# Revisiting Higher-Order Differential(-Linear) Attacks from an Algebraic Perspective

Applications to ASCON, GRAIN v1, XOODOO, and ChaCha

#### Kai Hu and Thomas Peyrin

School of Physical and Mathematical Sciences, Nanyang Technological University, Singapore

kai.hu@ntu.edu.sg, thomas.peyrin@ntu.edu.sg

Abstract. The higher-order differential-linear (HDL) attack was studied for the first time by Biham, Dunkelman and Keller at FSE 2005, where a linear approximation is appended to a higher-order differential (HD) transition. It is a natural generalization of the differential-linear (DL) attack, but there are two main obstacles for its practical usage: (a) there is no known method to trace probabilistic HD trails; (b) the bias of a HDL approximation is estimated as  $2^{2^{l}-1}pq^{2^{l}}$ , where l, p are the order and probability of the HD and q the bias of the appended linear approximation. Therefore, the bias can become exponentially small when  $|q| \neq \frac{1}{2}$ and  $l \gg 1$ . As a result, the HDL cryptanalysis has attracted much less attention compared to its DL counterpart since its proposal. Inspired by the algebraic perspective on DL attacks recently proposed at CRYPTO 2021, in this paper we show that the HDL attack can be made much more practical with a similar algebraic treatment. The bias of an l-th order HDL approximation is thus related to the bias of the superpoly of a cube for a so-called l-th order differential supporting function (DSF). In addition, although the cryptography community has known that HD, integral and cube attacks have close relationships, there has been no explicit formula to describe their exact transformation thus far. This new algebraic perspective applied to the HD attack gives precisely such a simple and direct formula.

Unsurprisingly, HD/HDL attacks have the potential to be more effective than their simpler Differential/DL counterpart. We provide three new methods to detect possible HD/HDL distinguishers, including: (a) an estimation of the algebraic degree of the DSF; (b) the so-called higher-order algebraic transitional form (HATF); (c) experimental methods based on cube testers. With these methods, we present HD distinguishers for 7 and 8 rounds of the Ascon permutation in the black-box model with 2<sup>23</sup> and 2<sup>46</sup> data/time complexity respectively, zero-sum distinguisher for full 12-round ASCON permutation with 2<sup>55</sup> date/time complexity, (almost) deterministic HDL approximations for 4 and 5 rounds of the ASCON initialization, and new key-recovery attacks on 5 and 6 rounds of the ASCON AEAD. All these results greatly improve over the best-known attacks on reduced ASCON. Note these attacks in this paper are applicable to both Ascon-128 and Ascon-128A. We also give a conditional HD approximation for 130-round Grain v1 (5 more rounds than the previous best conditional differential approximation) and new 4-round deterministic HDL distinguishers for the permutation X00D00 with only

4 chosen-plaintexts. Finally, we further applied our strategy to the ARX-based cipher ChaCha, obtaining 3.5-, 4- and 4.5-round distinguishers and again improving over the state-of-the-art.

Keywords: Higher-Order Differential, Higher-Order Differential-Linear, ASCON, XOODOO, GRAIN v1, ChaCha

#### 1 Introduction

#### 1.1 Differential and Linear Cryptanalysis

Differential cryptanalysis was proposed in [BS90] as an approach to analyze the security of DES-like cryptosystems. In a differential attack, the attacker seeks a fixed input difference  $\Delta_I$  that propagates through the target cipher to a fixed output difference  $\Delta_O$  with a high probability. The so-called differential is denoted by  $\Delta_I \stackrel{p}{\to} \Delta_O$ , where p is the probability  $\Pr[C \oplus C' = \Delta_O | P \oplus P' = \Delta_I]$  and C/C' being the ciphertexts corresponding to the plaintexts P/P' respectively. If p is significantly larger than  $2^{n-1}$ , where n is the block size of the cipher, the differential can be used for distinguishing it from a random permutation.

Linear cryptanalysis [Mat93] was also originally proposed to attack the DES cipher. In a linear cryptanalysis, the attacker studies the bias of the approximation between the parity of some plaintext and ciphertext bits. The bias q with the input and output masks  $(\lambda_I, \lambda_O)$  can be computed with  $\Pr[P \cdot \lambda_I = C \cdot \lambda_O] = \frac{1}{2} + q$ , where  $a \cdot b = \bigoplus_{i=0}^{n-1} a[i]b[i]$  for  $a, b \in \mathbb{F}_2^n$ . Such a linear approximation is denoted by  $\lambda_I \xrightarrow{q} \lambda_O$ . If |q| is significantly larger than 0, it is possible to distinguish the cipher from a random permutation.

#### 1.2 Differential-Linear Cryptanalysis

Differential or linear cryptanalysis have been the fundamental methods for evaluating the security of a cipher. Nowadays, all new schemes are requested to claim resistance against these two attacks, e.g., [DR02,BJK+16]. However, resistance against the plain differential and linear cryptanalysis does not necessarily lead to a resistance against variants of these two attacks. For example, despite its security proof against differential attacks, the cipher Coconuty [Vau98] has been shown to be vulnerable to boomerang and differential-linear DL cryptanalysis [Wag99,BDK02] which are two variants of the differential and linear attacks, leveraging a combined strategy.

Differential-Linear cryptanalysis was first proposed by Langford and Hellman in 1994 [LH94] and it remains the best-known attack on many ciphers, e.g., AES competition finalist Serpent [BAK98]. For a difference-mask pair  $(\Delta_I, \lambda_O)$ , the bias q' of a DL approximation can be derived from the following equation

$$\Pr[\lambda_O \cdot (C \oplus C') = 0 | P \oplus P' = \Delta_I] = \frac{1}{2} + q'.$$

Similar to the case of linear cryptanalysis, if |q'| is significantly larger than 0, we can distinguish the cipher from a random permutation.

There are mainly two types of methods to estimate q' in the literature. In the classical DL cryptanalysis [LH94,BDK02], a cipher E is decomposed into two sub-ciphers as  $E = E_1 \circ E_0$ , where there is a differential  $\Delta_I \stackrel{p}{\to} \Delta_O$  for  $E_0$  and a linear approximation  $\lambda_I \stackrel{q}{\to} \lambda_O$  for  $E_1$ . The DL bias q' can be analyzed as follows. Let (P, P') be the chosen plaintext pair with difference  $\Delta_I$ , (X, X') and (C, C') be the corresponding intermediate state pair (between  $E_0$  and  $E_1$ ) and ciphertext pair. The DL approximation for E then combines three approximations: the values of  $\lambda_O \cdot C$  and  $\lambda_O \cdot C'$  are correlated to  $\lambda_I \cdot X$  and  $\lambda_I \cdot X'$ , respectively, by  $\lambda_I \stackrel{q}{\to} \lambda_O$  for  $E_1$ ; the values  $\lambda_I \cdot X$  and  $\lambda_I \cdot X'$  are correlated, as consequences of  $\Delta_I \stackrel{p}{\to} \Delta_O$  for  $E_0$ . Under two assumptions: (a)  $E_0$  and  $E_1$  are independent; (b) When  $X \oplus X' \neq \Delta_O$ ,  $\lambda_O \cdot C$  and  $\lambda_O \cdot C'$  are correlated to  $\lambda_I \cdot X$  and  $\lambda_I \cdot X'$  with probability  $\frac{1}{2}$  respectively, the overall bias q' can be computed with  $q' = (-1)^{\Delta_O \cdot \lambda_I} 2pq^2$  with the well-known pilling-up lemma [Mat93].

As pointed in [BDK02], these two assumptions may fail sometimes, so experiments are required to verify the estimated bias when possible. There are two main refined methods to avoid the assumptions issue. One is from Blondeau et al. [BLN17], where an accurate formula for q' is given under only the first assumption. The other, proposed by Bar-On et al. [BDKW19] at EUROCRYPT 2019, is called the differential-linear connectivity table (DLCT) technique which overcomes the independence problem between  $E_0$  and  $E_1$ . The drawback of the first method is that it is computationally impossible to apply the formula for practical use-cases, while the second method only works when a large-enough DLCT can be built efficiently.

A new method to estimate q' from an algebraic perspective has been proposed by Liu *et al.* [LLL21] at CRYPTO 2021. If we define a Boolean function according to  $\lambda_O$  as  $f_{\lambda_O}: \mathbb{F}_2^n \to \mathbb{F}_2$ ,  $f(u) = \lambda_O \cdot u$  and let  $f = f_{\lambda_O} \circ E$ , the bias of  $\lambda_O \cdot (C \oplus C')$ is equivalent to the bias of the following Boolean function

$$\mathcal{D}_{\Lambda_I} f(P) = f(P) \oplus f(P \oplus \Delta_I). \tag{1}$$

Then, they introduced another function with an auxiliary variable  $x \in \mathbb{F}_2$  as

$$f_{\Delta_I}(P, x) = f(P \oplus x\Delta_I), \tag{2}$$

where  $x\Delta_I \in \mathbb{F}_2^n$  means that x is multiplied with each coordinate of  $\Delta_I$ , *i.e.*,  $x\Delta_I = (\Delta_I[0] \times x, \dots, \Delta_I[n-1] \times x)$ . Given a Boolean function  $g(a_0, a_1, \dots, a_{n-1})$  with n variables and for a certain variable  $a_i$ , we can write g as  $g = g''a_i \oplus g'$  with g' and g'' being independent of  $a_i$ , where the partial derivative of g with respect to  $a_i$  is the polynomial g'', denoted by  $D_{a_i}g$ . Liu et al. gave the following intuitive observation linking Equation (1) and (2),

$$f'' = D_x f_{\Delta_I} = \mathcal{D}_{\Delta_I} f. \tag{3}$$

That is to say, considering Equations (1,2,3), in order to evaluate the bias of  $\lambda_O \cdot (C \oplus C')$ , we only need to evaluate the bias of the Boolean function  $D_x f_{\Delta_I}$ . This estimation from the algebraic perspective does not require any assumption in theory. However, it is extremely difficult to derive  $D_x f_{\Delta_I}$  or evaluate its

bias. To overcome this obstacle, Liu *et al.* introduced the so-called algebraic transitional forms (ATF)<sup>1</sup> technique to construct a transitional expression of  $D_x f_{\Delta_I}$ . Then, the bias is estimated from this transitional expression. We will give a formal description of the ATF technique in Section 2.

#### 1.3 Higher-Order Differential(-Linear) Cryptanalysis

Inspired by the boomerang and DL cryptanalysis, other combined attacks were studied by Biham et al. [BDK05]. These combined attacks include the differential-bilinear, higher-order differential-linear (HDL), boomerang-linear attack, etc.

The higher-order differential (HD) was for the first time introduced by Lai in 1994 [Lai94] and later studied by Knudsen [Knu94]. It is a natural generalization of the differential attack that takes advantage of having access to more plaintexts. Given an l-th order difference  $\Delta_I = (\Delta_0, \Delta_1, \dots, \Delta_{l-1})$  where  $\Delta_0, \Delta_1, \dots, \Delta_{l-1}$  are linearly independent, the l-th order differential of a (partial) cipher E studies the probability

$$p = \Pr \left[ \bigoplus_{x \in X \oplus \mathcal{L}(\Delta_I)} E(x) = \Delta_O \right],$$

where  $\mathcal{L}(\Delta_I)$  is the linear span of  $(\Delta_0, \Delta_1, \dots, \Delta_{l-1})$ , the affine space  $X \oplus \mathcal{L}(\Delta)$  is called the input set with respect to  $\Delta$ , and  $\Delta_O$  is called the output difference. In [Tie17], Tiessen pointed that a HD is a cluster of so-called d-differences from polytopic cryptanalysis [Tie16]. However, since the number of d-differences is exponential and every single d-difference has an extremely low probability, it is computationally impossible to calculate the probability of a HD or even some useful lower bounds in a differential-like way. Therefore, in practice usually only the deterministic property from the algebraic degree of a cipher [BCC11], or the integral attack [KW02] are considered in previous HD cryptanalysis.

As the name higher-order differential-linear suggests, HDL cryptanalysis [BDK05] studies the bias with respect to an l-th order input difference  $\Delta_I$  and an output mask  $\lambda_O$ . The bias  $\varepsilon$  of a HDL approximation is derived from the following formulation:

$$\Pr\left[\lambda_O \cdot \left(\bigoplus_{x \in X \oplus \mathcal{L}(\boldsymbol{\Delta}_I)} E(x)\right) = 0\right] = \frac{1}{2} + \varepsilon.$$

Akin to the first kind of method to evaluate the bias in DL cryptanalysis, Biham  $et~al.~[\mathrm{BDK05}]$  gave an analysis based on viewing E as two sub-ciphers  $E=E_1\circ E_0$ . Suppose that we know an l-th order differential with probability p for  $E_0$  and that  $E_1$  has a linear approximation with bias q, then the overall bias  $\varepsilon$  is estimated as  $\varepsilon=2^{2^l-1}pq^{2^l}$ . However, as we mentioned, there is no effective method to trace the propagation of a HD or calculate its probability yet. Thus,

In [LLL21], there is another terminology DATF when ATF is used to construct transitional expressions for  $f_{\Delta}$ . In this paper, we directly use ATF for all kinds of Boolean functions no matter whether we target f or  $f_{\Delta}$ .

Biham et al. had to restrain themselves to the integral property for  $E_0$ , which leads to p=1. The integral property usually requires a large l in order to attack an interesting number of rounds, but if  $|q| \neq \frac{1}{2}$ ,  $\varepsilon$  will become extremely close to zero. As a result, we can only get an interesting HDL distinguisher when there is a linear approximation with bias  $\pm \frac{1}{2}$  for  $E_1$ . In practice, some ciphers such as IDEA [LM90] allow weak-key linear approximations with bias  $\frac{1}{2}$ , which makes them vulnerable to HDL attacks [BDK05,BDK07].

Interestingly, the ideas of HDL have been already used in the context of cryptanalysis of Salsa [Ber08b] and ChaCha [Ber08a] although no one explicitly called it HDL cryptanalysis. In [SZFW12], Shi et al. provided several 2nd order differentials with one active output bit for 4-round Salsa and 3-round ChaCha based on experiments. As pointed in [BLN17,LLL21], differentials with one active output bit are actually DL distinguishers with unit output masks, the observation works for the HD as well. Thus, Shi et al.'s distinguishers are also HDL distinguishers. In [CM16], Choudhuri and Maitra extended Shi et al.'s HD by appending a linear approximation, which is the typical case of HDL (note that they did not call it HDL nor gave much discussions on this topic).

We remind the readers that in this paper generally we do not strictly distinguish between HD and HDL cryptanalysis. From an algebraic perspective we are always applying HD cryptanalysis to one or more Boolean functions, *i.e.*, both cryptanalysis share the same underlying principle, which will be clearer in Section 3.

#### 1.4 Motivation and Contributions

Considering that DL attacks are efficient for many important primitives, such as Ascon [DEMS21] and Salsa/ChaCha [Ber08b,Ber08a], we are naturally interested in whether the HDL attack could achieve an even better performance. It is fair to remark that since its proposal HDL cryptanalysis has attracted much less attention compared to DL cryptanalysis. One of the main reasons is likely that there are not enough tools to study the probabilistic HD transitions. Simultaneously, the integral and cube attacks, which are very close to HD cryptanalysis, have been studied extensively. Many powerful tools such as the division property [Tod15,TM16] are available. One can naturally wonder what is the exact relationship between the HD, integral and cube attacks. Are those methods designed for cube and integral attacks also applicable to HD attacks? Recently, the algebraic perspective on DL attacks [LLL21] opened up a new road to study the DL-like attack and achieved better precision for some important instances such as Ascon [DEMS21]. We naturally would like to know if such an algebraic treatment also works for the HDL attack. In this paper, we give positive answers to these questions.

Our contributions. Our results range from theory to applications, so our contributions are generally two-fold. In the theoretical part, we revisit HD cryptanalysis of a Boolean function from an algebraic perspective and show it is equivalent to an integral or cube cryptanalysis of a closely related Boolean function called its differential supporting function (DSF). On the applications side, we give

three methods for HD/HDL cryptanalysis based on the study of the DSF. We obtain improvements over the state-of-the-art for several primitives.

- 1. We start by giving a rigorous proof for Liu  $et\ al.$ 's algebraic perspective on the differential attack since they only proposed it based on an intuitive observation. From this proof, the underlying rational behind Equation (3) and the reason for introducing the auxiliary variable x in Equation (2) become clearer. More importantly, we can naturally extend the algebraic perspective on differential attacks to the higher-order case. We explicitly show that any HD attack for a Boolean function is equivalent to the cube or integral attack on this Boolean function's DSF (which is a related Boolean function) with the input set being a linear space  $\mathbb{F}_2^l$ , where l is the order of the HD. Therefore, all tools available for integral and cube cryptanalysis can now be applied to HD attacks as well. This greatly deepens our general understanding of the relationship between these three techniques.
- 2. We provide three methods to mount HD attacks on a Boolean function f by analyzing its DSF (which can be used to mount HDL attacks on concrete instances as well). All HDL approximations for various primitives we obtained in this paper (as well as their previous DL approximations) are summarized in Table 1.
  - (a) Instead of using the degree evaluation on f so as to derive HD distinguishers, we can evaluate the algebraic degree or find integral distinguishers for its DSF. As we will see, the DSF is a related Boolean function parameterized by the input value and the (higher-order) difference. Thus, a proper choice of the parameters could significantly simplify the DSF such as reducing its algebraic degree. Therefore, we have a greater chance of detecting an integral distinguisher for the DSF. After that, we conveniently transform it into a HD distinguisher for f. With this technique, we significantly improve the best-known distinguishing attacks on round-reduced Ascon permutation [DEMS21]. A 46th order differential will lead to a zero output difference (in 64 bits) for 8 rounds, i.e.,  $2^{46}$ plaintexts are enough to distinguish 8-round ASCON permutation from a random permutation (the previous best distinguisher requires  $2^{130}$  computations [Tod15]). This is the first distinguisher with complexity being lower than 2<sup>64</sup> for 8-round Ascon permutation. With a similar method applied on the inverse ASCON permutation, we constructed a zero-sum distinguisher for full 12-round ASCON permutation requiring only  $2^{55}$ calls while the previous best zero-sum distinguisher costs  $2^{130}$  calls. We also give a 2nd order HDL distinguisher for 4 rounds of the ASCON initialization with bias  $\frac{1}{2}$ . This is the first deterministic DL-like distinguisher for 4 rounds of ASCON AEAD. Interestingly, we also found one deterministic 2nd order HDL approximation for the encryption phase of Ascon. In other word, with only 4 repeated nonces, we can use 4 messages to distinguish the 4-round reduced Ascon encryption. These distinguishers are demonstrated in the distinguisher part of Table 2.
  - (b) We propose the higher-order algebraic transitional form (HATF) to estimate the bias of a HDL approximation. With HATF, we can construct

efficiently an transitional expression of the DSF and then evaluate its bias. We detected a conditional HDL approximation with bias only  $2^{-2}$ for 5-round initialization of ASCON AEAD. By analyzing the conditions in this distinguisher, we could obtain the best key-recovery attack on 5-round Ascon with time/data complexity 2<sup>23</sup>, which is 8 times faster than its DL counterpart. We also found a HDL approximation with  $2^{-30}$ bias for 6-round Ascon initialization that is outside the scope of DL cryptanalysis. With some reasonable assumptions, we could mount a key-recovery attack on 6-round Ascon initialization. This is the second type of attack that works for more than 5 rounds besides the cubelike attacks [LDW17,RHSS21]. A summary of the key-recovery attacks on ASCON AEAD is given in the key-recovery part of Table 2. Note these attacks are applicable to both Ascon-128 and Ascon-128A. To further illustrate the powerfulness of the HATF, we applied it to GRAIN v1 [HJM07] to get a conditional HD approximation for 130 rounds, which is 5 rounds longer than the previous best conditional DL approximation [LLL21].

(c) Finally, we applied the cube tester to the DSF. This is actually an experimental method that was used in the scope of DL cryptanalysis in many previous works. This method works for all kinds of primitives. We first applied cube testers to the initialization of the ASCON AEAD, and found more highly-biased HDL approximations. For example, we detected an 8th order HDL with bias only  $2^{-2.46}$  for 5 rounds and thus we can use about 2<sup>13</sup> data/time complexity to distinguish 5 rounds of the Ascon initialization (the previous best one requires 2<sup>16</sup> [RHSS21]). If we impose 16 conditions on the key, the bias can even improve to  $\frac{1}{2}$ , i.e., for 2<sup>112</sup> keys, 5-round ASCON initialization could be distinguished with 2<sup>8</sup> data/time complexities. By analyzing the nonlinear operations of XOODOO [DHAK18], we choose some specific forms of the input values and differences. An exhaustive search within a small space returned a deterministic HDL distinguisher for 4-round XOODOO (the bias is  $\frac{1}{2}$ ). For ChaCha [Ber08a], we first searched for some efficient HDL distinguishers for 2-, 2.5 and 3-round ChaCha permutation, then appended a 1.5-round linear approximation with bias  $\frac{1}{2}$  to extend the distinguishers to 3.5, 4 and 4.5 rounds. The biases of these three HDL approximations are significantly higher than DL approximations. A summary of these results are provided in Table 1.

The source codes of this work are provided in the anonymous git repository <a href="https://anonymous.4open.science/r/HDL-CC85">https://anonymous.4open.science/r/HDL-CC85</a>. This can be seen as an extra practical contribution, as the team of [LLL21] did not make their code public.

Outline. In Section 2, we briefly recall the main concepts of the HD and the algebraic perspective on the differential attack. We also give a description of the ATF technique. In Section 3, a formal proof for the algebraic perspective on differential cryptanalysis is provided. Based on the idea of the proof, we generalize it to the higher-order case and give a simple and direct formula for the trans-

Table 1: Approximation Biases of the differential, DL and HDL for ciphers considered in this paper. Cond. is short for Conditional and means that we impose some conditions on the key bits.

Primitive	Round	Bias $(-\log)$	Type	Reference
	4	2 <b>1</b>	DL <b>2nd order HDL</b>	[DEMS15] Section 4.4
Ascon Init.		9 4.54	DL Con. DL	[DEMS15] [LLL21]
	5	$\substack{2.46 \\ 2}$	8th order HDL Con. 2nd order HDL	Section 6.1 Section 5.2
		1.04 1	11th order HDL Con. 8th order HDL	Section 6.1 Section 6.1
	6	30	Con. 2nd order HDL	Sup.Mat. C
	120	12.8	Cond. diff.	[LG19]
Grain v1	$\frac{125}{130}$	17.4 <b>30.18</b>	Cond. diff. Cond. 2nd order diff.	[LLL21] Sup.Mat. D
Хоороо	4	1 <b>1</b>	Rotational DL 2nd order HDL	[LSL21] Sup.Mat. E.1
	3.5	1.00	2nd order HDL	Sup.Mat. E.2
ChaCha	4	3.33 2.21 <b>1.19</b>	DL 2nd order HDL <b>2nd order HDL</b>	[CM16] [CM16] Sup.Mat. E.2
	4.5	6.14 <b>4.81</b>	DL 2nd order HDL	[CM16] Sup.Mat. E.2

formation between HD/HDL and cube/integral cryptanalysis. The definition of the DSF is also introduced in this section. In the following Sections 4, 5 and 6, three novel techniques are provided to detect possible HD/HDL distinguishers based on analyzing the DSF. In Section 7, we do some discussions and conclude this paper.

## 2 Preliminaries

#### 2.1 Notations

We use italic lower-case letters (sometimes with subscripts) such as  $x/x_i$  to represent elements in  $\mathbb{F}_2^n$ . The *i*-th bit of x is denoted by  $x[i], 0 \leq i < n$  where x[0] is the most significant (the leftmost) bit. The vectors of m elements in  $\mathbb{F}_2^n$  are denoted by  $\mathbf{x} = (x_0, x_1, \dots, x_{m-1}) \in (\mathbb{F}_2^n)^m$ , thus the *i*-th element of  $\mathbf{x}$  is  $x_i$ . A special case is when  $\mathbf{x} \in (\mathbb{F}_2)^m$  which is sometimes interchangeably used with  $x \in \mathbb{F}_2^m$ . In formulas such as  $\bigoplus_{x \in \mathbb{F}_2^n} f(x)$ , we will use  $x \in \mathbb{F}_2^n$ , in other cases, we use  $\mathbf{x} = (x_0, \dots, x_{m-1}) \in (\mathbb{F}_2)^m$  to stress that elements in  $\mathbf{x} = (x_0, \dots, x_{m-1})$  are treated as symbolic variables. Given  $x \in \mathbb{F}_2$  and  $\Delta \in \mathbb{F}_2^n$ ,  $x\Delta = (\Delta[0]x, \Delta[1]x, \dots, \Delta[n-1]x)$ . For  $a, b \in \mathbb{F}_2^n$ ,  $a||b \in \mathbb{F}_2^{2n}$  represents the concatenation of a and b,  $a \cdot b$  stands for the inner production as  $a \cdot b = \bigoplus_{0 \leq i \leq n} a[i]b[i]$ .

#### 2.2 Boolean Function

An *n*-variable Boolean function is a mapping from  $\mathbb{F}_2^n$  to  $\mathbb{F}_2$ , which can be uniquely written as its algebraic normal form (ANF) as a multivariate poly-

Table 2: Summary of results on the permutation (black-box mode) (labelled by ●), permutation (non-black-box mode) (labelled by ●), initialization (labelled by ■) and encryption (labelled by ▲) of reduced-round ASCON. Time complexities are expressed in number of primitive calls while the data complexities are measured by the nonces, *i.e.*, 128-bit blocks. Our distinguishers up to 7 rounds have been verified experimentally.

Type	Round	Data (log)	Time ( $\log$ )	Method	Reference
		108	108	Differential 🛑	[DEMS21]
		101	101	Linear	[DEMS21]
		16	16	Rectangle •	[GPT21]
	4	8	8	Limited-birthday	[GPT21]
	4	5	5	Integral	[RHSS21]
		5	5	DL	[DEMS15]
		3	3	HD 🛑	Section 4.2
		2	<b>2</b>	$\mathrm{HDL} \  riangleq \  riangleq$	[GPT21] [RHSS21] [DEMS15] Section 4.2 Section 4.4 [Tez16] [DEMS21] [DEMS21] [GPT21] [GPT21] [Tod15] [DEMS15] [RHSS21] Section 4.2 [Tod15] [RHSS21] Section 4.2 [Tod15] [RHSS21] Section 4.2 [Tod15] [RHSS21] Section 4.2 [Tod15] [RHSS21] Section 4.2
	•	108	108	Truncated Diff.	[Tez16]
		191	191	Differential •	[DEMS21]
		189	189	Linear 🛑	[DEMS21]
		80	80	Rectangle •	[GPT21]
D:-+::	-	65	65	Limited-birthday	[GPT21]
Distinguisher	5	18	18	Integral •	[Tod15]
		18	18	DL	
		16	16	Integral	
		13	13	HDL	Section 6.1
		6	6	HD 🌘	Section 4.2
	6	35	35	Integral	[Tod15]
		31	31	Integral	[RHSS21]
		12	12	HD 🌘	Section 4.2
		65	65	Integral •	[Tod15]
	7	60	60	Integral	[RHSS21]
		23	23	HD 🌘	Section 4.2
	8	130	130	Integral •	[Tod15]
		46	46	HD 🌘	Section 4.2
	1.0	130	130	Zero-Sum 🔷	[DEMS15]
	12	55	<b>55</b>	Zero-Sum 🔷	Section 4.3
		36	36	DL	[DEMS15]
W D	5	26	26	Cond. DL	[LLL21]
	9	24	24	Cond. Cube	[LDW17]
		23	23	Cond. HDL	Section 5.2
Key-Recovery	6	40	40	Conditional Cube	[LDW17]
	0	74 74	Cond. HDL	Section 5.2	
	7	77	103	Cond. Cube	[LDW17]
	1	64	123	Cube	[RHSS21]

nomial over  $\mathbb{F}_2$  as

$$f(\boldsymbol{x}) = f(x_0, x_1, \dots, x_{n-1}) = \bigoplus_{u \in \mathbb{F}_2^n} a_u \pi_u(\boldsymbol{x}) = \bigoplus_{u \in \mathbb{F}_2^n} a_u \prod_{i=0}^{n-1} x_i^{u[i]}, a_u \in \mathbb{F}_2$$

The algebraic degree of f, denoted by  $\deg(f)$  is defined as  $\max_{a_u \neq 0} \{wt(u)\}$  for all  $u \in \mathbb{F}_2^n$  in the above formula. The monomial  $x_0x_1 \cdots x_{n-1}$  is called the maxterm of f, denoted by  $\pi(x)$ . The coefficient of a monomial  $\pi_u(x)$  of f is denoted by  $\operatorname{Coe}(f, \pi_u(x))$ . Each output bit of a cryptographic primitive can be written as a Boolean function of its public variables (such as plaintexts, initial values (IV) or nonces) and secret variables such as the key bits. Therefore, in this paper we usually explain our theories with Boolean functions rather than concrete primitive instances.

The bias and correlation are two ways measuring the non-randomness of an n-variable Boolean function f. The bias  $\varepsilon$  is defined as  $\varepsilon = \frac{1}{2^n} |\{f(x) = 0\}| - \frac{1}{2} = \Pr[f = 0] - \frac{1}{2}$  while the correlation  $c = \frac{1}{2^n} \sum_{x \in \mathbb{F}_2^n} (-1)^{f(x)}$ . Actually,  $c = 2\varepsilon$ . In some papers such as [LLL21], the bias is taken while in other papers such as [AFK<sup>+</sup>08] the correlation is used. In this paper, we will only use the bias  $\varepsilon$  to measure the non-randomness.

#### 2.3 Higher-Order Differential, Integral and Cube Attack

HD cryptanalysis was proposed in 1994 by Lai [Lai94] as a generalization of the differential attack. l linearly independent values  $\Delta_0, \Delta_1, \ldots, \Delta_{l-1}$  are denoted by a vector  $\boldsymbol{\Delta}_I = (\Delta_0, \ldots, \Delta_{l-1})$ . Let  $\mathcal{L}(\boldsymbol{\Delta}_I)$  be the linear span of  $\boldsymbol{\Delta}_I$ , *i.e.*, a set containing all  $2^l$  linear combinations of  $\Delta_0, \ldots, \Delta_{l-1}$ . Then, the l-th order differential of a Boolean function f at X is

$$\mathcal{D}_{\Delta_I} f(X) = \bigoplus_{x \in \mathcal{L}(\Delta_I)} f(X \oplus x) = \Delta_O.$$

If  $\deg(f) < l$ , any  $\Delta_I$  with l or larger dimension will lead to  $\Delta_O = 0$ . Therefore, the common method of using HD in cryptanalysis is to evaluate the upper bound on  $\deg(f)$  then use a  $(\deg(f) + 1)$ -st order difference  $\Delta_I$  to ensure  $\Delta_O = 0$  (see [BCC11]).

Integral cryptanalysis [KW02] originated from an analysis on the cipher Square, so the attack was also called square attack [DKR97]. It studies several specific properties of multisets as well as their transitions. Nowadays, division properties [Tod15,TM16] proposed by Todo have been the dominant methods to study the integral property. According to the state-of-the-art of division properties [HLLT20], for  $I \subseteq \{0,1,\ldots,n-1\}$ , if the coefficient of  $\prod_{i\in I} x_i$  in an n-variable Boolean function f, denoted by  $\operatorname{Coe}(f,\prod_{i\in I} x_i)$ , is zero, we obtain a balanced property such that  $\bigoplus_{x\in C_I} f = 0$ , where  $C_I$  is a set with  $x_i, i\in I$  taking all possible values.

The cube attack was invented by Dinur and Shamir to analyze stream ciphers [DS09]. The idea is that an n-variable Boolean function f can be written as  $f = p \times \prod_{i \in I} x_i \oplus q$  with  $I \subseteq \{0, 1, \ldots, n-1\}$  where at least one  $x_i, i \in I$  doesn't appear in q. We have  $p = \bigoplus_{x \in C_I} f$ , where p is called the superpoly of the cube  $C_I$  ( $C_I$  is defined as in the integral cryptanalysis). It is clear that the integral cryptanalysis is a special case of the cube attack with the superpoly being zero.

The cryptography community has known that the three attacks have close relationships. However, to the best of our knowledge, there has been no explicit formula describing the exact transformation from the HD to the integral or cube attack, nor vice-versa.

#### 2.4 An Algebraic Perspective on DL and the ATF Technique

In this subsection, we briefly recall the idea of the algebraic perspective on the differential attack presented by Liu *et al.* in [LLL21].

Recall Equation (1), the bias of a DL approximation is related to the differential bias of the Boolean function  $f = f_{\lambda_O} \circ E$ . Thus to study the DL attack, it is enough to focus on the differential property of a sole Boolean function. As explained in Section 1, Liu *et al.* proposed Equation (3) based on some intuitive observations, but no proof nor motivation was given in their article.

Basic idea of algebraic transitional forms. Equation (3) tells us that if we can (a) calculate out the ANF of  $D_x f_{\Delta}$ , (b) evaluate the bias of  $D_x f_{\Delta}$ , then we can directly know the bias of the output difference. Unfortunately, both tasks are computationally infeasible for modern cryptographic primitives. To overcome these two obstacles, Liu et al. introduced the algebraic transitional forms (ATF) as an transitional expression of the exact ANF of  $f_{\Delta}$ , which is friendly to compute the bias. The ATF of a Boolean function f is denoted by  $\mathcal{A}(f)$ . From  $\mathcal{A}(f_{\Delta})$ , we hope to obtain a simple transitional expression of  $D_x f_{\Delta}$ , say  $D_x \mathcal{A}(f_{\Delta})$ . Finally, the bias of  $D_x \mathcal{A}(f_{\Delta})$  will be regarded as an estimation of the real bias.

Construction of algebraic transitional forms. The core of the ATF technique is to substitute some parts of a Boolean function with new variables to simplify its form. Since almost all symmetric-key primitives are iterated designs, each of their output bits can be represented as a composite Boolean function such as

$$f = f^{r-1} \circ f^{r-2} \circ \dots \circ f^0,$$

where  $f^i: \mathbb{F}_2^n \to \mathbb{F}_2^n$  for  $0 \le i < r-1$  and  $f^{r-1}: \mathbb{F}_2^n \to \mathbb{F}_2$ . Since we want to construct a transitional expression for  $D_x f_{\Delta}$ , we need to be careful not to bury the variable x during the substitution operations. Therefore, we only substitute the expressions in f which are independent of x. Following this principle, we introduce the transitional variables  $\alpha^i, \beta^i \in \mathbb{F}_2^n$  for  $F^i = f^i \circ \cdots \circ f^0(X \oplus x\Delta)$  for  $0 \le i < r$ . For the j-th bit of the output of  $F^i$ , which can be written as  $F^i[j] = (F^i[j])''x + (F^i[j])'$ , we let

$$\begin{cases} \alpha^{i}[j] \stackrel{s}{=}_{Q} (F^{i}[j])'' \\ \beta^{i}[j] \stackrel{s}{=}_{Q} (F^{i}[j])' \end{cases}, 0 \le j < n$$

where " $\stackrel{s}{=}_{Q}$ " means that we substitute  $(F^{i}[j])''$  and  $(F^{i}[j])'$  with new variables  $\alpha^{i}[j]$  and  $\beta^{i}[j]$ , respectively, and store the key-value pairs  $\{\alpha^{i}[j]: (F^{i}[j])''\}$  and  $\{\beta^{i}[j]: (F^{i}[j])''\}$  into a substitution dictionary Q, for all j. Since the goal of the substitution is to simplify the ANF of f, we apply it only when  $(F^{i}[j])''$  or  $(F^{i}[j])'$  contains at least two different variables (no need to enforce substitutions if the expressions are simple enough).

After the substitution, the ANF of each coordinate of  $F^i$  is simplified to  $F^i[j] = \alpha^i[j]x \oplus \beta^i[j]$ . For readability, we ignore their indexes and write them as  $F^i = \alpha^i x \oplus \beta^i$ , for all  $0 \le j < n$ , and this is called the ATF of  $F^i$ , denoted by  $\mathcal{A}(F^i)$ . From  $\mathcal{A}(F^i)$ , we calculate  $\mathcal{A}(F^{i+1})$  similarly. Finally,  $\mathcal{A}(f)$  can be computed from  $\mathcal{A}(F^{r-2})$  as  $f = f^{r-1}(\alpha^{r-2}x \oplus \beta^{r-2})$ . The algorithm for constructing  $\mathcal{A}(f_\Delta)$  is given in [LLL21, Algorithm 1].

Evaluating the bias of  $\mathcal{A}(f_{\Delta})$ . The expression of  $\mathcal{A}(f_{\Delta})$  is a transitional expression of  $f_{\Delta}$  where some part of  $f_{\Delta}$  is substituted by transitional variables, thus the transitional expression of  $D_x f_\Delta$  is  $D_x \mathcal{A}(f_\Delta)$  (since we do substitutions for expressions independent of x). The bias of  $D_x f_\Delta$  is estimated from  $D_x \mathcal{A}(f_\Delta)$ . Suppose  $D_x \mathcal{A}(f_\Delta) = p_n \oplus p_l$  where  $p_l$  is the XOR of linearly isolated monomials and  $p_n$  is the remaining part. The bias of  $p_n$ , denoted by  $Bias(p_n)$ , is calculated directly from the definition of the bias by counting the number of inputs leading to a zero output although there may be transitional variables in  $p_n$ . If  $p_l$  contains any transitional variables, we expand it with the corresponding expressions in Q. We repeat the estimation for this new expression until there are no transitional variables in the linearly isolated part. The biases obtained along the way are used with the pilling-up lemma to calculate the bias of  $D_x \mathcal{A}(f_\Delta)$ . The algorithm for computing this bias is given in [LLL21, Algorithm 2]. Since part of our work directly utilizes this method to estimate the bias of the HDL approximation, to make this paper self-contained we borrow this algorithm and present it in Algorithm 4 in Section A of Supplementary Material.

There is an improved version of the estimation where the distributions of transitional variables are calculated and the final bias of  $D_x \mathcal{A}(f_\Delta)$  also considers these distributions. The improved version is illustrated in [LLL21, Algorithm 3]. This method is more accurate but also more time-consuming. We only consider the primary Algorithm 4 in this work.

### 3 HD/HDL Cryptanalysis from an Algebraic Perspective

In this section, we first give a formal proof for Equation (3). Our proof clearly states the underlying rationale of Equation (3) including the reason for introducing the auxiliary variable x. Based on this proof, we show that it is natural to generalize this algebraic perspective to HD and HDL cryptanalysis.

#### 3.1 Proof of Equation (3)

When calculating the output difference of a Boolean function f with respect to the input difference  $\Delta$ , we compute  $\mathcal{D}_{\Delta}f(X)=f(X)\oplus f(X\oplus\Delta)$ . Note that here we are operating on a one-dimensional affine space  $\mathbb{A}=\{X,X\oplus\Delta\}$ . Considering any other one-dimensional affine space  $\mathbb{A}'=\{Y,Y'\}$ , we can always find a corresponding bijective mapping  $\mathcal{M}$  that sends  $\mathbb{A}'$  to  $\mathbb{A}$ , *i.e.*,  $X=\mathcal{M}(Y)$  and  $X\oplus\Delta=\mathcal{M}(Y')$ . Therefore,

$$\bigoplus_{a \in \mathbb{A}} f(a) = \bigoplus_{a' \in \mathbb{A}'} f(\mathcal{M}(a')) = \bigoplus_{a' \in \mathbb{A}'} f \circ \mathcal{M}(a').$$

That is to say, the output difference of f with respect to the input pair  $\{X, X \oplus \Delta\}$  is equivalent to the output difference of another Boolean function  $f \circ \mathcal{M}$  with input pair  $\mathbb{A}' = \{\mathcal{M}^{-1}(X), \mathcal{M}^{-1}(X \oplus \Delta)\}$ . It is possible to choose some specific  $\mathcal{M}$  or  $\{\mathcal{M}^{-1}(X), \mathcal{M}^{-1}(X \oplus \Delta)\}$  to simplify the evaluation of the output difference of f (we can't choose both, as choosing one will fix the other).

A natural idea is to choose  $\mathbb{A}' = \{0,1\} = \mathbb{F}_2$ , as  $\mathbb{F}_2$  is intuitively the simplest one-dimensional affine space. Then,  $\mathcal{M}$  should be a bijective mapping between  $\mathbb{F}_2$  and  $\mathbb{A} = \{X, X \oplus \Delta\}$ . Note that  $\mathcal{M}$  is an affine mapping because it does not change the dimension of  $\mathbb{F}_2$  and  $\mathbb{A}$ , so by a *method of undermined coefficients*, the following  $\mathcal{M}$  is one choice satisfying our requirements:

$$\mathcal{M}: \mathbb{F}_2 \to \mathbb{A} = \{X, X \oplus \Delta\}$$

$$x \mapsto X \oplus x\Delta$$

$$(4)$$

Now, we are ready to rigorously prove Equation (3).

**Proposition 1** ([LLL21]). Given f and an input difference  $\Delta$ ,  $\mathcal{D}_{\Delta}f = D_x f_{\Delta}$ .

*Proof.* With  $\mathcal{M}$  as given in Equation (4), for any X we have

$$\mathcal{D}_{\Delta}f(X) = \bigoplus_{a \in \{X, X \oplus \Delta\}} f(a) = \bigoplus_{x \in \mathbb{F}_2} f(\mathcal{M}(x)) = \bigoplus_{x \in \mathbb{F}_2} f(X \oplus x\Delta).$$

From the perspective of cube attacks,  $\bigoplus_{x \in \mathbb{F}_2} f(X \oplus x\Delta)$  is just the coefficient of x in  $f(X \oplus x\Delta)$ , *i.e.*,  $D_x f_\Delta$ .

#### 3.2 HD/HDL Cryptanalysis from an Algebraic Perspective

From the proof of Proposition 1, it is natural to generalize the algebraic perspective to HD/HDL cryptanalysis. Given a Boolean function f and an input l-th order difference  $\Delta = (\Delta_0, \Delta_1, \dots, \Delta_{l-1})$ , the input set is  $X \oplus \mathcal{L}(\Delta)$ . The l-th order differential of f is calculated as

$$\mathcal{D}_{\Delta}f(X) = \bigoplus_{a \in X \oplus \mathcal{L}(\Delta)} f(a).$$

Similarly, we are operating an l-dimensional affine space  $\mathbb{A}^l = X \oplus \mathcal{L}(\Delta)$  and we can also link  $\mathbb{A}^l$  to another l-dimensional affine space  $(\mathbb{A}^l)'$  by a bijective mapping  $\mathcal{M}^l$  that sends  $(\mathbb{A}^l)'$  to  $\mathbb{A}^l$ . Again, we tend to choose the simplest l-dimensional affine space, i.e.,  $\mathbb{F}^l_2$ . With a method of undetermined coefficients, one choice of  $\mathcal{M}^l$  can be

$$\mathcal{M}^{l}: \mathbb{F}_{2}^{l} \to \mathbb{A}^{l}$$

$$(x_{0}, x_{1}, \dots, x_{l-1}) \mapsto X \oplus x_{0} \Delta_{0} \oplus x_{1} \Delta_{1} \oplus \dots \oplus x_{n-1} \Delta_{l-1} = X \oplus \boldsymbol{x} \boldsymbol{\Delta}^{T}$$

$$(5)$$

Let  $D_{\boldsymbol{x}} f_{\boldsymbol{\Delta}}$  represent the coefficient of the maxterm in  $f_{\boldsymbol{\Delta}}$ , *i.e.*,  $\mathsf{Coe}\left(f(X \oplus \boldsymbol{x}\boldsymbol{\Delta}^T), \pi(\boldsymbol{x})\right)$ . We have the following proposition as the generalization of Proposition 1.

Proposition 2 (Algebraic-Perspective on HD/HDL). Given f and an l-th order difference  $\Delta$ ,  $\mathcal{D}_{\Delta} f = D_{x} f_{\Delta}$ .

*Proof.* With  $\mathcal{M}^l$  as given in Equation (5), for any X we have

$$\mathcal{D}_{\boldsymbol{\Delta}}f(X) = \bigoplus_{a \in X \oplus \mathcal{L}(\boldsymbol{\Delta})} f(a) = \bigoplus_{x \in \mathbb{F}_2^l} f(\mathcal{M}(x)) = \bigoplus_{x \in \mathbb{F}_2^l} f(X \oplus x\boldsymbol{\Delta}^T).$$

From the perspective of cube attacks,

$$\bigoplus_{\boldsymbol{x} \in \mathbb{F}_2^l} f(X \oplus \boldsymbol{x} \boldsymbol{\Delta}^T) = \mathsf{Coe}\left(f(X \oplus \boldsymbol{x} \boldsymbol{\Delta}^T), \pi(\boldsymbol{x})\right) = D_{\boldsymbol{x}} f_{\boldsymbol{\Delta}}.$$

Proposition 1 is a special case of Proposition 2 when l=1. Therefore, in the remaining part of this paper, we will use  $\mathcal{M}$  to represent both the mappings defined in Equations (4) and (5). With the two propositions, we know that the l-th order differential of f is equivalent to the coefficient of the maxterm of  $f \circ \mathcal{M}$ . Obviously,  $f \circ \mathcal{M}$  plays an important role in (higher-order) differential cryptanalysis, thus we give it a formal definition:

**Definition 1 (Differential Supporting Function).** Given a Boolean function f and an l-th order difference  $\Delta = (\Delta_0, \Delta_1, \dots, \Delta_{l-1})$ , the composite Boolean function

$$\mathrm{DSF}_{f,X,\boldsymbol{\Delta}}^{l}(\boldsymbol{x}) = f \circ \mathcal{M}(\boldsymbol{x}) = f(X \oplus \boldsymbol{x}\boldsymbol{\Delta}^{T}), \boldsymbol{x} = (x_{0},x_{1},\ldots,x_{l-1})$$

is called the l-th order differential supporting function (DSF) of f with respect to  $(X, \Delta)$ . When the order l is clear in context, we will ignore it in the notation, i.e.,  $\mathrm{DSF}_{f,X,\Delta}(x)$ .

We provide an example to illustrate the usage of the DSF in differential cryptanalysis.

Example 1. Let  $f: \mathbb{F}_2^3 \to \mathbb{F}_2$  be  $f(a_0, a_1, a_2) = a_0 a_1 a_2 \oplus a_0 a_1 \oplus a_0 a_2 \oplus a_1 a_2$ ,  $\boldsymbol{\Delta} = (\Delta_0, \Delta_1)$  where  $\Delta_0 = (1, 0, 1)$  and  $\Delta_1 = (1, 1, 1)$ , we consider the 2nd order differential of f at a point  $X = (X_0, X_1, X_2) \in (\mathbb{F}_2)^3$ . According to Equation (5),  $\mathcal{M}(x_0, x_1) = X \oplus x_0 \Delta_0 \oplus x_1 \Delta_1 = (X_0 \oplus x_0 \oplus x_1, X_1 \oplus x_1, X_2 \oplus x_0 \oplus x_1)$ . The composite of f and  $\mathcal{M}$  is then

$$DSF_{f,X,\Delta}(x_0, x_1) = f \circ \mathcal{M}(x_0, x_1) = f(X_0 \oplus x_0 \oplus x_1, X_1 \oplus x_1, X_2 \oplus x_0 \oplus x_1)$$

$$= x_0 x_1 (X_0 \oplus X_2 \oplus 1) \oplus x_0 X_0 X_1 \oplus x_0 X_0 \oplus x_0 X_1 X_2 \oplus x_0 X_1$$

$$\oplus x_0 X_2 \oplus x_0 \oplus x_1 X_0 X_1 \oplus x_1 X_0 X_2 \oplus x_1 X_0 \oplus x_1 X_1 X_2$$

$$\oplus x_1 X_1 \oplus x_1 X_2 \oplus X_0 X_1 X_2 \oplus X_0 X_1 \oplus X_0 X_2 \oplus X_1 X_2$$

We can see that  $\mathcal{D}_{\Delta}f(X) = \mathsf{Coe}\left(\mathsf{DSF}_{f,X,\Delta}, x_0x_1\right) = X_0 \oplus X_2 \oplus 1$ . If we view X as parameters, then note that when  $X_0 = X_2 \oplus 1$ , the 2nd order differential of f at X would be 0 with probability 1.

The terminology of HD and HDL cryptanalysis in this paper. Assume a cryptographic primitive E with n output bits (n > 1), which can be seen as a set of n Boolean functions  $(f_0, f_1, \ldots, f_{n-1})$ . In this paper, HDL cryptanalysis will refer to the HD properties of only one  $f_i$  or the sum of several  $f_i$ , while HD cryptanalysis will refer to at least two different  $f_i$  simultaneously. Typically, HDL will consider the bias of a single Boolean expression equal to one  $f_i$  or to the sum of several  $f_i$ , while HD will consider the probability that a certain set of  $f_i$  will each be equal to a certain Boolean value.

### 4 HD/HDL Cryptanalysis Based on Degree Estimation of the DSF

In this section, we show how to obtain HD distinguishers for a Boolean function by analyzing the algebraic degree of its DSF. Our first application is the cryptanalysis of the NIST LWC<sup>2</sup> finalist ASCON [DEMS21]. A brief description of the ASCON AEAD and its permutation is provided in Section B of Supplementary Material.

We first introduce some notations used for describing the state of ASCON. For the ASCON permutation, the output state after r rounds is denoted by  $S^r = S^r[0] ||S^r[1]||S^r[2]||S^r[3]||S^r[4]$ , where  $S^0$  is the input of the whole permutation. The j-th bit of  $S^r[i]$  is denoted by  $S^r[i][j]$  where  $0 \le i < 5, 0 \le j < 64$ .  $S^r[0][0]$  is the leftmost bit of the first row of the state matrix  $S^r$ . Let  $p_C, p_S, p_L$  represent the operations of addition of constants, substitution layer, linear diffusion layer, respectively. Then  $S^r = (p_L \circ p_S \circ p_C)^r(S^0)$ . We use  $S^{r.5}$  to represent the state  $p_S \circ p_C(S^r)$ . For example,  $S^{3.5}$  represents the state after  $p_S$  of the round 3, i.e., 4 rounds without the last  $p_L$ . Note that there are two versions of ASCON-AEAD that have different bits of rate, named as ASCON-128 and ASCON-128A. Our attacks in this paper for ASCON are applicable to both the two versions.

#### 4.1 Degree Matrix Transition of the Ascon Permutation

Before we introduce our core theory about the degree estimation of the DSF, we first introduce an efficient way to trace the update of algebraic degrees of the ASCON permutation state, *i.e.*, given the degrees or the upper bounds of bits in  $S^r$ , we can quickly calculate the degree upper bounds of bits in  $S^{r+1}$ . This will be useful in our HD and HDL cryptanalysis of the ASCON permutation in the remaining part of this section.

**Definition 2 (Degree Matrix of**  $S^r$ ). The algebraic degrees of the bits in the state  $S^r$  are called a degree matrix of  $S^r$ , denoted by

$$DM(S^r) = (deg(S^r[i][j]), 0 \le i < 5, 0 \le j < 64).$$

**Proposition 3 (Degree Matrix Transition over**  $p_S$  ). With the knowledge of  $DM(S) = (d_{i,j}, 0 \le i < 5, 0 \le j < 64)$ , we have  $DM(p_S(S)) = (d'_{i,j}, 0 \le i < 64)$ 

https://csrc.nist.gov/News/2021/lightweight-crypto-finalists-announced

 $5, 0 \le j < 64$ ), where  $d'_{i,j}, 0 \le i < 5, 0 \le j < 64$  are computed as

$$\begin{aligned} d_{0,j}' &= \max(d_{4,j} + d_{1,j}, d_{3,j}, d_{2,j} + d_{1,j}, d_{2,j}, d_{2,j} + d_{0,j}, d_{1,j}, d_{0,j}) \\ d_{1,j}' &= \max(d_{4,j}, d_{3,j} + d_{2,j}, d_{3,j} + d_{1,j}, d_{3,j}, d_{2,j} + d_{1,j}, d_{2,j}, d_{1,j}, d_{0,j}) \\ d_{2,j}' &= \max(d_{4,j} + d_{3,j}, d_{4,j}, d_{2,j}, d_{1,j}, 0) &, 0 \leq j < 64 \\ d_{3,j}' &= \max(d_{4,j} + d_{0,j}, d_{4,j}, d_{3,j} + d_{0,j}, d_{3,j}, d_{2,j}, d_{1,j}, d_{0,j}) \\ d_{4,j}' &= \max(d_{4,j} + d_{1,j}, d_{4,j}, d_{3,j}, d_{1,j} + d_{0,j}, d_{1,j}) \end{aligned}$$

**Proposition 4 (Degree Matrix Transition over**  $p_L$ ). With the knowledge of  $DM(S) = (d'_{i,j}, 0 \le i < 5, 0 \le j < 64)$ , we have  $DM(p_L(S)) = (d''_{i,j}, 0 \le i < 5, 0 \le j < 64)$ , where  $d''_{i,j}, 0 \le i < 5, 0 \le j < 64$  are computed as

$$\begin{aligned} d_{0,j}'' &= \max(d_{0,j+0}', d_{0,j-19 \bmod 64}', d_{0,j-28 \bmod 64}') \\ d_{1,j}'' &= \max(d_{1,j+0}', d_{1,j-61 \bmod 64}', d_{1,j-39 \bmod 64}') \\ d_{2,j}'' &= \max(d_{2,j+0}', d_{2,j-1 \bmod 64}', d_{2,j-6 \bmod 64}'), 0 \leq j < 64 \\ d_{3,j}'' &= \max(d_{3,j+0}', d_{3,j-10 \bmod 64}', d_{3,j-17 \bmod 64}') \\ d_{4,j}'' &= \max(d_{4,j+0}', d_{4,j-7 \bmod 64}', d_{4,j-41 \bmod 64}') \end{aligned}$$

These two propositions are derived directly from the ANFs of  $p_S$  and  $p_L$ , we provide brief proofs for them in Section B.1 of Supplementary Material.

Suppose  $\mathrm{DM}(S^r)[i][j] \geq 1$  for all i,j, then one can observe that  $p_C$  will not affect the degree matrix. In our applications, we always compute the ANF first for a few rounds until  $\deg(S^r[i][j]) \geq 1$  for all i,j. Then, we apply Propositions 3 and 4 to compute  $\mathrm{DM}(S^{r+r'})$  from  $\mathrm{DM}(S^r)$  for r'>0. Although Propositions 3 and 4 are very simple, they achieve a quite precise estimation of the algebraic degrees of the state bits when dealing with the ASCON permutation (which is sometimes even as good as division properties [Tod15,TM16] according to our experiments).

#### 4.2 HD Distinguishers for the ASCON Permutation

Note that in the Definition 1,  $\boldsymbol{x}$  are variables while X and  $\boldsymbol{\Delta}$  are parameters. Hence, different X and  $\boldsymbol{\Delta}$  will lead to different DSF. Some combinations of  $(X, \boldsymbol{\Delta})$  may make  $\mathrm{DSF}_{f,X,\boldsymbol{\Delta}}$  simpler. More specifically,  $\mathrm{deg}(\mathrm{DSF}_{f,X,\boldsymbol{\Delta}})$  may be reduced to some values smaller than l. In this case, we derive the integral property for  $\mathrm{DSF}_{f,X,\boldsymbol{\Delta}}$ . Applying the inverse of  $\mathcal{M}$ , we immediately derive an l-th order difference yielding the following property with probability 1

$$\mathcal{D}_{\Delta}f(X) = \bigoplus_{x \in \mathbb{F}^l_2} \mathrm{DSF}_{f,X,\Delta}(x) = 0.$$

Next, we show how to estimate the degree of a DSF. The Boolean functions of symmetric-key primitives are always composite, so the DSF of them are also composite Boolean functions. Therefore, we can write a DSF into two phase as follows,

$$\mathrm{DSF}_{f,X,\boldsymbol{\Delta}}(\boldsymbol{x}) = f(X \oplus \boldsymbol{x}\boldsymbol{\Delta}^T) = f^1 \circ f^0(X \oplus \boldsymbol{x}\boldsymbol{\Delta}^T).$$

Different combinations of  $(X, \Delta)$  will lead to different  $f^0(X \oplus x \Delta^T)$  then affecting the degree of  $\mathrm{DSF}_{f,X,\Delta}$ . If  $f^0$  is not too complicated, we can actually compute out its ANFs as well as the exact degrees of the output of  $f^0(X \oplus x \Delta^T)$ . Therefore, given  $(X, \Delta)$ , our degree estimation of  $\mathrm{DSF}_{f,X,\Delta}$  consists of two steps. In the first step, we compute the ANFs of  $f^0(X \oplus x \Delta^T)$  and derive the degrees of its output bits. In the second step, we update the obtained degrees by  $f^1$  to get the degree upper bounds of the whole  $\mathrm{DSF}_{f,X,\Delta}$ . Note  $f^1$  is as the same as the original cipher, so any degree estimation algorithm is also applicable to  $f^1$ .

Regarding the r-round ASCON permutation, any output bit is a composite Boolean function f. If we let  $f^0$  represent the first  $r_0$  rounds of the ASCON permutation, then a larger  $r_0$  will make the estimation of  $\deg(\mathrm{DSF}_{f,X,\Delta})$  more precise but more time-consuming to compute the ANFs of  $f^0(X \oplus \boldsymbol{x} \Delta^T)$ , while a smaller  $r_0$  may undermine the precision. Therefore, we choose  $r_0 = 2.5$  for ASCON to achieve a balance between efficiency and precision. The remaining (r-2.5)-round permutation is seen as  $f^1$ , and the method introduced in Section 4.1 is a suitable method for  $f^1$  to update the degrees of the output of  $f^0$ . The only challenge now is to find a desirable combination of  $(X, \Delta)$ .

To find a proper  $(X, \Delta)$ , a naive idea is to exhaust all possible values of  $(X, \Delta)$ , but the search space is clearly too large. Considering the first operation of the ASCON permutation without  $p_C$  (we can safely ignore the first  $p_C$  operation since we target the permutation) is  $p_S$  which consists of 64 parallel small Sboxes. If we consider independent 1st order differentials for each Sbox S, in total we are considering a 64th order differential. To guarantee the independence, here we restrict elements in  $\Delta = (\Delta_0, \Delta_1, \dots, \Delta_{63})$  to be active in only one and different Sboxes, so we can write  $p_S(X \oplus x\Delta^T)$  as follows:

$$p_S(X \oplus x\Delta^T) = S(X_0 \oplus x_0\Delta'_0)||S(X_1 \oplus x_1\Delta'_1)||\cdots||S(X_{63} \oplus x_{63}\Delta'_{63}),$$
  
where  $X = X_0||X_1||\cdots||X_{63}$  and  $\Delta_i = 0||\cdots||\Delta'_i||\cdots||0$  for  $0 \le i < 64$ .

To further reduce the search space, we restrict the 64  $X_i$ 's and 64  $\Delta'_i$ 's to be equal respectively, *i.e.*,  $(X_i, \Delta'_i) = (\bar{X}, \bar{\Delta})$  for  $0 \le i < 64$ . Therefore, we only need to consider  $2^5$  possibilities for  $\bar{X}$  and 31 possibilities for  $\bar{\Delta}$  (excluding the trivial case  $\bar{\Delta} = 0$ ). The total search space is reduced to  $32 \times 31 = 992$  different cases.

For each  $(\bar{X}, \bar{\Delta}) \in \mathbb{F}_2^5 \times \mathbb{F}_2^5 \setminus \{0\}$ , we calculate the ANFs of  $f^0(X \oplus x \Delta^T)$ , then derive the degree matrix of its output. After that we use Propositions 3 and 4 to update the degree matrix to calculate the degree matrix of  $S^r$  (for  $r \geq 4$ ) which is the degree upper bound of the corresponding DSF. If the degree of a certain DSF is smaller than 64, we find useful 64th order differential distinguishers for r-round ASCON permutation. The process is illustrated by Algorithm 1.

Algorithm 1 is practical. We found dozens of useful HD distinguishers with order lower than 64 for up to 8 rounds. Among them, there are 8 optimal combinations of  $(\bar{X}, \bar{\Delta})$  that make the algebraic degree of the third word of  $S^8$  be only 45. They are

$$(\bar{X}, \bar{\Delta}) \in \left\{ (0x6, 0x13), (0xa, 0x13), (0xc, 0x17), (0xf, 0x18), \\ (0x15, 0x13), (0x17, 0x18), (0x19, 0x13), (0x1b, 0x17) \right\}. \tag{6}$$

**Algorithm 1** Detect HD Distinguishers (up to 64th order) for the Ascon permutation

```
Input: r-round Ascon permutation, r > 4
Output: (\bar{X}, \bar{\Delta}) leading to HD distinguishers (up to 64th order) for r-round Ascon
    permutation, the order of the HD
 1: degree = 64, (\bar{X}, \bar{\Delta}) = (-1, -1), DM^*
 2: for X from 0 to 31 do
                                                   \triangleright for Ascon initialization, X from 0 to 3
        for \Delta from 1 to 31 do
                                                   \triangleright for Ascon initialization, \triangle from 1 to 3
3:
 4:
            for i from 0 to 63 do
 5:
                for j from 0 to 4 do
 6:
                    S^0[j][i] = X[j] \oplus x_i \Delta[j]
            Compute the exact ANF of S^{2.5} and compute \mathrm{DM}(S^{2.5})
 7:
            Compute the degree matrix of S^r from S^{2.5} using Propositions 3 and 4
 8:
            if \min(\mathrm{DM}(S^r)) < \text{degree then}
9:
                 degree = \min(DM(S^r))
10:
11:
                 (\bar{X}, \bar{\Delta}) = (X, \Delta)
12:
                DM^* = DM(S^r)
13: return (\bar{X}, \bar{\Delta}, DM^*)
```

All combinations of  $(\bar{X}, \bar{\Delta})$  in Equation (6) lead to the same HD distinguishers for the reduced ASCON permutation up to 8 rounds. In Table 3, we list the upper bounds on degrees of the DSF of the r-round ASCON permutation with respective to  $(X, \Delta)$  in Equation (6). As is seen, for 7 rounds, the degree upper bound of  $S^7[4]$  is only 22, so  $2^{23}$  chosen texts are enough to enforce the zero-output difference in this word. We practically verified the algebraic degrees in Table 3 for  $(X, \Delta) = (0x6, 0x13)$  up to 7 rounds. According to Propositions 3 and 4, the degree upper bounds in Table 3 for 8 rounds is also verified. Therefore,  $2^{46}$  chosen plaintexts are enough to distinguish the 8-round ASCON permutation from a random permutation.

Table 3: Upper bounds on the algebraic degree of the DSF of the Ascon permutation with  $(X, \Delta)$  in Equation (6). We experimentally verified all algebraic degrees up to 7 rounds.

Round r	Upper bounds on the algebraic degree					
100 4114 /	$\overline{S^r[0]}$	$S^r[1]$	$S^{r}[2]$	$S^r[3]$	$S^r[4]$	
4	3	3	2	2	3	
5	6	5	5	6	6	
6	11	11	12	12	11	
7	23	24	23	23	22	
8	47	47	45	46	47	

#### 4.3 Zero-Sum Distinguishers for ASCON Permutation

The zero-sum distinguisher was first proposed to study the non-ideal property of the Keccak-f permutation [AM09,BC10,YLW+19], which was also used to distinguish the (12-round) Ascon permutation by its designers [DEMS21]. Currently, the best result of the zero-sum distinguisher for the 12-round Ascon permutation costs  $2^{130}$  calls [DEMS21]. In this subsection, we show how to use our HD distinguisher to build a zero-sum distinguisher for 12-round Ascon permutation with only  $2^{55}$  calls.

The zero-sum distinguisher studies the following question. Given a permutation  $P: \mathbb{F}_2^n \to \mathbb{F}_2^n$ , can we create a set of inputs, I, such that

$$\bigoplus_{x \in I} x = \bigoplus_{x \in I} P(x) = 0?$$

Note that the idea of degree matrix transition method introduced in Section 4.1 is also applicable to the inverse operation of the ASCON permutation if we substitute their transitional rules by those of the inverse operations. Thereby we can give two corollaries of Porpositions 3 and 4.

Corollary 1 (Degree Matrix Transition over  $p_S^{-1}$ ). With the knowledge of  $\mathrm{DM}(S)=(d_{i,j},0\leq i<5,0\leq j<64)$ , we have  $\mathrm{DM}(p_S^{-1}(S))=(d'_{i,j},0\leq i<5,0\leq j<64)$ , where  $d'_{i,j},0\leq i<5,0\leq j<64$  are computed as

$$\begin{split} d_{0,j}' &= \max(d_{4,j} + d_{3,j} + d_{2,j}, d_{4,j} + d_{3,j} + d_{1,j}, d_{4,j} + d_{3,j} + d_{0,j}, d_{3,j} + d_{2,j} + d_{0,j}, \\ d_{3,j} + d_{2,j}, d_{3,j}, d_{2,j}, d_{1,j} + d_{0,j}, d_{1,j}, 0) \\ d_{1,j}' &= \max(d_{4,j} + d_{2,j} + d_{0,j}, d_{4,j}, d_{3,j} + d_{2,j}, d_{2,j} + d_{0,j}, d_{1,j}, d_{0,j}) \\ d_{2,j}' &= \max(d_{4,j} + d_{3,j} + d_{1,j}, d_{4,j} + d_{3,j}, d_{4,j} + d_{2,j} + d_{1,j}, d_{4,j} + d_{2,j} + d_{0,j}, \\ d_{4,j} + d_{2,j}, d_{4,j}, d_{3,j} + d_{2,j}, d_{3,j} + d_{1,j} + d_{0,j}, d_{3,j} + d_{1,j}, d_{2,j} + d_{1,j} + d_{0,j}, \\ d_{2,j} + d_{1,j}, d_{2,j} + d_{0,j}, d_{1,j}, d_{0,j}, 0) \\ d_{3,j}' &= \max(d_{4,j} + d_{2,j} + d_{0,j}, d_{4,j} + d_{2,j} + d_{0,j}, d_{4,j} + d_{2,j}, d_{4,j} + d_{0,j}, d_{1,j} + d_{0,j}) \\ d_{4,j}' &= \max(d_{4,j} + d_{3,j} + d_{2,j}, d_{4,j} + d_{2,j}, d_{4,j} + d_{2,j} + d_{1,j}, d_{2,j} + d_{0,j}, d_{4,j} + d_{2,j}, d_$$

The ANF of  $p_L^{-1}$  is a little complicated, so we introduce a simpler version of the degree matrix transition for  $p_L^{-1}$ .

Corollary 2 (Simplified Degree Matrix Transition over  $p_L^{-1}$ ). With the knowledge of  $DM(S) = (d'_{i,j}, 0 \le i < 5, 0 \le j < 64)$ , we have  $DM(p_L^{-1}(S)) =$ 

 $(d_{i,j}'', 0 \leq i < 5, 0 \leq j < 64), \ where \ d_{i,j}'', 0 \leq i < 5, 0 \leq j < 64 \ are \ computed \ as$ 

$$d''_{0,j} = \max_{0 \le k < 64} (d'_{0,k})$$

$$d''_{1,j} = \max_{0 \le k < 64} (d'_{1,k})$$

$$d''_{2,j} = \max_{0 \le k < 64} (d'_{2,k}), 0 \le j < 64$$

$$d''_{3,j} = \max_{0 \le k < 64} (d'_{3,k})$$

$$d''_{4,j} = \max_{0 \le k < 64} (d'_{4,k})$$

It is easy to verify that Corollary 1 and 2 give an upper bound on the degree of output bits of  $p_S^{-1}$  and  $p_L^{-1}$ . Thus, we can replay the calculation of Section 4.2 to the inverse ASCON permutation.

Considering that with  $(X, \Delta)$  in Equation (6), the upper bounds on the degree of the five words of the output after 8 rounds are (47, 47, 45, 47, 47), we only test the  $(X, \Delta)$  for the 4-round inverse ASCON permutation. Note that in the forward direction, we did not include the first  $p_C$ , thus we add it to the backward calculation. In other words, the four rounds of inverse ASCON permutation is

$$P_b = (p_C \circ p_S^{-1} \circ p_L^{-1})^4 \circ p_C.$$

We first calculate the exact ANFs of the output of  $p_L^{-1} \circ p_C \circ p_S^{-1} \circ p_L^{-1} \circ p_C (X \oplus x\Delta^T)$ , then apply Corollary 1 and 2 to calculate the degree upper bounds for 4 rounds of inverse ASCON permutation, *i.e.*,  $P_b$ . Finally, with  $(X, \Delta) \in \{(0xf, 0x18), (0x17, 0x18)\}$ , the degree upper bounds are shown in Table 4.

Table 4: Upper bounds on the algebraic degree of the DSF of the inverse Ascon permutation with  $(X, \Delta) \in \{(0xf, 0x18), (0x17, 0x18)\}$ . We experimentally verified the upper bounds on degrees up to 3 inverse rounds.

Round r	Upper bounds on the algebraic degree						
	S[0]	S[1]	S[2]	S[3]	S[4]		
1	2	1	2	0	2		
2	4	6	6	6	6		
3	18	16	18	18	18		
4	54	54	54	54	54		

Thus, we choose 55 positions from  $\{0, 1, \ldots, 63\}$ , traverse the variables, and keep the remaining 64 - 55 = 9 positions as constants for the state after  $p_C$  of the fifth round of the 12-round ASCON permutation. The corresponding plaintext and ciphertext sets are zero-sum. Thus we obtain a zero-sum distinguisher for 12-round ASCON permutation, with complexity of  $2^{55}$ . Similarly, with 7 forward rounds and 3 backward rounds, we can construct a zero-sum distinguisher for 10

rounds with  $2^{25}$  complexity; with 8 forward rounds and 3 backward rounds, we can construct a zero-sum distinguisher for 11 rounds with  $2^{48}$  complexity. We experimentally verified the 7-round zero-sum distinguisher.

The impact of the distinguisher. Although these zero-sum distinguishers require very low complexities, their actual impact on the security of the ASCON AEAD and Hash are very likely non-existent or at best not clear. In [DEMS15], the designers gave the zero-sum distinguisher for 12 rounds with complexity 2<sup>130</sup> and noted: "The non-ideal properties of the permutation do not seem to affect the security of ASCON. In particular, the complexity of 2<sup>130</sup> is above the cipher's claimed security level." Yet, we emphasize that our 12-round distinguisher requires a much lower complexity than the cipher's claimed security level (2<sup>128</sup>).

In addition, as discussed in [WGR18,GPT21], the advantage of the zero-sum distinguisher for ASCON permutation and a perfect permutation is very small, usually falling under a factor of 2 (our zero-sum approach follows the same philosophy).

Yet, zero-sum distinguishers still represent some non-ideal property of the target permutation. We can mention that the Keccak team decided to increase the number of rounds of Keccak-f (e.g., for Keccak-f[1600] from 18 to 24 rounds) in round 2 of the SHA-3 competition, even though they judged as very unlikely that the zero-sum distinguishers on the full Keccak-f permutation can result in actual attacks against the global Keccak scheme.

#### 4.4 HDL Distinguisher for Ascon Initialization and Encryption

Algorithm 1 can be adapted to detect HD or HDL distinguishers for the initialization of ASCON. We remind the readers that when we consider only one output bit or the sum of several output bits, we refer to HDL cryptanalysis, while when we consider at least two outputs simultaneously, we refer to HD cryptanalysis. When targeting the initialization, we are only allowed to access the fourth and fifth words of the state and observe the first word of the output. The first, second and third words of input are filled with IV and key variables. The first  $p_C$  should also be included in the computation. This means that X is limited to  $\{0,1,2,3\}$  while  $\Delta$  is limited to  $\{1,2,3\}$  in Algorithm 1. We observe that the distinguishers found in [RHSS21] based on division properties are the optimal under our settings when  $(X, \Delta) = (0,3)$ .

Next, we focus on the 2nd order HDL. In other words, in line 4 of Algorithm 1, we do not fill all 64 positions, instead, we only choose 2 different positions  $(i_0, i_1)$  to impose differences and let the other positions be filled with free variables. We found many different index pairs  $(i_0, i_1)$  and  $(\bar{X}, \bar{\Delta})$  that make the algebraic degrees of some bits after 3.5-round initialization to only 1. For example, when  $(i_0, i_1) = (0, 60)$  and  $(\bar{X}, \bar{\Delta}) = (0, 3)$ ,  $\deg(S^{3.5}[50]) \leq 1$ . Thus, we obtain a deterministic 2nd order HDL approximation for 4-round ASCON. One sample is enough to distinguish 4-round ASCON initialization from a random permutation (the ASCON initialization will never be judged as a random permutation). One sample contains 4 texts, so the data and time complexity is 4. The previous best DL distinguisher has a bias  $2^{-2}$ , so it requires about  $2^4$  samples to achieve a similar success rate, *i.e.*, the data and time complexity are 32.

We would like to mention that one can also adapt Algorithm 1 to check the encryption phase of ASCON where we can access the first word of the input (other four words are filled with free variables) and observe the first word of the output. For 4 rounds of encryption, when we impose differences into positions of (0,22) and  $(\bar{X},\bar{\Delta})=(0x0,0x10)$ , the degree of  $S^{3.5}[0][22]$  is 1. Thus, we can distinguish 4 rounds of the ASCON encryption with one sample, *i.e.*, 4 messages, under the nonce-misuse setting. Although ASCON strictly prohibits the noncemisuse case, it may be somehow a practical scenario if we require only 4 times a reuse of the nonce. All the HD or HDL distinguishers obtained in this section have been listed in Table 2 in Section 1.

## 5 Probabilistic HDL Cryptanalysis Based on HATF

In Section 4, we exhibited deterministic distinguishers. In this section, we give a strategy to measure an HDL approximation based on the higher-order algebraic transitional form (HATF) of the output bits.

#### 5.1 Higher-Order ATF Technique

According to Definition 1, to evaluate the bias of a HDL approximation of a Boolean function f, we need to evaluate the bias of the coefficient of the maxterm of its DSF. Recall that the ATF technique [LLL21] gives an transitional expression of  $\mathsf{Coe}\,(f_\Delta,x)$  for the 1st order DL. We can adapt the ATF technique to the l-th order situation, i.e., we try to construct an transitional expression for  $\mathsf{Coe}\,(\mathsf{DSF}_{f,X,\Delta}(x),\pi(x))$ . After that, we can estimate the bias of the transitional expression using Algorithm 4.

Constructing the HATF of a composite Boolean function. Consider a composite Boolean function  $f: \mathbb{F}_2^n \to \mathbb{F}_2$  represented as

$$f = f^{r-1} \circ f^{r-2} \circ \cdots \circ f^0, f^i : \mathbb{F}_2^n \to \mathbb{F}_2^n, 0 \le i < r-1, f^{r-1} : \mathbb{F}_2^n \to \mathbb{F}_2.$$

Since we need a transitional expression of  $\mathsf{Coe}\,(f,\pi(\boldsymbol{x}))$ , we need to retain the variables in  $\boldsymbol{x}$ . Therefore, we introduce  $2^l$  transitional variables, *i.e.*,  $\boldsymbol{\alpha}^i = (\alpha_0^i,\alpha_1^i,\dots,\alpha_{2^l-1}^i) \in (\mathbb{F}_2^n)^{2^l}$ , to substitute all the coefficients of monomials  $\pi_u(\boldsymbol{x}) = \prod_{0 \leq i < l} x_i^{u[i]}$  for  $u \in \mathbb{F}_2^l$  in  $F^i = f^i \circ f^{i-1} \circ \dots \circ f^0(\boldsymbol{x})$  as follows: The ANF of the j-th bit of the output of  $F^i$  can be written as

$$F^i[j] = \bigoplus_{u \in \mathbb{F}_2^l} \mathsf{Coe}\left(F^i[j], \pi_u(\boldsymbol{x})\right) \pi_u(\boldsymbol{x}),$$

We use the transitional variable  $a_u^i$  to substitute the coefficient of the monomial  $\pi_u(\mathbf{x})$  as follows,

$$\alpha_u^i[j] \stackrel{s}{=}_Q \operatorname{Coe}\left(F^i[j], \pi_u(\boldsymbol{x})\right), 1 \leq j \leq n$$

Again, " $\stackrel{s}{=}_{Q}$ " means we use a new variable to substitute an expression, and store the key-value pair into a dictionary Q. After that, the HATF of  $F^{i}[j]$  is

$$F^{i}[j] = \bigoplus_{u \in \mathbb{F}_2^l} \alpha_u^{i}[j] \ \pi_u(\boldsymbol{x}).$$

Similarly to the ATF, we do the variable substitution only when the number of variables in  $Coe(F^{i}[j], \pi_{n}(\mathbf{x}))$  is at least 2 (when  $Coe(F^{i}[j], \pi_{n}(\mathbf{x}))$  contains only one variable, it is simple enough and there is no need to introduce new transitional variables to simplify it). For readability, we ignore their indexes and write them as  $F^i = \bigoplus_{u \in \mathbb{F}_2^l} \alpha_u^i \pi_u(x)$ , for all  $0 \leq j < n$ , and this is called the higher-order ATF (HATF) of  $F^i$ . We also denote the HATF of f by  $\mathcal{A}(f)$  since the ATF [LLL21] is only a special case of the HATF when l = 1. From  $\mathcal{A}(F^i)$ , we calculate  $\mathcal{A}(F^{i+1})$  similarly. Finally,  $\mathcal{A}(f)$  can be computed from  $\mathcal{A}(F^{r-2})$ 

$$f = f^{r-1} \left( \bigoplus_{u \in \mathbb{F}_2^l} \alpha_u^{r-2} \ \pi_u(\boldsymbol{x}) \right).$$

The process of evaluating  $\mathcal{A}(f)$  is illustrated in Algorithm 2, which can be seen as a generalized version of [LLL21, Algorithm 1] to the case of higher-order.

#### **Algorithm 2** Higher-Order Algebraic Transitional From (HATF)

**Input:** An *l*-variable composite Boolean function  $f = f^{r-1} \circ f^{r-2} \circ \cdots \circ f^0$ **Output:** Expression of A(f) and the variable-substitution dictionary Q

- 1: Initialize the variable-substitution dictionary  $Q = \emptyset$
- 2: Compute  $Y^1 = f^0(\mathbf{x})$  according to the ANF of  $f^0$
- 3: for i from 1 to r-1 do
- $\alpha_u^{i-1} \stackrel{s}{=}_Q \operatorname{Coe} \big(Y^i, \pi_u(\boldsymbol{x})\big), \text{ for } u \in \mathbb{F}_2^l \triangleright \operatorname{Substitution and add the key-value pair } \{\alpha_u^{i-1} : \operatorname{Coe} \big(Y^i, \pi_u(\boldsymbol{x})\big)\} \text{ into } Q$
- Compute the HATF of the next round,  $Y^{i+1} = f^i \left( \bigoplus_{u \in \mathbb{F}_n^n} \alpha_u^{i-1} \pi_u(\boldsymbol{x}) \right)$
- 6: **return**  $A(f) = Y^r, Q$

In HDL cryptanalysis, we apply Algorithm 2 to  $\mathrm{DSF}_{f,X,\Delta}$  to get  $\mathcal{A}(f(X \oplus$  $x\Delta^T$ ). After that, we compute  $D_x\mathcal{A}(f(X\oplus x\Delta^T))$  as an transitional expression of the HDL expression of f with respect to  $\Delta$ . The bias of  $D_x \mathcal{A}(f(X \oplus x \Delta^T))$ is evaluated by Algorithm 4.

#### Application to 5-Round Ascon Initialization

To apply Algorithm 2 to the initialization of Ascon, we divide the Sbox of ASCON into two parts,  $p_{S_L}$  and  $p_{S_N}$ , as done in [LLL21]. The first part of the Sbox,  $p_{S_L}$ , is a linear operation

$$x_0 = x_0 \oplus x_4;$$
  $x_4 = x_4 \oplus x_3;$   $x_2 = x_2 \oplus x_1;$ 

where  $(x_0, x_1, x_2, x_3, x_4)$  is the input of  $p_{S_L}$ . The round function of the Ascon permutation is then divided into two parts,  $p_A = p_{S_L} \circ p_{P_C}$  and  $p_B = p_L \circ p_{S_N}$ . In Algorithm 2, we let  $f^0 = p_A$ , and  $f^i = p_A \circ p_B$  for  $1 \leq i < r - 1$ , and  $f^{r-1} = p_{S_N}$ . Thus r-round ASCON (note that we ignore the last diffusion layer)

is represented as

$$p_{S_N} \circ (p_A \circ p_B)^{r-2} \circ p_A = f^{r-1} \circ f^{r-1} \circ f^{r-2} \circ \cdots \circ f^1 \circ f^0$$

The 128-bit key and 128-bit nonce are set to 256 binary variables, the IV is set to the constant specified in [DEMS21].

Considering the efficiency, we only search for 2nd order input differences like  $\Delta = (\Delta_0, \Delta_1)$  and unit output mask  $\lambda$  in this section. The previous DL attacks [DEMS15,LLL21] have shown that when the input difference is active simultaneously in both the third and fourth words, the bias of the output difference tends to be higher. Therefore, we restrict  $\Delta_0$  and  $\Delta_1$  to be active in the third and forth words of different Sboxes. To improve the bias of the HDL approximation, we could impose some conditions I to the first  $r_0$  rounds. Then in each computation of the ANFs or ATFs we reduce the polynomials over the ideal of I, denoted by "mod I". With the conditions in I, we obtain a set of expressions  $Q_I$  by substituting the transitional variables with the original expressions with the help of the dictionary Q. After that, a system of equations  $S = \{f = 0 | f \in Q_I\}$  is derived, *i.e.*, we will get a HDL distinguisher with a specific bias  $\varepsilon$  when the equations in S are satisfied. This technique has been used in [LLL21], ours follows a similar process. The procedure is illustrated in Algorithm 3.

#### **Algorithm 3** Evaluate Conditions HDL Bias for A Boolean Function

**Input:** An *l*-variable composite Boolean function  $f = f^{r-1} \circ f^{r-2} \circ \cdots \circ f^0$ , a round  $r_0$  before which we impose conditions

**Output:** Expression of  $\mathcal{A}(f)$ , the variable-substitution dictionary Q and a set conditions  $Q_I$ 

```
1: Initialize the variable-substitution dictionary Q = \emptyset
 2: Compute Y^1 = f^0(\boldsymbol{x}) according to the ANF of f^0
 3: for i from 1 to r-1 do
 4:
           if i \leq r_0 then
                for u \in \mathbb{F}_2^l do
                                                                            \triangleright For coefficient of any \pi_u(\boldsymbol{x}), u \neq 0
 5:
                      if Coe(Y^i, \pi_u(x)) \notin \{0, 1\} then
 6:
                           Add Coe (Y^i, \pi_u(\boldsymbol{x})) to I
 7:
                           Y^i = Y^i \mod I
           \alpha_u^{i-1} \stackrel{s}{=}_Q \operatorname{\mathsf{Coe}} \left( Y^i, \pi_u(\boldsymbol{x}) \right), for u \in \mathbb{F}_2^l \triangleright \operatorname{\mathsf{Substitution}} and add the key-value pair
      \{\alpha_u^{i-1}: \mathsf{Coe}\left(Y^{i-1}, \pi_u(\boldsymbol{x})\right)\} into Q
           Compute the HATF of the next round, Y^{i+1} = f^i \left( \bigoplus_{u \in \mathbb{F}_n^n} \alpha_u^{i-1} \pi_u(\boldsymbol{x}) \right)
11: Dealing with I and obtain a set of expressions in input bits, denoted by Q_I
12: return \mathcal{A}(f) = Y^{i+1}, Q, Q_I
```

Conditional 2nd order HDL distinguishers. With an exhaustive search using Algorithm 3 with  $r_0 = 2$  (we choose  $r_0 = 2$  for a balance of the high bias and simple conditions) for all the possible positions  $(i_0, i_1)$  for input and

positions for output bits, there are many combinations of the input difference and output mask  $(\Delta_0, \Delta_1, \lambda)$  leading to a high bias. When  $i_0 = 0$ , we found four combinations whose biases are  $2^{-2}$ :

- 1.  $\Delta_0$  is active in  $(S^0[3][0], S^0[4][0])$ ,  $\Delta_1$  is active in  $(S^0[3][7], S^0[4][7])$  and  $\lambda$  is active in  $S^{4.5}[0][25]$ ;
- 2.  $\Delta_0$  is active in  $(S^0[3][0], S^0[4][0])$ ,  $\Delta_1$  is active in  $(S^0[3][14], S^0[4][14])$  and  $\lambda$  is active in  $S^{4.5}[0][51]$ ;
- 3.  $\Delta_0$  is active in  $(S^0[3][0], S^0[4][0])$ ,  $\Delta_1$  is active in  $(S^0[3][51], S^0[4][51])$  and  $\lambda$  is active in  $S^{4.5}[0][18]$ ;
- 4.  $\Delta_0$  is active in  $(S^0[3][0], S^0[4][0])$ ,  $\Delta_1$  is active in  $(S^0[3][57], S^0[4][57])$  and  $\lambda$  is active in  $S^{4.5}[0][18]$ ;

We used  $2^{26}$  random data to test each of these biases and observed that they are extremely precise.

Recovering key bits from the conditions. We take the first case above as an example to describe our key-recovery attack on 5-round ASCON AEAD. From Algorithm 3, the bias is  $2^{-2}$  when 18 conditions in  $Q_I$  are satisfied. Since some conditions are related to secret key bits, we could observe the bias of the HDL distinguisher to guess some key bits. These conditions can be categorized into three types as introduced in [LM12] (for simplicity, we use  $u_0, \ldots, u_{127}$  to represent the 128 bits of nonce  $S^0[3][0], \ldots, S^0[4][63]$  and  $k_0, \ldots, k_{127}$  to represent the 128 bits of key  $S^0[1][0], \ldots, S^0[2][63]$ ):

- 2 Type-0 conditions involving only nonce bits:  $u_0 = u_{64}, u_7 = u_{71}$ .
- 12 Type-1 conditions involving bits of nonce and key. We performed some measurements for all 2<sup>12</sup> cases of the 12 conditions with 2<sup>22</sup> samples each, and found that 9 conditions seem to be largely redundant: whether they hold or not does not affect the bias significantly. To optimize the data and time complexity, we remove these conditions and retain only the three most significant ones.

```
\begin{array}{c} u_{16} = u_{19} \oplus u_{49} \oplus u_{80} \oplus u_{83} k_{19} \oplus u_{83} \oplus u_{90} k_{26} \oplus u_{113} k_{49} \oplus u_{113} \\ & \oplus k_9 \oplus k_{16} \oplus k_{19} \oplus k_{49} \oplus k_{73} \oplus k_{80} \oplus k_{90} \\ u_{67} = u_3 k_3 \oplus u_3 k_{67} \oplus u_3 \oplus u_{25} k_{25} \oplus u_{25} k_{89} \oplus u_{25} \oplus u_{89} \oplus k_3 k_{67} \\ & \oplus k_3 \oplus k_{25} k_{89} \oplus k_{25} \oplus k_{67} \oplus k_{89} \oplus 1 \\ u_{74} = u_{10} k_{10} \oplus u_{10} k_{74} \oplus u_{10} \oplus u_{32} k_{32} \oplus u_{32} k_{96} \oplus u_{32} \oplus u_{96} \oplus k_{10} k_{74} \\ & \oplus k_{10} \oplus k_{32} k_{96} \oplus k_{32} \oplus k_{74} \oplus k_{96} \end{array}
```

-4 Type-2 conditions involving only bits of key:  $k_0=0, k_{64}=0, k_7=0, k_{71}=0.$ 

Considering the removal of the 9 conditions, the overall bias changes a bit. By experimenting with  $2^{26}$  data, we observe that when all 9 above conditions are satisfied the bias would be  $2^{-3.19}$ . However, when at least one does not hold, the bias is at most  $2^{-4.47}$ .

The 2 Type-0 conditions can be satisfied for free. However, we cannot control the type-2 conditions. To continue, let's first assume the Type-0 and Type-2 conditions have been satisfied, we then only need to distinguish the right case where all these 3 Type-1 conditions are satisfied from the other 7 wrong cases when  $(u_{16}, u_{67}, u_{74})$  varies over all possible values.

To distinguish the right case from the wrong cases, we perform a statistical test. Suppose we encrypt N samples, the frequency of the parity bit being 0, denoted by T, obeys the binary distribution  $\mathcal{B}(N, \frac{1}{2} + \varepsilon)$ , where  $\varepsilon$  is the bias of the parity. According to the law of large numbers, T obeys approximately a normal distribution

$$T \sim \mathcal{N}\left(N(\frac{1}{2} + \varepsilon), N(\frac{1}{4} - \varepsilon^2)\right)$$
 (7)

Since the right and wrong cases lead to different biases, T of the right and wrong cases follow different normal distributions. Distinguishing the right case from wrong cases is related to distinguishing two different normal distributions. This question has actually been studied extensively in linear-like attacks. We here adapt it for the DL or HDL cases.

Distinguishing two normal distributions with statistical testing. Suppose that we have known a statistics T obeys either  $\mathcal{N}(\mu_0, \sigma_0^2)$  or  $\mathcal{N}(\mu_1, \sigma_1^2)$  and w.l.o.g.  $u_0 < u_1$ , we want to judge which one T really follows. The method is to find a threshold  $\mu_0 < \tau < u_1$  such that when  $T < \tau$  we judge  $T \sim \mathcal{N}(\mu_0, \sigma_0^2)$ , otherwise  $T \sim \mathcal{N}(\mu_1, \sigma_1^2)$ , enduring the risks of two types of errors:

- 1.  $\alpha_0$ : the probability that  $T \sim \mathcal{N}(\mu_0, \sigma_0^2)$  but we judge it as  $T \sim \mathcal{N}(\mu_1, \sigma_1^2)$ ; 2.  $\alpha_1$ : the probability that  $T \sim \mathcal{N}(\mu_1, \sigma_1^2)$  but we judge it as  $T \sim \mathcal{N}(\mu_0, \sigma_0^2)$ ;

The relationship between  $\mu_0, \mu_1, \tau, \alpha_0$  and  $\alpha_1$  is illustrated in Figure 2 in Section F of Supplementary Material. Let  $\Phi$  be the cumulative distribution functions of the standard normal distribution. According to Figure 2 we have

$$\begin{cases}
\tau = \mu_0 + \Phi^{-1}(1 - \alpha_0)\sigma_0 = \mu_1 - \Phi^{-1}(1 - \alpha_1)\sigma_1 \\
\mu_1 - \mu_0 = \Phi^{-1}(1 - \alpha_0)\sigma_0 + \Phi^{-1}(1 - \alpha_1)\sigma_1
\end{cases}$$
(8)

In Equation (7), the number of samples is the only parameter influencing the mean  $\mu$  and variance  $\sigma^2$  of the normal distribution (with known bias). Let  $\varepsilon_0$ and  $\varepsilon_1$  represent the bias of wrong and right cases, respectively. Substituting the  $\mu_0, \mu_1, \sigma_0^2, \sigma_1^2$  with  $N \times (\frac{1}{2} + \varepsilon_0), N \times (\frac{1}{2} + \varepsilon_1), N \times (\frac{1}{4} - \varepsilon_0^2), N \times (\frac{1}{4} - \varepsilon_1^2),$ respectively, we can get the formula to compute the necessary simple amount with predefined probabilities of errors  $\alpha_0$  and  $\alpha_1$  as

$$N = \left(\frac{\sqrt{\frac{1}{4} - \varepsilon_0^2} \Phi^{-1}(1 - \alpha_0) + \sqrt{\frac{1}{4} - \varepsilon_1^2} \Phi^{-1}(1 - \alpha_1)}{\varepsilon_1 - \varepsilon_0}\right)^2.$$
(9)

We set  $\alpha_1 = 0.05$ , that is the right case would be judged as wrong cases with probability 0.05 at worst. We set  $\alpha_0$  to make sure that the probability that at least one wrong case among m wrong cases is identified as the right case is no larger than 0.05, therefore from  $1 - (1 - \alpha_0)^m = 0.05$  we derive  $\alpha_0 = 1 - 2^{\frac{\log(1-0.05)}{m}}$ . In terms of our HDL cryptanalysis, we have 7 wrong cases, so m = 7. The bias of the right case is  $\varepsilon_1 = 2^{-3.19}$  while the bias for wrong cases is at most  $\varepsilon_0 = 2^{-4.47}$ . Thus,  $2^{9.94}$  samples are enough to identify the right case according to Equation (9) and the threshold is  $\tau = 572$  according to Equation (8).

Once we find the right case, we obtain some equations about the key by flipping some nonce bits following [LLL21]. We take an example to demonstrate how to get these equations. Note that in the first Type-1 condition, the coefficient of  $u_{83}$  is  $k_{19} \oplus 1$ . Then, if know a set of nonce values that satisfy all Type-1 conditions, we can flip  $u_{83}$  to see whether the conditions are still satisfied by the aforementioned statistical testing. If the conditions still hold, we know  $k_{19} \oplus 1 = 0$  since the flipping of  $u_{83}$  does not change anything, otherwise  $k_{19} \oplus 1 = 1$ . With this strategy, we can get several key equations, that is,  $k_{19} = c_0$ ,  $k_{26} = c_1$ ,  $k_{49} = c_2$ ,  $k_9 \oplus k_{16} \oplus k_{19} \oplus k_{49} \oplus k_{73} \oplus k_{80} \oplus k_{90} = c_3$ ,  $k_3 \oplus k_{67} = c_4$ ,  $k_{25} \oplus k_{89} = c_5$ ,  $k_{10} \oplus k_{74} = c_6$ ,  $k_{32} \oplus k_{96} = c_7$ . When  $c_0, \ldots, c_7$  are known by flipping the corresponding nonce bits, we can get two more quadratic equations as  $c_8 = k_3k_{67} \oplus k_{25}k_{89}$  and  $c_9 = k_{10}k_{74} \oplus k_{32}k_{96}$ . Since we know  $k_3 \oplus k_{67} = c_4$  and  $k_{25} \oplus k_{89} = c_5$ , we can linearize the first quadratic equation to  $c_8 = k_3(1 \oplus c_4) \oplus k_{25}(1 \oplus c_5)$ . Similarly, the second quadratic equation can be linearized to  $c_9 = k_{10}(1 \oplus c_6) \oplus k_{32}(1 \oplus c_7)$ . Together with the four equations of Type-2, we can recover 14 key bits totally.

The rotation-invariance assumption of Ascon. Until now our cryptanalysis assumes that the four Type-2 conditions have been satisfied. In other words, this is a weak-key key-recovery attack. In [LLL21], Liu et al.'s DL attack on 5-round Ascon contains 2 Type-2 conditions. They assumed that because of the rotation-invariance of ASCON permutation, there are 64 opportunities to find approximately 16 offsets to make their 2 Type-2 conditions hold. However, we found that for different offsets the biases and the corresponding conditions may be slightly different due to the IV and constant bits of the ASCON permutation, so a more precise one by one analysis of the conditions is needed. Yet, to roughly estimate the full complexity to recover all key bits, we assume that the complexities for different offsets are similar<sup>3</sup>. In our case, we have 4 Type-2 conditions. By exhausting all 64 possible offsets for all the four aforementioned 2nd order difference-mask pairs with bias  $2^{-2}$ , our experiments show that we can obtain at least 8 combinations where the Type-2 conditions hold with probability larger than 78% (with experiments on  $2^{30}$  random keys). Then, we could collect  $14 \times 8 = 112$  linear equations, which is enough to recover all key bits (the remaining 16 bits of the key can be brute-forced). The data and time complexi-

<sup>&</sup>lt;sup>3</sup> Unfortunately, we could not make the verification process automatic, so we have to verify the conditions by hand. In total we need to analyze  $4 \times 64 = 256$  different cases. We verified several among them and found that although the conditions have slight differences, we can always find 3 conditions to make the bias approximately  $2^{3.1}$ . Therefore, we believe this assumption is reasonable. We notice that this issue also appeared in the DL attack of [LLL21].

ties are thus  $2^2 \times (4 \times 64 \times 2^{9.94+3} + 8 \times 8 \times 2^{9.94}) \approx 2^{23}$ , which is 8 times faster than the 1st order DL attack that requires  $2^{26}$  [LLL21].

HDL cryptanalysis of the 6-round ASCON initialization. With the HATF, we detected two HDL approximations with bias  $-2^{-30}$  and two with  $-2^{-37}$  for 6-round ASCON. In [LLL21], Liu *et al.* remarked that they made a lot of efforts but could not find any DL approximation with bias larger than  $2^{-64}$ , which demonstrate well the advantage of the HDL cryptanalysis. Based on these four HDL approximations, we can mount a key-recovery attack on 6-round ASCON and we provide the details of this attack in Section C of Supplementary Material.

Conditional HD approximation of 130-round Grain v1. In [LLL21], Liu et al. found a 125-round conditional differential with bias  $2^{-20.77}$  (experimentally  $2^{-17.4}$ ) on Grain v1. To further compare the effects of differential and HD, we used HATF and detected a conditional HD with bias  $2^{-30.18}$  for 130-round Grain v1, which is five rounds longer than the conditional differential counterpart. More details are presented in Section D of Supplementary Material.

#### 6 Practical HDL Distinguishers Based on Cube Testers

In this section, we show how to construct practical HDL distinguishers based on cube testers. The cube tester technique was originally proposed at FSE 2009 as a general method to test the non-randomness of the superpoly for stream ciphers [ADMS09]. We have seen that the HDL attack on a Boolean function is equivalent to the cube attack on its DSF, so we can also apply cube testers to its DSF function then convert them back to HDL attacks on the original Boolean function. Actually, the experimental methods which have been extensively used in previous DL works, e.g., [DEMS15,AFK<sup>+</sup>08], can also be viewed as cube testers. When applied to the DSF, an advantage is that we can take different X and  $\Delta$  to simplify the DSF<sub>X,\Delta,f</sub>. In this section and in Section E of Supplementary Material, we use the cube tester to construct practical HDL distinguishers for the reduced-round ASCON permutation, XOODOO [DHAK18] and ChaCha [Ber08a].

#### 6.1 More HDL distinguishers for Ascon Initialization

In [DEMS15], the designers experimentally found a DL distinguisher with bias  $2^{-9}$  for 5 rounds of the ASCON initialization. In this subsection, we provide more HDL distinguishers for this variant. From the previous study, when elements in an l-th order difference  $\Delta = (\Delta_0, \Delta_1, \dots, \Delta_{l-1})$  are active both in the third and fourth words and the output bit is active in a single bit, the bias could be higher. Naturally, in our experiments, we always let the difference to be active in these two words and consider only one bit of output. Therefore, we need to choose l positions from  $0, 1, \dots, 63$  to incorporate the differences. Recall that in the key-recovery attack on 5-round ASCON, we could impose some conditions to enhance the bias. For simplicity, we only consider the Type-0 and Type-2 conditions. Note if some type-2 conditions are imposed, the corresponding HDL approximation is conditional on the key, which we cannot access. When l is not large, e.g.,  $l \leq 4$ , we can exhaust all combinations of input differences

Table 5: Some HDL approximations obtained using experiments for 5-round ASCON initialization. Type-0 means we impose Type-0 conditions into the cube while Type-0/2 means both Type-0 and Type-2 conditions are imposed. Since Type-2 conditions are related to the key, the corresponding HDL are considered as conditional HDL.

Order	Input Diff. / Output Mask	$\begin{array}{c} \mathbf{Bias}(-\log) \\ \mathbf{Type-0} \end{array}$	$\begin{array}{c} \mathbf{Bias}(-\log) \\ \mathbf{Type-0/2} \end{array}$
3	(0,24,33)/51	6.52	3.56
4	(0,9,15,41)/27	6.44	2.14
5	(0,9,24,51,55)/18	5.31	2.02
6	(1,12,18,22,21,52)/49	4.88	1.89
7	(10,13,21,31,49,55,61)/28	4.03	1
8	(0,3,10,11,26,28,31,55)/60	2.46	1
9	(8,13,14,16,21,25,39,42,46)/12	1.76	1
10	(4,14,23,27,35,39,41,49,51,55)/0	1.09	1
11	(19,24,33,35,36,48,54,57,59,62,63)/27	1.04	1

and output masks in the aforementioned form. When l is large, e.g.,  $l \geq 5$ , it is costly to exhaust all possibilities of the l-th order differences. Thus, we choose randomly the positions of l-th order differences and the output bit. For each combination of the differences and masks, we compute their bias with  $2^{15}$  samples. After we detect some biases that are significantly larger than  $2^{-7}$ , we use  $2^{26}$  samples to confirm these biases. Some l-th order HDL approximations are shown in Table 5. If we take the 8th order HDL with bias is  $2^{-2.46}$  (with Type-0 conditions being imposed) to distinguish 5-round ASCON initialization, we need about  $2^{4.92}$  samples, i.e.,  $2^{4.92+8} = 2^{12.92}$  data/time complexity. The previous best distinguisher for 5 rounds is the integral distinguisher proposed in [RHSS21] requiring  $2^{16}$  data/time complexity. We also provide in Section E of Supplementary Material improved HDL approximations for XOODOO and ChaCha.

#### 7 Discussions, Open Questions and Conclusion

In this section, we continue the discussion on HD cryptanalysis, identify some open problems and finally conclude this paper.

## 7.1 Relationship between Differential, HD and Cube/Integral Cryptanalysis

1st order differential cryptanalysis was proposed as a statistical attack and the statistical methods can usually predict well the probability of a 1st order difference transition. Since HD cryptanalysis has been seen as a generalization of differential cryptanalysis, we could see some papers attempting to solve the probabilistic HD transition using statistical methods such as [Tie17], but they did not succeed.

Our algebraic perspective on this question provides better insights about the relation between the HD of a Boolean function and the superpoly of its DSF. The past years we have witnessed a great progress on the integral and cube attacks, especially in cryptanalysis of stream ciphers where even exact superpolies can sometimes be recovered. Many powerful variants of cube attacks such as the dynamic cube, conditional cube and correlation cube can now be applied to HD cryptanalysis. We expect that this algebraic perspective on HD will bring some breakthrough for HD cryptanalysis.

#### 7.2 Precision of the HATF

How to evaluate the bias of DL-like approximations has been a long-standing open problem. Various works based on the traditional two-phase strategy were proposed to estimate the real bias including the theoretical formula in [BLN17] and the DLCT technique [BDKW19]. However, with the existence of differential clustering and linear hull, the two methods are either impractical or imprecise. Liu et al.'s algebraic perspective on the DL cryptanalysis provided another method and for some primitives such as ASCON, their ATF technique is more precise. However, the ATF technique relies on some other assumptions such as the transitional variables in the ATF being independent. The validity of these assumptions will need time to be tested on various primitives. As the HDL biases approximations in this paper are estimated by a higher-order version of ATF, they suffer from the same problem. however, to alleviate the worries about the precision of our results, we performed many experiments to verify the biases we obtained, up to computational feasibility. For example, the bias  $2^{-2}$  for the conditional HDL on 5-round of the Ascon initialization has been fully verified. However, it is of course too costly to verify the extremely small bias for 6-round ASCON or 130-round Grain v1. We encourage more studies on the precision of the ATF and HATF in the future.

#### 7.3 Conclusion

In this paper, we revisited the HD/HDL cryptanalysis from an algebraic perspective: the HD/HDL approximation is equivalent to that of the superpoly of the maxterm in the DSF. Our work provides better insights on the HD and HDL cryptanalysis. By analyzing the DSF, we provided three methods to detect possible HD/HDL distinguishers. The first one is to estimate an upper bound on the algebraic degree of the DSF. Since the DSF is parameterized by the input value and difference, we can choose some specific values to simplify it and obtain useful HDL distinguishers more easily. The second method is called HATF by which we construct an transitional expression of the DSF and then use it to estimate the bias of the HDL approximation. The third method is based on the cube tester to experimentally obtain some useful practical HDL distinguishers. By these new methods, we greatly improved the best distinguishing attacks on the ASCON permutation and key-recovery attacks on 5 rounds of the ASCON initialization. We also obtained better approximations for some other high-profile primitives such as Grain v1, Xoodoo and ChaCha. We believe that the HDL

cryptanalysis has more potential than expected, and deserves more attention from the cryptographic community.

**Acknowledgments.** We are grateful to the anonymous referees for their comments that improved the quality of this article.

#### References

- ADMS09. Jean-Philippe Aumasson, Itai Dinur, Willi Meier, and Adi Shamir. Cube Testers and Key Recovery Attacks on Reduced-Round MD6 and Trivium. In Orr Dunkelman, editor, Fast Software Encryption FSE 2009, volume 5665 of LNCS, pages 1–22. Springer, 2009.
- AFK<sup>+</sup>08. Jean-Philippe Aumasson, Simon Fischer, Shahram Khazaei, Willi Meier, and Christian Rechberger. New Features of Latin Dances: Analysis of Salsa, ChaCha, and Rumba. In Kaisa Nyberg, editor, Fast Software Encryption FSE 2008, volume 5086 of LNCS, pages 470–488. Springer, 2008.
- AM09. Jean-Philippe Aumasson and Willi Meier. Zero-sum distinguishers for reduced keccak-f and for the core functions of luffa and hamsi. rump session of Cryptographic Hardware and Embedded Systems-CHES, 2009:67, 2009.
- BAK98. Eli Biham, Ross J. Anderson, and Lars R. Knudsen. Serpent: A New Block Cipher Proposal. In Serge Vaudenay, editor, Fast Software Encryption FSE '98, volume 1372 of LNCS, pages 222–238. Springer, 1998.
- BC10. Christina Boura and Anne Canteaut. A zero-sum property for the keccak-f permutation with 18 rounds. In *IEEE International Symposium on Information Theory, ISIT 2010, June 13-18, 2010, Austin, Texas, USA, Proceedings*, pages 2488–2492. IEEE, 2010.
- BCC11. Christina Boura, Anne Canteaut, and Christophe De Cannière. Higher-Order Differential Properties of Keccak and *Luffa*. In Antoine Joux, editor, Fast Software Encryption FSE 2011, volume 6733 of *LNCS*, pages 252–269. Springer, 2011.
- BDK02. Eli Biham, Orr Dunkelman, and Nathan Keller. Enhancing Differential-Linear Cryptanalysis. In Yuliang Zheng, editor, Advances in Cryptology -ASIACRYPT 2002, volume 2501 of LNCS, pages 254–266. Springer, 2002.
- BDK05. Eli Biham, Orr Dunkelman, and Nathan Keller. New Combined Attacks on Block Ciphers. In Henri Gilbert and Helena Handschuh, editors, Fast Software Encryption FSE 2005, volume 3557 of LNCS, pages 126–144. Springer, 2005.
- BDK07. Eli Biham, Orr Dunkelman, and Nathan Keller. A New Attack on 6-Round IDEA. In Alex Biryukov, editor, Fast Software Encryption FSE 2007, volume 4593 of LNCS, pages 211–224. Springer, 2007.
- BDKW19. Achiya Bar-On, Orr Dunkelman, Nathan Keller, and Ariel Weizman. DLCT: A New Tool for Differential-Linear Cryptanalysis. In Yuval Ishai and Vincent Rijmen, editors, *Advances in Cryptology EUROCRYPT 2019*, volume 11476 of *LNCS*, pages 313–342. Springer, 2019.
- BDPVA12. Guido Bertoni, Joan Daemen, Michaël Peeters, and Gilles Van Assche. Permutation-based encryption, authentication and authenticated encryption. *Directions in Authenticated Ciphers*, pages 159–170, 2012.
- Ber08a. Daniel J Bernstein. ChaCha, a variant of Salsa20. In Workshop record of SASC, volume 8, pages 3–5, 2008.

- Ber08b. Daniel J. Bernstein. The Salsa20 Family of Stream Ciphers. In Matthew J. B. Robshaw and Olivier Billet, editors, New Stream Cipher Designs -The eSTREAM Finalists, volume 4986 of LNCS, pages 84–97. Springer, 2008
- BJK<sup>+</sup>16. Christof Beierle, Jérémy Jean, Stefan Kölbl, Gregor Leander, Amir Moradi, Thomas Peyrin, Yu Sasaki, Pascal Sasdrich, and Siang Meng Sim. The SKINNY Family of Block Ciphers and Its Low-Latency Variant MANTIS. In Matthew Robshaw and Jonathan Katz, editors, Advances in Cryptology CRYPTO 2016, volume 9815 of LNCS, pages 123–153. Springer, 2016.
- BLN17. Céline Blondeau, Gregor Leander, and Kaisa Nyberg. Differential-Linear Cryptanalysis Revisited. *J. Cryptol.*, 30(3):859–888, 2017.
- BLT20. Christof Beierle, Gregor Leander, and Yosuke Todo. Improved Differential-Linear Attacks with Applications to ARX Ciphers. In Daniele Micciancio and Thomas Ristenpart, editors, *Advances in Cryptology CRYPTO 2020*, volume 12172 of *LNCS*, pages 329–358. Springer, 2020.
- BS90. Eli Biham and Adi Shamir. Differential Cryptanalysis of DES-like Cryptosystems. In Alfred Menezes and Scott A. Vanstone, editors, *Advances in Cryptology CRYPTO '90*, volume 537 of *LNCS*, pages 2–21. Springer, 1990.
- CM16. Arka Rai Choudhuri and Subhamoy Maitra. Significantly Improved Multibit Differentials for Reduced Round Salsa and ChaCha. IACR Trans. Symmetric Cryptol., 2016(2):261–287, 2016.
- CN21. Murilo Coutinho and Tertuliano C. Souza Neto. Improved Linear Approximations to ARX Ciphers and Attacks Against ChaCha. In Anne Canteaut and François-Xavier Standaert, editors, Advances in Cryptology EUROCRYPT 2021, volume 12696 of LNCS, pages 711–740. Springer, 2021.
- DEMS15. Christoph Dobraunig, Maria Eichlseder, Florian Mendel, and Martin Schläffer. Cryptanalysis of Ascon. In Kaisa Nyberg, editor, Topics in Cryptology CT-RSA 2015, volume 9048 of LNCS, pages 371–387. Springer, 2015.
- DEMS21. Christoph Dobraunig, Maria Eichlseder, Florian Mendel, and Martin Schläffer. Ascon v1.2: Lightweight Authenticated Encryption and Hashing. J. Cryptol., 34(3):33, 2021.
- DHAK18. Joan Daemen, Seth Hoffert, Gilles Van Assche, and Ronny Van Keer. Xoodoo cookbook. *IACR Cryptol. ePrint Arch.*, page 767, 2018.
- DKR97. Joan Daemen, Lars R. Knudsen, and Vincent Rijmen. The Block Cipher Square. In Eli Biham, editor, Fast Software Encryption - FSE '97, volume 1267 of LNCS, pages 149–165. Springer, 1997.
- DR02. Joan Daemen and Vincent Rijmen. AES and the Wide Trail Design Strategy. In Lars R. Knudsen, editor, *Advances in Cryptology EUROCRYPT 2002*, volume 2332 of *LNCS*, pages 108–109. Springer, 2002.
- DS09. Itai Dinur and Adi Shamir. Cube Attacks on Tweakable Black Box Polynomials. In Antoine Joux, editor, *Advances in Cryptology EUROCRYPT* 2009, volume 5479 of *LNCS*, pages 278–299. Springer, 2009.
- GPT21. David Gérault, Thomas Peyrin, and Quan Quan Tan. Exploring Differential-Based Distinguishers and Forgeries for ASCON. *IACR Trans. Symmetric Cryptol.*, 2021(3):102–136, 2021.
- HJM07. Martin Hell, Thomas Johansson, and Willi Meier. Grain: a stream cipher for constrained environments. Int. J. Wirel. Mob. Comput., 2(1):86–93, 2007.

- HLLT20. Phil Hebborn, Baptiste Lambin, Gregor Leander, and Yosuke Todo. Lower Bounds on the Degree of Block Ciphers. In Shiho Moriai and Huaxiong Wang, editors, Advances in Cryptology - ASIACRYPT 2020, volume 12491 of LNCS, pages 537–566. Springer, 2020.
- Knu94. Lars R. Knudsen. Truncated and Higher Order Differentials. In Bart Preneel, editor, Fast Software Encryption - FSE'94, volume 1008 of LNCS, pages 196–211. Springer, 1994.
- KW02. Lars R. Knudsen and David A. Wagner. Integral Cryptanalysis. In Joan Daemen and Vincent Rijmen, editors, Fast Software Encryption FSE 2002, volume 2365 of LNCS, pages 112–127. Springer, 2002.
- Lai94. Xuejia Lai. Higher order derivatives and differential cryptanalysis. In Communications and cryptography, pages 227–233. Springer, 1994.
- LCM<sup>+</sup>16. Adam Langley, Wan-Teh Chang, Nikos Mavrogiannopoulos, Joachim Strombergson, and Simon Josefsson. ChaCha20-Poly1305 Cipher Suites for Transport Layer Security (TLS). RFC 7905, June 2016.
- LDW17. Zheng Li, Xiaoyang Dong, and Xiaoyun Wang. Conditional Cube Attack on Round-Reduced ASCON. *IACR Trans. Symmetric Cryptol.*, 2017(1):175–202, 2017.
- LG19. Jun-Zhi Li and Jie Guan. Advanced conditional differential attack on Grain-like stream cipher and application on grain v1. IET Inf. Secur., 13(2):141–148, 2019.
- LH94. Susan K. Langford and Martin E. Hellman. Differential-Linear Cryptanalysis. In Yvo Desmedt, editor, *Advances in Cryptology CRYPTO '94*, volume 839 of *LNCS*, pages 17–25. Springer, 1994.
- LLL21. Meicheng Liu, Xiaojuan Lu, and Dongdai Lin. Differential-Linear Cryptanalysis from an Algebraic Perspective. In Tal Malkin and Chris Peikert, editors, *Advances in Cryptology CRYPTO 2021*, volume 12827 of *LNCS*, pages 247–277. Springer, 2021.
- LM90. Xuejia Lai and James L. Massey. A Proposal for a New Block Encryption Standard. In Ivan Damgård, editor, Advances in Cryptology - EURO-CRYPT '90, volume 473 of LNCS, pages 389–404. Springer, 1990.
- LM12. Michael Lehmann and Willi Meier. Conditional Differential Cryptanalysis of Grain-128a. In Josef Pieprzyk, Ahmad-Reza Sadeghi, and Mark Manulis, editors, *Cryptology and Network Security CANS*, volume 7712, pages 1–11. Springer, 2012.
- LSL21. Yunwen Liu, Siwei Sun, and Chao Li. Rotational Cryptanalysis from a Differential-Linear Perspective Practical distinguishers for round-reduced friet, xoodoo, and alzette. In Anne Canteaut and François-Xavier Standaert, editors, Advances in Cryptology EUROCRYPT 2021, volume 12696 of LNCS, pages 741–770. Springer, 2021.
- LZWW17. Yanbin Li, Guoyan Zhang, Wei Wang, and Meiqin Wang. Cryptanalysis of round-reduced ASCON. Sci. China Inf. Sci., 60(3):38102, 2017.
- Mat<br/>93. Mitsuru Matsui. Linear Cryptanalysis Method for DES Cipher. In Tor<br/>Helleseth, editor, Advances in Cryptology EUROCRYPT '93, volume<br/>765 of LNCS, pages 386–397. Springer, 1993.
- RHSS21. Raghvendra Rohit, Kai Hu, Sumanta Sarkar, and Siwei Sun. Misuse-Free Key-Recovery and Distinguishing Attacks on 7-Round Ascon. *IACR Trans. Symmetric Cryptol.*, 2021(1):130–155, 2021.
- SZFW12. Zhenqing Shi, Bin Zhang, Dengguo Feng, and Wenling Wu. Improved Key Recovery Attacks on Reduced-Round Salsa20 and ChaCha. In Taeky-

- oung Kwon, Mun-Kyu Lee, and Daesung Kwon, editors, *Information Security and Cryptology ICISC 2012*, volume 7839 of *LNCS*, pages 337–351. Springer, 2012.
- Tez16. Cihangir Tezcan. Truncated, Impossible, and Improbable Differential Analysis of Ascon. *IACR Cryptol. ePrint Arch.*, page 490, 2016.
- Tie16. Tyge Tiessen. Polytopic Cryptanalysis. In Marc Fischlin and Jean-Sébastien Coron, editors, Advances in Cryptology EUROCRYPT 2016, volume 9665 of LNCS, pages 214–239. Springer, 2016.
- Tie17. Tyge Tiessen. From Higher-Order Differentials to Polytopic Cryptanalysis. IACR Cryptol. ePrint Arch., page 266, 2017.
- TM16. Yosuke Todo and Masakatu Morii. Bit-Based Division Property and Application to Simon Family. *IACR Cryptol. ePrint Arch.*, page 285, 2016.
- Tod15. Yosuke Todo. Structural Evaluation by Generalized Integral Property.
   In Elisabeth Oswald and Marc Fischlin, editors, Advances in Cryptology
   EUROCRYPT 2015, volume 9056 of LNCS, pages 287–314. Springer, 2015.
- Vau98. Serge Vaudenay. Provable Security for Block Ciphers by Decorrelation. In Michel Morvan, Christoph Meinel, and Daniel Krob, editors, Annual Symposium on Theoretical Aspects of Computer Science STACS 98, volume 1373 of LNCS, pages 249–275. Springer, 1998.
- Wag99. David A. Wagner. The Boomerang Attack. In Lars R. Knudsen, editor, Fast Software Encryption - FSE '99, volume 1636 of LNCS, pages 156–170. Springer, 1999.
- WGR18. Qingju Wang, Lorenzo Grassi, and Christian Rechberger. Zero-sum partitions of PHOTON permutations. In Nigel P. Smart, editor, Topics in Cryptology CT-RSA 2018 The Cryptographers' Track at the RSA Conference 2018, San Francisco, CA, USA, April 16-20, 2018, Proceedings, volume 10808 of Lecture Notes in Computer Science, pages 279–299. Springer, 2018.
- YLW<sup>+</sup>19. Hailun Yan, Xuejia Lai, Lei Wang, Yu Yu, and Yiran Xing. New zero-sum distinguishers on full 24-round keccak-f using the division property. *IET Inf. Secur.*, 13(5):469–478, 2019.

## Supplementary Material

## A Algorithm for Evaluating the Bias of an ATF

```
Algorithm 4 Estimation of the Differential-Linear Bias [LLL21]
Input: The ATF \mathcal{A}(f) of a Boolean function f, and the substitution dictionary Q
Output: A bias \varepsilon
1: Calculate e = D_{x} \mathcal{A}(f), set \varepsilon = \frac{1}{2}
2: while e \neq 0 do
3:
        Selected the isolated variables in e, and sum them to e_l
4:
        Compute the bias of e^* = e - e_l by \varepsilon^* = \text{Bias}(e^*), and calculate \varepsilon = 2 \cdot \varepsilon^* \cdot \varepsilon
        Substitute the expressions Q into e_l, and update e with this new polynomial
5:
                ▶ For some complicated case such as GRAIN v1, we will substitute only
    one monomial in e_l every time. Then, the final bias of e_l will be estimated by the
    pilling lemma with bias of all monomials in e_l
6: return \varepsilon
 7: procedure Bias (f)
        (f_1, f_2, \dots, f_{m-1}) \leftarrow \mathtt{Separate}(f)
8:
9:
10:
        for i from 1 to m do
            if the number of variables in the expression of f_i is small then
11:
12:
                 Compute the bias \varepsilon_i of f_i according to its Hamming weight
13:
                 Select a variable v minimizing the maximum cardinality of the variable
14:
    sets of the polynomial in Separate(f_i|_{v=0}) and Separate(f_i|_{v=1})
                 Compute the bias of f_i by \varepsilon_i = \frac{1}{2} \text{Bias}(f_i|_{v=0}) + \frac{1}{2} \text{Bias}(f_i|_{v=1})
15:
16:
            \varepsilon \leftarrow 2 \cdot \varepsilon \cdot \varepsilon_i
            if \varepsilon = 0 then
17:
                break
18:
19:
        return \varepsilon
20: procedure Separate(f)
        Separate the Boolean polynomial f as a sum of m polynomials f_i whose variable
    sets are mutually disjoint, and sort f_1, f_2, \ldots, f_m in ascending order according to
    the number of terms in their ANFs
22:
        return (f_1, f_1, \ldots, f_m)
```

## B Brief Specification of ASCON

ASCON, designed by Dobraunig, Eichlseder, Mendel, and Schläffer, is a family of AEAD and hash algorithms. At a high level, the ASCON AEAD takes as input a nonce N, a secret key K, an associated data A and a plaintext or message M,

and produces a ciphertext C and a tag T. The authenticity of the associated data and message can be verified against the tag T. Table 6 lists the variants of ASCON AEAD along with the recommended parameter sets.

Table 6: Ascon variants and their recommended parameters

Name	State size	Rate $r$		Size of		Rounds	
1.00110	21010 2120	10000	Key Nonce Tag		$p^a$	$p^b$	
ASCON-128	320	64	128	128	128	12	6
Ascon-128a	320	128	128	128	128	12	8

ASCON adopts a Monkey Duplex [BDPVA12] mode with a stronger keyed initialization and keyed finalization phases as illustrated in Figure 1. The underlying permutations  $p^a$  and  $p^b$  are iterative designs, whose round function p is based on the substitution permutation network design paradigm and consists of three simple steps  $p_C,\,p_S,$  and  $p_L.$  We now describe the round function p and each step in detail.

The round function  $p = p_L \circ p_S \circ p_C$  operates on a 320-bit state arranged into five 64-bit words. The input state to the round function at r-th round is denoted by  $S^r = S^r[0] ||S^r[1]||S^r[2]||S^r[3]||S^r[4]$ , the j-th bit of  $S^r[i]$  is denoted by  $S^r[i][j]$  where  $0 \le i < 5, 0 \le j < 64$ . We use  $S^{r.5}$  to represent the state after  $p_S$  of the r-th round,  $r \ge 0$ .

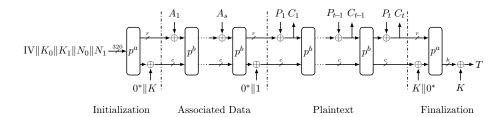


Fig. 1: The encryption algorithm of Ascon

Addition of constants  $(p_C)$ . An 8-bit constant is XORed to the bit positions  $56, \dots, 63$  of the 64-bit word  $S^r[2]$  at each round.

Substitution layer  $(p_S)$ . Update each slice of the 320-bit state by applying the 5-bit Sbox  $\mathcal{S}: \mathbb{F}_2^5 \to \mathbb{F}_2^5$  defined by the following algebraic normal forms:

$$\begin{cases} y_0 = x_4 x_1 + x_3 + x_2 x_1 + x_2 + x_1 x_0 + x_1 + x_0 \\ y_1 = x_4 + x_3 x_2 + x_3 x_1 + x_3 + x_2 x_1 + x_2 + x_1 + x_0 \\ y_2 = x_4 x_3 + x_4 + x_2 + x_1 + 1 \\ y_3 = x_4 x_0 + x_4 + x_3 x_0 + x_3 + x_2 + x_1 + x_0 \\ y_4 = x_4 x_1 + x_4 + x_3 + x_1 x_0 + x_1 \end{cases}$$

$$(10)$$

The ANF of the inverse of the Sbox is as follows,

$$\begin{cases} y_0 = x_4 x_3 x_2 + x_4 x_3 x_1 + x_4 x_3 x_0 + x_3 x_2 x_0 + x_3 x_2 + x_3 + x_2 + x_1 x_0 + x_1 + 1 \\ y_1 = x_4 x_2 x_0 + x_4 + x_3 x_2 + x_2 x_0 + x_1 + x_0 \\ y_2 = x_4 x_3 x_1 + x_4 x_3 + x_4 x_2 x_1 + x_4 x_2 x_0 + x_4 x_2 + x_4 + x_3 x_2 + x_3 x_1 x_0 \\ + x_3 x_1 + x_2 x_1 x_0 + x_2 x_1 + x_2 x_0 + x_2 + x_1 + x_0 + 1 \\ y_3 = x_4 x_2 x_1 + x_4 x_2 x_0 + x_4 x_2 + x_4 x_1 + x_4 + x_3 + x_2 x_1 + x_2 x_0 + x_1 \\ y_4 = x_4 x_3 x_2 + x_4 x_2 x_1 + x_4 x_2 x_0 + x_4 x_2 + x_3 x_2 x_0 + x_3 x_2 + x_3 + x_2 x_1 + x_2 x_0 + x_1 x_0 \end{cases}$$

Linear diffusion layer  $(p_L)$ . Apply a linear transformation  $\Sigma_i$  to each 64-bit word  $S^{r.5}[i]$  with  $0 \le i < 5$ , where  $\Sigma_i$  is defined as

$$\begin{cases} y_0 \leftarrow \Sigma_0(x_0) = x_0 + (x_0 \gg 19) + (x_0 \gg 28) \\ y_1 \leftarrow \Sigma_1(x_1) = x_1 + (x_1 \gg 61) + (x_1 \gg 39) \\ y_2 \leftarrow \Sigma_2(x_2) = x_2 + (x_2 \gg 1) + (x_2 \gg 6) \\ y_3 \leftarrow \Sigma_3(x_3) = x_3 + (x_3 \gg 10) + (x_3 \gg 17) \\ y_4 \leftarrow \Sigma_4(x_4) = x_4 + (x_4 \gg 7) + (x_4 \gg 41) \end{cases}$$

$$(12)$$

In this paper, when we attack r rounds of the ASCON permutation, we can operate all 320 input bits  $S^0$  and observe all 320 output bits of  $S^r$  or  $S^{r.5}$ . When we attack r rounds of the ASCON initialization, we can operate only  $S^0[3]$  and  $S^0[4]$  and observe  $S^r[0]$ .

#### B.1 Proofs for Proposition 3 and 4

*Proof.* It is clear that if  $y = x_0 \oplus x_1$ ,  $\deg(y) \leq \max(x_0, x_1)$ ; if  $y = x_0x_1$ ,  $\deg(y) \leq \deg(x_0) + \deg(x_1)$ . Then from the ANFs of  $p_S$  (Equation (10)) and  $p_L$  (Equation (12)), we directly derive the formula in Proposition 3 and Proposition 4.

#### C Application to 6-Round ASCON Initialization

We perform here a 2nd order HDL cryptanalysis of 6-round of the initialization of ASCON. With an exhaustive search using Algorithm 3 for all the possible positions  $(0, i_1 > 0)$  for input and positions for output, there are four combinations

of the input difference and output mask  $(\Delta_0, \Delta_1, \lambda)$  leading to a significantly high bias:

- 1.  $\Delta_0$  is active in  $(S^0[3][0], S^0[4][0])$  and  $\Delta_1$  is active in  $(S^0[3][5], S^0[4][5])$ ,  $\lambda$  is active in  $S^{5.5}[0][37]$ . The bias is  $-2^{-30}$ .
- 2.  $\Delta_0$  is active in  $(S^0[3][0], S^0[4][0])$  and  $\Delta_1$  is active in  $(S^0[3][59], S^0[4][59])$ ,  $\lambda$  is active in  $S^{5.5}[0][32]$ . The bias is  $-2^{-30}$ .
- 3.  $\Delta_0$  is active in  $(S^0[3][0], S^0[4][0])$  and  $\Delta_1$  is active in  $(S^0[3][28], S^0[4][28])$ ,  $\lambda$  is active in  $S^{5.5}[0][4]$ . The bias is  $-2^{-37}$ .
- 4.  $\Delta_0$  is active in  $(S^0[3][0], S^0[4][0])$  and  $\Delta_1$  is active in  $(S^0[3][51], S^0[4][51])$ ,  $\lambda$  is active in  $S^{5.5}[0][55]$ . The bias is  $-2^{-37}$ .

We take the first two 2nd order HDL approximations to mount the key recovery attacks. Since we obtain conditions from the first two rounds, which is the same as the 5-round case, we expect a similar situation except that we will need more samples for the statistical testing to distinguish the right case. Suppose that there are also three Type-1 conditions after removing some redundant conditions, the sample amount is approximately calculated as  $N \approx 2^{62.06}$ . After exhausting all 64 positions, we have 2 opportunities to do the key recovery attacks, thus the approximate data and time complexities are

$$4 \times 2 \times 64 \times 2^{62.06+3} + 4 \times 2 \times 2 \times 8 \times 2^{62.06} \approx 2^{74.10}$$
.

Note that because of the extremely small bias, we cannot perform a more detailed analysis based on experiments as we did for the 5 rounds, thus the above complexities are rough estimations. However, there is no doubt that the HDL attacks on 6-round Ascon are possible since the biases are much greater than  $2^{-64}$ . We emphasize that in [LLL21] Liu et al. remarked that they made a lot of efforts but could not find any DL approximation with bias larger than  $2^{-64}$ . This demonstrates well the advantage of the HDL cryptanalysis. We note that this is the second type of attack applicable to 6 rounds of Ascon initialization besides the cube-like attacks [LDW17,DEMS15,RHSS21,LZWW17].

### D HD Cryptanalysis of Grain v1

GRAIN v1 is a stream cipher proposed by Hell et al. [HJM07] which has been selected in the eSTREAM hardware profile. GRAIN v1 uses an 80-bit secret key  $K = (k_0, k_1, \ldots, k_{79})$  and a 64-bit initial value  $V = (v_0, v_1, \ldots, v_{63})$ . It consists of three main building blocks: an 80-bit linear feedback shift register (LFSR), an 80-bit non-linear feedback shift register (NFSR) and a non-linear output function. In [LLL21], Liu et al. proposed the conditional differential attacks (for stream ciphers whose output is one bit, the DL and differential attacks are identical) on the 125-round GRAIN v1 initialization with a theoretical bias  $2^{-20.77}$ .

To give a comparison between the effects of the 2nd and 1st order differential attacks, we tested the 2nd order differential on Grain v1 based on HATF to see whether we could reach more rounds. In [LLL21], the authors used an input

difference  $\Delta_0$  which is active in the 21th and 46th bits of the IV. We set it as one component of our 2nd order difference, say  $\Delta_0$ , and use another component  $\Delta_1$  which is active in the 19th and 44th bits of the IV. Therefore, our 2nd order difference is  $\Delta = (\Delta_0, \Delta_1)$ . We apply Algorithm 3 with  $\Delta$  as input to 130-round Grain v1, and set  $r_1$  as 50 (conditions are imposed for the first 50 rounds, the same setting as [LLL21]). The HATF of the first output bit is calculated and the bias is estimated by Algorithm 4. Since the difference expression is very complicated, to make the computation feasible, we substitute only one linearly isolated term using Q every time, and finally use the pilling lemma to estimate the overall bias with all the biases we get from all terms in  $e_l$  (see Line 5 in Algorithm 4). Finally, our experiment shows that the output 2nd order difference of 130-round Grain v1 has a bias approximately  $2^{-30.18}$ . This conditional HD is 5 rounds longer than the previous best conditional differential distinguisher. Unfortunately, the bias is too small to verify it experimentally, as we would need about 2<sup>60.36</sup> data. Considering that some freedom degrees of the IV bits are used to meet the conditions we impose in the first 50 rounds, this HD approximation cannot be used in key-recovery attacks. Therefore, this approximation shows some non-randomness property of Grain v1 and we present it for a comparison with its 1st order conditional differential counterpart.

## E Practical HDL Distinguishers Based on Cube Testers for X00D00 and ChaCha

#### E.1 4-Round Deterministic HDL Distinguisher for X00000

XOODOO [DHAK18] is an efficient 384-bit permutation designed by the Keccak Team<sup>4</sup>. The state of XOODOO is arranged into a  $4 \times 3 \times 32$  cube and a state bit is denoted by S[x][y][z]. One round of XOODOO consists of the following operations.

$$\begin{split} S[x][y][z] &= S[x][y][z] \oplus \bigoplus_{y} S[x-1][y][z-5] \oplus \bigoplus_{y} S[x-1][y][z-14] \\ S[x][1][z] &= S[x-1][1][z], S[x][2][z] = S[x][2][z-11] \\ S[0][0] &= S[0][0] \oplus RC_{i} \\ S[x][y][z] &= S[x][y][z] \oplus ((S[x][y+1][z] \oplus 1) \cdot S[x][y+2][z]) \\ S[x][1][z] &= S[x][1][z-1], S[x][2][z] = S[x-1][2][z-8] \end{split}$$

The total number of rounds in XOODOO is 12, but in some modes the core permutation calls a 6-round XOODOO permutation. More details of XOODOO including the constants  $RC_i$  can be found in its specification [DHAK18].

<sup>4</sup> https://keccak.team

In our cryptanalysis of XOODOO, we do not consider the linear layers before and after the nonlinear operations in the first and last round. Since XOODOO is a permutation, such an assumption is reasonable. Before applying the cube tester to XOODOO, we first analyze its nonlinear operation  $S[x][y][z] = S[x][y][z] \oplus ((S[x][y+1][z] \oplus 1) \cdot S[x][y+2][z])$ . Intuitively, if we let S[x][y+1][z] = 0 and S[x][y][z] = a[x][y+2][z] and set the difference active in both S[x][y][z] and S[x][y+2][z], the nonlinear operation will be simplified. This way, the difference in S[x][y][z] after the nonlinear operation will be canceled. We apply this setting to the 96 bits represented by S[0] as follows:

- 1. Let S[0][0][z] = S[0][2][z] and S[0][1][z] = 0,
- 2. Exhaust all 2nd order differences  $\Delta = (\Delta_0, \Delta_1)$  where  $\Delta_0$  and  $\Delta_1$  are both active in S[0][0][z] and S[0][2][z] but  $\Delta_0 \neq \Delta_1$ .

We observe that with these settings many output bits after 4 rounds are highly biased. For example, if  $\Delta_0$  is active in S[0][0][0] and S[0][2][0],  $\Delta_1$  is active in S[0][0][0][20] and S[0][2][20], the bias of S[0][0][0][0] after 4 rounds would be  $\frac{1}{2}$ , *i.e.*, we found a deterministic 2nd DL distinguisher for 4-round XOODOO. We note that before our work there was another deterministic rotational-differential-linear distinguisher found for 4-round XOODOO [LSL21]. However, no DL distinguisher has been reported for 4-round XOODOO until now. Unfortunately, with the same method, we did not find useful 2nd order HDL for 5 rounds of XOODOO.

#### E.2 3-, 4- and 4.5-Round HDL Distinguisher for ChaCha

ChaCha is a variant of Salsa which are both designed by Bernstein [Ber08a,Ber08b]. Because of its high software efficiency, ChaCha has been adopted by the TLS protocol [LCM<sup>+</sup>16].

The state of ChaCha is of size 64 bytes or 512 bits, which is divided into 16 words, each of 32 bits. These words are framed of a  $4 \times 4$  matrix. In the initial matrix denoted by  $X^0$ , the 1st row consists of 4 constants  $c_0 = 0$ x61707865,  $c_1 = 0$ x3320646e,  $c_2 = 0$ x79622d32 and  $c_3 = 0$ x6b206574. The second and third row consist of 8 key words  $k_0, k_1, \ldots, k_7$  and the fourth row consists of the two 32-bit nonces  $v_0, v_1$  and two 32-bit counters  $t_0, t_1$ . The nonces and counters are usually considered as IVs, which we can control. The state  $X^0$  is illustrated as follows,

$$X^{0} = \begin{bmatrix} X_{0}^{0} & X_{1}^{0} & X_{2}^{0} & X_{3}^{0} \\ X_{4}^{0} & X_{5}^{0} & X_{6}^{0} & X_{7}^{0} \\ X_{8}^{0} & X_{9}^{0} & X_{10}^{0} & X_{11}^{0} \\ X_{12}^{0} & X_{13}^{0} & X_{14}^{0} & X_{15}^{0} \end{bmatrix} = \begin{bmatrix} c_{0} & c_{1} & c_{2} & c_{3} \\ k_{0} & k_{1} & k_{2} & k_{3} \\ k_{4} & k_{5} & k_{6} & k_{7} \\ t_{0} & t_{1} & v_{0} & v_{1} \end{bmatrix}.$$

The round function of ChaCha is based on an operation called quarter-round (QR) which operates on a 4 tuple (a,b,c,d) and updates it as follows,

$$a' = a + b$$
,  $d' = (d \oplus a') \gg 16$ ,  $c' = c + d'$ ,  $b' = (b \oplus c') \gg 12$ ,  $a'' = a' + b'$ ,  $d'' = (d' \oplus a'') \gg 8$ ,  $c'' = c' + d''$ ,  $b'' = (b' \oplus c'') \gg 7$ .

$$i.e.,~\mathcal{QR}(a,b,c,d)\xrightarrow{(a',b',c',d')}(a'',b'',c'',d'').$$

 $\mathcal{QR}$  is applied on the 4 words of each column in the odd rounds and each diagonal in the even rounds. The state after r rounds is denoted by

$$X^{0} = \begin{bmatrix} X_{0}^{r} & X_{1}^{r} & X_{2}^{r} & X_{3}^{r} \\ X_{4}^{r} & X_{5}^{r} & X_{6}^{r} & X_{7}^{r} \\ X_{8}^{r} & X_{9}^{r} & X_{10}^{r} & X_{11}^{r} \\ X_{12}^{r} & X_{13}^{r} & X_{14}^{r} & X_{15}^{r} \end{bmatrix}$$

The output key-stream block Z is executed as  $Z = X^0 + X^R$  for ChaCha/R. A half-round represents the update of (a,b,c,d) to (a',b',c',d') in the  $\mathcal{QR}$  operation. Thus, ChaCha/R.5 means a R full and a half round function. We continue to use X[i] to represent the i-th bit of the word X, but only within this subsection, X[0] stands for the least significant bit. This is for consistency with previous work related to ChaCha.

Currently, the most efficient methods for analyzing ChaCha have been differential-linear cryptanalysis [AFK+08,SZFW12,CM16,BLT20,CN21]. Interestingly, we notice that the HDL idea has been partially used in the previous cryptanalysis on ChaCha but the terminology higher-order differential-linear attack was not used. In [SZFW12], Shi et al. proposed some higher biased truncated 2nd order differentials whose outputs are one bit for ChaCha/3, which had been better than the 1st order truncated differentials. In the appendix of [CM16], Choudhuri et al. gave several truncated 2nd order differential differentials whose outputs are multiple bits for 4-round ChaCha by appending one-round linear approximations to the distinguishers from [SZFW12]. However, in general the HDL cryptanalysis has not considered extensively for ChaCha. In this subsection, we give the best distinguishers based on HDL for ChaCha/3.5, ChaCha/4 and ChaCha/4.5, which shows that the HDL cryptanalysis has a larger potential than expected and probably deserves more attention from the cryptography community.

To establish these distinguishers, we first use experiments to find high biased 2nd order HDL whose output is active in one bit, and secondly append it with a 1.5-round deterministic linear approximation. Since the round functions of ChaCha are different for odd and even rounds, these 1.5-round linear approximations we use are also different. Yet, all of them are similar to the 1.5-round linear approximation proposed in [CM16, Section 3.1.3] and can be built similarly.

**3.5-round 2nd order HDL with bias close to**  $\frac{1}{2}$ . The input is the 2nd order difference  $(\Delta_0, \Delta_1)$  where  $\Delta_0$  is active in  $X_{12}^0[0]$  and  $\Delta_1$  is active in  $X_{14}^0[0]$ , the output is the difference active in  $X_8^2[0]$ . The bias of this 2nd order HDL is approximately  $\frac{1}{2}$  since among  $2^{30}$  samples, only 131 led to a nonzero difference. The 1.5-round linear approximation with bias  $\frac{1}{2}$  is

$$X_8^2[0] = X_0^{3.5}[0] \oplus X_0^{3.5}[8] \oplus X_0^{3.5}[0] \oplus X_4^{3.5}[12] \oplus X_9^{3.5}[0] \oplus X_{11}^{3.5}[0] \oplus X_{12}^{3.5}[0] \oplus X_{15}^{3.5}[16] \oplus X_{15}^{3.5}[24].$$

We connect the first 2-round 2nd order HDL approximation with the 1.5-round linear approximation to get a 3.5-round 2nd order HDL distinguisher whose bias is almost  $\frac{1}{2}$ .

**4-round 2nd order HDL with bias approximately**  $2^{-1.19}$ . The input is the 2nd order difference  $(\Delta_0, \Delta_1)$  where  $\Delta_0$  is active in  $X_{13}^0[16]$  and  $\Delta_1$  is active in  $X_{14}^0[0]$ , the output is active in  $X_8^2[0]$ . The bias of this 2nd order HDL is approximately  $0.4386 \approx 2^{-1.19}$ , which is close to a deterministic distinguisher. The 1.5-round linear approximation with bias  $\frac{1}{2}$  is

$$X_8^{2.5}[0] = X_1^4[0] \oplus X_1^4[16] \oplus X_2^4[0] \oplus X_6^4[7] \oplus X_8^4[0] \oplus X_{11}^4[0] \oplus X_{12}^4[24] \oplus X_{13}^4[0] \oplus X_{13}^4[8].$$

We connect the first 2.5-round 2nd order HDL approximation with the 1.5-round linear approximation to get a 4-round 2nd order HDL distinguisher whose bias is about  $2^{-1.19}$ .

**4.5-round 2nd order HDL with bias approximately**  $2^{-4.81}$ . The input is the 2nd order difference  $(\Delta_0, \Delta_1)$  where  $\Delta_0$  is active in  $X^0_{14}[12]$  and  $\Delta_1$  is active in  $X^0_{15}[15]$ , the output is active in  $X^0_{8}[0]$ . The bias of this 2nd order HDL is approximately  $0.0357 \approx 2^{-4.81}$ . The 1.5-round linear approximation with bias  $\frac{1}{2}$  is

$$X_8^3[0] = X_0^{4.5}[0] \oplus X_0^{4.5}[8] \oplus X_1^{4.5}[0] \oplus X_5^{4.5}[12] \oplus X_9^{4.5}[0] \oplus X_{11}^{4.5}[0] \oplus X_{12}^{4.5}[16] \oplus X_{12}^{4.5}[24] \oplus X_{15}^{4.5}[0].$$

We connect the first 3-round 2nd order HDL approximation with the 1.5-round linear approximation to get the 4-round 2nd order HDL distinguisher whose bias is about  $2^{-4.81}$ .

The biases of these three 2nd order HDL distinguishers are significantly higher than all previous DL distinguishers, a detailed comparison has been given in Table 1. With these higher biased approximations, the distinguishing attacks on ChaCha/3.5, ChaCha/4 and ChaCha/4.5 can be improved. With a conventional method where we need  $\varepsilon^{-2}$  samples to distinguish the cipher from a random permutation, we need about  $2^2$ ,  $2^{2.38}\approx 11$  and  $2^{9.62}\approx 787$  samples for the three variants of ChaCha. Considering that each sample contains 4 texts, the complexity is then  $2^4=16$ ,  $2^{4.38}\approx 44$  and  $2^{11.61}\approx 3184$  respectively. On the same scale, the previous best DL distinguishers for 4 and 4.5 rounds required  $2\times 2^{6.66}\approx 202$  and  $2\times 2^{12.28}\approx 9947$  chosen texts. The HDL achieves a better performance.

We also tried to construct 2nd order HDL for ChaCha/5. However, we did not find advantageous approximations compared to the existing DL approximations. Firstly, no 2nd order HDL for the first 3.5-round ChaCha was found in our experiments, so we have to construct a 5-round approximation with a 3-round 2nd order HDL and a 2-round linear approximation. We reuse the 2nd order HDL which has been introduced for ChaCha/4.5, *i.e.*, the input is the 2nd order difference  $(\Delta_0, \Delta_1)$  where  $\Delta_0$  is active in  $X_{14}^0[12]$  and  $\Delta_1$  is active in  $X_{15}^0[15]$ , the output is active in  $X_8^2[0]$ . The probability of this 2nd order HDL is approximately  $2^{-4.81}$ . In this case, the bias for the optimal linear approximation with the input mask being active in  $X^2[8][0]$  is  $2^{-2}$ , one of such approximations can also be constructed by the method in [CM16] as follows,

$$\begin{split} X_8^3[0] = & X_0^{4.5}[0] \oplus X_0^{4.5}[8] \oplus X_1^{4.5}[0] \oplus X_5^{4.5}[12] \oplus X_9^{4.5}[0] \oplus X_{11}^{4.5}[0] \oplus X_{12}^{4.5}[16] \\ \oplus X_{12}^{4.5}[24] \oplus X_{15}^{4.5}[0] \end{split}$$

Thus, the overall bias of the approximation for ChaCha/5 is  $2^{-1} \times 2^{-3.81} \times 2^{-4} \approx 2^{-8.81}$ . While the previous best DL has a bias of  $2^{-8.2}$ . Therefore, for ChaCha/5 we found that 2nd order HDL is not better than DL. It implies that when we need to append linear approximations to a higher-order HDL to extend the rounds, the overall bias of the approximations would decrease faster than its DL counterpart.

## F The Illustration of Relationships between $u_0, u_1, \tau, \alpha_0$ and $\alpha_1$

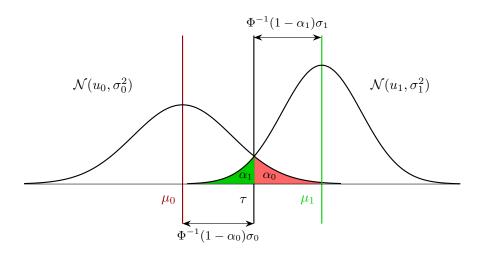


Fig. 2: The relationship among  $u_0, u_1, \tau, \alpha_0$  and  $\alpha_1$