# Load-Balanced Server-Aided MPC in Heterogeneous Computing

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**Abstract.** Most existing MPC protocols consider the homogeneous setting, where all the MPC players are assumed to have identical communication and computation resources. In practice, the weakest player often becomes the bottleneck of the entire MPC protocol execution. In this work, we initiate the study of so-called *load-balanced MPC* in the heterogeneous computing. A load-balanced MPC protocol can adjust the workload of each player accordingly to maximize the overall resource utilization. In particular, we propose new notions called *composite circuit* and *composite garbling scheme*, and construct two efficient server-aided protocols with malicious security and semi-honest security, respectively. Our maliciously secure protocol is over  $400 \times$  faster than the authenticated garbling protocol (CCS'17); our semi-honest protocol is up to  $173 \times$  faster than the optimized BMR protocol (CCS'16).

## 1 Introduction

Secure multi-party computation (MPC) is an important cryptographic primitive that enables a set of participants  $P_1, \ldots, P_N$  to collaboratively evaluate a function  $f(x_1, \ldots, x_N)$  with certain security guarantees [21,47], where  $x_i$  is the private input of  $P_i$ . Most existing MPC protocols consider the homogeneous setting where all the involved participants have the same computing power as well as network bandwidth. While in a practical deployment, such an assumption of homogeneity may be unrealistic, e.g., some participants may have dedicated cloud servers, some may be equipped with personal computers, while some may only have portable devices. When MPC protocols originally designed for the homogeneous setting are executed among these heterogeneous devices, the weakest device always becomes the shortest stave in the wooden bucket theory.

On the other hand, the concept of MPC is closely related to the concept of distributed computing, which also focuses on how to coordinate a network of participants to jointly solve a common computation task. Specifically, distributed computing considers *load balancing* and provides scalable solutions. Take the simplest case where all the participants have the same resources as an example. Let |f| denote the total amount of workload for a task f. Suppose there are N participants, each participant's workload is expected to be as low as  $\frac{\mathcal{O}(|f|)}{N}$  (with minimum overhead). That is, the workload of each participant shall decrease along with the increase of the participant number. However, most existing practical MPC solutions, e.g., [45], fail to achieve such a nice property. Ironically, in many MPC protocols, e.g., [17, 21], each participant's workload even grows with the number of participants. Hereby, we ask the following questions:

Is it possible to design an efficient MPC that can freely adjust the computation and communication workload of each MPC participant?

**Load-balanced MPC.** In this work, we initiate the study of so-called *load-balanced MPC* in the heterogeneous computing. Without loss of generality, for a typical MPC solution, given a function f, there exists a protocol generator  $\Pi \leftarrow \text{GenProt}(N, f)$  that takes as input the number of parties N and the function f, and it outputs the MPC protocol  $\Pi := (\Pi_1, \ldots, \Pi_N)$ , where  $\Pi_i$  denotes protocol description for  $p_i$ . As we can see, the MPC parties' communication and computation resources are not taken into consideration.

In a load-balanced MPC, we augment the conventional protocol generator into  $\Pi^{LB} \leftarrow \text{GenProt}^{LB}(N, f, \{\tau_i, \rho_i\}_{i \in [N]})$ , where  $(\tau_i, \rho_i)$  are the computing power and communication bandwidth of  $P_i$ . Therefore,  $\Pi^{LB}$  could potentially be tailor-made to maximize the overall resource utility for the MPC participants, resulting a faster MPC protocol in heterogeneous computing.

**Limitations of the related works.** Although the load-balanced MPC has not been formally studied, there are some potential solutions in the literature. A straightforward solution is to utilize (threshold) fully homomorphic encryption (FHE) [16], where each client encrypts his input and sends the ciphertext to a high-performance computing node, e.g., a third-party server, who will evaluate the MPC function over encrypted data, and then all the clients jointly decrypt the result. However, in an FHE-based MPC, the workload of the computing node is extremely high, which

makes it unsuitable for complicated computation tasks; moreover, heavy zero-knowledge proofs might be needed to achieve malicious security [32].

The recently proposed YOSO MPC [20] and Fluid MPC [15] show how to evaluate a long-term computation task among a set of dynamically changing MPC participants. In each round of these protocols, a chosen group of participants compute only a fraction of the computation task and then transmit their intermediate secret states to the subsequent group of participants, who will carry on the computation. In particular, there are solutions in which the participants only process a tiny part of the task, such as a gate in the whole circuit, at each time they are chosen. With appropriate task assignment, these solutions can be applied to the load-balanced MPC setting. Nevertheless, currently, YOSO MPC candidates perform terribly due to state transmission and are far from being practical.

**Sever-aided MPC.** Kamara, Mohassel and Raykova [26] formally propose the notion of *server-aided* MPC, which assumes one or more third-party server(s) are available to accelerate the MPC execution. In their model, both the servers and the other participants (which are called parties in the rest of this work) can be (maliciously) corrupted, but the corrupted servers are not allowed to collude with the corrupted parties. Such non-colluding restriction enables researchers to design more efficient MPC protocols in practice.

Most server-aided MPC protocols are designed for the mobile cloud computing setting [10,11,26,27,33,46], where a number of parties are mobile devices with limited resources. Technically, these protocols are transformed from secure two-party computation (2PC) protocols, e.g., the Yao's Garbled Circuits (GC) protocol [47]. During the MPC execution, the server acts as  $P_1$  of the 2PC protocol, and one heavy-load party acts as  $P_2$  of the 2PC protocol, while the other parties only provide their inputs and carry out some verifications. Therefore, the workloads of the server and the heavy-load party are O(|f|), whereas the workloads of the other parties only depend on their input/output sizes. However, this line of research fail to *freely* adjust the parties' workloads; more specifically, except one heavyload party, the other parties can barely contribute to the MPC execution.

To the best of our knowledge, [8] is the only existing sever-aided MPC that can freely adjust the parties' workloads on demand. In particular, this work lets the parties share the same PRF seed such that the workload of the GC generation can be arbitrarily distributed among the parties. However, this technique conflicts with many GC optimizations, e.g., the garbled-row-reduction technique [38] and the free-XOR technique [31]. Without these optimizations, the resulting protocol is inefficient.

**Our approaches.** In this work, we propose two efficient load-balanced MPC protocols that enable arbitrary distribution of the communication (and computation) workload(s) among the parties in the server-aided model.

Distributing Communication. Usually, communication is the performance bottleneck of an MPC protocol, and we first show how to balance the communication of each parties. Our protocol  $\Pi_{mal}$  uses garbled circuit as its building block, and it achieves malicious security as defined in [11, 27], i.e., either the server or all-but-one parties can be maliciously corrupted, while the remaining participants are semi-honestly corrupted. Let  $\rho_i$  to denote the communication bandwidth of  $P_i$ . In  $\Pi_{mal}$ , the communication cost of  $P_i$  is  $\mathcal{O}\left(\frac{\rho_i}{\sum_{i=1}^N \rho_i} \cdot \lambda \cdot |f|\right)$ , where  $\lambda$  is the security parameter.

 $\Pi_{mal}$  lets each party generate the same copy of garbled circuit using a shared seed (distributed via a tailor-made coin-flipping protocol). To achieve communication load balancing, we divide the garbled circuit into multiple segments according to the parties' communication bandwidths  $\{\rho_i\}_{i \in [N]}$ , and each party only sends one segment to the server. Since transmitting garbled circuit is the main communication cost, it is easy to see that  $\Pi_{mal}$  is communication load-balanced.

To deal with malicious adversaries, we let each party send the hash values of the other garbled circuit segments. The non-colluding server can help to check the consistency of the received garbled circuit segments and the received hash values and prevent any violation behavior. Besides, the hash values are of size  $O(\lambda)$ , which only bring negligible burden.

*Distributing Computation.* Simply partitioning the garbled circuit cannot distribute the workload of the garbled circuit generation among multiple parties. The main reason is that the garbled circuit labels are highly dependent with each other after adopting certain efficient garbled circuit optimizations, e.g., the garbled-row-reduction technique [38] and the free-XOR technique [31].

Alternatively, our solution is to directly partition the circuit of the MPC computation task f into smaller subcircuits  $\{f_i\}_{i \in [N]}$ , referred as the simple circuits. Each party  $P_i$  is associated with the simple circuit  $f_i$ , whose size is proportional to  $P_i$ 's computing power  $\tau_i$  and communication bandwidth  $\rho_i$ .

– Composite Circuit. We propose a new notion called *composite circuit* as the composition of multiple simple circuits. The simple circuits are viewed as *black-boxs* and are linked together according to the so-called *link informa-*

Table 1: Communication costs (in Bytes) of the participants when computing AES128 with  $\Pi_{mal}$ . The overall cost is the sum of the parties' costs and the server's cost. As a comparison, in the half-gates garbling scheme [48], the size of the garbled material for the AES128 circuit is 204800 Bytes.

Party Num	Server		Max $P_i$		Min $P_i$			Overall				
	Offline	Online	Total	Offline	Online	Total	Offline	Online	Total	Offline	Online	Total
2	32	4096	4128	102592	2048	104640	102496	2048	104544	205120	8192	213312
3	48	6144	6192	68528	2048	70576	68384	2048	70432	205376	12288	217664
4	64	8192	8256	51552	2048	53600	51360	2048	53408	205696	16384	222080
5	80	10240	10320	41392	2048	43440	41152	2048	43200	206080	20480	226560
6	96	12288	12384	34624	2048	36672	34336	2048	36384	206528	24576	231104
7	112	14336	14448	29840	2048	31888	29504	2048	31552	207040	28672	235712
8	128	16384	16512	26272	2048	28320	25888	2048	27936	207616	32768	240384

Table 2: Communication costs (in Bytes) of the parties when computing AES128 with  $\Pi_{mal}$ . As a comparison, in the half-gates garbling scheme [48], the size of the garbled material for the AES128 circuit is 204800 Bytes.

Party Num		$\operatorname{Max} P_i$		Min $P_i$			
1 410) 1 (411)	Offline	Online	Total	Offline	Online	Total	
2	114384	2048	116432	114352	2048	116400	
3	86256	2048	88304	74864	2048	76912	
4	70192	2048	72240	57904	2048	59952	
5	53568	2048	55616	51408	2048	53456	
6	49776	2048	51824	41552	2048	43600	
7	45712	2048	47760	36528	2048	38576	
8	42160	2048	44208	33840	2048	35888	

tion. For instance,  $link_{s,t} = \{(s',t')\}$  stands for the scenario where the output wire t of  $f_s$  is linked with the input wire t' of  $f_{s'}$ . The composite circuit is a 5-tuple CompCirc =  $(\kappa, \{f_s\}_{s \in [\kappa]}, link, \mathcal{I}, \mathcal{O})$ , where  $\kappa$  is the number of the simple circuits,  $\{f_s\}_{s \in [\kappa]}$  is the set of the simple circuit, link is the collection of all the link information,  $\mathcal{I}$  and  $\mathcal{O}$  are the input wire set and output wire set of the composite circuit, respectively.

A composite circuit CompCirc can be generated by partitioning a circuit f. In such case, the partition should be directed and acyclic, i.e., there exists a suitable numbering of the resulting sub-circuits, such that each sub-circuit is only linked to its subsequent sub-circuits. Many acyclic multi-way graph partitioning algorithms [22, 23, 36, 37, 42] can be adopted to our setting.

- Composite Garbling Scheme. We introduce the notion of *composite garbling scheme* as the garbling scheme for composite circuits. Roughly speaking, in a composite garbling scheme, the garbled materials of the simple circuits are linked by *link materials*, which deliver values between garbled circuits in a privacy-preserving fashion. We also show how to transform a conventional garbling scheme with point-permute [4] and free-XOR [31] optimisations to a composite garbling scheme, while retaining the security properties.

A similar idea of linking garbled circuits together is used in the reactive garbling scheme [40], which assumes the circuit can be partially evaluated and the intermediate output can be revealed. However, the schemes proposed in [40] don't apply the garbled-row-reduction technique [38]; while most efficient garbling optimisations is compatible with our schemes, including the half-gates garbling scheme [48] and the state-of-the-art three-halves garbling scheme [41].

**Performance.** Our maliciously secure protocol  $\Pi_{mal}$  is 18.41-410.98× faster than the authenticated garbling protocol [44, 45], and it is 2.51-4.35× faster than the state-of-the-art server-aided MPC protocol of Lu *et al.* [33]. Our semi-honest protocol  $\Pi_{semi}$  is 110.91-173.53× faster than the optimized BMR protocol [6], and it is 2.94-3.88× faster than the protocol of Lu *et al.* Even compared with the semi-honest Yao's GC protocol [47], our maliciously secure protocol  $\Pi_{mal}$  can be 2.17× faster and semi-honest protocol  $\Pi_{semi}$  can be 2.55× faster. As depicted in Table. 1, Table. 2 and Table. 3, the proposed protocols indeed achieve communication (and computation) load balancing.

Table 3: Time (in ms) of the parties for generating garbled materials and link materials when computing AES128 with  $\Pi_{\text{semi}}$  for 1000 times. The original time is the running time of generating the garbled materials according to the half-gates garbling scheme [48].

Party Num	$\operatorname{Max} P_i$	$\operatorname{Min} P_i$	Original
2	143.872	133.768	240.785
3	110.986	101.698	239.397
4	99.253	88.513	243.075
5	94.033	84.763	242.787
6	95.944	87.184	241.670
7	121.762	91.079	243.698
8	128.104	97.470	242.582

## 2 Preliminaries

**Notations.** Let  $\lambda$  be the security parameter. Let a||b denote the concatenation of two strings a and b. Let [a, b] denote the set  $\{a, a + 1, \ldots, b\}$  and let [a] denote [1, a]. Let a := b denote assigning the value of b to a. When A is a string, let |A| denote the length of A. When A is a determines algorithm, let a := A(x) denote executing A on input x, and assigning the output to a. When A is a probabilistic algorithm, let  $a \leftarrow A(x)$  denote executing A on input x and a fresh random coin, and assigning the output to a; specifically, we may also use a := A(x; r) to denote executing A on input x and a fresh random coin r, and assigning the output to a. Let  $a \stackrel{\$}{\leftarrow} A$  denote sampling an element a from the set A uniformly at random. Let PPT be the abbreviation of *probabilistic polynomial time*, and let poly( $\cdot$ ) and

negl( $\cdot$ ) be a polynomially-bounded function and negligible function, respectively.

**Circuit.** We adopt the circuit specification in [5]. A circuit is a 6-tuple f = (n, m, q, A, B, G). n, m and q denote the numbers of inputs, outputs and gates in the circuit, respectively, so the circuit contains n + q wires. Each wire is associated with a wire id wid; for each gate, we use the wire id of the output wire to denote it. The set of all wires is denoted as  $\mathcal{W} := \{1, \ldots, n + q\}$ , the set of all input wires is denoted as  $\mathcal{I} := \{1, \ldots, n\}$ , the set of all output wires is denoted as  $\mathcal{O} := \{n + q - m + 1, \ldots, n + q\}$ , and the set of all gates is denoted as  $\mathcal{G} := \{n + 1, \ldots, n + q\}$ . A  $: \mathcal{G} \mapsto \mathcal{W} \setminus \mathcal{O}$  is a function that identifies the first incoming wire of a gate, and  $B : \mathcal{G} \mapsto \mathcal{W} \setminus \mathcal{O}$  is a function that identifies the first incoming wire of a gate, and  $B : \mathcal{G} \mapsto \mathcal{W} \setminus \mathcal{O}$  is a function that identifies the first incoming wire of a gate, and  $B : \mathcal{G} \mapsto \mathcal{W} \setminus \mathcal{O}$  is a function that identifies the first incoming wire of a gate. For  $g \in \mathcal{G}$ , we require that A(g) < B(g) < g. We define the evaluation function for the circuit as  $y \leftarrow \text{ev}(f, x)$ , where f is a circuit, x is the n-bit input and y is the m-bit output. We use |f| to denote the size of the circuit f, which is typically defined by the number of gates in the circuit.

**Garbling Scheme.** As formalized in [5], a garbling scheme consists of five algorithms GC := (Gb, En, Ev, De, ev); the algorithm Gb is probabilistic while the other algorithms are deterministic.

- $(F, e, d) \leftarrow \mathsf{Gb}(1^{\lambda}, f)$ . The garbling algorithm Gb takes as input the security parameter  $\lambda$  and the circuit f, and it outputs the garbled material F, the input encoding information e and the output decoding information d.
- X := En(e, x). The encoding algorithm En takes as input the input encoding information e and the plaintext input x, and it outputs a garbled input X.
- $Y := \mathsf{Ev}(f, F, X)$ . The evaluation algorithm  $\mathsf{Ev}$  takes as input the circuit f, the garbled material F and the garbled input X, and it outputs a garbled output Y.
- y := De(d, Y). The decoding algorithm De takes the output decoding information d and the garbled output Y, and it outputs a plaintext output y.
- $y \leftarrow ev(f, x)$ . The plaintext evaluation algorithm ev takes as input the circuit and the plaintext input x, and it outputs the computation result of f on input x.

A garbling scheme should have the following properties.

**Definition 1 (Correctness of Garbling Scheme).** The garbling scheme GC is correct if for any circuit f and any input x, the following is  $1 - \operatorname{negl}(\lambda)$ :

$$\Pr\left[(F, e, d) \leftarrow \mathsf{Gb}(1^{\lambda}, f) : \mathsf{De}(d, \mathsf{Ev}(f, F, \mathsf{En}(e, x))) = \mathsf{ev}(f, x)\right]$$

**Definition 2 (Obliviousness of Garbling Scheme).** The garbling scheme GC is oblivious if for any circuit f and any input x, there exists a PPT simulator Sim<sub>GC</sub> such that for any PPT adversary A, the following is negl( $\lambda$ ):

$$\left| \Pr \begin{bmatrix} (F_0, e_0, d_0) \leftarrow \mathsf{Gb}(1^{\lambda}, f); X_0 := \mathsf{En}(e_0, x); \\ (F_1, X_1) \leftarrow \mathsf{Sim}_{\mathsf{GC}}(1^{\lambda}, f); b \stackrel{\$}{\leftarrow} \{0, 1\}; \hat{b} \leftarrow \mathcal{A}(1^{\lambda}, f, F_b, X_b): \\ b = \hat{b} \end{bmatrix} - \frac{1}{2} \right|$$

**Definition 3 (Authenticity of Garbling Scheme).** The garbling scheme GC is authentic if for any circuit f and any input x, for all PPT adversary A, the following is negl( $\lambda$ ):

$$\Pr\left[\begin{array}{l} (F, e, d) \leftarrow \mathsf{Gb}(1^{\lambda}, f); X := \mathsf{En}(e, x); \hat{Y} \leftarrow \mathcal{A}(1^{\lambda}, f, F, X) : \\ \hat{Y} \neq \mathsf{Ev}(f, F, X), \mathsf{De}(d, \hat{Y}) \neq \bot \end{array}\right]$$

Without loss of generality, we assume a typical garbling algorithm is instantiated by three sub-algorithms Gb := (Gblnp, GbCirc, GbOut):

- $e \leftarrow \mathsf{Gblnp}(1^{\lambda}, f.\mathcal{I})$ . The input garbling algorithm Gblnp takes as input the security parameter  $\lambda$  and the set of the input wires of the circuit  $f.\mathcal{I}$ , and it outputs the input encoding information e.
- $(F, o) \leftarrow \mathsf{GbCirc}(1^{\lambda}, f, e)$ . The circuit garbling algorithm  $\mathsf{GbCirc}$  takes as input the security parameter  $\lambda$ , the circuit f and the input encoding information e, and it outputs the garbled material F and the output encoding information o.
- $d \leftarrow \text{GbOut}(1^{\lambda}, f.\mathcal{O}, o)$ . The output garbling algorithm GbOut takes as input the security parameter  $\lambda$ , the set of the output wires of the circuit  $f.\mathcal{O}$  and the output encoding information o, and it outputs the output decoding information d.

We assume the garbling scheme is *projective*, i.e., each wire wid in the circuit is associated with two labels  $W_{\text{wid}}^0$  and  $W_{\text{wid}}^1$ . Besides, the garbled material is the concatenation of the garbled gates for the gates in the circuit. Specifically, we focus on garbling schemes adopting the point-permute technique [4] and the free-XOR technique [31]. In the point-permute technique, a random *select bit* is appended to each wire label, the garbling algorithm Gb arranges the content of each garbled gate according to the select bits of the input wire labels, such that the evaluation algorithm Ev knows how to evaluate the garbled gate. In the free-XOR technique, it holds that for any wire wid,  $W_{\text{wid}}^0 \oplus W_{\text{wid}}^1 = \Delta$ , where  $\Delta$  is a global offset. Combining together, we have that the select bit is the least significant bit lsb of each wire label, and  $\Delta \in \{0, 1\}^{\lambda-1}||1$ .

The garbling schemes that satisfy our requirements include (i) combining point-permute [4], garbled-row-reduction [38] and free-XOR [31] together, (ii) the half-gates garbling scheme [48], and (iii) the three-halves garbling scheme [41].

### 2.1 Commitment Scheme

In our protocol, we let the party  $P_1$  sample and distribute a random coin to other parties, and we use commitments to prevent the deviating behavior of  $P_1$ . Specifically, we use a commitment scheme that only consists of a commit algorithm Com := (commit).

- The commit algorithm commit takes as input the message to commit m and a random seed r, and it outputs the commitment c. That is, c := commit(m; r).

We only require the commitment scheme to be computationally hiding and computationally binding:

**Definition 4 ((Computationally) Hiding of Commitment Scheme).** The commitment scheme Com is hiding if for any message  $m_0, m_1$  and any PPT adversary A, the following is  $negl(\lambda)$ :

$$\Pr \begin{bmatrix} b \stackrel{\$}{\leftarrow} \{0,1\}, r \stackrel{\$}{\leftarrow} \{0,1\}^{\lambda}; c := \operatorname{commit}(m_b, r); \\ \hat{b} \leftarrow \mathcal{A}(1^{\lambda}, c) : b = \hat{b} \end{bmatrix} - \frac{1}{2}$$

**Definition 5 ((Computationally) Binding of Commitment Scheme).** The commitment scheme Com is binding if for any PPT adversary A, the following is negl( $\lambda$ ):

$$\Pr\begin{bmatrix} (m_0, m_1, r_0, r_1) \leftarrow \mathcal{A}(1^{\lambda}) :\\ m_0 \neq m_1 \lor r_0 \neq r_1;\\ \mathsf{commit}(m_0, r_0) = \mathsf{commit}(m_1, r_1) \end{bmatrix}$$

In this work, we use the hash-based commitment scheme, that is, c := hash(m||r).

### **3** Security Definition

Based on the standard ideal/real world paradigm [9], Kamara, Mohassel and Raykova [26] formalized the behavior of non-colluding adversaries and proposed the security definition of server-aided MPC. In this work, we follow their security definition and we focus on the setting where one third-party server assists the MPC computation.

**Non-Colluding adversary.** MPC mainly considers two standard adversary models: (i) semi-honest adversaries who follows the protocol description but tries to learn private information by observing the protocol execution; (ii) malicious adversaries who can arbitrarily deviate from the protocol description. As for a semi-honest adversary, its protocol message does not contain its private information, so it can only collude with other adversaries through non-protocol messages. Therefore, a semi-honest adversary is non-colluding if it is *independent*, that is, it does not share information with other adversaries beyond the protocol execution. As for a malicious adversary, it is stronger than a semi-honest adversary in the sense that it may use protocol messages to collude with other adversaries. We use the following notion of non-cooperative to capture the non-colluding behavior of a malicious adversary.

**Definition 6 (Non-Cooperative Adversary [26]).** An adversary  $A_i$  is non-cooperative with respect to another adversary  $A_j$  if the messages sent from  $A_i$  to  $A_j$  do not reveal  $A_i$ 's private information, except for what can be learned from  $A_i$ 's protocol output.

**Real world execution.** In the real world, the parties  $\{P_i\}_{i \in [N]}$  and a server Server execute the protocol  $\Pi$  in the presence of m + 1 adversaries  $\{\mathcal{A}_i\}_{i \in [m+1]}$ , where  $m \leq N$ . Let  $\mathcal{H}$  denote the set of the honest parties,  $\mathcal{I}$  denote the set of corrupted but non-colluding parties, and  $\mathcal{C}$  denote the set of corrupted and colluding parties.  $\mathcal{H}, \mathcal{I}$  and  $\mathcal{C}$  are pairwise disjoint sets, and their union contains all the parties and servers. Specifically, we require that the server does not collude with the parties, so Server  $\in \mathcal{H} \cup \mathcal{I}$ . At the beginning of the protocol, for  $i \in [m]$ , the adversary  $\mathcal{A}_i$  receives an element of  $\mathcal{I}$  (which can be a party or the server), while the adversary  $\mathcal{A}_{m+1}$  receives  $\mathcal{C}$ . The adversaries then corrupts the parties accordingly.

We assume the protocol contains a offline phase and an online phase. In the offline phase, the party  $P_i$  receives its auxiliary input  $z_i$  and random coin  $r_i$ , and the server receives its auxiliary input  $z_s$  and random coin  $r_s$ . In the online phase, the party  $P_i$  receives its input  $x_i$ , while the server receives nothing. Then we have  $\mathbf{x} = (x_1, \ldots, x_N)$ ,  $\mathbf{z} = (z_1, \ldots, z_N, z_s)$  and  $\mathbf{r} = (r_1, \ldots, r_N, r_s)$ 

At the end, each party  $P_i$  outputs  $OUT_i$ , and the server outputs  $OUT_s$ . If the party (server) is honest,  $OUT_i$  is its protocol output; if the party (server) is corrupted,  $OUT_i$  is its view during the protocol execution. The output of the real world execution of protocol  $\Pi$  among the parties  $\{P_i\}_{i \in [N]}$  and the server Server in the presence of the adversaries  $\mathcal{A} = (\mathcal{A}_1, \dots, \mathcal{A}_{m+1})$  is defined as:

$$\mathsf{REAL}_{\Pi,\mathcal{A},\mathcal{I},\mathcal{C},\mathbf{z}}(\lambda,\mathbf{x};\mathbf{r}) = \{\mathsf{OUT}_1,\ldots,\mathsf{OUT}_N,\mathsf{OUT}_s\}$$

Ideal world execution. In the ideal world, the parties interact with a trusted third party. The parties, the server and the adversaries receive the same inputs as in the real world, and we refer to the adversaries in the ideal world as simulators. In the online phase, the parties send the inputs to the trusted third party. If  $P_i$  is corrupted by a malicious simulator, it can send an arbitrary  $\tilde{x}_i$ , e.g.,  $\tilde{x}_i := \bot$ ; otherwise, it sends  $\tilde{x}_i := x_i$ . The trusted third party sends  $\bot$  to the parties and the server if it receives an abort message or  $\tilde{x}_i = \bot$ . Otherwise, the trusted third party computes  $y := f(\tilde{x}_1, \ldots, \tilde{x}_N)$ . If the server Server is corrupted by a malicious simulator, the trusted third party asks the server which of the parties should receive the output and which should receive  $\bot$ .

At the end, each party  $P_i$  outputs  $OUT_i$ , and the server outputs  $OUT_s$ . If the party (server) is honest,  $OUT_i$  is its received output; if the party (server) is corrupted,  $OUT_i$  is a value generated by the simulator. The output of the ideal world execution among the parties  $\{P_i\}_{i \in [N]}$  and the server Server in the presence of the simulators  $S = (S_1, \ldots, S_{m+1})$  is defined as:

$$\mathsf{IDEAL}_{f,\mathcal{S},\mathcal{I},\mathcal{C},\mathbf{z}}(\lambda,\mathbf{x};\mathbf{r}) = \{\mathsf{OUT}_1,\ldots,\mathsf{OUT}_N,\mathsf{OUT}_s\}.$$

The formal security definition is as follows:

**Definition 7** (Server-aided Security). A protocol  $\Pi$  among the parties  $\{P_i\}_{i \in [N]}$  and a server Server is secure if there exists PPT transformations  $\{Sim_i\}_{i \in [m+1]}$  such that for all PPT adversaries  $\{A_i\}_{i \in [m+1]}$ , all inputs  $\mathbf{x}$  and all auxiliary inputs  $\mathbf{z}$ :

$$\{\mathsf{REAL}_{\Pi,\mathcal{A},\mathcal{I},\mathcal{C},\boldsymbol{z}}(\lambda,\boldsymbol{x};\boldsymbol{r})\}_{\lambda\in\mathbb{N}} \stackrel{c}{\approx} \{\mathsf{IDEAL}_{f,\mathcal{S},\mathcal{I},\mathcal{C},\boldsymbol{z}}(\lambda,\boldsymbol{x};\boldsymbol{r})\}_{\lambda\in\mathbb{N}}$$

where **r** is random and uniform,  $S = (S_1, \ldots, S_{m+1})$  and  $S_i := Sim_i(A_i)$ , for  $i \in [m+1]$ .

Protocol  $\Pi_{mal}$ 

The protocol  $\Pi_{mal}$  is for N parties  $\{P_i\}_{i \in [N]}$  and a third-party server Server. For simplicity, we assume each party  $P_i$ inputs  $\ell$  bits  $\{x_k^{(i)}\}_{k\in [\ell]}$ .  $H: \{0,1\}^* \to \{0,1\}^{\lambda}$  is a collision-resistant hash function.  $\mathsf{GC} := (\mathsf{Gb}, \mathsf{En}, \mathsf{Ev}, \mathsf{De}, \mathsf{ev})$  is a garbling scheme with correctness, obliviousness and authenticity. Com := (commit) is a commitment scheme that is hiding and binding.

#### **Protocol Generation**

Given the circuit f, the load-balanced protocol generator GenProt<sup>LB</sup> can pre-compute the length of the garbled material as |F|. According to the parties' communication bandwidths  $\{\rho_i\}_{i\in[N]}$ , GenProt<sup>LB</sup> pre-partitions F into N segments  $\{F_i\}_{i \in [N]}$  such that for each segment  $F_i$ ,  $\frac{|F_i|}{|F|} \approx \frac{\rho_i}{\sum_{i \in [N]} \rho_i}$ .

#### **Offline** Phase

- 1. (a) The party  $P_1$  samples  $\operatorname{coin}_1, r \stackrel{\$}{\leftarrow} \{0, 1\}^{\lambda}$  and sends  $\operatorname{coin}_1, r$  to  $\{P_i\}_{i \in [2, N]}$ .
  - (b) The server Server samples  $\operatorname{coin}_2 \xleftarrow{\$} \{0,1\}^{\lambda}$  and sends  $\operatorname{coin}_2$  to  $\{P_i\}_{i \in [N]}$ .
- 2. (a) For i ∈ [N], the party P<sub>i</sub> computes c<sup>(i)</sup><sub>coin</sub> := commit(coin<sub>1</sub>, r) and sends c<sup>(i)</sup><sub>coin</sub> to the server Server.
  (b) The party P<sub>1</sub> sets seed := coin<sub>1</sub> ⊕ coin<sub>2</sub> and sends seed to the parties {P<sub>i</sub>}<sub>i∈[2,N]</sub>.
- 3. (a) For  $i \in [2, N]$ , the party  $P_i$  sets seed :=  $coin_1 \oplus coin_2$  and asserts seed = seed' where seed' is received from  $P_1$ . If the assertion fails, it aborts. (b) The server Server asserts  $c_{coin}^{(1)} = \cdots = c_{coin}^{(N)}$ . If the assertions fails, it aborts.
- 4. For  $i \in [N]$ , the party  $P_i$ :
  - (a) Generates  $(F, e, d) := \mathsf{GC.Gb}(1^{\lambda}, f; \mathsf{seed}).$
  - (b) Partitions F into  $\{F_i\}_{i \in [N]}$  as specified by GenProt<sup>LB</sup>.
  - (c) Sends  $F_i$  to the server Server.
  - (d) For  $j \neq i$ , computes  $h_i^{(i)} := H(F_j)$  and sends  $h_i^{(i)}$  to the server Server.
- 5. The server Server:

  - (a) For  $i \in [N]$ , computes  $h_i^{(i)} := H(F_i)$ . (b) For  $i \in [N]$ , asserts  $h_i^{(1)} = \cdots = h_i^{(N)}$ . If the assertion fails, it aborts.

### **Online Phase**

6. For  $i \in [N]$ , the party  $P_i$ : (a) Parses  $e := \{W_t^0, W_t^1\}_{t \in f, \mathcal{I}}$ .

(b) For 
$$k \in [\ell]$$
, sets  $X_{(i-1)\cdot \ell+k} := W_{(i-1)\cdot \ell+k}^{x_k^{(i)}}$ .

(c) Sends  $\{X_{(i-1)\cdot \ell+k}\}_{k\in [\ell]}$  to the server Server.

- (a) Sets  $F := F_1 || \cdots || F_N$  and  $X := (X_1, \dots, X_{N \cdot \ell})$ .
- (b) Evaluates  $Y := \mathsf{GC}.\mathsf{Ev}(f, F, X)$ .
- (c) Sends Y to the parties  $\{P_i\}_{i \in [N]}$ .
- 8. For  $i \in [N]$ , the party  $P_i$  decodes  $y := \mathsf{GC}.\mathsf{De}(d, Y)$  and outputs y.

Fig. 1: The Communication Load-Balanced Server-Aided Protocol  $\Pi_{\mathsf{mal}}$  Secure Against a Malicious Server or Malicious Parties

**Lemma 1** ([27]). If a protocol  $\Pi$  among the parties  $\{P_i\}_{i \in [N]}$  and a server Server is secure (i) in the presence of semihonest and independent PPT adversaries  $\{A_i\}$  and (ii) in the presence of a malicious PPT adversary  $A_i$ , then the protocol  $\Pi$  is also secure in the presence of a malicious PPT adversary  $\mathcal{A}_i$  and semi-honest PPT adversaries  $\{\mathcal{A}_i\}_{i\neq i}$ , where  $\mathcal{A}_i$ is non-cooperative with respective to all other adversaries  $\{A_i\}_{i \neq i}$ .

#### **Communication Load-Balanced Protocol** 4

In most MPC protocols, communication is the performance bottleneck. For example, in the Yao's Garbled Circuits protocol [47], the party  $P_1$  needs to send the garbled material of the circuit to the party  $P_2$ , and the size of the garbled material is  $\mathcal{O}(\lambda \cdot |f|)$ . According to the test data from the work of Lu *et al.* [34], when computing the SHA512 circuit using garbled circuit, generating and evaluating the garbled material only take about 4ms in total, while transferring the garbled material in a network with 100Mbps takes about 163ms.

**Intuition.** Our communication load-balanced MPC protocol  $\Pi_{mal}$  achieves malicious security. At a high level, we let the parties act as the garbled circuit generator and let the server act as the garbled circuit evaluator. In the protocol  $\Pi_{mal}$ , the parties share the same seed and generate a garbled circuit copy using the seed. They partition the garbled material into several parts according to their communication bandwidths, and each party only sends a fraction of the garbled material to the server. Hence, the server can assemble the whole garbled material while each party's communication workload is proportional to its communication bandwidth.

**Formal description.** Fig. 1 depicts the protocol description of  $\Pi_{mal}$ . As defined earlier, in a load-balanced MPC, GenProt<sup>LB</sup> takes the communication resource of each party into consideration, and distributes the workload to the parties accordingly. In a protocol based on garbled circuit, the transmission of the garbled material F is the main communication cost. According to the parties' communication bandwidths  $\{\rho_i\}_{i \in [N]}$ , GenProt<sup>LB</sup> pre-partitions F into N segments  $\{F_i\}_{i \in [N]}$  such that  $\frac{|F_i|}{|F|} \approx \frac{\rho_i}{\sum_{i \in [N]} \rho_i}$ , for  $i \in [N]$ . That is, the size of the segment  $F_i$  is proportional to  $P_i$ 's communication bandwidth  $\rho_i$ .

In the offline phase, the parties first generate the shared garbled circuit seed with the assistance of the server. More precisely, in the first round, the party  $P_1$  samples  $\lambda$ -bit coin<sub>1</sub> and r at uniformly random and sends the randomness to the other parties  $\{P_i\}_{i \in [2,N]}$ ; meanwhile, the server Server samples  $\lambda$ -bit coin<sub>2</sub> at uniformly random and sends coin<sub>2</sub> to all the parties  $\{P_i\}_{i \in [N]}$ . The parties can then use seed := coin<sub>1</sub>  $\oplus$  coin<sub>2</sub> as the garbled circuit seed; in addition, we use an extra round to prevent the potentially malicious  $P_1$  and the potentially malicious Server from sending inconsistent messages. That is, each party computes the commitment of coin<sub>1</sub> by  $c_{coin}^{(i)}$  := commit(coin<sub>1</sub>, r) and sends the commitment to Server. Moreover, the party  $P_1$  sends its seed seed to the other parties  $\{P_i\}_{i \in [2,N]}$ . In this way, the server can help to ensure all the parties hold the same coin<sub>1</sub> by checking the consistency of the received commitments, while the parties can check the consistency of the seed generated by itself and the seed sent by  $P_1$  to prevent Server from sending inconsistent coin<sub>2</sub>.

If the above verification passes, the parties generate the same garbled circuit copy by  $(F, e, d) := \mathsf{GC.Gb}(1^{\lambda}, f; \mathsf{seed})$ and partitions F into  $\{F_i\}_{i \in [N]}$  as specified by  $\mathsf{GenProt}^{\mathsf{LB}}$ . Each party  $P_i$  sends the segment  $F_i$  to the server, and for the segments  $\{F_j\}_{j \neq i}$ ,  $P_i$  computes a hash value  $h_j^{(i)} := H(F_j)$  and sends  $h_j^{(i)}$  to the server. The server then checks the consistency of the received garbled material segments against the received hash values.

In the online phase, the parties receive their inputs. Since all of the parties have the encoding information e, each party can select the appropriate wire labels according to its input and send the wire labels to the server. The server reconstructs the garbled material and evaluates the garbled circuit, then it sends the garbled output Y to the parties. At the end, the parties decode the output y := GC.De(d, Y).

**Efficiency.** In the offline phase, the server Server sends  $N \cdot \lambda$  bits, the party  $P_1$  sends  $(4N-3) \cdot \lambda + |F_1|$  bits, and for  $i \in [2, N]$ , the party  $P_i$  sends  $N \cdot \lambda + |F_i|$  bits; in the online phase, the server sends  $N \cdot \ell \cdot \lambda$  bits (suppose the output is  $\ell$  bits), and for  $i \in [N]$ , the party  $P_i$  sends  $\ell \cdot \lambda$  bits. For most garbling schemes, the size of the garbled material can be computed by  $|F| = C \cdot |f| \cdot \lambda$ , where C is a small constant. Therefore, in most practical applications, |F| is much larger than the other constant costs. Note that the garbled material is partitioned such that for each segment  $F_i$ , we have  $\frac{|F_i|}{|F|} \approx \frac{p_i}{\sum_{i=1}^{N} p_i}$ . Therefore, the protocol  $\Pi_{mal}$  is communication load-balanced.

**Security.** We first briefly explain why the protocol  $\Pi_{mal}$  is secure against a malicious server or up to N-1 malicious parties. When the adversary  $\mathcal{A}$  corrupts the server, it only sees commitments of coin<sub>1</sub>, the garbled circuit and hash values of the garbled material segments. If the commitment scheme is hiding, the commitments leaks no information of coin<sub>1</sub>; and if the garbling scheme is oblivious, the garbled circuit leaks no information of the parties' inputs. The pre-images of the hash values are already known to the server. Besides, if the corrupted server sends inconsistent coin<sub>2</sub> to the parties, the parties can detect the inconsistency in step 3(a); the authenticity of the garbling scheme prevents the corrupted server from forging the garbled output.

Then we consider the case where the adversary  $\mathcal{A}$  corrupts parties  $\{P_i\}_{i \in [N-1]}$ . Note that in step 3(b), we use the server to check the consistency of the commitments sent by the parties, so when the commitment scheme Com is binding,  $\mathcal{A}$  has to send the same coin<sub>1</sub> and r to the party  $P_N$ . Similarly, when the hash function is collision-resistant,  $\mathcal{A}$  has to send the correct garbled material segments and hash values to the server in step 4(d); otherwise, the server can detect the inconsistency in step 5(b). In step 2(b),  $\mathcal{A}$  also needs to send the correct seed seed to  $P_N$ , or  $P_N$  can detect the inconsistency in step 3(a). In step 6, when the garbling scheme GC is authentic, the wire labels sent by  $\mathcal{A}$  should correspond to some valid plaintext inputs, which can be extracted by the simulator. The case where the adversary  $\mathcal{A}$  corrupts parties  $\{P_i\}_{i \in [2,N]}$  can be handled in a similar way.

Now we give the formal security theorem for  $\Pi_{mal}$ , and its proof can be found in App. A.1.

**Theorem 1.** If (a)  $H : \{0,1\}^* \to \{0,1\}^{\lambda}$  is a collision-resistant hash function, (b) GC := (Gb, En, Ev, De, ev) is a garbling scheme with correctness, obliviousness and authenticity and (c) Com := (commit) is a commitment scheme that is hiding and binding, then the protocol  $\Pi_{mal}$  depicted in Fig. 1 is secure when (i) a malicious adversary corrupts up to N-1 parties, and the remaining parties and the server are corrupted by semi-honest and independent adversaries, and (ii) a malicious adversary corrupts the server, and the parties are corrupted by semi-honest and independent adversaries. In both cases, the malicious adversary is non-cooperative with respect to all other adversaries.

## 5 Composite Circuit

Specification of Composite Circuit. Our work makes extensive use of the notion of *composite circuit*. To make a distinction, we rename the circuit defined in Sec. 2 as *simple circuit* from now on. A composite circuit can be interpreted as a composition of  $\kappa$  simple circuits  $\{f_s\}_{s \in [\kappa]}$ . Each simple circuit appears as a *black-box* to other simple circuits, and we use link information link to illustrate the connection relationships between the simple circuits. Similar to the general circuit case, we use  $\mathcal{I}$  and  $\mathcal{O}$  to denote the sets of all input wires and all output wires in the composite circuit, respectively. Combined together, a composite circuit is a 5-tuple CompCirc =  $(\kappa, \{f_s\}_{s \in [\kappa]}, \text{link}, \mathcal{I}, \mathcal{O})$ . This notion of composite circuit is particularly useful for our load-balancing purpose, intuitively, we want each party to only evaluate a fraction of the composite circuit.

We first describe how to interpret the link information link. We assume the existence of two *virtual* simple circuit  $f_0 := (|\mathcal{I}|, |\mathcal{I}|, 0, \emptyset, \emptyset, \emptyset)$  and  $f_{\kappa+1} := (|\mathcal{O}|, |\mathcal{O}|, 0, \emptyset, \emptyset, \emptyset)$ , both of which directly outputs its inputs. The simple circuit  $f_0$  collects the inputs of the composite circuit and outputs to other simple circuits, and the simple circuit  $f_{\kappa+1}$  collects outputs from the other simple circuits and produces the outputs of the composite circuit. The link information is defined as link :=  $\{ \text{link}_{s,t} \}_{s \in [0,\kappa+1], t \in f_s, \mathcal{O}}$ , and each  $\text{link}_{s,t}$  is a set describing the connection relationship of the output wire t of the simple circuit  $f_s$ . For instance, suppose the output wire t of the simple circuit  $f_s$  is connected with the input wire t' of the simple circuit  $f_{s'}$ , then  $\text{link}_{s,t} := \{(s', t')\}$ ; suppose the aforementioned wire is not connected with any other wire, then  $\text{link}_{s,t} := \emptyset$ ; suppose the aforementioned wire is connected with multiple wires, then  $\text{link}_{s,t} := \{(s'_1, t'_1), \dots, (s'_n, t'_n)\}$ .

One may notice that the above definition of link information is not complete and connecting simple circuits according to the above link information could potentially generate an abnormal circuit. For example, if  $(s_2, t_2) \in \lim_{s_1,t_1} \operatorname{and} (s_1, t_1') \in \lim_{s_2,t_2'}$ , then there will be a cycle  $f_{s_1} \rightsquigarrow f_{s_2} \rightsquigarrow f_{s_1}$  in the composite circuit, while a circuit should be cycle-free. Therefore, we require the composite circuit  $\operatorname{CompCirc} = (\kappa, \{f_s\}_{s \in [\kappa]}, \operatorname{link}, \mathcal{I}, \mathcal{O})$  to satisfy the following conditions:

Acyclicity. There does not exist a cycle in the composite circuit. For simplicity, we directly assume that the simple circuits are arranged according to the topological order. That is, for any  $s \in [0, \kappa]$  and any  $t \in f_s.\mathcal{O}$ , if  $(s', t') \in \text{link}_{s,t}$ , then s' > s. Specifically, for  $t \in f_{\kappa+1}.\mathcal{O}$ ,  $\text{link}_{\kappa+1,t} = \emptyset$ .

Input Legality. Each input of the simple circuits  $\{f_s\}_{s \in [\kappa+1]}$  is connected with at least one output of another simple circuit. That is, for any  $s \in [\kappa + 1]$  and any  $t \in f_s.\mathcal{I}$ , there exists (s', t') such that  $(s, t) \in \mathsf{link}_{s',t'}$ .

Input Uniqueness. No input of the simple circuits  $\{f_s\}_{s\in[\kappa+1]}$  is connected with two outputs of other simple circuits. That is, for any  $s \in [\kappa + 1]$  and any  $t \in f_s.\mathcal{I}$ , there does not exist  $(s'_1, t'_1)$  and  $(s'_2, t'_2)$  such that  $s'_1 \neq s'_2$ ,  $t'_1 \neq t'_2$ ,  $(s, t) \in \text{link}_{s'_1, t'_1}$  and  $(s, t) \in \text{link}_{s'_2, t'_2}$ .

We say a composite circuit is *legal* if it satisfies these three conditions. Throughout the paper, we only consider legal composite circuits.

Now we can define the composite circuit evaluation function  $ev_{sc}(CompCirc, x)$ ; more specifically,  $ev_{sc}(CompCirc, x)$  is constructed from the simple circuit evaluation function ev(f, x):

**Definition 8 (Composite Circuit Evaluation Function).** The composite circuit evaluation function ev takes as input a composite circuit CompCirc =  $(\kappa, \{f_s\}_{s \in [\kappa]}, \text{link}, \mathcal{I}, \mathcal{O})$  and a |CompCirc. $\mathcal{I}|$ -bit string  $x := \{x_t\}_{t \in \text{CompCirc}, \mathcal{I}}$ , and it outputs a |CompCirc. $\mathcal{O}|$ -bit string  $y := \{y_t\}_{t \in \text{CompCirc}, \mathcal{O}}$ . ev<sub>sc</sub>(CompCirc, x) proceeds as follows:

- 1. For  $t \in \text{CompCirc.}\mathcal{I}$ , for  $(s', t') \in \text{link}_{0,t}$ , set  $v_{s',t'} := x_t$ ;
- 2. For  $s \in [\kappa]$ :
  - (a) Compute  $\{v_{s,t}\}_{t \in f_s.\mathcal{O}} := ev(f_s, \{v_{s,t}\}_{t \in f_s.\mathcal{I}});$
  - (b) For  $t \in f_s.\mathcal{O}$ , for  $(s', t') \in \text{link}_{s,t}$ , set  $v_{s',t'} := v_{s,t}$ ;
- 3. For  $t \in \mathsf{CompCirc.}\mathcal{O}$ , set  $y_t := v_{\kappa+1,t}$ ;
- 4. Return  $\{y_t\}_{t \in \text{CompCirc.}\mathcal{O}}$ .

Given this composite circuit evaluation function, we can describe the functionality of a composite circuit. For any valid input x, if  $ev_{sc}(CompCirc, x) = ev(f, x)$ , then we can say that the composite circuit CompCirc computes the same function as the simple circuit f.

**Comparison with Gradual Function [40].** In [40], a similar notion of gradual function is considered, which also combines multiple circuits together. At a high level, the composite circuit is *fixed* while the gradual function is *flexible*. Specifically, a composite circuit assumes the inputs arrive at the same time, then all the simple circuits can be sequentially evaluated; while a gradual function allows partial evaluation, i.e., the inputs may arrive gradually and some of the outputs may be revealed in the middle, so an access function is needed to describe the availability of the intermediate outputs. The gradual function specification does not explicitly describe how the components (simple circuits) are connected. Specifically, a single input wire may be linked with multiple output wires, and it requires careful value assignment for such situation. Although the notion of composite circuit is more restricted, we find that it is adequately suitable for our use case, since we assume the computation task is determined at the very beginning.

**Composite Circuit Generation.** There are two possible approaches to generate a composite circuit. On the one hand, we can prepare several types of building block, e.g., adder and multiplier, and link these building blocks according to the description of the computation task. The DUPLO framework [30] is built in this way. On the other hand, there are also cases where the target function is already described as a circuit, and we can generate a composite circuit that realizes the given circuit by partitioning.

A circuit can be viewed as a directed acyclic graph (DAG), and graph partitioning is a fundamental combinatorial problem [19]. The graph partitioning problem has many variants. For instance, it may give a two-way partitioning [29] or a multi-way partitioning [1], and it may consider a directed graph [28] or a undirected graph [18]. For our case, we find that the *acyclic multi-way graph partitioning* algorithms [22,23,36,37,42] provide suitable solutions, which partition a DAG into multiple DAG's and ensure that there are no cycle among the generates parts. In this work, we use the multilevel algorithm of Herrmann *et al.* [23] to partition the circuit, which includes a coarsening phase, an initial partitioning phase and a uncoarsening phase. We refer interested readers to the original paper for the details of the algorithm.

## 6 Garbling Schemes for Composite Circuits

The BHR garbling scheme framework [5] considers general circuits and cannot be directly applied to composite circuits. As discussed in Sec. 5, a composite circuit is similar to a gradual function, so a natural idea is to apply the reactive garbling scheme [40], which is designed for the gradual functions, to the composite circuits. However, we find that since the composite circuits are fixed, some syntaxes in the reactive garbling scheme seem redundant for us. For example, the link materials used to connect multiple garbled materials can be generated inside the garbling algorithm, instead of using a separate "link" algorithm. Thus, in this work, we introduce the notion of a *composite garbling scheme*.

In [40], it is shown that the garbling scheme instantiation in [5] can be extended to a reactive garbling scheme in the random oracle model. While their construction requires the knowledge of the underlying garbling scheme, e.g., how each gate is garbled, we want to use the underlying garbling scheme in a more black-box manner. Specifically, we focus on the garbling schemes with the point-permute optimization [4] and the free-XOR optimization [31]. In such case, we can simply invoke the conventional garbling scheme algorithms in our construction. Our scheme is compatible with (i) combining point-permute [4], garbled-row-reduction [38] and free-XOR [31] together, (ii) the half-gates garbling scheme [48], and (iii) the three-halves garbling scheme [41].

**Composite Garbling Scheme.** We define the composite garbling scheme CGC for composite circuits. A composite garbling scheme consists of five algorithms  $CGC := (Gb, En, Ev, De, ev_{sc})$ , the algorithm CGC.Gb is probabilistic while the other algorithms are deterministic.

- $(F, e, d) \leftarrow \mathsf{CGC.Gb}(1^{\lambda}, \mathsf{CompCirc})$ . The garbling algorithm CGC.Gb takes as input the security parameter  $\lambda$  and the composite circuit CompCirc, and it outputs the garbled material F, the input encoding information e and the output decoding information d.
- X := CGC.En(e, x). The encoding algorithm CGC.En takes as input the input encoding information e and the plaintext input x, and it outputs a garbled input X.
- Y := CGC.Ev(CompCirc, F, X). The evaluation algorithm CGC.Ev takes as input the composite circuit CompCirc, the garbled material F and the garbled input X, and it outputs a garbled output Y.

- y := CGC.De(d, Y). The decoding algorithm CGC.De takes the output decoding information d and the garbled output Y, and it outputs a plaintext output y.
- The plaintext evaluation algorithm for composite circuits ev<sub>sc</sub> is defined in Def. 8.

The security notion of a composite garbling scheme is similar to the security notion of a garbling scheme.

**Definition 9** (Correctness of Composite Garbling Scheme). The composite garbling scheme CGC is correct if for any legal composite circuit CompCirc and for any input x, the following is  $1 - \text{negl}(\lambda)$ :

$$\Pr \begin{bmatrix} (F, e, d) \leftarrow \mathsf{CGC.Gb}(1^{\lambda}, \mathsf{CompCirc}) :\\ \mathsf{CGC.De}(d, \mathsf{CGC.Ev}(\mathsf{CompCirc}, F, \mathsf{CGC.En}(e, x))) = \mathsf{ev}_{\mathsf{sc}}(\mathsf{CompCirc}, x) \end{bmatrix}$$

**Definition 10 (Obliviousness of Composite Garbling Scheme).** The composite garbling scheme CGC is oblivious if for any legal composite circuit CompCirc and for any input x, there exists a PPT simulator Sim<sub>CGC</sub> such that for all PPT adversary A, the following is negl( $\lambda$ ):

$$\Pr \begin{bmatrix} (F_0, e_0, d_0) \leftarrow \mathsf{CGC.Gb}(1^\lambda, \mathsf{CompCirc}); X_0 := \mathsf{CGC.En}(e_0, x); \\ (F_1, X_1) \leftarrow \mathsf{Sim}_{\mathsf{CGC}}(1^\lambda, \mathsf{CompCirc}); b \xleftarrow{\$} \{0, 1\}; \hat{b} \leftarrow \mathcal{A}(1^\lambda, \mathsf{CompCirc}, F_b, X_b) : \\ b = \hat{b} \end{bmatrix} - \frac{1}{2} \begin{bmatrix} 1 \\ 1 \\ 2 \end{bmatrix}$$

**Definition 11 (Authenticity of Composite Garbling Scheme).** The composite garbling scheme CGC is authentic if for any legal composite circuit CompCirc and for any input x, and for any PPT adversary A, the following is  $negl(\lambda)$ :

$$\Pr \begin{bmatrix} (F, e, d) \leftarrow \mathsf{CGC}.\mathsf{Gb}(1^{\lambda}, \mathsf{CompCirc}); X := \mathsf{CGC}.\mathsf{En}(\mathsf{CGC}.e, x); \\ \widehat{Y} \leftarrow \mathcal{A}(1^{\lambda}, \mathsf{CompCirc}, F, X) : \\ \widehat{Y} \neq \mathsf{CGC}.\mathsf{Ev}(\mathsf{CompCirc}, F, X) \land \mathsf{CGC}.\mathsf{De}(d, \widehat{Y}) \neq \bot \end{bmatrix}$$

**Construct** CGC **from** GC. We show how to use a garbling scheme GC to construct a composite garbling scheme CGC<sup>GC</sup>. To make a distinction, we call GC as the basic garbling scheme from now on.

We present the construction of the composite garbling scheme in Fig. 2. Roughly speaking, for each simple circuit  $f_i$ , the garbling algorithm of the composite garbling scheme  $CGC^{GC}$ . Gb first invokes the garbling algorithms of the basic garbling scheme to generate the input encoding information, garbled material and output encoding information of  $f_i$ . It also generates the output decoding information of the output simple circuit  $f_{\kappa+1}$ . According to the link information link,  $CGC^{GC}$ . Gb parses the encoding information and generates the link materials. For example, suppose link<sub>s,t</sub> := {(s',t')}; to link the *t*-th output of the simple circuit  $f_s$  with the *t'*-th input of the simple circuit  $f_{s'}$ , it extract the corresponding wire labels { $W_{s,t}^0, W_{s,t}^1$ } and { $W_{s',t'}^0, W_{s',t'}^1$ } from the encoding information, and it generates two ciphertexts  $H(s, t, s', t', W_{s,t}^0) \oplus W_{s',t'}^0$  and  $H(s, t, s', t', W_{s,t}^1) \oplus W_{s',t'}^1$  using a secure hash function H (the concrete property will be described later). In particular, the ciphertexts are arranged according to the select bit, such that the evaluator can always decrypt the correct ciphertext. For simplicity, we use a private procedure GenLink to generate all the link materials related to the simple circuit  $f_s$ . CGC<sup>GC</sup>. Gb sets the input encoding information of the composite garbling scheme as the collection of the garbled materials and link materials of the simple circuits, and sets the output decoding information as the output decoding information of  $f_{\kappa+1}$ .

As for the evaluation algorithm,  $CGC^{GC}$ . Ev sequentially invoke the evaluation algorithm of the basic garbling scheme to evaluate the garbled circuit of each simple circuit. After evaluating the garbled circuit of the simple circuit  $f_i$ , it additionally evaluates the link materials associated with  $f_i$  to translate the wire labels of  $f_i$  to the wire labels of the subsequent simple circuits. In this way, the value of the wires are secretly transferred among the simple circuits.

The encoding algorithm of the composite garbling scheme  $CGC^{GC}$ . En can be directly implemented by invoking the encoding algorithm of the basic garbling scheme GC.En on the simple circuit  $f_0$ . Similarly, the decoding algorithm of the composite garbling scheme  $CGC^{GC}$ . De can be directly implemented by invoking the decoding algorithm of the basic garbling scheme GC.De on the simple circuit  $f_{\kappa+1}$ .

**Security.** The security of the construction  $CGC^{GC}$  relies on the security of the basic garbling scheme GC and the hash function H. Recall that we assume GC adopts the free-XOR technique [31]. Following the work of Choi *et al.* [14], we assume the hash function H has *circular correlation robustness*. Choi *et al.* only considered a single garbled circuit, or, a single global offset  $\Delta$ . In our case, each garbled circuit of a simple circuit is associated with a  $\Delta$ , so we propose

procedure  $CGC^{GC}$ .Gb $(1^{\lambda}, CompCirc)$ **procedure**  $CGC^{GC}$ .En(CGC.e, x)  $\triangleright$  Encode the input of the input simple circuit  $f_0$ Parse CompCirc =  $(\kappa, \{f_s\}_{s \in [\kappa]}, \text{link}, \mathcal{I}, \mathcal{O});$ Parse link = {link<sub>s,t</sub>}<sub>s \in [0, \kappa+1], t \in f\_s.O</sub>; **return** GC.En(CGC.e, x). Set  $f_0 := (|\mathcal{I}|, |\mathcal{I}|, 0, \emptyset, \emptyset, \emptyset);$ **procedure** CGC<sup>GC</sup>.Ev(CompCirc, CGC.F, CGC.X)Set  $f_{\kappa+1} := (|\mathcal{O}|, |\mathcal{O}|, 0, \emptyset, \emptyset, \emptyset);$ for  $s \in [0, \kappa + 1]$  do: Parse CompCirc =  $(\kappa, \{f_s\}_{s \in [\kappa]}, \mathsf{link}, \mathcal{I}, \mathcal{O});$  $e_s \leftarrow \mathsf{GC.GbInp}(1^\lambda, f_s.\mathcal{I});$ Parse link = {link<sub>s,t</sub>}<sub>s \in [0, \kappa+1], t \in f\_s.O</sub>;  $(F_s, o_s) \leftarrow \mathsf{GC.GbCirc}(1^\lambda, f_s, e_s);$ Set  $f_0 := (|\mathcal{I}|, |\mathcal{I}|, 0, \emptyset, \emptyset, \emptyset);$ for  $s \in [0, \kappa]$  do: Set  $f_{\kappa+1} := (|\mathcal{O}|, |\mathcal{O}|, 0, \emptyset, \emptyset, \emptyset);$  $\{L_{s,t}\}_{t\in f_s.\mathcal{O}} := \mathsf{GenLink}(s, \{\mathsf{link}_{s,t}\}_{t\in f_s.\mathcal{O}}, o_s, \{e_{s'}\}_{s'\in[\kappa+1]});$ Parse CGC.  $F = \{F_s\}_{s \in [\kappa]} \cup \{L_{s,t}\}_{s \in [0,\kappa], t \in f_s.\mathcal{O}};$  $d_{\kappa+1} \leftarrow \mathsf{GC.GbOut}(1^{\lambda}, f_{\kappa+1}.\mathcal{O}, o_{\kappa+1});$ Set  $F_0 := \emptyset$ ;  $CGC.e := e_0;$ Set  $F_{\kappa+1} := \emptyset$ ;  $\triangleright F_0 = F_{\kappa+1} = \emptyset$ Parse CGC. $X = \{X_{0,t}\}_{t \in f_0.\mathcal{I}};$  $\mathsf{CGC}.F := \{F_s\}_{s \in [\kappa]} \cup \{L_{s,t}\}_{s \in [0,\kappa], t \in f_s.\mathcal{O}};\$ for  $s \in [0, \kappa + 1]$  do:  $\mathsf{CGC.}d := d_{\kappa+1};$ Set  $X_s := \{X_{s,t}\}_{t \in f_s.\mathcal{I}};$ return (CGC.F, CGC.e, CGC.d).  $Y_s := \mathsf{GC}.\mathsf{Ev}(f_s, F_s, X_s);$ Parse  $Y_s = \{Y_{s,t}\}_{t \in f_s.\mathcal{O}};$ private procedure GenLink $(s, \{link_{s,t}\}_{t \in f_s.O}, o_s, \{e_{s'}\}_{s' \in [\kappa+1]})$ if  $s < \kappa + 1$  then: for  $t \in f_s.\mathcal{O}$  do: Parse  $o_s = \{W_{s,t}^0, W_{s,t}^1\}_{t \in f_s.\mathcal{O}};$  $\tau_{s,t} := \mathsf{lsb}(Y_{s,t});$ for  $s' \in [\kappa + 1]$  do: for  $(s', t') \in \text{link}_{s,t}$  do: Parse  $e_{s'} = \{W^0_{s',t}, W^1_{s',t}\}_{t \in f_{s'},\mathcal{I}};$ Set  $X_{s',t'} := H(s,t,s',t',Y_{s,t}) \oplus \sigma_{s't'}^{\tau_{s,t}}$ for  $t \in f_s.\mathcal{O}$  do:  $\mathsf{CGC}.Y := Y_{\kappa+1};$ Set  $L_{s,t} := \emptyset$ ;  $\tau_{s,t} := \mathsf{lsb}(W_{s,t}^0);$ return CGC.Y. for  $(s', t') \in \text{link}_{s,t}$  do: procedure  $CGC^{GC}$ .De(CGC.d, CGC.Y)  $\sigma_{s',t'}^{\tau_{s,t}} := H(s,t,s',t',W_{s,t}^0) \oplus W_{s',t'}^0;$  $\sigma^{\tau_{s,t}\oplus 1}_{s',t'} := H(s,t,s',t',W^1_{s,t}) \oplus W^1_{s',t'};$  $\triangleright$  Decode the output of the output simple circuit  $f_{\kappa+1}$ return GC.De(CGC.d, CGC.Y).  $L_{s,t} := L_{s,t} \cup \{\sigma_{s',t'}^0, \sigma_{s',t'}^1\};$ return  $\{L_{s,t}\}_{t \in f_s,\mathcal{O}}$ .

Fig. 2: The Composite Garbling Scheme CGC<sup>GC</sup> from the Basic Garbling Scheme GC.

the *multiple circular correlation robustness*. We define an oracle  $\mathcal{O}_{\Delta_0,...,\Delta_{\kappa+1}}^H$  with respect to the hash function H and the  $\Delta$ 's, where each  $\Delta_i \in \{0,1\}^{\lambda-1}$ ||1:

$$\mathcal{O}^{H}_{\Delta_{0},\dots,\Delta_{\kappa+1}}(s,t,s',t',X,a,b) = H(s,t,s',t',X+a\cdot\Delta_{s}) + b\cdot\Delta_{s'}(s,t,s',t',X+a\cdot\Delta_{s}) + b\cdot\Delta_{s'}(s,t,s',t',X,a,b) = H(s,t,s',t',X+a\cdot\Delta_{s}) + b\cdot\Delta_{s'}(s,t,s',t',X,a,b) = H(s,t,s',t',X+a\cdot\Delta_{s}) + b\cdot\Delta_{s'}(s,t,s',t',X,a,b) = H(s,t,s',t',X+a\cdot\Delta_{s}) + b\cdot\Delta_{s'}(s,t,s',t',X+a\cdot\Delta_{s}) + b\cdot\Delta_{s'}(s,t,s',t',X+a,t') + b\cdot\Delta_{s'}(s,t,s',t',X+a,t') + b\cdot\Delta_{s'}(s,t,s',t',X+a,t') +$$

**Definition 12 (Multiple Circular Correlation Robustness).** The hash function H is is multiple circular correlation robust if for any PPT adversary that queries the oracle with distinct (s, t, s', t') values, the oracle  $\mathcal{O}^{H}_{\Delta_{0},...,\Delta_{\kappa+1}}$  is indistinguishable from a random oracle that accepts inputs with the same form and outputs a  $\lambda$ -bit random string.

This definition is similar to the *mixed-modulus circular correlation robustness* defined in [3], except that they assume each  $\Delta$  is a vector of  $Z_m$  elements where m may not be 2, while we only consider m = 2.

Then we have the following security theorem.

**Theorem 2.** If (a) the basic garbling scheme GC has correctness, obliviousness and authenticity, (b) GC adopts the point-permute technique and the free-XOR technique, and (c) the hash function H has multiple circular correlation robustness, then the construction  $CGC^{GC}$  depicted in Fig. 2 is a composite garbling scheme with correctness, obliviousness and authenticity.

Intuitively, the construction  $CGC^{GC}$  retains the security properties of the basic garbling scheme GC, because the output of the hash function H is indistinguishable from a random string. For obliviousness, the simulator  $Sim_{CGC}$  invokes the obliviousness simulator of GC to simulate the garbled materials, and it programs the simulated link materials such that the adversary always obtain the simulated wire labels. The multiple circular correlation robustness

Protocol  $\Pi_{\mathsf{semi}}$ 

The protocol  $\Pi_{semi}$  is for N parties  $\{P_i\}_{i \in [N]}$  and a third-party server Server. For simplicity, we assume each party  $P_i$ inputs  $\ell$  bits  $\{x_k^{(i)}\}_{k \in [\ell]}$ . PRG :  $\{0,1\}^{\lambda} \to \{0,1\}^{(2 \cdot N+5) \cdot \lambda}$  is a secure pseudorandom number generator. CGC<sup>GC</sup> is the composite garbling scheme constructed in Sec. 6, and the details of the procedures GenLink, CGC<sup>GC</sup>.Ev and CGC<sup>GC</sup>.De can be found in Fig. 2.

#### **Protocol Generation**

Given the computation task f, the parties' computing power  $\{\tau_i\}_{i \in [N]}$  and the parties' communication bandwidth  $\{\rho_i\}_{i \in [N]}$ , the load-balanced protocol generator GenProt<sup>LB</sup> generates a composite circuit CompCirc =  $(N, \{f_s\}_{s \in [N]}, \text{link}, \mathcal{I}, \mathcal{O})$  computing f. Specifically, for  $i \in [N], |f_i|$  is proportional to  $P_i$ 's computing power  $\tau_i$  and communication bandwidth  $\rho_i$ .

### **Offline** Phase

- 1. For  $i \in [N]$ , the party  $P_i$ :
  - (a) Parses CompCirc =  $(N, \{f_s\}_{s \in [N]}, \text{link}, \mathcal{I}, \mathcal{O})$  and parses  $\text{link} = \{\text{link}_{s,t}\}_{s \in [0,N], t \in f_s, \mathcal{O}}$ . (b) Sets  $f_0 := (|\mathcal{I}|, |\mathcal{I}|, 0, \emptyset, \emptyset)$  and  $f_{N+1} := (|\mathcal{O}|, |\mathcal{O}|, 0, \emptyset, \emptyset, \emptyset)$ .
- 2. The party  $P_1$  samples  $\operatorname{coin} \stackrel{\$}{\leftarrow} \{0,1\}^{\lambda}$  and sends  $\operatorname{coin}$  to  $\{P_i\}_{i \in [2,N]}$ .
- 3. For  $i \in [N]$ , the party  $P_i$ :
  - (a) Computes  $(\mathsf{seed}_{1,0},\ldots,\mathsf{seed}_{1,N+1},\mathsf{seed}_{2,0},\ldots,\mathsf{seed}_{2,N+1},\mathsf{seed}_3) := \mathsf{PRG}(\mathsf{coin}).$
  - (b) For  $s \in [0, N+1]$ , generates  $e_s := \mathsf{GC.GbInp}(1^{\lambda}, f_s.\mathcal{I}; \mathsf{seed}_{1,s})$ .
  - (c) Generates  $(F_i, o_i) := \mathsf{GC.GbCirc}(1^{\lambda}, f_i, e_i; \mathsf{seed}_{2,i})$ . If i = 1, additionally generates  $(F_0, o_0) := \mathsf{GC.GbCirc}(1^\lambda, f_0, e_0; \mathsf{seed}_{2,0}).$
  - (d) Generates  $\{L_{i,t}\}_{t \in f_i,\mathcal{O}} := \text{GenLink}(i, \{\text{link}_{i,t}\}_{t \in f_i,\mathcal{O}}, o_i, \{e_{s'}\}_{s' \in [N+1]})$ . If i = 1, additionally generates  $\{L_{0,t}\}_{t\in f_0.\mathcal{O}} := \mathsf{GenLink}(0, \{\mathsf{link}_{0,t}\}_{t\in f_0.\mathcal{O}}, o_0, \{e_{s'}\}_{s'\in[N+1]})$
  - (e) Generates  $(F_{N+1}, o_{N+1}) := \mathsf{GC.GbCirc}(1^{\lambda}, f_{N+1}, e_{N+1}; \mathsf{seed}_{2,N+1}).$
  - (f) Generates  $\mathsf{CGC}.d := \mathsf{GC}.\mathsf{GbOut}(1^{\lambda}, f_{N+1}.\mathcal{O}, o_{N+1}; \mathsf{seed}_3).$
  - (g) Sends  $\{F_i\} \cup \{L_{i,t}\}_{t \in f_i, \mathcal{O}}$  to the server Server. If i = 1, additionally sends  $\{L_{0,t}\}_{t \in f_0, \mathcal{O}}$ .

### **Online Phase**

- 4. For  $i \in [N]$ , the party  $P_i$ :

  - (a) Parses  $e_0 = \{W_{0,t}^0, W_{0,t}^1\}_{t \in f_0.\mathcal{I}}$ . (b) For  $k \in [\ell]$ , sets  $X_{0,(i-1)\cdot\ell+k} := W_{0,(i-1)\cdot\ell+k}^{(x_k^{(i)})}$ . (c) Sends  $\{X_{0,(i-1)\cdot\ell+k}\}_{k \in [\ell]}$  to the server Server.
- 5. The server Server:
  - (a) Sets  $CGC.F := \{F_s\}_{s \in [N]} \cup \{L_{s,t}\}_{s \in [0,N], t \in f_s.\mathcal{O}}$  and  $CGC.X := (X_{0,1}, \ldots, X_{0,N\cdot\ell})$ . (b) Evaluates  $CGC.Y := CGC^{GC}.Ev(CompCirc, CGC.F, CGC.X)$ .

  - (c) Sends CGC. Y to the parties  $\{P_i\}_{i \in [N]}$ .
- 6. For  $i \in [N]$ , the party  $P_i$  decodes  $y := \mathsf{CGC}^{\mathsf{GC}}.\mathsf{De}(\mathsf{CGC}.d,\mathsf{CGC}.Y)$  and outputs y.

Fig. 3: The Communication & Computation Load-Balanced Server-Aided Protocol II<sub>semi</sub> Secure Against Malicious Server

of H ensures that the programmed outputs are indistinguishable from the authentic link materials. For authenticity, the adversary has to break the authenticity of GC or the multiple circular correlation robustness of H to forge the garbled output, so it only succeeds with negligible probability. The formal security proof can be found in App. A.2.

#### **Communication & Computation Load-Balancing** 7

Given the notion of the composite circuit and the composite garbling scheme construction, now we are ready to present a server-aided MPC protocol  $\Pi_{semi}$  that is communication & computation load-balanced. As in our communication load-balanced protocol  $\Pi_{mal}$ , the basic idea is to let the parties act as the garbled circuit generator and let the server act as the garbled circuit evaluator. The parties share the same garbled circuit seed and are able to generate the same garbled circuit copy. Moreover, to achieve computation load balancing, the load-balanced protocol generator GenProt<sup>LB</sup> coordinates the generation process such that each party only generate one part of the garbled circuit. Suppose N parties  $\{P_i\}_{i \in [N]}$  want to compute a computation task f, GenProt<sup>LB</sup> partitions the circuit of f into N

circuits  $\{f_i\}_{i \in [N]}$  such that the size of  $f_i$  is proportional to  $P_i$ 's computing power  $\tau_i$  and communication bandwidth  $\rho_i$ . For example, suppose the party  $P_1$  is equipped with a 4.8Ghz processor and 500Mbps bandwidth, while each of the other parties is equipped with a 2.4Ghz processor and 100Mbps bandwidth, then GenProt<sup>LB</sup> can generate the simple circuits such that  $|f_1| = \min(\frac{4.8\text{Ghz}}{2.4\text{Ghz}}, \frac{500\text{Mbps}}{100\text{Mbps}}) \cdot |f_i| = 2 \cdot |f_i|$ , for  $i \in [2, N]$ . Using our composite garbling scheme construction  $CGC^{GC}$ , each party only needs to garble the circuit  $f_i$  and generate some link materials associated with  $f_i$  to link the garbled materials together. In terms of security,  $\Pi_{semi}$  is secure when the server is maliciously corrupted, and the parties are corrupted by semi-honest and independent adversaries.

**Protocol description.** We provide the details of the protocol  $\Pi_{semi}$  in Fig. 3. In the protocol generation phase, the load-balanced protocol generator GenProt<sup>LB</sup> generates a composite circuit CompCirc =  $(N, \{f_s\}_{s \in [N]}, \text{link}, \mathcal{I}, \mathcal{O})$ computing f. In CompCirc, the size of each simple circuit  $f_i$  is proportional to  $P_i$ 's computing power  $\tau_i$  and communication bandwidth  $\rho_i$ . GenProt<sup>LB</sup> can generate the composite circuit using the strategies discussed in Sec. 5.

In the offline phase, the parties first parse the composite circuit and prepare the virtual simple circuits  $f_0$  and  $f_{N+1}$ . The party  $P_1$  samples the garbled circuit seed seed uniformly at random and sends seed to the other parties. The parties then use a PRG to extend seed into  $2 \cdot N + 5$  seeds such that each step of the garbling algorithm CGC<sup>GC</sup>.Gb can be determined. For  $i \in [N]$ , the party  $P_i$  generates the input encoding information of all the simple circuits, and it generates the garbled material and output encoding information of the simple circuit  $f_i$ . In this way,  $P_i$  can generate the link material associated with  $f_i$ . Additionally, we let  $P_1$  generate the link material associated with the input simple circuit  $f_0$ . The parties then generate the output decoding information, and they send the generated garbled material and link material to the server.

The online phase of  $\Pi_{semi}$  is essentially the same as the online phase of  $\Pi_{mal}$ . Note that in the composite garbling scheme, the input encoding information of the input simple circuit  $f_0$  is used as the input encoding information of the composite circuit. After receiving the inputs, the parties select the wire labels of their inputs and send the labels to the server. The server evaluates the garbled circuit according to the evaluation algorithm of the composite garbling scheme, and it sends the garbled output to the parties. At the end, the parties decode and output.

Efficiency. The concrete efficiency of  $\Pi_{semi}$  depends on each party's computing power and communication bandwidth as well as the how the load-balanced protocol generator GenProt<sup>LB</sup> generates the composite circuit CompCirc. Generally, in a GC-based protocol, the main computation cost is generating and evaluating the garbled circuit, and the main communication cost is transmitting the garbled circuit. We assume that GenProt<sup>LB</sup> appropriately generates CompCirc, such that the size of each simple circuit  $f_i$  is proportional to  $P_i$ 's computing power  $\tau_i$  and communication bandwidth  $\rho_i$ , then we can say that the protocol  $\Pi_{semi}$  is communication & communication load-balanced.

**Security.** The security analysis of  $\Pi_{semi}$  is much similar to that of  $\Pi_{mal}$ . The malicious adversary  $\mathcal{A}_s$  that corrupts server only sees the garbled input, garbled materials and link materials. Due to the obliviousness of CGC<sup>GC</sup>,  $A_s$ cannot obtain information about the parties' inputs from the garbled circuit. Besides, the authenticity of CGC<sup>GC</sup> prevents  $A_s$  from forging garbled output. As for the semi-honest parties, in the execution of  $\Pi_{semi}$ , each party receives at most two messages: (i) the garbled circuit seed from  $P_1$  and (ii) the garbled output from server. These messages does not leak extra information about other parties' inputs. Therefore, the protocol  $\Pi_{\text{semi}}$  is secure when a malicious adversary corrupts the server, and the parties are corrupted by semi-honest and independent adversaries.

The formal security theorem for  $\Pi_{\text{semi}}$  is given below, and its proof can be found in App. A.3.

**Theorem 3.** If (a)  $\mathsf{PRG} : \{0,1\}^{\lambda} \to \{0,1\}^{(2 \cdot N + 5) \cdot \lambda}$  is a secure PRG and (b)  $\mathsf{CGC}^{\mathsf{GC}} := (\mathsf{Gb}, \mathsf{En}, \mathsf{Ev}, \mathsf{De}, \mathsf{ev}_{\mathsf{sc}})$  is the composite garbling scheme constructed in Sec. 6, then the protocol  $\Pi_{\text{semi}}$  depicted in Fig. 3 is secure when a malicious adversary corrupts the server, and the parties are corrupted by semi-honest and independent adversaries. Specifically, the malicious adversary is non-cooperative with respect to all other adversaries.

<u>Remark.</u> To achieve better load balancing, the load-balanced protocol generator GenProt<sup>LB</sup> actually distributes the work of generating and transmitting the link materials associated with the simple circuit  $f_0$  to all the parties. Nevertheless, this tweak does not affect the semi-honest security.

#### **Implementation and Benchmarks** 8

**Experimental Setup.** We implement the protocols  $\Pi_{mal}$  and  $\Pi_{semi}$  in C++. We implement the PRG algorithm and the multiple circular correlation robust hash function H with AES-NI, and we use SHA256 for other hash functions. We use the half-gates garbling scheme as the garbling scheme in  $\Pi_{mal}$  and the basic garbling scheme for CGC<sup>GC</sup>,

Protocol	Running Time (in ms)						
	Setup	Offline	Online	Total			
Semi-honest Yao [47]	8.101	3.579	0.579	12.258			
Auth. Garb. [44]	30.847	72.890	0.786	103.737			
Lu <i>et al.</i> [33]	9.530	3.982	0.627	14.139			
$\Pi_{\sf mal}$	_	5.073	0.560	5.633			
$\Pi_{semi}$	—	4.301	0.495	4.796			

Table 4: Efficiency comparison of two-party computation protocols.

Table 5: Efficiency comparison of semi-honest multi-party computation protocols. Num of parties = 3.

Protocol	Circuit	Running Time (in ms)					
		Setup	Offline	Online	Total		
Optimized BMR [6]	AES128 SHA256	360.132 358.927	224.937 2705.085	5.121 21.409	590.191 3085.422		
$\varPi_{semi}$	AES128 SHA256	_	4.714 16.353	0.607 1.428	5.321 17.780		

which is open source in the EMP toolkit [43]. We use the hash-based commitment scheme, that is, commit(m; r) = SHA256(m||r).

We use the AES128 circuit and the SHA256 circuit from Bristol Fashion circuits [2] as the benchmark circuits. If not explicitly stated otherwise, the following evaluation results are for the AES128 circuit. For the multi-party case, we construct multi-party circuits from the original circuits in the following way: the inputs of  $\{P_i\}_{i \in [N-1]}$  are XOR-ed together to be used as the input of  $P_1$  in the original circuit, and the input of  $P_N$  is used as the input of  $P_2$  in the original circuit. We use the acyclic graph partitioning algorithm of Herrmann *et al.* [23] to generate the composite circuit used in  $\Pi_{\text{semi}}$ , which is open source in dagP [24].

We perform the experiments on a Dell OptiPlex 7080 equipped with an Intel Core 8700 CPU @ 3.20 GHz with 32.0 GB RAM, running Ubuntu 18.04 LTS. In the experiments, all of the parties have the same computing power and the same communication speed. Specifically, the communication speed of each party is restricted to 500Mbps. All the reported results are the average of 10 tests.

**Two-Party Computation.** For the two-party case, we compare our protocols  $\Pi_{mal}$  and  $\Pi_{semi}$  with the Yao's Garbled Circuits protocol [47], which is secure in the *semi-honest* setting, the two-party authenticated garbling protocol [44], which is secure in the *malicious* setting, and the state-of-the-art server-aided protocol of Lu *et al.* [33], which is secure against *semi-honest server and malicious parties.* The Yao's GC protocol and the two-party authenticated garbling protocol of Lu *et al.* [33], which is secure in the EMP toolkit [43]; and we re-implement the server-aided protocol of Lu *et al.* 

We provide the evaluation results in Table. 4. The running time of our communication load-balanced protocol  $\Pi_{\mathsf{semi}}$  is 5.633ms, and the running time of our communication & computation load-balanced protocol  $\Pi_{\mathsf{semi}}$  is 4.796ms. Compared with the semi-honest Yao's protocol,  $\Pi_{\mathsf{mal}}$  is 2.17× faster and  $\Pi_{\mathsf{semi}}$  is 2.55× faster, while both of our protocols consider malicious adversary. Compared with the maliciously secure authenticated garbling protocol,  $\Pi_{\mathsf{mal}}$  is 18.41× faster and  $\Pi_{\mathsf{semi}}$  is 21.62× faster. Compared with the server-aided protocol of Lu *et al.*,  $\Pi_{\mathsf{mal}}$  is 2.51× faster and  $\Pi_{\mathsf{semi}}$  is 2.94× faster, specifically,  $\Pi_{\mathsf{mal}}$  considers both malicious server and malicious parties, and it is more secure than the server-aided protocol of Lu *et al.* 

**Multi-Party Computation.** For the multi-party case, we compare our protocols  $\Pi_{mal}$  and  $\Pi_{semi}$  with the optimized BMR protocol [6], which is secure in the *semi-honest* setting, the multi-party authenticated garbling protocol [45], which is secure in the *malicious* setting, and the state-of-the-art server-aided protocol of Lu *et al.* [33], which is secure against *semi-honest server and malicious parties.* The optimized BMR protocol is open source in [7], but the implementation only provides a 3-party AES128 circuit and a 3-party SHA256 circuit, so we only provide the evaluation results for the 3-party case; the multi-party authenticated garbling protocol is open source in the EMP toolkit [43]; and we re-implement the server-aided protocol of Lu *et al.* 

Protocol	Phase	Running Time for Different Number of Parties (in ms)						
11010000	1 11450	2	3	4	5	6	f Parties (in ms)           7           565         206.129           980         1639.160         3           003         8.118         3           549         1853.407         3           786         18.786         7           718         4.842         262           262         1.327         7           766         24.955         0           080         5.098         777           777         0.832         857           857         5.930         0           012         5.348         779           79         0.848         791           6.195         0         0	8
	Setup	18.193	40.410	69.951	108.777	144.565	206.129	281.735
Auth. Garb. [45]	Offline	86.732	238.638	472.509	782.390	1178.980	1639.160	2177.836
	Online	1.503	3.467	3.328	5.050	7.003	8.118	8.777
	Total	106.428	282.516	545.789	896.217	1330.549	1853.407	2468.348
	Setup	9.530	9.956	10.899	12.024	16.786	18.786	19.564
Lu <i>et al.</i> [33]	Offline	3.982	4.047	4.265	4.455	4.718	4.842	5.040
20 01 00 [00]	Online	0.627	0.723	0.768	0.981	1.262	1.327	1.540
	Total	14.139	14.726	15.931	17.460	22.766	24.955	26.144
	Offline	5.073	5.032	5.055	5.049	5.080	5.098	5.099
$\Pi_{\sf mal}$	Online	0.560	0.670	0.691	0.751	0.777	0.832	0.907
	Total	5.633	5.702	5.746	5.799	5.857	5.930	6.006
	Offline	4.301	4.714	4.850	4.911	5.012	5.348	5.808
$\Pi_{semi}$	Online	0.495	0.607	0.641	0.749	0.779	0.848	0.918
	Total	4.796	5.321	5.490	5.660	5.791	6.195	6.726

Table 6: Efficiency comparison of maliciously secure multi-party computation protocols.

We compare the performance of the semi-honest protocols in Table. 5. For the AES128 circuit, our communication & computation load-balanced protocol  $\Pi_{semi}$  only takes 5.321ms, which is  $110.91 \times$  faster than the BMR protocol; for the SHA256 circuit, our protocol  $\Pi_{semi}$  only takes 17.780ms, which is  $173.53 \times$  faster than the BMR protocol. This efficiency improvement is mainly because in our protocol, the parties only needs to locally generate part of the garbled circuit; while in the BMR protocol, the parties needs to communicate with each other to generate the garbled circuit, specifically, the size of the garbled circuit in BMR increases with the number of involved parties.

We compare the performance of the maliciously secure protocols in Table. 6. Since  $\Pi_{semi}$  considers potentially malicious server, we also provide the evaluation results of  $\Pi_{semi}$  as a supplement. Compared with the multi-party authenticated garbling protocol and the server-aided protocol of Lu *et al.*, the performance of  $\Pi_{mal}$  and  $\Pi_{semi}$  is less affected by the number of involved parties. For the 8-party case,  $\Pi_{mal}$  takes 6.006ms, which is 410.98× faster than the multi-party authenticated garbling protocol and 4.35× faster than the server-aided protocol of Lu *et al.*;  $\Pi_{semi}$  takes 6.726ms, which is 366.98× faster than the multi-party authenticated garbling protocol of Lu *et al.* 

One may note that, the semi-honest  $\Pi_{semi}$  is slower than the maliciously secure  $\Pi_{mal}$  when there are more than 6 parties. This is because  $\Pi_{semi}$  requires the parties to generate and transfer some link materials. As the number of involved parties increases, the circuit needs to be partitioned into more segments, thus contains more link information. While in  $\Pi_{mal}$ , the overall communication cost is basically unaffected by the number of involved parties.

**Load Balancing.** We also examine whether our protocols are load-balanced. As for the protocol  $\Pi_{mal}$ , we provide the communication cost of the participants in Table. 1. For the 2-party case, the highest and the lowest communication costs are 104640 Bytes and 104544 Bytes, and the difference is merely 96 Bytes; even for the 8-party case, the difference is only 384 Bytes. Moreover, the overall offline communication costs of  $\Pi_{mal}$  for the 2-party case and the 8-party case are only 205120 Bytes and 207616 Bytes, respectively, while simply sending the garbled material F needs 204800 Bytes of communication. As for the online communication, all of the parties have the same input length, thereby having the same communication cost.

As for the protocol  $\Pi_{\text{semi}}$ , we provide the communication costs in Table. 2 and the running time for generating the garbled materials and link materials in Table. 3. We omit the server's costs in the table since its offline communication cost is 0 and its online communication cost is the same as the cost in  $\Pi_{\text{mal}}$ . Compared with  $\Pi_{\text{mal}}$ , the parties need to additionally transfer the link materials, hence having slightly higher communication costs. For the 2-party case, the highest and the lowest communication costs are 116432 Bytes and 116400 Bytes, and the difference is merely 32 Bytes. When there are more parties, the sizes of the link information associated with different simple circuits may have larger difference. However, even for the 8-party case, the difference between the highest and the lowest communication costs is only 8320 Bytes.

To evaluate the computation time, we generate the garbled materials and link materials in the way described in  $\Pi_{\text{semi}}$  for 1000 times. For comparison, we also generate the garbled materials according to the half-gates garbling scheme for 1000 times, and we refer to the running time of the half-gates garbling scheme as the original time. The original time is about 240ms. For the 2-party case, the highest and the lowest running time are 143.872ms and 133.768ms, respectively, both of which are about half of the original time. The parties' running times do not decrease linearly as the number of the parties increase; instead, when there are too many parties, the running time may even increase, because the size of the link information grows too fast. But even for the 8-party case, the running times of the parties are still much shorter than the original time. Besides, the results of  $\Pi_{\text{semi}}$  can benefit from the improvement of graph partitioning algorithms.

As a conclusion, the proposed protocols are indeed *load-balanced*.

## 9 Related Work

**Server-Aided MPC.** In our protocols, the non-colluding server is indispensable for the load balancing purpose. Kamara, Mohassel and Raykova [26] first formalized the notion of *server-aided* MPC, in which the server does not collude with the parties. Specifically, they found that with the assistance of a non-colluding server, the workload of the party  $P_2$  can be sublinear in the circuit size, which is impossible in the previous works if the fully-homomorphic encryption technique is not adopted. Following [26], many server-aided MPC protocols are proposed [8, 10–12, 25, 27, 33, 35, 46], but none of these works can *freely* adjust the parties' workloads while ensure efficiency.

[10, 11, 27, 33, 46] consider the mobile cloud computing setting and propose solutions based on GC. During the protocol execution, one of the parties interacts with the server to generate and evaluate the GC, while the other parties only provide their inputs and carry out some verifications. Therefore, the workload of the heavy-load party has to be  $\mathcal{O}(|f|)$ , while the other parties cannot help to share the workload. Similarly, Carter *et al.* [12] proposed a server-aided two-party computation protocol in which the server and the party  $P_1$  execute another two-party computation protocol, and the party  $P_2$  only deliver the input and verify the output. Their protocol has the same weakness as the GC-based solutions. Jakobsen, Nielsen and Orlandi [25] instead consider the setting of secure outsourced computation, in their protocol, the parties outsource the computation to a number of servers in a verifiable way. Obviously, the parties cannot contribute to the MPC execution either. Mohassel, Orobets and Riva [35] adapted the protocol of Nielsen [39] to the server-aided setting. In the offline phase, the non-colluding server generates and provides authenticated triples to the parties, and in the online phase, the parties computes in a similar way as [39]. Although they claim that the parties can be instantiated with mobile devices, the workloads of the parties are actually the same as the circuit size. To the best of our knowledge, the only server-aided MPC protocol that allows freely distribute the workload is [8], but as discussed in Sec. 1, their protocol use GC as the building block but is not compatible with many practical GC optimizations and is therefore inefficient.

**MPC with Composite Circuit.** Although the notion of composite circuit has not been explicitly proposed prior to this work, the idea of combining simple circuits or partitioning complex circuits has been widely used. The reactive computation, e.g., [40], allows for partial evaluation of the circuit. Specifically, some reactive secure computation protocols, e.g., the SPDZ protocol [17] and the TinyOT protocol [39], realize the arithmetic black-box functionality, which allows the parties to compute the whole computation task by sequentially invoking adders (XOR) and multipliers (AND). Similar to our work, the GC-based reactive computation protocols [30, 40] also generate garbled circuit of each simple circuit (component) and link the generated garbled materials together. However, they focus on fine-grained cut-and-choose and maliciously secure computation, and do not consider to distribute the workloads of the parties.

Recently, Chen *et al.* [13] proposed the Silph compiler, which also use the graph partitioning algorithms in MPC. Silph considers the hybrid protocol assignment problem, which aims to use secret sharing, garbled circuit and other MPC primitives to generate a hybrid MPC protocol, while minimizing the overall cost. Silph finds that, the protocol assignment problem can be expressed as a integer linear programming (ILP) problem. Since ILP algorithms are not scalable to large programs, Silph further uses graph partitioning algorithms to decompose the target program into multiple components. Therefore, Silph and our protocols use the graph partitioning algorithms for different purposes. Nevertheless, Silph is inspiring to our future work, since it considers mixed circuits while we only consider boolean circuits.

## 10 Conclusion

In this work, we initiate the study of load-balanced MPC, which takes the participants' communication and computation resources into consideration and can adjust the participants' workloads accordingly. We construct a communication load-balanced protocol and a communication & computation load-balanced MPC protocol in the server-aided model. The evaluation results show that they are much more efficient than the existing protocols.

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## A Security Proofs of Our Theorems

### A.1 Proof of Theorem. 1

*Proof.* According to Lemma. 1, to prove Thm. 1, we only need to consider (i) the case where all the parties and the server are corrupted by semi-honest and independent adversaries, (ii) the case where the server is corrupted by a malicious adversary while the parties are honest, and (iii) the case where up to N - 1 parties are corrupted by a malicious adversary while the remaining parties and the server are honest. For each case, we present corresponding simulators that make the ideal-world execution and real-world execution indistinguishable.

Claim. The protocol  $\Pi_{mal}$  depicted in Fig. 1 is secure in the presence of N + 1 semi-honest and independent adversaries.

*Proof.* In this case, we assume that the adversary  $A_s$  corrupts the server and the adversary  $A_i$  corrupts the party  $P_i$ , for  $i \in [N]$ . We construct the simulators in the following way:

- The simulator  $S_s$  is constructed by  $S_s := Sim_s(A_s)$ :
  - For steps 1-3,  $S_s$  acts as the honest parties  $\{P_i\}_{i \in [N]}$ .  $S_s$  samples  $coin_1, r \stackrel{\$}{\leftarrow} \{0, 1\}^{\lambda}$  and computes  $c_{coin} := commit(m, r)$ . For  $i \in [N]$ ,  $S_s$  sends  $c_{coin}$  to  $\mathcal{A}_s$  on behalf of  $P_i$ . Meanwhile,  $S_s$  receives  $coin_2$  from  $\mathcal{A}_s$  on behalf of the parties.
  - For steps 4-6, S<sub>s</sub> uses the obliviousness simulator for GC to generate the fake garbled circuit to obtain the garbled materials *F* and garbled input *X*, that is, (*F*, *X*) ← Sim<sub>GC</sub>(1<sup>λ</sup>, *f*). According to the protocol description, S<sub>s</sub> partitions the garbled material *F* into {*F*<sub>i</sub>}<sub>i∈[N]</sub>, and it generates the hash values. After that, S<sub>s</sub> sends the garbled material segments, the hash values and the garbled input to A<sub>s</sub> on behalf of the parties in step 4(c), step 4(d) and step 6(c).
  - For steps 7-8, S<sub>s</sub> receives the garbled output from the adversary A<sub>s</sub> on behalf of the parties. S<sub>s</sub> then instructs the trusted third party to send the output to all of the parties. At the end, S<sub>s</sub> outputs the entire view of A<sub>s</sub>. Server's partial output only consists of the view of the adversary A<sub>s</sub>. Throughout the execution, A<sub>s</sub> only receives the commitments of a random coin, the garbled material segments and the hash values of the garbled material segments. When Com is hiding, A<sub>s</sub> cannot extract any information of coin<sub>1</sub> from the commitments; when GC has obliviousness, the fake garbled circuit is indistinguishable from a genuine one; as for the hash values, A<sub>s</sub> already receives their pre-images. Therefore, Server's partial output in the real-world execution are indistinguishable from Server's partial output in the ideal-world execution.
- The simulator  $S_1$  is constructed by  $S_1 := Sim_1(A_1)$ :
  - For steps 1-5, S<sub>1</sub> acts as the honest parties {P<sub>i</sub>}<sub>i∈[2,N]</sub> and the honest server Server. S<sub>1</sub> receives coin<sub>1</sub>, r from A<sub>1</sub> on behalf of the parties and receives c<sup>(1)</sup><sub>coin</sub> from A<sub>1</sub> on behalf of the server. At the same time, S<sub>1</sub> samples coin<sub>2</sub> <sup>\$</sup> {0,1}<sup>λ</sup> and sends coin<sub>2</sub> to A<sub>1</sub> on behalf of Server. After receiving seed, S<sub>1</sub> generates the garbled circuit by (F, e, d) := GC.Gb(1<sup>λ</sup>, f; seed). Subsequently, S<sub>1</sub> receives the garbled material segment and the hash values from A<sub>1</sub> on behalf of Server.
  - For step 6,  $S_1$  receives the input  $\{x_k^{(1)}\}_{k \in [\ell]}$  and sends  $\{x_k^{(1)}\}_{k \in [\ell]}$  to the trusted third party to obtain the output y. Meanwhile,  $S_1$  receives  $\{X_k\}_{k \in [\ell]}$  from  $\mathcal{A}_1$  on behalf of Server.
  - For step 7, S<sub>1</sub> generates the garbled output Y according to the garbled circuit and the output y, and it sends *˜* Y to A<sub>1</sub> on behalf of Server. Note that S<sub>1</sub> knows the seed for the garbling algorithm, it can extract the wire labels of the output wires and arrange a fake garbled output that evaluates to y.
  - For step 8,  $S_1$  outputs the view of  $A_1$ .

 $P_1$ 's partial output only consists of the view of the adversary  $A_1$ . Throughout the execution,  $A_1$  only receives  $coin_2$  and  $\widetilde{Y}$  from the simulator  $S_1$ . As in the protocol description, the random  $coin coin_2$  is uniformly random. Besides,  $S_1$  programs  $\widetilde{Y}$  such that  $De(d, \widetilde{Y}) = y$  where y is the real output. Therefore,  $P_1$ 's partial output in the real-world execution are indistinguishable from  $P_1$ 's partial output in the ideal-world execution.

- For  $i \in [2, N]$ , the simulator  $S_i$  can be constructed in a similar way as  $S_1$ , except that in step 1,  $S_i$  needs to sample  $coin_1, r \stackrel{s}{\leftarrow} \{0, 1\}^{\lambda}$  and sends coin, r to  $\mathcal{A}_i$  on behalf of  $P_1$ , and in step 2(b),  $\mathcal{S}_i$  needs to send seed :=  $coin_1 \oplus coin_2$ to  $A_i$  on behalf of  $P_1$ . The proof of indistinguishability is also similar, so we omit the details here.

Each partial output in the ideal-world execution is indistinguishable from the corresponding partial output in the real-world execution. According to the security definition, the protocol  $\Pi_{mal}$  depicted in Fig. 1 is secure in the presence of N + 1 semi-honest and independent adversaries.

*Claim.* The protocol  $\Pi_{mal}$  depicted in Fig. 1 is secure in the presence of a malicious adversary corrupting the server.

*Proof.* In this case, we construct the simulator S by S := Sim(A). Whenever A aborts, S instructs the trusted third party to send  $\perp$  to all the parties  $\{P_i\}_{i \in [N]}$ . If  $\mathcal{A}$  does not abort, the simulation is done in the following way:

- For step 1, S samples coin<sub>1</sub>, r <sup>\$</sup> {0,1}<sup>λ</sup>. For i ∈ [N], S receives coin<sub>2</sub><sup>(i)</sup> from the adversary A on behalf of P<sub>i</sub>.
  For step 2, S computes c<sub>coin</sub> := commit(coin<sub>1</sub>, r) and sends c<sub>coin</sub> to the adversary A on behalf of P<sub>i</sub>, for i ∈ [N].
- For step 3, if there exists i, j such that  $coin_2^{(i)} \neq coin_2^{(j)}$ , S sends an abort message to A and the trusted third party, and it outputs the entire view of A.
- For step 4(a), S invokes the obliviousness simulator for the garbling scheme to generate the fake garbled material  $\tilde{F}$  and the fake garbled input  $\tilde{X}$ , that is,  $(\tilde{F}, \tilde{X}) \leftarrow \mathsf{Sim}_{\mathsf{GC}}(1^{\lambda}, f)$ .
- For step 4(b), S partitions the garbled material  $\tilde{F}$  into N segments  $\{\tilde{F}_i\}_{i \in [N]}$  according to the protocol description.
- For steps 4(c)-4(d), S computes the hash values of the garbled material segments. According to the protocol description,  $\mathcal{S}$  sends the garbled material segments and the hash values to  $\mathcal{A}$  on behalf of the parties.
- For step 6, S sends the fake garbled input to the adversary A on behalf of the parties. More concretely, S parses  $\tilde{X} = {\{\tilde{X}_t\}}_{t \in f.\mathcal{I}}$ . For  $i \in [N]$ ,  $\mathcal{S}$  sends  ${\{\tilde{X}_{(i-1)}, \ell+k\}}_{k \in [\ell]}$  to the adversary  $\mathcal{A}$  on behalf of  $P_i$ .
- For step 7, for  $i \in [N]$ , S receives  $\hat{Y}_i$  from the adversary A on behalf of  $P_i$ .
- For step 8, S computes  $\tilde{Y} := \mathsf{GC}.\mathsf{Ev}(f, \tilde{F}, \tilde{X})$  by itself and it compares  $\tilde{Y}$  with each of  $\{\hat{Y}_i\}_{i \in [N]}$ . When the trusted third party asks which of the parties should receive the output, S instructs the trusted third party to send the output to the parties who receive  $\tilde{Y} = \hat{Y}_i$  and to send  $\perp$  to the parties who receive  $\tilde{Y} \neq \hat{Y}_i$ . At the end, S outputs the entire view of A.

We prove the indistinguishability through a sequence of hybrid worlds.

- **Hyb**<sub>0</sub>. This is the real-world.
- Hyb<sub>1</sub>. This hybrid world is the same as Hyb<sub>0</sub>, except that in Hyb<sub>1</sub>, the seed of the garbled circuit is sampled at uniformly random, that is, seed  $\stackrel{\$}{\leftarrow} \{0,1\}^{\lambda}$ . When Com is hiding, it is hard for the adversary  $\mathcal{A}$  to extract information of  $coin_1$  from the commitment  $c_{coin}$ . Even though  $coin_2$  is chosen by  $\mathcal{A}$ , seed :=  $coin_1 \oplus coin_2$  is still masked by a uniformly random one-time pad, and is indistinguishable from true randomness. Therefore,  $Hyb_0$ and  $\mathbf{Hyb}_1$  are indistinguishable.
- Hyb<sub>2</sub>. This hybrid world is the same as Hyb<sub>1</sub>, except that in Hyb<sub>2</sub>, if a party  $P_i$  receives  $coin_2^{(i)} \neq coin_2^{(j)}$ , the simulator S sends an abort message to A and the trusted third party. In  $Hyb_1$ , the computation also terminates if such event happens, so  $Hyb_1$  and  $Hyb_2$  are indistinguishable.
- $Hyb_3$ . This hybrid world is the same as  $Hyb_2$ , except that in  $Hyb_3$ , the simulator S checks the garbled output sent by the adversary  $\mathcal{A}$  in the following way:  $\mathcal{S}$  execute the evaluation algorithm GC.Ev to obtain the garbled output, and it compares the generated garbled output with the garbled outputs received by the parties. If a party  $P_i$  receives an inconsistent garbled output, S instructs the trusted third party to send  $\perp$  to  $P_i$ ; otherwise, S instructs the trusted third party to send the actual output y to  $P_i$ . When GC has authenticity, it is hard for the adversary A to forge a valid garbled output. Therefore, the outputs of the honest parties in the Hyb<sub>2</sub> and in Hyb<sub>3</sub> are indistinguishable.

- Hyb<sub>4</sub>. This hybrid world is the same as Hyb<sub>3</sub>, except that in Hyb<sub>4</sub>, the parties uses the obliviousness simulator for GC to generate a fake copy of the garbled circuit. In step 4 and step 6, the parties sends the fake garbled circuit to the adversary  $\mathcal{A}$ . When GC has obliviousness, the fake garbled circuit is indistinguishable from a genuine one, and the views of A in  $\mathbf{Hyb}_3$  and in  $\mathbf{Hyb}_4$  are indistinguishable.

Note that,  $\mathbf{Hyb}_4$  is the ideal-world. The view of the adversary  $\mathcal{A}$  and the output of the honest parties  $\{P_i\}_{i \in [N]}$  in the execution of  $\mathbf{Hyb}_4$  are indistinguishable from the corresponding variables in the execution of  $\mathbf{Hyb}_0$ . According to the security definition, the protocol  $\Pi_{mal}$  depicted in Fig. 1 is secure in the presence of a malicious adversary corrupting the server.

*Claim.* The protocol  $\Pi_{mal}$  depicted in Fig. 1 is secure in the presence of a malicious adversary corrupting up to N-1parties.

*Proof.* Without loss of generality, we consider the case where  $\mathcal{A}$  corrupts  $\{P_i\}_{i \in [N-1]}$ . We construct a simulator  $\mathcal{S}$ by  $\mathcal{S} := \mathsf{Sim}(\mathcal{A})$ :

- For step 1(a), S receives coin<sub>1</sub>, r from  $P_1$  on behalf of  $P_N$ .
- For step 1(b), S samples  $\operatorname{coin}_2 \stackrel{\$}{\leftarrow} \{0, 1\}^{\lambda}$  and sends  $\operatorname{coin}_2$  to  $\mathcal{A}$  on behalf of Server. For step 2(a), S receives  $\{c_{\operatorname{coin}}^{(i)}\}_{i \in [N-1]}$  from  $\mathcal{A}$  on behalf of Server.
- For step 2(b), S receives seed from A on behalf of  $P_N$ .
- For step 3(a), S computes seed :=  $coin_1 \oplus coin_2$ . If seed  $\neq$  seed, S sends an abort message to A on behalf of  $P_N$ and sends an abort message to the trusted third party on behalf of  $P_1$ , then it outputs the entire view of  $\mathcal{A}$ .
- For step 3(b), S computes  $c_{coin}^{(N)} := \text{commit}(\text{coin}_1, r)$ . For  $i \in [N-1]$ , S asserts that  $c_{coin}^{(i)} = c_{coin}^{(N)}$ . If there exists i such that  $c_{coin}^{(i)} \neq c_{coin}^{(N)}$ , S sends an abort message to A and the trusted third party, then it outputs the entire view of  $\mathcal{A}$
- For step 4, S generates  $(F, e, d) := \mathsf{GC.Gb}(1^{\lambda}, f; \mathsf{seed})$  and partitions F into  $\{F_i\}_{i \in [N]}$ . S then receives the garbled material segments and the hash values from  $\mathcal{A}$  on behalf of Server.
- For step 5, S checks the garbled material segments and the hash values. For  $i \in [N]$ , S computes  $h_i := H(F)$ by itself, then it asserts all the hash values associated with the garbled material segment  $F_i$  are the same. Additionally, S checks the garbled material segments sent by the parties by asserting  $F_i = F_i$ , for  $i \in [N]$ . If any assertion fails, S sends an abort message to A on behalf of Server and sends an abort message to the trusted third party on behalf of the parties that send inconsistent values, and it outputs the entire view of A.
- For step 6, S receives the garbled inputs  $\{\hat{X}_k\}_{k \in [(N-1) \cdot \ell]}$  from A on behalf of Server. S then extracts the inputs of  $\mathcal{A}$ .  $\mathcal{S}$  parses the input encoding information  $e := \{W_t^0, W_t^1\}_{t \in f.\mathcal{I}}$ . For  $i \in [N-1]$ ,  $k \in [\ell]$ , if there exists  $\tilde{x}_{i,k} \in \{0,1\}$  such that  $W_{(i-1)\cdot\ell+k}^{\tilde{x}_{i,k}} = \hat{X}_{(i-1)\cdot\ell+k}$ , then  $\mathcal{S}$  sets  $\tilde{x}_{i,k}$  as the k-th bit of  $P_i$ 's input; otherwise,  $\mathcal{S}$  sets  $\tilde{x} := \bot.$
- For step 7, S sends the extracted  $\{\tilde{x}_i\}_{i \in [N-1]}$  to the trusted third party and receives the output back. If the output is  $\bot$ , S sends  $Y := \bot$  to A on behalf of Server and it outputs the entire view of A. If the output is y, S generates a fake garbled output Y according to the garbled circuit and the output y, and it sends Y to A on behalf of Server.
- For step 8, S outputs the entire view of A.

We prove the indistinguishability through a sequence of hybrid worlds.

- **Hyb**<sub>0</sub>. This is the real-world.
- $Hyb_1$ . This hybrid world is the same as  $Hyb_0$ , except that in  $Hyb_1$ , if the server Server receives inconsistent commitments from  $\{P_i\}_{i \in [N-1]}$ , the simulator S sends an abort message to A and the trusted third party. In  $\mathbf{Hyb}_0$ , the computation also terminates if such event happens, so  $\mathbf{Hyb}_0$  and  $\mathbf{Hyb}_1$  are indistinguishable.
- **Hyb**<sub>2</sub>. This hybrid world is the same as **Hyb**<sub>1</sub>, except that in **Hyb**<sub>2</sub>, if  $P_N$  receives  $\widehat{\text{coin}_1}$ ,  $\hat{r}$  such that commit $(\widehat{\text{coin}_1}, \hat{r}) \neq \hat{r}$  $c_{coin}$ , the simulator S sends an abort message to A on behalf of Server and to the trusted third party on behalf of  $P_1$ . Note that, when Com is binding, it is hard for A to find inconsistent values that computes to the same commitment, so  $\mathbf{Hyb}_1$  and  $\mathbf{Hyb}_2$  are indistinguishable.
- $\mathbf{Hyb}_3$ . This hybrid world is the same as  $\mathbf{Hyb}_2$ , except that in  $\mathbf{Hyb}_3$ , if the party  $P_N$  receives seed  $\neq$  seed where seed :=  $coin_1 \oplus coin_2$ , the simulator S sends an abort message to A and the trusted third party. In **Hyb**<sub>2</sub>, the computation also terminates if such event happens, so  $\mathbf{Hyb}_2$  and  $\mathbf{Hyb}_3$  are indistinguishable.

- $\mathbf{Hyb}_4$ . This hybrid world is the same as  $\mathbf{Hyb}_3$ , except that in  $\mathbf{Hyb}_4$ , if the server Server receives inconsistent hash values of the garbled material segments, the simulator S sends an abort message to A and the trusted third party. In  $\mathbf{Hyb}_3$ , the computation also terminates if such event happens, so  $\mathbf{Hyb}_3$  and  $\mathbf{Hyb}_4$  are indistinguishable.
- $\mathbf{Hyb}_5$ . This hybrid world is the same as  $\mathbf{Hyb}_4$ , except that in  $\mathbf{Hyb}_5$ , the simulator S additionally checks the garbled material segments in the following way: S uses the seed computed by the party  $P_N$  to generate the garbled circuit by itself, and it compares the garbled material segments sent by the parties  $\{P_i\}_{i \in [N-1]}$  with the generated garbled material segments. If Server receives inconsistent garbled material segments, S sends an abort message to A and the trusted third party. When H is a collision-resistant hash function, it is hard for the adversary A to forge fake garbled materials and link materials that evaluates to the same hash value. Therefore,  $\mathbf{Hyb}_4$  and  $\mathbf{Hyb}_5$  are indistinguishable.
- $\mathbf{Hyb}_6$ . This hybrid world is the same as  $\mathbf{Hyb}_5$ , except that in  $\mathbf{Hyb}_6$ , the simulator S extracts the inputs of the corrupted parties from the garbled input received by the server Server according to the input encoding information. Subsequently, S sends the extracted inputs to the trusted third party as the inputs of the parties. After receiving the output y from the trusted third party, Server sets the garbled output according to y and the garbled circuit, and it sends the garbled output to A.  $\mathbf{Hyb}_5$  and  $\mathbf{Hyb}_6$  differs only when the adversary A manages to find  $\hat{X}_t \notin \{W_t^0, W_t^1\}$  that also evaluates to valid garbled output. According to the authenticity of GC, this only happens with negligible probability. Therefore,  $\mathbf{Hyb}_5$  and  $\mathbf{Hyb}_6$  are indistinguishable.

Note that,  $\mathbf{Hyb}_6$  is the ideal-world. The view of the adversary  $\mathcal{A}$  and the output of the honest party  $P_N$  in the execution of  $\mathbf{Hyb}_6$  are indistinguishable from the corresponding variables in the execution of  $\mathbf{Hyb}_0$ . According to the security definition, the protocol  $\Pi_{mal}$  depicted in Fig. 1 is secure in the presence of a malicious adversary corrupting up to N - 1 parties.

According to Lemma. 1, we can conclude that  $\Pi_{mal}$  depicted in Fig. 1 is secure when (i) a malicious adversary corrupts up to N - 1 parties, and the other parties and the server are corrupted by semi-honest and independent adversaries, and (ii) a malicious adversary corrupts the server, and the parties are corrupted by semi-honest and independent adversaries.

#### A.2 Proof of Theorem. 2

Proof. To prove Thm. 2, we need to prove the correctness, obliviousness and authenticity of the construction  $CGC^{GC}$ . **Correctness.** The correctness of the construction  $CGC^{GC}$  follows from the correctness of GC. We only need to argue that the input labels of the simple circuits are properly generated and evaluated. To link the outputs of the simple circuit  $f_s$  to the subsequent simple circuits, the link material generation algorithm GenLink generates two ciphertexts  $\sigma_{s',t'}^0 := H(s,t,s',t',W_{s,t}^{\tau_{s,t}}) \oplus W_{s',t'}^{\tau_{s,t}}$  and  $\sigma_{s',t'}^1 := H(s,t,s',t',W_{s,t}^{\tau_{s,t}\oplus 1}) \oplus W_{s',t'}^{\tau_{s,t}\oplus 1}$ , where  $\tau_{s,t}$  is the select bit of the 0-label  $W_{s,t}^0$ . The evaluation  $CGC^{GC}$ . Ev computes  $X_{s',t'} := H(s,t,s',t',Y_{s,t}) \oplus \sigma_{s',t'}^{\tau_{s,t}}$ , where  $Y_{s,t}$  is the label of the wire t in the simple circuit s, and  $\tau'_{s,t}$  is the select bit of  $Y_{s,t}$ . Suppose the label  $Y_{s,t}$  carries the value v, then  $\sigma_{s',t'}^{\tau_{s,t}} = \sigma_{s',t'}^{\tau_{s,t}} = H(s,t,s',t',W_{s,t}^v) \oplus W_{s',t'}^v$ , and  $X_{s',t'} = W_{s',t'}^v$  also carries the value v. Therefore, the input labels of the simple circuits are properly generated and evaluated. We conclude that the CGC<sup>GC</sup> correctness game succeeds if all the GC correctness games for the simple circuits is the label  $Y_{s,t}$  is the label  $Y_{s,t}$  is the label  $Y_{s,t} = 0$ .

We conclude that the CGC<sup>GC</sup> correctness game succeeds if all the GC correctness games for the simple circuits succeed. If GC has correctness, the GC correctness game succeeds except with negligible probability, and  $poly(\lambda) \cdot negl(\lambda)$  is still negligible. In other words, if the basic garbling scheme GC has correctness, then the construction CGC<sup>GC</sup> has correctness.

**Obliviousness.** The obliviousness of the construction  $CGC^{GC}$  follows from the obliviousness of GC and the multiple correlation robustness of the hash function H. We first present the simulator in Fig. 4, and then we prove that  $Sim_{CGC}$  works. For each simple circuit  $f_s$ , the simulator  $Sim_{CGC}$  invokes  $Sim_{GC}$ , which is the obliviousness simulator for the basic garbling scheme GC, to simulate the garbled material  $\hat{F}_s$  and garbled input  $\hat{X}_s$ .  $Sim_{CGC}$  then invokes the evaluation algorithm to obtain the simulated garbled output  $\hat{Y}_s := Ev(f_s, \hat{F}_s, \hat{X}_s)$ . After that,  $Sim_{CGC}$  uses the procedure SimLink to simulate the link materials. Suppose the output wire t of the simple circuit  $f_s$  is linked to the input wire t' of the simple circuit  $f_{s'}$ , SimLink extracts the select bit  $\hat{\tau}_{s,t} := Isb(\hat{Y}_{s,t})$ . To simulate the two ciphertexts, SimLink sets  $\hat{\sigma}_{s',t'}^{\tau,s,t\oplus1} := RO(s, t, s', t', \hat{Y}_{s,t}) \oplus \hat{X}_{s',t'}$  where RO is a random oracle; for the other ciphertext, SimLink samples  $\hat{\sigma}_{s',t'}^{\tau,s,t\oplus1}$  uniformly at random.

We prove the simulator Sim<sub>CGC</sub> works by considering a sequence of hybrid worlds.

**procedure**  $Sim_{CGC}(1^{\lambda}, CompCirc)$ Parse CompCirc =  $(\kappa, \{f_s\}_{s \in [\kappa]}, \text{link}, \mathcal{I}, \mathcal{O});$ Parse link = {link<sub>s,t</sub>}<sub>s \in [0, \kappa+1], t \in f\_s.O</sub>; Set  $f_0 := (|\mathcal{I}|, |\mathcal{I}|, 0, \emptyset, \emptyset, \emptyset);$ Set  $f_{\kappa+1} := (|\mathcal{O}|, |\mathcal{O}|, 0, \emptyset, \emptyset, \emptyset);$ for  $s \in [0, \kappa + 1]$  do:  $(\hat{F}_s, \hat{X}_s) \leftarrow \mathsf{Sim}_{\mathsf{GC}}(1^\lambda, f_s);$  $\hat{Y}_s := \mathsf{GC}.\mathsf{Ev}(f_s, \hat{F}_s, \hat{X}_s);$ for  $s \in [0, \kappa]$  do:  $\{L_{s,t}\}_{t\in f_s,\mathcal{O}} \leftarrow \mathsf{SimLink}(s,\{\mathsf{link}_{s,t}\}_{t\in f_s,\mathcal{O}},\hat{Y}_s,\{\hat{X}_{s'}\}_{s'\in[\kappa+1]});$  $Sim.X := X_0;$  $\mathsf{Sim}.F := \{\hat{F}_s\}_{s \in [\kappa]} \cup \{\hat{L}_{s,t}\}_{s \in [0,\kappa], t \in f_s.\mathcal{O}};$ return (Sim.F, Sim.X). procedure SimLink(s, {link<sub>s,t</sub>}<sub>t \in f\_s.O</sub>,  $\hat{Y}_s$ , { $\hat{X}_{s'}$ }<sub>s' \in [\kappa+1]</sub>) Parse  $\hat{Y}_s = {\{\hat{Y}_{s,t}\}_{t \in f_s.\mathcal{O}}};$ for  $s' \in [\kappa + 1]$  do: Parse  $\hat{X}_{s'} = {\{\hat{X}_{s',t}\}_{t \in f_{s'}.\mathcal{I}}};$ for  $t \in f_s$ .  $\mathcal{O}$  do: Set  $\hat{L}_{s,t} := \emptyset$ ;  $\hat{\tau}_{s,t} := \mathsf{lsb}(\hat{Y}_{s,t});$ for  $(s', t') \in link_{s,t}$  do:  $\hat{\sigma}_{s',t'}^{\tau_{s,t}} := \mathsf{RO}(s,t,s',t',\hat{Y}_{s,t}) \oplus \hat{X}_{s',t'};$  $\hat{\sigma}_{s',t'}^{\tau_{s,t}\oplus 1} \stackrel{\$}{\leftarrow} \{0,1\}^{\lambda};$  $L_{s,t} := L_{s,t} \cup \{\hat{\sigma}^0_{s',t'}, \hat{\sigma}^1_{s',t'}\};$ return  $\{L_{s,t}\}_{t \in f_s.\mathcal{O}}$ .

Fig. 4: The Obliviousness Simulator  $Sim_{CGC}$  for the construction  $CGC^{GC}$ . GC := (Gb, En, Ev, De, ev) is the basic garbling scheme and  $Sim_{GC}$  is the obliviousness simulator for GC. RO is a random oracle.

 $\begin{aligned} \mathbf{Hyb}_{0}: \text{This is the real execution. Namely, given CompCirc} &= (\kappa, \{f_{s}\}_{s \in [\kappa]}, \text{link}, \mathcal{I}, \mathcal{O}) \text{ and } x, (\text{CGC}.F, \text{CGC}.e, \text{CGC}.d) \leftarrow \\ \text{CGC.Gb}(1^{\lambda}, \text{CompCirc}) \text{ and } \text{CGC}.X &:= \text{CGC.En}(\text{CGC}.e, x) \text{ are executed. We have } \mathbf{Hyb}_{0}.X = X_{0} = \text{GC.En}(e_{0}, x) \\ \text{and } \mathbf{Hyb}_{0}.F &= \{F_{s}\}_{s \in [\kappa]} \cup \{L_{s,t}\}_{s \in [0,\kappa], t \in f_{s}.\mathcal{O}}. \end{aligned}$ 

**Hyb**<sub>1</sub>: This hybrid world is the same as  $\mathbf{Hyb}_0$ , except that in  $\mathbf{Hyb}_1$ , we use random oracle RO rather than the hash function H to generate the link materials. More concretely, for  $s \in [0, \kappa]$ ,  $t \in f_s.\mathcal{O}$ ,  $(s', t') \in \mathsf{link}_{s,t}$ , we compute  $\hat{\sigma}_{s',t'}^{\tau_{s,t}} := \mathsf{RO}(s, t, s', t', W_{s,t}^0) \oplus W_{s',t'}^0$  and  $\hat{\sigma}_{s',t'}^{\tau_{s,t}\oplus 1} := \mathsf{RO}(s, t, s', t', W_{s,t}^1) \oplus W_{s',t'}^1$ , and we insert  $\hat{\sigma}_{s',t'}^0$ ,  $\hat{\sigma}_{s',t'}^1$  to  $\hat{L}_{s,t}$ . At the end, we outputs  $\mathbf{Hyb}_1.X := \mathsf{CGC}.X$  and  $\mathbf{Hyb}_1.F := \{F_s\}_{s \in [\kappa]} \cup \{\hat{L}_{s,t}\}_{s \in [0,\kappa], t \in f_s.\mathcal{O}}$ .

When the hash function has multiple correlation robustness,  $Hyb_0$  and  $Hyb_1$  are indistinguishable.

**Hyb**<sub>2</sub>: This hybrid world is the same as  $\mathbf{Hyb}_1$ , except that in  $\mathbf{Hyb}_2$ , we first evaluate the composite circuit CompCirc. We look into the execution of the composite circuit evaluation function  $ev_{sc}$ , and we extract the outputs of the simple circuits  $\{y_s\}_{s\in[0,\kappa+1]}$ . After that, we modify the link materials. The link material  $\hat{\sigma}_{s',t'}^{\tau_{s,t}\oplus y_{s,t}}$  remains unchanged, while the link material  $\hat{\sigma}_{s',t'}^{\tau_{s,t}\oplus 1\oplus y_{s,t}}$  is now sampled uniformly at random. At the end, we outputs  $\mathbf{Hyb}_2.X := CGC.X$  and  $\mathbf{Hyb}_2.F := \{F_s\}_{s\in[\kappa]} \cup \{\hat{L}_{s,t}\}_{s\in[0,\kappa],t\in f_s.\mathcal{O}}$ .

Note that the adversary can only decrypt the ciphertext  $\hat{\sigma}_{s',t'}^{\tau_{s,t}\oplus y_{s,t}}$ , which is unchanged. As for  $\hat{\sigma}_{s',t'}^{\tau_{s,t}\oplus \oplus y_{s,t}}$ , the outputs of the random oracle are indistinguishable from true random string, so **Hyb**<sub>1</sub> and **Hyb**<sub>2</sub> are indistinguishable.

**Hyb**<sub>3</sub>: This hybrid world is the same as **Hyb**<sub>2</sub>, except that in **Hyb**<sub>3</sub>, the garbled circuit of the simple circuit  $f_{\kappa+1}$  is replaced by a simulated one. We invoke the GC obliviousness simulator by  $(\hat{F}_{\kappa+1}, \hat{X}_{\kappa+1}) \leftarrow \text{Sim}_{\text{GC}}(1^{\lambda}, f_{\kappa+1})$ . For each input wire t' of  $f_{\kappa+1}$ , we can find a pair (s, t) in the link information link, indicating that the connection relationship. Then we modify the related link materials. Suppose the link materials in **Hyb**<sub>2</sub> is  $\hat{\sigma}^0_{\kappa+1,t'}$  and  $\hat{\sigma}^1_{\kappa+1,t'}$ , where  $\hat{\sigma}^{\tau_{s,t}\oplus y_{s,t}}_{\kappa+1,t'}$  is computed by  $\text{RO}(s, t, \kappa+1, t', W^{y_{s,t}}_{s,t}) \oplus W^{y_{s,t}}_{\kappa+1,t'}$ . We change  $\hat{\sigma}^{\tau_{s,t}\oplus y_{s,t}}_{\kappa+1,t'}$  to  $\text{RO}(s, t, \kappa+1, t', W^{y_{s,t}}_{s,t}) \oplus \hat{X}_{\kappa+1,t'}$ . In this

way, the link material will evaluate to the simulated input label  $\hat{X}_{\kappa+1,t'}$ . At the end, we outputs  $\mathbf{Hyb}_3 X := \mathsf{CGC} X$ and  $\mathbf{Hyb}_{3}.F := \{F_{s}\}_{s \in [\kappa]} \cup \{\tilde{L}_{s,t}\}_{s \in [0,\kappa], t \in f_{s}.\mathcal{O}}.$ 

The random oracle outputs are indistinguishable. Besides, suppose the adversary  $A_3$  distinguishes Hyb<sub>2</sub> and **Hyb**<sub>3</sub>, then we can construct an adversary  $\mathcal{A}'_3$  breaking the GC obliviousness game.  $\mathcal{A}'_3$  receives  $F_{\kappa+1}, X_{\kappa+1}$  of the simple circuit  $f_{\kappa+1}$ , and it genuinely generates the garbled circuits of  $\{f_s\}_{s \in [0,\kappa]}$  and generates the link materials as in Hyb<sub>3</sub>.  $A'_3$  feeds Hyb<sub>3</sub>. F, Hyb<sub>3</sub>. X to  $A_3$  and outputs whatever  $A_3$  outputs. When GC has obliviousness, Hyb<sub>2</sub> and Hyb<sub>3</sub> are indistinguishable.

 $\mathbf{Hyb}_{i+4}$ , for  $i \in [0, \kappa - 1]$ : This hybrid world is the same as  $\mathbf{Hyb}_{i+3}$ , except that in  $\mathbf{Hyb}_{i+4}$ , the garbled circuit of the simple circuit  $f_{\kappa-i}$  is replaced by a simulated one. We invoke the GC obliviousness simulator by  $(\hat{F}_{\kappa-i}, \hat{X}_{\kappa-i}) \leftarrow$  $Sim_{GC}(1^{\lambda}, f_{\kappa-i})$ . For the inputs of  $f_{\kappa-i}$ , we modify the related link materials in the same way as Hyb<sub>3</sub>. Moreover, we modify the link materials related to the outputs of  $f_{\kappa-i}$ . We compute the garbled output  $\hat{Y}_{\kappa-i} := \mathsf{GC}.\mathsf{Ev}(f_{\kappa-i}, \hat{F}_{\kappa-i}, \hat{X}_{\kappa-i})$ . For  $t \in f_{\kappa-i}$ .  $\mathcal{O}$ , we extract the select bit  $\hat{\tau}_{\kappa-i,t} := \mathsf{lsb}(\hat{Y}_{\kappa-i,t})$ ; for  $(s',t') \in \mathsf{link}_{\kappa-i,t}$ , we set  $\sigma_{s',t'}^{\hat{\tau}_{\kappa-i,t}} := \mathsf{RO}(\kappa - i)$  $i, t, s', t', \hat{Y}_{\kappa-i,t}) \oplus \hat{X}_{s',t'}$  and sample  $\sigma_{s',t'}^{\tau_{\kappa-i,t} \oplus 1}$  uniformly at random. At the end, we outputs  $\mathbf{Hyb}_{i+4} X := \mathsf{CGC}.X$ and  $\mathbf{Hyb}_{i+4}$ . $F := \{F_s\}_{s \in [\kappa - i - 1]} \cup \{\hat{F}_s\}_{s \in [\kappa - i, \kappa]} \cup \{\hat{L}_{s,t}\}_{s \in [0, \kappa], t \in f_s.\mathcal{O}}$ .

All the garbled materials and link materials related to  $f_{\kappa-i}$  are replaced by a simulated one. Specifically, in this way, we make sure that the link materials related to the outputs of  $f_{\kappa-i}$  only contains simulated labels. Therefore,  $Hyb_{i+3}$  and  $Hyb_{i+4}$  are indistinguishable for the same reason as  $Hyb_2$  and  $Hyb_3$  are indistinguishable.

 $\mathbf{Hyb}_{\kappa+4}$ : This hybrid world is the same as  $\mathbf{Hyb}_{\kappa+3}$ , except that in  $\mathbf{Hyb}_{\kappa+4}$ , the garbled circuit of the simple circuit  $f_0$  is replaced by a simulated one. We invoke the GC obliviousness simulator by  $(\hat{F}_0, \hat{X}_0) \leftarrow \text{Sim}_{\text{GC}}(1^{\lambda}, f_0)$  and compute the garbled output by  $\hat{Y}_0 := \mathsf{GC}.\mathsf{Ev}(\hat{F}_0, \hat{X}_0)$ . The link materials related to  $f_0$  is modified in the same way as  $\mathbf{Hyb}_{i+4}$ . At the end, we outputs  $\mathbf{Hyb}_{\kappa+4}$ .  $X := \hat{X}_0$  and  $\mathbf{Hyb}_{\kappa+4}$ .  $F := \{\hat{F}_s\}_{s \in [\kappa]} \cup \{\hat{L}_{s,t}\}_{s \in [0,\kappa], t \in f_s. \mathcal{O}}$ .  $\mathbf{Hyb}_{\kappa+3}$  and  $\mathbf{Hyb}_{\kappa+4}$  are indistinguishable for the same reason as  $\mathbf{Hyb}_{i+3}$  and  $\mathbf{Hyb}_{i+4}$  are indistinguishable.

 $Hyb_{\kappa+4}$  is the simulated world of the obliviousness simulator  $Sim_{CGC}$ , and we conclude that if the basic garbling scheme GC has obliviousness and the hash function H has multiple correlation robustness, then the construction CGC<sup>GC</sup> has obliviousness.

Authenticity. The authenticity of the construction CGC<sup>GC</sup> follows from the authenticity of GC and the multiple correlation robustness of the hash function H. Suppose there is an adversary  $\mathcal{A}$  breaking the authenticity of  $CGC^{GC}$ then (i) for some  $i \in [0, \kappa + 1]$ ,  $\mathcal{A}$  successfully obtain a valid  $\dot{Y}_i \neq Y_i$ , or (ii)  $\mathcal{A}$  learns the information of both input wire labels from the link materials. The first case indicates the existence of an adversary  $\mathcal{A}'$  breaking the authenticity of GC; and the second case indicates the existence of an adversary  $\mathcal{A}''$  breaking the multiple circular correlation robustness of H. Therefore, if the basic garbling scheme GC has authenticity and the hash function Hhas multiple correlation robustness, then the construction CGC<sup>GC</sup> has *authenticity*.

#### Proof of Theorem. 3 A.3

Proof. According to Lemma. 1, to prove Thm. 3, we only need to consider (i) the case where all the parties and the server are corrupted by semi-honest and independent adversaries, and (ii) the case where the server is corrupted by a malicious adversary while the parties are honest. For each case, we present corresponding simulators that make the ideal-world execution and real-world execution indistinguishable.

Claim. The protocol  $\Pi_{\text{semi}}$  depicted in Fig. 3 is secure in the presence of N+1 semi-honest and independent adversaries.

*Proof.* In this case, we assume that the adversary  $A_s$  corrupts the server and the adversary  $A_i$  corrupts the party  $P_i$ , for  $i \in [N]$ . We construct the simulators in the following way:

- The simulator  $S_s$  is constructed by  $S_s := Sim_s(A_s)$ :

- For steps 1-4,  $S_s$  uses the obliviousness simulator for CGC<sup>GC</sup> (constructed in the proof of Thm. 2) to generate a fake copy of the garbled circuit.  $S_s$  parses the fake garbled circuit to obtain the garbled materials, link materials and garbled input. In step 3(f) and step 4(c),  $S_s$  sends the fake garbled circuit to the adversary Aon behalf of the parties.
- For steps 5-6,  $S_s$  receives the garbled output from the adversary  $A_s$  on behalf of the parties.  $S_s$  then instructs the trusted third party to send the output to all of the parties. At the end,  $S_s$  outputs the entire view of  $A_s$ .

Server's partial output only consists of the view of the adversary  $A_s$ . Throughout the execution,  $A_s$  only receives the garbled circuit. When PRG is a secure pseudorandom number generator, the generated seeds are indistinguishable from true randomness, so the garbled circuit generated using these seeds are indistinguishable from a garbled circuit generated using true randomness. When CGC<sup>GC</sup> has obliviousness, the fake garbled circuit are indistinguishable from a genuine one. Therefore, Server's partial output in the real-world execution is indistinguishable from Server's partial output in the ideal-world execution.

- The simulator  $S_1$  is constructed by  $S_1 := Sim_1(A_1)$ :
  - For steps 1-3(f), S₁ acts as the honest parties {P<sub>i</sub>}<sub>i∈[2,N]</sub>. For i ∈ [2, N], S₁ receives coin from A₁ on behalf of P<sub>i</sub>. S₁ then follows the protocol description to generate the seeds and the garbled circuit.
  - For step 3(g),  $S_1$  receives  $\{F_1\} \cup \{L_{s,t}\}_{s \in [0,1], t \in f_s, \mathcal{O}}$  from  $\mathcal{A}_1$  on behalf of Server.
  - For step 4,  $S_1$  receives the input  $\{x_k^{(1)}\}_{k \in [\ell]}$  and sends  $\{x_k^{(1)}\}_{k \in [\ell]}$  to the trusted third party to obtain the output y. Meanwhile,  $S_1$  receives  $\{X_{0,k}\}_{k \in [\ell]}$  from  $\mathcal{A}_1$  on behalf of Server.
  - For step 5,  $S_1$  generates the garbled output CGC.Y according to the garbled circuit and the output y, and it sends  $\widetilde{CGC.Y}$  to  $\mathcal{A}_1$  on behalf of Server. More specifically,  $S_1$  have generated  $(F_{N+1}, o_{N+1}) :=$  $GC.GbCirc(1^{\lambda}, f_{N+1}, e_{N+1}; \text{seed}_{2,N+1})$  in step 3(d).  $S_1$  parses  $o_{N+1} = \{W_{N+1,t}^0, W_{N+1,t}^1\}_{t \in f_{N+1}.\mathcal{O}}$  and  $y = \{y_t\}_{t \in f_{N+1}.\mathcal{O}}$ . After that,  $S_1$  sets  $\widetilde{CGC.Y} := \{W_{N+1,t}^{y_t}\}_{t \in f_{N+1}.\mathcal{O}}$ .
  - For step 6,  $S_1$  outputs the view of  $A_1$ .

 $P_1$ 's partial output only consists of the view of the adversary  $A_1$ . Throughout the execution,  $A_1$  only receives  $\widetilde{\mathsf{CGC}}.Y$  from the simulator  $S_1$ . Specifically,  $S_1$  programs  $\widetilde{\mathsf{CGC}}.Y$  such that  $\mathsf{De}(d, \widetilde{\mathsf{CGC}}.Y) = y$  where y is the real output. Therefore,  $P_1$ 's partial output in the real-world execution are indistinguishable from  $P_1$ 's partial output in the ideal-world execution.

- For  $i \in [2, N]$ , the simulator  $S_i$  can be constructed in a similar way as  $S_1$ , except that in step 2,  $S_i$  needs to sample coin  $\stackrel{\$}{\leftarrow} \{0, 1\}^{\lambda}$  and sends coin to  $A_i$  on behalf of  $P_1$ . The proof of indistinguishability is also similar, so we omit the details here.

Each partial output in the ideal-world execution is indistinguishable from the corresponding partial output in the real-world execution. According to the security definition, the protocol  $\Pi_{semi}$  depicted in Fig. 3 is secure in the presence of N + 1 semi-honest and independent adversaries.

*Claim.* The protocol  $\Pi_{\text{semi}}$  depicted in Fig. 3 is secure in the presence of a malicious adversary corrupting the server.

*Proof.* In this case, we construct a simulator S by S := Sim(A). Whenever A aborts, S instructs the trusted third party to send  $\bot$  to all the parties  $\{P_i\}_{i \in [N]}$ . For the case where A does not abort, the simulation is done in the following way:

- For steps 1-2, S acts as the honest parties. S parses CompCirc =  $(N, \{f_s\}_{s \in [N]}, \text{link}, \mathcal{I}, \mathcal{O})$  and sets  $f_0 := (|\mathcal{I}|, |\mathcal{I}|, 0, \emptyset, \emptyset, \emptyset)$  and  $f_{N+1} := (|\mathcal{O}|, |\mathcal{O}|, 0, \emptyset, \emptyset, \emptyset)$ .
- For steps 3(a)-3(f), S invokes the obliviousness simulator for the composite garbling scheme to generate the fake garbled material  $\widetilde{CGC}.F$  and the fake garbled input  $\widetilde{CGC}.X$ , that is,  $(\widetilde{CGC}.F, \widetilde{CGC}.X) \leftarrow \operatorname{Sim}_{\mathsf{CGC}}(1^{\lambda}, \mathsf{CompCirc})$ .
- For step 3(g), S parses the fake garbled material  $\widetilde{\mathsf{CGC}}_{F} = {\widetilde{F}_s}_{s \in [N]} \cup {\widetilde{L}_{s,t}}_{s \in [0,N], t \in f_s.\mathcal{O}}$ . For  $i \in [N]$ , S sends  ${\widetilde{F}_i} \cup {\widetilde{L}_{i,t}}_{t \in f_i.\mathcal{O}}$  to the adversary  $\mathcal{A}$  on behalf of  $P_i$ .
- For step 4, S parses the fake garbled input  $\widetilde{\mathsf{CGC}}.X = {\widetilde{X}_{0,t}}_{t \in f_0.\mathcal{I}}$ . For  $i \in [N]$ , S sends  ${\widetilde{X}_{0,(i-1)\cdot\ell+k}}_{k \in [\ell]}$  to the adversary  $\mathcal{A}$  on behalf of  $P_i$ .
- For step 5, for  $i \in [N]$ , S receives  $\widehat{\mathsf{CGC.Y}}_i$  from the adversary A on behalf of  $P_i$ .
- For step 6, S computes  $CGC.Y := CGC^{GC}.Ev(CompCirc, CGC.F, CGC.X)$  by itself and it compares CGC.Ywith each of  $\{CGC.Y_i\}_{i \in [N]}$ . When the trusted third party asks which of the parties should receive the output, S instructs the trusted third party to send the output to the parties who receive  $CGC.Y_i = CGC.Y$  and to send  $\perp$  to the parties who receive  $CGC.Y_i \neq CGC.Y$ . At the end, S outputs the entire view of A.

We prove the indistinguishability through a sequence of hybrid worlds.

- **Hyb**<sub>0</sub>. This is the real-world.

- $\mathbf{Hyb}_1$ . This hybrid world is the same as  $\mathbf{Hyb}_0$ , except that in  $\mathbf{Hyb}_1$ , the simulator S uses true randomness to execute the garbling algorithms. S then sends the garbled material to A on behalf of the parties. When PRG is a secure pseudorandom number generator, its output is indistinguishable from true randomness, and the views of A in  $\mathbf{Hyb}_0$  and in  $\mathbf{Hyb}_1$  are indistinguishable.
- $\mathbf{Hyb}_2$ . This hybrid world is the same as  $\mathbf{Hyb}_1$ , except that in  $\mathbf{Hyb}_2$ , the simulator S checks the garbled output sent by the adversary  $\mathcal{A}_s$  in the following way: S execute the evaluation algorithm  $\mathsf{CGC}^{\mathsf{GC}}$ . Ev to obtain the garbled output, and it compares the generated garbled output with the garbled outputs received by the parties. For  $i \in [N]$ , if the party  $P_i$  receives an inconsistent garbled output, S instructs the trusted third party to send  $\bot$  to  $P_i$ ; otherwise, S instructs the trusted third party to send the actual output y to  $P_i$ . When  $\mathsf{CGC}^{\mathsf{GC}}$  has authenticity, it is hard for the adversary  $\mathcal{A}$  to forge a valid garbled output. Therefore, the outputs of the honest parties in the  $\mathbf{Hyb}_1$  and in  $\mathbf{Hyb}_2$  are indistinguishable.
- $\mathbf{Hyb}_3$ . This hybrid world is the same as  $\mathbf{Hyb}_2$ , except that in  $\mathbf{Hyb}_3$ , the simulator S uses the obliviousness simulator for CGC<sup>GC</sup> (constructed in the proof of Thm. 2) to generate a fake copy of the garbled circuit. S parses the fake garbled circuit to obtain the garbled material, link materials and garbled input, and in step 3(g) and step 4(c), S sends the fake garbled circuit to the adversary A on behalf of the parties. When CGC<sup>GC</sup> has obliviousness, the fake garbled circuit is indistinguishable from a genuine one, and the views of A in  $\mathbf{Hyb}_2$  and in  $\mathbf{Hyb}_3$  are indistinguishable.

Note that,  $\mathbf{Hyb}_3$  is the ideal-world. The view of the adversary  $\mathcal{A}$  and the output of the honest parties  $\{P_i\}_{i \in [N]}$  in the execution of  $\mathbf{Hyb}_3$  are indistinguishable from the corresponding variables in the execution of  $\mathbf{Hyb}_0$ , so Server's partial output in the real-world execution are indistinguishable from Server's partial output in the ideal-world execution. According to the security definition, the protocol  $\Pi_{\text{semi}}$  depicted in Fig. 3 is secure in the presence of a malicious adversary corrupting the server.

According to Lemma. 1, we can conclude that  $\Pi_{\text{semi}}$  depicted in Fig. 3 is secure when the server Server is corrupted by a malicious adversary, and the parties are corrupted by semi-honest and independent adversaries.