

# A Method For Generation Of High-Nonlinear S-Boxes Based On Gradient Descent

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# Agenda

- 1 Introduction
- 2 Preliminaries
- 3 Optimal substitutions
- 4 A new method to generate optimal substitutions
- 5 Conclusions & Open problems

# What is a substitution?

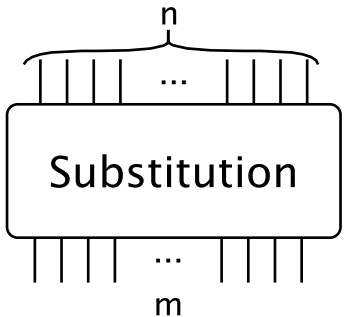
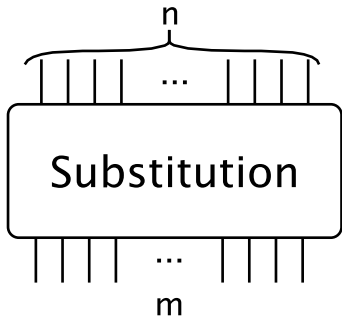


Figure 1: A Substitution Box

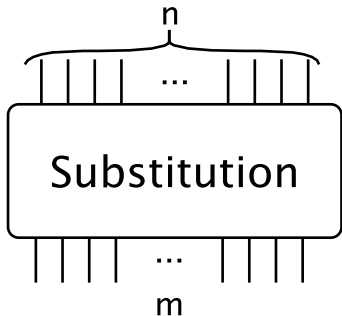
# What is a substitution?



## Possible variants

- $n > m$
- $n < m$
- $n = m$

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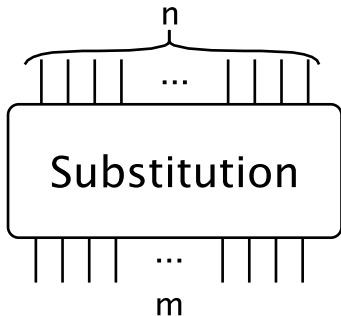


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- $n < m$
- $n = m$ 
  - $\#img(S\text{-box}) = 2^n$

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- $n > m$
- $n < m$
- $n = m$ 
  - $\#img(S\text{-box}) = 2^n$

## Representation

- lookup tables
- vectorial Boolean functions
  - Boolean functions
- system of equations

Figure 1: A Substitution Box

# Application of S-boxes

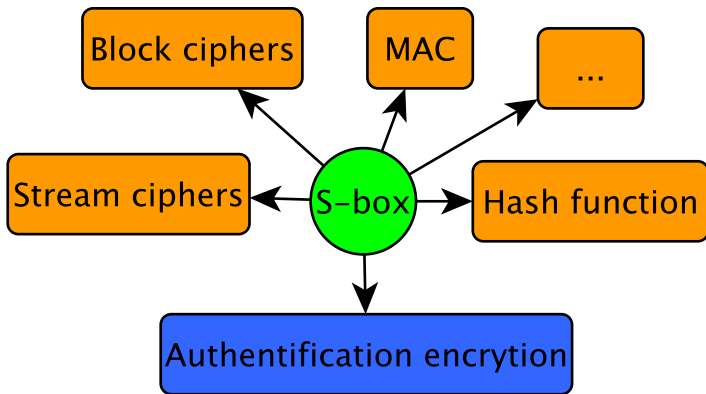


Figure : Usage of S-boxes

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# Properties of substitutions (1/5)

## Definition

Let  $n$  and  $m$  be two positive integers. Any function  $F : \mathbb{F}_2^n \mapsto \mathbb{F}_2^m$  is called an  $(n, m)$ -function or vectorial Boolean function [1].

## $\delta$ -uniform

Arbitrary  $F$  is differentially  $\delta$ -uniform if equation

$$b = F(x) + F(x + a), \quad \forall a \in \mathbb{F}_2^n, \forall b \in \mathbb{F}_2^m, a \neq 0$$

has at most  $\delta$  solutions.

# Properties of substitutions (2/5)

## Walsh transform

The **Walsh transform** of an  $(n, m)$ -function  $F$  at  $(u, v) \in \mathbb{F}_2^n \times \mathbb{F}_2^m \setminus \{0\}$

$$\lambda(u, v) = \sum_{x \in \mathbb{F}_2^n} (-1)^{v \cdot F(x) \oplus u \cdot x}, \quad (1)$$

where "·" denotes inner products in  $\mathbb{F}_2^n$  and  $\mathbb{F}_2^m$  respectively.

## Nonlinearity

$$NL(F) = 2^{n-1} - \frac{1}{2} \max_{v \in \mathbb{F}_2^{m*}; u \in \mathbb{F}_2^n} |\lambda(u, v)|$$

# Properties of substitutions (3/5)

## Balancedness

An  $(n, m)$ -function  $F$  is called **balanced** if it takes every value of  $F_2^m$  the same number of times ( $2^{n-m}$ ).

## Absence of Fixed Points

A substitution must not have fixed point, i.e.

$$F(a) \neq a, \quad \forall a \in \mathbb{F}_2^n.$$

# Properties of substitutions (4/5)

The algebraic normal form (ANF) of any  $(n, m)$ -function  $F$  always **exists** and is **unique**:

$$F(x) = \sum_{I \subseteq \{1, \dots, n\}} a_I \left( \prod_{i \in I} x_i \right) = \sum_{I \subseteq \{1, \dots, n\}} a_I x^I, \quad a_I \in \mathbb{F}_2^m$$

The **algebraic degree** of  $F$

$$\text{deg}(F) = \max\{|I| \mid a_I \neq 0\}$$

## Minimum degree

The minimum algebraic degree of **all the component functions** of  $F$  is called the minimum degree.

# Properties of substitutions (5/5)

Arbitrary substitution can be represented as the system of equations

$$\begin{cases} g_1(x_1, x_2, \dots, x_n, y_1, y_2, \dots, y_m) = 0; \\ g_2(x_1, x_2, \dots, x_n, y_1, y_2, \dots, y_m) = 0; \\ \dots \\ g_r(x_1, x_2, \dots, x_n, y_1, y_2, \dots, y_m) = 0. \end{cases} \quad (2)$$

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## Algebraic immunity

The algebraic immunity  $AI(F)$  of any  $(n, m)$ -function  $F$  is the minimum algebraic degree of all functions in (2).

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# List of properties

## Definition

An  $S$ -box is a mapping of an  $n$ -bit input message to an  $m$ -bit output message.

- Minimum degree
- Balancedness
- Nonlinearity
- Correlation immunity
- $\delta$ -uniformity
- Cyclic structure
- Algebraic immunity
- Absolute indicator
- Absence of fixed points
- Propagation criterion
- Sum-of-squares indicator
- ...



# Necessary properties for stream ciphers (FG)

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# Necessary properties for block ciphers

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# Perfect nonlinear substitutions

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An optimal substitution for a block cipher

- permutation
- maximum value of minimum degree
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  - minimum  $\delta$ -uniformity
  - maximum nonlinearity

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Substitutions satisfying only mandatory criteria essential for a particular cryptographic algorithm are called optimal.

An optimal **permutation** for a block cipher

- ~~permutation~~
- maximum value of minimum degree
- ~~without fixed points (cycles of length 1)~~
- maximum algebraic immunity / ~~minimum number of equations~~
  - minimum  $\delta$ -uniformity
  - maximum nonlinearity

# Example of criteria

An optimal permutation without fixed points for  $n = m = 8$  must have

- minimum degree 7
- algebraic immunity 3 (441 equations)
- $\delta \leq 8$
- $NL \geq 100$



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# Random method

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## Practical result

After **12 hours** of cluster operation (**4096 cores**) it was found **27 optimal permutations** (with  $NL = 100$  and  $AI = 3$ ), four of which were CCZ-nonequivalent.

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## Computational restrictions

After 48 hours of cluster operation (**22 years on 1 core**) no substitutions with  $NL = 102$  were found.

# Problem

Are such substitutions the best?

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- Counterexample was given in STB 34.101.31-2011 [2]. The substitution has  $NL = 102$  and  $AI = 3$ .
- Another example of optimal substitutions generation was given in "A New Method for Generating High Non-linearity S-Boxes" (2010) [3].



# Proposed method

## Definition

Suppose  $F$  is a highly nonlinear vectorial Boolean function with low  $\delta$ -uniformity.

## Algorithm

- 1 Generate a substitution  $S$  based on  $F$ .
- 2 Swap  $NP$  values of  $S$  randomly and set it to  $S_t$ .
- 3 Test substitution for all criteria depending on their computational complexity. If  $S_t$  satisfies all of them except the cyclic properties then go to 4. Otherwise repeat step 2.
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Suppose  $F = x^{-1}$  for  $n = m = 8$  and  $NP = 26$ .

# Performance of the proposed method

## Previous method [3]

“With probability 90% the program search one 104 8x8 S-Box up to 44 hours on personal computer (Intel Core 2 Duo E8500/4096 MB /MS Windows 7 Ultimate 64 bit)”.

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## Computational result of proposed method

During **1 hour** of cluster operation **1152 optimal permutations** (except cyclic properties) with  $NL = 104$  and  $AI = 3$  were generated.

# Performance of the proposed method

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## Computational result of proposed method

During **1 hour** of cluster operation **1152 optimal permutations** (except cyclic properties) with  $NL = 104$  and  $AI = 3$  were generated.

## Performance comparison

If the swapping function **exchanges values randomly** then **time** needed to generate **1 optimal substitution** on a PC with one core on **average equals 3.5 hours**.

# Comparison with known substitutions

Properties	AES	GOST R 34.11-2012 [4]	STB 34.101.31-2011	Kalyna S0	Proposed S-box
$\delta$ -uniformity	4	8	8	8	8
Nonlinearity	112	100	102	96	104
Absolute Indicator	32	96	80	88	80
SSI	133120	258688	232960	244480	194944
Minimum Degree	7	7	6	7	7
Algebraic Immunity	2(39)	3(441)	3(441)	3(441)	3(441)

Table : Substitutions comparison

# Changed criteria for $n = m = 8$

An optimal **permutation without fixed points** must have

- minimum degree 7
- algebraic immunity 3
- $\delta \leq 8$
- $NL \geq 104$

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- The proposed method has the highest performance among the known methods available in public literature.
- Application of the proposed method allows to generate optimal permutations, the use of which in perspective symmetric cryptoprimitives provides a high level of resistance with respect to differential, linear and algebraic cryptanalysis.

# Open problems

## Open problem 1

- How to predict the **number of swapping points**?
  - **Predict properties** of the substitution after  $NP$  exchanges.
- Faster algorithm.

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## Open problem 2

Find the upper bound of nonlinearity for optimal  $F : \mathbb{F}_2^n \mapsto \mathbb{F}_2^n$

- Prove/disprove that  $NL(F) = 104$  is the maximum value for  $8 \times 8$  substitutions with optimal properties.
- Find the upper bound of  $NL(F)$  with maximum value of  $AI(F)$ .



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