## Cryptanalysis of ARX-based White-box Implementations

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SnT

## Plan

Introduction and the target design

Attack summary

Decomposition attack (affine encoding)

Decomposing attack (quadratic encoding)

Conclusions

## White-box cryptography

- Implementation fully available, secret key unextractable?
- Extra: one-wayness, incompressibility, traitor traceability, ...


## White-box cryptography

- Implementation fully available, secret key unextractable?
- Extra: one-wayness, incompressibility, traitor traceability, ...
- The most challenging:
existing symmetric primitives, e.g. the AES, Speck


## Implicit computations (Ranea, Vandersmissen, and Preneel 2022)

Let $y=F(x)$

- usual method: write down polynomials or a circuit for $F$ :

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\begin{aligned}
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- how to compute $y$ from $x$ ?

1. require that $P(x, y)$ is linear in $y$
2. plug in value for $x=\bar{x}$
3. solve linear system $P(\bar{x}, y)=0$ for $y$

## Implicit ARX (Ranea, Vandersmissen, and Preneel 2022)

Modular addition

- let $\boxplus$ denote word addition (modulo $2^{n}$ )
- $i$-th output bit (from LSB) has degree $i$
- $\Rightarrow \boxplus$ has degree $n-1$
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Why implicit?

- let $I, O$ be input/output encodings, $I$ low-degree, $O$ linear
- polynomial $P(I(x), O(y))$ can be written compactly (representing $O \circ F \circ I$ )
- obfuscate using graph automorphisms

Self-equivalences (Vandersmissen, Ranea, and Preneel 2022; Ranea, Vandersmissen, and Preneel 2022)


## Block-cipher family Speck

- Designed by NSA (2014)
- Simple ARX structure (1 round $\stackrel{\text { aff }}{\sim}(x \boxplus y, y))$
- Block size: 32, 48, 64, ... (2 words)
- Key size: $64,72,96, \ldots$ ( $2-4$ words)



## Speck-based implicit ARX white-box



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Affine-quadratic self equivalence of $E^{(i)}$


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- repeat $\rightarrow$ get $B_{1}[0], B_{2}[0]$


## Step 3: recover left-branch maps



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3. recover $T_{1}, T_{2}$
using differential probabilities


## Step 3: recover left-branch maps

Proposition 4. Let $z=x \boxplus y$ be an $n$-bit modular addition, $n \geq 3$. Set

$$
\Delta y=0, \quad \Delta x_{1}=e_{0}=(0,0,0, \ldots, 0,1), \quad \Delta x_{2}=e_{0} \oplus e_{n-2}=(0,1,0, \ldots, 0,1) .
$$

Then, the most probable transitions with input differences $\left(\Delta x_{1}, \Delta y\right)$ and $\left(\Delta x_{2}, \Delta y\right)$ respectively are described by

$$
\begin{align*}
& \operatorname{Pr}\left[\left(\Delta x_{1}, \Delta y\right) \xrightarrow{\boxplus} \Delta z\right]= \begin{cases}1 / 2, & \Delta z=(0, \ldots, 0,0,1)=\Delta x_{1}, \\
1 / 4, & \Delta z=(0, \ldots, 0,1,1), \\
\leq 1 / 4, & \text { otherwise } \ldots\end{cases}  \tag{4}\\
& \operatorname{Pr}\left[\left(\Delta x_{2}, \Delta y\right) \xrightarrow{\boxplus} \Delta z\right]= \begin{cases}1 / 4, & \Delta z=(0,1, \ldots, 0,1)=\Delta x_{2}, \\
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4. recover $A_{1}, A_{2} \boxplus c_{1}, A_{3}$
by fixing righthand side

- 8 solutions per $y$
- choose arbitrarily
- combine for lin. indep. y's
- $\Rightarrow$ a solution
- (with some annoyances due to the carry $c_{1}$ )


## Step 5: finishing



1. recover affine equivalence of $c_{1} \stackrel{\text { aff }}{\sim} y_{0} y_{1}$ (next slides)
2. move out the recovered Feistel maps $A_{1}, A_{2}, A_{3}$
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- let $S:(x, y) \mapsto(x \boxplus y, y)$
- let $A, Q$ be affine-quadratic self-equiv. of $S$ : $S=Q \circ S \circ A$
- theorem: half of outputs of $Q$ has to be linear



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- theorem: half of outputs of $Q$ has to be linear
- experimental: at most 3 quadratic outputs (linearly independent)
- experimental: each of them consists of 1-2 quadratic monomials (up to affine-equivalence)
- example:
$x_{0} y_{0},\left(x_{n-1}+y_{n-1}\right)\left(x_{1}+x_{5}+\ldots+y_{1}+y_{5}+\ldots\right)$



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- right branch leaks the quadratic monomials of $B$
- degree-2 outputs zero-sum on any 3 -dimensional subspace
- but not on all 2-dimensional subspaces (separate from degree-1 output)
- linear algebra to find corresp. part of $C^{(i)}$



## Step 2: decompose into monomials

## Problem

Given quadratic Boolean polynomial $f$, find a linear map $A$ such that $f(A(x))$ has smallest number of quadratic terms

## Example

Instance: $f(x)=x_{0} x_{2}+x_{0} x_{5}+x_{0} x_{6}+x_{1} x_{3}+x_{1}+x_{2} x_{3}+x_{2} x_{5}+x_{2} x_{6}+x_{2}+x_{5}+x_{6}$

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## Definition (Linear Structures)

A linear structure $\delta$ of $f$ is a probability- 1 differential over $f$ :

$$
\exists c \forall x \quad f(x+\delta)=f(x)+c
$$

Method: the dual space of LS is exactly the space of target linear combinations

## Step 3: algebraic recovery of $Q^{\prime}$



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1. inversion of $Q$ - easy due to sparsity
2. "detach" $Q$ from current round and "attach" to the previous round
3. run affine-encoded decomposition attack
4. combine round decompositions
5. extract subkeys (Vandersmissen, Ranea, and Preneel 2022)
6. recompute the master key (from 4 consecutive subkeys)

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> github.com/cryptolu/implicit_ARX_whitebox_cryptanalysis tches.iacr.org/index.php/TCHES/article/view/10958

