SAT-aided Automatic Search of Boomerang Distinguishers for ARX Ciphers

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Background: Boomerang Distinguishers



The whole cipher is separated into two parts.

Under an independence assumption, these two differential characteristics can be connected.

Background: Boomerang Distinguishers



A new part is seperated out.

To analysis the connectivity of two characteristics, new cryptanalysis is put on the middle part.

Typically, cryptanalysis on E_m is reduced to that on the non-linear operations.

Background: Boomerang Tables



Boomerang Connectivity Table (BCT)

 $\operatorname{BCT}(\Delta,
abla)=\#\left\{x\in \mathbb{F}_2^n\mid S^{-1}(S(x)\oplus
abla)\oplus S^{-1}(S(x\oplus\Delta)\oplus
abla)=\Delta
ight\}$

Variants of BCT [DDV20]

$$egin{aligned} ext{UBCT}(\Delta,\Delta',
abla)&=\#\left\{x\in\mathbb{F}_2^n\midrac{S(x)\oplus S(x\oplus\Delta)=\Delta'}{S^{-1}(S(x)\oplus
abla)\oplus S^{-1}(S(x\oplus\Delta)\oplus
abla)=\Delta}
ight\}\ ext{LBCT}(\Delta,
abla',
abla',
abla)&=\#\left\{x\in\mathbb{F}_2^n\midrac{S(x)\oplus S(x\oplus
abla')=
abla}{S^{-1}(S(x)\oplus
abla)\oplus S^{-1}(S(x\oplus\Delta)\oplus
abla)\oplus
abla)=\Delta'\ ext{EBCT}(\Delta,\Delta',
abla',
abla',
abla)&=\#\left\{x\in\mathbb{F}_2^n\mid S(x)\oplus S(x\oplus\Delta)=\Delta'\ ext{S}^{-1}(S(x\oplus
abla)\oplus
abla)=\Delta'\ ext{S}^{-1}(S(x)\oplus
abla)=\Delta'\ ext{S}^{-1}(S(x\oplus
abla)\oplus
abla)=\Delta'\ ext{S}^{-1}(S(x\oplus
abla))=\Delta'\ ext{S}^{-1}(S(x\oplus
abla))=
abla, \end{aligned} \right\}$$

Motivation



The previous result was given by Cid et al..

In fact, the result can be derived from BCT on S-boxes. View the modular addition as a special S-box:

 $S(L\|R) = (L+R)\|R$

 $\mathrm{BCT}_n(\Delta_l,\Delta_r,
abla_l,
abla_r,
abla_l,
abla_r,
abla_r) = \#igg\{(L,R)\in\mathbb{F}_2^n imes\mathbb{F}_2^n\mid \left(\left((L\boxplus_nR)\oplus
abla_ligg)\boxminus_n(R\oplus
abla_r)
ight)\oplus\left(\left(\left((L\oplus\Delta_l)\boxplus_n(R\oplus\Delta_r)igg)\oplus
abla_ligg)\boxplus_n(R\oplus\Delta_r\oplus
abla_r)
ight)=\Delta_ligg\}$

Motivation



The BCT is too large!

Is there a fast method to compute one entry?

Can we construct SAT/MILP models for it?

Any new results on ARX ciphers?

 $\mathrm{BCT}_n(\Delta_l,\Delta_r,
abla_l,
abla_r,
abla_l,
abla_r,
abla_r) = \#iggl\{(L,R)\in\mathbb{F}_2^n imes\mathbb{F}_2^n\mid \left(\left((L\boxplus_nR)\oplus
abla_l
ight)\boxminus_n(R\oplus
abla_r)
ight)\oplus\left(\left(\left((L\boxplus_nR)\oplus
abla_l
ight)\boxplus_n(R\oplus
abla_r)
ight)\oplus
abla_liggr\}$

Our Contributions

- Design a dynamic programming algorithm to compute the BCT and its variants of the modular addition.
- **2** Construct SAT models for these tables.
- **3** Take Speck and LEA as examples, and improve the previous results.

Relations between modular addition (subtraction) and XOR

$$x \boxplus_n y = x \oplus y \oplus \operatorname{carry0}_n(x,y)$$

$$x oxdot_n y = x oxdot_n ar y oxdot_n 1 = x \oplus ar y \oplus \operatorname{carryl}_n(x,ar y)$$

Function $c = \operatorname{carry0}_n(x, y)$

$$c[i] = egin{cases} 0 & i=0\ (x[i-1] \wedge y[i-1]) \oplus (x[i-1] \wedge c[i-1]) \oplus (y[i-1] \wedge c[i-1]) & i>0 \end{cases}$$

Function $\overline{b} = \operatorname{carry1}_n(x, y)$

$$b[i]=egin{cases} 1 & i=0\ (x[i-1]\wedge y[i-1])\oplus (x[i-1]\wedge b[i-1])\oplus (y[i-1]\wedge b[i-1]) & i>0 \end{cases}$$

 $\mathrm{BCT}_n(\Delta_l, \Delta_r, \nabla_l, \nabla_r)$ $= \# \Big\{ (L,R) \in \mathbb{F}_2^n imes \mathbb{F}_2^n \mid \Big(ig((L oxplus_n R) \oplus
abla_l ig) oxplus_n (R \oplus
abla_r) \Big) \oplus ig(ig(((L oxplus \Delta_r \oplus
abla_r) ig) oxplus \Delta_r \oplus
abla_r) \Big) = \Delta_l \Big\}$ $c_1 = \operatorname{carry0}_n(L, R)$ $b_1 = \operatorname{carry1}_n(L \oplus R \oplus c_1 \oplus
abla_l, R \oplus
abla_r)$ $c_2 = \operatorname{carry0}_n(L \oplus \Delta_l, R \oplus \Delta_r)$ $b_2 = \mathrm{carry1}_n(L \oplus \Delta_l \oplus R \oplus \Delta_r \oplus c_2 \oplus
abla_l, R \oplus \Delta_r \oplus
abla_r)$ $\mathrm{BCT}_n(\Delta_l, \Delta_r, \nabla_l, \nabla_r)$ $= \ \# \Big\{ (L,R) \in \mathbb{F}_2^n imes \mathbb{F}_2^n \mid c_1 \oplus b_1 \oplus c_2 \oplus b_2 = 0 \Big\}$ $egin{aligned} &= \#\Big\{(L,R)\in \mathbb{F}_2^n imes \mathbb{F}_2^n \mid orall i\in [0,n-1], c_1[i]\oplus b_1[i]\oplus c_2[i]\oplus b_2[i]=0\Big\} \end{aligned}$

$$\operatorname{BCT}_n(\Delta_l,\Delta_r,
abla_l,
abla_r,
abla_l,
abla_r)=\#\Big\{(L,R)\in \mathbb{F}_2^n imes \mathbb{F}_2^n\mid orall i\in [0,n-1], c_1[i]\oplus b_1[i]\oplus c_2[i]\oplus b_2[i]=0\Big\}$$

Every equation $c_1[i] \oplus b_1[i] \oplus c_2[i] \oplus b_2[i] = 0$ is a restriction on L[i-1] and R[i-1]. What about L[n-1] and R[n-1]? **FREE!**

The four bit string $c_1[i]||b_1[i]||c_2[i]||b_2[i]$ can only take **8** possible values: $S_{BCT} = \{0000, 0011, 0101, 0110, 1001, 1010, 1110, 1111\}$

$$\operatorname{BCT}_n(\Delta_l,\Delta_r,
abla_l,
abla_r,
abla_l)=\#\Big\{(L,R)\in \mathbb{F}_2^n imes \mathbb{F}_2^n\mid orall i\in [0,n-1], c_1[i]\oplus b_1[i]\oplus c_2[i]\oplus b_2[i]=0\Big\}$$

$$\operatorname{BCT}_{n}(\Delta_{l},\Delta_{r},\nabla_{l},\nabla_{r}) = \left\{ \begin{array}{c} L[n-1] = 0, R[n-1] = 0, c_{1}[n-1] \|b_{1}[n-1]\|c_{2}[n-1]\|b_{2}[n-1] = 0000\\\\ L[n-1] = 0, R[n-1] = 0, c_{1}[n-1] \|b_{1}[n-1]\|c_{2}[n-1]\|b_{2}[n-1] = 0011\\\\\\ \ldots\\\\\\ L[n-1] = 0, R[n-1] = 1, c_{1}[n-1]\|b_{1}[n-1]\|c_{2}[n-1]\|b_{2}[n-1] = 0000\\\\\\\\ \ldots\\\\\\\\ L[n-1] = 1, R[n-1] = 1, c_{1}[n-1]\|b_{1}[n-1]\|c_{2}[n-1]\|b_{2}[n-1] = 1111\\\\\end{array} \right\}$$

$$egin{aligned} &\mathrm{BCT}_n(\Delta_l,\Delta_r,
abla_l,\nabla_r)=\#\Big\{(L,R)\in\mathbb{F}_2^n imes\mathbb{F}_2^n\midorall i\in[0,n-1],c_1[i]\oplus b_1[i]\oplus c_2[i]\oplus b_2[i]=0\Big\}\ &=4 imes\sum_{v\in S_{\mathrm{BCT}}}\#\Big\{rac{(L^{n-1},R^{n-1})}{\in\mathbb{F}_2^{n-1} imes\mathbb{F}_2^{n-1}}\midrac{c_1[n-1]\|b_1[n-1]\|c_2[n-1]\|b_2[n-1]=v}{orall j\oplus c_2[j]\oplus b_2[j]=0}\Big\}\ &=4 imes\sum_{v\in S_{\mathrm{BCT}}}f(n-1,v) \end{aligned}$$

NEW GOAL: how to compute function f(n-1, v)?

$$f(n-1,v)=\#\left\{(L^{n-1},R^{n-1})\in \mathbb{F}_2^{n-1} imes \mathbb{F}_2^{n-1} \mid egin{smallmatrix} c_1[n-1]\|b_1[n-1]\|c_2[n-1]\|b_2[n-1]=v\ orall j\in [0,n-2], c_1[j]\oplus b_1[j]\oplus c_2[j]\oplus b_2[j]=0
ight\}$$

$$f(n-1,v)=\#\left\{(L^{n-1},R^{n-1})\in \mathbb{F}_2^{n-1} imes \mathbb{F}_2^{n-1} \mid egin{smallmatrix} c_1[n-1]\|b_1[n-1]\|c_2[n-1]\|b_2[n-1]=v\ orall j\in [0,n-2], c_1[j]\oplus b_1[j]\oplus c_2[j]\oplus b_2[j]=0
ight\}$$

$g(u,v,L[i],R[i],\Delta_l[i],\Delta_r[i], abla_r[i], abla_r[i], abla_r[i])$

Denote whether the chosen values of L[n-2] and R[n-2] are valid.

$$f(n-1,v) = \# \left\{ (L^{n-1},R^{n-1}) \in \mathbb{F}_2^{n-1} imes \mathbb{F}_2^{n-1} \mid egin{smallmatrix} c_1[n-1] \| b_1[n-1] \| c_2[n-1] \| b_2[n-1] = v \ orall j \in [0,n-2], c_1[j] \oplus b_1[j] \oplus c_2[j] \oplus b_2[j] = 0
ight\}$$

$$= \sum_{u \in S_{ ext{BCT}}} \sum_{L[n-2], R[n-2] \in \mathbb{F}_2} g(u, v, L[n-1], R[n-2], \Delta_l[n-2], \Delta_r[n-2], \nabla_l[n-2],
abla_r[n-2], \nabla_r[n-2]) f(n-2, u)$$

$$= \sum_{u \in S_{ ext{BCT}}} f(n-2,u) \sum_{L[n-2], R[n-2] \in \mathbb{F}_2} g(u,v,L[n-2],R[n-2],\Delta_r[n-2],
abla_r[n-2],
abl$$

$$I=\sum_{u\in S_{
m BCT}} \overline{T(u,v,\Delta_l[n-2],\Delta_r[n-2],
abla_r[n-2],
abla_r[n$$

Recursive definition again!

Theorem 2

Let
$$S'_{BCT} = \{0000, 0011, 0101, 0110\}$$
. For $u, v \in S'_{BCT}$, denote $f'(i, v) = f(i, v) + f(i, \overline{v})$ and

$$T'(u, v, \Delta_l[i], \Delta_r[i], \nabla_l[i], \nabla_r[i]) = T(u, v, \Delta_l[i], \Delta_r[i], \nabla_l[i], \nabla_r[i]) + T(u, v, \Delta_l[i], \Delta_r[i], \nabla_l[i], \nabla_r[i])$$
Then
 $f'(i+1, v) = \sum_{u \in S'_{BCT}} T'(u, v, \Delta_l[i], \Delta_r[i], \nabla_l[i], \nabla_r[i]) f'(i, u)$

Algorithm 1 A dynamic programming algorithm to compute f.

1: procedure $DP(n, v, \Delta_l, \Delta_r, \nabla_l, \nabla_r)$ \triangleright The value of f(n, v) where $v \in S_{BCT}$ Initialize a hash table T_{dp} such that, for all $u \in S_{BCT}$, $T_{dp}[u] = 0$ except that 2: $T_{dp}[0101] = 1;$ for all $i \in \{0, 1, 2, \dots, n-1\}$ do 3: Initialize a hash table T'_{dp} such that $T'_{dp}[u] = 0$ for all $u \in S_{BCT}$; 4: for all $u \in S_{BCT}$ do 5: for all $u' \in S_{BCT}$ do 6: Look up the value $T(u', u, \Delta_l[i], \Delta_r[i], \nabla_l[i], \nabla_r[i])$. Assume that it is t; 7: $\begin{array}{c} L \\ T_{dp}'[u] \leftarrow T_{dp}'[u] + t \times T_{dp}[u']; \\ T_{dp} \leftarrow T_{dp}'; \end{array}$ 8: 9: return $T_{dp}[v]$; 10:

$$f'(n,v) = \sum_{u \in S'_{
m BCT}} T'(u,v,\Delta_l[n-1],\Delta_r[n-1],
abla_r[n-1],
abla_r[n-1],$$

Algorithm 3 A dynamic programming algorithm to check an entry in BCT.

1: procedure ISZERO $(n, \Delta_l, \Delta_r, \nabla_l, \nabla_r)$ Initialize a hash table T_{dp} such that, for all $u \in S_{BCT}$, $T_{dp}[u] = False$ except that 2: $T_{dp}[0101] = True;$ for all $i \in \{0, 1, 2, \dots, n-1\}$ do 3: Initialize a hash table T'_{dp} such that $T'_{dp}[u] = False$ for all $u \in S_{BCT}$; 4: for all $u \in S'_{BCT}$ do 5: for all $u' \in S'_{BCT}$ do 6: Look up the value $T'_b(u', u, \Delta_l[i], \Delta_r[i], \nabla_l[i], \nabla_r[i])$. Assume that it is t; 7: $\begin{bmatrix} T'_{dp}[u] \leftarrow T'_{dp}[u] \lor (t \land T_{dp}[u']); \\ T_{dp} \leftarrow T'_{dp}; \end{bmatrix}$ 8: 9: $sum \leftarrow False;$ 10: check whether the BCT entry is non-zero or not. for all $u \in S'_{BCT}$ do 11: $sum \leftarrow sum \lor T_{dp}[u];$ 12: **return** sum; \triangleright sum is True if the entry is non-zero and False if it is zero. 13:

$$f_b'(n,v) = \max_{u \in S_{
m BCT}'} T_b'(u,v,\Delta_l[n-1],\Delta_r[n-1],
abla_r[n-1],
abla_r[n$$

If, for all $u \in S'_{\mathrm{BCT}}$, we have $T'(u, u, \Delta_l[i-1], \Delta_r[i-1], \nabla_l[i-1], \nabla_r[i-1])
eq 0$, then

$$\sum_{v \in S'_{ ext{BCT}}} f'(i,v) = 4 imes \sum_{u \in S'_{ ext{BCT}}} f'(i-1,u)$$

Note that:
$$\operatorname{BCT}_n(\Delta_l, \Delta_r,
abla_l,
abla_r) = 4 imes \sum_{v \in S'_{\operatorname{BCT}}} f'(n-1, v).$$

If, for all $u \in S'_{\mathrm{BCT}}$, we have $T'(u, u, \Delta_l[i-1], \Delta_r[i-1], \nabla_l[i-1], \nabla_r[i-1])
eq 0$, then

$$\sum_{e\in S_{
m BCT}'} f'(i,v) = 4 imes \sum_{u\in S_{
m BCT}'} f'(i-1,u) \, ,$$

A Heuristic Trick (Partial BCT)

v

If k out of n-1 these equations are required to be satisfied, the resulting BCT entry would be $4^{k+1}q$. That is, just express k restrictions

"for all $u \in S_{\mathrm{BCT}}'$, $T'(u, u, \Delta_l[i-1], \Delta_r[i-1], \nabla_l[i-1], \nabla_r[i-1])
eq 0$ "

as boolean expressions.

A Heuristic Trick (Partial BCT)

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"for all
$$u \in S_{\mathrm{BCT}}'$$
, $T'(u, u, \Delta_l[i-1], \Delta_r[i-1],
abla_l[i-1],
abla_r[i-1], \nabla_l[i-1], \nabla_r[i-1])
eq 0$ "

as boolean expressions.

8	8	8	8	expect: $4^{k+1}q$ with $q > 1$?	?	?	?
8	0	2	6		?	?	?	?
8	4	2	4		?	?	?	?
8	2	6	2		?	?	?	?

A Heuristic Trick (Partial BCT)

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, $T'(u, u, \Delta_l[i-1], \Delta_r[i-1], \nabla_l[i-1], \nabla_r[i-1])
eq 0$ "

as boolean expressions.

- Fact: 1 Currently, we lack enough knowledge about q.
 - 2 The resulting partial BCT still contains values with q < 1.
 - 3 Our experiments showed that the models always return BCT entries with values around 4^{k+1} .

Modelling: The Complete Model

Algorithm 3 A dynamic programming algorithm to check an entry in BCT.

```
1: procedure ISZERO(n, \Delta_l, \Delta_r, \nabla_l, \nabla_r)
          Initialize a hash table T_{dp} such that, for all u \in S_{BCT}, T_{dp}[u] = False except that
 2:
          T_{dp}[0101] = True;
          for all i \in \{0, 1, 2, \dots, n-1\} do
 3:
               Initialize a hash table T'_{dp} such that T'_{dp}[u] = False for all u \in S_{BCT};
 4:
               for all u \in S'_{BCT} do
 5:
                    for all u' \in S'_{BCT} do
 6:
                         Look up the value T'_b(u', u, \Delta_l[i], \Delta_r[i], \nabla_l[i], \nabla_r[i]). Assume that it is t;
 7:
            \begin{bmatrix} T'_{dp}[u] \leftarrow T'_{dp}[u] \lor (t \land T_{dp}[u']); \\ \overline{T}_{dp} \leftarrow T'_{dp}; \end{bmatrix}
 8:
 9:
          sum \leftarrow False;
10:
           \text{for all } u \in S'_{\text{BCT}} \text{ do} \qquad (1) \ \forall u \in S'_{\text{BCT}}, T'_{dp}[u] = \bigvee_{u' \in S'} \left( T'_b(u', u, \Delta_l[i], \Delta_r[i], \nabla_l[i], \nabla_r[i]) \land T_{dp}[u'] \right) 
11.
                                                                                                    u' \in S'_{
m BCT}
               sum \leftarrow sum \lor T_{dp}[u];
12:
          return sum; \triangleright sum is True if the entry is non-zero and False if it is zero.
13:

ightarrow (2) \;\; f_b'(n-2,0000) \lor f_b'(n-2,0011) \lor f_b'(n-2,0101) \lor f_b'(n-2,0110) = True
```

Modelling: The Complete Model

A Heuristic Trick (Partial BCT)

If k out of n-1 these equations are required to be satisfied, the resulting BCT entry would be $4^{k+1}q$. That is, just express k restrictions

"for all $u \in S_{\mathrm{BCT}}'$, $T'(u,u,\Delta_l[i-1],\Delta_r[i-1],
abla_l[i-1],
abla_r[i-1],
a$



(3)

Modelling: The Complete Model

Framework 1

- Set the product of the probabilities of two differential characteristics as the objective function and maximize it.
- 2 Compute the probability of the switch and obtain the total probability.
- **3** Tweak the threshold and repeat step 1 and step 2 until a desired boomerang distinguisher is found.

It is fast but may miss better characteristics.

Suitable for long characteristics or complicated switches.

Framework 2

- Set the product of the probabilities of two differential characteristics as the objective function. Set the threshold to 0. Then, maximize it. This step returns the upper bound of the probability of boomerang distinguishers.
- 2 Set the threshold and the upper bound of the probability and enumerate all the charateristics. Take the largest cluster and enumerate all possible characteristics in it. Compute the probability of the cluster and return.
- 3 Tweak the threshold and upper bound. Repeat step 2 until a desired boomerang distinguisher is found.

It is slow but can take the advantage of clustering effect.

Suitable for short characteristics or simple switches.

The Results

Cipher	Rounds	$-\log_2$ EST.	Prob. EXP.	Input difference of E_0 (hex)	Output difference of E_1 (hex)
SPECK32/64	10	$29.15 \\ 29.17 \\ 29.78$	27.34 27.39 28.43	$\begin{array}{c} 2800 \parallel 0010 \\ 0014 \parallel 0800 \\ 2800 \parallel 0010 \end{array}$	$\begin{array}{c ccccccccccccccccccccccccccccccccccc$
SPECK48/72	12	$\begin{array}{c} 44.15 \\ 46.41 \\ 47.93 \end{array}$	- -	020082 120200 820200 001202 820200 001202	$\begin{array}{c ccccccccccccccccccccccccccccccccccc$

Table 5: The Estimated Probabilities of the Switch in LEA

Method	Prob.	Time^*
[KKS20]	0.661755	221 milliseconds
ARXtools	0.710850	34 seconds
Our SAT-aided Method	0.708521	17 hours
Experimental Evaluation	0.71	17 hours

- 1 The dynamic programming algorithm and ARXtools are based on the same property of modular additions, but they are constructed from two different perspectives.
- 2 From our perspective, more mathmatical properties behind the modular addition are revealed.
- 3 When estimating probabilities, ARXtools is faster and more precise.
- 4 Our technique is capable of searching characteristics, while ARXtools cannot.

Conclusion

Results:

- A dynamic programming algorithm to compute the BCT entries of the modular addition.
- **2** SAT models for partial BCT, LBCT, UBCT, and EBCT.
- 3 New results on Speck and LEA.

Limitations:

- 1 The current computations of BCT and its variants are not convenient to be modelled.
- **2** The models for switches are large.
- 3 Optimal distinguishers are still unknown.
- 4 Comparing with ARXtools, our computation of probabilities are slow.

All the codes are publicly available at https://github.com/0NG/boomerang_search

Thank you very much for your attention!