# Fast Oblivious AES A decicated application of the MiniMac protocol

Abstract. We present an actively secure multi-party computation the of the Advanced Encryption Standard (AES). To the best of our knowledge it is the fastest of its kind to date. We start from an efficient actively secure evaluation of general binary circuits that was implemented by the authors of [DLT14]. They presented an optimized implementation of the so-called MiniMac protocol [DZ13] that runs in the pre-processing model, and applied this to a binary AES circuit. In this paper we describe how to dedicate the pre-processing to the structure of AES, which improves significantly the throughput and latency of previous actively secure implementations. We get a latency of about 6 ms and amortised time about 0.4 ms per AES block, which seems completely adequate for practical applications such as verification of 1-time passwords.

## Introduction

Secure Multi-party computation (MPC) allows a set of players (or computers) with *private inputs* to evaluate a function on these inputs. Security means that all players learns the output of the function and essentially nothing else. More precisely the problem of MPC for n players is to compute a function  $f(x_1,...,x_n) = (y_1,...,y_n)$  such that Player,  $P_i$ , learns only  $y_i$  after evaluating f and  $x_i$  is the private input held by  $P_i$ . This problem was first proposed by Yao in [Yao82,Yao86] and has been an active area of research since.

The description of the function f can take different forms. In this work we consider descriptions of f as a circuit over the (AND,XOR) or (MUL,ADD) basis for binary and arithmetic circuits respectively. Protocols for evaluating such function typically implement an ideal functionality sometimes called an Arithmetic black-box [DN03]. The Arithmetic black-box is depicted in Fig. 1. Intuitively, the players agree on a circuit over the actions Open, Input, Xor/Add and And/Mul. Players provide input values using the Input command, and then work their way through the circuit invoking the appropriate command for each gate. Finally the Open command is used to the result.

MPC for the case where a majority of the players are corrupt require public-key machinery and was therefore for a long time thought to be impractical, especially for the case of active security. To resolve this, the so-called pre-processing-model was proposed, where the heavy computations are pushed to a pre-processing phase. Using precomputed material one can evaluate the function securely much faster in the on-line phase. With recent result [NNOB12,DKL+13,DLT14,FJN14] in particular, practicality is within our reach, see [IKM+13] for an in depth discussion on the power of correlated randomness. We consider here the particular protocol nick-named *MiniMac* from [DZ13]. This is an arithmetic black-box

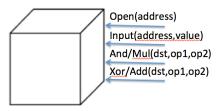


Fig. 1: The Arithmetic Black Box.

protocol in the pre-processing-model, which was designed to handle arithmetic circuit over small fields efficiently. To do this, it computes on vectors of field elements instead of single values.

Benchmarking Oblivious AES is a much used example of how practical MPC is becoming, see [PSSW09] and [NNOB12,DKL $^+$ 12,GHS12,DLT14,HKS $^+$ 10,HEKM11]. Oblivious AES distinguishes itself from the classical AES encryption by being distributed between two or more parties. All players know the plaintext and everybody learns the ciphertext. The key, however, is additively shared meaning that the key k is not known to any player.

Performance wise, previous state of the art for Oblivious AES with malicious security is the implementation using a binary circuit in [DLT14] where they report on amortized running times less than 4 milliseconds per AES-block and 3-4 seconds latency on ordinary consumer hardware. In [KSS13] a different implementation was reported that uses the algebraic description of AES over  $\mathbb{F}_{2^8}$ . They achieve about 1 ms amortised time per AES block and a latency of 100 ms.

Our contributions. We show that both amortised time and latency can be improved significantly: in the fastest configuration, we obtain about 0.4 ms amortised time and a latency of about 6 ms. We present three constructions which are variations on the idea that if we exploit the special structure of AES, rather that seeing it as a general binary or arithmetic circuit, we can tailor the pre-processing such that we save on the number of rounds and also on local computation. We try out these ideas in practice using the implementation of MiniMac from [DLT14] <sup>1</sup> as our starting point.

The basic approach in our first protocol is to pre-process a number of tables, each of which implement an AES S-box followed by the Mix-Column and Shift-Row operations applied to the bits output from the S-box in question. We first a describe what the correlated randomness should look like to implement the tables, and then we present a slightly modified version of the MiniMac protocol using this material to perform AES. This solution computes 5 simultaneous

Available at http://tinyurl.com/q2dmcuw

AES blocks in only 10 rounds of online communication. In comparison [DLT14] required at least 6800 rounds.

No AES blocks	Time/AES ms	Latency ms	Prep. size Mb/player
MiniMac [DLT14]			
680	4	9962	130, 0.2/AES
Protocol 1 incl. Key Expansion			
5	3	15	270, 54/AES
Protocol 1 without Key Expansion			
5	1.2	6	220, 44/AES
Estimated time, Protocol 2 (no on-line multiplications)			
15	0.4	6	650, 44/AES
Estimated time, Protocol 3 (minimized preprocessing)			
15	0.8	12	10.5, 0.7/AES

Fig. 2: Execution times of our AES protocol.

For our second protocol, we observe that after we introduce the tables, we no longer need to do secure multiplication in the on-line phase. This allows us to change the internal representation used in MiniMac to allow more parallelism at no extra cost. This immediately saves us a factor roughly 3 in amortized time per AES instance.

For the third protocol we give a new construction that shows how to obtain much smaller preprocessing material. We save a factor of at least 60 in the size of preprocessed data at the cost of doing 1 extra round of communication and more local computation in the final protocol. Some explanation of the idea behind this optimisation is in order as the idea may be of interest beyond oblivious AES: the efficiency of MiniMac is based on the idea of computing on vectors of values in a SIMD fashion, i.e. we add and multiply vectors coordinate-wise. Concretely, the implementation of MiniMac we started from uses vectors containing 85 data bytes. Now, the reason why it makes sense to compute the AES SBox by table look-up is that the input is only 1 byte, so we need only 256 entries in the table. However, the result we get will be just one byte, and this result needs to go to the right place in the vector representing the state after the table look-up, of course without revealing what was output from the table. The simplest solution is to make the table entry be an entire MiniMac word containing data that only depends on the single byte that is output from that table entry. This will work, as we explain in more detail later, but of course means that tables get very large. What we do for protocol 3 is to show that with an appropriate combination of masking by random values and unconditional MACs, we can have table entries that only consist of a single data byte and some authentication information. This idea can be applied to computation of any function with small input and output, possibly followed by some linear function.

We implemented the Protocol 1 and based on this we calculated the size of preprocessed data for the other results and conservatively estimated their running times, as detailed in the following sections. A summary of this can be seen in Table 2.

The demands we have to the pre-processed data are quite specialized and it may not be clear how we can do the required preprocessing reasonably efficiently. In particular, the preprocessing assumed by the original MiniMac protocol does not produce data of the form we need. In principle, the problem can be solved by writing down an arithmetic circuit that takes some random bits as input and outputs the data players need; and then evaluate that circuit using the original MiniMac protocol. This would be an extremely large circuit, and therefore, in the final section, we give a recipe for how pre-processed material may be constructed more efficiently from a generic MiniMac instance.

A main take-home message from our paper is that the only structure we need from AES to speed up the computation is that it's non-linear parts consist only of Sboxes with small inputs, this is what allows us to use table look-up with tables of feasible size. In future work, it will therefore be interesting to investigate if secure computation of other ciphers or hash functions can be made practical using a similar approach.

## The MiniMac protocol

This protocol is in a nutshell a SIMD Arithmetic black-box. That is, the protocol operates on a so called representation consisting of a vector of field elements. The actions of the Arithmetic black-box operates in parallel on all elements of the vector simultaneously. The details and proof of security can be found in [DZ13] while the extension for operating efficiently on binary fields was discovered in [DLT14]. For our purposes here we will think of MiniMac simply as an implementation of a SIMD Arithmetic Black-box and hence describe MiniMac's representation of data as containing an l-vector over a finite field<sup>2</sup>.

$$[\![\mathbf{a}]\!] = [\![(a_1,...,a_l)]\!]$$

The operations Input, Add, Mul and Open for the Arithmetic black-box operates on such vectors. E.g. adding two elements in the box with MiniMac yields the computation:

$$[\![\mathbf{a}]\!] + [\![\mathbf{b}]\!] = [\![(a_1 + b_1, ..., a_l + b_l)]\!] = [\![\mathbf{a} + \mathbf{b}]\!]$$

In a similar way Input requires the secret values to be loaded into the box to be *l*-vectors and Open gives the parties an *l*-vector back.

## Advanced Encryption Standard

AES is described in [DR00]. Here we consider only 128-bit 10 round encryption with AES. As a courtesy to the reader we give here a summary of the intimate

<sup>&</sup>lt;sup>2</sup> Actually, the players in MiniMac have additive shares of the vectors and a special type of MACs are used to prevent cheating, but these details are not important here.

details. The algorithm can be considered to have two distinct phases: The *Key Expansion* and the 10 *Rounds*. The Key Expansion operates on a 16 byte state of key material and the 10 rounds operate on a 16 byte state of plain/cipher-text.

The key expansion in more details operates on a 16 byte state of key material initially containing the encryption key. This state is updated in each round to contain the corresponding round-key.

In [DR00] the key expansion algorithm is explained in an algorithmic way over bytes. Our framework of implementation is geared for matrix operations thus we here give an alternative characterization of the key schedule in terms of matrices. Here we abstract the S-Box operations to merely a table lookup and explain later how such lookups can be done securely with MiniMac. Let  $K_0 = (k_0, ..., s_{15})$  be the initial 16 bytes of encryption key. The key is divided in to 4 so called words  $w_0$  through  $w_3$  in the natural increasing order of indices. Word  $w_3 = (k_{12}, ..., k_{15})$ 

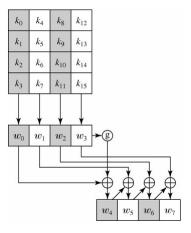


Fig. 3: The AES key schedule

is passed through the key schedule core, denoted g in Figure 3, which rotates the word one position left  $rot(w_3) = (k_{13}, k_{14}, k_{15}, k_{12})$  and then forms the result  $T_3 = (sb(k_{13}), sb(k_{14}), sb(k_{15}), sb(k_{12}))$ . Here sb refers the S-box. We have the four word state  $T = (T_0, T_1, T_2, T_3) = (k_0, ..., k_{11}, sb(k_{13}), sb(k_{14}), sb(k_{15}), sb(k_{12}))$ . From T the remaining of the key schedule is (almost) a linear transformation,

KS, over  $\mathbb{F}_{2^8}^{16}$  depicted below:

When expanding the key from round i to round i + 1 we denote  $w_0, ..., w_3$  the four words of the current key and denote the new key  $w_4, ..., w_7$ .

To see how the computation above resembles the operations depicted in Figure 3 we consider each word of the result in turn. The first word in the new key is  $w_4$ . We see from the figure that it should be  $w_0 \oplus T_3 = (k_0 \oplus t_{12}, k_1 \oplus t_{13}, k_2 \oplus t_{14}, k_3 \oplus t_{15})$ . Doing the inner product with the first four rows of KS and T yields this. Similar observations can be made progressing to rows 4 though 7 and rows 8 through 11 for words  $w_5$  and  $w_6$  respectively. For  $w_7$  the operation is slightly different as it according to Figure 3 should be  $w_3 \oplus w_4 \oplus w_5 \oplus w_6$  where only  $w_4, w_5$  and  $w_6$  are present in our T vector. To obtain the final result we additionally XOR  $w_3$  onto  $KS \times T$  obtaining the same operation as in Figure 3. The reason for laying out the computation as above will become clear later.

The 10 rounds are the main encryption loop of AES. Algorithm 1 describes the algorithm. Add Round Key covers the operation of XORing the current round key with the current AES state obtaining a new AES state. The KeyExpansion step updates the current round key into the one needed for the following round. If the key expansion is computed beforehand as suggested above the KeyExpansion step can be ignored. After the final step the 16 bytes AES state in S contains the ciphertext. Our results rely on a mathematical interpretation of the steps in AES which we will give in the following. We consider each step in Algorithm 1. The Sub-Byte step is the operation of replacing each byte in the AES state with the S-Box lookup for that byte. More precisely, if the AES state is  $\mathbf{S} = (s_0, ..., s_{15})$  after applying Sub-bytes the AES state is  $\mathbf{S}' = (SBox[s_0], ..., SBox[s_{15}])$ . Another interpretation of the S-Box can be found in [DK10]. Here the S-Box is considered a degree 254 polynomial over  $\mathbb{F}_{2^8}$ . In our case, we will use a lookup table however a low-depth binary circuit for the S-Box can be found in [BP11].

#### Algorithm 1: AES Encryption ${f Data}: S = (s_0,...,s_{15})$ - /\* the AES state **Data**: $K = (k_0, ..., k_{15})$ - /\* the AES key /\* Prepare the 11 round keys /\* Nor the 0th round key to the state 1 AddRoundRey(K,S,0) **2** for $round \in \{1, 2, 3, 4, 5, 6, 7, 8, 9\}$ do KeyExpansion(K,round) 3 SubByte(S) 4 ShiftRows(S) /\* Considered as polynomials over $\mathbb{F}_{2^8}$ the columns of the state are multiplied with the fixed polynomial $3x^3+x^2+x+2$ $\mod x^4 + 1$ . MixColumns(S) 6 /\* Xor the [round]th key to the state \*/ AddRoundKey(K,S,round) 8 KeyExpansion(K,10) 9 SubByte(S) 10 AddRoundKey(K,S,10)

In the *Shift-rows* step we consider the 16 bytes AES state as a  $4 \times 4$  matrix as in Figure 4a. Then the shiftrows cycles the second row one element, the third row two elements and the fourth row three elements as depicted in Figure 4b. This operation corresponds to the  $16 \times 16$  linear transformation performed by

$$S = \begin{bmatrix} s_0 & s_4 & s_8 & s_{12} \\ s_1 & s_5 & s_9 & s_{13} \\ s_2 & s_6 & s_{10} & s_{14} \\ s_3 & s_7 & s_{11} & s_{15} \end{bmatrix}$$

$$S = \begin{bmatrix} s_0 & s_4 & s_8 & s_{12} \\ s_5 & s_9 & s_{13} & s_1 \\ s_{10} & s_{14} & s_2 & s_6 \\ s_{15} & s_3 & s_7 & s_{11} \end{bmatrix}$$

(a) 16 bytes of AES state laid out in a  $4 \times 4$ -(b) 16 bytes of AES state with Shift-rows matrix.

Fig. 4: Illustration of Shift-rows.

the matrix on the 16-vector holding the AES state,  $S = (s_0, ..., s_{15})$ 

The Mix-columns step can also be described as a linear transformation:

We are going to apply these matrices in the pre-processing phase and in the online phases of our protocol using a trick which will be explained later. In all of our application of Shift-rows and Mix-columns we compute on many AES blocks in parallel. For this we introduce one additional bit of notation. Let SR and MCbe the Shift-rows and Mix-columns matrices as above respectively. To apply e.g. SR to a vector holding n AES states we write  $SR_n \times S$  where  $SR_n$  is the  $16n \times 16n$ -matrix having n SR on the diagonal and zero everywhere else. We denote SRMC the matrix that applies Shift-rows followed by Mix-columns to S. That is  $SRMC \times S = MC \times SR \times S$ . The organization of this paper is as follows. In Section 1 we present how to compute Oblivious AES as a multi-party computation with dedicated pre-processing. We actually implemented this work as code and report on running times as low as 5ms for 5 simultaneous AES instances in Figure 2. Our work can be reproduced following our instructions in Appendix A. Then in Section 2 we discuss an optimization of the protocol from the fact that with dedicated pre-processing the online computation is all linear. In Section 3 we discuss another improvement reducing the size of our pre-processing material required. Finally in Section 4 we show how to efficiently get dedicated pre-processing from a general MiniMac instance evaluating arithmetic circuits over  $\mathbb{F}_{2^8}$ .

## 1 Fast AES using dedicated Preprocessing

In this Section we show how dedicated pre-processing can be used to efficiently compute Oblivious AES. We list demands for the pre-processing material needed and describe an online protocol using the material to compute Oblivious AES. Also we present an implementation and performance numbers on consumer grade hardware.

We employ the fastest version of MiniMac implementation from [DLT14] which allows us to compute on vectors containing 85 bytes. In such a vector we can pack 5 full AES states taking up 80 bytes. In this way we run a small number of AES circuits in parallel. However notice here that we are running "different" operations on individual bytes in the representation as we are not performing the same operations to all bytes in the AES state. This is not supported directly by MiniMac and hence we need help from the pre-processing.

The pre-processing will generate tables of correlated randomness corresponding to handling the entire AES round (except add round key). Loosely put, we pre-process random values with the AES round operation applied to them. Then, we correct these at runtime to yield the AES round operation on the actual input values

We start by describing how we pre-process the S-Box. The S-Box can be thought of as a table with 256 entries. To apply the S-Box to a single byte in the AES state we look up the entry corresponding to that byte (e.i. the state byte has a numeric base 10 value between 0 and 255 which we use as index into the S-box). Lets consider how to do this for a single  $s_j$  in our representation with 5 AES states consisting of 80 bytes  $\mathbf{S} = (s_0, ..., s_{79})$ . To ensure  $s_j$  remains secret inside the box we disguise  $s_j$  with a uniformly random value  $R_j$  and open  $R_j + s_j$  to all the parties. Now we will construct a pre-processed table  $SBox_{+R_j}$  that contains 256 MiniMac representations of S-Box values. However, the indexing into the table is permuted by adding the random  $R_j$ . More precisely, we want that

$$\forall s \in [0, ..., 255], j = 0...79 : SBox_{+R_j}[s + R_j] = [(0, ..., SBox[s], 0, ..., 0)]$$
 where the value  $SBox[s]$  is placed in position  $j^3$ .

<sup>&</sup>lt;sup>3</sup> Note that when we say an entry in the table is a MiniMac representation of some vector this actually means that players have additive shares of that vector as well as

We will require the preprocessing to also output  $[(R_0, ..., R_{79})]$  and when the time comes to do the S-boxes, we add this to the current state and open  $(s_0 + R_0, ..., s_{79} + R_{79})$ . Then we do the 80 table look-ups and add all the outputs, and then we have effective applied the S-Box to all 80 bytes.

This trick can be extended so that we can make the table look-up implicitly compute also the linear transformation constituted by Shift-rows and Mix-columns. Let the matrix SRMC denote the Shift-rows matrix multiplied with the Mix-columns matrix from Section 1. Note that if taken directly from Section 1 this matrix would only operate on one AES state, but it can be extended in a natural way to operate on a vector containing 5 states.

Now, using the same random values  $R_j$ , we replace the S-box tables defined above by 80 tables denoted  $AESBox_j, j = 0, ..., 79$ , such that

$$\forall s \in [0, ..., 255], j = 0...79 : AESBox_j[s+R_j] = [SRMC \times (0, ..., 0, SBox[s], 0, ..., 0)]$$

where again the non-zero value is placed at position j. Because the multiplication by SRMC is a linear operation, it follows that if we do the 80 table look-ups using  $(s_0 + R_0, \ldots, s_{79} + R_{79})$  as indices and add the results, this time we will obtain

$$\sum_{i=0}^{79} \llbracket SRMC \times (0,..,0,SBox[s_j],0,...,0) \rrbracket = \llbracket SRMC \times (SBox(s_0),...,SBox(s_{79})) \rrbracket$$

and this exactly the 5 new AES states we wanted. The protocol depicted in Figure 5 describes how one AES round is handled using this approach.

#### **AES Round:** The AES round proceeds as follows:

- 1. Take a fresh  $AESBox = \{AESBox_j\}_{j=0,...,79}$  from the available ones and the corresponding  $[\![R]\!] = [\![(R_0,...,R_{79})]\!]$ .
- 2. Let the current state be  $[S] = [(s_0, ..., s_{79})]$ . The parties compute  $[\delta] = [R + S]$ .
- 3.  $\delta = (\delta_0, ..., \delta_{79})$  is opened
- 4. As  $\delta$  is known in plain by all parties, they can look up  $S'_j = AESBox[\delta_j], j = 0, ..., 79$ <sup>a</sup>.
- 5. The parties form the state S' after SubBytes, ShiftRows and MixColumns by computing  $S' = \sum_{i=0}^{79} S'_i$ .
- Finally (a MiniMac representation of) the round key is added to the state and the next round follows.

Fig. 5: Online phase,  $\Pi_{AES-round}$ 

<sup>&</sup>lt;sup>a</sup> For the 10th round we have a pre-processed AESBox which is the same except we only apply the Shift-Row matrix to the values in the tables.

some MACs and corresponding keys, however, the details of this are not important here.

### 1.1 Experiments with the implementation

We have implemented MiniMac on-line phase and a program for creating the pre-processing material for all parties running on one machine. In Figure 2 we list timings of our experiments.

Execution time of out experiments are recorded as follows:

We have three test machines, two Peers who will carry out the MPC and a third monitor who will record execution time. When the Peer processes have loaded pre-processing material from Disk and otherwise ready to commence computation they report "Ready" to the monitor. When both have done so, the monitor will record a time stamp and send "Start" to the Peers. Each Peer report to the monitor "Done" when it has reached completion of the MPC circuit. When all Peers have reported "Done" the monitor records the time and execution time is taken to the difference between our two time stamps. More precisely, for Peer 0 and Peer 1 the following happens:

- Peer 0 starts, connects to the Monitor and listens for Peer 1 to connect.
- Peer 1 starts, connects to the Monitor and connects to Peer 0
- Then both peers loads pre-processing material and perform input-gates obtaining the initial shared AES state and reports "Ready" to the Monitor.
   Then they wait for the Monitor to signal start.
- When All peers has arrived at an initial AES-state the Monitor signals "Start" and the MPC begins.
- Upon completing the AES circuit each peer reports "Done" to the monitor.
- The Monitor records the time before the first "Start"-signal is issued until the last Peer reports back its computation has completed. The difference between these two time stamps is the computation time we report.

When to include the KeyExpansion requires a bit of discussion. When encrypting many blocks of data the key expansion can be computed once and reused. This requires that the round-keys are computed beforehand and stored. Thus using 11 representations one for each round key we can compute the key expansion once and reuse it for encrypting any number of blocks afterwards. Therefore, a good approximation of amortized execution time per block of encryption with large bodies of plain-text can be achieved with one round of encryption omitting the key expansion entirely and multiplying up. However, when measuring the latency (with a fresh key not pre-loaded) from when starting the encryption until the first block of cipher-text is ready, the key expansion does count and as we will see, it plays a significant role. In summary we care about two types of measurements: Latency from scratch and amortized execution time per block over many blocks . See the result in Figure 2. Here, xxx/AES is the number of pre-processed Mega bytes required per computed AES block.

## 2 Exploiting the absence of on-line multiplications

The representation of data used in MiniMac is carefully designed to support secure coordinate-wise multiplication of vectors. However, using the techniques we have seen in the previous section, we do not need such multiplication operations.

In this section we describe how we can exploit this fact to change the data representation so that we can compute on more data at smaller cost.

One important step in representing a vector in MiniMac format (and the only one we need to worry about here) is to encode it in a linear code. In order to support multiplications, one needs two properties from this code: first, the encoding must be in systematic form, that is, the encoded vector appears in the first positions of the resulting codeword. Second, the so-called Schur transform of the code must have large enough minimum distance. To obtain the Schur transform of a code C is the linear span of all vectors in  $\{a*b|a,b\in C\}$ , where a\*b is the coordinate-wise (or Schur) product of a and b.

The implementation from [DLT14] obtains these properties by encoding vectors of length 85 into a Reed-Solomon code of length 255. Actually, one could use a larger value than 85 and still satisfy the two properties, but since the underlying field contains a root of unity of order 255 and 85 divides 255, these choices allow us to use the FFT algorithm to encode and decode and this speeds up the computations we need quite dramatically.

However, if we do not need to do multiplications, it turns out that the only demand we need to satisfy is that the code itself has large enough minimum distance, more precisely, it just has to be at least the security parameter divided by 8 (since each field element is 8 bits long). Furthermore we no longer need the code to be in systematic form.

With these relaxations, we can choose a Reed-Solomon code of length 255 and encode vectors of length 239. Because the codeword length is still 255, we can use FFT to encode and decode (the requirement for the data length to divide 255 was only necessary to have systematic encoding and still be able to use FFT).

This change will speed up our AES implementation in two ways: first we can pack 14 AES states into one vector instead of 5, so this almost a factor 3. Second, the encoding is faster than before because we no longer need systematic encoding. The reason for this is as follows: a Reed-Salomon codeword is computed by taking a polynomial of at most a certain degree and evaluating it in a set of fixed input points (255 in our case). For systematic encoding the polynomial must take the values specified by our input in the first points, so to encode one must first interpolate to get the right polynomial and then evaluate it in the other points to get the rest of the codeword. For non-systematic encoding one just thinks of the input as coefficients of a polynomial and then we just evaluate.

We did no do the resulting AES implementation, but since the number of rounds will be the same and local computation is simpler, we can safely assume that the total time for the protocol will not be larger than before. But we now compute 14 AES instances instead of 5, and in fact we can put 15 AES instances if we settle 120 bits of security in the authentication of data values which is more than enough in practice. So we can expect an amortized time of 0.4ms per AES block and the same latency of 6ms.

The size of the pre-processing grows significantly as we now have 240 working bytes we need 240 S-Boxes and we store a 256 entry table for each. The estimated

size of the pre-processing material is  $\approx 650$  Mb per player per AES block we will try to improve on this in the following.

# 3 Minimizing size of the pre-processing material

The ideas we described so far requires a rather large amount of pre-processed material. Each of the S-Box tables we have been using so far has 256 entries where each entry is an entire MiniMac codeword which requires 1056 bytes of storage for each player. This translates to approximately 21MB of pre-processed data per player per AES round using the first method we presented. We suggest in the following a different way to represent the tables that saves a factor of about 60 in the preprocessing size. The price we pay for this optimization is one extra round of communication per AES round and some extra local computation.

The idea We first describe our idea for organizing tables in a generic fashion because we believe it can be interesting in other contexts than secure AES. So assume that we are working with an arithmetic black-box, we have computed  $\llbracket x \rrbracket$  and would like to compute  $\llbracket f(x) \rrbracket$ . We assume for concreteness that  $x \in \mathbb{F}_{2^8}$ , but this is not necessary in general. If f is rather complicated to compute via a circuit, as is the case for the AES S-Box, we can do better using a precomputed table. The first step towards this is similar to what we already did above: we will pre-process a random value  $\llbracket R \rrbracket$  and also pre-process a table  $f_{+R}$  defined as

$$f_{+R}[z+R] = f(z)$$
, for  $z = 0, \dots 255$ .

Now we can compute and open [x+R] = [x] + [R] and look up in the table. This will hide x because we add R but is of course insecure because f(x) will become public.

A slightly better idea is to pre-process a random  $\llbracket v \rrbracket$  and re-define the table as

$$f_{+R}[z+R] = f(z) + v$$
, for  $z = 0, \dots 255$ .

Now the table look-up will produce f(x) + v and we can add this to  $\llbracket v \rrbracket$  to get  $\llbracket f(x) \rrbracket$ . This is still not secure, however: we use the same mask v for all entries and so different table entries are not independent and we may reveal information on how the table was permuted and hence indirectly information on x.

So the final idea is to not store the table in the clear but instead secret share the entries additively between the players. We will only open the entry we actually look up, and now it is secure to use the same mask v for all entries. To prevent players from lying about their shares, we add standard message authentication codes (MACs) to the shares.

More concretely, this means that for each table entry w = f(z) + v, we choose in the preprocessing random  $r_1, r_2$  such that  $r_1 + r_2 = w$ , and in addition we choose random vectors  $\mathbf{a}_1, \mathbf{b}_1, \mathbf{a}_2, \mathbf{b}_2$ , these will serve as MAC keys. Then we compute MACs,  $\mathbf{m}_1 = \mathbf{a}_2 * (r_1, \ldots, r_1) + \mathbf{b}_2$  and  $\mathbf{m}_2 = \mathbf{a}_1 * (r_2, \ldots, r_2) + \mathbf{b}_1$  and give  $r_1, \mathbf{m}_1, \mathbf{a}_1, \mathbf{b}_1$  to the first player and  $r_2, \mathbf{m}_2, \mathbf{a}_2, \mathbf{b}_2$  to the other. Here, \* denotes the coordinate-wise (or Schur) product of vectors.

We will use (w) to denote all this data in the following. The reader should think of this as a randomized representation of w that can be reliably opened: the players would exchange shares and MACs and then use their keys to check the MACs. It is well known and easy to prove that having, say, the first player accept an incorrect value requires that you guess  $a_1$ . So if we choose the length of  $a_i$  and  $b_i$  to be 8 bytes, for instance, we get 64 bits of (unconditional) security which should be more than enough in most cases.

So the final table is of form

$$f_{+R}[z+R] = (f(z)+v), \text{ for } z=0,\dots 255.$$

We will need one representation  $(\cdot)$  for each table entry, but the values  $a_1$  and  $a_2$  can be the same for all entries without affecting security. So in this case, a table entry requires essentially 1+8+8=17 bytes for each player. This is a factor more than 60 less than the 1056 bits we needed before.

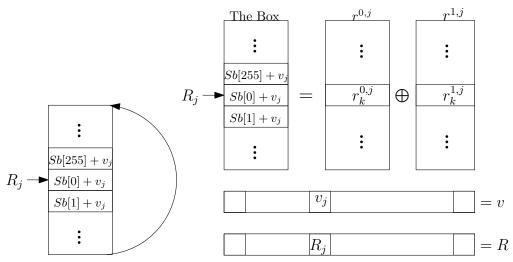
A final observation is that if what we really want to compute is not  $\llbracket f(x) \rrbracket$  but  $\llbracket L(f(x)) \rrbracket$  where L is a linear function, then we can precompute  $\llbracket L(v) \rrbracket$ . When players have computed f(x) + v they can locally compute L(f(x) + v) = L(f(x)) + L(v) and add this into  $\llbracket L(v) \rrbracket$  to get  $\llbracket L(f(x)) \rrbracket$ .

Using the Idea for AES In the following we describe our observation above using plain codewords with 240 working bytes in each representation. We start by designing the content of the pre-processed S-Boxes differently as follows. We have a random  $[R] = [R_0, ..., R_{239}]$  and 240 tables in mind namely one table for each byte in our 15 AES states. Let  $[S] = [S_0, ..., S_{239}]$  denote the MiniMac representation holding our 15 AES states. For  $S_j$  the jth state byte we consider the table with S-Box values rotated by  $R_j$  and masked with a single  $v_j$  from a random  $v \in \mathbb{F}_{2^8}^{240}$ , see Figure 6a. Now our idea is to additively share this table between the players with MACs. Thus each player m gets a table  $r^{m,j}$  such that the entries  $r_k^{m,j}$  in  $r^{m,j}$  add up to  $Sb[(R_j + k) \mod 256] + v_j = \sum_{m=0}^{n-1} r_k^{m,j}$  for fixed k, j summing over m adding each of the shares held by the players. This is illustrated in Figure 6b for two players, e.g.  $m \in \{0,1\}$ . Each table  $r^{m,j}$  is MACed towards the other player(s). Thus in addition player m has a table  $M(r^{l,j})$  for  $l \in \{i | 0 \le i < n \land i \ne m\}$ . For two players the situation is depicted in Figure 7 Thus we define an AESBox in this new set up as a triple of three things: A random representation [R], a random representation  $\mathbf{v}$  with the SRMC-linear transformation applied to it  $[SRMC \times v]$  and a set of 240 tables with 256 entries constructed as described above.

$$AESBox = \{ [\![R]\!], [\![SRMC_{15} \times \mathbf{v}]\!], \{ (\![r_k^j]\!] \}_{j \in [239], k \in [255]} \}$$

Here we used  $(r_k^j)$  to denote the set of values shared with MACs as described in Figure 7 for all the players constituting table j.

The on-line phase is summarized in Figure 8. Similar to our previous solution we start by taking an  $AESBox = (\llbracket R \rrbracket, \llbracket SRMC \times v \rrbracket, \{ (r_k^j) \}_{j \in 239, k \in [255]} \})$  and "blind" the the current states in S by adding our random R to it obtaining  $\llbracket \Delta \rrbracket =$ 



(a) Table with 256 S-Box entries(b) The Box intended for state position j now additively rotated by a random value  $R_j$ shared in  $r^{0,j}$  and  $r^{1,j}$ . Player i gets table  $r^{i,j} = (r_0^{i,j}, ..., r_{255}^{i,j})$ . and masked by  $v_j$ . Each entry is Each players also gets his shared state for  $[\![\mathbf{v}]\!]$  and  $[\![R]\!]$ . one byte.

Fig. 6: The new layout

 $\llbracket S \oplus R 
rbracket$ . Then we open  $\llbracket \Delta 
rbracket$  to everyone. Now since our  $r^{m,j}$  tables are shares of the S-Box masked by  $v_j$  and rotated by  $R_j$  we can lookup  $(Sbox[S_j] \oplus v_j)$  by letting each player m take  $r_{\Delta_j}^{m,j}$  to be his share of  $(T_j) = (Sb[S_j] \oplus v_j)$ . As  $\mathbf{v}$  is randomly chosen it blinds the actual value looked up in the S-Box thus we can safely open  $(T_j)$ . To open  $(T_j)$  the parties exchange the Values and MACs describe above in Figure 7 and the receiving parties checks that the MACs are correct. If no one aborts everybody know  $T_j = Sb(S_j) \oplus v_j$ . Knowing all  $T_j, \forall j \in [239]$  the players compute  $T = \bigoplus_{j \in [239]} T_j$ . Now the parties take the linear transformation  $SRMC_{15}$  and apply it to T obtaining  $SRMC_{15} \times T = SRMC_{15} \times S \oplus SRMC_{15} \times v$ . Then the new state S' after SubBytes, Shift-rows and Mix-columns is computed as  $SRMC_{15} \times T \oplus \llbracket SRMC_{15} \times v \rrbracket = \llbracket SRMC_{15} \times S \oplus SRMC_{15} \times r \rrbracket$ . Finally the round key is added to the S' and the following AES round follows.

For the 10th round  $SRMC_{15}$  is replaced by the linear transformation  $SR_{15}$  which is the  $240 \times 240$  matrix having 15 SR matrices on its diagonal. Note this influences  $[SR_{15} \times v]$  requiring a bit of book keeping taking a special AESBox for the last round.

This protocol requires two rounds of communication instead of one for the first two protocols we presented. Also, it requires players to compute the linear mapping SRMC locally. This, however, can be done in a simple way by a table

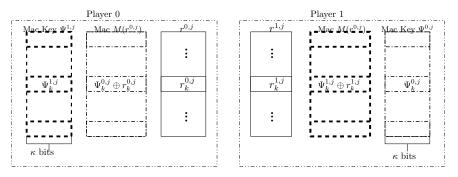


Fig. 7: Above we depict the  $(|x|) = \{\{x_0 \in \mathbb{F}_{2^8}, M(x_0) \in \mathbb{F}_{2^8}^{\kappa/8}, \Psi_1 \in \mathbb{F}_{2^8}^{\kappa/8}\},$  $\{x_1 \in \mathbb{F}_{2^8}, M(x_1) \in GF^{\kappa/8}, \Psi_0 \in \mathbb{F}_{2^8}^{\kappa/8}\}\}$  representation. Player 0 hold from left to right a MAC key table, a Mac table and a table of values. The Key table allows Player 0 to check the table of values held by Player 1. The MAC table allows player 0 to convince Player 1 his table of values is authentic.

#### $\Phi_{AESRound}$

- 1 Take an available  $AESBox = ([\![R]\!], [\![SRMC \times v)\!], \{(\![r_k^j]\!]\}_{j \in [239], k \in [255]})$
- **2** All parties compute  $\llbracket \Delta \rrbracket = \llbracket S \rrbracket \oplus \llbracket R \rrbracket = \llbracket S \oplus R \rrbracket$
- **3**  $\llbracket \Delta \rrbracket$  is opened to each player.
- **4** Each player uses  $\Delta_j$  to lookup  $r_{\Delta_j}^{m,j}$ , obtaining  $(T_j) = (Sb(S_j) \oplus v_j)^a$  as a  $(\cdot)$ representation between them.

- 5  $T_j$  is opened to everyone for  $j \in [239]$ . 6 The players compute  $T = \sum_{j=0}^{239} T_j = Sb(S) \oplus v$ 7 The players computes  $SRMC \times T = SRMC \times Sb(S) \oplus SRMC \times v$
- 8 The players take  $S' = SRMC \times T \oplus \llbracket SRMC \times v \rrbracket = \llbracket SRMC \times Sb(S) \rrbracket$  as the AES state after SubBytes, Shift-rows and Mix-columns.
- **9** Finally the AES round key  $[K_{round}]$  is added obtaining the next state  $S_{round+1} =$  $S' \oplus K_{round}$ .

Fig. 8:  $\Phi_{AESRound}$ 

look-up for each byte position in the input. Therefore we conservatively estimate that this protocol will require twice the time needed for protocol 1.

 $a r_{\Delta_i}^{m,j}$  is the particular share each player can lookup. Here we use  $(T_j)$  when referring to these shares as a combined shared value  $T_j$  mutually authenticated with MACs.

## 4 Pre-processing from the original MiniMac Protocol

Our solutions above put some quite specialized requirements on the pre-processing material. In this section we show how one may generate such data by first running the pre-processing phase of the original MiniMac protocol and then using this to run the original MiniMac online phase. We set this up such that the function we compute will output the pre-processing material we need for our construction. We will describe how to generate the AESBoxes as required by our protocol in Section 1. Generating pre-processing material for the protocol in sections 2 and 3 is a matter of applying appropriate linear transformations to the result presented here. Our goal is to generate AESBox tables from a

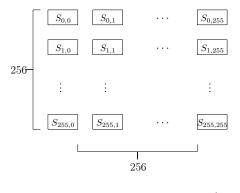


Fig. 9:  $256 \times 256$  table for entry j in  $[\![R]\!]$  with entry  $S_{i,s} = SRMC_5 \times \Psi$  for  $\Psi$  having SBox[i+s] in position j.

random representation  $[(R_1,...,R_{85})]$ : Getting such a random value is directly supported by MiniMac. Now for each position j in  $[(R_1,...,R_{85})]$  we take  $256^2$  as depicted in 9. Each entry  $S_{i,s}$  is a public MiniMac representation with value  $SRMC_5 \times (0,...,SBox[i+s],...,0), i \in [0;255], s \in [0;255].$ 

Recall that our protocol in Section 1 requires an AESBox to have the form:

$$s \in \mathbb{F}_{28}, AESBox_{i}[R_{i} + s] = [SRMC_{5} \times (0, ..., SBox[s], ..., 0)]$$

This is exactly the values stored in row  $R_j$  of our  $256^2$  table above. The challenge is to lookup this row. To this end we start by computing the vector  $[(0,\ldots,R_j,\ldots,0)]=(0,\ldots,1,\ldots,0)\times [\![R]\!]$ . Recall that the original MiniMac protocol in [DZ13] allows its pre-processing to generate values of the form:

$$[\![R]\!], [\![L \times R]\!]$$

for linear transformations L. The particular transformation we are after here is the one replicating  $R_j$  onto every position obtaining  $[(R_j, \ldots, R_j)]$ . Then we

compute  $\Phi_i = (\mathbf{1} - \llbracket (R_j, \dots, R_j) - \mathbf{i} \rrbracket^{255})$  for  $i \in [0; 255]$  where  $\mathbf{i}$  is the 85 vector with i in all entries. The resulting table for all  $s \in \mathbb{F}_{2^8}$  is  $AESBox_j[R_j + s] = \sum_{i=0}^{255} \Phi_i \times S_{i,s}$ .

To see why this is actually what we wanted consider  $\Phi_i$ . Because the subgroup of units in  $\mathbb{F}_{2^8}$  has order 255  $[(R_j, ..., R_j) - \mathbf{i}]^{255}$  is all ones when  $R_j \neq i$  and zero only when  $R_j = i$ . As we want ones when they are equal we compute  $(\mathbf{1} - ([(R_j, ..., R_j) - \mathbf{i}]^{255})) = \Phi_i$  which is all ones only when  $R_j = i$  and all zero otherwise. In this way  $\Phi_i$  selects the row of  $S_{i,s}$  where  $i = R_j$  forming our  $AESBox_j$  for each possible value of s. Now the steps above are repeated for all entries in [R] forming the full  $AESBox = \{AESBox_j\}_{j=0,...,84}$ .

We note that the  $S_{i,j}$  tables do not all have to exist in memory at the same time; it is enough to generate the columns as needed on the fly.

## 5 Conclusion

We have seen that for dishonest majority protocols in the preprocessing model, the efficiency and in particular the latency of oblivious AES can be dramatically improved by tailoring the preprocessed data to the structure of AES. And that in particular that the only structure that matters is the fact that AES makes use of Sboxes with small input, so that we can use table look-up to circumvent the use of circuits to compute the non-linear parts.

Our study shows that we need only about 0.4 ms amortised time and 6 ms latency to do AES, which seems completely adequate for real life applications such as verifying 1-time passwords.

In future work, it would be interesting to see if other block ciphers or hash functions can be done securely and practically with a similar approach.

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## A Reproducing our results with the implementation

## Getting the code

The implementation of our work can be found on GitHub at http://tinyurl.com/qbx99jv

#### Requirements

- AutoMake 1.15
- Bash 3.2 or later
- Reasonable GCC compiler supporting C99 (or Windows SDK Visual Studio 2013 or later).

#### **Building on Windows IA64**

Install Visual Studio 2013 and open the solution file in

miniapps/dedicatedaes/winx64/daestest.sln. Press F7 in the x64-release build configuration to build the code. We have experienced problems with many small allocations on Windows making the

malloc and free implementation on this system degenerate in performance.

#### Building on Linux and OSX

To build the code type ./build.sh release or

./build.sh debug depending on which configuration you want. To reproduce the performance numbers reported in the paper please build in the release configuration.

#### Generating pre-processing material for testing

Running the program with command line arguments -prep will generate the default set of preprocessing material needed to compute one block of ciphertext. ./miniapps/dedicatedaes/linux/src/cheetah -prep or on windows setting

the command-line arguments and pressing F5. Alternatively the windows exe file can be located in

miniapps/dedicatedaes/winx64/daestest/Debug/daestest.exe

#### Running the protocol

Running the program with -mpc -prepfile <filename> will make the process given aes preprocessing material file for player zero listen and wait for the other players to connect.

E.g. for two players

cheetah -mpc -prepfile ./aes\_prep\_4\_player\_0.rep will start the listening peer listening on all interfaces port 2020. While cheetah -mpc -prepfile ./aes\_prep\_4\_player\_1.rep -ip xxx.yyy.zzz.www -port 2020 will connect to a peer at ip-address xxx.yyy.zzz.www on port 2020.