# More Efficient Privacy Amplification with Less Random Seeds via Dual Universal Hash Function

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#### Abstract

We explicitly construct random hash functions for privacy amplification (extractors) that require smaller random seed lengths than the previous literature, and still allow efficient implementations with complexity  $O(n \log n)$  for input length n. The key idea is the concept of *dual* universal<sub>2</sub> hash function introduced recently. We also use a new method for constructing extractors by concatenating  $\delta$ -almost dual universal<sub>2</sub> hash functions with other extractors.

Besides minimizing seed lengths, we also introduce methods that allow one to use non-uniform random seeds for extractors. These methods can be applied to a wide class of extractors, including dual universal<sub>2</sub> hash function, as well as to conventional universal<sub>2</sub> hash functions. The technical details are in arXiv:1311.5322 (2013).

### **Index Terms**

privacy amplification, universal hash function, minimum entropy, quantum cryptography

*Background:* Even when a random source at hand is partially leaked to an eavesdropper, one can amplify its secrecy by applying a random hash function. This process is called the *privacy amplification*. In this process, the amplification of secrecy is realized with the help of another auxiliary random source, which is public and is called a *random seed*. The random hash functions used for this purpose are often called *extractors*. There is also a similar but distinct process called two-sources-extractors [9], where the auxiliary random source is not public. The most typical random hash function for these purposes is the universal<sub>2</sub> hash function [5], [45]. There are many security theorems which assumes the use of the universal<sub>2</sub> hash function. In particular, the leftover hashing lemma [4], [14] has several extensions and various applications in the classical and quantum setting [30], [39], [17], [18], [24], [16], [19], [20], [27].

The universal<sub>2</sub> hash function has now become indispensable for privacy amplification of quantum key distribution (QKD) [3], [30], [40], [23], [22]. The most widely used universal<sub>2</sub> hash function for this purpose is the one that uses the (modified) Toeplitz matrix, mainly because it can be implemented efficiently with complexity  $O(n \log n)$  for input length n (see, e.g., [32], [43]). Here we note that the usual notion of efficiency (i.e., the algorithm finishes in polynomial time) is not sufficient, but a stricter criterion of the complexity being  $O(n \log n)$  is desirable for QKD. This is because, for typical QKD systems, the finite size effect requires the input length n to be  $n \ge 10^6$  [40], [23], [22], and thus algorithms that are efficient in the usual sense, e.g.,  $O(n^2)$ , are useless.

Another important criterion for practical hash functions is how much randomness is required for the random seed. This can be measured in two way, i.e., by the required length of a uniformly random seed, and also by the entropy of the seed. While the importance of minimizing the former is obvious, the latter is also equally important, since it is quite difficult to prepare a perfect random number generator for real cryptographic systems.

The main goal of this paper is to construct explicitly random hash functions for privacy amplification that require smaller random seed lengths than in the previous literature, and still allow efficient implementations with complexity  $O(n \log n)$  for input length n. For achieving this goal, we use the concept of  $\delta$ -almost *dual* universal<sub>2</sub> hash function. We also use a new method for constructing extractors by concatenating  $\delta$ -almost *dual* universal<sub>2</sub> hash functions and conventional extractors.

In addition to minimizing the seed lengths, we also present general methods that enable the use of non-uniform random seeds. These methods are general in the sense that they can be applied a wide class of extractors, including dual universal<sub>2</sub> hash function, as well as to conventional universal<sub>2</sub> hash functions. Here the minimum entropy is used as a measure that describes the randomness of the non-uniform random seed.

The concept of the  $\delta$ -almost *dual* universal<sub>2</sub> hash function, as well as the extended leftover hashing lemma for it were proposed in Refs. [11], [43]. In [43], we also gave the explicit inclusion relation with the (conventional) universal<sub>2</sub> hash function; e.g., if an arbitrary linear and surjective hash function is universal<sub>2</sub> (with  $\delta = 1$ ), then it is automatically  $\delta$ -almost dual universal<sub>2</sub>. In this sense, the  $\delta$ -almost dual universal<sub>2</sub> function can be regarded as an extension of the conventional universal<sub>2</sub> function. Several classical and quantum security evaluations have been obtained based on this new class of hash functions [16], [19]. In particular, finite-length security analysis has been done with this class [23], [22].

#### Our proposed hash function:

Based on properties of conventional and dual universal<sub>2</sub> hash functions, the corresponding security criteria, and the corresponding leftover hashing lemmas. we propose a new method to construct random hash functions by concatenating given random hash functions. While a method is already known for concatenating two (conventional)  $\delta$ -almost universal<sub>2</sub> hash functions [37], we are here rather interested in other combinations including  $\delta$ -almost dual universal<sub>2</sub> hash functions. Then by exploiting these results, we present secure hash functions that require less random seed length h than previous methods, and can be implemented with complexity  $O(n \log n)$ . That is, we explicitly construct a set of extractors whose seed lengths are min(m, n - m) asymptotically, where n is the input length and m the output length. Recall that many of existing random hash functions, such as the one using the (modified) Toeplitz matrix (see the attachment) and the ones proposed recently [41], require seed length n or 2masymptotically (see Table I). Here, we improve them by giving four types of hash functions explicitly. Namely, we first present  $f_{F1,R}$  suitable for  $m/n \ge 1/2$ , and  $f_{F2,R}$  suitable for  $m/n \le 1/2$ , both requiring seed length n - m. Then by concatenating  $f_{F2,R}$  and its dual  $f_{F2,R}^{\perp}$ , we construct  $f_{F3,R}$  and  $f_{F4,R}$  which require seed length m asymptotically.

In order to demonstrate that hash functions  $f_{F1,R}, \ldots, f_{F4,R}$  can indeed be implemented efficiently with complexity  $O(n \log n)$ , we also give a set of explicit algorithms in the attachment. This algorithm set uses multiplication algorithm for finite field  $\mathbb{F}_{2^k}$  developed, e.g., in Refs. [35], [26], and works for parameter k satisfying certain conditions related to Artin's conjecture [36, Chap. 21]. We numerically check the existence of so many such integers up to  $k \simeq 10^{50}$ , and thus the algorithm can be applied to most practical cases.

| computational                    | length of random seeds $h$ & min entropy $t$                                      |   |
|----------------------------------|---|---|
| complexity                       | when the seeds are uniformly random   |   |
|                                  | $\epsilon$ const.   | $\epsilon = e^{-\beta n^{\gamma}}$  |
| $O(n \log n)$                    | $t = \alpha n + O(1)$   | $t = \alpha n + 2\beta n^{\gamma} + O(1)$   |
| $O(n \log n)$                    | $h = (1 - \alpha)n$   | $h = (1 - \alpha)n$   |
| $O(n \log n)$                    | $t = \alpha n + O(1)$   | $t = \alpha n + 2\beta n^{\gamma} + O(1)$   |
| $O(n \log n)$                    | $h = \alpha n + O(1)$   | $h = \alpha n + 4\beta n^{\gamma} + O(1)$   |
| $O(n \log n)$                    | $t = \alpha n + O(1)$   | $t = \alpha n + 4\beta n^{\gamma} + O(1)$   |
| $f_{\mathrm{F4},R}$ $O(n\log n)$ | $h = \alpha n + O(1)$   | $h = \alpha n + 4\beta n^{\gamma} + O(1)$   |
| $O(m \log m)$                    | $t = \alpha n + O(1)$   | $t = \alpha n + 2\beta n^{\gamma} + O(1)$   |
| $O(n \log n)$                    | h = n   | h = n   |
| [6] $\operatorname{poly}(n)$     | $t = \alpha n + O(1)$   | $t = \alpha n + 4\beta n^{\gamma} + O(1)$   |
|                                  | $h = O(\log^3 n)$   | $h = O(n^{2\gamma} \log^3 n)$   |
| $O(n \log n)^*$                  | $t = \alpha n + O(1)$   | $t = \alpha n + 4\beta n^{\gamma} + O(1)$   |
| TSSR paper [41] $O(n \log n)^*$  | $h = 2\alpha n + O(1)$  | $h = 2\alpha n + 4\beta n^{\gamma} + O(1)$  |
| $\operatorname{poly}(n)$         | $t = \alpha n + O(1)$   | $t = \alpha n + 4\beta n^{\gamma} + O(1)$   |
|                                  | $h = 4\alpha n + o(n)$  | $h = 4\alpha n + 4\beta n^{\gamma} + o(n)$  |
| noly(n)                          | $t = \alpha n + O(1)$   | $t = \alpha n + 2\beta n^{\gamma} + O(1)$   |
| pory(n)                          | h = n   | h = n   |
|                                  | $O(n \log n)$ $O(n \log n)$ $O(n \log n)$ $O(n \log n)$ $poly(n)$ $O(n \log n)^*$ | $\begin{array}{c} \begin{array}{c} \mbox{complexity} & \hline \mbox{when the seed} \\ \hline e \ const. \\ \hline \\ O(n \log n) & \hline h = (1 - \alpha)n \\ \hline h = (1 - \alpha)n \\ \hline \\ O(n \log n) & \hline h = \alpha n + O(1) \\ \hline h = \alpha n + O(1) \\ \hline \\ O(n \log n) & \hline \\ t = \alpha n + O(1) \\ \hline \\ O(n \log n) & \hline \\ t = \alpha n + O(1) \\ \hline \\ O(n \log n) & \hline \\ t = \alpha n + O(1) \\ \hline \\ h = n \\ \hline \\ poly(n) & \hline \\ t = \alpha n + O(1) \\ \hline \\ h = 2\alpha n + O(1) \\ \hline \\ h = 2\alpha n + O(1) \\ \hline \\ h = 2\alpha n + O(1) \\ \hline \\ h = 4\alpha n + O(1) \\ \hline \\ h = 4\alpha n + O(1) \\ \hline \\ poly(n) & \hline \\ t = \alpha n + O(1) \\ \hline \\ poly(n) & \hline \\ t = \alpha n + O(1) \\ \hline \\ poly(n) & \hline \\ t = \alpha n + O(1) \\ \hline \\ \end{array}$ |

## TABLE I COMPARISON OF RANDOM HASH FUNCTIONS

 $f_{F1,R}$ ,  $f_{F2,R}$ ,  $f_{F3,R}$ , and  $f_{F4,R}$  are hash functions proposed in this paper. Parameter n is the length of the input to the hash function, and  $\epsilon$  is the security level ( $L_1$  distinguishability) of the final key. Parameters  $h, t, \alpha, \gamma$  are defined in order to compare the six schemes for a case where the random seeds are uniformly random: t is the required minimum entropy for the input to a hash function,  $\alpha n$  the output length, h the required length of random seeds, and  $\gamma$  a constant in (0,1]. We mainly choose  $\gamma > 1/2$ .  $f_{F3,R}$  is a hash function for the classical case.  $f_{F4,R}$  is its quantum modification. \*The paper [41] did not evaluate the computational complexity. However, when we employ our construction of finite filed given in the attachment, we find that the computational complexity of the random hash function is  $O(n \log n)$ .

*Comparison with existing hash functions:* As to comparisons with the existing methods: Trevisan [42] proposed another efficient random hash function, whose performance was studied in the quantum case by [6]. The paper [41], [28] also proposed other random hash functions. As is also summarized in Table I, the relations with our hash function are as follows.

- 1) Our random hash functions,  $f_{F1,R}, \ldots, f_{F4,R}$  and  $g_{n,l,m}$ , and those of Ref. [41] have an efficient algorithm with complexity  $O(n \log n)$  for input length n. On the other hand, Ref. [8] only considers algorithms typically with complexity  $O(n^3)$  (c.f. the attachment), and Ref. [28] with poly(n). For Trevisan's random extractor, a pre-computation is required and the complexity of the actual calculation is only shown to be polynomial in n. Although our random hash functions require a search for an integer k mentioned above, it should be noted that k of a desired size up to  $k \simeq 10^{50}$  can be found in less than a second, and thus our random hash functions practically have no pre-computation.
- 2) For the case where the uniform random seeds are uniformly random, we also compare the required length h of random seeds, and the required minimum entropy t of the input to the hash function, as is summarized in Table I. Here we denote the input and output lengths by n and m, their ratio by  $\alpha := m/n$ , and the security level ( $L_1$  distinguishability) of the final key by  $\epsilon$ .
  - When both  $\alpha$  and  $\epsilon$  are constant, all random hash functions have almost the same required minimum input entropy t. While Trevisan's random extractor [42], [6] has the minimum value for the required length h of random seeds, the computational complexity is O(poly(n)) and also requires a pre-computation. Our hash function  $f_{F1,R}$ ,  $f_{F2,R}$  or  $f_{F3,R}$ ,  $f_{F4,R}$  realizes the next minimum value dependently of  $\alpha$ , and can be implemented efficiently with  $O(n \log n)$  and with virtually no pre-computation.
  - Next, we consider the case where  $\alpha$  is constant and  $\epsilon$  is exponentially small with respect to n; that is, we assume that  $\epsilon$  behaves as  $e^{-\beta n^{\gamma}}$  with  $\gamma > \frac{1}{2}$ .<sup>1</sup> In this case our random hash function  $f_{F1,R}$ ,  $f_{F2,R}$  or  $f_{F3,R}$ ,  $f_{F4,R}$  achieves the minimum values of the required length h of random seeds and the required minimum input entropy t at least in the first order n, dependently of  $\alpha$ .

Conclusion: We have proposed new random hash functions  $f_{F1,R}, \ldots, f_{F4,R}$  using a finite field with a large size, which are designed based on the concepts of the  $\delta$ -almost dual universal<sub>2</sub> hash function. The proposed method realizes the two advantages simultaneously. First, it requires the smallest length of random seeds. Second, there exist efficient algorithms for them achieving the calculation complexity of the smallest order, namely  $O(n \log n)$ . Note that no previously known methods, such as the one using the modified Toeplitz matrix, as well as those given in Refs. [6], [41], [28], can realize these two at the same time.

Although there are now several security analyses done with the  $\delta$ -almost dual universality<sub>2</sub> [16], [19], a larger part of existing security analyses are still based on the conventional version of universality<sub>2</sub>. The results obtained here clarify advantages of the  $\delta$ -almost dual universal<sub>2</sub> hash function over the conventional one, and also demonstrate that they can be easily constructed in practice. We believe that these facts suggest the importance of further security analyses based on the  $\delta$ -almost dual universality<sub>2</sub>, from theoretical and practical viewpoints.

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<sup>1</sup>Recall that, as is numerically shown in [44], when  $\epsilon$  is too small in comparison with *n*, it is better to describe  $\epsilon$  as an exponential function of *n*.

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