# **Oblivious Polynomial Evaluation and Secure Set-Intersection from Algebraic PRFs**

#### Carmit Hazay\*

Faculty of Engineering, Bar-Ilan University, Israel. carmit.hazay@biu.ac.il

**Abstract.** In this paper we study the two fundamental functionalities *oblivious polynomial evaluation in the exponent* and *set-intersection*, and introduce a new technique for designing efficient secure protocols for these problems (and others). Our starting point is the [6] technique (CRYPTO 2011) for verifiable delegation of polynomial evaluations, using *algebraic PRFs*. We use this tool, that is useful to achieve *verifiability* in the *outsourced setting*, in order to achieve *privacy* in the *standard two-party* setting. Our results imply new simple and efficient oblivious polynomial evaluation (OPE) protocols. We further show that our OPE protocols in the plain model. As a side result, we demonstrate the usefulness of algebraic PRFs for various search functionalities, such as keyword search and oblivious transfer with adaptive queries. Our protocols are secure under full simulation-based definitions in the presence of malicious adversaries.

**Keywords:** Efficient Secure Computation, Oblivious Polynomial Evaluation, Secure Set-Intersection, Committed Oblivious PRF

## 1 Introduction

*Efficient secure two-party computation.* Secure two-party computation enables two parties to mutually run a protocol that computes some function f on their private inputs, while preserving a number of security properties. Two of the most important properties are privacy and correctness. The former implies data confidentiality, namely, nothing leaks by the protocol execution but the computed output. The latter requirement implies that the protocol enforces the integrity of the computations made by the parties, namely, honest parties learn the correct output. Feasibility results are well established [49, 23, 39, 5], proving that any efficient functionality can be securely computed under full simulation-based definitions (following the ideal/real paradigm). Security is typically proven with respect to two adversarial models: the semi-honest model (where the adversary follows the instructions of the protocol but tries to learn more than it should from the protocol transcript), and the malicious model (where the adversary follows an arbitrary polynomial-time strategy), and feasibility holds in the presence of both types of attacks.

<sup>\*</sup> Research partially supported by a grant from the Israel Ministry of Science and Technology (grant No. 3-10883).

Following these works, many constructions focused on improving the *efficiency* of the computational and communication costs. Conceptually, this line of works can be split into two sub-lines: (1) Improved generic protocols that compute any boolean or arithmetic circuit; see [47, 30, 44, 36, 38, 7, 16, 43] for just a few examples. (2) Protocols for concrete functionalities. In the latter approach attention is given to constructing efficient protocols for specific functions while exploiting their internal structure. This approach has been proven useful for many different functions in both the semi-honest and malicious settings. Notable examples are calculating the *k*th ranked element [1], pattern matching and related search problems [29, 48], set-intersection [31, 28] and oblivious pseudorandom function (PRF) evaluation [20].

In this paper we study the two fundamental functionalities *oblivious polynomial evaluation in the exponent* and *set-intersection* and introduce a new technique for designing efficient secure protocols for these problems in the presence of semi-honest and malicious attacks with simulation-based security proofs. We further demonstrate that our technique is useful for various search functionalities.

Algebraic PRFs. Informally, an algebraic pseudorandom function (PRF) is a PRF with a range that forms an Abelian group such that group operations are efficiently computable. In addition, certain algebraic operations on these outputs can be computed significantly more efficiently if one possesses the key of the pseudorandom function that was used to generate them. This property is denoted by *closed form efficiency* and allows to compute a batch of l PRF values much more efficiently than by computing the l values separately and then combing them. Algebraic PRFs were exploited in [6] to achieve faster verifiable polynomial evaluations (in the exponent). Specifically, in their setting, a client outsources a d-degree polynomial to an untrusted server together with some authenticating information, while the client stores a short secret key. Next, when the client provides an input for this polynomial the server computes the result and an authentication message that allows the client to verify this computation in sub-linear time in d.

More concretely, let  $Q(\cdot) = (q_0, \ldots, q_d)$  be the polynomial stored on the server in the clear. Then the client additionally stores a vector of group elements  $\{g^{aq_i+r_i}\}_{i=0}^d$ where  $a \leftarrow \mathbb{Z}_p$  and p is a prime, and  $r_i$  is the *i*th coefficient of a polynomial  $R(\cdot)$  of the same degree as  $Q(\cdot)$ . Then for every client's input t the server returns y = Q(t)and  $u = g^{aQ(t)+R(t)}$  and the client accepts u if and only if  $u = g^{ay+R(t)}$ . Interestingly, in case  $g^{r_i} = \mathsf{PRF}_K(i)$ , where  $\mathsf{PRF}$  is an algebraic  $\mathsf{PRF}$ , the closed form efficiency property enables the client to compute the value  $g^{R(t)}$  in sub-linear time in d. Stated differently, verifiability is achieved by viewing  $g^{aq_i+r_i}$  as a (one-time) message authentication code (MAC) for  $g^{q_i}$  where batch verification of multiple MACs can be computed more efficiently than verifying each MAC separately.

In this work we demonstrate the usefulness of algebraic PRFs for various two-party problems by designing secure protocols based on this primitive. In particular, we modify the way [6] use algebraic PRFs so that instead of achieving *verifiability* in the *outsourced setting*, we achieve *privacy* in the *standard two-party* setting. It is worth noting that although the main focus of [6] is correctness, they do discuss how to achieve one-sided privacy by encrypting the coefficients of the polynomial (since the polynomial must be specified explicitly). Nevertheless, it is not clear how to maintain the privacy

of the input to the polynomial in their protocol. In this work, we use algebraic PRFs to mask the polynomial in a different way that does not allow the verifiability of the polynomial evaluation but allows the extractability of the polynomial more easily, and demonstrate an alternative way to achieve correctness. We focus our attention on the *plain model* where no trusted setup is required.

Oblivious polynomial evaluation. The oblivious polynomial evaluation (OPE) functionality is an important functionality in the field of secure two-party computation. It considers a setting where party  $P_0$  holds a polynomial  $Q(\cdot)$  and party  $P_1$  holds an element t, and the goal is that  $P_1$  obtains Q(t) and nothing else while  $P_0$  learns nothing. OPE has proven to be a useful building block and can be used to solve numerous cryptographic problems; e.g., secure equality of strings, set-intersection, approximation of a Taylor series, RSA key generation, oblivious keyword search, set membership, data entanglement and more [22, 37, 21, 20, 41, 3].

Despite its broad applicability the study of OPE was demonstrated using only few concrete secure protocols, initiated in [40] and further continued in [9, 50, 24]. In particular, the only protocol with a complete simulation-based proof in the presence of malicious attacks is the protocol in [24]. This protocol evaluates a *d*-degree polynomial over a composite order group  $\mathbb{Z}_N$  with O(sd) modular exponentiations, where N is an RSA composite and *s* is a statistical security parameter.

The general (and currently the most practical) approach of [16, 15] for arithmetic circuits follows the preprocessing model: in an offline phase some shared randomness is generated independently of the function and the inputs; in an online phase the actual secure computation is performed. One of the main advantages of these protocols is that the basic operations are almost as cheap as those used in the passively secure protocols. To get good performance, these protocols use the somewhat-homomorphic SIMD approach that handles many values in parallel in a single ciphertext, and thus more applicable for large degree polynomials. Similarly, protocols for Boolean circuits apply the cut-and-choose technique which requires to repeat the computation *s* times in order to prevent cheating except with probability  $2^{-s}$  [35].

In some applications such as password-based authenticate key exchange protocols or when sampling an element from a *d*-wise independence space, the polynomial degree is typically small and even a constant. In these cases, our protocols have clear benefits since they are much simpler, efficient and easily implementable.

Secure set-intersection. In the set-intersection problem parties  $P_0$ ,  $P_1$ , holding input sets X, Y of sizes  $m_X$  and  $m_Y$ , respectively, wish to compute  $X \cap Y$ . This problem has been intensively studied by researchers in the last few years mainly due to its potential applications for dating services, datamining, recommendation systems, law enforcement and more; see [21, 34, 13, 31, 32, 25, 28] for a few examples. For instance, consider two security agencies that wish to compare their lists of suspects without revealing their contents, or an airline company that would like to check its list of passengers against the list of people that are not allowed to go abroad.

Two common approaches are known to solve this problem securely in the plain model: (1) oblivious polynomial evaluation and (2) committed oblivious PRF evaluation. In the former approach party  $P_0$  computes a polynomial  $Q(\cdot)$  such that Q(x) = 0

for all  $x \in X$ . This polynomial is then encrypted using homomorphic encryption and sent to  $P_1$ , that computes the encryption of  $r_y \cdot Q(y) + y$  for all  $y \in Y$ , and using fresh randomness  $r_y$ . This approach (or a variant of it) was taken in [21, 34, 13, 28].

The second approach uses a secure implementation of oblivious pseudorandom function evaluation. Namely,  $P_0$  chooses a PRF key K and computes the set  $\mathsf{PRF}_X = \{\mathsf{PRF}_K(x)\}_{x \in X}$ . The parties then execute an oblivious PRF protocol where  $P_0$  inputs K, whereas  $P_1$  inputs the set Y and learns the set  $\mathsf{PRF}_Y = \{\mathsf{PRF}_K(y)\}_{y \in Y}$ . Finally,  $P_0$  sends the set  $\mathsf{PRF}_X$  to  $P_1$  that computes  $\mathsf{PRF}_X \cap \mathsf{PRF}_Y$  and extracts the actual intersection. This idea was introduced in [20] and further used in [25, 31, 32]. Other solutions in the random oracle model such as [12, 11, 2] take a different approach by applying the random oracle on (one of) the sets members, or apply oblivious transfer extension [18].

In a recent result [45], the authors overview exiting solutions for set-intersection in the semi-honest setting and compare their efficiency. One of their conclusions is that OPE-based approaches are inferior to oblivious-transfer extension based approaches. It is an interesting question to test whether this conclusion also for the case for the malicious setting as well.

To the best of our knowledge, the most efficient protocol in the malicious plain model that does not require a trusted setup or rely on non-standard assumptions is the protocol of [28] that incurs computation of  $O(m_X + m_Y \log(m_X + m_Y))$  modular exponentiations. A more efficient protocol with  $O(m_X + m_Y)$  communication and computational costs was introduced by [31] in the common reference string (CRS) model (where the CRS includes a safe RSA composite that determines the group order and implies high overhead when mutually produced). Another drawback of this protocol is that its security proof runs an exhaustive search on the input domain of the PRF in order to extract  $P_0$ 's input. This implies that the proof works for small domain PRFs and that the complexity of the simulator grows linearly with the size of the PRF's input domain.

Committed oblivious PRF evaluation. The oblivious PRF evaluation functionality  $\mathcal{F}_{PRF}$  that obliviously evaluates a PRF is defined by  $(K, x) \mapsto (-, \mathsf{PRF}_K(x))$ . This functionality is very important in the context of secure computation since it essentially implements a random oracle. That is, the party with the PRF key, say  $P_0$ , mimics the random oracle role via interaction. Therefore, if the protocol that realizes  $\mathcal{F}_{PRF}$  is simulation-based secure then both desirable properties of a random oracle, programmability and observability, can be achieved by this protocol. First, since the simulator can force any output for a corrupted  $P_1$ , it essentially programs the function's output. In addition, it can also observe (via extraction) the input to the functionality. Nevertheless, the usefulness of oblivious PRF evaluation is reflected via an additional property of committed key that implies that the same key is used for multiple PRF evaluations.

Committed oblivious PRF (CPRF) evaluation has been used to compute secure setintersection [31, 25], oblivious transfer with adaptive queries [20], keyword search [20], pattern matching [25, 19] and more. It is therefore highly important to design efficient protocols for this functionality. Current implementations of the [42] algebraic PRF, discussed in this paper, employ an oblivious transfer protocol for each input bit [20, 25] and are only secure for a single PRF evaluation. Consequently, the protocol of [25] does not achieve full security against malicious adversaries. In addition, the protocol from [31] (that implements a variant of the [17] PRF) requires a trusted setup of a safe RSA composite and suffers from the drawbacks specified above.

#### 1.1 Our Results

In this paper we use algebraic PRFs to design alternative simple and efficient protocols for polynomial evaluation, set-intersection, committed oblivious PRF evaluation and search problems. Below, we demonstrate the broad usefulness of our technique.

Oblivious polynomial evaluation (Section 3). We present secure protocols in the plain model for OPE in the exponent with simulation-based security against semi-honest and malicious attacks. We stress that evaluating a polynomial in the exponent has strong applicability in the context of set membership where the goal is to privately verify membership in some secret set, as well as achieving *d*-wise independence. We use algebraic PRFs to build simple two-phases OPE protocols as follows. In the first phase party  $P_0$ , holding the polynomial  $g^{Q(\cdot)}$ , publishes its masked polynomial  $g^{Q(\cdot)+R(\cdot)}$  where the set  $g^{R(\cdot)}$  is determined by an algebraic PRF. Next,  $P_1$  locally computes  $g^{Q(t)+R(t)}$  and the parties run an unmasking secure computation for obliviously evaluating  $g^{R(t)}$  for  $P_1$ .

The efficiency of the latter phase is dominated by the overhead of the closed form efficiency property of the specific PRF. In this work, we consider two PRF implementations used by [6]: (1) a PRF with security under the strong-DDH assumption. (2) The Naor-Reingold PRF [42] with security under the DDH assumption. More concretely, the efficiency of our protocols is only d + 1 modular exponentiations for the first phase of sending the masked polynomial, and d+1+O(1) (resp.  $O(\log d)$ ) modular exponentiations for the second phase of obliviously evaluating the pseudorandom polynomial under the strong-DDH (resp. DDH) assumption. For simplicity, we only consider univariate polynomials. Our technique can be applied for multivariate polynomials as well (with total degree d or of degree d in each variable); see [6] for further details. To the best of our knowledge, our protocols are the first to obliviously evaluate both univariate and multivariate polynomials that efficiently.

Secure set-intersection (Section 4). In this work we demonstrate that algebraic PRFs are useful for both approaches of OPE and committed oblivious PRF that enable to design set-intersection protocols. We first show that our protocols for OPE readily induce secure protocols for set-intersection. That is, first  $P_0$  encodes the set X by a polynomial  $g^{Q(\cdot)}$  as specified above, and masks it. Next, for each  $y \in Y$  party  $P_1$  verifies whether the masked polynomial evaluation of y equals the evaluation  $g^{R(y)}$ , and concludes whether the element is in the intersection. We stress that this naive approach requires a multiplicative overhead (in the sets sizes) since for each element in its input Y,  $P_1$  needs to evaluate a polynomial of degree  $m_X$ . To reduce the computational overhead, Freedman et al. [21] introduced a balanced allocation scheme [4] into their protocol that splits the elements into  $\mathcal{B} = \frac{m_X}{\log \log m_X}$  bins, with maximum number of  $\mathcal{M} = O(m_X/\mathcal{B} + \log \log \mathcal{B}) = O(\log \log m_X)$  elements in each bin. In that case, the elements mapped by  $P_0$  to a certain bin must only be compared to those mapped by  $P_1$  to the same bin. Therefore,  $P_1$  should only evaluate an M-degree polynomial for each  $y \in Y$ , rather than a polynomial of degree  $m_X$ . Nevertheless, their solution with

hash functions is only applicable in the semi-honest setting. Following that, Hazay and Nissim [28] introduced a maliciously secure protocol which implies the computation of  $O(m_X + m_Y \log(m_X + m_Y))$  modular exponentiations. Their construction is fairly complicated and combines both approaches of OPE and oblivious PRF evaluation.

We introduce the hashing technique into our constructions and provide a generic description that can be instantiated with different hash functions. Our protocols are far less complicated and maintain a modular description. Specifically, we devise an alternative zero-knowledge proof for verifying the correctness of the hashed polynomials while exploiting the algebraic properties of the PRF. Under the strong-DDH assumption our protocol matches the communication overhead of the protocol from [31] (that also relies on a dynamic hardness assumption) and implies the computation of  $O(m_X + m_Y \log \log m_X)$  exponentiations, with the benefits that it operates over prime order groups, it does not require a trusted setup and the proof complexity does not depend on the PRF's input domain size. Under the DDH assumption our protocol, using hash functions, implies the computation of  $O(m_X + m_Y \log m_X)$  exponentiations which improves the overhead of the [28] protocol. Next we show that algebraic PRFs are useful for applications that rely on committed oblivious PRF evaluation. Our results for set-intersection are summarized in Table 1.

Committed oblivious PRF evaluation (Section 5). Observing that the batch computation for l PRF values PRF'<sub>K</sub> $(x) = \prod_{i=0}^{l} [PRF_K(i)]^{x^i}$  is a PRF as well (by fixing l properly), we derive new PRF constructions in prime order groups and more interestingly, simple committed oblivious PRF evaluation protocols. Our strong-DDH based PRF requires constant overhead, and our DDH-based protocol is the *first* committed oblivious PRF implementation for the [42] function. Our protocols using committed oblivious PRF imply set-intersection protocols with  $O(m_X + m_Y)$  costs under the strong-DDH assumption and  $((m_X + m_Y) \log(m_X + m_Y))$  communication and computation costs under the DDH assumption, where the former analysis matches the overhead from [31]. In particular, plugging-in our protocols for committed oblivious PRF evaluation in the protocols cited above implies malicious security fairly immediately. Finally, we note that committed oblivious PRF evaluation is also useful for search functionalities that support database search and data retrievals, such as in keyword search and oblivious transfer with adaptive queries.

## 2 Preliminaries

#### 2.1 Basic Notations

We denote the security parameter by n. We say that a function  $\mu : \mathbb{N} \to \mathbb{N}$  is *negligible* if for every positive polynomial  $p(\cdot)$  and all sufficiently large n it holds that  $\mu(n) < \frac{1}{p(n)}$ . We use the abbreviation PPT to denote probabilistic polynomial-time. We further denote by  $a \leftarrow A$  the random sampling of a from a distribution A, by [d] the set of elements  $(1, \ldots, d)$  and by [0, d] the set of elements  $(0, \ldots, d)$ .

We define a *d*-degree polynomial  $Q(\cdot)$  by its set of coefficients  $(q_0, \ldots, q_d)$ , or simply write  $Q(x) = q_0 + q_1 x + \ldots q_d x^d$ . Typically, these coefficients will be picked

**Table 1.** Comparisons with secure set-intersection constructions. We highlight the constructions with the best performance under each assumption.

		Hardness	Overhead
Reference	Modeling	Assumption	(Number of Exp.)
[31]	CRS of a safe prime	Decisional d-DHI	$O(m_X + m_Y)$
[28]	plain model	DDH	$O(m_X + m_Y \log(m_X + m_Y))$
[18]	random oracle	random oracle	O(n), where n is sec. parameter
This Work – OPE	plain model	d-strong DDH	$O(m_X + m_Y \log \log m_X)$
This Work – OPE	plain model	DDH	$\mathbf{O}(\mathbf{m_X} + \mathbf{m_Y}\mathbf{log}\mathbf{m_X})$
This Work – CPRF	plain model	d-strong DDH	$O(m_{\mathbf{X}}+m_{\mathbf{Y}})$
This Work – CPRF	plain model	DDH	$O((m_X + m_Y)\log(m_X + m_Y))$

from  $\mathbb{Z}_p$  for a prime p. We further write  $g^{Q(\cdot)}$  to denote the coefficients of  $Q(\cdot)$  in the exponent of a generator g of a multiplicative group  $\mathbb{G}$  of prime order p.

## 2.2 Zero-Knowledge Proofs

To prevent malicious behavior, the parties must demonstrate that they are well-behaved. To achieve this, our protocols utilize zero-knowledge (ZK) proofs of knowledge. Our proofs are  $\Sigma$ -protocols with a constant overhead. A generic efficient technique that enables to transform any  $\Sigma$ -protocol into a zero-knowledge proof of knowledge can be found in [26]. This transformation requires additional 6 exponentiations.

1.  $\pi_{\text{DL}}$ , for demonstrating the knowledge of a solution x to a discrete logarithm problem [46].

$$\mathcal{R}_{ ext{dl} ext{DL}} = \{((\mathbb{G}, g, h), x) \mid h = g^x\}$$

2.  $\pi_{\text{DDH}}$ , for demonstrating that an El Gamal ciphertext is an encryption of zero [10].

$$\mathcal{R}_{\text{DDH}} = \{ ((\mathbb{G}, g, h, g_1, h_1), x) \mid g_1 = g^x \land h_1 = h^x \}$$

3.  $\pi_{\text{MULT}}$ , for proving that a ciphertext  $c_2$  encrypts a product of two plaintexts values. Namely,

$$\mathcal{R}_{\text{mult}} = \left\{ ((\mathbb{G}, \mathsf{PK}, c_0, c_1, c_2), (a_0, a_1, r_0, r_1, r_2, )) \mid \begin{array}{c} c_i = \mathsf{Enc}_{\mathsf{PK}}(a_i; r_i) \\ \text{for } i \in \{0, 1\} \\ \land c_2 = \mathsf{Enc}_{\mathsf{PK}}(a_0 \cdot a_1; r_2) \end{array} \right\}$$

where multiplication is performed in the corresponding plaintext group. A zeroknowledge proof for the El Gamal PKE, that is based on the Damgård and Jurik technique [14], can be found in [28].

4.  $\pi_{Eq}$ , for demonstrating equality of two exponentiations. Namely,

$$\mathcal{R}_{\rm Eq} = \left\{ ((\mathsf{PK}, c_1, c_1', c_2, c_2'), (m, r_1, r_2)) \mid \begin{array}{c} c_1' = c_1^m \cdot \mathsf{Enc}_{\mathsf{PK}}(0; r_1) \\ \wedge c_2' = c_2^m \cdot \mathsf{Enc}_{\mathsf{PK}}(0; r_2) \end{array} \right\}$$

where exponentiation, as well as multiplication with an encryption of zero, are computed componentwise. A variant of this zero-knowledge proof was presented and discussed in [27] for Paillier encryption scheme and can be easily extended for this relation as well. We leave the details of this proof to the full version.

## **3** Protocols for Oblivious Polynomial Evaluation

In this section we introduce our new constructions for oblivious polynomial evaluation (OPE) in the exponent, implementing functionality  $\mathcal{F}_{OPE} : (g^{Q(\cdot)}, t) \mapsto (-, g^{Q(t)})$  for  $Q(\cdot) = (q_0, \ldots, q_d)$ . In particular, we assume common knowledge of the public parameters: a multiplicative group  $\mathbb{G}$  of order p and a generator g for  $\mathbb{G}$ , and that the polynomial coefficients are in  $\mathbb{Z}_p$ . In our solution, party  $P_0$  generates these parameters and publishes its masked polynomial  $g^{Q(\cdot)+R(\cdot)}$ , where the set of values  $g^{R(\cdot)}$  is determined by an algebraic PRF that has a closed form efficient computation for univariate polynomials (see Section 3.1). Next,  $P_1$  computes  $g^{Q(t)+R(t)}$  and the parties run an unmasking secure computation for obliviously evaluating  $g^{R(t)}$  for  $P_1$ . Importantly, the closed form efficiency property of the PRF allows the parties to mutually compute  $g^{R(t)}$  in *sub-linear* time in d. Before presenting our OPE constructions we formally define algebraic pseudorandom functions.

## 3.1 Algebraic Pseudorandom Functions [6]

Algebraic PRFs are PRFs with two additional algebraic properties. First, they map their inputs into some Abelian group, where certain algebraic operations on these outputs can be computed signicantly faster if one possesses the PRF key. These properties were exploited in [6] to achieve faster polynomial evaluations (in the exponent), where the coefficients of these polynomials lie in the PRF range. Several constructions, implying different overheads, were introduced in [6]; we focus our attention on their constructions for univariate polynomials. Our protocols can be applied for multivariate polynomials as well (with total degree d or of degree d in each variable). We begin with the formal definition of algebraic PRFs.

**Definition 31 (Algebraic PRFs)** We say that  $\mathcal{PRF} = (KeyGen, PRF, CFEval)$ , is an algebraic PRF if KeyGen, PRF are polynomial-time algorithms specified as follows:

- KeyGen, given a security parameter  $1^n$ , and a parameter  $m \in \mathbb{N}$  that determines the domain size of the PRF, outputs a pair  $(K, param) \leftarrow \mathcal{K}_n$ , where  $\mathcal{K}_n$  is the key space for a security parameter n. K is the secret key of the PRF, and param encodes the public parameters.
- PRF, given a key K, public parameters param, and an input  $x \in \{0, 1\}^m$ , outputs a value  $y \in Y$ , where Y is some set determined by param.
- In addition, the following properties hold:
  - **Pseudorandomness.** We say that  $\mathcal{PRF}$  is pseudorandom if for every PPT adversary  $\mathcal{A}$ , and every polynomial m = m(n), there exists a negligible function negl such that

$$|\Pr[\mathcal{A}^{\mathsf{PRF}_{K}(\cdot)}(1^{n}, param) = 1] - \Pr[\mathcal{A}^{f_{n}(\cdot)}(1^{n}, param) = 1]| \le \mathsf{negl}(n),$$

where  $(K, param) \leftarrow \mathsf{KeyGen}(1^n, m)$  and  $f_n : \{0, 1\}^m \mapsto Y$  is a random function.

**Algebraic.** We say that  $\mathcal{PRF}$  is algebraic if the range Y of  $\mathsf{PRF}_K(\cdot)$  for every  $n \in \mathbb{N}$  and  $(K, param) \leftarrow \mathcal{K}_n$  forms an Abelian multiplicative group. We require that the group operation on Y be efficiently computable given param. **Closed form efficiency.** Let N be the order of the range sets of PRF for security parameter n. Let  $z = (z_1, \ldots, z_l) \in (\{0, 1\}^m)^l$ ,  $k \in \mathbb{N}$ , and efficiently computable  $h : \mathbb{Z}_N^k \mapsto \mathbb{Z}_N^l$  with  $h(x) = \langle h_1(x), \dots, h_l(x) \rangle$ . We say that (h, z) is closed form efficient for PRF if there exists an algorithm  $CFEval_{h,z}$  such that for every  $x \in \mathbb{Z}_N^k$ ,

$$\mathsf{CFEval}_{h,z}(x,K) = \prod_{i=1}^{l} [\mathsf{PRF}_K(z_i)]^{h_i(x)}$$

and the running time of CFEval is polynomial in n, m, k but sublinear in l.

The last property is very important for our purposes since it allows to run certain computations very fast when the secret key is known. We next describe two implementations for algebraic PRFs introduced in [6].

Algebraic PRFs From Strong DDH Let  $\mathcal{G}$  be a computational group scheme. The following construction  $\mathcal{PRF}_1$  is an algebraic PRF with polynomial sized domains.

KeyGen $(1^n, m)$ : Generate a group description  $(\mathbb{G}, p, g) \leftarrow \mathcal{G}(1^n)$ . Choose  $k_0, k_1 \leftarrow$  $\mathbb{Z}_p$ . Output  $param = (m, p, g, \mathbb{G}), K = (k_0, k_1)$ . PRF<sub>K</sub>(x): Interpret x as an integer in  $\{0, \ldots, D = 2^m\}$  where D is polynomial in n.

Compute and output  $q^{k_0 k_1^x}$ .

Closed form efficiency for polynomials of degree d. We now show an efficient closed form for  $\mathcal{PRF}_1$  for polynomials of the form (where evaluation is computed in the exponent)

$$Q(x) = \mathsf{PRF}_K(0) \cdot \mathsf{PRF}_K(1)^x \cdot \ldots \cdot \mathsf{PRF}_K(d)^{x^d} = \prod_{i=0}^d \mathsf{PRF}_K(i)^{x^i}$$

where  $d \leq D$ . Let  $h : \mathbb{Z}_p \mapsto \mathbb{Z}_p^{d+1}$ , be defined as  $h(x) \stackrel{\text{def}}{=} (1, x, \dots, x^d)$  and  $(z_0,\ldots,z_d) = (0,\ldots,d)$ . Then, we can define

$$\mathsf{CFEval}_h(x,K) \stackrel{\text{def}}{=} g^{\frac{k_0(k_1^{d+1}x^{d+1}-1)}{k_1x-1}}.$$

Specifically, we write

$$\prod_{i=0}^{d} [\mathsf{PRF}_{K}(z_{i})]^{h_{i}(x)} = \prod_{i=0}^{d} [g^{k_{0}k_{1}^{i}}]^{x^{i}} = g^{k_{0}\sum_{i=0}^{d}k_{1}^{i}x^{i}}.$$

Correctness of CFEval follows by the identity  $\sum_{i=0}^{d} k_0 k_1^i x^i = \frac{k_0((k_1 x)^{d+1} - 1)}{k_1 x - 1}$ .

**Theorem 32** ([6]) Suppose that the D-Strong DDH assumption holds. Then,  $PRF_1$  is a pseudorandom function.

Algebraic PRFs From DDH Let  $\mathcal{G}$  be a computational group scheme. Define  $\mathcal{PRF}_2$  as follows.

KeyGen $(1^n, m)$ : Generate a group description  $(p, g, \mathbb{G}) \leftarrow \mathcal{G}(1^n)$ . Choose  $k_0, k_1, \ldots, k_m \leftarrow \mathbb{Z}_p$ . Output  $param = (m, p, g, \mathbb{G}), K = (k_0, k_1, \ldots, k_m)$ .

 $\mathsf{PRF}_K(x)$ : Interpret  $x = (x_1, \ldots, x_m)$  as an *m*-bit string. Compute and output  $g^{k_0 \prod_{i=1}^m k_i^{x_i}}$ .

This function is known by the Naor-Reingold function [42].

Closed form for polynomials of degree d. We describe an efficient closed form for  $\mathcal{PRF}_2$  for computing polynomials of the same form as above. That is,

$$Q(x) = \mathsf{PRF}_K(0) \cdot \mathsf{PRF}_K(1)^x \cdot \ldots \cdot \mathsf{PRF}_K(d)^{x^d} = \prod_{i=0}^d \mathsf{PRF}_K(i)^{x^i}.$$

Let  $h : \mathbb{Z}_p \mapsto \mathbb{Z}_p^{d+1}$ , defined as  $h(x) = (1, x, \dots, x^d)$  and let  $z = (z_1, \dots, z_l) = (0, \dots, d)$  then

$$\mathsf{CFEval}_{h,z}(x,K) \stackrel{\text{def}}{=} g^{k_0(1+k_1x)(1+k_2x^2)\dots(1+k_mx^{2^m})}$$

with  $m = \lceil \log d \rceil$  (clearly, d must be a power of 2).

**Theorem 33 ([42])** Suppose that the DDH assumption holds. Then,  $PRF_2$  is a pseudorandom function.

To this end, we only consider z = (0, ..., d) and omit z from the subscript, writing  $CFEval_h(x, K)$  instead.

#### **3.2 Our OPE Constructions**

We describe our protocol for oblivious polynomial evaluation in the  $\mathcal{F}_{\text{MaskPoly}}$ -hybrid setting, where the parties have access to a trusted party that computes functionality  $\mathcal{F}_{\text{MaskPoly}}$ :  $(K,t) \mapsto (-,g^{R(t)})$  relative to some prime order group  $\mathbb{G}$  and generator g that are picked by  $P_0$ , for  $g^{R(\cdot)} = (g^{r_0}, \ldots, g^{r_d})$  and  $g^{r_i} = \text{PRF}_K(i)$  for all i. For simplicity, we first describe a semi-honest variant of our protocol and then show how to enhance its security into the malicious setting. Formally, let  $\mathcal{PRF} = \langle \text{KeyGen}, \text{PRF}, \text{CFEval} \rangle$  denote an algebraic PRF with a range group  $\mathbb{G}$  (cf. Definition 31), then our semi-honest protocol follows.

## **Protocol 1 (Protocol** $\pi_{\rm OPE}$ with semi-honest security.)

- Input: Party  $P_0$  is given a d-degree polynomial  $g^{Q(\cdot)} = (g^{q_0}, \ldots, g^{q_d})$  with coefficients  $q_i$ 's from  $\mathbb{Z}_p$  with respect to prime order group  $\mathbb{G}$  and generator g. Party  $P_1$  is given an element t from  $\mathbb{Z}_p$ . Both parties are given a security parameter  $1^n$ , group description  $\mathbb{G}$ , p and q.

<sup>-</sup> The protocol:

1. Masking the polynomial.  $P_0$  invokes  $(K, param) \leftarrow \text{KeyGen}(1^n, \lceil \log d \rceil)$  where param includes a group description  $\mathbb{G}$  of prime order p and a generator g. It next defines a sequence of d elements  $\widetilde{R}(\cdot) = (\widetilde{r}_0, \ldots, \widetilde{r}_d)$  over  $\mathbb{G}$  where  $\widetilde{r}_i = \text{PRF}_K(i)$  for all i.

 $P_0$  sends  $P_1$  param and the masked polynomial  $C(\cdot) = (g^{q_0}\tilde{r}_0, \ldots, g^{q_d}\tilde{r}_d)$ , where multiplication is implemented (componentwise) in  $\mathbb{G}$ .

2. Unmasking the result. Upon receiving the masked polynomial  $C(\cdot) = (c_0, \ldots, c_d)$ , party  $P_1$  computes the polynomial evaluation  $C(t) = \prod_{i=0}^d (c_i)^{t^i}$ . I.e.,  $C(\cdot)$  is evaluated in the exponent. Next, the parties invoke an ideal execution of  $\mathcal{F}_{\text{MaskPoly}}$  where the input of  $P_0$  is K and the input of  $P_1$  is t. Let Z denote the output of  $P_1$  from this ideal call, then  $P_1$ 's output is C(t)/Z where division in implemented in  $\mathbb{G}$ .

Note that correctness holds since party  $P_1$  computes in Step 2 the polynomial evaluation

$$C(t) = \prod_{i=0}^{d} (c_i)^{t^i} = \prod_{i=0}^{d} (g^{q_i} \tilde{r}_i)^{t^i} = \prod_{i=0}^{d} (g^{q_i} g^{r'_i})^{t^i} = g^{Q(t) + R(t)}$$

and then "fixes" its computation by dividing out  $Z = g^{R(t)}$ . In addition, privacy holds due to the pseudorandomness of  $\mathcal{PRF}$  that hides the coefficients of  $Q(\cdot)$ . Next, we prove the following theorem. The proof is straightforward and is left for the full version.

**Theorem 34** Assume  $\mathcal{PRF} = \langle \text{KeyGen}, \text{PRF}, \text{CFEval} \rangle$  is an algebraic PRF, then Protocol 1 securely realizes functionality  $\mathcal{F}_{\text{OPE}}$  in the presence of semi-honest adversaries in the  $\mathcal{F}_{\text{MaskPoly}}$ -hybrid model.

*Efficiency.* In the first phase  $P_0$  computes d + 1 modular exponentiations as it can first compute the PRF evaluations in  $\mathbb{Z}_p$  (using the PRF key K) and then raise the outcomes to the power of g. Next,  $P_0$  multiplies each PRF evaluation  $\mathsf{PRF}_K(i)$  with  $g^{q_i}$  (where these computations can be combined into a single exponentiation per index i). Efficiency of the second phase is dominated by the degree of  $Q(\cdot)$  and the implementation of functionality  $\mathcal{F}_{\text{MaskPoly}}$ . In Section 3.3 we discuss several ways to realize  $\mathcal{F}_{\text{MaskPoly}}$ . (1) Assuming the strong-DDH assumption, our protocol requires a constant number of modular exponentiations. (2) Assuming the DDH assumption our protocol requires  $O(\log d)$  modular exponentiations. Therefore, the overall cost is 2(d+1) + O(1) (resp.  $O(\log d)$  exponentiations.

Security in the Presence of Malicious Adversaries We next prove the security of Protocol 1 in the presence of malicious attacks. We observe that if the protocol that implements  $\mathcal{F}_{\text{MaskPoly}}$  is secure in the presence of malicious corruptions then the entire protocol is secure against malicious attacks as well. Intuitively, security against a corrupted  $P_1$  is immediately implied since a corrupted  $P_1$  does not learn anything beyond  $g^{R(t')}$ , where t' is  $P_1$ 's input to  $\mathcal{F}_{\text{MaskPoly}}$ . More concretely, in the security proof the simulator publishes a random polynomial  $\widetilde{S}(\cdot) = g^{S(\cdot)}$  first, and then extracts  $P_1$ 's input t' to  $\pi_{\text{MaskPoly}}$ . Finally, the simulator forces  $P_1$ 's output within  $\pi_{\text{MaskPoly}}$  to be  $g^{S(t')}/g^{Q(t')}$ . In case  $P_0$  is corrupted we need to demonstrate how to extract the coefficients of  $g^{Q(\cdot)}$ . This is achieved by the fact that  $P_0$  is committed to the PRF key K within  $\mathcal{F}_{\text{MaskPoly}}$ .

To conclude, in order to obtain malicious security the only modification we need to consider with respect to  $\pi_{OPE}$  is to employ a maliciously secure implementation of functionality  $\mathcal{F}_{MaskPoly}$ . In the hybrid setting this does not make a difference for the protocol description. In Section 3.3 we discuss secure implementations of functionality  $\mathcal{F}_{MaskPoly}$ . The proof for the following theorem is simple and left for the full version.

**Theorem 35** Assume  $\mathcal{PRF} = \langle \text{KeyGen}, \text{PRF}, \text{CFEval} \rangle$  is an algebraic PRF, then Protocol 1 securely realizes functionality  $\mathcal{F}_{\text{OPE}}$  in the presence of malicious adversaries in the  $\mathcal{F}_{\text{MaskPoly}}$ -hybrid model.

## 3.3 Secure Protocols for $\pi_{\text{MaskPoly}}$

In this section we describe a concrete protocol that implements functionality  $\mathcal{F}_{\text{MaskPoly}}$ :  $(K,t) \mapsto (-, g^{R(t)})$ , used as a subprotocol within our main protocol  $\pi_{\text{OPE}}$  for oblivious polynomial evaluation from Section 3.2. This computation corresponds to the polynomial evaluation  $\widetilde{R}(x) = \text{PRF}_K(0) \cdot \text{PRF}_K(1)^x \cdots \text{PRF}_K(d)^{x^d}$  with respect to function PRF. In what follows, we discuss a detailed secure implementation for  $\mathcal{PRF}_1$  that is described in Section 3.1 and then briefly discuss how to implement function  $\mathcal{PRF}_2$ , formally described in Section 3.1, using similar ideas.

We recall that when implementing functionality  $\mathcal{F}_{\text{MaskPoly}}$  relative to  $\mathcal{PRF}_1$  the parties compute the value  $g^{\sum_{i=0}^{d} k_0 k_1^i x^i} = g^{\frac{k_0((k_1x)^{d+1}-1)}{k_1x-1}}$ , so that  $P_0$  enters a PRF key  $K = (k_0, k_1)$  and learns nothing and  $P_1$  enters x = t and learns this outcome. This is a simple computation that requires a constant number of exponentiations and can be easily implemented securely. Achieving malicious security requires to ensure correctness of computations which we obtain using simple zero-knowledge proofs of knowledge. Loosely speaking, the parties first generate a joint public key for the additive El Gamal PKE such that no party knows the secret key (we omit the details here). Next, each party commits to its input and the parties jointly compute  $k_1t$ . A slight complication arises since the parties need to compute the inverse of  $k_1t-1$ . Relying on the fact that  $(k_1t-1)^{-1} = (k_1t-1)^{p-2} \mod p$  and that

$$\frac{k_0((k_1t)^{d+1}-1)}{k_1t-1} = \frac{k_0(k_1t)^{d+1}-k_0}{k_1t-1} = \frac{k_0k_1^{d+1}t^{d+1}}{k_1t-1} - \frac{k_0}{k_1t-1},$$

we let the parties compute the inverse of  $k_1t - 1$  first and then complete the computation by multiplying the result with  $k_0(k_1t)^{d+1}$  and  $k_0$ . Formally, our protocol uses the following tools:

- 1. Distributed additive El Gamal. We denote this scheme by  $\Pi = (\pi_{\text{KeyGen}}, \text{Enc}, \pi_{\text{DEC}})$ .
- 2. Zero-knowledge proofs of knowledge:  $\pi_{DL}$  for proving a discrete logarithm and  $\pi_{Eq}$  for proving consistency of exponents, which are formally stated in Section 2.2.

Finally, we implicitly assume that a party rerandomizes its homomorphic computations on the ciphertexts. Such that rerandomization is carried out by multiplying the outcome with a random encryption of zero. We now describe our protocol is details.

#### **Protocol 2 (Protocol** $\pi_{MaskPoly}$ with malicious security.)

- Input: Party  $P_0$  is given a PRF key  $K = (k_0, k_1)$ . Party  $P_1$  is given an element t. Both parties are given a security parameter  $1^n$ , a polynomial degree d and  $(\mathbb{G}, p, g)$  for a group description  $\mathbb{G}$  of prime order p and a generator g.
- **Convention:** *Homomorphic operations on ciphertexts are computed componentwise.*
- The protocol:
  - 1. Distributed key generation.  $P_0$  and  $P_1$  run protocols  $\pi_{\text{KeyGen}}(1^n, 1^n)$  in order to generate additive El Gamal public key  $\text{PK} = \langle \mathbb{G}, p, g, h \rangle$  for which the corresponding shares of the secret key SK are (SK<sub>0</sub>, SK<sub>1</sub>).  $P_0$  then sends  $P_1$  encryptions of  $k_0$  and  $k_1$ , denoted by  $c_{k_0}$  and  $c_{k_1}$ , and proves their knowledge using  $\pi_{\text{DL}}$ .
  - 2. Computing encryption of  $k_1t$ . Upon receiving ciphertexts  $c_{k_0}$  and  $c_{k_1}$ ,  $P_1$  sends  $P_0$ an encryption of its input t, denoted by  $c_t$ . It further computes the encryption of  $k_1t$ , denoted by  $c_{k_1t}$ , and proves consistency relative to  $c_t$  and  $c_{k_1t}$  using the zero-knowledge proof  $\pi_{Eq}$ .
  - 3. Computing encryptions of  $\mathbf{k}_{1}^{d+1}$  and  $\mathbf{t}^{d+1}$ .  $P_0$  computes the encryption of  $k_{1}^{d+1}$ , denoted by  $c_{k_{1}^{d+1}}$ , and proves consistency between  $g^{d+1}$  and  $c_{k_{1}^{d+1}}$  using  $\pi_{\text{Eq}}$ . Similarly,  $P_0$  computes the encryption of  $t^{d+1}$ , denoted by  $c_{t^{d+1}}$ , and proves correctness.
  - 4. Computing encryption of  $(\mathbf{k_1t} 1)^{-1}$ . The parties compute the inverse of  $(k_1t 1)$ , by first computing the encryption of  $k_1t 1$  given ciphertext  $c_{k_1t}$  from above, and then raising the result to the power of p 2. Let  $c_{inv}$  denote the outcome.
  - raising the result to the power of p 2. Let  $c_{inv}$  denote the outcome. 5. Computing encryptions of  $\mathbf{k}_0(\mathbf{k}_1\mathbf{t}-1)^{-1}$  and  $\mathbf{k}_0\mathbf{k}_1^{\mathbf{d}+1}(\mathbf{k}_1\mathbf{t}-1)^{-1}$ . Given ciphertexts  $c_{inv}$ ,  $c_{k_1^{d+1}}$  and  $c_{k_0}$ ,  $P_0$  computes the encryptions of  $k_0(k_1t-1)^{-1}$  and  $k_0k_1^{d+1}(k_1t-1)^{-1}$ and proves consistency relative to  $c_{inv}$ ,  $c_{k_1^{d+1}}$  and  $c_{k_0}$  using  $\pi_{\mathrm{Eq}}$  (where the proof of the later computation involves running  $\pi_{\mathrm{Eq}}$  twice). Let  $c_0$  and  $c'_0$  denote the respective
  - outcomes.
    6. Computing encryption of k<sub>0</sub>k<sub>1</sub><sup>d+1</sup>t<sup>d+1</sup>(k<sub>1</sub>t 1)<sup>-1</sup>. Given ciphertexts c<sub>td+1</sub> and c'<sub>0</sub>, P<sub>1</sub> computes the encryption of k<sub>0</sub>k<sub>1</sub><sup>d+1</sup>t<sup>d+1</sup>(k<sub>1</sub>t 1)<sup>-1</sup> and proves consistency using
  - 7. **Outcome.** Finally, the parties decrypt  $c_1/c_0$  for  $P_1$  that outputs the result.

 $\pi_{Eq}$ . Let  $c_1$  denote the respective outcome.

**Theorem 36** Assume  $\Pi = (\pi_{\text{KeyGen}}, \text{Enc}, \pi_{\text{DEC}})$ ,  $\pi_{\text{DL}}$  and  $\pi_{\text{Eq}}$  are as above, then Protocol 2 securely realizes functionality  $\mathcal{F}_{\text{MaskPoly}}$  with respect to  $\mathcal{PRF}_1$  in the presence of malicious adversaries.

We leave the proof to the full version. Next, we note that the implementation of the other PRF  $\mathcal{PRF}_2$  follows similarly. Namely, recall that the parties compute the value  $g^{k_0(1+k_1,x)(1+k_2x^2)\dots(1+k_mx^{2^m})}$  which can be carried out in O(m) time as follows. First,  $P_0$  commits to its key  $(k_0, k_1, \dots, k_m)$ , whereas  $P_1$  commits to the elements  $(x, x^2, \dots, x^{2^m})$  together with a ZK proof of consistency. Next, given the product  $\tilde{q} = q^{k_0(1+k_1,x)(1+k_2x^2)\dots(1+k'_mx^{2^m'})}$  for some integer m' < m, the parties compute

$$\tilde{g} \cdot \tilde{g}^{k_{m'+1}x^{2^{(m'+1)}}} = \tilde{g}^{(1+k_{m'+1}x^{2^{(m'+1)}})} = g^{k_0(1+k_1,x)(1+k_2x^2)\dots(1+k_{m'+1}x^{2^{(m'+1)}})}$$

where  $\hat{g} = \tilde{g}^{k_{m'+1}}$  is carried out by  $P_0$  and proven correct with respect the commitment of  $g^{k_{m'+1}}$ . This computation is followed by  $P_1$  computing  $\hat{g}^{x^{2^{(m'+1)}}}$  which is also verified against the commitment of  $g^{x^{2^{(m'+1)}}}$  where the commitment is realized using El Gamal. See the ZK proof  $\pi_{\text{Eq}}$  for more details.

## 4 Secure Set-Intersection

One important application that benefits from our OPE construction is the set-intersection functionality which is defined by having each party's input consists of a *set* of elements from domain  $\{0, 1\}^t$ . Formally:

**Definition 41** Let X and Y be subsets of a predetermined arbitrary domain  $\{0, 1\}^t$  and  $m_X$  and  $m_Y$  the respective upper bounds on the sizes of X and Y.<sup>1</sup> Then functionality  $\mathcal{F}_{\cap}$  is defined by:

$$(X, Y) \mapsto (m_Y, (X \cap Y, m_X)).$$

To achieve a secure set-intersection protocol, we modify protocol  $\pi_{\text{OPE}}$  from Section 3.2 as follows. First,  $P_0$  prepares a polynomial  $Q(\cdot)$  with coefficients in  $\mathbb{Z}_p$  and the set of roots X. It then masks  $Q(\cdot)$  as in Protocol 1 using the sequence of pseudorandom elements  $\widetilde{R}(\cdot)$ . The parties then interact with a trusted party that computes functionality  $\mathcal{F}_{\text{EqMask}}$ , which is a slight variation of functionality  $\mathcal{F}_{\text{MaskPoly}}$ . Namely, instead of implementing  $\mathcal{F}_{\text{MaskPoly}}$  the functionality checks for equality with respect to  $P_1$ 's polynomial evaluations of  $g^{Q(\cdot)}\widetilde{R}(\cdot)$  and  $\widetilde{R}(\cdot)$  on the set Y. This modification in the functionality's description is required due to the fact that we cannot let  $P_1$  learn Q(y) for arbitrary  $y \in Y$  (even if  $P_1$  is honest), since that would leak information about X. More specifically,  $\mathcal{F}_{\text{EqMask}}$  is defined by  $(K, \{(y_i, T_i)\}_{y_i \in Y}) \mapsto (-, \{b_i\}_i)$ , where  $b_i = 1$  only if  $T_i = g^{R(y_i)}$  and 0 otherwise,  $g^{R(\cdot)} = (g^{r_0}, \ldots, g^{r_m_X})$  and  $g^{r_i} = \text{PRF}_K(i)$  for all i. Stated differently,  $b_i = 1$  if and only if  $Q(y_i) = 0$  (or  $y_i \in X \cap Y$ ) with overwhelming probability. Finally,  $P_1$  outputs the set of elements  $Z \subseteq Y$  for which  $b_i = 1$ .

Our implementation for  $\mathcal{F}_{\text{MaskPoly}}$  from Section 3.3 easily supports this functionality, since  $P_0$  can run its zero-knowledge proofs with respect to a single set of ciphertexts encrypting its PRF key. In addition, in order to enable the extraction of the set X by the simulator we add zero-knowledge proofs of knowledge for the relation  $\mathcal{R}_{\text{DL}}$ , formally defined in Section 2.2. This technicality arises because  $P_0$  sends elements in  $\mathbb{G}$ yet the polynomial  $Q(\cdot) + R(\cdot)$  is evaluated *in the exponent*, implying that X and Y must be sampled from  $\mathbb{Z}_p$  as well. Note that  $P_0$  may fix X and its masked polynomial in  $\mathbb{G}$ . Nevertheless,  $P_1$  needs to know the discrete logarithms of Y with respect to some group generator g in order to evaluate the masked polynomial.

Formally, let  $d = m_X - 1$ , then define our set-intersection protocol as follows,

#### **Protocol 3 (Protocol** $\pi_{\cap}$ with malicious security.)

- Input: Party P<sub>0</sub> is given a set X of size m<sub>X</sub>. Party P<sub>1</sub> is given a set Y of size m<sub>Y</sub>. Both parties are given a security parameter 1<sup>n</sup>.
- The protocol:
  - 1. Masking the input polynomial.  $P_0$  defines an d-degree polynomial  $Q(\cdot) = (q_0, \ldots, q_d)$ with coefficients in  $\mathbb{Z}_p$  and the set of roots X, for  $d = m_X - 1$ . It then invokes  $(K, param) \leftarrow \mathsf{KeyGen}(1^n, d)$  where param includes a group description  $\mathbb{G}$  of prime

<sup>&</sup>lt;sup>1</sup> In order to deal with a proof technicality, where a corrupted party inputs less elements than its set size, prior constructions assume a super polynomial lower bound on the input domain sizes. Since we do not wish to restrict the input domains, we assume that the set sizes are not strict and may denote some upper bound on the actual numbers of elements.

order p and a generator g, and defines a new d-degree polynomial  $\widetilde{R}(\cdot) = (\widetilde{r}_0, \ldots, \widetilde{r}_d)$ over  $\mathbb{G}$ , where  $r_i$  is defined by  $\mathsf{PRF}_K(i)$  for all i.

 $P_0$  sends  $P_1$  param and the masked polynomial  $C(\cdot) = (g^{q_0} \tilde{r}_0, \ldots, g^{q_d} \tilde{r}_d)$ , where multiplication is implemented in  $\mathbb{G}$ .  $P_0$  further proves the knowledge of the discrete logarithm of  $c_i = g^{q_i} \tilde{r}_i$  for all i with respect to a generator g, by invoking an ideal execution of  $\mathcal{F}_{DL}$  on input  $\{((g, c_i), \log_g c_i)\}_{i \in [0,d]}$ .<sup>2</sup> The input of  $P_1$  for  $\mathcal{F}_{DL}$  is  $\{(g, c_i)\}_{i \in [0,d]}$ .

2. Unmasking the result. Upon receiving the masked polynomial  $C(\cdot) = (c_0, \ldots, c_d)$ and upon receiving from  $\mathcal{F}_{DL}$  the value 1, denoting "accept" for all *i*, party  $P_1$  computes the polynomial evaluation  $C(y) = \prod_{i=0}^{d} (c_i)^{y^i}$  for all  $y \in Y$  (picked in a random order). I.e.,  $C(\cdot)$  is evaluated in the exponent.

Next, the parties invoke an ideal execution of  $\mathcal{F}_{EqMask}$ , where the input of  $P_0$  is K and the input of  $P_1$  is the set  $\{(y, C(y))\}_{y \in Y}$ .  $P_1$  outputs y if and only if the output from  $\mathcal{F}_{EqMask}$  on (y, C(y)) is 1.

Correctness follows easily since  $P_1$  outputs only elements in Y that zeros polynomial  $Q(\cdot)$ , whom its roots are the set X. Next, we prove the following theorem.

**Theorem 42** Assume  $\mathcal{PRF} = \langle \text{KeyGen}, F, \text{CFEval} \rangle$  is an algebraic PRF, then Protocol 3 securely realizes functionality  $\mathcal{F}_{\cap}$  in the presence of malicious adversaries in the  $\{\mathcal{F}_{\text{DL}}, \mathcal{F}_{\text{EqMask}}\}$ -hybrid model.

**Proof:** We prove security for each corruption case separately.

 $P_0$  is corrupted. Let  $\mathcal{A}$  be a PPT adversary corrupting party  $P_0$ , we design a PPT simulator SIM that simulates the view  $\mathcal{A}$ , playing the role of the honest  $P_1$  while extracting  $\mathcal{A}$ 's input set X, details follow.

- 1. Given input  $(1^n, X, z)$ , SIM invokes A on this input and receives A's first message,  $(\mathbb{G}, p, g)$  and a *d*-degree polynomial  $C(\cdot) = (c_0, \ldots, c_d)$ .
- 2. SIM emulates the ideal calls of  $\mathcal{F}_{DL}$  by playing the role of the trusted party that receives from  $\mathcal{A}$  tuples  $\{((g, c_i), c'_i)\}_{i \in [0,d]}$  and records these values. SIM verifies whether  $c_i = g^{c'_i}$  for all *i* and records 1 only if these conditions are met, and 0 otherwise. In case SIM records 0 it aborts and outputs whatever  $\mathcal{A}$  does.
- 3. SIM defines the input set X' as follows. For every *i* let  $\tilde{r}_i = \mathsf{PRF}_K(i)$  and  $r_i = \log_g \tilde{r}_i$  and let  $q'_i = c'_i r_i$ .<sup>3</sup> SIM fixes polynomial  $Q'(\cdot) = (q'_0, \ldots, q'_d)$  and defines X' to be the set of roots of  $Q'(\cdot)$ . SIM computes X' by factoring  $Q'(\cdot)$  over  $\mathbb{Z}_p$  and sends the set X' to the trusted party, receiving back  $m_Y$ .
- 4. SIM emulates the ideal call of  $\mathcal{F}_{MaskPoly}$  by playing the role of the trusted party that receives from  $\mathcal{A}$  a PRF key K.
- 5. SIM outputs whatever A does.

Note that the adversary's view is identical to its view in the hybrid execution since it does not get any output from the internal ideal calls as well as from  $\mathcal{F}_{\cap}$ . We now claim

<sup>&</sup>lt;sup>2</sup> We implicitly assume that  $P_0$  knows the discrete logarithms of the  $r_i$ 's by its knowledge of K. This is the case for all PRF implementations presented in [6].

<sup>&</sup>lt;sup>3</sup> See Footnote 2.

that  $P_1$ 's output is identical with overwhelming probability in both executions due to the following. In the hybrid execution the correctness of the ideal call for  $\mathcal{F}_{EqMask}$  ensures that  $P_1$  obtains the correct equality bit for every  $y \in Y$ . Namely, if  $C(y) \neq \tilde{R}(y)$  then the honest  $P_1$  obtains 0 from  $\mathcal{F}_{EqMask}$  and does not output y. On the other hand, if  $C(y) = \tilde{R}(y)$  then  $P_0$  receives 1 and returns y. Stating differently,  $P_1$  returns  $y \in Y$  only if  $C(y)/\tilde{R}(y) = 1$  where division is computed component-wise. Next, in the simulation  $\mathcal{SIM}$  defines the input set X' of the adversary as the set of roots with respect to the unmasked polynomial  $C(\cdot)/\tilde{R}(\cdot)$  (computed component-wise), where the masking is defined by the PRF key K input by the adversary to  $\mathcal{F}_{EqMask}$ . Therefore the intersection is computed with respect to the same set X'.

 $P_1$  is corrupted. Let  $\mathcal{A}$  be a PPT adversary corrupting party  $P_1$ , we design a PPT simulator SIM that generates the view of  $\mathcal{A}$  as follows. SIM first sends a random polynomial  $\tilde{S}(\cdot)$ . Next, upon receiving the adversary's set of elements Y' to  $\mathcal{F}_{\text{MaskPoly}}$ , SIM forwards it to the trusted party for  $\mathcal{F}_{\cap}$ . Let Z' denotes the output returned by the trusted party, then SIM completes the simulation by forcing the output of  $\mathcal{A}$  within  $\mathcal{F}_{\text{EqMask}}$  to be consistent with the set Z. More formally,

- 1. Given input  $(1^n, Y, z)$ , SIM invokes A on this input and sends it  $(\mathbb{G}, p, g)$ .
- 2. SIM picks a random *d*-degree polynomial  $\hat{S}(\cdot) = (\tilde{s}_0, \ldots, \tilde{s}_d) = (g^{s_0}, \ldots, g^{s_d})$  with coefficients in  $\mathbb{G}$  and sends it to  $\mathcal{A}$ . (We assume that the simulator knows  $m_X$  as part of its auxiliary information. This can also be assured by modifying the definition of the functionality, given  $m_X$  to  $P_1$  as part of its input).
- 3. SIM emulates the ideal calls of  $\mathcal{F}_{DL}$  by playing the role of the trusted party that receives from  $\mathcal{A}$  tuples  $\{(g, \tilde{s}_i)\}_{i \in [0,d]}$  and sends  $\mathcal{A}$  the value 1 for all *i* (denoting accept calls).
- 4. SIM then emulates the ideal call of  $\mathcal{F}_{EqMask}$  by playing the role of the trusted party that receives from  $\mathcal{A}$  the set  $\{(y'_j, T_{y'_j})\}_{j \in [m_Y]}$ . SIM sends the set  $Y' = \{y'_j\}_{j \in [m_Y]}$  to the trusted party, receiving back the intersection  $Z = X \cap Y'$ .

For all  $y'_j \in Z$ , SIM emulates the ideal response of  $\mathcal{F}_{EqMask}$  as follows. If  $T_{y'_j} = g^{S(y'_j)}$  then SIM sends A the value 1. Otherwise it sends 0. For all  $y'_j \notin Z$ , SIM always replies with 0.

5. SIM outputs whatever A does.

Note that the protocol never verifies that  $\mathcal{A}$ 's inputs to  $\mathcal{F}_{EqMask}$  are consistent pairs  $\{(y'_j, T_{y'_j})\}_j$  of which  $T_{y'_j} = g^{S(y'_j)}$  for all  $j \in [m_Y]$ . We prove that this is not required. Specifically, the differences between the hybrid and simulated executions are as follows. First, SIM sends in the simulation a random polynomial instead of a real masked polynomial. In addition, SIM fixes the output of  $\mathcal{F}_{EqMask}$  based on the correctness of  $\mathcal{A}$ 's computations which deviates from the way this functionality is defined. Consider a hybrid game Hyb where the simulator  $SIM_{Hyb}$  uses the real input X of  $P_0$  to define polynomial  $Q(\cdot)$ , but decides on the output of  $\mathcal{F}_{EqMask}$  according to the strategy specified in the simulation. Namely for every pair  $(y'_j, T_{y'_j})$ ,  $SIM_{Hyb}$  verifies first whether  $T_{y'_j} = C(y'_j)$  and returns 1 if equality holds. Clearly, the views induced in Hyb and in the simulation are computationally indistinguishable due to the pseudorandomness of F. This argument is similar to the argument presented in the proof of Protocol 1.

Next, we claim that the distributions induced by the views of the hybrid execution and game Hyb are statistically close.

Formally, for every  $y'_j$  consider two cases. (i)  $y'_j \notin X$  which implies that  $y'_j$  is not in the intersection and that  $b_j = 0$  in the simulation of Hyb. Next, define a Bad event in which  $\mathcal{A}$  receives  $b_j = 1$  from the trusted party for  $\mathcal{F}_{EqMask}$  in the hybrid execution. Clearly, this event holds only if  $T_{y'_j} = CFEval(y'_j, K) = g^{R(y'_j)}$  for K the PRF key entered by the honest  $P_0$ , which implies that  $\mathcal{A}$  must correctly guess  $CFEval(y'_j, K)$ . We claim that the probability this event occurs is negligible due to the pseudorandomness of F and CFEval (in Section 5 we discuss the pseusorandomness of CFEval). Specifically, any successful guess with a non-negligible probability implies an attack on the PRF. Thus, the probability that Bad occurs is negligible. It therefore holds that the adversary's views are statistically close condition on the event that  $y'_j$  is not in the intersection. (ii)  $y'_j \in X$  which implies that  $y'_j$  is in the intersection. Nevertheless, here there is no analogue bad event. This is because  $b_j = 1$  only when  $T_{y'_j} = C(y'_j) = CFEval(y'_j, K)$ , which implies that  $b_j = 1$  in both executions due to correctness of  $\mathcal{F}_{EqMask}$ .

*Efficiency*. As in Protocol 1, the efficiency of Protocol 3 is dominated by the implementation of functionality  $\mathcal{F}_{EqMask}$ . Our protocols from Section 3.3 can be easily modified to support this functionality without significantly effecting their overhead, since the parties can first compute the encryption of the closed form efficiency of the PRF and then compare it with the input of  $P_1$ . Therefore, the overall communication complexity is  $O(m_X)$  group elements for sending the first message and  $O(m_Y)$  (resp.  $O(m_Y \log m_Y)$ ) group elements for the second phase of implementing  $\mathcal{F}_{EqMask}$  for each  $y \in Y$ , depending on the underlying PRF. In particular, the number of modular exponentiations implies multiplicative costs in the sets sizes since  $P_1$  evaluates its masked polynomial for each element in Y. Next, we demonstrate how to reduce this cost.

### 4.1 Improved Constructions Using Hash Functions

We now show how to reduce the computational overhead using hash functions by splitting the set elements into smaller bins. Our protocol is applicable for different hash functions such as: simple hashing, balanced allocations [4] and Cuckoo hashing [33]. For simplicity, we first describe our protocol for the simple hashing case; see Section 4.1 for a discussion about extensions to the other two hashing. Informally, the parties first agree on a hash function that is picked from a family of hash functions and induces a set of bins with some upper bound on the number of elements in each bin. Next,  $P_0$  maps its elements into these bins and generates a polynomial for each such bin, which is computed as in Protocol 3 but with a smaller degree. Finally,  $P_0$  masks all the polynomials and sends them to  $P_1$ . Upon receiving the masked polynomials,  $P_1$  maps its elements into the same set of bins and evaluates the masked polynomials for these mapped bins. In the last step, the parties unmask these evaluations. To be precise, we need to specify how the masking procedure works and ensure that the parties do not deviate from the instructions of the protocol.

We fix some notations first. We denote by h the hash function picked by the parties, by  $\mathcal{B}$  the number of bins and by  $\mathcal{M}$  the maximum number of elements allocated to any single bin (where  $\mathcal{B}$  and  $\mathcal{M}$  are parameters specified by the concrete hash function in use and further depend on  $m_X$ ). Note that the potential number of allocated elements is bounded by  $\mathcal{B}\mathcal{M}$  which may be higher than the exact number  $m_X$ . This implies that the protocol must ensure that  $P_0$  does not take advantage of that and introduce more set elements into the protocol execution. In addition, it must be ensured that a corrupted  $P_0$  does not mask the zero polynomial, which would imply that  $P_1$  accepts any value it substitutes in the masked polynomial. On the other hand, the protocol must ensure that a corrupted  $P_1$  does not gain any information by entering incorrect values. Verifying that a polynomial is not all zeros can be easily done by substitution a random element in it and checking that the result is different than zero. In Section 4.1 we demonstrate how to enforce  $P_0$ 's correct behaviour by designing a new proof that exploits the algebraic properties of the underlying PRF. The verification procedure for  $P_1$  is even simpler as demonstrated below.

Next, we explain how the masking procedure is computed. Denote by  $Q_j(\cdot)$  the polynomial associated with the *j*th bin. If the degree of  $Q_j(\cdot)$  is smaller than  $\mathcal{M} - 1$  then  $P_0$  fixes the values of the  $\mathcal{M}_1 - \deg(Q_j(\cdot))$  leading coefficients to be zeros. It then masks the *i*th coefficient of  $Q_j(\cdot)$  by multiplying it with  $\mathsf{PRF}_K((j-1) \cdot \mathcal{M} + i)$  for  $i \in [0, \mathcal{M} - 1]$ . Furthermore, unmasking is computed by comparing the evaluation of the *j*th polynomial to the following computation

$$\prod_{i=0}^{j\mathcal{M}-1} \mathsf{PRF}_K(i)^{x^i} / \prod_{i=0}^{(j-1)\mathcal{M}-1} \mathsf{PRF}_K(i)^{x^i}$$
$$= \mathsf{PRF}_K((j-1)\mathcal{M})^{x^{(j-1)\mathcal{M}}} \cdot \ldots \cdot \mathsf{PRF}_K(j\mathcal{M}-1)^{x^{j\mathcal{M}-1}},$$

which is exactly the set of PRF values that mask polynomial  $Q_i(\cdot)$ .

More formally, our protocol uses two functionalities in order to ensure correctness. First, the parties call functionality  $\mathcal{F}_{\text{Bins}}$  for proving that the masked polynomials sent by  $P_0$  are correctly defined. Namely,  $\mathcal{F}_{\text{Bins}} : (K, \{C_j(\cdot) = (c_0^j, \ldots, c_{\mathcal{M}-1}^j)\}_{j \in [\mathcal{B}]}) \mapsto$ (-, b) and b = 1 only if none of the unmasked polynomials  $\{Q_j(\cdot)\}_j$  is the zero polynomial and the overall degrees of these polynomials  $\{Q_j(\cdot)\}_j$  is bounded by  $m_X$ . In addition, the parties call functionality  $\mathcal{F}_{\text{EqMaskHash}}$  in order to correctly unmask polynomial evaluations  $\{C_{h(y)}(y)\}_{y \in Y}$  for  $P_1$ . We continue with the detailed description of our set-intersection protocol in the hybrid model. In Sections 4.1 and 4.1 we discuss how to securely implement these functionalities.

#### **Protocol 4** (Protocol $\pi_{\cap}$ with malicious security and hash functions.)

- Input: Party  $P_0$  is given a set X of size  $m_X$ . Party  $P_1$  is given a set Y of size  $m_Y$ . Both parties are given a security parameter  $1^n$ .
- The protocol:
  - Fixing the parameters of the hash function. The parties fix the parameters B and M of the hash function and picks a hash function h : {0,1}<sup>t</sup> → [B]. P<sub>0</sub> invokes (K, param) ← KeyGen(1<sup>n</sup>, M - 1) where param includes a group description G of prime order p and a generator g.
  - 2. Masking the input polynomial. For every  $x \in X$ ,  $P_0$  maps x into bin h(x). Let  $\mathcal{B}_j$  denote the set of elements mapped into bin j. Next,  $P_0$  constructs a polynomial

 $Q_j(\cdot) = (q_0^j, \ldots, q_d^j)$  with coefficients in  $\mathbb{Z}_p$  and the set of roots  $\mathcal{B}_j$ . If  $|\mathcal{B}_j| < \mathcal{M}$ ,  $P_0$  fixes the leading  $\mathcal{M} - |\mathcal{B}_j| - 1$  coefficients to zero.

For each  $j \in [\mathcal{B}]$ ,  $P_0$  defines a new  $(\mathcal{M}-1)$ -degree polynomial  $\hat{R}_j(\cdot) = (\tilde{r}_j^j, \ldots, \tilde{r}_{\mathcal{M}-1}^j)$ over  $\mathbb{G}$ , where  $\tilde{r}_i^j$  is defined by  $\mathsf{PRF}_K((j-1)\mathcal{M}+i)$  for all  $i \in [0, \mathcal{M}-1]$ .  $P_0$  sends  $P_1$  param and the masked polynomials  $\{C_j(\cdot)\}_j = \{g^{q_0^j}\tilde{r}_0^j, \ldots, \ldots, g^{q_{\mathcal{M}-1}^j}\tilde{r}_{\mathcal{M}-1}^j\}_j$ , where multiplication is implemented in  $\mathbb{G}$ .

 $P_0$  further proves the knowledge of the discrete logarithm of  $c_i^j = g^{q_i^j} \tilde{\tau}_i^j$  for all iand j with respect to a generator g, by invoking an ideal execution of  $\mathcal{F}_{DL}$  on input  $\{((g, c_i^j), \log_g c_i^j)\}_{i \in [0, \mathcal{M}-1], j \in [\mathcal{B}]}$ .<sup>4</sup> The input of  $P_1$  for  $\mathcal{F}_{DL}$  is  $\{(g, c_i^j)\}_{i \in [0, \mathcal{M}-1], j \in [\mathcal{B}]}$ . Finally,  $P_0$  proves correctness using  $\mathcal{F}_{Bins}$  where  $P_0$  enters K and  $P_1$  enters the masked polynomials.

3. Unmasking the result. Upon receiving the polynomials  $\{C_j(\cdot) = (c_0^j, \ldots, c_{\mathcal{M}-1}^j)\}_{j \in [\mathcal{B}]}$ and upon receiving accepting messages from  $\mathcal{F}_{DL}$ ,  $\mathcal{F}_{Bins}$ , party  $P_1$  computes the following for every  $y \in Y$  (picked in a random order). It first maps y into bin h(y) and then computes the polynomial evaluation  $C_{h(y)}(y) = \prod_{i=(h(y)-1)\mathcal{M}}^{h(y)\mathcal{M}-1} (c_i^{h(y)})^{y^i}$ . I.e.,  $C_{h(y)}(\cdot)$  is evaluated in the exponent. Next, the parties invoke an ideal execution of  $\mathcal{F}_{EqMaskHash}$ , where the input of  $P_0$  is K

and the input of  $P_1$  is the set  $\{(y, h(y), C_{h(y)}(y))\}_{y \in Y}$ .

 $P_1$  outputs y only if the output from  $\mathcal{F}_{EqMaskHash}$  on  $(y, h(y), C_{h(y)}(y))$  is 1.

**Theorem 43** Protocol 4 securely realizes functionality  $\mathcal{F}_{\cap}$  in the presence of malicious adversaries in the  $\{\mathcal{F}_{DL}, \mathcal{F}_{Bins}, \mathcal{F}_{EqMaskHash}\}$ -hybrid model.

Security follows easily from the secure implementations of  $\mathcal{F}_{\text{Bins}}$  and  $\mathcal{F}_{\text{EqMaskHash}}$  and the proof of Protocol 3. We discuss these protocols next. We stress that  $P_1$  needs to ensure in Protocol 4 that  $P_0$  indeed uses the same PRF key for both sub-protocols (for instance by ensuring that  $P_0$  enters the same commitment of K).

A Secure Protocol for  $\mathcal{F}_{\text{Bins}}$  In this section we design a protocol  $\pi_{\text{Bins}}$  for securely implementing functionality  $\mathcal{F}_{\text{Bins}} : (K, \{C_j(\cdot)\}_{j \in [\mathcal{B}]}) \mapsto (-, b)$  for which b = 1 only if none of the unmasked polynomials  $\{Q_j(\cdot)\}_j$  is the zero polynomial and the overall degrees of all polynomials  $\{Q_j(\cdot)\}_j$  is bounded by  $m_X$ . To prove that none of the polynomials is the all zeros polynomial we evaluate each masked polynomial on a random element and then verify that the result is different than zero. In particular, for each jthe parties first agree on a random element  $z_j$  and then compute the polynomial evaluation  $C_j(z_j)$ . Next, the parties verify whether  $C_j(z_j) = \tilde{R}_j(z_j)$  where  $\tilde{R}_j(\cdot)$  is the masking polynomial of  $C_j(\cdot)$ . Note that if  $Q_j(\cdot)$  is not the all zeros polynomial then  $C_j(z_j) \neq \tilde{R}_j(z_j)$  with overwhelming probability over the choice of  $z_j$ . This is because there exists a coefficient  $q_{i,j} \neq 0$  which implies that for  $C_j(z_j) = Q_j(z_j) \cdot \tilde{R}_j(z_j)$ . Now since  $Q_j(z_j) \neq 0$  it holds that  $C_j(z_j) \neq \tilde{R}_j(z_j)$ . On the other hand, in case  $Q_j(\cdot)$ is the zero polynomial then it holds that  $C_j(z_j) = \tilde{R}_j(z_j)$  for all  $z_j$ . This is because  $Q_j(z_j) = 0$  as all its coefficients equal zero.

The more challenging part is to prove that the overall degrees of all polynomials  $\{Q_j(\cdot)\}_j$  is bounded by  $m_X + \mathcal{B}^5$  Our proof ensures that as follows. First,  $P_0$ 

<sup>&</sup>lt;sup>4</sup> See Footnote 2.

<sup>&</sup>lt;sup>5</sup> For technical reasons, we require that in case of an empty bin,  $P_0$  fixes the polynomial that is associated with this bin to be 1.

picks a PRF key K and forwards  $P_1$  a commitment of K together with encryptions of  $f = (f_0 = \mathsf{PRF}_K(0), \ldots, f_{\mathcal{BM}-1} = \mathsf{PRF}_K(\mathcal{BM}-1))$  (that are encrypted using the El Gamal encryption scheme). Next,  $P_0$  proves that it computed the sequence f correctly. This can be achieved by exploiting the closed form efficiency property of the PRF. Namely, the parties mutually compute the encryption of  $\prod_{i=0}^{\mathcal{BM}-1} \mathsf{PRF}_K(i)^{z^i}$  for some random z, and then compare it with the encryption of  $\prod_{i=0}^{\mathcal{BM}-1} f_i^{z^i}$ . In particular, the latter computation is carried out on the ciphertexts that encrypt the corresponding values from f by utilizing the homomorphic property of El Gamal. Then, equality is verified such that  $P_0$  proves that the two ciphertexts encrypt the same value. Finally, the parties divide the vector of ciphertexts f with the polynomials coefficients  $\{C_j(\cdot)\}_{j \in [\mathcal{B}]}$  component-wise (note that both vectors have the same length).  $P_0$  then proves that the overall degrees of the polynomials is as required using a sequence of zero-knowledge proofs. The last part of our proof borrows ideas from [28]. We continue with the formal description of our protocol.

#### **Protocol 5 (Protocol** $\pi_{Bins}$ with malicious security.)

- Input: Party  $P_0$  is given a PRF key K for function PRF. Both parties are given a security parameter  $1^n$ , masked polynomials  $\{C_j(\cdot) = (c_0^j, \ldots, c_{\mathcal{M}-1}^j)\}_{j \in [\mathcal{B}]}$ ,  $(\mathbb{G}, p, g)$  for a group description  $\mathbb{G}$  of prime order p and a generator g, and an integer  $m_X$ .
- The protocol:
  - 1. Setup.  $P_0$  generates  $(PK, SK) \leftarrow Gen(1^n)$  for the El Gamal encryption scheme for group  $\mathbb{G}$ . It then computes the set  $f = (f_0 = PRF_K(0), \ldots, f_{\mathcal{BM}-1} = PRF_K(\mathcal{BM}-1))$  and sends to  $P_1$  their encryptions under PK, denoted by  $(e_0, \ldots, e_{\mathcal{BM}-1})$ , as well as PK.
  - 2. **Proving the correctness of** f. The parties pick  $z \leftarrow \mathbb{Z}_p$  at random and compute  $e_f = \prod_{i=0}^{\mathcal{MB}-1} e_i^{z^i}$ . Next, the parties compute the encryption of the product  $\prod_{i=0}^{\mathcal{BM}-1} \mathsf{PRF}_K(i)^{z^i}$ , denoted by  $e_{\mathsf{PRF}}$ , which corresponds to the closed form efficiency function of  $\mathsf{PRF}$ . Finally,  $P_0$  proves that the two ciphertexts encrypt the same plaintext by proving that  $e_f/e_{\mathsf{PRF}}$  is a Diffie-Hellman tuple using  $\pi_{\mathsf{DL}}$  (see Section 2.2).
  - 3. Proving a bound  $m_X$  on the overall degrees. If  $\pi_{DL}$  is verified correctly, the parties compute the differences with respect to the masked polynomials  $\{C_j(\cdot)\}_j$  and plaintexts f, component-wise. Namely, for all  $j \in [\mathcal{B}]$  and  $i \in [0, \mathcal{M} 1]$  the parties compute the encryption of  $c_i^j/f_{(j-1)\mathcal{M}+i}$ . We denote the result vector of ciphertexts by  $c_{Diff}$ .

 $P_0$  then sets  $Z_{i,j} = 1$  for  $0 \le i \le \deg(Q_j(\cdot))$ , and otherwise  $Z_{i,j} = 0$ .  $P_0$  computes  $z_{i,j} = \operatorname{Enc}_{\mathsf{PK}}(Z_{i,j})$  and sends  $\{z_{i,j}\}_{i,j}$  to  $P_1$ .  $P_0$  proves that  $Z_{0,j}, Z_{1,j}, \ldots, Z_{M-1,j}$  is monotonically non-increasing. For that,  $P_0$  and  $P_1$  compute encryptions of  $Z_{i,j} - Z_{i+1,j}$  and  $Z_{i,j} - Z_{i+1,j} - 1$ , and  $P_0$  proves that  $Z_{i,j} - Z_{i+1,j} \in \{0, 1\}$  by showing that one of these encryptions denotes a Diffie-Hellman tuple using  $\pi_{\text{DDH}}$ .

 $P_0$  completes the proof that the values  $Z_{i,j}$  were constructed correctly by proving for all i, j that one of the encryptions  $\{e_{(j-1)\mathcal{M}+i}, z'_{i,j}\}$  is an encryption of zero, where  $z'_{i,j}$  is an encryption of  $1 - Z_{i,j}$ .<sup>6</sup>

Finally, to prove that the sum of degrees of the polynomials  $\{Q_j(\cdot)\}$  equals  $m_X$ , both parties compute an encryption  $\tau$  of  $T = \sum_{i,j} Z_{i,j} - B - m_X$ . Then P proves that  $(\mathsf{PK}, \mathsf{Enc}_{\mathsf{PK}}(T))$  is a Diffie-Hellman tuple using  $\pi_{\mathsf{DDH}}$ .

<sup>&</sup>lt;sup>6</sup> We wish to avoid the case where  $e_{(j-1)\mathcal{M}+i}$  is an encryption of a non-zero value while  $z'_{i,j}$  encrypts zero.

- 4. Checking zero polynomials. If all the proofs are verified correctly, then for any  $j \in [\mathcal{B}]$ the parties compute  $C_j(z_j)$  where  $z_j \leftarrow \mathbb{Z}_p$ . The parties call  $\mathcal{F}_{EqMaskHash}$  with inputs  $(K, \{z_j, j, C_j(z_j)\}_{j \in [\mathcal{B}]})$ . Let  $\{b_j\}_{j \in [\mathcal{B}]}$  be  $P_1$ 's output from this ideal call.<sup>7</sup>
- 5.  $P_1$  outputs b = 1 only if  $b_j = 0$  for all j.

**Theorem 44** Assume that El Gamal is IND-CPA, then Protocol 5 securely realizes functionality  $\mathcal{F}_{\text{Bins}}$  in the presence of malicious adversaries in the  $\{\mathcal{F}_{\text{DL}}, \mathcal{F}_{\text{DDH}}, \mathcal{F}_{\text{EqMaskHash}}\}$ -hybrid model.

The details of the proof are omitted here. Next, we note that the efficiency of our protocol is dominated by Steps 2 and 4, where in the former step the parties compute the closed form efficiency relative to the set f in time  $O(\mathcal{BM}) = O(m_X)$  and in the latter step the parties substitute a random element in every polynomial  $C_j$ . Overall, the overhead of this step relative to PRF  $\mathcal{PRF}_1$  implies  $O(\mathcal{B}) = O(m_X)$  group elements and modular exponentiations. For PRF  $\mathcal{PRF}_2$  this step implies  $O(\mathcal{B} \log m_X) = O((m_X \setminus \log \log m_X) \cdot \log m_X)$  cost; see a discussion below.

A Secure Protocol for  $\mathcal{F}_{EqMaskHash}$  The next protocol is designed in order to compare the result of  $P_1$ 's polynomial evaluations on the set Y with the masking polynomials. Basically, for every  $y \in Y$ ,  $P_1$  computes first  $C_{h(y)}(y)$ . The parties then run a protocol for comparing  $\{C_{h(y)}(y)\}_{y \in Y}$  with  $\{\tilde{R}_{h(y)}(y)\}_{y \in Y}$ . To do so,  $P_1$  must also input the value h(y) which determines the bin's name. Nevertheless, we do not require from the parties to mutually compute h(y) since that would imply a far less efficient protocol. Instead, we demonstrate that  $P_1$  cannot learn additional information by entering an inconsistent bin number. Finally, for every j,  $P_1$  outputs 1 only if equality holds.

Formally, we define  $\mathcal{F}_{EqMaskHash}$  by  $(K, \{y, h(y), C_{h(y)}(y)\}_{y \in Y}) \mapsto (-, \{b_j\}_j)$ , where  $b_j = 1$  if  $C_{h(y)}(y) = \prod_{i=0}^{h(y)\mathcal{M}-1} \mathsf{PRF}_K(i)^{y^i} / \prod_{i=0}^{(h(y)-1)\mathcal{M}-1} \mathsf{PRF}_K(i)^{y^i}$ . The actual implementation of this functionality depends on the underlying PRF. We consider two different implementations here. First, considering our protocol from Section 3.3 designed for  $\mathcal{PRF}_1$ , an analogue protocol for our purposes can be similarly designed with the modification that the parties now compare  $C_{h(y)}(y)$  against the result of the following formula evaluation,

$$g^{\frac{k_0\left((k_1x)^{(h(y)+1)\mathcal{M}-1}-(k_1x)^{h(y)\mathcal{M}-1}\right)}{k_1x-1}}$$

where h(y) is only known to  $P_1$ . Note that our protocol from Section 3.3 does not need to rely on the fact that both parties know the polynomial degree d for computing this formula. It is sufficient to prove that the computation of some ciphertext c to the power of h(y) is consistent with a ciphertext encrypting  $g^{h(y)}$ , where such a ciphertext can be provided by  $P_1$ . See this protocol from Section 3.3 and the ZK proof  $\pi_{Eq}$  for more details. The overall overhead of the modified protocol is also constant.

Next, considering the unmasking protocol for  $\mathcal{PRF}_2$ , the parties compute the following formula that corresponds to the masking of the polynomial that is associated

<sup>&</sup>lt;sup>7</sup> Note that  $z_j$  may be an element that is not mapped to the *j*th bin.

with bin h(y),

$$g^{k_0(1+k_1,x)(1+k_2x^2)\dots(1+k_mx^{2^{\log(h(y)\mathcal{M}-1)}})} / g^{k_0(1+k_1,x)(1+k_2x^2)\dots(1+k_mx^{2^{2^{\log((h(y)-1)\mathcal{M}-1)}})}.$$

Note that computing this formula requires  $O(\log m_X)$  exponentiations on the worst case if the bin number implies a high value so that  $h(y)\mathcal{M}$ , which determines the polynomial degree, is  $O(m_X)$ .

Security is stated as follows. If  $P_0$  is corrupted then security follows similarly to the security proof of the protocols implementing  $\mathcal{F}_{\text{MaskPoly}}$  (Section 3.3) since  $P_0$  enters the same input for both functionalities and runs the same computations with respect to its PRF key. The interesting and less trivial corruption case is of  $P_1$ . We consider two bad events here: (1) A corrupted  $P_1$  enters y, h' for which  $h' \neq h(y)$ . This implies that the parties will not compute the correct unmasking. (2) A corrupted  $P_1$  enters consistent y, h(y), but an incorrect value  $C_{h(y)}(y)$ . Note that upon extracting  $P_1$ 's input to the protocol execution, the simulator can always tell whether this input corresponds to the first or the second case, or neither.

Specifically, in the first case the parties compute the unmasking on y for which element y in not allocated to the specified bin h'. This implies that  $P_1$  would always obtain 0 from the protocol execution unless it correctly guesses  $\tilde{R}_{h'}(y)$ , which only occurs with a negligible probability due to the security of the PRF. Therefore we can successfully simulate this case by always returning zero. We further note that the security argument of the later case boils down to the security presented in the proof for a single polynomial shown in the proof of Theorem 42, since in this case  $P_1$  enters h(y)that is consistent with y so the parties compute the correct masking for y.

Using More than One Hash Function In some cases, such as for balanced allocation hash function [4], better performance are obtained by using a pair of hash functions  $h_1, h_2$ , which allocate elements into two distinct bins. That is, the input to the functionality are defined by  $(K, \{y, h_1(y), h_2(y), C_{h(y)}(y)\}_{y \in Y}) \mapsto (-, \{b_j\}_j)$ . This poses a problem in our setting since a corrupted  $P_1$  may deviate from the protocol by substituting a different element with respect to each hash function, and learn some information about  $P_0$ 's input. Specifically, if  $P_1$  learns that some element  $y \in X$  was not allocated to  $h_1(y)$  it can conclude that  $P_0$  has  $\mathcal{M}$  additional elements that are already mapped into bin  $h_1(y)$ . Note that this leaked information cannot be simulated since it depends on the real input X. In this case we need to verify that  $P_1$  indeed maps the same element into both bins correctly. A simple observation shows that if this is not the case then the simulation fails only for elements that are in the intersection. Meaning, there exists a bin for which the membership result is positive (since otherwise the adversary anyway learns 0, and it cannot distinct the cases of non-membership and incorrect behaviour). We thus define the polynomials slightly different, forcing correct behaviour.

Specifically, the polynomial  $Q_j(\cdot)$  that is associated with the set of elements  $\mathcal{B}_j$ (namely, the elements that are mapped to the *j*th bin) is defined as follows. For each  $x \in \mathcal{B}_j$ , set  $Q_j(x) = g^{h_1(x)+h_2(x)}$  where  $h_1(x)$  and  $h_2(x)$  are viewed as elements in  $\mathbb{Z}_p$ . Next, in the unmasking phase, for any tuple  $(y, h_1, h_2, C_y)$  entered by  $P_1$ , the parties compare  $C_y$  with both  $\left(\prod_{i=0}^{h_1\mathcal{M}-1} \mathsf{PRF}_K(i)^{y^i} / \prod_{i=0}^{(h_1-1)\mathcal{M}-1} \mathsf{PRF}_K(i)^{y^i}\right) \cdot g^{h_1 \cdot h_2}$  and  $\left(\prod_{i=0}^{h_2\mathcal{M}-1} \mathsf{PRF}_K(i)^{y^i} / \prod_{i=0}^{(h_2-1)\mathcal{M}-1} \mathsf{PRF}_K(i)^{y^i}\right) \cdot g^{h_1 \cdot h_2}$  such that the functionality returns 1 to  $P_1$  if equality holds with respect to one of the comparisons. Therefore,  $P_1$  will learn that an element  $y \in X$  only if it entered  $h_1$  and  $h_2$  such that  $h_1 + h_2 = h_1(y) + h_2(y)$ . Note that this implies that if one of the  $h_1, h_2$  values is inconsistent with  $h_1(y), h_2(y)$  yet equality holds, then the other value is also inconsistent with high probability. In this case,  $P_1$ 's output will always be 0 since the incorrect polynomials will be unmasked.

We further need to prove that for any  $y \notin X$  the protocol returns 0 with overwhelming probability. Specifically, we need to prove that the probability that either  $Q_{h_1(y)}(y) = g^{h_1(y)+h_2(y)}$  or  $Q_{h_2(y)}(y) = g^{h_1(y)+h_2(y)}$ , is negligible. In order to simplify our proof, we modify our construction and fix  $Q_j(x) = \mathsf{PRF}_K(g^{h_1(x)+h_2(x)})$  for any  $x \in \mathcal{B}_j$  using a PRF K key that is mutually picked by both parties. In this case, we can easily claim that the probability that the protocol returns 1 for  $y \notin X$  is negligible since that implies that either  $Q_{h_1(y)}(y)$  or  $Q_{h_2(y)}(y)$  equal the pseudorandom value  $\mathsf{PRF}_K(g^{h_1(y)+h_2(y)})$  for  $y \notin X$ . We stress that the PRF key for this purpose can be publicly known since pseudorandomness is still maintained as long as the algorithm for generating the bin polynomials does not use this key. We further note that both algebraic PRFs that we consider in this paper can be easily evaluated over an encrypted plaintext given the PRF key since it only require linear operations.

Finally, a similar solution can be easily adapted for Cuckoo hashing with a stash [33] (by treating the stash as a third polynomial). Nevertheless, Cuckoo hashing using a stash suffers from the following drawback. It has been proven in [33] that for any constant s, using a stash of size s implies an overflow with probability  $O(n^s)$  (taken over the choice of the hash functions). Specifically, if the algorithm aborts whenever the original choice of hash functions results in more than s items being moved to the stash, then this means that the algorithm aborts with probability of at most  $O(n^s)$ . Consequently,  $P_1$  can identify with that probability whether a specific potential input of  $P_0$  does not agree with the hash functions  $h_1$  and  $h_2$ . This probability is low but not negligible. On the other hand, Broder and Mitzenmacher [8] have shown for balanced allocations hash function that asymptotically, when mapping n items into n bins, the number of bins with i or more items falls approximately like  $2^{2.6i}$ . This means that if  $\mathcal{M} = \omega(\log \log n)$  then except with negligible probability no bin will be of size greater than  $\mathcal{M}$ . Nevertheless, (ignoring the abort probability), Cuckoo hashing performs better than balanced allocation hash functions, and by tuning the parameters accordingly this abort probability can be ignored for most practical applications.

**Efficiency** The efficiency here depends on the parameters  $\mathcal{B} = O(m_X/\log\log m_X)$ and  $\mathcal{M} = O(\log\log m_X)$  that are specified by the underlying hash function, as well as the PRF implementation that induce the overhead of the implementations of  $\mathcal{F}_{\text{Bins}}$ and  $\mathcal{F}_{\text{EqMaskHash}}$ . Concretely, when implementing the algebraic PRF with  $\mathcal{PRF}_1$  the number of exponentiations computed by the parties is  $O(\mathcal{BM} + m_Y \mathcal{M}) = O(m_X + m_Y \log \log m_X)$ , whereas the number of transmitted group elements is  $O(\mathcal{BM} + m_Y) = O(m_X + m_Y \log \log m_X)$ .

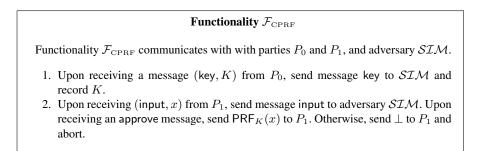


Fig. 1. The committed oblivious PRF evaluation functionality.

 $O(m_X + m_Y)$ . Moreover, implementing the algebraic PRF using  $\mathcal{PRF}_2$  implies the overhead of  $O(m_X + m_Y \log m_X)$  exponentiations and the communication is as above.

## 5 Committed Oblivious PRF Evaluation

The oblivious PRF evaluation functionality  $\mathcal{F}_{PRF}$  is an important functionality that is defined by  $(K, x) \mapsto (-, \mathsf{PRF}_K(x))$ . One known example for a protocol that implements  $\mathcal{F}_{PRF}$  is the instantiation based on the Naor-Reingold pseudorandom function [42] (specified in Section 3.1), that is implemented by the protocol presented in [20] (and proven secure in the malicious setting in [25]). This protocol involves executing an oblivious transfer for every bit of the input x. Nevertheless, it has major drawback since it does not enforce the usage of *the same* key for multiple evaluations, which is often required. In this section, we observe first that the algebraic closed form efficiency of PRFs  $\mathcal{PRF}_1$  and  $\mathcal{PRF}_2$ , specified in Section 3.1, are PRFs as well. Moreover, the protocols for securely evaluating these functions induce efficient implementations for the *committed* oblivious PRF evaluation functionality with respect to these new PRFs in the presence of adaptive inputs. This is because the PRF evaluations protocols are implemented with respect to the same set of key commitments. We formally define this functionality in Figure 1.

More formally, let PRF be an algebraic PRF from a domain  $\{0,1\}^m$  into a group  $\mathbb{G}$ . Then, define the new function  $\mathsf{PRF}': \mathbb{Z}_p \mapsto \mathbb{G}$  by  $\mathsf{PRF}'_K(x) = \prod_{i=0}^l [\mathsf{PRF}_K(i)]^{x^i}$ . Note that the domain size of  $\mathsf{PRF}'$  is bounded by l + 1, since upon observing l + 1 evaluations of  $\mathsf{PRF}'$  it is possible to interpolate the coefficients of the polynomial  $\{\mathsf{PRF}_K(i)\}_i$  (in the exponent). On the other hand, it is easy to verify that if  $l + 1 \leq 2^m$  then  $\mathsf{PRF}'$  is a PRF. The proof is straight forward and thus omitted.

**Theorem 51** Assume  $F : \{0, 1\}^m \mapsto \mathbb{G}$  is a PRF, then  $\mathsf{PRF}'$  is a PRF for  $(l+1) \leq 2^m$ .

We implement PRF' using the two PRFs from Section 3.1 and obtain two new PRF constructions under the strong-DDH and DDH assumptions. Let  $K = (k_0, k_1)$  be the key for the PRF  $\mathcal{PRF}_1$  with the strong-DDH based security, and recall that the closed form efficiency for this function is defined by

$$\mathsf{PRF}'_K(x) = \mathsf{CFEval}_h(x,K) = g^{\frac{k_0(k_1^{d+1}x^{d+1}-1)}{k_1x-1}}.$$

This implies that  $\mathsf{PRF}'$  only requires a constant number of modular exponentiations. See Section 3.3 for secure implementations of obliviously evaluating  $\mathsf{PRF}'$ . Next, let  $K = (k_0, \ldots, k_m)$  be the key for the Naor-Reingold PRF, and recall that the closed form efficiency of this function is defined by

$$\mathsf{PRF}'_K(x) = \mathsf{CFEval}_{h,z}(x,K) = g^{k_0(1+k_1,x)(1+k_2x^2)\dots(1+k_mx^{2^m})}$$

which requires  $O(\log l) = O(m)$  operations, namely, a logarithmic number of operations in the domain size where x is an m-bits string. This is the same order of overhead induced by the [20] implementation that requires an OT for each input bit. Nevertheless, our construction has the advantage that it also achieves easily the property of a committed key since multiple evaluations can be computed with respect to the same PRF key. Plugging-in our protocol inside the protocols for keyword search, OT with adaptive queries [20] and set-intersection [25] implies security against malicious adversaries fairly immediately. It is further useful for search functionalities as demonstrated below.

#### 5.1 The Set-Intersection Protocol

We continue with describing our set-intersection protocol. Informally,  $P_0$  generates a PRF key for PRF and evaluates this function on its set X. It then sends the evaluation results to  $P_1$  and the parties engage in a committed oblivious PRF protocol that evaluates PRF on the set Y.  $P_1$  then concludes the intersection. In order to handle a technicality in the security proof, we require that  $P_0$  must generate its PRF key independently of its input X, since otherwise it may maliciously pick a secret key that implies collisions on elements from X and Y, causing the simulation to fail. We ensure key independence by asking the parties to mutually generate the PRF key after  $P_0$  has committed to its input. Then upon choosing the PRF key, the parties invoke two variations of functionality  $\mathcal{F}_{CPRF}$ , denoted by  $\mathcal{F}_{CPRF}^{0}$  and  $\mathcal{F}_{CPRF}^{1}$ . Formally, we define  $\mathcal{F}^0_{\text{CPRF}}$  as follows:  $((K, (x_1, \dots, x_{m_X}), R), (c_{\text{KEY}}, (c_1, \dots, c_{m_X}), \text{PK})) \mapsto$  $(-, (\mathsf{PRF}_K(x_1), \ldots, \mathsf{PRF}_K(x_{m_X})))$  only if  $c_i$  encrypts  $x_i$  for all i and  $c_{KEY}$  is a commitment of K where verification is carried out using randomness R. In the final step, the parties call functionality  $\mathcal{F}_{\text{CPRF}}^1$  in order to evaluate the PRF on the set Y and is defined by  $((K, R), (c_{KEY}, (y_1, \dots, y_{m_Y}))) \mapsto (-, (\mathsf{PRF}_K(y_1), \dots, \mathsf{PRF}_K(y_{m_Y})))$  only if  $c_{\text{KEY}}$  is a commitment of K where verification is carried out using randomness R. In both executions the output is given to  $P_1$  that computes the intersection of the results.

Implementing  $\mathcal{F}_{CPRF}^0$  and  $\mathcal{F}_{CPRF}^1$ . Implantation-wise, there is not much of a difference between the protocols for the two functionalities, which mainly differ due to the identity of the party that enters the input values to the PRF (where the same committed key is used for both protocol executions). We note that the realization of  $\mathcal{F}_{CPRF}^0$  and  $\mathcal{F}_{CPRF}^1$ can be carried out securely based on the implementations of the closed form efficiency functions shown in Section 3.3, since our committed PRFs are based on these functions. More concretely, the difference with respect to functionality  $\mathcal{F}_{CPRF}^0$  is that now when  $P_0$  is corrupted the simulator needs to extract the randomness used for committing to the PRF key and the  $x_i$ 's elements which can be achieved using the proof of knowledge  $\pi_{DL}$  since the parties use the El Gamal PKE. Specifically,  $P_0$  proves the knowledge of the discrete logarithm of  $(c_1, \ldots c_{m_X})$  with respect to a generator g, by invoking an ideal execution of  $\mathcal{F}_{DL}$  on input  $\{((g, c_i), \log_g c_i)\}_{i \in [m_X]}$ .<sup>8</sup> The input of  $P_1$  for  $\mathcal{F}_{DL}$  is  $\{(g, c_i)\}_{i \in [m_X]}$ . In case  $P_1$  does not receive an "accept" message from  $\mathcal{F}_{DL}$  it aborts. Next, the parties continue with the PRF evaluations where the ZK proofs are carried out with respect to the same key commitment. We note that extracting the PRF key and the set  $(x_1, \ldots, x_{m_X})$  is already implied by the protocols from Section 3.3 due to the ZK proofs of knowledge. Finally, the implementation of  $\mathcal{F}^1_{CPRF}$  follows similarly but without the additional proof we added above for  $\mathcal{F}^0_{CPRF}$  in order to extract the randomness of the committed input.

Next, we describe our set-intersection protocol using committed oblivious PRF.

#### **Protocol 6** (Protocol $\pi_{\cap}$ with malicious security from committed oblivious PRF.)

- Input: Party  $P_0$  is given a set X of size  $m_X$ . Party  $P_1$  is given a set Y of size  $m_Y$ . Both parties are given a security parameter  $1^n$ .
- The protocol:
  - 1. Distributed key generation.  $P_0$  and  $P_1$  run protocol  $\pi_{\text{KeyGen}}(1^n, 1^n)$  in order to generate additive El Gamal public key  $\text{PK} = \langle \mathbb{G}, p, g, h \rangle$  where the corresponding shares of the secret key SK are  $(SK_0, SK_1)$ .
  - 2. Input commitment and PRF key generation.  $P_0$  sends encryptions of its input Xunder PK; denote this set of ciphertexts by  $C = (c_1, \ldots c_{m_X})$ .  $P_0$  invokes  $(K, param) \leftarrow \text{KeyGen}(1^n, d = \log(m_X + m_Y))$  where param includes a group description  $\mathbb{G}$  of prime order p and a generator g, and sends  $P_1$  param and a ciphertext  $\text{Enc}_{PK}(K; R)$ .

 $P_1$  picks a new key  $(K', param) \leftarrow \text{KeyGen}(1^n, d = \log(m_X + m_Y))$  and sends it to  $P_0$ . The parties then compute the encryption  $c_{\text{KEY}}$  of  $\tilde{K} = KK'$ , relying on the homomorphic property of El Gamal.

- 3. **PRF evaluations on X.** The parties call functionality  $\mathcal{F}^{0}_{CPRF}$  where  $P_{0}$  enters the set X, key  $\widetilde{K}$  and randomness R and  $P_{1}$  enters  $C, c_{KEY}$  and PK. Denote by  $\mathsf{PRF}_{X} = \{\mathsf{PRF}'_{\widetilde{K}}(x)\}_{x \in X}$  the output of  $P_{1}$  from this ideal call only if C is a vector of ciphertexts that encrypts X and  $c_{KEY}$  is a commitment of  $\widetilde{K}$ , where verification is computed using randomness R.
- 4. **Oblivious PRF evaluations on Y.** The parties call functionality  $\mathcal{F}^1_{CPRF}$  where  $P_0$  enters the key  $\widetilde{K}$  and randomness R and  $P_1$  enters the commitment  $c_{KEY}$  and the set Y. Denote by  $\mathsf{PRF}_Y = \{f_y\}_{y \in Y}$  the output of  $P_1$  from this ideal call only if  $c_{KEY}$  is a commitment of  $\widetilde{K}$  where verification is computed using randomness R.  $P_1$  outputs all  $y \in Y$  for which  $f_y \in \mathsf{PRF}_X$ .

**Theorem 52** Assume  $\mathsf{PRF}'_K(\cdot)$  is a PRF defined as above and that El Gamal is IND-CPA, then Protocol 6 securely realizes functionality  $\mathcal{F}_{\cap}$  in the presence of malicious adversaries in the  $\{\mathcal{F}_{\mathrm{DL}}, \mathcal{F}^0_{\mathrm{CPRF}}, \mathcal{F}^1_{\mathrm{CPRF}}\}$ -hybrid model.

**Proof:** We prove security for each corruption case separately. We assume that the simulator is given  $m_X$  and  $m_Y$  as part of its auxiliary input.

<sup>&</sup>lt;sup>8</sup> We abuse notation and write  $\log c$  to denote the discrete logarithm of the two group elements in ciphertext c.

 $P_0$  is corrupted. Let A be a PPT adversary corrupting party  $P_0$ , we design a PPT simulator SIM that generates the view of A as follows.

- Given (1<sup>n</sup>, X, z), SIM engages in an execution of π<sub>KeyGen</sub>(1<sup>n</sup>, 1<sup>n</sup>) with A. Denote the outcome by PK.
- Upon receiving from A its commitment for the PRF key K ← KeyGen(1<sup>n</sup>, d = log(m<sub>X</sub> + m<sub>Y</sub>)), SIM picks a new key share K' and sends it to A using PK. Denote the combined key by K̃ = KK'.
- 3. SIM extracts the adversary's input X' from the input to the ideal call  $\mathcal{F}_{CPRF}^0$ . It then sends X' to the trusted party and completes the execution as would the honest  $P_1$  do on an arbitrary set.

In the hybrid setting, computational indistinguishability between the hybrid and simulated executions is trivially claimed since the adversary does not receive any message from  $P_1$  that depends on Y. An important observation here is that the probability of the event for which there exists  $y \in Y$  such that  $y \notin X'$  and yet  $\mathsf{PRF}_{\widetilde{K}}(y) \in \mathsf{PRF}_{X'}$  is negligible, since the key  $\widetilde{K}$  is picked independently of the set X'. This argument follows from similarly to the proof in [25] and implies that  $P_1$ 's output in both executions is identical condition that the above event does not occur.

 $P_1$  is corrupted. Let  $\mathcal{A}$  be a PPT adversary corrupting party  $P_1$ , we design a PPT simulator SIM that generates the view of  $\mathcal{A}$  as follows.

- 1. Given  $(1^n, Y, z)$ , SIM engages in an execution of  $\pi_{\text{KeyGen}}(1^n, 1^n)$  with A. Denote the outcome by PK.
- 2. SIM picks a PRF key share  $K \leftarrow \text{KeyGen}(1^n, d = \log(m_X + m_Y))$  and sends its encryption to A using PK. Upon receiving A's key share K' the simulator sets the combined key by  $\tilde{K} = KK'$ .
- 3. SIM picks a set of  $m_X$  arbitrary elements  $X_{SIM}$  from  $\mathbb{Z}_p$ . It then emulates the ideal call  $\mathcal{F}^0_{CPRF}$  and hands the adversary a random set U of size  $m_X$  and proper length.
- 4. Finally, the simulator extracts the adversary's input Y' to the ideal call F<sup>1</sup><sub>CPRF</sub> and sends this set to the trusted party, receiving back Z = X ∩ Y'. The simulator completes the execution as follows. For each element y' ∈ Y' ∩ Z it programs the ideal answer of F<sup>1</sup><sub>CPRF</sub> to be r ∈ U where r is picked from the remaining elements from the set U that were not picked thus far. Otherwise, the simulator returns a fresh random element from Z<sub>p</sub>.

Security here follows from the IND-CPA security of the El Gamal PKE and the security of the PRF. That is, the simulated view is different from the hybrid view relative to the encrypted input of  $P_0$  and the fact that the simulator uses a random function to evaluate the sets in  $X'_{SIM}$  and Y'. Therefore, the proof can be shown by defining a hybrid game where in the first game the simulator encrypts  $P_0$ 's real input X but completes the simulation as in the original simulation. Indistinguishability between the simulation and the hybrid game follows easily by a reduction to the IND-CPA security of El Gamal since the simulator never uses the secret key of the encryption scheme. Indistinguishability between the hybrid game and the hybrid execution follows by a reduction to the pseudorandomness of the PRF. *Efficiency.* The overhead of protocol 6 depends on the implementations of  $\mathcal{F}^0_{CPRF}$  and  $\mathcal{F}^1_{CPRF}$  discussed above. Our protocol obtains  $O(m_X + m_Y)$  communication and computation overheads under the strong-DDH assumption and  $O((m_X + m_Y) \log(m_X + m_Y))$  overheads under the DDH assumption, where the former analysis matches the [31] analysis (such that both constructions rely on dynamic assumptions).

## 5.2 Search Functionalities

In search functionalities a receiver searches in a sender's database, retrieving the appropriate record(s) according to some search query. The database for search functionalities can be described by pairs of queries/records  $\{(q_i, T_i)\}_i$  such that the answer to a query  $q_i$  is a record  $T_i$ .<sup>9</sup> In a private setting we need to ensure that nothing beyond these records leaks to the receiver, while the sender does not learn anything about the receiver's search queries. Committed oblivious PRF evaluation is a useful tool for securely implementing various search functionalities [20]. First, in the setup phase the database is encoded and handed to the receiver. That is, for each query  $q_i$  the sender defines the pair ( $\mathsf{PRF}_K(q_i||1), \mathsf{PRF}_K(q_i||2) \oplus T_i$ ). Next, in the query phase the parties run a committed oblivious PRF evaluation protocol twice such that the sender inputs Kand the receiver inputs a query q. The receiver's output are the values  $\mathsf{PRF}_K(q||1)$  and  $\mathsf{PRF}_K(q||2)$ , where the first outcome is used to find the encrypted record while the second outcome is used to extract the record. (Alternative implementations involve a single invocation of PRF by splitting  $\mathsf{PRF}_K(q)$  into two parts). Examples for such functionalities are keyword search, oblivious transfer with adaptive queries and pattern matching (and all its variants). The functionality of committed oblivious PRF is important in this context since the sender must be enforced to use the same PRF key.

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<sup>&</sup>lt;sup>9</sup> This may not be the most concise description of the database but it is the simplest. In particular, it will do for our purposes.

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