. According to Sec. 4.1, the secretly shared polynomials are:

$$f_1(x), f_2(x), f_3(x), ..., f_k(x).$$

An honest server will secretly keep his core-share. For instance, if the server  $Sr_i \ (i=1,2,...,n)$  is honest, hi will secretly keep his core-share:

$$core - share_i = (f_1(ID_i), f_2(ID_i), f_3(ID_i), ..., f_k(ID_i)).$$

The t-1 malicious servers do not know anything about  $f_1(x), f_2(x), f_3(x), ..., f_k(x)$  except that  $f_1(x), f_2(x), f_3(x), ..., f_k(x)$  are (t-1)-degree polynomials. In other

Table 3: Performance of algorithms of FHNVSS with the change of degree of request (second)

Degree of request	Recover	Gen_Resp	Ver_Resp
2	0.000478268	0.001681805	0.007747173
3	0.000378373	0.001621246	0.016930582
4	0.000452042	0.001915455	0.023883823
5	0.000365019	0.001704931	0.032199383
6	0.000339508	0.001774073	0.049633026
7	0.000391245	0.001723289	0.065804005
8	0.000404119	0.001615524	0.081865788
9	0.000323057	0.001732349	0.096564293
10	0.000386238	0.001726389	0.122139454

We deployed (3,7) FHNVSS with the largest degree of addressable request being 10 to show the performance of algorithms Recover, Gen\_Resp, Ver\_Resp. Moreover, the finite field is based on a 256-bit big prime number.

words, they only know  $f_1(x), f_2(x), f_3(x), ..., f_k(x)$  have the following expressions, but they do not know their coefficients.

$$f_1(x) = w_{1,t-1}x^{t-1} + w_{1,t-2}x^{t-2} + w_{1,1}x + s$$

$$f_2(x) = w_{2,t-1}x^{t-1} + w_{2,t-2}x^{t-2} + w_{2,1}x + s^2$$
.....
$$f_k(x) = w_{k,t-1}x^{t-1} + w_{k,t-2}x^{t-2} + w_{k,1}x + s^k$$

Essentially, we want to discuss why the t-1 malicious servers cannot recover s by using their core-shares although they work jointly. Without loss of generality, we assume that  $Sr_1, Sr_2, ..., Sr_{t-1}$  are the t-1 malicious servers as well as other servers are honest. According to Sec. 4.1, we know that core-share kept by  $Sr_i$  (i=1,2,...,t-1) is  $(f_1(ID_i), f_2(ID_i), f_3(ID_i), ..., f_k(ID_i))$  as shown in Table 4.

In order to solve coefficients of  $f_1(x), f_2(x), f_3(x), ..., f_k(x)$ , the t-1 malicious

Table 4: Core-shares of servers

Server	$Sr_1$	$Sr_2$	 $Sr_{t-1}$
Core-shares	$f_1(ID_1)$	$f_1(ID_2)$	 $f_1(ID_{t-1})$ $f_2(ID_{t-1})$ $f_3(ID_{t-1})$
	$f_2(ID_1)$	$f_2(ID_2)$	 $f_2(ID_{t-1})$
	$f_3(ID_1)$	$f_3(ID_2)$	 $f_3(ID_{t-1})$
	$f_k(ID_1)$	$f_k(ID_2)$	 $f_k(ID_{t-1})$

servers can construct linear equations by using their core-shares as follows:

$$\begin{cases}
f_1(ID_1) = w_{1,t-1}ID_1^{t-1} + w_{1,t-2}ID_1^{t-2} + w_{1,1}ID_1 + s \\
f_1(ID_2) = w_{1,t-1}ID_2^{t-1} + w_{1,t-2}ID_2^{t-2} + w_{1,1}ID_2 + s \\
\dots \\
f_1(ID_{t-1}) = w_{1,t-1}ID_{t-1}^{t-1} + w_{1,t-2}ID_{t-1}^{t-2} + w_{1,1}ID_{t-1} + s
\end{cases} (2)$$

$$\begin{cases}
f_2(ID_1) = w_{2,t-1}ID_1^{t-1} + w_{2,t-2}ID_1^{t-2} + w_{2,1}ID_1 + s^2 \\
f_2(ID_2) = w_{2,t-1}ID_2^{t-1} + w_{2,t-2}ID_2^{t-2} + w_{2,1}ID_2 + s^2 \\
& \dots \\
f_2(ID_{t-1}) = w_{2,t-1}ID_{t-1}^{t-1} + w_{2,t-2}ID_{t-1}^{t-2} + w_{2,1}ID_{t-1} + s^2
\end{cases}$$
(3)

.....

$$\begin{cases}
f_k(ID_1) = w_{k,t-1}ID_1^{t-1} + w_{k,t-2}ID_1^{t-2} + w_{k,1}ID_1 + s^k \\
f_k(ID_2) = w_{k,t-1}ID_2^{t-1} + w_{k,t-2}ID_2^{t-2} + w_{k,1}ID_2 + s^k \\
\dots \\
f_k(ID_{t-1}) = w_{k,t-1}ID_{t-1}^{t-1} + w_{k,t-2}ID_{t-1}^{t-2} + w_{k,1}ID_{t-1} + s^k
\end{cases} (4)$$

For Eq.2, there are t-1 equations and t variables. The t variables are  $b_{t-1}^f, b_{t-2}^f, ..., b_1^f, s$ . Moreover, according to the theory of linear algebra, we know that s is a free variable. Namely, s can be any number. Consequently, s cannot be determined by Eq.2.

For Eq.3, there are t-1 equations and t variables. The t variables are  $b_{t-1}^{c_2}, b_{t-2}^{c_2}, ..., b_1^{c_2}, s$ . Moreover, according to the theory of linear algebra, we can also know that s is a free variable. Consequently, s cannot be determined by Eq.2 and Eq.3.

Similarly, for Eq.4, s is a free variable still. Consequently, s cannot be determined by Eq.2, Eq.3,..., Eq.4.

In a word, s is always un-determined, and the t-1 malicious servers cannot recover the key secret value s although they jointly work together.

#### 7. BeeHive

In this section, we will make an extension on (t,n) (t>2) FHNVSS to obtain a double non-interactive multi-party computation scheme, called BeeHive. In a (t,n) BeeHive scheme, n players jointly compute a negotiated function, the input of which are inputs of all players, but each player does not reveal his own input to others. Because the MPC scheme BeeHive is based on FHNVSS, properties of non-interactive and verifiability are same as FHNVSS. That is to say, players can jointly compute with inputs of all players without interaction; players can verify VK, core-shares and responses without interaction. The verification process of BeeHive can be simply obtained from FHNVSS. The construction of BeeHive will be presented first, then we will discuss the security of BeeHive.

## 440 7.1. Construction of BeeHive

A (t,n) BeeHive scheme includes n players  $(n \ge t > 2)$ . Each player works as a dealer of (t,n) FHNVSS to confidentially share his data with other players, and he also works as a server of FHNVSS to jointly compute a function negotiated by players, the input of which are data shared by all players. In the following content, we will take a (t,n) BeeHive as an example to present the work process of the scheme. Let these n players be  $P_1, P_2, ..., P_n$ .

• Step 1: i from 1 to n,  $P_i$  executes a (t, n) FUNVSS scheme among the n players independently. In this process all n players act as n servers of this

(t,n) FUNVSS scheme and the key secret sampled by  $P_i$  is  $s_i$ . Specifically,  $P_i$  executes algorithms  $\mathsf{Gen\_VK}$  and  $\mathsf{Gen\_CS}$  to generate a verification key  $(VK_i)$  and n core-shares  $(CS_{i,1},CS_{i,2},...,CS_{i,n})$  respectively. He opens the  $VK_i$  and securely sends  $CS_{i,j}$   $(j=1,2,...,n,\ j\neq i)$  to  $P_j$ , and he securely keeps the  $CS_{i,i}$ . The  $VK_i$  can be verified by other players with the algorithm  $\mathsf{Ver\_VK}$ . If  $VK_i$  is invalid,  $P_i$  has to re-generate this  $VK_i$ .  $CS_{i,j}$  can be verified by  $P_j$  with the algorithm  $\mathsf{Ver\_CS}$ . If  $CS_{i,j}$  is invalid,  $P_j$  can request  $P_i$  to re-send a  $CS_{i,j}$  until a valid core-share is received. Once each player opens a valid verification key and sends valid core-shares to other players, they join in the next step.

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- Step 2: i from 1 to n,  $P_i$  use his secret numbers  $(n_{i,1}, n_{i,2}, ..., n_{i,m_i})$  to generates his encrypted numbers  $(encn_{i,1}, encn_{i,2}, ..., encn_{i,m_i})$  by computing  $encn_{i,j} = cn_{i,j} s_i$  (j = 1, 2, ..., m) and sends them to other players. These numbers are as  $P_i$ 's input of the function negotiated by players in the next step.
- Step 3: These *n* players negotiate a function, which will be jointly calculated by them. The input this function are encrypted numbers shared by players. The function is a sum of *n* polynomials as follow:

$$\sum_{j=1}^{n} g_j(n_{j,1}, n_{j,2}, ..., n_{j,m_j}),$$

where  $g_j$  is a polynomial of  $n_{j,1}, n_{j,2}, ..., n_{j,m_j}$ .

- Step 4: i from 1 to n, j from 1 to n, according to the formula  $g_j$  of the negotiated function,  $P_i$  executes the algorithm Gen\_Resp to generate a response  $Resp_{j,i}$  with  $(CS_{j,i})$  and  $(encn_{i,1}, encn_{i,2}, ..., encn_{i,m_i})$ . After that, he adds all  $Resp_{1,i}$ ,  $Resp_{2,i}$ , ...,  $Resp_{n,i}$  to obtain the final response  $Resp_i$ . Then he broadcasts his response  $Resp_i$  to other players.
- Step 5: After receiving a response  $Resp_i$ , a player verifies it with  $VK_1, VK_2, ..., VK_n$ . Specifically, the player computes all  $CM_{g_1(ID_i)}, CM_{g_2(ID_i)}, ..., CM_{g_n(ID_i)}$ .

After that, the player multiples these commitments to obtain a commitment as follow:

$$CM_{final,i} = CM_{q_1(ID_i)}CM_{q_2(ID_i)}..., CM_{q_n(ID_i)}.$$

If  $CM_{final,i} = g^{Resp_i}$ , the response  $Resp_i$  is valid. If the response is invalid, the player can request the corresponding player re-send a response until a valid response is received.

• Step 6: If a player collects at least t valid responses, he can use Lagrangian interpolation to recover a polynomial H(x). Then the correct result of negotiated function is equal to  $H(x)|_{x=0}$ .

## 7.2. Security analysis of BeeHive

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In this subsection, we will discuss the security of (t, n) BeeHive  $(n \ge t > 2)$ .

- In a (t, n) BeeHive,  $P_i$ 's (i = 1, 2, ..., n) inputs are always confidential as long as the number of malicious players is less than t.  $P_i$ 's inputs are shared among  $P_1, P_2, ..., P_n$  via a (t, n) FHNVSS. A player can recover  $P_i$ 's inputs iff he can get t valid core-shares of  $P_i$  such as  $(CS_{i,1}, CS_{i,2}, ..., CS_{i,t})$ . However, this player cannot get these core-shares as long as the number of malicious players is less than t. Special case: In a (n, n) BeeHive,  $P_i$ 's inputs are always confidential as long as he does not reveal his  $CS_{i,i}$ . A player recovers  $P_i$ 's inputs iff he can get all core-shares  $CS_{i,1}$ ,  $CS_{i,2}, ..., CS_{i,n}$ . However, this player cannot get  $CS_{i,i}$  as long as  $P_i$  does not reveal it.
- Only-one jointly computing. In a (t,n) BeeHive, the number of honest players is at least t, t > 2. Honest players will not reveal their inputs. When a player is honest, the result of negotiated function includes at least two undetermined inputs, which are secretly kept by other honest players, for him. Consequently, this honest player cannot solve inputs of other honest players from result. When a player is malicious, the result includes at least three undetermined inputs, which are secretly kept by honest

players, for him. Therefore, he cannot solve inputs of honest players from result.

### • Multi-jointly computing with the same inputs.

- Negotiated functions cannot be used to increase the advantage for solving inputs of players. For instance, the following case is unallowed. The first function is as follow:

$$F_1 = x_1 + x_2 + x_3 + x_4$$
.

The second negotiated function is as follow:

$$F_2 = x_1 + x_2 + x_3 - x_4.$$

Any player can obtain  $x_4$  by computing  $(F_1 - F_2)/2$ .

In a (t, n) BeeHive, players can jointly compute at most t-2 functions with the same inputs. For instance, in a (4,5) BeeHive, five players are  $P_1, P_2, P_3, P_4, P_5$  and  $x_i$  is the input of  $P_i$  (i=1,2,3,4,5). According to our point, in this instance, players can jointly compute at most 2 negotiated functions with the same inputs. Because the protocol is of (4,5), it could includes a malicious player who is willing to reveal his input to others. For example, the malicious player is  $P_5$ . Therefore,  $x_5$  could be known by all players. Other four players are honest and they do not reveal their inputs. For anyone of honest players, the result of a negotiated function includes three undetermined inputs from other three honest players. Consequently, to keep inputs of honestly players being confidential, the number of negotiated functions is at most 2.

## 8. Conclusions

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In this paper, we propose a fully homomorphic non-interactive verifiable secret sharing (FHNVSS) scheme. In this scheme, shareholders can generate anydegree polynomials of shared numbers without interaction, and the dealer can verify whether shareholders are honest without interaction. We implemented the FHNVSS scheme in Python with a detailed performance evaluation. Besides, we make a extension on the FHNVSS scheme to obtain a double non-interactive secure multi-party computation, called BeeHive, where distrustful players can jointly calculate a any-degree negotiated function, the input of which are inputs of all players, without interaction, and each player can verify whether other players calculate honestly without interaction.

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