

# A novel privacy-preserving multi-attribute reverse auction scheme with bidder anonymity using multi-server homomorphic computation

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# ABSTRACT

With the further development of Internet, the decision-making ability of the smart service is getting stronger and stronger, and the electronic auction is paid attention to as one of the ways of decision system. In this paper, a secure multi-attribute reverse auction protocol without the trusted third party is proposed. It uses the Paillier public key cryptosystem with homomorphism and combines with oblivious transfer and anonymization techniques. A single auction server easily collides with a bidder, in order to solve this problem, a single auction server is replaced with multiple auction servers. The proposed scheme uses multiple auction servers to calculate the attributes under encryption protection and obtains the linear additive score function value finally. Since the attribute is calculated under the protection of encryption, the proposed scheme achieves privacy-preserving winner determination with bid privacy. Furthermore, the proposed scheme uses oblivious transfer and anonymization techniques to achieve bidder anonymity. In accordance with the security analysis, major properties, bidder anonymity and somewhat reducing collusion possibilities, are provided under the semi-honest model. According to a comparison of computation, the proposal's computation cost is reasonable.

KEY WORDS: Reverse multi-attribute auction • Privacy-preserving • Homomorphic encryption • Oblivious transfer.

# 1 INTRODUCTION

WITH the advent of networked smart devices and distributed information systems, the demand for new smart services is expected to increase as these services are now becoming an important part of our life. Networked smart devices and distributed information systems completely changed the people's traditional way of life[1-10]. Meanwhile, a variety of security and privacy issues associated with smart services and systems[11-21]. A security protocol can ensure the security of the smart service by using the cryptographic methods and it can perform a securityrelated function. In order to solve security and privacy issues associated with smart services and systems, many cryptographic protocols including real authentication[22-25], keyword search in encrypted cloud[26-29], verifiable data auditing in Cloud[30] are proposed. These approaches have played a very important role in security protocol design for smart services.

As an important part of economic activities, Auctions attract more and more people and entities rely on the auction to efficiently complete the sale of goods or services. The auction provides the buyer and the seller with the benefit maximization. Electronic auction as a new form of Internet auction, with low cost, convenience, fairness and other characteristics. But the electronic auction also faces some obstacles, such as information security issues.

In sealed auctions, the participants bid is not disclosed to others [31]. On the other hand, auction protocols can be classified into two types: one-sided auction and two-sided auction[32]. Only one seller or buyer can receive the multiple buyers or sellers bids in one sided auction protocol. After a long period of research and practice, one-sided sealed-bid auction protocol research has achieved a lot [33-37]. Recently, most researchers begin to use cryptography to ensure the security of auction, such as zero-knowledge proof [33-37] and secure multi-party computation[35]. Those techniques provide better bid privacy and winner public verifiability.

Currently, most researchers focus on singleattribute auction model. With the development of market demands, price, as the only determinant of the auction winner, has not met the needs. In comparison with single-attribute model auction, buyers and sellers can reap greater benefits in multi-attribute model auction[38].

Nowadays, multi-attribute model auction become more and more important in our fields of e-auction and it is a hot spot of the research in auction theory. The research of the multi-attribute needs to consider the security issue of online auction that researchers defined. Thus, various problems we should to deal with and consider how to solve them [33, 39-41]. The security requirements of OMOTE et al. [33, 39-41] and summarized as follows: anonymity, traceability, no framing, unforgeability, Non-repudiation, fairness, public verifiability, unlinkability among different rounds of an auction. Some details are not repeat here. To satisfy the requirements of people in auction, some research of multi-attribute can be summed as four parts. We need to considerate the computational complexity of winner determination [42, 43], procurement cost reduction of buyer[43-46], cost function of seller[42,43,46,47], configuration of bids[48] and number of winners[48]. According to the consideration of the configuration of bids for example, Bichlerand Kalagnanam propose the concept of Configurable offer focus on a configurable offer as a function of price on multi-attributes (quantitative and qualitative)[48]. In addition, some protocols of multiattributes auction may also need online Trusted Third Party (TTP) which is proposed by Srinathet al.[49] However, the protocol in[49] has a weak bid privacy and the public verifiability cannot be provided.

In this paper, we consider the security problems above and proposed privacy-preserving multi-attribute reverse auction scheme with bidder anonymity using multi-server Homomorphic Computation. Our contributions as follows: Firstly, the proposed scheme uses a public key cryptosystem with homomorphism to protect the attributes of the bidding scheme and achieves privacy-preserving bid calculation. Through the comparison of performance, security and homomorphism among RSA, Elgamal and Paiilier, Paillier public key cryptosystem was selected finally[50]. Secondly, a single auction server easily collides with a bidder, in order to solve this problem, a single auction server is replaced with multiple auction servers. The proposed scheme uses multiple auction servers to calculate the attributes under encryption

protection and obtains the linear additive score function value finally. Finally, the proposed scheme uses oblivious transfer and anonymization techniques to achieve bidder anonymity. The remainder of this paper is organized as follows. In Section 2, we recall some preliminary knowledge including the semihonest model, Paillier cryptosystem and oblivious transfer. The proposed scheme is shown in Section 3. In Section 4, security analysis of our scheme is given. Next, the performance evaluation compared with other schemes is provided in Sections 5. Finally, Section 6 concludes this paper.

#### 2 PRELIMINARIES

#### 2.1 Semi-honestmodel

IN the semi-honest model, all parties are assumed to perform computations and send messages according to their prescribed actions in the protocol. They may record all information from the protocol execution and try to infer as much information as possible in the process of the protocol, but the intermediate results in the process of the protocol cannot be modified [51,52].

**Definition 1:** Let  $S \subseteq \{0,1\}^*$ . Two aggregations (indexed by *S*),  $X \stackrel{def}{=} \{X_w\}_{winS}$  and  $Y \stackrel{def}{=} \{Y_w\}_{winS}$  are computationally indistinguishable if there is a negligible function  $\mu$  for every family of polynomialsize circuits,  $\{D_n\}_{n\in\mathbb{N}}$ ,  $N \rightarrow [0,1]$ , so that  $|pr[D_n(w, X_w) = 1] - pr[D_n(w, Y_w) = 1] | < \mu(|w|)$ . In such a case, it expressed as  $X \stackrel{c}{=} Y$ .

**Definition 2:** protocol  $\pi$  securely computes deterministic functionality f with static semi-honest adversaries if there are probabilistic polynomial-time simulators  $S_1$  and  $S_2$  such that

$$\begin{cases} S_{1}(x, f(x, y)) \\_{x, y \in \{0, 1\}^{*}} \equiv \begin{cases} view_{1}^{\pi}(x, y) \\_{x, y \in \{0, 1\}^{*}} \end{cases} \\ \begin{cases} S_{1}(x, f(x, y)) \\_{x, y \in \{0, 1\}^{*}} \equiv \begin{cases} view_{2}^{\pi}(x, y) \\_{x, y \in [0, 1]^{*}} \end{cases} \\ where |x| = |y|. \end{cases}$$

# 2.2 Paillier's cryptosystem [53]

**Key generation:** let p, q be two large primes and n = pq, p and q satisfy

gcd(pq,(p-1)(q-1)) = 1. Compute  $\lambda = lcm$ (p-1,q-1) and select random integer g where  $g \in Z_{n^2}^*$ . Ensure n divides the order of g by checking the existence of the following modular multiplicative inverse:  $\mu = (L(g^{\lambda} \mod n^2))^{-1} \mod n$ , where function *L* is defined as  $L(\mu) = \mu - 1$ . Get private (decryption) key  $(\lambda, \mu)$  and public (encryption) key (n, g).

**Encryption:** a message *m* is encrypted as  $c = g^m r^n \mod n^2$ , where  $m \in Z_n$ , where *r* is taken at random and  $r \in Z_n^*$ .

**Decryption:** the message *m* is obtained by computing  $m = L(c^{\lambda} \mod n^2)$  from ciphertext  $c \in Z_{n^2}^*$ .

Paillier cryptosystem can achieve two homomorphic properties as follows:

- (1)  $D(E(m_1,r_1) \cdot E(m_2,r_2) \mod n^2) = m_1 + m_2 \mod n$
- (2)  $D(E(m_1, r_1)^k \mod n^2) = km_1 \mod n$

D() denotes decryption function, E() denotes encryption function, where  $m_1, m_2 \in Z_n$ ,  $r_1, r_2 \in Z_n^*$ .

# 2.3 Oblivious Transfer

Oblivious Transfer (OT) [54] is a very useful cryptography tool to transfer secrets between two parties, a sender and a receiver. Sender transfers n secrets to a receiver, but has no idea of which piece (if any) has been transferred. In the other hand, the receiver can access one of the secrets from the sender, without getting any information about the remaining n-1 secrets.

Table 1 shows the pseudo-code of 1-out-of-n oblivious transfer protocol  $OT_1^n$  proposed in[55], where q' is a large prime, g and h are two generators of  $G_{q'}$ , which is a cyclic group of order q', and  $Z_{q'}$  is a finite additive group of q' elements. As long as  $\log_g h$  is not revealed, g and h can be used repeatedly.

# Table 1. 1-out-of-n oblivious transfer ( $(OT_n^1)$ )

 $\begin{array}{l} \mbox{Initialization:} \\ \mbox{Parameters:} \left(g,h,G_q\right) \\ \mbox{Sender's Input:} s_1,s_2,\ldots,s_n \in G_q \\ \mbox{Receiver's choice:} \ensuremath{\mathcal{E}}, \ensuremath{\mathcal{E}} \left[1,n\right] \\ \mbox{1. The sender sends } \ensuremath{\mathcal{E}}, y = g^r h^{\ensuremath{\mathcal{E}}}, r \in_R \ensuremath{Z_q} \\ \mbox{Z}_q \\ \ensuremath{\mathcal{E}}, \end{array}$ 

2. The receiver sends  $c_j = \left(g^{t_j}s_j\left(y/h^j\right)^{t_j}\right)$ ,

$$t_j \in_R Z_{q'}, 1 \le j \le n;$$

3. After receiving  $c_{\varepsilon} = (d, f)$ , sender computes  $s_{\varepsilon} = f / d^r$ ;

#### 3 THE PROPOSED SCHEME

#### 3.1 Initialization phase

AT the protocol initialization phase, buyers publish the requirements of their goods that they want to purchase and the set of corresponding non-price weight attributes  $\{w_i\}_{i \in [1,l]}$ . Then buyers generate key pairs (Pk, Sk) and broadcast Pk in the broadcast channel. Private key Sk is kept secretly by the buyer.

In addition, bidders provide the supply program which in fact is an attribute vector of a length of L including such as price, weight and other attribute values denoted as a collection  $\{\alpha_j\}_{1 \le j \le l}$ .

Anonymization technology proposed in [56] is used in this protocol to process the bidders of the true identities *UID* Register and get an anonymous identity *PID* which is well-processed.

$$PID = E_{PK} (UID \parallel pad \parallel Pk)$$
(1)

*pad* is a random padding bit which is used for filling the location that buyer specified to a certain length. The details of proof for security and uniqueness of *PID* can be found in[56]. It is unnecessary to go into details here. Bidders will send the *PID* through the broadcast channel.

At last, bidders use the public key that is published by buyer to encrypt the attribute vector  $\{\alpha_j\}_{1 \le j \le l}$  using the Paillier encryption:

$$e_j = E_{Pk}(\alpha_j) = g^{\alpha_j} r_j^n \mod n^2, r_j \in Z_n^*$$
(2)

After encryption, bidders modify the status in the broadcast channel and set the flag as to be sent.

#### 3.2 Bidding phase

When the auctioneer servers detect the flag of bidders to become to be sent, l servers use the  $OT_n^1$  protocol (section 2.3) in a random order and begin to select the encrypted attributes. For auctioneer servers  $P_{i \in [1,l]}$ :

(1)  $P_i$  selects a subscript k randomly and sends the  $y = g^r h^k$  to the anonymous bidders, where  $r \in Z_n$ ;

(2) Anonymous bidders return a response collection  $\{c_1, c_2, ..., c_l\}$ , where  $c_{j \in [1,l]} = (g^{t_j}, e_j (y / h^j)^{t_j}), t_j \in Z_n$ ; (3)  $P_i$  selects k corresponding the element

 $c_k = (d, f)$  in  $\{c_1, c_2, ..., c_l\}$  and compute:

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$$e_{k} = f / d^{r} = e_{k} \left( y / h^{k} \right)^{t_{j}} / \left( g^{t_{j}} \right)^{r}$$
$$= e_{k} \left( g^{r} h^{k} / h^{k} \right)^{t_{j}} / \left( g^{t_{j}} \right)^{r}$$
(3)

Assume *l* servers  $P_k$  all receive the ciphertext of attribute  $e_{j \in [1,l]}$  correctly and formula  $D(E(m_1, r_1)^k, (\text{mod } n^2) = km_1 \text{ mod } n$  is used, the second property of paillier cryptosystem, to compute the weight of the attribute  $w_j * \alpha_j$  under the status of ciphertext:

$$E_{Pk}\left(AT_{ij}\right) = E_{Pk}\left(\alpha_{j}\right)^{w_{j}} = e_{j}^{w_{j}}$$

$$\tag{4}$$

After computation, sent the  $E_{Pk}(AT_{ij})$  to the server  $P_l$ . When  $P_l$  receive the other number of l-1 of weight attribute of cipher text,  $P_l$  begin to compute:

$$E_{Pk}\left(Score\left(AT_{i}\right)\right) = \prod_{j=1}^{l} E_{Pk}\left(AT_{ij}\right)$$
(5)

*Score*() is a linear additive score function. And then get the computation  $E_{Pk}(Score(AT_i))$  to sent the buyer and when finish computation of the *ith* of bid document, auctioneer servers continue to monitor the remaining bid status of bidders.

#### 3.3 Winner determination phase

When the bid time that buyer set is deadline, buyer can use the private key Sk to decrypt the bid results that have received and bidders' identities. According to the formula  $\arg \max_i (score(b_i, AT_i))$ , buyer can either choose one or more optional bidders as winners or launch the next round of bidding according to their scores. Figure 1 describes the procedure of protocol of one bidder.

#### 4 SECURITY ANALYSIS.

IN this section, the security analysis of the proposed scheme will be described in details.

# 4.1 The security of Paillier cryptosystem

In this protocol, the process of computation of the bid document is based on Paillier cryptosystem. Therefore, the confidentiality of bid document also depends on the security of Paillier cryptosystem. In this section, we analyses the security of the Paillier cryptosystem.

Assumption 1: (Decisional Composite Residuosity Assumption ) assume n = pq is a *RSA* module and there is no polynomial-time algorithm can judge that whether the integer z is the n order remainder of module  $n^2$  or not. In other words, it is hard to verify that whether y exists or not that satisfy the formula  $z \equiv y^n \mod n^2$ , which is denoted as *DCRA* (Decisional Composite Residuosity Assumption).

**Definition 3:** set  $w \in Z_{n^2}^*$ , g is a non-zero integer multiple of element which the middle order is n of  $Z_{n^2}^*$ . There exists unique  $m \in Z_n$ ,  $r \in Z$   $Z_n^*$  and that can make  $w = g^m r^n \mod n^2$ . we call m is w based on g of n-order residue class denoted as  $||w||_g$  and take the problem of  $||w||_g$  computation as the n-order residual class problem denoted as Class[n,g] [50]; proof the that for given  $w \in Z_{n^2}^*$ , the complexity of Class[n,g] is independent of g. Therefore, we can only consider the n from the complexity of computation and this problem can be simplified as Class[n]

If factorize n, we can get the Class[n]. So far, how to factorize the long length module n of RSA is still an open problem in cryptography. Therefore, the following assumptions can be made:

**Assumption 2:** (Computational Composite Residuosity Assumption) in the algorithm of probability polynomial time, it is difficult to compute the composite order residual class problem. In other words, Class[n] problem is intractable and denoted as CCRA (Computational Composite Residuosity Assumption).

Under premise of Assumption 2, Paillier cryptosystem is unidirectional; under premise of Assumption 1, Paillier cryptosystem is semantically secure. Paillier cryptosystem provides the semantic security against non-responsive selective plaintext attack (IND-CPA1). In assumption of IND-CPA, crypto- graphic system indistinguishability is defined experimentally as follows: for an attacker A (Adversary) and the holder B (Challenger) of encryption algorithm. A and B play a game (Game-Based Security Definition):

(1) *B* based on a security parameter *k* generates a key pair (Pk, Sk), then public the *Pk* and save the *Sk*.

(2) A sends two equal length and distinct plaintexts  $m_0$ ,  $m_1$  to B;

(3) *B* chooses a bit  $b \in \{0,1\}$  randomly and sends the ciphertext  $c_b = E_{Pk}(m_b)$  to *A*;

(4) A can make any computation or operation to  $C_b$ 

and finally output a result (guess)b'.

Paillier encryption is indistinguishable under IND-CPA, because for any probability polynomial within the time of the attacker *A* may guess the advantage of



(2) after the auction, determine the winner

#### Figure 1. The proposed scheme procedure

the right answer of b' (win the game) which can ignore. The formula is:

$$Adv_{A}(E) = \left| \Pr\left[ c \leftarrow E(k, m_{0}) \right] - \Pr\left[ c \leftarrow E(k, m_{0}) \right] \right| = \epsilon$$

where the  $\epsilon$ may ignore. Although A knows  $m_0$ ,  $m_1$ , and Pk, according to the probability characteristic of

Paillier encryption  $m_b$  is just one of many legal ciphertext. Therefore, A cannot get a greater advantage in this game.

Response and non-response chosen plaintext attack (IND-CPA1, IND-CPA2) may also use the similar experiment definition of IND-CPA and Paillier encryption that may resist IND-CPA1 has already proved. However, It is an open discussion in academia to resist IND-CPA2 and chosen ciphertext attack.

#### 4.2 Other security

(1) The identity of winner anonymity: at the phase of seller information preparation, each seller takes part in this auction as a temporary identity pseudonym and buyers perform the anonymity of identities through the private key. (2) Fairness: The techniques of oblivious transfer and identity anonymity are used in this protocol. Therefore, in the transmission process of encrypted attribute between auctioneer servers and seller, their identities are unrecognizable and in this situation there is no conspiracy attack. The key pair is generated separately by each buyer, which exists the possibility of collusion between buyers and auctioneer servers. Therefore, this protocol cannot fully guarantee the fairness of results of auction.

(3) Avoid the dependency of the private channel: the information transmitted in this protocol is encrypted information and can be arbitrarily transmitted in the broadcast channel. Therefore, for the assumption of private channel can be avoided.

Except several securities above, this protocol do not provide the other requirements of security such as non-repudiation, public verifiability in the security auction protocol. Knowledge signature, digital signature and other cryptographic techniques can be added in to improve this protocol. This is a main task in the future research.

# 5 PERFORMANCE EVALUATION AND DISCUSSION

# 5.1 Computation complexity analysis

IN this protocol, assume the binary bit length of nis k denoted as  $k = \lceil \log_2 n \rceil + 1$  and all the participants are semi-honest. At the bidder information preparation phase,  $g^m \mod n^2$  of module exponential operation is needed to compute and the plaintext m and  $n^2$  of bit length are 2k, k respectively. The module  $n^2$  multiplication of integers of two k bit length requiring the time complexity is  $O(k^2)$ compute the modular exponentiation  $g^m \mod n^2$  at most to call k times. So the time complexity of computing the  $g^m \mod n^2$  is  $O(k^3)$  and similarly, the time complexity of computing the  $r^m \mod n^2$  is also  $O(k^3)$ . At the bidder information preparation phase, the time complexity that the encrypted attribute  $E_{pk}(m,r) = g^m r^n \mod n^2$  needs is  $O(k^3)$ . The process needs to be repeated l times and at this phase, the time complexity is  $O(lk^3)$ . At the encrypted attribute transmission phase, the l times equations is needed to compute the response collection c of oblivious transfer. At the computation of attribute ciphertext phase, the l times power function multiplication is needed to be done to compute the weighted attribute ciphertext and then the l times homomorphic addition is also needed to be done to compute the result of the weighed sum. Finally, buyer needs to decrypted the for all n sellers of the result of the weighted sum and the time complexity of decryption is  $O(k^3)$ .In conclusion, if all the participants in the auction are semi-honest, the time complexity of the single round auction protocol is  $O(lk^3)$ . For the auction with d bidders, the time complexity of the whole protocol is  $O(dlk^3)$ .

#### 5.2 Communication complexity

As before, assume all the participants are semihonest and ignore the communication traffic that transmission pseudonym generates. At the initial phase, buyer needs to send the public key to the n sellers. At the encrypted trans- mission phase, lelements are needed as the response collection c of oblivious transfer. At the attribute ciphertext computation phase, l-1 severs need to transfer their weighted ciphertext to a specific auction sever. Finally, the weighted sum of l is sent to buyer. Assume all the participants are semi-honest and at most transfer *n* times. Therefore, the communication traffic of the protocol is 2n+2l-1 and the communication complexity is O(n+l).

# 5.3 Properties

Firstly, a comparison among related protocols is summarized in Table 2. We discuss properties concluding the trusted third party, Strong bid privacy, Bulletin board, the number of parties, attribute relation, winner determination, adversary model, bidder anonymity of these protocols. We can easily conclude that the adversary model of all protocols are semi-honest and protocols need no the trusted third party except[49]. According to the complicated relation among attributes, the bid expression is important in the process of the winner determination. The Table 2 has shown that [58,59] are flexible to independent, and support dependent and interdependent attribute relation. In addition, because of the linear utility function is introduced for multiattribute bid evaluation and it is assumed that each attribute is independent in each multi-attribute bid using linear utility function[49],[57]. are only to support the independent attribute relation. According to the score function we used in this paper and structure of the winner determination, our proposal scheme also support the independent attribute relation only. Therefore, the proposed schemes of [58,59] can support both quantitative and qualitative attribute winner determination[49],[57]. and our proposal scheme only support quantitative attribute winner determination. However, only[49] and our proposal scheme provide the property of bid anonymity to protect the privacy of bidders identities at the bidding phase but do not[57-59].

#### 5.4 Experiments

We detailly discuss the computation operation in this subsection and the computation operation of protocols is shown in Table 3. We make a simple description that the *PKE* denoted as the Public Key Encryption and PKD denoted as the Public Key Decryption. We define the length of the prime number p is 512, 1024, 1536 bits in modular exponentiation which set as ME and set the R as the operation of generating a random number. t, T means the number of offer and the number of attribute respectively. Hash function digest is 512bits (for SHA-1) denoted as HF. *n* means the number of supplier. Because computation operation of RSA can be summarized as a modular exponentiation operation, and the computation operation of a modular exponentiation is about O(|L|) times that of a modular multiplication, where |L| denotes the bit length of L. In addition, So compared with a modular multiplication computation in  $Z_n^*$ , the computation

time consumed by hashing operations and random generation can be neglected. At the initiation phase, 1HF is needed in [49,57] and 1R should be done in[58,59]. However[49,57] and our proposal scheme need 2R. Finally, all protocols should do 1PKE and 1PKD except[49] which only need to compute n+3PKE. At bidding phase, nPKE, nPKD are need to be compute only in [49] and n(T+1)+2T, PKEn(T+1)PKE in [57]. The computation of operation should be done in [58] are t + 2HFt + 1PKE and 6tR, 22tME in [59]. According to our proposed scheme we only compute the nP and nPKE only. At the opening phase, [58] needs to compute more operations that are tR, 2(t+1)HF, tPKE, t + 1PKD respectively. While in [49] we only need to compute the nPKE . 2nTPKE and n(T+1)PKE should be done in [57]. Our proposal scheme and do not need computation operation in this process[59]. At the winner determination phase, The protocols of computation operation nPKD, 2nTPKE, ntHF should be done only in[49,57,58] respectively and [59],our proposal scheme should do two more operation. 8tR, 34tME are needed to compute in and ntME, nPKD in our proposal scheme[59].

Finally, a performance simulation is shown as follows. [49,57-59] and our proposed scheme are implemented in *C* using *MIRACL* library and server configuration: Microsoft Win7 Professional 2009 Service Pack 1, Intel(R) Core(TM) i5, CPU 2.53 GHz, 1.86 GB of RAM [60]. The average time for computing a single modular exponentiation is 1.5ms for 512-bit,6ms for 1024- bit, and 28ms for 1536-bit. For a small-scale system design, assume that n > T > t. Many experiments have been done and three typical experiments are shown in Figure 2,3,4.

Table 2. Discussion of achieved properties

Protocols	[49]	[57]	[58]	[59]	Proposal
Trusted third party	Yes	No	No	No	No
Strong bid privacy	No	No	Yes	Yes	Yes
Bulletin board	No	Yes	Yes	Yes	No
The number of parties	3	2	2	2	3
Attribute relation	Independent	Independent	Independent Dependent Interdependent	Independent Dependent Interdependent	Independent
Winner determination	Quantitative	Quantitative	Qualitative and quantitative	Qualitative and quantitative	Quantitative
Adversary model	Semi-honest	Semi-honest	Semi-honest	Semi-honest	Semi-honest
Bidder anonymity	Yes	No	No	No	Yes

Table 3. The	numbers of differen	t computation operation	s

Phase	[49]	[57]	[58]	[59]	Proposal
The initiation phase	1 HF 2 R n+3 PKE0	1 HF 2 R 1PKE 1PKD	1R 1PKE 1PKD	1R 1PKE 1PKD	2R 1PKE 1PKD
The bidding phase	0 nPKEnPKD	0 n(T+1)+2TPKEn(T+2)+2TPKD	t+2HF t+1 PKE0	6tR 22tME	nPKE
The opening phase	0 0 n PKE0	0 0 2nTPKEn(T+1)PKD	tR 2(t+1)HFt PKEt+1PKD		
The winnerdetermina- tion phase	0 0 nPKD	0 2nTPKE 0	ntHF 0 0	8tR 34tMEnPKD	ntME

PKE: Public Key Encryption; PKD: Public Key Decryption; HF: Hash Function; ME:

Modular Exponentiation; R: generate a random number; t: number of offer; T: number of attribute; n: number of supplier



Figure 2. Comparison of computation time(key=512bit,t=10, T=20,n=50)



Figure 3. Comparison of computation time(key=1024bit,t=20, T=30,n=50)

#### 6 CONCLUSIONS

IN this paper, A novel privacy-preserving multiattribute reverse auction scheme with bidder anonymity using multi-server homomorphic computation is pro- posed for future smart services. The proposed scheme uses multiple auction servers instead of a single auction server to alleviate collusion between a bidder and an auction server, and calculate the attributes under encryption protection and obtain the linear additive score function value finally. The proposed scheme achieves privacy-preserving winner determination with bid privacy by oblivious transfer and anonymization techniques. According to the security analysis, we can conclude that our proposed scheme can strongly preserve the information privacy of every participant. In addition, performance evaluation shows that the proposed scheme has a reasonable computation overhead.



Figure 4. Comparison of computation time(key=1536bit,t=30, T=40,n=50)

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