Lucky Microseconds: A Timing Attack on Amazon's s2n Implementation of TLS

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Abstract. s2n is an implementation of the TLS protocol that was released in late June 2015 by Amazon. It is implemented in around 6,000 lines of C99 code. By comparison, OpenSSL needs around 70,000 lines of code to implement the protocol. At the time of its release, Amazon announced that s2n had undergone three external security evaluations and penetration tests. We show that, despite this, s2n — as initially released — was vulnerable to a timing attack in the case of CBC-mode ciphersuites, which could be extended to complete plaintext recovery in some settings. Our attack has two components. The first part is a novel variant of the Lucky 13 attack that works even though protections against Lucky 13 were implemented in s2n. The second part deals with the randomised delays that were put in place in s2n as an additional countermeasure to Lucky 13. Our work highlights the challenges of protecting implementations against sophisticated timing attacks. It also illustrates that standard code audits are insufficient to uncover all cryptographic attack vectors.

Keywords: TLS · CBC-mode encryption · Timing attack · Plaintext recovery · Lucky $13 \cdot s2n$

1 Introduction

In late June 2015, Amazon announced a new implementation of TLS (and SSLv3), called s2n [Lab15,Sch15]. A particular feature of s2n is its small codebase: while s2n relies on OpenSSL or any of its forks for low-level cryptographic processing the core of the TLS protocol implementation is written in around 6,000 lines of C99. This is intended to make s2n easier to audit. Indeed, Amazon also announced that s2n had undergone three external security evaluations and penetration tests prior to release. No details of these audits appear to be in the

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public domain at the time of writing. Given the recent travails of SSL/TLS in general and the OpenSSL implementation in particular, s2n generated significant interest in the security community and technical press.¹

We show that s2n — as initially released — was vulnerable to a timing attack on its implementation of CBC-mode ciphersuites. Specifically, we show that the two levels of protection offered against the Lucky 13 attack [AP13] in s2n at the time of first release were imperfect, and that a novel variant of the Lucky 13 attack could be mounted against s2n.

The attack is particularly powerful in the web setting, where an attack involving malicious client-side Javascript (as per BEAST, POODLE [MDK14] and Lucky 13) results in the complete recovery of HTTP session cookies, and user credentials such as BasicAuth passwords. In this setting, an adversary runs malicious JavaScript in a victim's browser and additionally performs a Person-inthe-Middle attack. We note, though, that many modern browsers prefer TLS 1.2 AEAD cipher suites avoiding CBC-mode, making them immune to the attack described in this work if the sever also supports TLS 1.2 cipher suites as s2n does. The issues identified in this work have since been addressed in s2n, partly in response to this work, and current versions are no longer vulnerable to the attacks described in this work.

We stress that the problem we identify in s2n does not arise from reusing OpenSSL's crypto code, but rather from s2n's own attempt to protect itself against the Lucky 13 attack when processing incoming TLS records. It does this in two steps: (1) using additional cryptographic operations, to equalise the running time of the record processing; and (2) introducing random waiting periods in case of an error such as a MAC failure.

Step (1) involves calls to a function s2n_hmac_update, which in turn makes hash compression function calls to, for example, OpenSSL or LibreSSL. The designers of s2n chose to draw a line above which to start their implementation, roughly aligned at the boundary between low-level crypto functions and the protocol itself. The first part of our attack is focused at the lowest level above that line. Specifically, we show that the desired additional cryptographic operations may not be carried out as anticipated: while s2n always fed the same number of bytes to s2n_hmac_update, to defeat timing attacks, this need not result in the same number of compression function calls of the underlying hash function. Indeed this latter number may vary depending on the padding length byte which controls after how many bytes s2n_hmac_digest is called, this call producing a digest over all data submitted so far. We can also arrange that subsequent calls to s2n_hmac_update do not trigger any compression function calls at all. This has the effect of removing the timing equalisation and reopening the window for an attack in the style of Lucky 13.

The second part of our attack is focussed on step (2), the random waiting periods introduced in s2n as an additional protection against timing attacks.

 $^{^1}$ See for example http://www.theregister.co.uk/2015/07/01/amazon_s2n_tls_library/, http://www.securityweek.com/amazon-releases-new-open-source-implementation-tls-protocol.

The authors of [AP13] showed that adding random delays as a countermeasure to Lucky 13 would be ineffective if the maximum delay was too small. The s2n code had a maximum waiting period that is enormous relative to the processing time for a TLS record, 10s compared to around 1 µs, putting the attack techniques of [AP13] well out of contention. However, the initial release of s2n used timing delays generated by calls to sleep and usleep, giving them a granularity much greater than the timing differences arising from the failure to equalise the running time in step (1). Consequently, at a high level, we were able to bypass step (2) by "mod-ing out" the timing delays provided by sleep and usleep. However, the reality is slightly more complex than this simple description would suggest, because those functions do not provide delays that are exact multiples of 1 µs but instead themselves have distributions that need to be taken into account in our statistical analysis. Weaknesses in random delays as countermeasures to timing side-channels have been point out before, cf. [CK10]. In contrast to previous work, though, here the source of timing differences was not close enough to uniform, allowing our analysis of the low-level code to "leak through" the random timing delays, despite them being very large.

Our attack illustrates that protecting TLS's CBC construction against attacks in the style of Lucky 13 is hard (cf. [AIES15]). It also shows that standard code audits may be insufficient to uncover all cryptographic attack vectors.

Our attack can be prevented by more carefully implementing countermeasures to the Lucky 13 attack that were presented in [AP13]. A fully constant time/constant memory access patch can be found in the OpenSSL implementation; its complexity is such that around 500 lines of new code were required to implement it, and it is arguable whether the code would be understandable by all but a few crypto-expert developers. It is worth noting that the countermeasure against Lucky 13 in OpenSSL does not respect the separation adopted in the s2n design, i.e. it avoids higher-level interfaces to HMAC but makes hash compression function calls directly on manually constructed blocks. The s2n code was patched to prevent our attacks using a different strategy, (mostly) maintaining the above-mentioned separation. At a high-level, the first step of our attacks exploits that s2n counted bytes submitted to HMAC instead of compression function calls. In response, s2n now counts the number of compression function calls. Furthermore, the second s2n countermeasure was strengthened by switching from using usleep to using nanosleep.

1.1 Disclosure and Remediation

We notified Amazon of the issue in step (1) of their countermeasures, in the function $s2n_verify_cbc$ in s2n on 5th July 2015. Subsequently and in response, this function was revised to address the issue reported. This issue in itself does not constitute a successful attack because s2n also implemented step (2), the randomised waiting period, as was pointed out to us by the developers of s2n. This countermeasure has since been strengthened by switching to the use of

² See [Lan13] for a detailed description of the patch.

nanosleep to implement randomised wait periods. This transition was already planned by the developers of s2n prior to learning about our work, but the change was accelerated in response to it. Our work shows that the switch to using nanosleep was a good decision because this step prevents the attacks described in this work.³

1.2 Lucky 13 Remedies in Other Libraries

As mentioned above OpenSSL prevents the Lucky 13 attack in 500 lines of code which achieves fully constant time/memory access [Lan13]. GnuTLS does not completely eliminate all potential sources of timing differences, but makes sure the number of compression function calls is constant and other major sources of timing differences are eliminated. As reported in [Mav13] this results in timing differences in the tens of nanonseconds, likely too small to be exploited in practice. In contrast, GoTLS as of now does not implement any countermeasure to Lucky 13. However, a patch is currently under review to equalise the number of compression function calls regardless of padding value [VF15]. This fix does not promise constant time/memory access. Botan does not implement any countermeasure to Lucky 13. WolfSSL implements the recommended countermeasures to Lucky 13 from [AP13].⁵

2 The TLS Record Protocol and S2n

The main component of TLS of interest here is the Record Protocol, which uses symmetric key cryptography (block ciphers, stream ciphers and MAC algorithms) in combination with sequence numbers to build a secure channel for transporting application-layer data. In SSL and versions of TLS prior to TLS 1.2, the only encryption option uses a MAC-Encode-Encrypt (MEE) construction. Here, the plaintext data to be transported is first passed through a MAC algorithm (along with a group of 13 header bytes) to create a MAC tag. The supported MAC algorithms are all HMAC-based, with MD5, SHA-1 and SHA-256 being typical hash algorithms. Then an encoding step takes place. For the RC4 stream cipher, this just involves concatenation of the plaintext and the MAC tag, while for CBC-mode encryption (the other possible option), the plaintext, MAC tag, and some encryption padding of a specified format are concatenated. In the encryption step, the encoded plaintext is encrypted with the selected cipher. In the case where CBC-mode is selected, the block cipher is DES, 3DES

³ We also note that the first fix was still vulnerable to a timing attack in step (1), as reported in [ABBD15]. This further highlights the delicacy of protecting against timing side-channel attacks and that the move towards using nanosleep was a good decision.

 $^{^4}$ https://github.com/randombit/botan/blob/master/src/lib/tls/tls_record.cpp# L398.

⁵ http://www.yassl.com/forums/topic328-wolfssl-releases-protocol-fix-for-lucky-thirteen-attack.html.

or AES (with DES being deprecated in TLS 1.2). The s2n implementation supports 3DES and AES. Following [PRS11], we refer to this MEE construction as MEE-TLS-CBC.

The MEE construction used in the TLS has been the source of many security issues and attacks [Vau02, CHVV03, Moe04, PRS11, AP12, AP13]. These all stem from how the padding that is required in MEE-TLS-CBC is handled during decryption, specifically the fact that the padding is added after the MAC has been computed and so forms unauthenticated data in the encoded plaintext. This long sequence of attacks shows that handling padding arising during decryption processing is a delicate and complex issue for MEE-TLS-CBC. It, along with the attacks on RC4 in TLS [ABP+13], has been an important spur in the TLS community's push to using TLS 1.2 and its Authenticated Encryption modes. AES-GCM is now widely supported in implementations. However, the MEE construction is still in widespread use, as highlighted by the fact that Amazon chose to support it in its minimal TLS implementation s2n.

2.1 MEE-TLS-CBC

We now explain the core encryption process for MEE-TLS-CBC in more detail. Data to be protected by TLS is received from the application and may be fragmented and compressed before further processing. An individual record R (viewed as a byte sequence of length at least zero) is then processed as follows. The sender maintains an 8-byte sequence number SQN which is incremented for each record sent, and forms a 5-byte field HDR consisting of a 2-byte version field, a 1-byte type field, and a 2-byte length field. The sender then calculates a MAC over the bytes SQN||HDR||R; let T denote the resulting MAC tag. Note that exactly 13 bytes of data are prepended to the record R here before the MAC is computed. The size of the MAC tag is 16 bytes (HMAC-MD5), 20 bytes (HMAC-SHA-1), or 32 bytes (HMAC-SHA-256). We let t denote this size in bytes.

The record is then encoded to create the plaintext P by setting P=R||T||pad. Here pad is a sequence of padding bytes chosen such that the length of P in bytes is a multiple of b, where b is the block-size of the selected block cipher (so b=8 for 3DES and b=16 for AES). In all versions of TLS, the padding must consist of p+1 copies of some byte value p, where $0 \le p \le 255$. In particular, at least one byte of padding must always be added. The padding may extend over multiple blocks, and receivers must support the removal of such extended padding. In SSL the padding format is not so strictly specified: it is only required that the last byte of padding must indicate the total number of additional padding bytes. The attack on s2n that we present works irrespective of whether the padding format follows the SSL or the TLS specification.

In the encryption step, the encoded record P is encrypted using CBC-mode of the selected block cipher. TLS 1.1 and 1.2 mandate an explicit IV, which should be randomly generated. TLS 1.0 and SSL use a chained IV; our attack works for either option. Thus, the ciphertext blocks are computed as:

$$C_j = E_{K_e}(P_j \oplus C_{j-1})$$

where P_i are the blocks of P, C_0 is the IV, and K_e is the key for the block cipher E. For TLS (and SSL), the ciphertext data transmitted over the wire then has the form:

where C is the concatenation of the blocks C_i (including or excluding the IV depending on the particular SSL or TLS version). Note that the sequence number is not transmitted as part of the message.

Simplistically, the decryption process reverses this sequence of steps: first the ciphertext is decrypted block by block to recover the plaintext blocks:

$$P_j = D_{K_e}(C_j) \oplus C_{j-1},$$

where D denotes the decryption algorithm of the block cipher. Then the padding is removed, and finally, the MAC is checked, with the check including the header information and a version of the sequence number that is maintained at the receiver.

However, in order to avoid a variety of known attacks, these operations must be performed without leaking any information about what the composition of the plaintext blocks is in terms of message, MAC field and padding, and indeed whether the format is even valid. The difficulties and dangers inherent in this are explained at length in [AP13].

For TLS, any error arising during decryption should be treated as fatal, meaning an encrypted error message is sent to the sender and the session terminated with all keys and other cryptographic material being disposed of.

2.2 Details of HMAC

As mentioned above, TLS exclusively uses the HMAC algorithm [KBC97], with HMAC-MD5, HMAC-SHA-1, and HMAC-SHA-256 being supported in TLS 1.2.⁶ To compute the MAC tag T for a message M with key K_a , HMAC applies the specified hash algorithm H twice, in an iterated fashion:

$$T = H((K_a \oplus \operatorname{opad})||H((K_a \oplus \operatorname{ipad})||M)).$$

Here opad and ipad are specific 64-byte values, and the key K_a is zero-padded to bring it up to 64 bytes before the XOR operations are performed. All the hash functions H used in TLS have an iterated structure, processing messages in chunks of 64 bytes (512 bits) using a compression function, with the output of each compression step being chained into the next step. Also, for all relevant hash functions used in TLS, an 8-byte length field followed by padding of a specified byte format are appended to the message M to be hashed. The padding is at least 1 byte in length and extends the data to a (56 mod 64)-byte boundary.

⁶ TLS ciphersuites using HMAC with SHA-384 are specified in RFC 5289 (ECC cipher suites for SHA256/SHA384) and RFC 5487 (Pre-Shared Keys SHA384/AES) but we do not consider the SHA-384 algorithm further here.

In combination, these features mean that HMAC implementations for MD5, SHA-1 and SHA-256 have a distinctive timing profile. Messages M of length up to 55 bytes can be encoded into a single 64-byte block, meaning that the first, inner hash operation in HMAC is done in 2 compression function evaluations, with 2 more being required for the outer hash operation, for a total of 4 compression function evaluations. Messages M containing from 56 up to 64+55=119 bytes can be encoded in two 64-byte blocks, meaning that the inner hash is done in 3 compression function evaluations, with 2 more being required for the outer operation, for a total of 5. In general, an extra compression function evaluation is needed for each additional 64 bytes of message data. A single compression function evaluation takes typically a few hundred clock cycles.⁷

Implementations typically implement HMAC via an "IUF" interface, meaning that the computation is first initialised (I), then the computation is updated (U) as many times as are needed with each update involving the buffering and/or hashing of further message bytes. When the complete message has been processed, a finalisation (F) step is performed. In s2n, OpenSSL or any of its forks is used to implement HMAC. The initialisation step $s2n_hmac_init$ carries out a compression function call on the 64-byte string $K_a \oplus ipad$. The update step $s2n_hmac_update$ involves buffering of message bytes and calls to the compression function on buffered 64-byte chunks of message. Note that no compression function call will be made until at least 64 bytes have been buffered. The finalisation step $s2n_hmac_digest$ consists of adding the length encoding and padding, performing final compression function calls to compute the inner hash and then performing the outer hash operation (itself involving 2 compression function evaluations).

2.3 HMAC Computations After Decryption in s2n

The s2n implementation uses the code in Fig. 1 to check the MAC on a record in the function s2n_verify_cbc. This code is followed by a constant-time padding check that need not concern us here (except to note that the fact that it is constant time helps our attack, since it enables us to isolate timing differences coming from this code fragment). In Fig. 1, the content of buffer decrypted->data is the plaintext after CBC-mode decryption. The header SQN||HDR of 13 bytes is dealt with by the calling function.

Notice how the code first computes, using the last byte of plaintext, a value for padding_length, the presumed length of padding that should be removed (excluding the pad length byte). Arithmetic is then performed to find payload_length, the presumed length of the remaining payload over which the HMAC computation is to be done. The actual HMAC computation is performed via an initialise call (not shown), and then the code in line 78 (update via the function s2n_hmac_update) and line 84 (finalise via the function s2n_hmac_digest). Line 86 compares the computed HMAC value with that

 $^{^7}$ For example, SHA-256 takes about 550 cycles per block on one of our test systems, an Intel Core i7–4850HQ CPU @ 2.30 GHz, whereas SHA-1 takes about 300 cycles.

contained in the plaintext, and sets a flag mismatches if they do not match as expected.

Line 79 copies the HMAC state to a dummy state, so that line 89 can perform a dummy s2n_hmac_update computation on data from the plaintext buffer. This attempts to ensure that the number of hash computations carried out is the same, irrespective of the amount of padding that should be removed. This is in an effort to remove the timing channel exploited in the Lucky 13 attack. The number of bytes over which the update is performed is equal to decrypted->size - payload_length - mac_digest_size - 1, which is one less than the number of bytes in the plaintext buffer excluding the 13 bytes of SQN||HDR, the message, and the MAC value. Recall, however, that this update operation may not actually result in any compression function computations being carried out. What happens depends on exactly how many bytes are already sitting unprocessed in the internal buffer and how many are added to it in the call.

2.4 Randomised Waiting Period

In order to additionally protect against attacks exploiting timing side-channels, s2n implements the following countermeasure: whenever an error occurs, the

```
67
     int payload_and_padding_size = decrypted->size - mac_digest_size;
68
69
     /* Determine what the padding length is */
70
     uint8_t padding_length = decrypted->data[decrypted->size - 1];
71
72
     int payload_length = payload_and_padding_size - padding_length \
73
     if (payload_length < 0) {
74
          payload_length = 0;
75
76
     /* Update the MAC */
77
78
     GUARD(s2n_hmac_update(hmac, decrypted->data, payload_length));
79
     GUARD(s2n_hmac_copy(&copy, hmac));
80
     /* Check the MAC */
81
     uint8_t check_digest[S2N_MAX_DIGEST_LEN];
82
     lte_check(mac_digest_size, sizeof(check_digest));
83
84
     GUARD(s2n_hmac_digest(hmac, check_digest, mac_digest_size));
85
     int mismatches = s2n_constant_time_equals(decrypted->data +
86
                                                payload_length,
                                                check_digest,
                                                mac_digest_size) ^ 1;
87
     /* Compute a MAC on the rest of the data so that we perform
88
        the same number of hash operations */
89
     GUARD(s2n_hmac_update(&copy, decrypted->data + payload_length +
                           mac_digest_size,
                           decrypted->size - payload_length -
                           mac_digest_size - 1));
```

Fig. 1. Excerpt from $s2n_verify_cbc$, s2n's code for checking the MAC on a TLS record

implementation waits for a random period of time before sending an error message. We reproduce the relevant code excerpts in Fig. 2; at a high level, when a MAC failure occurs, the following steps are taken:

- All available data is erased. Depending on the amount of buffered data, the time this takes may vary.
- All connection data is wiped, which may also introduce a timing difference.
- A random integer x between 1,000 and 10,001,000 is requested. Since rejection sampling is used to generate x, this might also introduce some timing variation.
- This random integer is then fed to usleep and sleep calls (after the appropriate scaling), causing a random delay of at least $x \mu s$.

```
s2n_record_read.c
91 int s2n_record_parse(struct s2n_connection *conn)
         /* Padding */
238
239
         if (cipher_suite->cipher->type == S2N_CBC) {
             if (s2n_verify_cbc(conn, mac, &en) < 0) {
240
241
                 GUARD(s2n_stuffer_wipe(&conn->in));
                 S2N_ERROR(S2N_ERR_BAD_MESSAGE);
242
243
                 return -1;
             }
244
s2n_recv.c
36 int s2n_read_full_record(struct s2n_connection *conn, \
                               uint8_t *record_type, int *isSSLv2)
97
         /* Decrypt and parse the record */
98
         if (s2n_record_parse(conn) < 0) {
99
             GUARD(s2n_connection_wipe(conn));
             if (conn->blinding == S2N_BUILT_IN_BLINDING) {
100
101
                 int delav:
102
                 GUARD(delay = s2n_connection_get_delay(conn));
                 GUARD(sleep(delay / 1000000));
103
                 GUARD(usleep(delay % 1000000));
104
             }
105
106
             return -1;
107
         }
```

Fig. 2. Excerpts from s2n_record_read.c and s2n_recv.c, s2n's code for adding a random waiting period

We note that this countermeasure, which is activated by default, is designed as an API mode which can in principle be disabled. This is to support implementations which provide their own timing channel countermeasures. If the variable blinding is not equal to S2N_BUILT_IN_BLINDING then none of the countermeasure code is run.⁸ Since this countermeasure introduces a delay of up to 10 s in

⁸ However, we note that a bug in the version of s2n that we studied prevented this from ever happening, because the call to wipe the connection data erased this configuration flag as well.

case of an error, it might be tempting for some application developers to disable it. However, note that the s2n documentation strongly advises against disabling this counter measure without replacing it by an equivalent one on the application level.

3 The Attack Without the Random Waiting Period Countermeasure

We first describe our variant of the Lucky 13 attack against s2n assuming the random waiting period countermeasure is not present. We show how to deal with this additional countermeasure in Sect. 4.

For simplicity of presentation, in what follows, we assume the CBC-mode IVs are explicit (as in TLS 1.1 and 1.2). We also assume that b=16 (so our block cipher is AES). It is easy to construct variants of our attacks for implicit IVs and for b=8. The MAC algorithm is HMAC-H where H is either MD5, SHA-1 or SHA-256. We focus at first on the case where the MAC algorithm is HMAC-SHA-256, so that t=32. We explain below how the attack can be adapted to t=16 and t=20 (HMAC-MD5 and HMAC-SHA-1, respectively).

Let C^* be any ciphertext block whose corresponding plaintext P^* the attacker wishes to recover. Let C' denote the ciphertext block preceding C^* . Note that C' may be the IV or the last block of the preceding ciphertext if C^* is the first block of a ciphertext. We have:

$$P^* = D_{K_e}(C^*) \oplus C'.$$

Let Δ be an arbitrary block of 16 bytes and consider the decryption of a ciphertext $C^{\operatorname{att}}(\Delta)$ of the form

$$C^{\operatorname{att}}(\varDelta) = \operatorname{HDR}||C_0||C_1||C_2||C_3||C' \oplus \varDelta||C^*$$

consisting of a header field HDR containing an appropriate value in the length field, an IV block, and 5 non-IV blocks. The IV block and the first 3 non-IV blocks are arbitrary, the penultimate block $C_4 = C' \oplus \Delta$ is an XOR-masked version of C' and the last block is $C_5 = C^*$. The corresponding 80-byte plaintext is $P = P_1 ||P_2||P_3||P_4||P_5$ in which

$$P_5 = D_{K_e}(C^*) \oplus (C' \oplus \Delta)$$
$$= P^* \oplus \Lambda.$$

Notice that P_5 is closely related to the unknown, target plaintext block P^* . Notice also that, via line 67 of the code in Fig. 1, the variable payload_and_padding_size is set to 80-32=48 (recall that the 13-byte string SQN||HDR was fed to HMAC by the calling function and is buffered but otherwise unprocessed at this point). We now consider 2 distinct cases:

- 1. Suppose P_5 ends with a byte value from the set $\{0x00, \dots, 0x04\}$. In this case, the code sets padding_length to be at most 4 and then, at line 72, payload_length is set to a value that is at least 48-4-1=43 (and at most 47). This means that when the HMAC computation is performed in lines 78 (update) and 84 (finalise), the internal buffer contains at least 56 bytes (because 13 bytes were already buffered by the calling function) and exactly 5 calls to the compression function will be made, including one call that initialises HMAC and 2 that finalises it. The time equalising code at line 89 adds between 0 and 4 bytes to the internal buffer, which still holds the previous message bytes. However, because of the short length of our chosen ciphertext, the buffer ends up being exactly 60 bytes in size. This number is obtained by considering the 13 bytes of SQN||HDR, the payload_length bytes added to the buffer at line 78 and the decrypted->size - payload_length mac_digest_size - 1 bytes added to the buffer at line 89. Combining these, one arrives at there being 12 + decrypted->size - mac_digest_size bytes in the buffer. This evaluates to 60 for the particular values in the attack. Notably, this number is independent of payload_length and padding_length. The call at line 89 is to the update function rather than the finalise function, so at least 64 bytes would be needed in the buffer to cause any compression function computations to be performed at this point. Thus no compression function call is made as a consequence of the call to s2n_hmac_update at line 89.
- 2. Suppose P_5 ends with a byte value from the set $\{0x05, \ldots, 0xff\}$. In this case, the code sets padding_length to be at least 5 and then, at line 72, payload_length is set to a value that is at most 48-5-1=42 (and at least 0). This means that when the HMAC computation is performed in lines 78 (update) and 84 (finalise), the internal buffer contains at most 55 bytes and exactly 4 calls to the compression function will be made (again, including the initialisation and finalisation calls). The time equalising code at line 89 will again result in no additional calls to the compression function being made, as the internal buffer is again too small at exactly 60 bytes in size (recall that the buffer size is independent of payload_length and padding_length).

Based on this case analysis, a timing difference will arise in HMAC processing of the attack ciphertext $C^{\operatorname{att}}(\Delta)$, according to whether the last byte of $P_5 = P^* \oplus \Delta$ is from the set $\{0\mathtt{x}00,\ldots,0\mathtt{x}04\}$ or not. The difference is equal to that taken by one compression function call. This timing difference becomes evident on the network in the form of a difference in the arrival time of an error message at the man-in-the-middle attacker who injects the attack ciphertext. The difference is of the same size as that observed in the plaintext recovery attack presented in [AP13], a few hundred clock cycles on a modern processor. Of course, as in [AP13], this time difference would be affected by noise arising from network jitter, but it is sufficiently big to enable it to be detected. Furthermore, if the attacker can arrange to be co-resident with the victim in a cloud environment, a realistic prospect as shown by a line of work culminating in [VZRS15], the attacker can perform a Person-in-the-Middle attack and observe the usage of resources on the server by being co-resident.

As was the case in [AP13], the attack can be iterated as often as is desired and with different values of Δ , provided the same plaintext is repeated at a predictable location across multiple sessions. The attack as presented already takes care of the complication that each trial will involve a different key in a different TLS session; only P^* needs to be constant for it to work.

By carefully exploring the timing behaviour for different values in the last byte of Δ (each value being tried sufficiently often so as to minimise the effect of noise), the attacker can deduce the value of the last byte of P^* . For example, the attacker can try every value in the 6 most significant bits in the last byte of Δ to identify a value Δ^* for which the time taken is relatively high. This indicates that the last byte of $P^* \oplus \Delta^*$ is in the set $\{0x00, \dots, 0x04\}$; a more refined analysis can then be carried out on the 3 least significant bits of the last byte of Δ^* to identify the exact value of the last byte of P^* . The worst case cost of this version of the attack is 64 + 8 = 72 trials (multiplied by a factor corresponding to the number of trials per Δ needed to remove noise).

The attack cost can be reduced further by using initially longer ciphertexts, because the peculiar characteristics of the s2n code mean that this choice results in there being a greater number of values for (the last byte of) Δ that result in a higher processing time; the precise value of the last byte of P^* can then be pinned down by using progressively shorter ciphertexts. We omit the details of this enhancement.

3.1 Extending to Full Plaintext Recovery

In the web setting, with HTTP session cookies as the target, the attack extends in a straightforward manner to full plaintext recovery using by-now-standard techniques involving malicious client-side Javascript and careful HTTP message padding. A good explanation of how this is achieved can be found in [MDK14] describing the POODLE attack on TLS. BasicAuth passwords also form a good target; see [GPdM15] for details.

3.2 Variants for HMAC-MD5 and HMAC-SHA-1

Assume b=16 (as in AES) and consider the case of HMAC-MD5. Then, because t=16 in this case, and t is still a multiple of b, the attack described above works perfectly, except that we need to use a ciphertext having 4 non-IV blocks instead of 5. The attack also works for b=8 for both HMAC-MD5 and HMAC-SHA-256 by doubling the number of non-IV blocks used.

For HMAC-SHA-1, we have t=20. Assume b=16 (AES). Then a similar case analysis as above shows that using a ciphertext with 4 blocks result in a slow execution time if and only if the last plaintext block P_4 ends with 0x00. This leads to a plaintext recovery attack requiring, in the worst case, 256 trials per byte. The attack adapts to the b=8 case by again doubling the number of non-IV blocks used.

4 Defeating the Random Wait Period Countermeasure

As described in Sect. 2.4, s2n implemented a second countermeasure against attacks exploiting timing channels. In this section, we show how it could be defeated.

4.1 Characterising the Timing Delays

To start off, we notice that at the price of increasing the number of samples by a factor of roughly ten, we can assume that sleep at line 103 in the code in Fig. 2 is called with parameter zero, by rejecting in an attack any sample where the overall time is more than 1s. This removes one potential source of randomness. As shown in Fig. 3, calling sleep(0) has a rather stable timing profile.

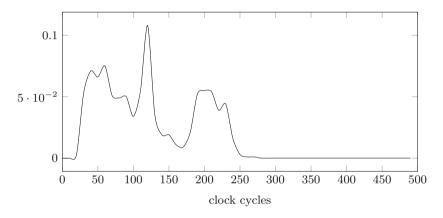


Fig. 3. Distribution of clock ticks for calling sleep(0) on Intel(R) Xeon(R) CPU E5-2667 v2 @ 3.30 GHz.

Next, we consider calls to usleep with a random delay as a source of timing randomness. For this, note that usleep has a granularity of 1 μ s. On our main test machine, which is clocked at 3.3 GHz, this translates to 3,300 clock cycles. From this, we might expect that if we take our timings modulo the clock ticks per μ s (namely, 3,300 on our test machine), we could filter out all the additional noise contributed by the usleep(delay) call. However, usleep(delay) does not guarantee to return after exactly delay μ s, or even to return after an exact number of μ s. Instead, it merely guarantees that it will return after at least delay μ s have elapsed. Indeed, on a typical UNIX system, waking up a process from sleep can take an unpredictable amount of time depending on global the state of the OS.

⁹ We note, however, that modern CPUs reclock their CPUs dynamically both below the base operating frequency and above it (e.g. Intel Turbo Boost). This must be taken into account when measuring time delays in elapsed clock cycles.

However, despite this, usleep does show exploitable non-uniform behaviour on the systems we tested. Figures 4 and 5 illustrate this behaviour. Figure 4 shows raw timings (in clock cycles) for usleep(d), normalised to remove the minimum possible delay, namely $3,300 \cdot d$ clock cycles. Figure 5 shows the distribution of timings (in clock cycles) for usleep(delay) with delay uniformly random in an

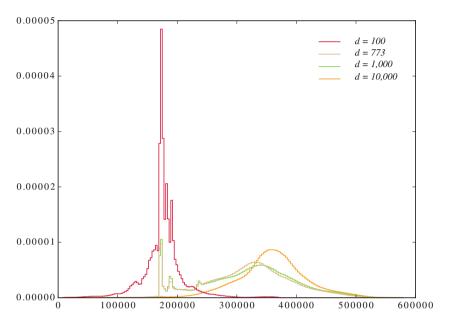


Fig. 4. Distribution of $usleep(d)-3,300 \cdot d$ (in clock cycles) on Intel(R) Xeon(R) CPU E5-2667 v2 @ 3.30 GHz. Probability on the y axis.

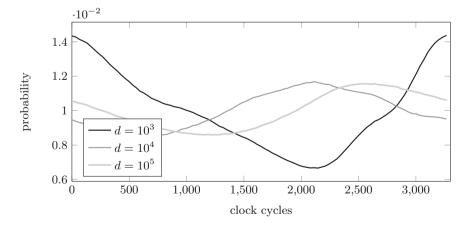


Fig. 5. Distribution of clock ticks modulo 3,300 for usleep(delay) with delay uniformly random in [0, d), on Intel(R) Xeon(R) CPU E5-2667 v2 @ 3.30 GHz.

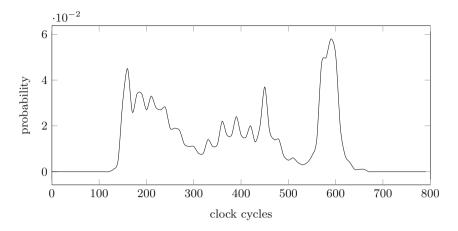


Fig. 6. Distribution of clock ticks for calling s2n_stuffer_wipe on Intel(R) Xeon(R) CPU E5-2667 v2 @ 3.30 GHz.

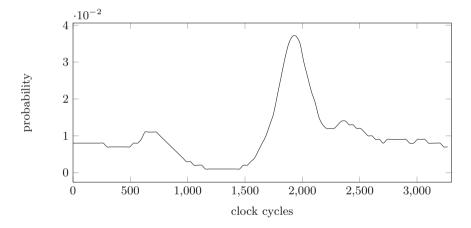


Fig. 7. Distribution of clock ticks modulo 3300 for calling $s2n_public_random$ on Intel(R) Xeon(R) CPU E5-2667 v2 @ 3.30 GHz.

interval [0, d), but now taken modulo 3,300. Both figures are generated from data captured on our main test machine. They exhibit the non-uniformity needed to bypass the random waiting period countermeasure in s2n.

Figures 6 and 7 show that, like the call to usleep, the calls to the functions s2n_stuffer_wipe and s2n_public_random also do not produce timing profiles which are uniform modulo 1µs (3,300 clock cycles).

However, it is not enough to simply characterise the timing profile of the calls to usleep; rather it is necessary to study the distribution of the running time of the entire random timing delay code in Fig. 2, in combination with the code for checking the MAC on a TLS record in Fig. 1, for different values of the mask Δ in the attack in Sect. 3. Figure 8 brings different sources of timing

difference together and shows that the timing distributions (modulo 3,300) that are obtained for different mask values are indeed still rather easily distinguishable. The figure is for samples with the maximum delay restricted to $100,000\,\mu s$ instead of 10 s. We stress that this is a synthetic benchmark for studying the behaviour of the various sources of timing randomness and does not necessarily represent actual behaviour. See Sect. 5 for experiments with the actual s2n implementation of these countermeasures.

4.2 Distinguishing Attack

Having characterised the timing behaviour of the s2n code, as exemplified in Fig. 8, we are now in a position to describe a statistical attack recovering plaintext bytes and its performance. In fact, the approach is completely standard: given the preceding analysis, we expect the timing distributions modulo 1μ s for ciphertexts in the attack of Sect. 3 to fall into two classes depending on the value of the last byte of $P^* \oplus \Delta$, one class $H = \{0x00, \dots, 0x04\}$, the other class $L = \{0x05, \dots, 0xff\}$; if the observed distributions for all values in L (resp. H) are close to each other but the Kullback-Leibler (KL) divergence between distributions from L and H is large (and equal to D, say), then, applying standard statistical machinery, we know that we will require about 1/D samples to distinguish samples from the two distributions. As Tables 1 and 2 demonstrate, the requirements on KL divergence for values in L and H are indeed satisfied, even for relatively large values for the maximum delay.

For example, assuming for the sake of argument that no additional noise is introduced by network jitter or other sources, we would be able to distinguish the value 0x00 from 0xc8 in the last byte of $P^* \oplus \Delta$ with $1/(3.6/1,000) \approx 280$ TLS sessions if the maximum delay were restricted to $100,000 \,\mu\text{s}$. Using rejection sampling, i.e. discarding all samples with a delay greater than $100,000 \,\mu\text{s}$ from

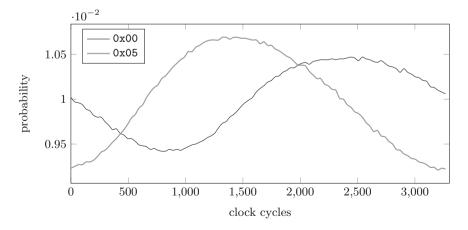


Fig. 8. Distribution of clock ticks modulo 3,300 for timing signals on Intel(R) Xeon(R) CPU E5-2667 v2 @ $3.30\,\text{GHz}$ with the maximum delay restricted to d=100,000.

Table 1. KL divergence multiplied by 1,000 of time distributions in clock cycles modulo 3,300 with the maximum delay limited to $1,000\mu s$ on Intel(R) Xeon(R) CPU E5-2667 v2 @ $3.30\,\mathrm{GHz}$.

	0x00	0x04	0x05	0x10	0x20	0x30	0x40	0x64	0xc8
0x00	.0	.7	14.1	15.1	17.7	13.2	18.4	17.4	17.6
0x04	.7	.0	15.4	16.8	19.5	15.3	20.0	18.9	19.3
0x05	14.0	15.3	.0	.1	.2	.3	.3	.2	.2
0x10	15.0	16.6	.1	.0	.1	.2	.2	.1	.1
0x20	17.4	19.2	.2	.1	.0	.5	.0	.0	.0
0x30	13.0	15.1	.3	.2	.5	.0	.7	.5	.5
0x40	18.2	19.7	.3	.2	.0	.7	.0	.0	.0
0x64	17.2	18.7	.2	.1	.0	.5	.0	.0	.0
0xc8	17.4	19.0	.2	.1	.0	.5	.0	.0	.0

Table 2. KL divergence (scaled by 1,000 for readability) of time distributions in clock cycles modulo 3,300 with the maximum delay limited to $100,000 \,\mu s$ on Intel(R) Xeon(R) CPU E5-2667 v2 @ 3.30 GHz.

	0x00	0x04	0x05	0x10	0x20	0x30	0x40	0x64	0xc8
0x00	.0	.0	2.4	1.9	2.3	2.0	2.8	2.1	3.6
0x04	.0	.0	2.3	1.8	2.1	2.0	2.6	1.9	3.3
0x05	2.4	2.3	.0	.0	.0	.1	.0	.0	.2
0x10	1.9	1.8	.0	.0	.1	.1	.1	.0	.3
0x20	2.3	2.1	.0	.1	.0	.2	.0	.0	.1
0x30	2.0	2.0	.1	.1	.2	.0	.3	.2	.5
0x40	2.8	2.7	.0	.1	.0	.3	.0	.1	.0
0x64	2.1	1.9	.0	.0	.0	.2	.1	.0	.2
0xc8	3.6	3.4	.2	.3	.1	.5	.0	.2	.0

the actual distribution produced by s2n (where the maximum delay is 10 s), this increases to roughly 28,000 TLS sessions for a successful distinguishing attack. We stress that this estimate is optimistic because it is derived from a synthetic benchmark not the actual implementation and because the surrounding code and network jitter will introduce additional noise.

4.3 Plaintext Recovery Attack

We can extend this distinguishing attack to a plaintext recovery attack in the following (standard) way. We assume that in a characterisation step, we have obtained, for possible value x of the last byte in block P_5 , a histogram of the timing distribution modulo $1 \mu s$ for ciphertexts $C^{\text{att}}(\Delta)$ of the form used in

Byte value	Cycles	Byte value	Cycles	Byte value	Cycles
0x00	2251.96	0x05	1746.49		
0x01	2354.57	0x06	1747.65	0xfc	1640.79
0x02	2252.07	0x07	1705.62	0xfd	1634.61
0x03	2135.11	0x08	1808.73	0xfe	1648.70
0x04	2130.02	0x09	1806.50	Oxff	1634.64

Table 3. Timing of function $s2n_verify_cbc$ (in cycles) with H = SHA-256 for different values of last byte in the decrypted buffer, each cycle count averaged over 2^8 trials.

the attack. We assume these timings are distributed into B equal-sized bins, and so the empirical probability of each bin $p_{x,b}$ for $0 \le b < B$ can be calculated. (In fact, since we expect that timing behaviours for the classes H and L are similar, it is sufficient to sample for two values x, one from each class.)

Now, in the actual attack, for each value δ of the last byte of Δ , we obtain N samples for ciphertexts $C^{\rm att}(\Delta)$ for which the timing delay is at most $100,000~\mu s$. This then requires a total of about $256 \cdot 100 \cdot N$ TLS sessions. We bin these into B bins as above, letting $n_{\delta,b}$ denote the number of values in bin b for last byte value δ . Now for each candidate value y for the last byte of P^* , we compute the log likelihood for the candidate, using the formula:

$$LL(y) = \sum_{\delta \in \{\texttt{OxOO}, \dots, \texttt{OxFF}\}} n_{\delta, b} \cdot \log(p_{\delta \oplus y, b}) \,.$$

We then output as the preferred candidate for the last plaintext byte the value y^* having the highest value of LL(y) amongst all candidates.

We omit the detailed analysis of the performance of this attack, pausing only to note that it will require more samples than the distinguishing attack because the underlying statistical problem is to now separate one correct candidate from 255 wrong candidates, and this is more demanding than the basic distinguishing problem.

To wrap up, we note that nanosleep, which is now used in s2n to add a random time delay, has a granularity of nanoseconds, does not show this behaviour, and therefore thwarts the attacks described in this work.

5 Proof of Concept

We confirmed that s2n does indeed behave as expected using the following two experiments.

For the first experiment, we setup a s2n_blob buffer of length 93 and filled it with random data. Then, we assigned all possible padding length values 0x00 to 0xff by overwriting the last byte of the buffer and timed how long the function s2n_verify_cbc took to return. As expected, the padding length values between 0x00 and 0x04 resulted in timings about 500-550 cycles longer than all other

values. The timing difference was clear and stable. Some sample data is shown in Tables 3 and 4. We note that at present we cannot explain the variation within the second and third columns of those tables.

Table 4. Timing of function $s2n_verify_cbc$ (in cycles) with H = SHA-1 for different values of last byte in the decrypted buffer, each cycle count averaged over 2^{10} trials.

Byte value	Cycles	Byte value	Cycles	Byte value	Cycles
0x00	1333.99	0x05	1095.01		
0x01	1174.29	0x06	1092.68	0xfc	1062.37
0x02	1178.52	0x07	1065.08	0xfd	1035.48
0x03	1156.56	0x08	1102.31	0xfe	1035.15
0x04	1140.14	0x09	1101.04	0xff	1036.02

For the second experiment, we ran the attack against the actual s2n implementation instead of running a synthetic benchmark. That is, we timed the execution of $s2n_recv$ under the attack described in Sect. 3. However, to speed up execution we patched s2n to only sample random delays up to $10,000 \, \mu s$. As highlighted in Table 5, this, too, shows marked non-uniform timing behaviour modulo $1 \, \mu s$.

Table 5. KL divergence observed the full attack against actual s2n implementation (scaled by 10^5 for readability) using 2^{24} samples on Intel(R) Xeon(R) CPU E5-2667 v2 @ 3.30 GHz.

	0x00	0x01	0x02	0x03	0x04	0x05	0x0a	0x10	0x20
0x00	.0	.4	.2	.1	.4	1.7	1.6	1.9	2.2
0x01	.4	.0	.4	.3	.3	2.6	2.6	2.8	3.2
0x02	.2	.4	.0	.1	.2	2.3	2.2	2.6	2.8
0x03	.1	.3	.1	.0	.3	2.1	1.9	2.3	2.7
0x04	.4	.3	.2	.3	.0	2.6	2.6	2.9	3.2
0x05	1.7	2.6	2.3	2.1	2.6	.0	.1	.2	.3
0x0a	1.6	2.6	2.2	1.9	2.6	.1	.0	.2	.3
0x10	1.9	2.8	2.6	2.3	2.9	.2	.2	.0	.2
0x20	2.2	3.2	2.8	2.7	3.2	.3	.3	.2	.0

We did not adjust our proof-of-concept code to realise a full plaintext recovery attack, because (a) s2n has since been patched in response to this work and because (b) the cost is somewhat dependent on the target machine and operating system. We note, though, that an attack can establish the characteristics of a

target machine by establishing genuine TLS sessions (where, hence, padding bytes are known) but with some random bits flipped.

The complete source codes for our experiments (which borrow heavily from the s2n test suite) are available at https://bitbucket.org/malb/research-snippets.

6 Discussion

Our attack successfully overcomes both levels of defence against timing attacks that were instituted in s2n, the first level being the inclusion of extra cryptographic operations in an attempt to equalise the code's running time and the second level being the use of a random wait interval in the event of an error such as a MAC failure.

Fundamentally, the first level could be bypassed because s2n counted bytes going into s2n-hmac_update instead of computing the number of compression function calls that need to be performed as suggested in [AP13]. A call to s2n-hmac_update in itself will not necessarily trigger a compression function call if insufficient data for such a call is provided. A call to s2n-hmac_digest, however, will pad the data and trigger several compression function calls, the number also depending on the data already submitted at the time of the call. We note that in OpenSSL this issue is avoided by effectively re-implementing HMAC in the function ss13_cbc_digest_record, i.e. by performing lower-level cryptographic operations within the protocol layer. In contrast, s2n is specifically aimed at separating those layers. In response to this work, s2n now sensibly counts the number of compression function calls performed, somewhat maintaining this separation.

The second level could be bypassed because, while the randomised wait periods were large, they were not sufficiently random to completely mask the timing signal remaining from the first step of our attack. Note that the analysis in [AP13] of the effectiveness of random delays in preventing the Lucky 13 attack assumed the delays were uniformly distributed; under this assumption, their analysis shows that the count measure is not effective unless the maximum delay is rather large. What the second step of our attack shows is that, even if the maximum delay is very large, non-uniformity in the distribution of the delay can be exploited. In short, it is vital to carefully study any source of timing delay to ensure it is of an appropriate quality when using it for this kind of protection.

Our experiments indicate that the distribution of nanonsleep as implemented on Linux is sufficiently close to uniform to thwart the attack described in this work. We note, however, that this puts a high security burden on this function which is not designed for this purpose. In particular, nanosleep(2) states (emphasis added): "nanosleep() suspends the execution of the calling thread until either at least the time specified in *req has elapsed, or the delivery of a signal that triggers the invocation of a handler in the calling thread or that terminates the process".

Finally, since randomised waiting can also have a significant performance impact, this work further highlights that MAC-then-Encrypt constructions such as MEE-TLS should be avoided where possible.

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