

# Automatic Cryptanalysis Tools

## Paper Read Report: MILP II

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## Paper of Interest

- Zhang, Y., Sun, S., Cai, J., & Hu, L. (2018). Speeding up MILP Aided Differential Characteristic Search with Matsui's Strategy.

# Contents

- Motivation
- Matsui's Algorithm
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- Application to PRESENT, SIMON, and SPECK
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# Motivation

- MILP model can be solved with generic MILP
- Inconvenience in implementing Matsui's algorithm
- Many new ciphers designed for lightweight devices or dedicated use cases
- MILP: sets up R-round model directly
- Matsui's Algo: Uses probability of optimal characteristics in lower rounds

# Matsui's Algorithm

- Continuously branch down each valid trail (DFS)
- Update the probability of reaching some round  $i$  from the previous round;  $P_{Rd(i)}$
- If the probability of reaching this round (from the start) is less than some specified bound, break the algo for this trail
- Improve efficiency by (i) using a larger, valid initial probability, and (ii) updating the current best probability found

# Matsui's Algorithm

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## Algorithm 1. Matsui's Algorithm

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**Input:**  $R \in \mathbb{Z}^*$ ,  $R \geq 2$ ;  $q > 0$ ;  $P_{Best}(1), P_{Best}(2), \dots, P_{Best}(R-1)$

**Output:** differential characteristic  $\mathcal{T} = (\alpha_0, \alpha_1, \dots, \alpha_{R-1}) \in \mathbb{F}_2^n$  where probability  $\mathbb{P}(\mathcal{T}) = P_{Estim}$

```
1 Algorithm OptimalTrail( $R, q, P_{Best}(1), \dots, P_{Best}(R-1)$ )    // Entry Point
2   for each non-zero  $\alpha_1$  do
3        $\mathcal{T} = ()$ ,  $P_{Estim} \leftarrow q$ 
4       Call FirstRound()
5   end
6   if  $\mathcal{T} \neq ()$  then
7       return  $\mathcal{T}$ ,  $P_{Estim} = \mathbb{P}(\mathcal{T})$ 
8   end
9 end
10
11 Function FirstRound()                                         // Subroutine
12    $P_{Rd(1)} \leftarrow \max_{\alpha} \mathbb{P}(\alpha \rightarrow \alpha_1)$ 
13    $\alpha_0 \leftarrow \alpha$ , s.t  $\mathbb{P}(\alpha \rightarrow \alpha_1) = P_{Rd(1)}$ 
14   if  $R > 2$  then
15       Call Round(2)
16   else
17       Call LastRound()
18   end
19 end
```

# Matsui's Algorithm

```

21 Function Round( $r$ ) ( $2 \leq r \leq R - 1$ )                                // Subroutine
22   for each candidate  $\alpha$  for  $\alpha_{r-1}$  do
23      $P_{Rd(r)} \leftarrow \mathbb{P}(\alpha_{r-1} \rightarrow \alpha)$ 
24     if  $\prod_{i=1}^r P_{Rd(i)} \cdot P_{Best}(R - r) \geq P_{Estim}$  then
25       // Matsui's bounding condition
26        $\alpha_r \leftarrow \alpha$ 
27       if  $r + 1 < R$  then
28         | Call Round( $r+1$ )
29       else
30         | Call LastRound()
31       end
32     end
33   end
34 end
35
36
37 Function LastRound()                                                // Subroutine
38   for each candidate  $\alpha$  for  $\alpha_{r-1}$  do
39      $P_{Rd(R)} \leftarrow \max_{\alpha} \mathbb{P}(\alpha_{R-1} \rightarrow \alpha)$ 
40      $\alpha_R \leftarrow \alpha$ , s.t  $\mathbb{P}(\alpha_{R-1} \rightarrow \alpha) = P_{Rd(R)}$ 
41   end
42   if  $\prod_{i=1}^R P_{Rd(i)} > P_{Estim}$  then                                // A strictly better trail is found
43      $\mathcal{T} \leftarrow (\alpha_0, \alpha_1, \dots, \alpha_{R-1})$ 
44      $P_{Festim} \leftarrow \prod_{i=1}^R P_{Rd(i)}$ 
45   end
46 end

```

# MILP Aided Characteristic Search

- Objective Function
- Modelling XOR [MILP 1]
- Modelling S-Box [MILP 1]
- Modelling Modular Addition



# Objective Function

- To minimize the *probability weight* of the underlying differential characteristic
- Recall: (Matsui's Bounding Condition)

$$\prod_{i=1}^r P_{Rd(i)} \cdot P_{Best}(R - r) \geq P_{Estim}$$

- For simplicity, WLOG, assume the condition can be represented (linearly) by:

$$\sum_{i=1}^R \sum_{j=1}^k A_{i,j},$$

where  $A_{i,j}$ 's are *probability weight variables* for  $j \in [1, k]$  in some round  $i$  in an iterative cipher

→ Probability weight contributed by round  $i$  is

$$\sum_{j=1}^k A_{i,j}$$

# Modular Addition in ARX construct

➤ ARX= add-rotate-xor

➤ Addition in  $(\text{mod } 2^n)$

➤ Ex.  $1 + 1 \equiv 0 \pmod{2}$  [XOR]

➤ Ex.  $F(1111) + F(1111) = E(1110) \pmod{F}$

# Setting up the MILP Model

- $d_{\oplus}$  is 0-1 dummy variable
- $s_i$  for  $i \in [1, n - 2]$  is 0-1 active markers

$$\left\{ \begin{array}{l} a_{n-1} + b_{n-1} + c_{n-1} \leq 2 \\ a_{n-1} + b_{n-1} + c_{n-1} - 2d_{\oplus} \geq 0 \\ d_{\oplus} - a_{n-1} \geq 0 \\ d_{\oplus} - b_{n-1} \geq 0 \\ d_{\oplus} - c_{n-1} \geq 0 \\ -a_i + b_i + s_i \geq 0 \\ -b_i + c_i + s_i \geq 0 \\ a_i - c_i + s_i \geq 0 \\ a_i + b_i + c_i - s_i \geq 0 \\ -a_i - b_i - c_i - s_i \geq -3 \\ c_i + a_{i-1} + b_{i-1} - c_{i-1} + s_i \geq 0 \\ -a_i - b_i - c_i + 3a_{i-1} + 3b_{i-1} + 3c_{i-1} + 2s_i \geq 0 \\ a_i + b_i + c_i - 3a_{i-1} - 3b_{i-1} - 3c_{i-1} + 2s_i \geq -6 \\ -b_i + a_{i-1} - b_{i-1} - c_{i-1} + s_i \geq -2 \\ c_i + a_{i-1} - b_{i-1} + c_{i-1} + s_i \geq 0 \\ -a_i - b_i - c_i - 3a_{i-1} + 3b_{i-1} - 3c_{i-1} + 2s_i \geq -6 \\ -a_i - a_{i-1} - b_{i-1} + c_{i-1} + s_i \geq -2 \\ a_i + b_i + c_i - 3a_{i-1} + 3b_{i-1} + 3c_{i-1} + 2s_i \geq 0 \\ (i = 1, \dots, n - 2) \end{array} \right.$$

# Setting up the MILP Model

- $d_{\oplus}$  is 0-1 dummy variable
- $s_i$  for  $i \in [1, n - 2]$  is 0-1 active markers

$$\left\{ \begin{array}{l} a_{n-1} + b_{n-1} + c_{n-1} \leq 2 \\ a_{n-1} + b_{n-1} + c_{n-1} - 2d_{\oplus} \geq 0 \\ d_{\oplus} - a_{n-1} \geq 0 \\ d_{\oplus} - b_{n-1} \geq 0 \\ d_{\oplus} - c_{n-1} \geq 0 \end{array} \right.$$

$$\left\{ \begin{array}{l} -a_i + b_i + s_i \geq 0 \\ -b_i + c_i + s_i \geq 0 \\ a_i - c_i + s_i \geq 0 \end{array} \right.$$

$$\left\{ \begin{array}{l} a_i + b_i + c_i - s_i \geq 0 \\ -a_i - b_i - c_i - s_i \geq -3 \end{array} \right.$$

$$\left\{ \begin{array}{l} c_i + a_{i-1} + b_{i-1} - c_{i-1} + s_i \geq 0 \\ -a_i - b_i - c_i + 3a_{i-1} + 3b_{i-1} + 3c_{i-1} + 2s_i \geq 0 \\ a_i + b_i + c_i - 3a_{i-1} - 3b_{i-1} - 3c_{i-1} + 2s_i \geq -6 \\ -b_i + a_{i-1} - b_{i-1} - c_{i-1} + s_i \geq -2 \\ c_i + a_{i-1} - b_{i-1} + c_{i-1} + s_i \geq 0 \\ -a_i - b_i - c_i - 3a_{i-1} + 3b_{i-1} - 3c_{i-1} + 2s_i \geq -6 \\ -a_i - a_{i-1} - b_{i-1} + c_{i-1} + s_i \geq -2 \\ a_i + b_i + c_i - 3a_{i-1} + 3b_{i-1} + 3c_{i-1} + 2s_i \geq 0 \\ (i = 1, \dots, n - 2) \end{array} \right.$$

# Integrating Matsui's Bounding Condition into MILP Search

- Define  $xobj$  as the linear representation of  $P_{Estim}$ , and let [Minimize  $xobj$ ] be the objective function of the model.

$$xobj = \sum_{i=1}^R \sum_{j=1}^k A_{i,j}$$

# Integrating Matsui's Bounding Condition into MILP Search

➤ Obtaining more constraints:



$$\sum_{t=1}^i \sum_{j=1}^k A_{t,j} + wt(P_{Best}(R - i)) \leq xobj, \quad i \in [1, R - 1]$$



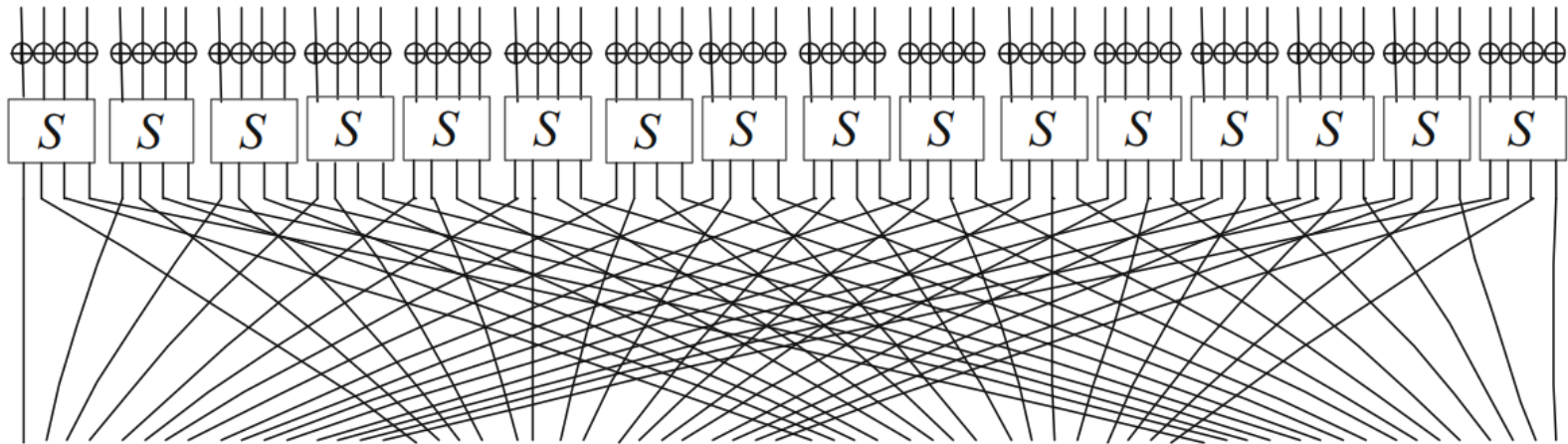
$$\sum_{t=i+1}^R \sum_{j=1}^k A_{t,j} + wt(P_{Best}(i)) \leq xobj, \quad i \in [1, R - 1]$$

\* $2R - 2$  more constraints

# Applications to PRESENT, SIMON, and SPECK

- PRESENT: SPN network
- SIMON: Feistel cipher with pure bitwise operations
- SPECK: ARX construction
- Using 3 models for comparison
  - original MILP without modifications
  - MILP with modified objective function, and R-1 constraints from the first inequality
  - MILP with modified objective function, and all 2R-2 constraints
- Measuring time cost for the solution to prove that the solution it identified is optimal
  - less time → tighter bound → more accurate security evaluation

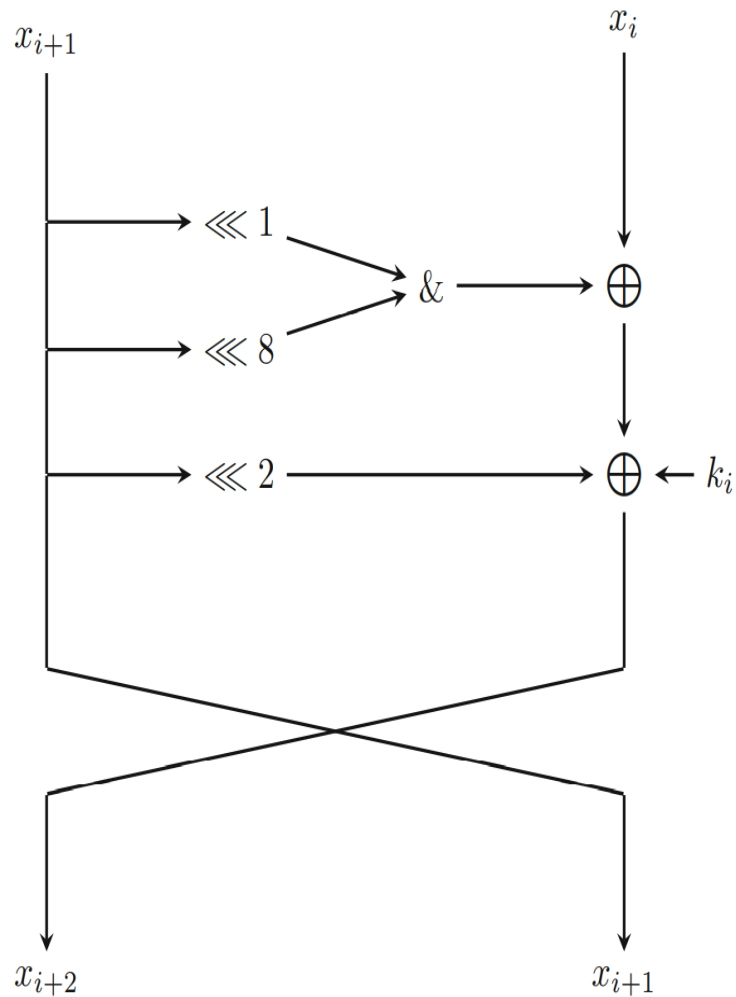
# Applications to PRESENT



$R$	$p$	$\mathcal{M}^I$	$\mathcal{M}^{II}$	$\mathcal{M}^{III}$
1	$2^{-2}$	0.01s	0.09s	0.13s
2	$2^{-4}$	0.95s	0.95s	0.06s
3	$2^{-8}$	3.70s	2.82s	2.43s
4	$2^{-12}$	15.78s	10.08s	8.82s
5	$2^{-20}$	629.83s	114.13s	448.61s
6	$2^{-24}$	1740.55s	200.03s	74.56s
7	$2^{-28}$	48638.29s	714.03s	655.36s
8	$2^{-32}$	>10h	2124.51s	1074.45s



# Applications to SIMON

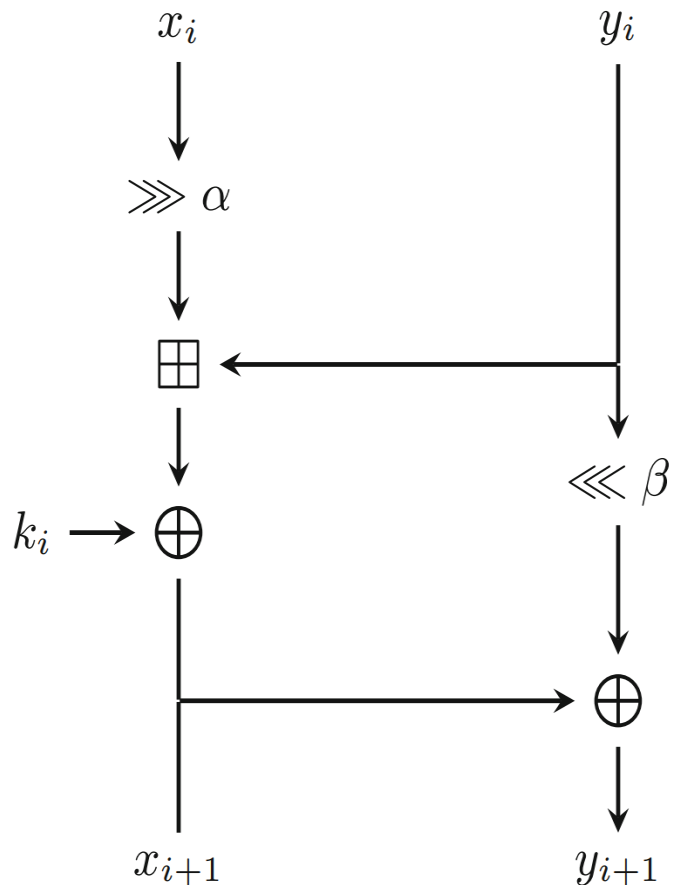


Parameters for SIMON32 and SIMON48

Variant $2n/mn$	Block Size $2n$	Key Size $mn$	Round $r$
32/64	32	64	32
48/72	48	72	36
48/96	48	96	36

Block size $2n$	$R$	$p$	$\mathcal{M}^I$	$\mathcal{M}^{II}$	$\mathcal{M}^{III}$
32	11	$2^{-30}$	75.05s	79.22s	67.92s
	12	$2^{-34}$	657.37s	559.83s	209.09s
48	13	$2^{-38}$	309.58s	376.33s	109.85s
	14	$2^{-44}$	4627.26s	3577.05s	2942.85s
	15	$2^{-46}$	31979.80s	3351.41s	2444.28s
	16	$2^{-50}$	>20h	>15h	26589.96s

# Applications to SPECK



Parameters for SPECK32 and SPECK48

Variant	$2n/mn$	Block Size $2n$	Key Size $mn$	Round $r$	$\alpha$	$\beta$
32/64		32	64	22	7	2
48/72		48	72	22	8	3
48/96		48	96	23	8	3

Block size $2n$	$R$	$p$	$\mathcal{M}^I$	$\mathcal{M}^{II}$	$\mathcal{M}^{III}$
32	5	$2^{-9}$	9.78s	17.15s	26.08s
	6	$2^{-13}$	173.67s	820.82s	390.33s
	7	$2^{-18}$	7175.87s	>10000s	>10000s
48	5	$2^{-10}$	32.90s	358.11s	273.98s
	6	$2^{-14}$	1482.66s	2626.50s	2287.21s
	7	$2^{-19}$	40860.38s	>100000s	>100000s

# Potential Considerations

- PRESENT: New MILP model v. Matsui's Algorithm
- Non-lightweight ciphers
- Integrating cutting-off inequalities (mentioned in MILP 1)

# Related Readings

- Heys, H.: A Tutorial on Linear and Differential Cryptanalysis. Computer Science Department, Boston College. <http://www.cs.bc.edu/~straubin/crypto2017/heys.pdf>
- Mouha, N., Wang, Q., Gu, D., Preneel, B.: Differential and linear cryptanalysis using mixed-integer linear programming. In: Wu, C.-K., Yung, M., Lin, D. (eds.) Inscrypt 2011. LNCS, vol. 7537, pp. 57–76. Springer, Heidelberg (2012). [https://doi.org/10.1007/978-3-642-34704-7\\_5](https://doi.org/10.1007/978-3-642-34704-7_5)
- Sun, S., et al.: Towards finding the best characteristics of some bit-oriented block ciphers and automatic enumeration of (related-key) differential and linear characteristics with predefined properties. Cryptology ePrint Archive, Report 2014/747(2014). <http://eprint.iacr.org/2014/747>
- Sun, S., Hu, L., Wang, P., Qiao, K., Ma, X., Song, L.: Automatic security evaluation and (related-key) differential characteristic search: application to SIMON, PRESENT, LBlock, DES(L) and other bit-oriented block ciphers. In: Sarkar, P., Iwata, T. (eds.) ASIACRYPT 2014. LNCS, vol. 8873, pp. 158–178. Springer, Heidelberg (2014). [https://doi.org/10.1007/978-3-662-45611-8\\_9](https://doi.org/10.1007/978-3-662-45611-8_9)
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- Li, H.: Some Basics. School of Physical and Mathematical Sciences, Nanyang Technological University

Thank you 😊