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# ROSE: Robust Searchable Encryption With Forward and Backward Security

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Abstract—Dynamic searchable symmetric encryption (DSSE) has been widely recognized as a promising technique to delegate update and search queries over an outsourced database to an untrusted server while guaranteeing the privacy of data. Many efforts on DSSE have been devoted to obtaining a good tradeoff between security and performance. However, it appears that all existing DSSE works miss studying on what will happen if the DSSE client issues irrational update queries carelessly, such as duplicate update queries and delete queries to remove non-existent entries (that have been considered by many popular database system in the setting of plaintext). In this scenario, we find that (1) most prior works lose their claimed correctness or security, and (2) no single approach can achieve correctness, forward and backward security, and practical performance at the same time. To address this problem, we study for the first time the notion of robustness of DSSE. Generally, we say that a DSSE scheme is robust if it can keep the same correctness and security even in the case of misoperations.

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Then, we introduce a new cryptographic primitive named key-updatable pseudo-random function and apply this primitive to constructing ROSE, a robust DSSE scheme with forward and backward security. Finally, we demonstrate the efficiency of ROSE and give the experimental comparisons.

Index Terms—Searchable symmetric encryption, forward and backward security, robustness, key-updatable pseudo-random function.

#### I. Introduction

SEARCHABLE symmetric encryption (SSE) enables a client to outsource his encrypted data to an honest-but-curious server while keeping the ability to issue keyword search queries over these ciphertexts [1], [2]. *Dynamic* SSE (DSSE) adds new capabilities for the client to update the outsourced database, such as adding new entries and deleting some existent entries [3]. In terms of security, a DSSE scheme guarantees that the curious server can infer the information as little as possible about the outsourced database and the issued search and update queries from the client. This security is described by the notion of *leakage functions* that define the types of leaked information to the server. In practice, the cores of designing a DSSE scheme are tradeoffs between efficiency, such as storage or communication cost or search performance, and the amount of leaked information.

At present, forward and backward security [4] is an important property of DSSE to mitigate the devastating leakage-abuse attacks [5], [6] by ensuring that (1) the newly updated entries cannot be linked with the previous update and search queries (called forward security [7]), and (2) the deleted entries cannot be found by the subsequent search queries (called backward security [8]). Specifically, backward security includes three different types of leakage (Type-I to Type-III ordered from most to least secure). As results, some well-known DSSE schemes were designed in the past three years for obtaining forward-and-backward security while achieving high efficiency as much as possible [8]–[11]. Table I lists these DSSE schemes and compares their efficiency and forward-and-backward security. It shows that the DSSE schemes with forward and Type-III backward security are much more practical than the others.

Our Motivation: Most of these DSSE schemes are unable to handle irrational update queries (e.g., adding or deleting the same entry repeatedly and deleting the non-existent entry) issued by the client due to human errors. They will be ineffective or insecure if the client issues the irrational update

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#### TABLE I

Comparisons With Prior Forward-and-Backward Secure Works. N Is the Total Number of Keyword/File-Identifier Pairs, W Is the Number of Distinct Keywords,  $W_{\text{MAX}}$  Is the Supported Maximum Number of Keywords, F Is the Total Number of Files, and  $F_{\text{MAX}}$  Is the Supported Maximum Number of Keyword w,  $a_w$  Is the Total Number of Inserted Entries,  $d_w$  Is the Number of Delete Queries,  $d_{\text{MAX}}$  Is the Supported Maximum Number of Delete Queries,  $d_w$  Is the Number of Files Currently Containing w,  $s_w$  Is the Number of Search Queries That Occurred,  $d_w$  Is the Total Number of Add Queries, and  $s_w'$  Is a Number Having  $s_w' \leq s_w$  ( $s_w'$  Is explained in Sec. VI). All Schemes Except Rose and Qos Have  $d_w = n_w + d_w$ . Specifically, Rose Has  $d_w = n_w + s_w' + d_w$ , and Qos Has  $d_w = d_w + d_w$ . RT is the Number of Round Trips for Search Until That the Server Obtains the Matching File Identifiers. BS Stands for Backward Security. The Notation  $\widetilde{O}$  Hides Polylogarithmic Factors

Scheme	Robust	Computation		Communication			Client	BS
		Search	Update	Search	RT	Update	Storage	1 103
Moneta [8]	/	$\widetilde{O}(a_w \log N + \log^3 N)$	$\widetilde{O}(\log^2 N)$	$\widetilde{O}(a_w \log N + \log^3 N)$	3	$\widetilde{O}(\log^3 N)$	O(1)	I
Fides [8]	/	$O(a_w)$	O(1)	$O(a_w)$	2	O(1)	$O(W \log F)$	II
Diana <sub>del</sub> [8]	X	$O(a_w)$	$O(\log a_w)$	$O(n_w + d_w \log a_w)$	2	O(1)	$O(W \log F)$	III
Janus [8]	X	$O(n_w \cdot d_w)$	O(1)	$O(n_w)$	1	O(1)	$O(W \log F)$	III
Janus++ [10]	X	$O(n_w \cdot d_{max})$	$O(d_{\max})$	$O(n_w)$	1	O(1)	$O(W \log F)$	III
MITRA [11]	X	$O(a_w)$	O(1)	$O(a_w)$	2	O(1)	$O(W \log F)$	II
ORION [11]	X	$O(n_w \log^2 N)$	$O(\log^2 N)$	$O(n_w \log^2 N)$	$O(\log N)$	$O(\log^2 N)$	O(1)	I
HORUS [11]	X	$O(n_w \log d_w \log N)$	$O(\log^2 N)$	$O(n_w \log d_w \log N)$	$O(\log d_w)$	$O(\log^2 N)$	$O(W \log F)$	III
FB-DSSE [12]	X	$O(a_w)$	O(1)	O(F)	O(1)	O(F)	$O(W \log F)$	I
SD <sub>a</sub> [13]	X	$O(a_w + \log N)$	$O(\log N)$	$O(a_w + \log N)$	2	$O(\log N)$	O(1)	II
SD <sub>d</sub> [13]	X	$O(a_w + \log N)$	$O(\log^3 N)$	$O(a_w + \log N)$	2	$O(\log^3 N)$	O(1)	II
QOS [13]	X	$O(n_w \log i_w + \log^2 W)$	$\log^3 N$	$O(n_w \log i_w + \log^2 W)$	$O(\log W)$	$O(\log^3 N)$	O(1)	III
Aura [14]	X	$O(n_w)$	O(1)	$O(n_w)$	1	O(1)	$O(W \cdot d_{max})$	II
IM-DSSE <sub>II</sub> [15]	X	$O(F_{\max})$	$O(W_{\max})$	$O(F_{\max})$	2	$O(W_{\max})$	$O(W_{\max} + F_{\max})$	III
IM-DSSE <sub>I+II</sub> [15]	X	$O(F_{\max})$	$O(W_{\max})$	$O(F_{\max})$	2	$O(W_{\max})$	$O(W_{\max} + F_{\max})$	III
ROSE [Sec. VI]	<b>/</b>	$O((n_w + s_w' + 1)d_w)$	O(1)	$O(n_w)$	2	O(1)	$O(W \log F)$	III

queries, say, they are not robust. System robustness is of significance in practice, and it is easily affected by human errors. In real-world information systems, human error is known as a key factor incurring security breaches. As reported by Verizon, 85% of data breaches involve human mistakes, wherein misdelivery is the top cause of data breaches in the healthcare industry [16]. Further, even if given a DSSE system supporting multiple clients, as described in work [17], we may still suffer from insider attacks. An inside and malicious client can leverage the robustness problem and intentionally issue irrational update queries so as to illegally learn plaintext information from the encrypted database or launch a denial-of-service attack. Traditional database systems, like MySQL, seem to be able to get rid of human errors or insider attacks by using integrity constraint mechanisms to prevent irrational update operations. But there has not been any DSSE work formally investigating the robustness problem. We also note that a few DSSE schemes are robust (in our definition), but their computation and communication costs are relatively high. Referring to Table I, the details of the above problems are as follows.

Diana $_{del}$  [8], ORION [11], and HORUS [11] cannot guarantee forward security when adding or deleting the same entry repeatedly. Suppose that the database is empty; then, the client successively adds the same keyword/file-identifier pair (w, id) twice. In Diana $_{del}$ , it is trivial for the server to find that these two add queries are for adding the same keyword. In ORION and HORUS, these two add queries have distinctly different procedures in the view of the server. Hence, the server can find the relationship between these two add queries. In addition, these two schemes are also not forward secure when deleting the same entry repeatedly for

the same reason. Although both ORION and HORUS try to hide the above mentioned differences by running some dummy operations, their methods fail to achieve the aim. Although both  $IM\text{-}DSSE_{II}$  and  $IM\text{-}DSSE_{I+II}$  build oblivious search indexes using encrypted matrices, they will extra leak which file is being updated when issuing the duplicate add or del queries. When issuing an add or a del query, both  $IM\text{-}DSSE_{II}$  and  $IM\text{-}DSSE_{I+II}$  clients inform the server which file is needed to be updated by uploading the corresponding column index. Since the column index is statically calculated with the client's secret key and the file identifier, when giving two duplicate add (or del) queries, the server knows that the latter query updates the file added (or deleted) by the former query. This extra leakage violates their declared update leakage functions.

After deleting a non-existent entry, Diana<sub>del</sub> and Janus [8], Janus++ [10],  $SD_a$  and  $SD_d$  [13], Aura [14], and MITRA [11] disallow the client to add the entry in the future. More generally, these seven schemes restrict the client to re-add the already deleted keyword/file-identifier pairs. This restriction contradicts the fact that the keywords of data rely on the data's content, and some keywords of data may be deleted and then recovered along with the constant update of the data's content in practice. However, Diana<sub>del</sub> and Janus explicitly mentioned that they fail to achieve this function. Janus++ has the same problem since it has the same essence as Janus when deleting an entry. Besides, if the same entry has been duplicately added, then scheme FB-DSSE [12] can not return the correct search result in future. Scheme QOS [13] fails to delete an entry that has been added twice or more, since a delete query of QOS only deletes the latest corresponding add query.

All existing DSSE works miss studying robustness. But, Moneta [8] and Fides [8] unintentionally achieve this feature with a very high cost. In terms of communication cost, these two schemes need to return all matching ciphertexts, including the ciphertexts of the deleted entries, to the client from the server, and then the client decrypts the received ciphertexts. Hence, they waste the communication cost to transfer the non-expected ciphertexts. Furthermore, after decrypting those ciphertexts, the client in both Moneta and Fides re-adds the non-removed entries to the server using a new secret key. Moneta applies a two-round ORAM [18], thus it is efficient in terms of round trip. However, it takes much more computation and bandwidth costs than Fides. More details are in Table I.

Our Contributions: A simple idea to alleviate from the above problems requires the client to query the update history before issuing each update query. However, this idea is impractical since it largely increases either the number of search queries or the client's storage cost. Moreover, it cannot enable the client to re-add the already deleted entries. Hence, we aim to construct a new DSSE scheme with robustness, forward and backward security, and practical performance. We start by investigating the robustness of some other prior DSSE works (Sec. II) and introducing some background knowledge about searchable encryption and forward and backward security (Sec. III). Our contributions can be summarized as follows.

To the best of our knowledge, this paper is the first one to define robustness of DSSE (Sec. IV). A robust DSSE scheme means that it can keep the same correctness and security regardless of whether the client adds or deletes the same keyword/file-identifier pair repeatedly or deletes the non-existent keyword/file-identifier pair or not. Correspondingly, we extend the original definition of backward security to contain the multiple timestamps of the duplicate update queries. In contrast, only one timestamp was defined in the original definition, since it implicitly assumes that no duplicate update query occurs.

To construct a robust DSSE scheme, we define a new cryptographic primitive called key-updatable PRF and construct its instance based on an early PRF scheme [19] (Sec. V). This instance is provably secure under the decisional Diffie-Hellman (DDH) assumption in the random oracle (RO) model. It enables a client to outsource his PRF values to a server and then allows the server to update the original secret key of those PRF values to a new one when receiving a key-update token from the client. In concept, key-updatable PRF is distinct from the notion of key-homomorphic PRF [20], even though both of them can update the secret key of PRF values since they use entirely different inputs to achieve the key update. More details about their differences are in Sec. V.

Finally, we construct a robust DSSE scheme named ROSE (Sec. VI). ROSE is forward and Type-III backward secure under the adaptive attacks. It has the efficient complexity in most terms of computation, communication and search costs as shown in Table I. Since ROSE applies an ingenious design to make  $s'_w \leq \min(s_w, n_w + 1)$  hold, where  $\min(s_w, n_w + 1)$  stands for the minimum one of  $s_w$  and  $(n_w + 1)$ , ROSE has the same search complexity as Janus and Janus++ in the worst

case. Moreover, in practice, ROSE takes much less search time than Janus and Janus++, since the number of expensive operations in ROSE, such as modular exponentiation, is linear with  $O(s'_w \cdot d_w)$  rather than  $O(n_w \cdot d_w)$ , and  $s'_w < n_w$  usually holds except for some particular case. Hence, ROSE also has practical search performance. Sec. VII tests the performance of ROSE comprehensively.

#### II. DSSE SCHEMES REVISITED

SSE was first introduced by Song *et al.* [1]. Later, Chang *et al.* proposed a forward secure SSE scheme [21]. Curtmola *et al.* were the first to formally define information leakage and proposed an SSE scheme in the static setting, and this scheme has the sub-linear search performance [2]. DSSE was first introduced by Kamara *et al.* [3]. In this section, we investigate some other well-known DSSE schemes regarding their robustness and find that only two of them are robust, but no single scheme has robustness, forward and backward security, and practical performance at the same time.

Two existing DSSE schemes explicitly assume that the client never issues the irrational update queries. Clearly, these schemes are not robust. For example, Cash *et al.* [22] and Stefanov *et al.* [4] proposed two practical DSSE schemes with small leakage, but Cash *et al.* mentioned that "We assume throughout that the client never tries to add a record/keyword pair that is already present", and Stefanov *et al.* assumed that "deletions happen only after additions".

Although the other DSSE schemes do not explicitly state the above assumption, most of them are still not robust. We categorize them into the following three types according to their flaws caused by the irrational update queries.

When issuing the same add query repeatedly, the prior DSSE schemes in [3], [23], [24], and [9], [15], [25], [26] cannot keep their claimed correctness or security. For example, in [23], [24], and [9], the information leakage caused by the duplicate add queries will be beyond the limitation of their security definitions; in [3], the duplicate add queries will insert several copies of the same data into the database; however, the subsequent delete query can just remove one copy of them, in other words, the delete task cannot be achieved completely; in [9], the duplicate add queries cause some data to be replaced improperly, such that the subsequent search query cannot be achieved correctly; in [26], scheme CLOSE-FB may fail to delete entries or disallow the client to re-add a deleted entry due to it randomly decrypts entries and perform deletion during a search; and in [25], for a keyword, if the client issues a search query in the middle of two duplicate add queries, the relationship between those two add queries will be leaked, which is beyond the leakage amount defined in that work. When issuing the same delete query repeatedly, the prior DSSE schemes in [23] and [27] leak the relationship of those duplicate delete queries, which is beyond their security definitions. The DSSE schemes in [28] and [7], [29], [30] disallow the client to re-add an already deleted entry. Otherwise, the re-added entry will be deleted by the server mistakenly. This mistake causes the subsequent search query to return incomplete results.

Fortunately, there are two prior DSSE schemes, named DOD-DSSE and FAST in [31] and [32], respectively, that are robust. In terms of performance, when issuing an update or search query, DOD-DSSE requires the client to fetch all related data (which has a size linear with the maximum number of keywords or files) from the server, update those data locally if the current query is an update one, and re-add the updated or original data to the server; thus, this scheme takes very high computation and communication costs; FAST has a practical search and update performance, but it is not backward secure. In addition, DOD-DSSE must set the maximum numbers of keywords and files when initializing it.

Another important research line on DSSE is to leverage the trusted hardware to protect the update and search queries [33]–[35]. Enclaves (in other words, trusted third party) used in those works can trace the full states of the encrypted database, while in traditional DSSE works, the only trusted party (namely, the client) maintains very limited information about the encrypted database. With the extra security assumption offered by the trusted hardware, the robustness may be achieved. In this work, we attempt to capture robustness without using the trusted hardware assumption.

#### III. BACKGROUND

*Notations:* Let  $\lambda \in \mathbb{N}$  be the security parameter. Symbol  $x \leftarrow \mathcal{X}$  means randomly picking x from the set or space  $\mathcal{X}$ . Symbol |x| means the binary size of the element x. Symbol  $|\mathcal{X}|$  means the number of elements in the set  $\mathcal{X}$ . Symbol x||y means concatenating strings x and y. Symbol  $\{0,1\}^i$  means the 0/1 strings of length  $i \in \mathbb{N}$ . Symbol  $\{0,1\}^*$  means the 0/1 strings with an arbitrary length. Symbol poly( $\lambda$ ) means a polynomial in parameter  $\lambda$ . Let  $\lambda$  be the abort symbol.

Symmetric Encryption (SE): Given a security parameter  $\lambda \in \mathbb{N}$ , an SE scheme with the key space  $\mathcal{K}_{SE} = \{0, 1\}^{\lambda}$ , the plaintext space  $\mathcal{M}_{SE} = \{0, 1\}^*$ , and the ciphertext space  $\mathcal{C}_{SE}$  consists of two algorithms SE=(SE.Enc, SE.Dec) with the following syntax: SE.Enc(K, m) takes a secret key  $K \in \mathcal{K}_{SE}$  and a plaintext  $m \in \mathcal{M}_{SE}$  as inputs and probabilistically generates a ciphertext ct; SE.Dec(K, ct) takes a secret key K and a ciphertext  $ct \in \mathcal{C}_{SE}$  as inputs and recovers a plaintext  $M \in \mathcal{M}_{SE}$  or returns  $\bot$ . An SE scheme must be correct and semantically secure under chosen plaintext attack (SS-CPA) at least.

Pseudorandom Function: Let  $F: \mathcal{K}_F \times \mathcal{X}_F \to \mathcal{Y}_F$  be an efficient function with the key space  $\mathcal{K}_F$ , the domain  $\mathcal{X}_F$ , and the range  $\mathcal{Y}_F$ . It is called a PRF if for all sufficiently large security parameter  $\lambda \in \mathbb{N}$  and PPT adversary  $\mathcal{A}$ , its advantage defined as  $Adv_{\mathcal{A},F}^{PRF}(\lambda) = |Pr[\mathcal{A}^{F(K,\cdot)}(\lambda) = 1] - Pr[\mathcal{A}^{f(\cdot)}(\lambda) = 1]$ 

1]| is negligible in  $\lambda$ , where  $K \stackrel{\$}{\leftarrow} \mathcal{K}_F$  and f is a random function from  $\mathcal{X}_F$  to  $\mathcal{Y}_F$ .

Searchable Encryption: A dynamic searchable symmetric encryption (DSSE) scheme  $\Sigma = (\Sigma.\text{Setup}, \Sigma.\text{Update}, \Sigma.\text{Search})$  consists of algorithm  $\Sigma.\text{Setup}$  and protocols  $\Sigma.\text{Update}$  and  $\Sigma.\text{Search}$  both between a client and a server:

•  $\Sigma$ .Setup( $\lambda$ ): the client takes a security parameter  $\lambda$  as input and initializes (K,  $\sigma$ , EDB), where K is a secret

- key,  $\sigma$  is the client's local state, and EDB is an empty encrypted database that is sent to the server.
- Σ.Update(K, σ, op, (w, id); EDB): For adding an entry to or deleting an entry from EDB as the client's request, the client takes his secret key K, local state σ, query type op ∈ {add, del}, and a keyword/file-identifier pair (w, id) as inputs, and the server takes EDB as input. After the protocol, the pair (w, id) is added to or deleted from EDB.
- Σ.Search(K, σ, w; EDB): For searching EDB as the client's query, the client takes his secret key K, local state σ, and a keyword w as inputs, and the server takes EDB as input. After the protocol, the results matching keyword w are returned from the server to the client.

Informally,  $\Sigma$  is correct if protocol  $\Sigma$ . Search always returns correct results with an overwhelming probability for each query. We refer readers to [3] for the formal definition. In terms of security, the adaptive security of DSSE is captured by the indistinguishability between a real and an ideal game, and both games allow an adversary to adaptively perform update and search queries. The adaptive security of a DSSE scheme is parameterized by a (stateful) leakage function  $\mathcal{L} = (\mathcal{L}^{Stp}, \mathcal{L}^{Updt}, \mathcal{L}^{Srch})$  that captures the information learned by the adversarial server throughout the execution of the DSSE scheme, and the components of  $\mathcal{L}$  express the information leaked by  $\Sigma$ . Setup,  $\Sigma$ . Update, and  $\Sigma$ . Search respectively.

Definition 1 (Adaptive Security of DSSE): A DSSE scheme  $\Sigma$  is said to be  $\mathcal{L}$ -adaptively secure if for all sufficiently large security parameter  $\lambda \in \mathbb{N}$  and PPT adversary  $\mathcal{A}$ , there is an efficient simulator  $\mathcal{S} = (\mathcal{S}.\mathsf{Setup}, \mathcal{S}.\mathsf{Update}, \mathcal{S}.\mathsf{Search})$  such that  $|Pr[Real_{\mathcal{A}}^{\Sigma}(\lambda) = 1] - Pr[Ideal_{\mathcal{A},\mathcal{S},\mathcal{L}}^{\Sigma}(\lambda) = 1]|$  is negligible in  $\lambda$ , where games  $Real_{\mathcal{A}}^{\Sigma}(\lambda)$  and  $Ideal_{\mathcal{A},\mathcal{S},\mathcal{L}}^{\Sigma}(\lambda)$  are defined as:

- $Real_{\mathcal{A}}^{\Sigma}(\lambda)$ : Initially, generate  $(K, \sigma, EDB) \leftarrow \Sigma.Setup(\lambda)$  and send EDB to  $\mathcal{A}$ . Then,  $\mathcal{A}$  adaptively issues update (resp. search) queries with input (op, w, id) (resp. w) and observes the real transcripts generated by these issues.  $\mathcal{A}$  eventually outputs a bit.
- $Ideal_{\mathcal{A},\mathcal{S},\mathcal{L}}^{\mathcal{L}}(\lambda)$ : In this game,  $\mathcal{A}$  sees the simulated transcripts instead of the real ones. Initially,  $\mathcal{S}$  simulates EDB by running  $\mathcal{S}$ . Setup( $\mathcal{L}^{Stp}(\lambda)$ ). Then,  $\mathcal{A}$  adaptively issues update (resp. search) queries with input (op, w, id) (resp. w) and observes the simulated transcripts generated by  $\mathcal{S}$ . Update( $\mathcal{L}^{Updt}(op, w, id)$ ) (resp.  $\mathcal{S}$ . Search( $\mathcal{L}^{Srch}(w)$ )). Eventually,  $\mathcal{A}$  outputs a bit.

Forward and Type-III Backward Security: We briefly recall the definitions of forward and Type-III backward security (for more details, please refer to [7], [8], [12]). Let Q be a list of all issued update and search queries. Each entry of Q is either an update query (u, op, (w, id)) or a search query (u, w), where u > 0 is the timestamp of the corresponding query and gradually increases with the number of queries. Before going ahead, we recall three leakage functions.

For a keyword w, function sp(w) is to return the timestamps at which keyword w is searched, function TimeDB(w) is to return all timestamp/file-identifier pairs of keyword w that

have been added to but not deleted from EDB, and function DelHist(w) is to return all insertion/deletion-timestamps pairs of keyword w if there is a file identifier id such that (w,id) has been added to EDB and subsequently deleted from EDB. Hence, the above three functions are formally constructed from the query list Q as follows.

$$\begin{split} \mathrm{sp}(w) &= \{u | (u,w) \in Q\} \\ \mathrm{TimeDB}(w) &= \{(u,id) | (u,add,(w,id)) \in Q \\ &\quad \text{and } \forall u', (u',del,(w,id)) \notin Q\} \\ \mathrm{DelHist}(w) &= \{(u^{add},u^{del}) | \exists id, (u^{add},add,(w,id)) \in Q \\ &\quad \text{and } (u^{del},del,(w,id)) \in Q\} \end{split}$$

With the above leakage functions, the forward and Type-III backward security is defined as follows.

Definition 2 (Forward Security): An  $\mathcal{L}$ -adaptively secure DSSE scheme  $\Sigma$  is forward secure iff the update leakage function  $\mathcal{L}^{Updt}(op, w, id) = \mathcal{L}'(op, id)$ , where  $\mathcal{L}'$  is a stateless function.

Definition 3 (Type-III Backward Security): An  $\mathcal{L}$ -adaptively secure DSSE scheme  $\Sigma$  is Type-III backward secure iff the update and search leakage functions  $\mathcal{L}^{Updt}$  and  $\mathcal{L}^{Srch}$  can be written as  $\mathcal{L}^{Updt}(op, w, id) = \mathcal{L}'(op, w)$  and  $\mathcal{L}^{Srch}(w) = \mathcal{L}''(sp(w), TimeDB(w), DelHist(w))$ , where both  $\mathcal{L}'$  and  $\mathcal{L}''$  are stateless functions.

Note that the definitions of both leakage functions  $\operatorname{TimeDB}(w)$  and  $\operatorname{DelHist}(w)$  implicitly assume that no duplicate update query is issued. The reason is that for each keyword/file-identifier pair, only one insertion/deletion timestamp is returned. Hence, these two leakage functions and the Type-III backward security are not suitable for a robust DSSE scheme (the definitions of Type-I and Type-II backward security also have the same problem). Fortunately, this problem does not exist in the definition of forward security.

#### IV. ROBUST SEARCHABLE ENCRYPTION

Syntax: Roughly, a robust DSSE scheme allows the client to issue duplicate update queries and delete non-existent keyword/file-identifier pairs while guaranteeing that (1) the search protocol always returns the correct set of file identifiers, (2) the client can re-add the already deleted keyword/file-identifier pairs, and (3) the security is consistent. Hence, we define robust DSSE as follows.

Definition 4 (Robust DSSE): Let  $\Sigma$  be a DSSE scheme.  $\Sigma$  is said to be robust if it can keep the same correctness and security even if the client adds or deletes the same keyword/file-identifier pairs repeatedly and re-adds the already deleted keyword/file-identifier pairs.

General Backward Security Definition: Taking the case of duplicate update queries into account, we slightly extend the definitions of leakage functions  $\operatorname{TimeDB}(w)$  and  $\operatorname{DelHist}(w)$  and name the resulting leakage functions as  $\operatorname{exTimeDB}(w)$  and  $\operatorname{exDelHist}(w)$  respectively. Their formal definitions are as follows, where  $\mathcal U$  denotes the set of all satisfactory timestamps.

exTimeDB(w)  
= 
$$\{(\mathcal{U}, id) | \forall u \in \mathcal{U}, (u, add, (w, id)) \in Q\}$$

and 
$$\forall u' > u, (u', del, (w, id)) \notin Q$$
.  
exDelHist(w)
$$= \{ (\mathcal{U}^{add}, \mathcal{U}^{del}) | \exists id, \forall u^{add} \in \mathcal{U}^{add} \text{ and } u^{del} \in \mathcal{U}^{del},$$

$$(u^{add}, add, (w, id)) \in Q \text{ and } (u^{del}, del, (w, id)) \in Q \}$$

In addition, both exTimeDB(w) and exDelHist(w) must be the maximal set to contain all possible elements.

With the above new leakage functions, we define the general Type-III backward security as below.

Definition 5 (General Type-III Backward Security): An  $\mathcal{L}$ -adaptively secure DSSE scheme  $\Sigma$  is general Type-III backward secure iff the update and search leakage functions  $\mathcal{L}^{Updt}$  and  $\mathcal{L}^{Srch}$  can be written as

$$\mathcal{L}^{Updt}(op, w, id) = \mathcal{L}'(op, w)$$
  
$$\mathcal{L}^{Srch}(w) = \mathcal{L}''(sp(w), exTimeDB(w), exDelHist(w))$$

where both  $\mathcal{L}'$  and  $\mathcal{L}''$  are stateless functions.

Clearly, the general Type-III backward security definition implies the traditional Definition 3 if no duplicate update query is issued. By the same method, the traditional Type-I and Type-II backward security can be extended to obtain more generality.

#### V. KEY-UPDATABLE PRF

Syntax and Security Definition: Let P be a PRF function. If P is key updatable, then for any two secret keys  $K_1$  and  $K_2$ , there is a key-update token that can update the PRF values with  $K_1$  to the PRF values with  $K_2$ . In terms of security, key updatable PRF is indistinguishable with a random function under the non-trivial attacks. We define key-updatable PRF and its security as below.

Definition 6 (Key-Updatable PRF): Let  $P: \mathcal{K}_P \times \mathcal{X}_P \rightarrow \mathcal{Y}_P$  be an efficient PRF function. We say that P is a secure key-updatable PRF if the following properties hold:

- For all keys  $K_1$  and  $K_2 \in \mathcal{K}_P$  and  $x \in \mathcal{X}_P$ , there are two efficient algorithms  $P.UpdateToken : \mathcal{K}_P \times \mathcal{K}_P \to \mathcal{K}_P$  and  $P.KeyUpdate : \mathcal{K}_P \times \mathcal{Y}_P \to \mathcal{Y}_P$ , such that given key-update token  $\Delta_{K_1 \to K_2} \leftarrow P.UpdateToken(K_1, K_2)$ , equation  $P.KeyUpdate(\Delta_{K_1 \to K_2}, P(K_1, x)) = P(K_2, x)$  holds
- For all sufficiently large  $\lambda$  and PPT adversary  $\mathcal{A}$ , its advantage defined as  $Adv_{\mathcal{A},P}^{PRF}(\lambda) = |Pr[Expt_{\mathcal{A},P}^{PRF}(\lambda) = 1] \frac{1}{2}|$  is negligible in  $\lambda$ , where experiment  $Expt_{\mathcal{A},P}^{PRF}(\lambda)$  is defined in Figure 1.

In addition, we say that the key-update tokens are combinable if there is an efficient operation  $\odot$  s.t.  $\Delta_{K_1 \to K_2} \odot \Delta_{K_2 \to K_3} = \Delta_{K_1 \to K_3}$  holds for any three keys  $K_1$ ,  $K_2$ , and  $K_3$ .

Let  $(K_1, K_2)$  be two randomly chosen secret keys. In experiment  $\operatorname{Expt}_{\mathcal{A}, \mathbf{P}}^{\operatorname{PRF}}(\lambda)$ , adversary  $\mathcal{A}$  takes key-update token  $\Delta_{K_1 \to K_2}$  as input, adaptively issues queries to oracles  $\operatorname{P}(K_1, \cdot)$  and  $f(\cdot)$ , and outputs n number of challenge PRF inputs  $\{x_1, \ldots, x_n\}$ ; then, randomly giving one of sets  $\{\operatorname{P}(K_1, x_i) | i \in [1, n]\}$  and  $\{f(x_i) | i \in [1, n]\}$  to  $\mathcal{A}$ , we say that  $\mathcal{A}$  wins in this experiment if he can correctly guess which set is given. During the experiment,  $\mathcal{A}$  cannot query oracles  $\operatorname{P}(K_1, \cdot)$  or  $f(\cdot)$  with these challenge PRF inputs.

```
\frac{\operatorname{Expt}_{\mathcal{A},P}^{\operatorname{PRF}}(\lambda):}{b \stackrel{\$}{\leftarrow} \{0,1\}, \ (K_1,K_2) \stackrel{\$}{\leftarrow} \mathcal{K}_{\operatorname{P}} \times \mathcal{K}_{\operatorname{P}}, \ \operatorname{and} \ \Delta_{K_1 \to K_2} \leftarrow \operatorname{P.UpdateToken}(K_1,K_2);
\operatorname{Let} \ f: \mathcal{X}_{\operatorname{P}} \to \mathcal{Y}_{\operatorname{P}} \ \operatorname{be} \ \operatorname{a} \ \operatorname{random} \ \operatorname{function};
(x_1,\cdots,x_n,st) \leftarrow \mathcal{A}^{\operatorname{P}(K_1,\cdot),f(\cdot)}(\lambda,\Delta_{K_1 \to K_2}), \ \operatorname{where}
x_i \in \mathcal{X}_{\operatorname{P}} \ \operatorname{for} \ i \in [1,n] \ \operatorname{and} \ n = \operatorname{poly}(\lambda);
\operatorname{If} \ b = 1, \ b' \leftarrow \mathcal{A}^{\operatorname{P}(K_1,\cdot),f(\cdot)}(\{\operatorname{P}(K_1,x_i)|i \in [1,n]\},st);
\operatorname{Else} \ b' \leftarrow \mathcal{A}^{\operatorname{P}(K_1,\cdot),f(\cdot)}(\{f(x_i)|i \in [1,n]\},st);
\operatorname{Return} \ 1 \ \operatorname{if} \ b = b'; \ \operatorname{otherwise}, \ \operatorname{return} \ 0;
\operatorname{Note} \ \operatorname{that} \ \operatorname{in} \ \operatorname{the} \ \operatorname{above}, \ \mathcal{A} \ \operatorname{never} \ \operatorname{queries} \ \operatorname{P}(K_1,x_i) \ \operatorname{or} \ f(x_i) \ \operatorname{for} \ i \in [1,n]; \ \operatorname{otherwise}, \ \operatorname{it} \ \operatorname{can} \ \operatorname{trivially} \ \operatorname{guess} \ b.
```

Fig. 1. Experiment on the security of key-updatable PRF.

Key-Updatable PRF vs. Key-Homomorphic PRF: Both key-updatable and key-homomorphic PRFs can alter the original secret key of PRF values to a new secret key. However, they apply different ways to achieve this work. Let  $F : \mathcal{K}_F \times \mathcal{X}_F \rightarrow \mathcal{Y}_F$  be a key-homomorphic PRF [20], namely given any two  $F(K_1, x)$  and  $F(K_2, x)$ , there is an efficient procedure  $\otimes$  such that  $F(K_1 \oplus K_2, x) = F(K_1, x) \otimes$  $F(K_2, x)$  holds. Suppose to alter the secret key  $K_1$  of values  $\{F(K_1, x_i)|i \in [1, n]\}$  to any another secret key  $K_3 \in \mathcal{K}_F$ , key-homomorphic PRF must take many PRF values  $\{F(K_1 \oplus$  $K_3, x_i)|i \in [1, n]$  as inputs and compute  $F(K_3, x_i) =$  $F(K_1, x_i) \otimes F(K_1 \oplus K_3, x_i)$  for  $i \in [1, n]$ , where  $n \in \mathbb{N}$ . In contrast, to achieve the analogous work, key-updatable PRF takes only one key-update token  $\Delta_{K_1 \to K_3}$  as input and computes  $P(K_3, x_i) = P.KeyUpdate(\Delta_{K_1 \to K_3}, P(K_1, x_i))$  for  $i \in [1, n]$ . It is clear that key-updatable PRF is much more efficient than key-homomorphic PRF for updating the secret key of PRF values. Specifically, the generation of  $\Delta_{K_1 \to K_3}$ does not rely on  $\{x_i | i \in [1, n]\}.$ 

A Key-Updatable PRF Instance: Referring to an early PRF instance [19], it is easy to construct a key-updatable PRF instance. Let  $\mathbb G$  be a finite cyclic and multiplicative group of prime order q, where  $|q| = \operatorname{poly}(\lambda)$  and  $H: \{0,1\}^* \to \mathbb G$  is a cryptographic hash function. Given  $\mathcal K_P = \mathbb Z_q^*$ ,  $\mathcal X_P = \{0,1\}^*$ , and  $\mathcal Y_P = \mathbb G$ , a key-updatable PRF instance can be constructed as

$$P(K, x) = H(x)^{K}$$

$$\Delta_{K_{1} \to K_{2}} = P.UpdateToken(K_{1}, K_{2}) = K_{1}^{-1} \cdot K_{2}$$

$$P.KeyUpdate(\Delta_{K_{1} \to K_{2}}, P(K_{1}, x))$$

$$= P(K_{1}, x)^{\Delta_{K_{1} \to K_{2}}}$$

where  $(K, K_1, K_2) \in \mathcal{K}_P$  and  $x \in \mathcal{X}_P$ . Additionally, this instance has the property of a combinable key-update token when setting operation  $\odot$  to be the multiplicative operation of group  $\mathbb{Z}_a^*$ .

Security Proof: The security of the above key-updatable PRE instance relies on the DDH assumption in the RO model. Let  $\mathbb{G}$  be a finite cyclic and multiplicative group of prime order q where  $|q| = \text{poly}(\lambda)$ . We say that the DDH assumption holds if for all sufficiently large  $\lambda$  and PPT adversary  $\mathcal{A}$ , its

```
Algorithm 1 The Contruction of S in the RO Model
```

```
\triangleright Note that Z = g^{\alpha\beta} or g^{\gamma}
1: Initialize two empty maps HList and FList
2: b \stackrel{\$}{\leftarrow} \{0, 1\}, \ \Delta \stackrel{\$}{\leftarrow} \mathcal{K}_{P}, \ \text{and} \ R \stackrel{\$}{\leftarrow} \mathbb{G}

3: (x_{1}, \dots, x_{n}, st) \leftarrow \mathcal{A}^{H(\cdot), P(K_{1}, \cdot), f(\cdot)}(\lambda, \Delta)

4: if b = 1 then

5: b' \leftarrow \mathcal{A}^{H(\cdot), P(K_{1}, \cdot), f(\cdot)}(\{P(K_{1}, x_{i}) | i \in [1, n]\}, st)
7: b' \leftarrow \mathcal{A}^{H(\cdot), P(K_1, \cdot), f(\cdot)}(\{f(x_i) | i \in [1, n]\}, st)
8: end if
9: return 1 if b = b'; otherwise, return 0
H(x)
1: if x has been queried before then
2: (r, g^{\beta \cdot r}) \leftarrow \text{HList}[x]
3: else $ 4: r \leftarrow \mathbb{Z}_q^* and \mathrm{HList}[x] \leftarrow (r, g^{\beta \cdot r})
5: end if
6: return g^{\beta \cdot r}
P(K_1, x)
1: Query H(x) if x was never queried before
2: (r, g^{\beta \cdot r}) \leftarrow \text{HList}[x]
                                                                    \triangleright It implies that K_1 = \alpha and K_2 = \alpha \cdot \Delta
f(x)
1: if x has been queried before then
2: (r, R^r) \leftarrow \text{FList}[x]
3: else
4: r \stackrel{\$}{\leftarrow} \mathbb{Z}_q^* and \text{FList}[x] \leftarrow (r, R^r)
5: end if
6: return R^r
```

advantage defined as  $\operatorname{Adv}^{\mathrm{DDH}}_{\mathcal{A}} = |\Pr[\mathcal{A}(g^{\alpha}, g^{\beta}, g^{\alpha\beta}) = 1] - \Pr[\mathcal{A}(g^{\alpha}, g^{\beta}, g^{\gamma}) = 1]|$  is negligible in  $\lambda$ , where  $(\alpha, \beta, \gamma) \stackrel{\$}{\leftarrow} \mathbb{Z}_q^* \times \mathbb{Z}_q^* \times \mathbb{Z}_q^*$ . Then, we have the following security theorem. Theorem 1: Let the cryptographic hash function H be modelled as a random oracle. The above key-updatable PRF instance is secure under the DDH assumption in the RO model.

*Proof*: To prove the security, suppose  $\mathcal{A}$  is a PPT adversary to break the key-updatable PRF instance in the experiment  $\operatorname{Expt}_{\mathcal{A},P}^{\operatorname{PRF}}$ . Algorithm 1 constructs a simulator  $\mathcal{S}$  that can simulate the experiment  $\operatorname{Expt}_{\mathcal{A},P}^{\operatorname{PRF}}$  in the RO model and leverage the capability of the adversary  $\mathcal{A}$  to break the DDH assumption. Next, we will prove that  $\mathcal{S}$  correctly simulates the experiment  $\operatorname{Expt}_{\mathcal{A},P}^{\operatorname{PRF}}$  in the view of  $\mathcal{A}$  if  $Z=g^{\alpha\beta}$ ; otherwise,  $\mathcal{A}$  has no advantage to correctly guess b.

When  $Z = g^{\alpha\beta}$ , for any x, we have  $g^{\beta \cdot r} = H(x)$  and  $P(K_1, x) = g^{\alpha\beta r} = g^{K_1 \cdot \beta r} = H(x)^{K_1}$ . It means that  $\mathcal{S}$  correctly simulates function  $P(K_1, \cdot)$  even if it does not know  $K_1$ . In addition, it is clear that the constructed function  $f(\cdot)$  is a random one. Hence, we have that  $\mathcal{S}$  is indistinguishable from the experiment  $\text{Expt}_{\mathcal{A}, P}^{\text{PRF}}$  in the view of  $\mathcal{A}$  if  $Z = g^{\alpha\beta}$ . Formally,

we have  $\Pr[\operatorname{Expt}_{\mathcal{A},P}^{\operatorname{PRF}}(\lambda) = 1] = \Pr[\mathcal{S}(g^{\alpha}, g^{\beta}, g^{\alpha\beta}) = 1].$ When  $Z = g^{\gamma}$ , for any x, we have  $P(K_1, x) = g^{\gamma r}$ 

where r is random. It implies that for  $i \in [1, n]$ ,  $P(K_1, x_i)$  is indistinguishable from  $f(x_i)$ , since  $g^{\gamma}$  has the same random distribution with R, and A cannot query  $P(K_1, x_i)$  or  $f(x_i)$ . Summarily, A has no advantage to correctly guess b if  $Z = g^{\gamma}$ . Formally, we have  $Pr[S(g^{\alpha}, g^{\beta}, g^{\gamma}) = 1] = \frac{1}{2}$ .

According to the definition of the DDH assumption and the above results, we have  $|\Pr[\mathcal{S}(g^{\alpha},g^{\beta},g^{\alpha\beta})=1]-\Pr[\mathcal{S}(g^{\alpha},g^{\beta},g^{\gamma})=1]|=|\Pr[\operatorname{Expt}_{\mathcal{A},P}^{\operatorname{PRF}}(\lambda)=1]-\frac{1}{2}|=\operatorname{Adv}_{\mathcal{A},P}^{\operatorname{PRF}}(\lambda)$ . It means that if the DDH assumption holds, the

#### Algorithm 2 Algorithm ROSE.Setup and Protocol ROSE.Update

```
3: (K', S') \stackrel{\$}{\leftarrow} \mathcal{K}_{P} \times \mathcal{K}_{F} and LastKey[w] \leftarrow (K', S')
1: Initialize a traditional PRF function F: \mathcal{K}_F \times \mathcal{X}_F \to \mathcal{Y}_F with \mathcal{Y}_F = \{0, 1\}^{\lambda}
                                                                                                            4: end if
    and a key-updatable PRF function P: \mathcal{K}_P \times \mathcal{X}_P \to \mathcal{Y}_P with the property
                                                                                                            5: R \leftarrow \{0, 1\}^{\lambda} and L \leftarrow G(P(K', w||id||op), R)
    of a combinable key-update token and \mathcal{K}_P = \mathcal{Y}_P = \{0, 1\}^{\lambda'}, where
                                                                                                            6: C \leftarrow SE.Enc(K_{SE}, id)
    \lambda' = \text{poly}(\lambda) s.t. F and P have the exact same security in practice
                                                                                                            7: (id', op', R') \leftarrow \text{LastUp}[w]
2: Initialize two hash functions G: \{0,1\}^* \to \{0,1\}^{\lambda} and H: \{0,1\}^* \to \{0,1\}^{2\lambda+\lambda'+2}
                                                                                                            8: if (id', op', R') = (NULL, NULL, NULL) then
                                                                                                            9: D \leftarrow H(F(S', w||id||op), R) \oplus (op||0^{2\lambda + \lambda'})
3: Initialize three empty maps LastKey, LastUp, and EDB
                                                                                                           10: else
4: Let op \in \{add, del, srch\} with the binary codes add = 01, del = 00, and
                                                                                                                  L' \leftarrow G(P(K', w||id'||op'), R') and T' \leftarrow F(S', w||id'||op')
                                                                                                           11:
                                                                                                           12:
                                                                                                                  if op = add then
5: Assume the file identifier id_0 = 0^{\lambda} is an invalid one that never is used by
                                                                                                                     D \leftarrow \mathsf{H}(\mathsf{F}(S', w||id||op), R) \oplus (op||0^{\lambda'}||L'||T')
                                                                                                           13:
    any real file
                                                                                                           14:
                                                                                                                  else
6: K_{SE} \stackrel{\$}{\leftarrow} \mathcal{K}_{SE}, K_{\Sigma} \leftarrow (LastKey, K_{SE}), and \sigma \leftarrow LastUp
                                                                                                                     X \leftarrow P(K', w||id||add)
                                                                                                           15:
7: Send EDB to the server
                                                                                                           16:
                                                                                                                     D \leftarrow H(F(S', w||id||op), R) \oplus (op||X||L'||T')
Update(K_{\Sigma}, \sigma, op, (w, id); EDB)
                                                                                                           17:
                                                                                                                 end if
Client:
                                                                                                           18: end if
                                                                                                           19: Update LastUp[w] \leftarrow (id, op, R)
1: (K', S') \leftarrow \text{LastKey}[w]
2: if (K', S') = (NULL, NULL) then
                                                                                                           20: Send ciphertext (L, R, D, C) to the server
                                                                                                            1: Store EDB[L] \leftarrow (R, D, C)
```

advantage of  $\mathcal{A}$  must be negligible when it breaks the security of the key-updatable PRF instance in the RO model.

#### VI. ROSE: OUR DSSE SCHEME

In this section, we introduce the main ideas to design ROSE, apply key-updatable PRF to constructing ROSE, and finally analyze ROSE.

Roughly, for each keyword, ROSE constructs a hidden chain relationship to connect all keyword-searchable ciphertexts of the keyword in sequence, in which the latest and earliest generated ciphertexts are located at the head and the tail of the chain, respectively. When receiving a keyword search trapdoor from the client, the server determines the first matching ciphertext that is located at the head of the corresponding chain and decrypts out an index that can guide the server to find the next matching ciphertext. By carrying on in the same way, the server can determine all matching ciphertexts. Finally, the server stops the search if the matching ciphertext located at the chain's tail is found and returns all found ciphertexts, and then the client decrypts out the file identifiers.

To guarantee robustness, ROSE designs a probabilistic algorithm to generate each ciphertext's index, such that all ciphertexts have different indexes even if they are generated by the duplicate update queries. However, this idea also causes a new challenge that concerns how to delete the ciphertexts generated by the previous duplicate add queries. Suppose the client adds the same keyword/file-identifier pair n times. ROSE makes the n generated ciphertexts have n different indexes. To remove all those ciphertexts by one delete query, ROSE allows the ciphertext generated by the delete query to contain a constant-size delete token, which enables the server to find all ciphertexts that were generated by the previous duplicate and relevant add queries.

To guarantee forward security when a search query occurs in the middle of the relevant delete and re-add queries, the ROSE client will randomly choose new secret keys to generate the ciphertexts in the subsequent update

queries (including the subsequent re-add queries) after the search query. Suppose the client issues a search query at timestamp  $u_s$ . This idea is advantageous in guaranteeing that the update queries issued before  $u_s$  are independent of the update queries issued after  $u_s$  in the view of the server. However, this idea also causes a new challenge that concerns how to delete the ciphertexts that were generated before the last search query.

Without loss of generality, for a keyword w, suppose the client adds id, searches w, and deletes id in sequence. Let  $\mathbf{C}_a$  and  $\mathbf{C}_d$  be the two ciphertexts generated by these add and delete queries. According to the above idea, these two ciphertexts were generated with different secret keys. Hence, the delete token contained in  $\mathbf{C}_d$  could be ineffective for deleting the ciphertext with index  $\mathbf{C}_a$ . Fortunately, keyupdatable PRF can overcome this challenge. It can update the secret key of the delete token to the secret key of ciphertext  $\mathbf{C}_a$ . Hence, it can be used to delete the ciphertext  $\mathbf{C}_a$ . More details are introduced in the following construction of ROSE.

Setup: Algorithm 2 describes algorithm ROSE.Setup. The client runs this algorithm to initialize a traditional PRF, a key-updatable PRF, two cryptographic hash functions, and three empty maps LastKey, LastUp, and EDB, chooses a secret key  $K_{SE}$  of symmetric encryption, generates the secret key  $K_{\Sigma}$  of ROSE, and sends EDB to the server whereas LastUp is stored locally. Note that LastKey will record the up-to-date secret key of each keyword that is used to generate ciphertexts, and the operation types include the search query srch in addition to add and del.

Update: Algorithm 2 also describes protocol ROSE.Update. When updating a keyword/file-identifier pair (w,id) with operation type op = add or del, the client randomly picks the secret keys (K', S') of w and inserts them into LastKey[w] if it is for the first time to issue the update query of w; otherwise, it retrieves the keys from LastKey[w] (lines 1-4). Then, the client generates and sends a keyword-searchable ciphertext (L, R, D, C) to the server. To generate L, the client

#### **Algorithm 3** Protocol ROSE.Search( $K_{\Sigma}$ , $\sigma$ , w; EDB)

```
22: (L'^t, T'^t) \leftarrow (L'', T'') and op^t \leftarrow op^t
1: (id', op', R') \leftarrow \text{LastUp}[w]
                                                                                                                         23: \mathcal{I} \leftarrow \mathcal{I} \cup \{C'\}
2: if (id', op', R') = (NULL, NULL, NULL) then
                                                                                                                         24: endif
3: return ⊥
                                                                                                                         25: endif
4: end if
                                                                                                                         26: if op' = srch then
5: (K', S') \leftarrow \text{LastKey}[w]
6: L' \leftarrow \text{G}(P(K', w||id'||op'), R') and T' \leftarrow \text{F}(S', w||id'||op')
                                                                                                                         27:
                                                                                                                                if op^t = srch and \Delta^t \neq NULL then
                                                                                                                                    Remove ciphertext (L', R', D', C') from EDB D^t \leftarrow D^t \oplus (00||\Delta^t \oplus (\Delta^t \odot X')||L'^t \oplus L''||T'^t \oplus T'')
7: (K,S) \stackrel{\$}{\leftarrow} \mathcal{K}_P \times \mathcal{K}_F, op \leftarrow srch, R \stackrel{\$}{\leftarrow} \{0,1\}^{\lambda}, and \Delta_{K \rightarrow K'} \leftarrow
                                                                                                                         29.
                                                                                                                                   Update EDB[L^t] \leftarrow (R^t, D^t, C^t)

(L'^t, T'^t) \leftarrow (L'', T'')

\Delta^t \leftarrow \Delta^t \odot X'
                                                                                                                         30:
    P.UpdateToken(K, K')
                                                                                                                         31:
8: L \leftarrow G(P(K, w||id_0||op), R), D \leftarrow H(F(S, w||id_0||op), R) \oplus
     (op||\Delta_{K \to K'}||L'||T'), and C \leftarrow SE.Enc(K_{SE}, id_0)
                                                                                                                         32:
                                                                                                                                                                                     \triangleright Note that X' \in \mathcal{K}_P if op' = srch
                                                                                                                         33:
                                                                                                                                 end if
9: Update LastUp[w] \leftarrow (id<sub>0</sub>, op, R) and LastKey[w] \leftarrow (K, S)
                                                                                                                                 if (op^t = srch \text{ and } \Delta^t = \text{NULL}) \text{ or } (op^t \neq srch) then
                                                                                                                         34.
10: Send search trapdoor (L', T') and ciphertext (L, R, D, C) to the server
                                                                                                                                   (L^{t}, R^{t}, D^{t}, C^{t}) \leftarrow (L', R', D', C')

(L'^{t}, T'^{t}) \leftarrow (L'', T'') \text{ and } (op^{t}, \Delta^{t}) \leftarrow (op', X')
                                                                                                                         35:
                                                                                                                         36:
1: Store EDB[L] \leftarrow (R, D, C)
                                                                                                                         37:
                                                                                                                                 end if
2: (L^t, R^t, D^t, C^t) \leftarrow (L, R, D, C), (op^t, \Delta^t) \leftarrow (srch, NULL), and (L^{tt}, T^{tt}) \leftarrow (L', T')
                                                                                                                         38:
                                                                                                                                 for all A \in \mathcal{D} do
                                                                                                                                   A \leftarrow P.KeyUpdate(X', A)
                                                                                                                         39.
3: \mathcal{I} \leftarrow \emptyset and \mathcal{D} \leftarrow \emptyset
                                                                                                                         40:
                                                                                                                               end for
4: repeat
                                                                                                                         41: end if
5: (R', D', C') \leftarrow \text{EDB}[L']
                                                                                                                         42: L' \leftarrow L'' and T' \leftarrow T''
6: op'||X'||L''||T'' \leftarrow D' \oplus H(T', R')
                                                                                                                         43: until (L' = 0^{\lambda} \text{ and } T' = 0^{\lambda})
7: if op' = del then
                                                                                                                         44: if \mathcal{I} = \emptyset then
8: Remove ciphertext (L', R', D', C') from EDB
                                                                                                                         45: Remove all previously found ciphertexts
                                                               \triangleright Note that X' \in \mathcal{Y}_P if op' = del
9: \mathcal{D} \leftarrow \mathcal{D} \cup \{X'\}
                                                                                                                         46: end if
10: D^t \leftarrow D^t \oplus (0^{\lambda'+2}||L'^t \oplus L''||T'^t \oplus T'') > \text{Note that operation } \oplus \text{ is}
                                                                                                                         47: Send \mathcal{I} to the client
       handled before operation ||
                                                                                                                         Client:
11: Update EDB[L^t] \leftarrow (R^t, D^t, C^t)
12: (L'^t, T'^t) \leftarrow (L'', T'')
                                                                                                                         1: if \mathcal{T} = \emptyset then
                                                                                                                         2: LastKey[w] \leftarrow (NULL, NULL)
13: end if
                                                                                                                         3: LastUp[w] \leftarrow (NULL, NULL, NULL)
14: if op' = add then
                                                                                                                         4: return ⊥
15: if \exists A \in \mathcal{D} s.t. L' = G(A, R') then
                                                                                                                         5: end if
16: Remove ciphertext (L', R', D', C') from EDB
                                                                                                                         6: for i = 1 to |\mathcal{I}| do
17: D^t \leftarrow D^t \oplus (0^{\lambda'+2} || L'' \oplus L'' || T'' \oplus T'')
                                                                                                                         7: id_i \leftarrow SE.Dec(K_{SE}, \mathcal{I}[i])
18: Update \text{EDB}[L^t] \leftarrow (R^t, D^t, C^t)
                                                                                                                         8: end for
19: (L'', T'') \leftarrow (L'', T'')
                                                                                                                         9: return \{id_i | i \in [1, |\mathcal{I}|]\}
20: else
21: (L^t, R^t, D^t, C^t) \leftarrow (L', R', D', C')
```

computes the key-updatable PRF value P(K', w||id||op) and takes this value and random number R as inputs to compute L = G(P(K', w||id||op), R) (line 5). The content of D contains the delete token X = P(K', w||id||add) if op = del (lines 15 and 16). Finally, the client updates LastUp[w] locally to record the newest update information (id, op, R) of keyword w (line 19).

Search: Algorithm 3 describes protocol ROSE.Search. When issuing a search query, the ROSE client generates and sends not only a search trapdoor but also a keyword-searchable ciphertext with operation type op = srch to the server, and the ciphertext contains a key-update token of key-updatable PRF, which will be disclosed to the server in due course for updating the secret key of delete tokens. When receiving a search trapdoor, ROSE can find all matching ciphertexts and delete all expected ciphertexts from them. Namely, only the still-valid ciphertexts will be sent to the client. To delete the matching-but-invalid ciphertexts, (1) the ROSE server applies the delete tokens disclosed from the already found ciphertexts to test if a newly found ciphertext can be removed; and (2) when finding a matching ciphertext with operation type op = srch, the ROSE server decrypts out a key-update token, applies the token to update the secret key of all previously disclosed delete tokens, and removes this ciphertext in some

cases (this step is for saving the time cost of the next search query). More details of protocol ROSE. Search are as below.

When issuing a search query of keyword w, the client retrieves the last secret keys (K',S') from LastKey[w] and takes them as inputs to compute both the index L' and the decryption token T' of the ciphertext that was generated in the last update or search query of w, and L' and T' constitute the search trapdoor (lines 1-6). Then, the client picks two new random secret keys (K,S), computes the key-update token  $\Delta_{K\to K'}$ , and takes (K,S) and  $(op=srch,w,id_0)$  as inputs to generate a keyword-searchable ciphertext (L,R,D,C), where  $id_0=0^\lambda$  does not stand for any real file, and D contains  $op||\Delta_{K\to K'}||L'||T'$  (lines 7 and 8). Finally, the client updates LastUp[w] and LastKey[w] to the information about the current search query and these two new secret keys, respectively, and sends (L',T') and (L,R,D,C) to the server.

Recall that all ciphertexts of each keyword are connected by a hidden chain relationship. Thus, in the chain of keyword w, let  $(L^t, R^t, D^t, C^t)$  and (L', R', D', C') be two adjacent ciphertexts and  $(L^t, R^t, D^t, C^t)$  be in front of (L', R', D', C'). Let  $(op^t, \Delta^t, L'^t, T'^t)$  be the operation type, the key-update token, the ciphertext's index, and the decryption token that are contained in  $D^t$ . Upon receiving (L', T')

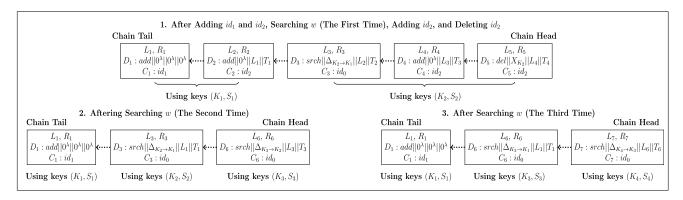


Fig. 2. An example of ROSE.

and (L, R, D, C) from the client, the server inserts (R, D, C) into EDB[L] and sets  $(L^t, R^t, D^t, C^t) \leftarrow (L, R, D, C)$  and  $(op^t, \Delta^t, L'^t, T'^t) \leftarrow (srch, \text{NULL}, L', T')$  at the beginning (lines 1 and 2).

Next, the server will repeat finding a new matching ciphertext and then handle this ciphertext in different ways until all matching ciphertexts are found (lines 4-43). Finally, the server returns  $\mathcal{I}$ . Then the client empties LastKey[w] and LastUp[w] if  $\mathcal{I}$  is empty and decrypts out the expected file identifiers (lines 1-9).

An Example: For keyword w, suppose the client adds file identifiers  $id_1$  and  $id_2$ , searches w, duplicately adds  $id_2$ , and deletes  $id_2$  in sequence. According to protocols ROSE.Update and ROSE.Search, the client orderly uploads five ciphertexts to the server, these ciphertexts contain a hidden chain relationship as the first part of Figure 2 shows, and we assume that ciphertexts with indexes  $L_1$  and  $L_2$  are generated using secret keys  $(K_1, S_1)$ , and the other ciphertexts are generated using secret keys  $(K_2, S_2)$ .

Next, suppose the client searches w again. The second part of Figure 2 shows the remainder ciphertexts and their relationships after the search. Specifically, according to protocol ROSE.Search, the client sends search trapdoor  $(L_5, T_6)$  and ciphertext  $(L_6, R_6, D_6, C_6)$  to the server, where ciphertext  $(L_6, R_6, D_6, C_6)$  is generated using secret keys  $(K_3, S_3)$ . Upon receiving those messages, the server inserts ciphertext  $(L_6, R_6, D_6, C_6)$  into EDB, sequentially finds all matching ciphertexts  $\{C_5, C_4, C_3, C_2, C_1\}$ , deletes  $\{C_5, C_4, C_2\}$ , and returns  $\{C_1\}$  to the client.

Finally, suppose that this is the third time the client searches w. The client sends search trapdoor  $(L_6, T_6)$  and ciphertext  $(L_7, R_7, D_7, C_7)$  to the server. The third part of Figure 2 shows the remainder ciphertexts and their relationships after the search. This part mainly shows that in the special case that the conditions in the lines 26 and 27 of protocol ROSE.Search hold, ciphertext  $(L_3, R_3, D_3, C_3)$  is removed, the key-update tokens  $\Delta_{K_2 \to K_1}$  and  $\Delta_{K_3 \to K_2}$  are combined to the key-update token  $\Delta_{K_3 \to K_1}$ , and  $D_6$  is updated to contain  $\Delta_{K_3 \to K_1} ||L_1||T_1$  instead of  $\Delta_{K_3 \to K_2} ||L_3||T_3$  (lines 28 and 32 of protocol ROSE.Search).

Analysis on Correctness, Security, and Robustness: Suppose that the client does not add or delete the same keyword/file-identifier pairs repeatedly or re-add the already deleted

keyword/file-identifier pairs. It is very easy to verify the correctness of ROSE. Without the assumption, it is also easy to verify the correctness of ROSE, since for a keyword, (1) all ciphertexts generated by the update and search queries, including by the duplicate update queries, have independent storage addresses and construct a hidden chain relationship well, (2) this chain can guide the server to find all matching ciphertexts in an orderly manner from chain head to chain tail, (3) the key-updatable feature of PRF P enables delete queries to remove all previously added and relevant ciphertexts, (4) the duplicate delete queries do not affect the search results, and (5) the re-added ciphertexts cannot be removed by the previously issued delete queries. Hence, ROSE is robust in terms of correctness.

In terms of security, we prove that without the above assumption, ROSE is forward and general Type-III backward secure. It also implies that with the above assumption, ROSE is forward and Type-III backward secure, since the general Type-III backward security implies the traditional Type-III backward security. Formally, we have the following theorem whose proof is in Appendix. It is easy to summarize and conclude that ROSE is robust.

Theorem 2: Let the cryptographic hash functions H and G be modelled as two random oracles. Suppose that the client can add or delete the same keyword/file-identifier pairs repeatedly and re-add the already deleted keyword/file-identifier pairs, and F and P are two secure PRF functions, then ROSE is an adaptively secure DSSE scheme with  $\mathcal{L}^{Stp}(\lambda) = \lambda$ ,  $\mathcal{L}^{Updt}(op, w, id) = \emptyset$ , and  $\mathcal{L}^{Srch}(w) = \{sp(w), exTimeDB(w), exDelHist(w)\}$ .

Performance Analysis: Table I has listed the computation and communication complexities of ROSE. When issuing an update query, the client takes a constant computation complexity to generate a constant-size ciphertext and send this ciphertext to the server by an one-pass communication; finally, the server stores this ciphertext in EDB. When issuing a search query, the client takes a constant computation complexity to generate a constant-size search trapdoor and a constant-size ciphertext and sends them to the server; then, the server finds all matching ciphertexts and sends the valid ones of them to the client; finally, the client takes the computation complexity linear with the number of the received ciphertexts to decrypt out file identifiers in the symmetric-key setting.

For each keyword, the client stores a pair of PRF's secret keys and a triple (file identity, operation type, random number) locally. Hence, ROSE is very practical in most aspects.

The only one slightly complicated work in ROSE is to find all matching ciphertexts. For keyword w, suppose that the client has issued the add queries  $n_w$  times, the delete queries  $d_w$  times, and the search queries  $s_w$  times. Thus, for keyword w, database EDB has stored  $n_w$  ciphertexts with operation type op = add,  $s'_{n}$  ciphertexts with operation type op = srch, and  $d_w$  ciphertexts with operation type op = delat most, where  $s'_w \leq \min(s_w, n_w + 1)$  holds since the redundant ciphertexts with operation type op = srch are removed according to the lines 28-32 of protocol ROSE.Search. Under the above assumption, the complexity of searching w over EDB mainly consists of the complexity  $O(d_w)$  for removing Type-del ciphertexts, the complexity  $O(n_w \cdot d_w)$  for finding or removing Type-add ciphertexts, and the complexity  $O(s'_w \cdot d_w)$ for updating the secret keys of the delete tokens. To summarize, the search complexity of protocol ROSE.Search is  $O((n_w + s'_w + 1)d_w).$ 

#### VII. IMPLEMENTATIONS

We experimentally compare ROSE with three DSSE schemes, say Fides, HORUS, and IM-DSSE<sub>I+II</sub> (All codes are available on https://github.com/HustSecurityLab/ROSE-Experiment). Fides unintentionally achieves robustness. HORUS can be slightly revised to gain robustness. IM-DSSE<sub>I+II</sub> has very high run-time efficiency and is evaluated to measure the performance degradation introduced by ROSE to achieve robustness. We do not compare ROSE with Moneta, since Moneta takes a very huge cost due to its underlying cryptographic tool TWORAM. In a nutshell, ROSE usually performs much better than both Fides and HORUS in most of terms, except that as the number of deletions grows, the search time cost of ROSE with a single thread will be slightly more than that of Fides. However, this disadvantage against Fides and HORUS can be relieved by parallelizing the search of ROSE. Compared to IM-DSSE<sub>I+II</sub>, ROSE, Fides, and HORUS require more time to issue an update query and to complete a search query. In most cases, ROSE only introduces about an order of magnitude extra time to complete the search, except for the case when there are historical deletions. In terms of client time cost during the search, ROSE outperforms IM-DSSE<sub>I+II</sub>.

Evaluated Metrics: We evaluate and compare the four schemes in terms of (1) the time cost to issue a single add/delete query and (2) the time and bandwidth costs when searching a keyword with or without considering historical deletions. When considering historical deletions, the search time cost of ROSE is also affected by the number of historical search queries. Hence, we evaluate ROSE's search performance when simultaneously considering historical deletions and search queries. In contrast, the historical search queries do not affect the search performance of Fides, HORUS, and IM-DSSE<sub>I+II</sub>. In addition, the two processes, namely ROSE tests whether a add ciphertext is deleted during

TABLE II
UPDATE TIME COST ( $\mu s$ ) Comparisons

	ROSE	Fides	HORUS	IM-DSSE <sub>I+II</sub>
op = add	1,338.73	3,090.51	87,503	17.61
op = del	2,087.81	3,092.13	114,692	16.20

the search query (Step 15 in Algorithm 3, Section VI) and updates the delete tokens (Steps 38 to 40 in Algorithm 3, Section VI), can be parallelized to gain higher efficiency during a search when considering historical deletions and search queries. Hence, we finally evaluate ROSE by parallelizing the above two processes.

System Environment: We develop ROSE in C++ and apply OpenSSL [36] and Relic Toolkit [37] to implement its cryptographic primitives. OpenSSL provides hash functions SHA-2 family and SHA-3 family and symmetric encryption AES-128. Relic Toolkit provides the NIST P-256 elliptic curve to implement key-updatable PRF. We code Fides in C++ and apply OpenSSL to implement its cryptographic primitives as well. We implement the RSA-based trapdoor permutation used in Fides with GMP Library [38]. We adjust the parameters of HORUS's opencode for achieving the same security level as ROSE and Fides do. Moreover, we slightly modify the opencode to fix the bug in the position re-randomization process of OMAP finalization. During the implementations of these schemes, all data are stored in the memory. When evaluating IM-DSSE<sub>I+II</sub>, we slightly revise the C++ code released by Hoang et al. to provide fair comparisons. Those revisions mainly include (1) we use the memory to store the encrypted database and the client-side states, (2) we use in-process variables instead of sockets to convey the communications between the client and the server, (3) we enable the IM-DSSE<sub>I+II</sub> code to support incrementally adding or deleting a single pair of keyword and file-identifier, and (4) we enable the client to convert the searched pseudorandom numbers to file identifiers after the search by maintaining client-side state table. Note that the last point enables IM-DSSE<sub>I+II</sub> to run in the setting where the file storage service is independent of the encrypted database. Our experiments are performed on a workstation with an Intel Xeon Silver 4216, 64 GB RAM, and Ubuntu Server 20.04. All figures in this section are drawn with Matplotlib [39].

Dataset: Since both Fides and HORUS take too much time costs when running them over a large-scale dataset, we simulate a moderate-scale dataset. This dataset is a fair one and similar as the dataset used by the work [11] to test HORUS. It contains 180,000 entries, where the result size of a search query is between 5,000 and 40,000. Each entry consists of a two-bytes keyword and a four-bytes file identifier.

Update Performance Comparisons: We compare the time costs of issuing a single add and a delete query of ROSE, Fides, HORUS, and IM-DSSE<sub>I+II</sub>. For each scheme, we generate add queries to all 180,000 entries at first, then generate delete queries to delete all these entries, and test the average time costs to issue a add query and a delete query, respectively. The average update time cost includes the client-side and server-side costs. Table II shows that

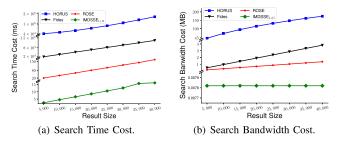


Fig. 3. Search performance comparisons without the historical deletion.

ROSE takes on average 1,338.73 and 2,087.81 microseconds to add and delete an entry, respectively, about two orders of magnitude more than those of IM-DSSE<sub>I+II</sub>. Although, the update performance of ROSE (no more than 2.1 milliseconds) is practical in real applications. Compared with Fides, ROSE is approximately  $2.31\times$  and  $1.48\times$  faster when adding and deleting an entry, respectively. Compared with HORUS, ROSE is clearly too much faster.

Search Performance Comparisons Without the Historical Deletion: This part compares the time and bandwidth costs when searching keywords with ROSE, Fides, HORUS, and IM-DSSE<sub>I+II</sub>. Note that the experiment here assumes that there is no delete query before searching keywords. The search time cost includes the client-side and server-side time costs. The bandwidth cost means the transferred data size between the client and the server. Figure 3 shows that ROSE outperforms Fides and HORUS but is less efficient than IM-DSSE<sub>I+II</sub>. Specifically, ROSE takes about 4.04 microseconds to find one matching ciphertext on average. It is approximately 814× and 8,560× faster than Fides and HORUS, respectively. Compared to Fides and HORUS, ROSE achieves a significant advantage in bandwidth cost. Suppose the search results contain 40,000 file identifiers. The bandwidth cost of ROSE is approximately 1.37 MB, which saves approximate 64% and 99.21% bandwidth compared with Fides and HORUS, respectively.ROSE costs about more 3.61 microseconds than IM-DSSE<sub>I+II</sub> to find one matching ciphertext on average. In terms of bandwidth cost, IM-DSSE<sub>I+II</sub> is more efficient than the rest, and its bandwidth does not change along with the result size. This is because the size of its encrypted index is fixed during the setup phase.

To clearly show that ROSE is more friendly to the client, we explicitly list the client time costs of ROSE, Fides, and IM-DSSE $_{I+II}$  during a search. We omit HORUS here, since the HORUS client undertakes almost all the computational tasks during a search. Hence, the client time cost of HORUS is much more than that of ROSE, Fides, and IM-DSSE $_{I+II}$ . Figure 4 shows that ROSE is at least 5,713× faster than Fides and gains a little advantage (about 1.3× faster on average) against IM-DSSE $_{I+II}$ . For example, when the search result size is 40,000, the ROSE client uses approximately 11.91 milliseconds, while the Fides and the IM-DSSE $_{I+II}$  client take approximately 2.19 minutes and 16.12 milliseconds, respectively.

Search Performance Comparisons With Historical Deletions: In this part, we test how the historical delete and

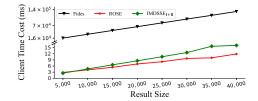


Fig. 4. Client time cost comparisons during a search without the historical deletion

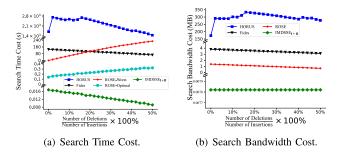


Fig. 5. Search performance comparisons with historical deletions but without the historical search.

search queries affect the performance of a freshly issued search query. Hence, before testing the search performance, we suppose two cases: (1) the client has issued some delete queries but no search query; (2) the client has issued not only some delete queries but also some search queries, where all search queries were issued ahead of the first delete query. We compare the search performance of ROSE, Fides, HORUS, and IM-DSSE $_{I+II}$  in the first case. In the second case, we only evaluate the search performance of ROSE, since the historical search queries do not affect the search performance of Fides, HORUS, and IM-DSSE $_{I+II}$ .

We select the most frequently used keyword whose search result size is 40,000 as the dataset used in the above two cases. Specifically, in the first case, for the selected keyword, we issue 40,000 add queries, then issue a variable number of delete queries, and finally test the search performance of the keyword over these historical ciphertexts. Note that all add and delete queries randomly chooses their corresponding file identifiers, and each file identifier chosen by a delete query must be also chosen by a previous add query. The second case has the same setting as the first case, except that to simulate the historical searches, we additionally add some ciphertexts with operation op = srch, and these ciphertexts appear after the 40,000 add queries but before all delete queries.

Figure 5 presents the experimental results in the first case. In this part, IM-DSSE $_{I+II}$  keeps its significant advantage in both terms of bandwidth cost and time cost against ROSE, Fides, and HORUS. In terms of bandwidth cost, ROSE saves at least 64% and 99.21% overhead compared with Fides and HORUS, respectively, since ROSE avoids re-encrypting and re-uploading ciphertexts to the server during a search. In terms of time cost (including the server and client's time costs), ROSE always outperforms HORUS and conditionally

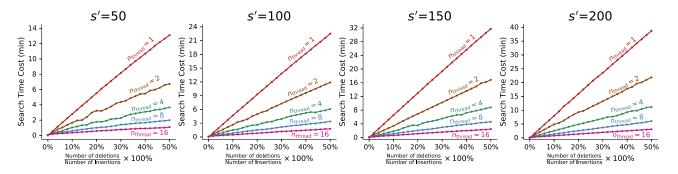


Fig. 6. Search time cost of ROSE with historical deletions and searches using different number of threads. symbol s' denotes the number of ciphertexts with op = srch before the first delete query. Symbol  $n_{thread}$  means the number of threads.

outperforms Fides when the ratio of historical delete queries to historical add queries is less than about 20% (shown as ROSE-Worst in Figure 5(a)). For example, when the ratio is 10%, ROSE takes approximately 56.21 seconds to complete the search, which is about  $2.09 \times$  faster than Fides. When the ratio is greater than 20%, ROSE takes more time cost than Fides. However, the first case we defined, indeed, is also the worst-case for ROSE, since all historical delete queries appear after all historical add queries, which causes ROSE must test each added ciphertexts with most of delete tokens. In contrast, in the optimal case that each added ciphertexts just be tested with one delete token at most, ROSE always outperforms Fides greatly (shown as ROSE-Optimal 5(a)). For example, given Number of Deletions Number of Insertions 100% = 50%, the optimal search performance is approximately 0.32 seconds, about  $704 \times$  less than the worst one (say, 3.80 minutes). Hence, in real applications, the search performance of ROSE should be between the worst one and the optimal one.

In the second case, given the different number of historical deletions and searches, Figure 6 shows the parallel search performance of ROSE. The numerical results demonstrate that ROSE has the powerful capability to parallelize a search process. For example, given 16 threads, Number of Deletions  $\times$  100% = 50%, and the historical search number s' = 50 (respectively 100, 150, and 200), ROSE takes approximately 1.09 minutes (respectively 1.77, 2.48, and 3.08 minutes). Compared with the time cost of a single thread, the search performance improves about 12.05 times (respectively 12.73, 12.78, and 12.57 times).

According to the above extreme experiments, the historical delete and search queries will affect the search performance of ROSE. However, ROSE is still efficient in practice due to the following reasons. First, all delete queries just affect the search performance once. It means that such negative effect will be significant if the client issues too many delete queries between two successive search queries. However, it is hard to find such kind of scenario in the real application. Secondly, ROSE allows the server to combine the ciphertexts with operation op = srch if they are adjacent. This feature will reduce the negative effect of historical search queries to the search performance. We omit this advantage in the above experiments, since it is hard to find a real dataset including

the client' search history. Thirdly, ROSE has the powerful capability to parallelize a search process. Hence, ROSE can sufficiently use the abundant computing power of the server, like Cloud.

#### VIII. CONCLUSION AND FUTURE WORKS

To the best of our knowledge, this work is for the first time to study the correctness, security and performance of DSSE under the assumption that the client can issue the irrational update queries. Under this assumption, we find that (1) most prior DSSE schemes cannot guarantee their claimed correctness or security, and (2) while a few prior DSSE schemes seem robust, they do not formally study the robustness, and they either entail very high computation and communication costs or obtain the weak security. To tackle all the above problems, we formally define the robustness of DSSE and propose ROSE, the first robust DSSE scheme with forward and backward security and practical performance. To construct ROSE, we introduce for the first time key-updatable PRF and then achieve ROSE. Finally, we experimentally compare ROSE with two state-of-the-art DSSE schemes. It shows that ROSE is very efficient in both updating data and performing keyword searches.

Security and efficiency are two important indicators for evaluating DSSE schemes. In terms of efficiency, we believe that an intuitive future work is to achieve higher performance without decreasing security. That expands robust DSSE's application scope to capture more high timeliness requirement scenarios. Besides, supporting smaller client storage will suit practical emerging ICT scenarios (e.g., the internet of things). In terms of security, we state that extending this work to support higher security with minimum efficiency degradation may be meaningful. That may enable DSSE to explore in those applications which care more about data confidentiality than performance. There is a tradeoff between security and efficiency. An open and challenging problem is to design securer and more efficient robust DSSE with properties of the highest backward security level, the smallest client storage, and more.

### APPENDIX SECURITY PROOF OF ROSE

To prove the forward and general Type-III backward security, we construct a simulator S, which takes leakage functions

#### **Algorithm 4** The Construction of S in the Ideal Game of ROSE

```
22: for each (\mathcal{U}^{add}, \mathcal{U}^{del}) \in \text{exDelHist}(w) and \mathcal{U} \in \text{exTimeDB}(w) do 23: u_{min} \leftarrow \text{Min}(\mathcal{U}^{add} \cup \mathcal{U}^{del}) or \text{Min}(\mathcal{U})
1: Initialize EDB \leftarrow \emptyset, four empty maps CipherList, UList, PList and TList,
    and a global variable u \leftarrow 0
                                                                                                                    24:
                                                                                                                            if PList[u_{min}] = (NULL, NULL) then
2: CipherList[0] \leftarrow (0^{\lambda}, \text{NULL}, \text{NULL}, \text{NULL}) and TList[0] \leftarrow 0^{\lambda}
                                                                                                                    25:
                                                                                                                              PList[u_{min}] \leftarrow (P_{add}, P_{del}) \stackrel{\$}{\leftarrow} \mathcal{Y}_{P} \times \mathcal{Y}_{P}
3: Send EDB to the server
                                                                                                                    26:
Update(\mathcal{L}^{Updt}(op, (w, id)))
                                                                                                                    27:
                                                                                                                             (P_{add}, P_{del}) \leftarrow PList[u_{min}]
                                  b the timestamp of the current update operation
1: u \leftarrow u + 1
                                                                                                                    28:
                                                                                                                            end if
                                                                                                                            Orderly extract all key-update tokens \{\Delta_1, \cdots, \Delta_m\} with their
2: (L, R, D, C) \stackrel{\$}{\leftarrow} \{0, 1\}^{\lambda} \times \{0, 1\}^{\lambda} \times \{0, 1\}^{2\lambda + \lambda' + 2} \times C_{SE}
                                                                                                                    29:
                                                                                                                           timestamps between u_{min} and u from UList for all v \in \mathcal{U}^{add} \cup \mathcal{U}^{del} or \mathcal{U}, PList[v] \neq (NULL, NULL), TList[v] \neq
3: CipherList[u] \leftarrow (L, R, D, C)
4: Send ciphertext (L, R, D, C) to the server
                                                                                                                           NULL, and u_{min} < v < u do
Search(\mathcal{L}^{Srch}(w))
                                                                                                                    31:
                                                                                                                               if m \neq 0 then
1: u \leftarrow u + 1
                                          > the timestamp of the current search query
                                                                                                                                 \underset{len}{\text{PList}[v]} \leftarrow (P_{add}^{\prod_{i=1}^{m} \Delta_{i}^{-1}}, P_{del}^{\prod_{i=1}^{m} \Delta_{i}^{-1}})
2: Extract the timestamp u_0 of the last search query from sp(w) where
                                                                                                                    32:
                                                                                                                    33.
    u_0 = 0 if sp(w) = \emptyset
3: Extract all timestamps \{u_1, \dots, u_n\} between u_0 and u from both
                                                                                                                    34:
                                                                                                                                 PList[v] \leftarrow (P_{add}, P_{del})
                                                                                                                    35:
    exTimeDB(w) and exDelHist(w) and exclude the repeated timestamps,
    where u_i < u_j if i < j
                                                                                                                               Set TList[v] \leftarrow T_n \stackrel{\$}{\leftarrow} \mathcal{Y}_F
                                                                                                                    36:
4: if n = 0 and u_0 = 0 then
                                                                                                                    37:
                                                                                                                            end for
5: return \perp
                                                                                                                    38: end for
6: end if
                                                                                                                    39: (L_{u_n}, R_{u_n}, D_{u_n}, C_{u_n}) \leftarrow \text{CipherList}[u_n] \text{ and } T_{u_n} \leftarrow \text{TList}[u_n]
7: Extract the maximum timestamp u_{max} less than u_0 from exTimeDB(w),
                                                                                                                    40: for i = n to 1 do
    where u_{max} = 0 if u_0 = 0 or no such kind of u_{max} exists
                                                                                                                            (P_{add}, P_{del}) \leftarrow \text{PList}[u_i]
                                                                                                                    41:
                                                                                                                            (L_{u_{i-1}}, R_{u_{i-1}}, D_{u_{i-1}}, C_{u_{i-1}}) \leftarrow \text{CipherList}[u_{i-1}]
T_{u_{i-1}} \leftarrow \text{TList}[u_{i-1}]
8: if n = 0 and u_{max} = 0 then
                                                                                                                    42:
9: return ⊥
                                                                                                                    43:
10: end if
                                                                                                                    44:
                                                                                                                            if u_i is corresponding to an add query then
11: (L_u, R_u, D_u, C_u) \stackrel{\$}{\leftarrow} \{0, 1\}^{\lambda} \times \{0, 1\}^{\lambda} \times \{0, 1\}^{2\lambda + \lambda' + 2} \times C_{SE}
                                                                                                                              Program G s.t. G(P_{add}, R_{u_i}) = L_{u_i}
                                                                                                                    45:
12: CipherList[u] \leftarrow (L_u, R_u, D_u, C_u)
                                                                                                                    46:
                                                                                                                              Program H s.t. H(T_{u_i}, R_{u_i}) = D_{u_i} \oplus (add||0^{\lambda}||L_{u_{i-1}}||T_{u_{i-1}}|)
13: P_u \stackrel{\$}{\leftarrow} \mathcal{Y}_P and TList[u] \leftarrow T_u \stackrel{\$}{\leftarrow} \mathcal{Y}_F
                                                                                                                    47:
                                                                                                                               Program G s.t. G(P_{del}, R_{u_i}) = L_{u_i}
Program H s.t. H(T_{u_i}, R_{u_i}) = D_{u_i} \oplus (del||P_{add}||L_{u_{i-1}}||T_{u_{i-1}})
                                                                                                                    48:
14: UList[u] \leftarrow \Delta_u \stackrel{\$}{\leftarrow} \mathcal{K}_P
                                                                                                                    49:
15: Program G s.t. G(P_u, R_u) = L_u
                                                                                                                    50:
                                                                                                                           end if
16: if n = 0 and u_{max} \neq 0 then
                                                                                                                    51: end for
       (L_{u_0}, R_{u_0}, D_{u_0}, C_{u_0}) \leftarrow \text{CipherList}[u_0] \text{ and } T_{u_0} \leftarrow \text{TList}[u_0]
                                                                                                                    52: Program H s.t. H(T_u, R_u) = D_u \oplus (srch||\Delta_u||L_{u_n}||T_{u_n})
        Program H s.t. H(T_u, R_u) = D_u \oplus (srch||\Delta_u||L_{u_0}||T_{u_0})
                                                                                                                    53: Send search trapdoor (L_{u_n}, T_{u_n}) and ciphertext (L_u, R_u, D_u, C_u) to the
       Send search trapdoor (L_{u_0}, T_{u_0}) and ciphertext (L_u, R_u, D_u, C_u) to the
                                                                                                                    54: return all file identifiers in exTimeDB(w) after receiving the response
       return all file identifiers in exTimeDB(w) after receiving the response
20:
                                                                                                                         from the server
```

 $\mathcal{L}^{Stp}(\lambda) = \lambda$ ,  $\mathcal{L}^{Updt}(op, w, id) = \emptyset$ , and  $\mathcal{L}^{Srch}(w) = \{sp(w), exTimeDB(w), exDelHist(w)\}$  as inputs to simulate algorithm ROSE.Setup and protocols ROSE.Update and ROSE.Search respectively, and demonstrate that the simulated ROSE is indistinguishable from the real ROSE under the adaptive attacks. Algorithm 4 describes the simulator  $\mathcal{S}$ . Specifically, the simulator  $\mathcal{S}$  consists of the following three phases.

from the server

21: end if

Setup Phase: In this phase, simulator  $\mathcal{S}$  takes leakage function  $\mathcal{L}^{Stp}(\lambda) = \lambda$  as input, initializes an empty database EDB, four empty maps CipherList, UList, PList and TList, and a variable u of the timestamp, and sends EDB to the server. Taking a timestamp as input, maps CipherList and TList return a ciphertext and the corresponding decryption token, respectively, both of which are generated by the update or search query at the input timestamp; map UList returns a key-update token that is generated by the search query at the input timestamp; map PList returns a pair of PRF P values, where one of them is used by the update query at the input timestamp to generate a ciphertext. It is clear that  $\mathcal{S}.\text{Setup}(\mathcal{L}^{Stp}(\lambda))$  is indistinguishable from the real algorithm ROSE. Setup, since the simulated database EDB is the same as a real database.

Update Phase: When adversary  $\mathcal{A}$  issues an update query (op, w, id), simulator  $\mathcal{S}$  takes leakage function  $\mathcal{L}^{Updt}(op, w, id)$  as input, computes the timestamp u of this update query, randomly picks a ciphertext (L, R, D, C), inserts this ciphertext into CipherList[u], and sends this ciphertext to the server. According to randomness of oracles H and G and the security of symmetric encryption, the simulated ciphertext (L, R, D, C) has the same distribution as the real ciphertext that is generated by protocol ROSE.Update in the RO model. Hence,  $\mathcal{S}$ .Update $(\mathcal{L}^{Updt}(op, w, id))$  is indistinguishable from the real protocol ROSE.Update.

Search Phase: When adversary A issues a search query w, simulator S takes leakage function  $\mathcal{L}^{Srch}(w)$  as input and performs the following steps:

- 1) S computes the timestamp u of this search query and extracts the timestamp  $u_0$  of the last search query of w if w has been searched before; otherwise, it sets  $u_0 = 0$  and extracts the timestamps of all update queries of w that occurred after timestamp  $u_0$  (lines 1-3);
- 2) If both n = 0 and  $u_0 = 0$  hold, it means that adversary A never issued an update query of w; then, S returns  $\bot$  (lines 4-6);

- 3) S extracts the timestamp  $u_{max}$  of the last add query of w having  $u_{max} < u_0$  and sets  $u_{max} = 0$  if  $u_0 = 0$  or there is no such kind of add query (line 7); if both n = 0 and  $u_{max} = 0$  hold, it means that either adversary A never issued an add query of w before timestamp  $u_0$  or all added ciphertexts of w before timestamp  $u_0$  have been removed by the adversary A's delete queries; then, S returns  $\bot$  (lines 8-10);
- 4) S randomly picks a ciphertext  $(L_u, R_u, D_u, C_u)$ , inserts this ciphertext into CipherList[u], randomly picks  $P_u$  from  $\mathcal{Y}_P$ , a decryption token  $T_u$  from  $\mathcal{Y}_F$  and a key-update token  $\Delta_u$  from  $\mathcal{K}_P$ , inserts  $T_u$  and  $\Delta_u$  into TList[u] and UList[u] respectively, and programs oracle G such that  $L_u$  can be correctly generated by taking  $P_u$  and  $R_u$  as inputs (lines11-15);
- 5) If both n = 0 and  $u_{max} \neq 0$  hold, it means that  $\mathcal A$  does not issue any update query of w after the last search query (or timestamp  $u_0$ ), and there are still some matching ciphertexts that were added before the last search query (or timestamp  $u_0$ ); then, S retrieves the ciphertext  $(L_{u_0}, R_{u_0}, D_{u_0}, C_{u_0})$ from CipherList $[u_0]$  and the corresponding decryption token  $T_{u_0}$  from TList[ $u_0$ ], programs oracle H such that ciphertext  $(L_u, R_u, D_u, C_u)$  contains the correct information and constructs a hidden chain relationship with ciphertext  $(L_{u_0}, R_{u_o}, D_{u_0}, C_{u_0})$ , sends search trapdoor  $(L_{u_0}, T_{u_0})$  and ciphertext  $(L_u, R_u, D_u, C_u)$  to the server, and returns all file identifiers in exTimeDB(w) after receiving the response from the server (lines 16-21); (Note that if  $n \neq 0$  holds, it means that A issued some update queries of w after the last search query (or timestamp  $u_0$ ); then, S will compute some values for the ciphertexts generated by those update queries and program oracles G and H such that these ciphertexts can be correctly found or removed by the server when receiving a correct search trapdoor.)
- 6) For each  $(\mathcal{U}^{add}, \mathcal{U}^{del}) \in \text{exDelHist}(w)$  and  $\mathcal{U} \in \text{exTimeDB}(w)$ ,  $\mathcal{S}$  performs the following steps (lines 22-38):
  - a) Extracts the minimum value  $u_{min}$  from  $\mathcal{U}^{add} \cup \mathcal{U}^{del}$  or  $\mathcal{U}$  (line 23);
  - b) Randomly picks  $(P_{add}, P_{del})$  from  $\mathcal{Y}_P \times \mathcal{Y}_P$  if  $PList[u_{min}]$  is empty; otherwise, retrieve  $(P_{add}, P_{del})$  from  $PList[u_{min}]$  (lines 24-28);
  - c) Extracts all key-update tokens with timestamps between  $u_{min}$  and u (line 29);
  - d) Finally, for all  $v \in \mathcal{U}^{add} \cup \mathcal{U}^{del}$  or  $\mathcal{U}$ , PList[v]  $\neq$  (NULL, NULL), TList[v]  $\neq$  NULL, and  $u_{min} < v < u$ , computes a pair of PRF P values according to the above extracted key-update tokens, picks a random delete token, and inserts them into the corresponding maps (lines 31-38);
- 7) For the ciphertexts stored in CipherList with timestamps  $\{u_1, \ldots, u_n\}$ , programs oracles G and H according to their operation types and precomputed values stored in maps PList and TList, such that these ciphertexts can be

- correctly found or removed by the server in the future (lines 39-51);
- 8) Programs oracle H such that the ciphertext  $(L_u, R_u, D_u, C_u)$  can be connected with ciphertext CipherList $[u_n]$  by a hidden chain relationship, sends search trapdoor  $(L_{u_n}, T_{u_n})$  and ciphertext  $(L_u, R_u, D_u, C_u)$  to the server, and returns all file identifiers in exTimeDB(w) after receiving the response from the server (lines 52-54).

In the above steps, upon receiving the search trapdoor from simulator S, the server implements the real search procedure to find all matching ciphertexts, except that the hash functions G and H work as two random oracles. Moreover, the search results are correct since oracles G and H have been programmed well. Hence,  $S.Search(\mathcal{L}^{Srch}(w))$  is indistinguishable from the real protocol ROSE. Search in the RO model.

To summarize, the above simulator S takes leakage functions  $\mathcal{L}^{Stp}(\lambda) = \lambda$ ,  $\mathcal{L}^{Updt}(op, w, id) = \emptyset$ , and  $\mathcal{L}^{Srch}(w) = \{sp(w), exTimeDB(w), exDelHist(w)\}$  as inputs and simulates an ideal game of ROSE that is indistinguishable from an real game of ROSE under the adaptive attacks in the RO model.

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