

An Area Optimized Implementation of AES S-Box Based on Composite Field and Evolutionary Algorithm

Yaoping Liu, Ning Wu, Xiaoqiang Zhang, Liling Dong, and Lidong Lan

Abstract—In this paper, in order to reduce the hardware complexity, the S-Box based on composite field arithmetic (CFA) technology is optimized by using Genetic Algorithm (GA) and Cartesian Genetic Programming (CGP) model. Firstly, the multiplicative inverse (MI) over $GF(2^8)$ is mapped into composite field $GF((2^4)^2)$ by using the CFA technique. Secondly, the compact circuit of MI over $GF(2^4)$ is selected from 100 evolved circuits, and same design method is applied to the compact circuit of multiplication over $GF(2^2)$. Compared with the direct implementations, the areas of optimized circuits of MI over $GF(2^4)$ and multiplication over $GF((2^2)^2)$ are reduced by 66% and 57.69%, respectively. Moreover, the area reductions for MI over $GF(2^8)$ and the whole of S-Box are up to 59.23% and 56.14%, respectively.

Index Terms—Advanced Encryption Standard (AES), composite field arithmetic (CFA), S-Box, Evolutionary Algorithm (EA)

I. INTRODUCTION

THE Advanced Encryption Standard (AES) is the smart-of-the-art symmetric block data encryption algorithm which was established by the National Institute of Standards and Technology (NIST) to replace the Data Encryption Standard (DES) in 2001. The AES algorithm consists of four transformations, namely SubBytes (SB), ShiftRows (SR), MixColumns (MC) and AddRoundKey (ARK). Nowadays, it has been widely used in various fields of information security, such as wireless local area network (WLAN), wireless personal network (WPAN), wireless sensor network (WSN) and the smart card system[1,2]. With the wide application of AES algorithm, it is very necessary to

design and implement compact circuit of AES. However, the implementation of S-Box is the most expensive part in terms of the required hardware. Therefore, the design and implementation of compact S-Box is the key component of the AES algorithm [3] [4].

AES S-box is defined as a multiplicative inverse (MI) over the Galois field $GF(2^8)$ followed by an affine transformation. The affine transformation is relatively simple to achieve, so the difficulty in design of AES S-Box is how to implement MI over $GF(2^8)$ in the specific hardware implementation. Different circuit architectures have been proposed by many papers for design and implementation of AES S-Box, such as CFA technology, look up table (LUT), positive polarity reed-muller (PPRM), decoder-switch-encoder (DSE), sum of products (SOP), binary decision diagram (BDD) and twisted-BDD. Among these implementations, S-Box implemented with CFA has the smallest area [5] [6]. Therefore, in order to reduce the hardware complexity, the MI over $GF(2^8)$ can be decomposed into composite field $GF((2^4)^2)$ or $GF(((2^2)^2)^2)$ by using the CFA technology.

Circuit optimization method is adopted to design a compact S-Box because there are still many redundant gates in the implementation of CFA S-Box. Different common sub-expression elimination (CSE) methods have been proposed by many papers to optimize the circuit of CFA S-Box. In [3] [4], the MI over $GF(2^8)$ is decomposed into composite field $GF((2^4)^2)$. According to different irreducible polynomials with normal basis representations, the MI over $GF(2^4)$ is expressed by logic expressions directly and optimized by CSE algorithm, which is an important part in MI over $GF((2^4)^2)$. In [7], the MI and multiplication over $GF(2^4)$ are decomposed into $GF((2^2)^2)$ and optimized by sharing common sub-expressions (CSs), and matrix multiplication is optimized by CSE algorithm. The implementation of S-Box proposed in [7] has the smallest area [4].

Evolutionary algorithm is an intelligent optimization algorithm based on population search. And people pay more and more attentions to it in recent years. Using EA to design circuit can reduce the resources of gates and the areas of circuits effectively and can also improve the utilization efficiency of the circuit. What is more, it can find novel circuit structure which is difficult for people to think of. Therefore, in this paper, Genetic Algorithm (GA) is adopted to further optimize the circuit of CFA S-Box.

The main works of this paper are as follows: Firstly, using CFA technology, the MI over $GF(2^8)$ is decomposed into composite field $GF((2^4)^2)$, and the multiplication over $GF(2^4)$

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is further mapped into composite field $GF((2^2)^2)$. Secondly, the MI over $GF(2^4)$ and the multiplication over $GF(2^2)$ are optimized with by GA respectively. Finally, the implementation of CFA S-Box optimized by GA has smaller area cost than the one proposed in [7] which has the minimal area cost [4].

II. THE IMPLEMENTATION OF CFA S-BOX OPTIMIZED BY GA

A. The design process of AES S-Box

In this paper, in order to reduce the hardware complexity, GA is adopted to optimize the circuit of CFA S-Box because the circuit designed by EA has small area cost. Fig. 1 shows the whole design process of AES S-Box.

Firstly, the MI over $GF(2^8)$ is decomposed into composite field $GF((2^4)^2)$. Secondly, the MI over $GF(2^4)$ is optimized by

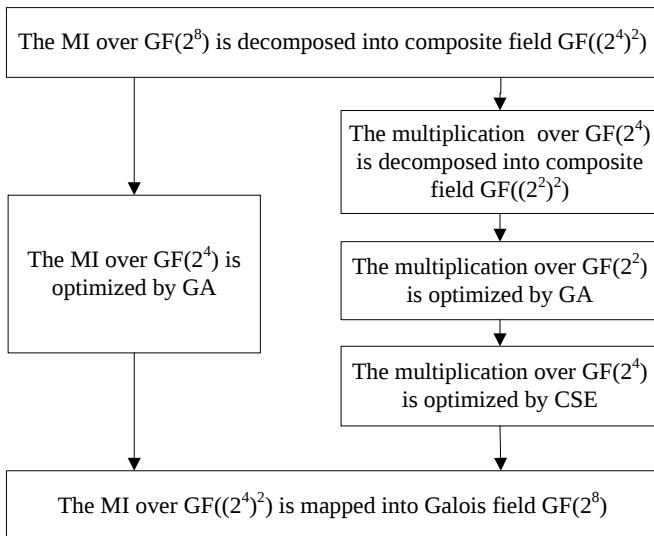


Fig. 1. The design process of AES S-Box.

GA, and at the same time the multiplication over $GF(2^4)$ is further mapped into $GF((2^2)^2)$, and then the multiplication over $GF(2^2)$ is optimized by GA. Thirdly, the multiplications over $GF(2^4)$ in MI over $GF((2^4)^2)$ are optimized by CSE algorithm. Finally, the MI over $GF((2^4)^2)$ is mapped into $GF(2^8)$ to implement the circuit of S-Box.

B. The implementation of S-Box based on CFA technology

AES S-Box is defined as the MI over the finite field $GF(2^8)$ followed by an affine transformation. The MI over $GF(2^8)$ can be mapped into composite field $GF(((2^2)^2)^2)$ to reduce the hardware complexity by adopting CFA technology, since direct calculation of the MI over $GF(2^8)$ is a complicated and difficult task. In this paper, the CFA technology proposed in [7] is adopted to illustrate the optimization of CFA S-Box by GA.

In CFA technology, an isomorphic mapping matrix is demanded to map the input vector from the finite field $GF(2^8)$ to the composite field $GF(((2^2)^2)^2)$, and its inverse matrix is required to revert the computing results to $GF(2^8)$. So the S-Box based on CFA technique can be expressed as:

$$S(X) = M(T^{-1}(TX)^{-1}) + V \quad (1)$$

where T is the isomorphic mapping matrix and T^{-1} is inverse matrix of T. Generally, matrix T^{-1} and matrix M are merged

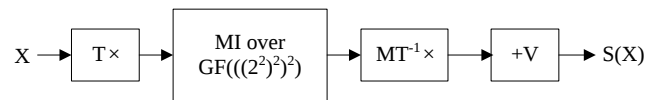


Fig.2. Architecture of S-Box using the CFA technique.

into a single matrix to reduce the hardware resources. The architecture of S-Box using the CFA technique is shown in Fig. 2.

In CFA technology, the MI over $GF(2^8)$ is built iteratively from $GF(2)$ by using the following irreducible polynomials:

$$\begin{cases} GF((2^4)^2): f_1(z) = z^2 + z + \gamma \\ GF((2^2)^2): f_2(y) = y^2 + y + \lambda \\ GF((2)^2): f_3(w) = w^2 + w + 1 \end{cases} \quad (2)$$

In [7], it indicates that the circuit constructed under coefficients $\{\gamma=(0001)_2, \lambda=(10)_2\}$ needs the least number of gates. So coefficients $\{\gamma=(0001)_2, \lambda=(10)_2\}$ are also used in this paper.

According to the first irreducible polynomial in (2), the MI over $GF(2^8)$ is decomposed into $GF((2^4)^2)$ as (3) [7]:

$$B(Z) = A^{-1}(Z) = ((A_h + A_l)^2 \gamma + A_h A_l)^{-1} \times (A_l Z^{16} + A_h Z) \quad (3)$$

where $A(Z)$ can be expressed as $A(Z) = A_h Z^{16} + A_l Z$, $\{A_h, A_l\} \in GF(2^4)$. $B(Z)$ can be represented in the same way. The architecture of MI over $GF((2^4)^2)$ is shown in Fig. 3.

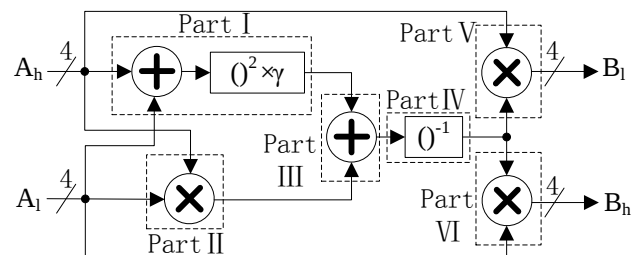


Fig. 3. The architecture of the MI over $GF((2^4)^2)$.

As shown in Fig. 3, the MI over $GF((2^4)^2)$ includes two additions, a MI, a square, a constant multiplication and three multiplications. All the operations are over $GF(2^4)$. The addition over $GF(2^k)$ is defined as bitwise XOR operations. The square and constant multiplication over $GF(2^4)$ can be deduced from multiplication over $GF(2^4)$, and they are usually joint into a single block to reduce the number of gates. The MI and multiplication over $GF(2^4)$ are further mapped into $GF(2^2)^2$ by using the second irreducible polynomial in (2). They are expressed as (4) and (5) respectively:

$$E(Y) = C^{-1}(Y) = ((C_h + C_l)^2 \lambda + C_h C_l)^{-1} \times (C_l Y^4 + C_h Y) \quad (4)$$

$$F(Y) = C(Y)D(Y) = [C_h D_h + (C_l + C_h)(D_l + D_h)\lambda]Y^4 + [C_l D_l + (C_l + C_h)(D_l + D_h)\lambda]Y \quad (5)$$

where $C(Y)$ can be expressed as $C(Y) = C_h Y^4 + C_l Y$, $\{C_h, C_l\} \in GF(2^2)$. $D(Y)$, $E(Y)$ and $F(Y)$ can be represented in the same way. By using the third irreducible polynomial in (2), the MI and multiplication over $GF(2^2)$ are further

decomposed into $GF((2^2)^2)$ as (6) and (7) respectively:

$$H(W) = G^{-1}(W) = (g_0 W^2 + g_1 W)$$

$$L(W) = G(W)K(W) = (g_0 k_0 + g_1 k_0 + g_0 k_1)W^2 + (g_1 k_0 + g_0 k_1 + g_1 k_1)W$$

where $G(W)=g_1 W^2+g_0 W$, $\{g_1, g_0\} \in GF(2)$, $K(W)$, $H(W)$ and $L(W)$ are expressed in the same way. According to (4) to (7), the logic expressions of each part in Fig. 3 can be derived.

C. Genetic Algorithm and Evolvable Hardware

GA is an adaptive optimization algorithm of probability search which simulates heredity and evolution of biology in environment, and uses some mechanisms inspired by biological evolution: selection, crossover and mutation [9] [10]. It is usually used to search exact or approximate solutions to optimize and solve problems.

GA will be constantly for evolutionary computation until find the best design. After several iterations, under the survival of the fittest algorithm, the bad design will be abandoned on the basis of competitive selection strategy. Therefore, the number of excellent individuals will increase continually and the best design will be find finally.

In this paper, the circuit model is based on Cartesian Genetic Programming (CGP) [11]. Each candidate circuit is encoded in the chromosome. The chromosome is a string of integers where each three continuous genes embody a gate. Each triplet in the chromosome encodes the two inputs and

TABLE I
THE TYPE, FUNCTION AND THE NUMBER OF TRANSISTORS OF LOGIC GATES
AND THEIR CORRESPONDING NUMBERS

Number	Type	Function	Transistors
0	AND	$A \& B$	6
1	OR	$A \parallel B$	6
2	XNOR	$A \odot B$	14
3	NOT1	$!A$	2
4	NOT2	$!B$	2
5	NAND	$!(A \& B)$	4
6	NOR	$!(A \parallel B)$	4
7	XOR	$A \oplus B$	12

the type of a gate respectively. So each chromosome represents a candidate circuit topology. The type, function and the quantity of transistors of logic gates [8] and their corresponding numbers are listed in TABLE I.

D. The optimization of MI over composite field $GF((2^4)^2)$

In this paper, the circuit of MI over composite field $GF(2^4)$ which is based on CGP model, is optimized by GA. The basic parameters of GA are set as follows: the population size is 500, the size of initial population is 200, the crossover probability is 0.8, and the mutation probability is 0.03. The optimization of each part in Fig. 3 is in the following.

The optimization of MI over composite field $GF(2^4)$

According to the derivation in section B, the logic expressions of MI over $GF(2^4)$ are represented as (8):

$$Q = P^{-1} = \begin{cases} q_3 = p_2 p_1 p_0 + p_3 p_1 + p_2 p_1 + p_1 + p_0 \\ q_2 = p_3 p_1 p_0 + p_3 p_1 + p_2 p_1 + p_2 p_0 + p_0 \\ q_1 = p_3 p_2 p_0 + p_3 p_1 + p_3 p_0 + p_3 + p_2 \\ q_0 = p_3 p_2 p_1 + p_3 p_1 + p_3 p_0 + p_2 p_0 + p_2 \end{cases} \quad (8)$$

In this paper, it is optimized by GA on the basis of logical relations shown in (8). The compact circuit of the 100 evolutionary circuits is shown in Fig. 4.

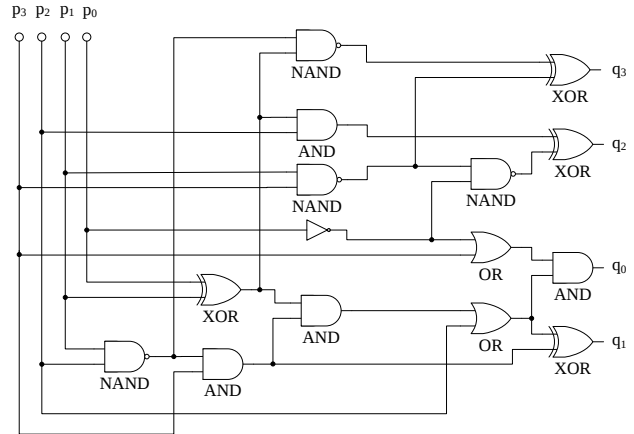


Fig. 4. The circuit of MI over $GF(2^4)$ optimized by GA

The optimization of multiplication over composite field $GF(2^4)$

The multiplication over $GF(2^4)$ is mapped into composite field $GF((2^2)^2)$ in this paper. According to (7), the direct implementation of multiplication over $GF(2^2)$ needs three

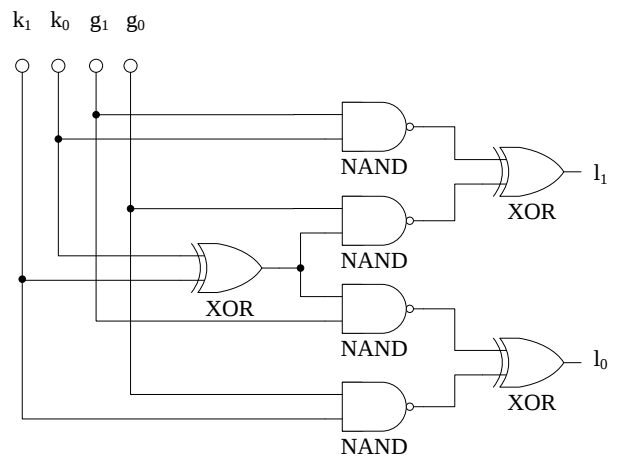


Fig. 5. The circuit of multiplication over $GF(2^2)$ optimized by GA

XORs and four ANDs. The circuit optimized by GA includes three XORs and four NANDs, which requires 52 transistors, with a reduction of 13.33% in terms of the total area occupancy. The circuit of multiplication over $GF(2^2)$ optimized by GA is shown in Fig. 5.

According to (6), it can be get that:

$$G(W) \times \lambda = (g_0 W^2 + (g_0 + g_1)W) \quad (9)$$

where $\lambda=(10)_2$. The block $() \times \lambda$ in (7) requires one XOR gates by using the computation in (9)

So the optimized circuit of multiplication over $GF(2^4)$

demands 18 XORs and 12 NANDs, which contains 264 transistors. Compared to the quantity of transistors in direct implementation, which requires 44 XORs and 16 ANDs, it gives 360(57.69%) transistors reduction in total area cost.

Hardware performances of optimized implementations

Substitute (7), (9), and $\gamma=(0001)_2$ into (5) to obtain that:

$$S = C^2 \times \gamma = \begin{cases} S_3 = c_2 + c_0 \\ S_2 = c_3 + c_3 \\ S_1 = c_1 + c_0 \\ S_0 = c_0 \end{cases} \quad (10)$$

where $c=(c_3c_2c_1c_0) \in GF(2^4)$, $\{c_3, c_2, c_1, c_0\} \in GF(2)$. According to (10), the block $()^2 \times \gamma$ in Fig. 3 needs three XORs.

Six XORs are eliminated by sharing common sub-expressions among Part II, Part V and Part VI in Fig. 3. Therefore, The three multiplications over $GF(2^4)$ requires 48 XORs and 36 NANDs.

The total area of MI over composite field $GF((2^4)^2)$ is computed as:

$$\begin{aligned} A_{MI} &= A_I + A_{III} + A_{IV} + A_{II} + A_{V+} + A_{VI} \\ &= (4A_{XOR} + 3A_{XOR}) + 4A_{XOR} \\ &\quad + (A_{NOT} + 4A_{XOR} + 4A_{NAND} + 4A_{AND} + 2A_{OR}) \\ &\quad + (48A_{XOR} + 36A_{NAND}) \\ &= A_{NOT} + 40A_{NAND} + 4A_{AND} + 2A_{OR} + 63A_{XOR} \end{aligned} \quad (11)$$

However, in the direct implementation, 162 XORs and 66 ANDs are required, and the number of transistors is 2340. The area reduction is up to 954(59.23%).

In this paper, the isomorphic mapping matrix T and matrix MT^{-1} are adopted as same as those in [7]. So the implementation of isomorphic mapping matrix multiplication requires 13 XORs and the multiplication of matrix MT^{-1} needs 11 XORs. The total number of gates in S-Box is computed as:

$$\begin{aligned} A_{S_Box} &= A_T + A_{MT^{-1}} + A_{MI} \\ &= 13A_{XOR} + 11A_{XOR} \\ &\quad + (A_{NOT} + 40A_{NAND} + 4A_{AND} + 2A_{OR} + 63A_{XOR}) \\ &= A_{NOT} + 40A_{NAND} + 4A_{AND} + 2A_{OR} + 87A_{XOR} \end{aligned} \quad (12)$$

Compared with the direct implementation, which includes 203 XORs and 66 ANDs, the quantity of transistors of optimized S-Box is 1242 with a reduction of 56.14% in terms of the total area cost.

III. COMPARISONS AND RESULTS

In this paper, the implementation of CFA S-Box is optimized by GA. The type and quantity of logic gates as well as the total number of transistors in the direct implementation and optimization by GA are listed in TABLE II, respectively.

As shown in TABLE II, compared to the direct implementation, the optimized circuit of MI over $GF((2^4)^2)$ is reduced by 59.23%. The area reduction for S-Box is up to 56.14%.

In TABLE III, the multiplication and MI over $GF(2^4)$ proposed in this paper is compared to the implementations in the previous works. It can be known that, the multiplication over $GF(2^4)$ is further decomposed into composite field $GF((2^2)^2)$, and the implementation in this paper has the minimal area. The MI over $GF(2^4)$ is directly implemented in [3,4] and this paper, whereas it is further mapped into $GF((2^2)^2)$ in [7]. The best implementations in [3] and [4], which proposed four and three implementations respectively, are listed in TABLE III. As shown in TABLE III, the MI over $GF(2^4)$ proposed in this paper achieves the minimal area cost.

The comparisons of the whole of implementation of S-Box are listed in TABLE IV. As shown in table 4, the S-Box achieved with CFA technology is more compact than those with other methods. The optimized implementation of S-Box proposed in this paper has the minimal hardware requirement.

TABLE II
THE AREA COST REQUIRED BY EACH PART OF THE CFA S-BOX THAT IS OPTIMIZED BY GA

Modules	Direct			Optimized by GA					
	XOR	AND	Transistors	NOT	NAND	AND	OR	XOR	Transistors(Reduction)
Multiplication Over $GF(2^4)$	44	16	624	—	12	—	—	18	264(57.69%)
MI over $GF(2^4)$	16	18	300	1	4	4	2	4	102(66%)
$(A_b + A_i)^2 \times \gamma$	10	—	120	—	—	—	—	7	84(30%)
Adder Over $GF(2^4)$	4	—	48	—	—	—	—	4	48(0%)
MI Over $GF((2^4)^2)$	162	66	2340	1	40	4	2	63	954(59.23%)
T ×	24	—	288	—	—	—	—	13	156(45.83%)
$MT^{-1} \times$	17	—	204	—	—	—	—	11	132(35.29%)
S-Box	203	66	2832	1	40	4	2	87	1242(56.14%)

TABLE III
COMPARISONS OF MULTIPLICATION OVER $GF(2^4)$ AND THE MI OVER $GF(2^4)$ PROPOSED IN THE WORKS

Works	Realization	Multiplication over $GF(2^4)$				MI over $GF(2^4)$					
		XOR	AND	NAND	Transistors	Realization	XOR	AND	NOT	NAND	OR
[3]	$GF((2^2)^2)$	21	9	—	306	$GF(2^4)$	13	8	—	—	—
[4]	$GF((2^2)^2)$	20	9	—	294	$GF(2^4)$	13	9	—	—	—
[7]	$GF((2^2)^2)$	18	12	—	288	$GF((2^2)^2)$	14	12	—	—	—
Ours	$GF((2^2)^2)$	12	—	18	264	$GF(2^4)$	4	4	1	4	2

TABLE IV
THE COMPARISONS OF THE WHOLE OF IMPLEMENTATIONS OF S-BOX

Works	Realization	Transistors
[5]	Twisted BDD	11260
[6]	PPRM	2308
[6]	DSE	2788
[3]	CFA	1614
[4]	CFA	1368
[7]	CFA	1308
ours	CFA	1242

IV. CONCLUSION

The circuit generated by using EA has the compact and novel structure that is hard for people to come up with. Therefore, in this paper, the S-Box with CFA technology is optimized by adopting GA and the implementation has the minimal area occupancy. Firstly, the MI over $GF(2^8)$ is decomposed into composite field $GF((2^4)^2)$, and then the MI over $GF(2^4)$ and the multiplication over $GF((2^2)^2)$ are optimized with using GA. Compared with the direct implementation, the number of transistors in the optimized circuit of MI over $GF(2^4)$ and multiplication over $GF((2^2)^2)$ are reduced by 66% and 57.69%, respectively. Secondly, the common sub-expressions among three multiplications over $GF(2^4)$ in MI over $GF((2^4)^2)$ are eliminated by CSE algorithm. The area reduction of MI over $GF((2^4)^2)$ and S-Box is up to 59.23% and 56.14% respectively compared to the direct implementation. In previous works, the implementation of S-Box proposed in [7] has the minimal area cost [4], which consists of 91 XORs and 36 ANDs, i.e.1308 transistors. Compared with the implementation in [7], the optimization proposed in this paper includes a NOT, 40 NANDs, four ANDs, two ORs and 87 XORs, i.e.1242 transistors, with a reduction of 13.33% in terms of the total area occupancy. Therefore, the implementation of S-Box proposed in this paper has the minimal area cost at present.

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