# **Decrypting Live SSH Traffic in Virtual Environments**

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# Abstract

Decrypting and inspecting encrypted malicious communications may assist crime detection and prevention. Access to client or server memory enables the discovery of artefacts required for decrypting secure communications. This paper develops the *MemDecrypt* framework to investigate they discovery of encrypted artefacts in memory and applies the methodology to decrypting the secure communications of virtual machines. For Secure Shell, used for secure remote server management, file transfer, and tunnelling inter alia, *MemDecrypt* experiments rapidly yield AES-encrypted details for a live secure file transfer including remote user credentials, transmitted file name and file contents. Thus, *MemDecrypt* discovers cryptographic artefacts and quickly decrypts live SSH malicious communications including detection and interception of data exfiltration of confidential data.

*Keywords:* network traffic; decryption; memory analysis; IoT; Android; VMI; Secure Shell; SSH; AES; Secure File Transfer; data exfiltration; insider attacks;

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# 1. Introduction

Decrypting malicious communications offers opportunities 36 2 to discover useful information. This could include botnet com- 37 mand and control traffic identifying compromised machines, 38 4 confidential information that has been extracted and sent or up- 39 5 loaded to an external location, ransomware keys, or details of 40 6 criminal activity [1]. This paper focuses on decrypting Secure 41 Shell (SSH) traffic, a potential medium for data exfiltration [2]. 42 8 Realistically useful decryption methods require a knowledge of 43 9 both the algorithm and the cryptographic artefacts used. En-44 10 cryption techniques based only on algorithmic secrecy may be 45 11 unreliable, as mechanisms such as reverse-engineering enable 46 12 the algorithm's functionality to be discovered and furthermore, 13 without extensive independent verification, the robustness of an 14 encryption algorithm may be weak [3]. As a result, publicly 15 known encryption algorithms are commonly used, and key se-16 crecy thus becomes paramount. Generating sufficiently long 51 17 random blocks as keys makes decryption unlikely using brute 18 force methods. 19

To decrypt, a framework must discover keys and other cryp-53 20 tographic artefacts. When software applications perform en-21 cryption and decryption, the artefacts reside in program mem-22 ory at that moment, whether on the program stack, in the heap, <sup>56</sup> 23 or in shared memory. As memory access is important to foren-57 24 sic investigations [4] software tools and libraries already exist 58 25 to support such capability for technologies such as desktops, 59 26 servers, the Internet of Things (IoT), Android smartphones, 60 27 and virtualized environments. Mechanisms to discover cryp-<sup>61</sup> 28 tographic artefacts in memory in a manner that allows the tar-62 29 get device to continue to operate normally during an investi-63 30 gation while remaining undetectable is of particular interest.<sup>64</sup> 31 This paper presents the MemDecrypt framework that stealthily 65 32 decrypts secure communications traffic. Although earlier re- 66 33

searchers have discovered encryption keys in device memory, other cryptographic artefacts, commonly required to decrypt secure traffic, are not considered. *MemDecrypt* implements a novel approach to decrypting SSH traffic by analyzing target memory extracts to identify these candidate cryptographic artefacts (initialization vectors) that, in turn, enable rapid location of candidate keys and the deciphering of payloads in live sessions with high probability. This enables malicious SSH activity in live secure communications sessions to be addressed. The techniques proposed are applicable to a range of device platforms, though the *MemDecrypt* framework is particularly focused on decrypting communications from within virtual machines.

Although plaintext could be obtained by adding an audit function to the binary, this is arguably a different application and has some similarity with a key logger, which may only be acceptable in specific environments. Also, unless all plaintext is captured rather than client input, file contents are not captured.

Plaintext could possibly be obtained by extracting on buffer memory writes. However, researchers have found that monitoring virtual machine read/write buffers is inefficient. As memory extraction is invasive minimizing the number of extracts is preferable so with buffer memory write triggers, the larger the exfiltrated file, the more extracts. To discover the plaintext of a full session, buffer breaks would need to be in place before the session. In MemDecrypt, memory can be extracted at any stage after the handshake completes to decrypt a captured network session. Buffer memory write triggers may be effective with interactive sessions as with exfiltrated data, missing an extract makes decryption problematic. Furthermore, exfiltrating non-ASCII data may be more challenging without certainty of buffer memory locations.

The rest of the paper is structured as follows. To provide

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<sup>67</sup> framework context, the background to secure communications<sup>119</sup>
<sup>68</sup> is provided in Section II. Earlier research in discovering crypto-<sup>120</sup>
<sup>69</sup> graphic artefacts is reviewed in Section III. Section IV presents<sup>121</sup>
<sup>70</sup> the *MemDecrypt* design and Section V the implementation de-<sup>122</sup>
<sup>71</sup> tails. Test results are evaluated and discussed in Section VI and<sup>123</sup>
<sup>72</sup> conclusions drawn in Section VII.

# 73 2. Related Work

This section provides a summary of symmetric encryption in-<sup>13</sup>/<sub>13</sub>
 cluding block and stream algorithms commonly used in secure
 communications protocols. Approaches for accessing memory
 to support cryptographic artefact discovery are also discussed.

Although there is no published research into finding crypto-78 graphic artefacts in Android smartphone and IOT device mem-79 ory, desktop and server memory has been studied. Entropy<sub>127</sub> 80 measures have frequently been used as a filtering mechanism to 81 discover keys. This approach assisted in searches for AES key<sub>139</sub> 82 schedules after cold-boot attacks [5] as well in finding Skipjack, 83 and Twofish algorithm artefacts [6]. These studies focus on en-141 84 cryption key discovery in dormant devices and therefore do not,12 85 decrypt the secure network sessions of live virtual machines. 86 143

Although malware analysis and detection has been a research<sub>144</sub> 87 focus for monitoring from outside the virtual machine, it has<sub>145</sub> 88 also been applied to analyze secure communications. For ex-146 89 ample, SSH session details were obtained from an SSH hon-147 90 eypot server customized to extract data when the specific sys-148 91 tem calls executed [7]. In *TLSkex* [8], AES-CBC cryptographic<sub>149</sub> 92 keys were discovered in Linux client virtual machine memory<sub>150</sub> 93 when Change Cipher Spec messages were detected in TLS net-151 94 work sessions by searching for bit strings where the counts  $of_{152}$ 95 0's and 1's suggested randomness. TLSkex investigates TLS<sub>153</sub> 96 traffic only so, for example, the uploading of confidential data<sub>154</sub> 97 using SSH is not considered. Furthermore, TLSkex analysis is155 98 restricted to Linux virtual machine so Windows virtual machine<sub>156</sub> 99 activity is excluded. The MemDecrypt framework decrypts en-157 100 tire sessions for both SSH and TLS protocols where different<sub>158</sub> 101 encryption algorithms have been applied for Windows clients<sub>159</sub> 102 and Linux servers using a standard entropy measure. Moreover, 160 103 MemDecrypt memory extractions are independent of message<sub>161</sub> 104 type and discovery of candidate initialization vectors drives the<sub>162</sub> 105 decryption process. 106 163

Encryption keys can be discovered by intercepting encryp-164 107 tion function calls to extract parameters. For example, the165 108 Linux *ptrace* command can attach to the encrypting process<sub>166</sub> 109 enabling identification of keys and other artefacts [9]. This<sub>167</sub> 110 approach may have been used to discover SSH plaintext, ci-168 111 phertext, and keys, although implementation details are unclear169 112 [10]. These approaches are Linux-specific and are easily de-170 113 tectable by virtual machine software. Consequently, they may<sub>171</sub> 114 not be effective against malicious insiders, especially when the172 115 target device runs Windows. MemDecrypt decrypts SSH net-173 116 work sessions in a stealthy manner by triggering memory ex-174 117 tracts only when an unusual event is detected. 118 175

#### 2.1. Encryption algorithms

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Encryption algorithms for secure communications are asymmetric or symmetric. For encryption and decryption, asymmetric algorithms use different keys whereas symmetric algorithms use the same keys. Asymmetric algorithms attain security through computational complexity, which takes processor time, making them considerably less CPU efficient than symmetric algorithms [11]. Consequently, asymmetric algorithms are frequently only used for agreement on symmetric keys, which are then used to encrypt the channel. Symmetric encryption algorithms are either stream algorithms, where plaintext is encrypted with either bit-by-bit or block algorithms (where blocks of a specific size are encrypted). Although the Advanced Encryption Standard (AES) block algorithm may be the gold standard, vulnerability and performance concerns have led to the adoption of ChaCha20 stream algorithm with Poly-1305 authentication [12] in secure protocols such as OpenSSH and OpenSSL, as well as being used for Google Chrome related communications on Android smartphones [13].

Block and stream algorithms commonly require initialization vectors (IVs) for secure communications. For AES, IVs incorporated in the encryption process provide defenses against replay attacks [14]. For example, in AES counter mode (AES-CTR), an IV is encrypted and XORed with the plaintext to produce ciphertext. AES-CTR is the quickest AES mode, and is recommended by security experts [3] [15]. For ChaCha20, the key, IV, and a counter are parameters to keystream creation [12]. The keystream is XORed with the plaintext to produce ciphertext. Both AES-CTR and ChaCha20 are approved for SSH [16] and TLS protocols. Consequently, encryption keys and IVs must be discovered to decrypt AES-CTR and ChaCha20 encrypted SSH and TLS channels.

This paper focuses on SSH communications. For SSH in AES-CTR mode, the IV increments by 1 for each outgoing plaintext block [17] so that the difference between the IV for the first plaintext block in packets n+1 and n is the number of plaintext blocks in packet n. Although AES-CTR is the only recommended SSH AES mode [16], AES-CBC is also used. For AES-CBC, each IV after the initial value is the ciphertext of the previous block [17]. Consequently, the IV for each encrypted AES-CBC block is known. ChaCha20 uses the IV to generate key streams. It performs 20 rounds of mathematical operations starting from a base structure consisting of a constant string of 16 bytes, a generated 32-byte key, a 4-byte counter, and a 12-byte IV, where the counter is typically 0 or 1 for each 64-byte plaintext block [12].

SSH enables secure management of remote servers across potentially insecure networks, offering functionality such as client-server file transfer. The protocol is specified in 4 key IETF RFCs: SSH Protocol Architecture (SSH-ARCH) [18], SSH Transport Layer Protocol (SSH-TRANS)[19], SSH Authentication Protocol (SSH-AUTH) [20], and the SSH Connection Protocol (SSH-CONNECT) [21]. SSH-TRANS defines the initial connection, packet protocol, server authentication, and the basic encryption and integrity service [22]. Following the TCP handshake, the parties transmit supported SSH protocol versions, and optionally application, which enables the

probable operating systems and library to be inferred. For in-232 176 stance, 'SSH-2.0-PuTTY\_Release\_0.70' probably signifies that233 177 a Windows client is executing the PuTTY application [23].234 178 Exchanged 'Key Exchange Initialization; and 'Key Exchange'235 179 messages determine the session encryption and authentication236 180 algorithm and the material for the generation of the crypto-237 181 graphic artefacts. Client New Keys messages advises that all238 182 subsequent traffic in the session is encrypted. An example of 183 the handshake process as well as the first encrypted packet is  $il_{239}$ 184 lustrated in Figure 1. SSH-AUTH defines authentication meth-185 ods such as public key, password, host based and none. After<sub>240</sub> 186 successful authentication, a file transfer requires the establish-241 187 ment of a secure channel to support the secure file transfer pro-242 188 tocol as defined by. Secure file transfer (SFTP) [24] is an  $SSH_{243}$ 189 sub-system particularly worthy for investigation as significant<sub>244</sub> 190 potential exists for it to transfer confidential files out of a sys-245 191 tem. 192 246

## 193 2.2. Memory Access

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Memory acquisition tools assist forensic analysis. So, for<sub>249</sub> 194 workstation and server technologies hardware and software ac-250 195 quisition methods exist [25]. Hardware acquisition typically<sub>251</sub> 196 involves connecting devices, such as PCMCIA cards or USB<sub>252</sub> 197 sticks, to a target [26] while software acquisition commonly in-253 198 volves executing extraction programs such as FTK Imager [27],254 199 Memoryze [28], or WinPmem [29] on the target [30]. These<sub>255</sub> 200 solutions may not always be practical in live network session<sub>256</sub> 201 decryption scenarios. 202 257

Android smartphone volatile memory is accessible. As<sub>258</sub> 203 Androids run Linux, memory acquisition tools such as the<sub>259</sub> 204 Linux Memory Extractor ('LiME') application [31] may suf-260 205 fice. However, LiME depends on compiled kernel modules<sub>261</sub> 206 for the target's Linux version, support by the smartphone and<sub>262</sub> 207 kernel level execution. The quantity of Linux variations for<sub>263</sub> 208 Android smartphones as well as the installation and execution<sub>264</sub> 209 requirements may be challenging. AMExtractor [32] requires<sub>265</sub> 210 kernel execution privilege but no compilation is required and so<sub>266</sub> 211 is potentially less restrictive. TrustDump [33] may be appropri-267 212 ate but minimal testing has been carried out. Commercial tools2008 213 such as Cellebrite also claim to extract memory from Android 214 devices without target modification although usage is restricted<sub>270</sub> 215 [34]. 216

Internet of Things (IoT) devices also commonly run Linux 217 [35]. However, device type and Linux variations pose po-218 tentially greater challenges than smartphones. Nevertheless, 219 solutions that support live acquisition from Android smart-220 watches, as well as smartphones, have been proposed [36]. 221 IoT device memory may also be acquired by flashing mem-222 ory, running Linux dump commands, or accessing device cir-223 cuitry [37]. Furthermore, memory access with commercial 224 tools, such as Cellebrite UFED Physical Analyzer, has also 225 been demonstrated [38]. As IoT devices frequently commu-226 nicate with cloud-based servers, memory acquisition of virtual-227 ized machines may present an easier alternative [35]. Virtual-271 228 ization enables memory access. Virtualization technologies en-272 229 able virtual machines to share host computer resources thereby273 230 providing an opportunity to discover cryptographic artefacts in274 231

virtual machine memory from the physical host. This ensures investigations have reduced the impact on virtual machine operations. Furthermore, software programs executing on the virtual machine, such as malware, may not detect the investigations. Examples of tools and libraries that support outsidethemachine monitoring include LibVMI [39] together with PyVMI [40] and Volatility [41], and Rekall [42].

# 3. MemDecrypt Design

*MemDecrypt* consists of network and data collection, memory analysis, and decrypt analysis components. Figure 2 illustrates the *MemDecrypt* activity flow diagram. Each component is described in the following paragraphs.

Network and Memory Extract. In MemDecrypt unusual events trigger memory extracts. This approach is less intrusive than continuous memory monitoring where the monitoring and analysis activities of the host may impact target device performance. Furthermore, malware writers script programs to be aware of monitoring activity, which would probably be more obvious with continuous monitoring. The triggers approach is also more precise than obtaining memory snapshots on a polled basis. Polling snapshots may miss malicious activity if the polling interval is too large, especially when malware uses counter analysis techniques. The quantity and timing of memory extraction events depend on the target device, the secure protocol, and the encryption algorithm. Where memory is classifiable, the read/write memory of the encryption program is extracted for size minimization, with consequent reduced impact on target performance and faster subsequent analysis.

**Memory analysis**. Candidate encryption keys and IVs are identified in the memory extracts. Although largely protocol specific, there are common features. In particular, candidate IV locations are discovered first with approaches that encompass an analysis of memory extracts, network packets or both network packets and memory extracts. As keys and IVs are cryptographic artefacts, the distance between their respective memory locations may be small If program memory extracts are taken when the same activity is being performed, such as the transmission of outgoing messages, memory blocks containing IVs change, while other blocks remain static.

Key randomness makes it different from many other types of memory regions. Key randomness means that the sequence of bits cannot be easily predicted. The randomness of keys can be evaluated using entropy, a measure of the amount of information in a key. This paper uses Shannon's entropy measure for discrete variables [43] in preference to cryptographically useful alternatives such as guessing entropy and min-entropy [44] because smaller candidate key sets are produced:

$$H = -\sum_{i=1}^{n} p(i) \log_2 p(i)$$
(1)

where p(i) is the normalized frequency of the *i*th byte in the message i.e. p(i) = f(i)/n. So, segments of high entropy user memory are more likely to contain the key. In contrast with IVs, keys do not generally change during a session. So, static,

No		Time	Source	Destination	Protocol	Length	Info
	10	13.533732	192.168.137.39	192.168.137.85	SSHv2	82	Client: Protocol (SSH-2.0-PuTTY_Release_0.70)
	11	13.535161	192.168.137.85	192.168.137.39	ТСР	54	2222 → 5488 [ACK] Seq=2885440383 Ack=1610535188 Win=29248 Len=0
	12	13.544907	192.168.137.85	192.168.137.39	SSHv2	98	Server: Protocol (SSH-2.0-OpenSSH_6.6.1p1 Ubuntu-2ubuntu2.10)
	13	13.558114	192.168.137.39	192.168.137.85	SSHv2	1158	Client: Key Exchange Init
	14	13.559490	192.168.137.85	192.168.137.39	SSHv2	430	Server: Key Exchange Init
	15	13.648092	192.168.137.39	192.168.137.85	TCP	54	5488 → 2222 [ACK] Seq=1610536292 Ack=2885440803 Win=16337920 Len=0
	16	13.685703	192.168.137.39	192.168.137.85	SSHv2	134	Client: Elliptic Curve Diffie-Hellman Key Exchange Init
	17	13.690448	192.168.137.85	192.168.137.39	SSHv2	294	Server: Elliptic Curve Diffie-Hellman Key Exchange Reply, New Keys
	18	13.710654	192.168.137.39	192.168.137.85	ТСР	54	5488 → 2222 [ACK] Seq=1610536372 Ack=2885441043 Win=16276480 Len=0
	19	18.341616	192.168.137.39	192.168.137.85	SSHv2	70	Client: New Keys
	20	18.383147	192.168.137.85	192.168.137.39	TCP	54	2222 → 5488 [ACK] Seq=2885441043 Ack=1610536388 Win=31424 Len=0
	21	18.384940	192.168.137.39	192.168.137.85	SSHv2	166	Client: Encrypted packet (len=112)

Figure 1: SSH Handshake Example



Figure 2: MemDecrypt Activity Flow Diagram

high-entropy contents are candidate encryption keys. This ob-297
 servation assists in improving memory analysis performance. 298

Decrypt analysis. Candidate keys and IVs identified in
memory analysis are used in decrypting network packets until
a valid key and IV combination has been found. Decrypt validation uses information derived from specific encrypted fields.
SSH encrypted data blocks are of the following format:

Packet Length (4 bytes) Padding Length (1 byte) Payload
(variable bytes) Padding (variable bytes) MAC

The packet length is the sum of the padding length size, the 284 payload, and padding fields. So, equation (2) is a good decrypt 285 test for many SSH messages as  $2^{(8*4-21)}$  valid packet length de-286 crypts are possible. The minimum SSH block size is 21 bytes<sub>299</sub> 287 comprising a packet length of 4 bytes, a padding length of 1 288 byte, and the payload and padding which is at least one block.300 289 So, the probability of an incorrect decrypt producing the correct<sub>301</sub> 290 header data is 1-in-4,294,967,275. Reassembly is undertaken302 291 when the SSH packet size exceeds the network packet size.303 292 Equation (2) is sound during the authentication, channel, and<sub>304</sub> 293 sub-service setup stages when SSH packet sizes are generally<sub>305</sub> 294 small and a modified version is used for reassembled SSH pack-306 295 ets. An additional test evaluates whether the decrypted padding307 296

length meets Equation (3) as required by SSH-TRANS. Correct decrypts are parsed to obtain SSH and SFTP fields.

$$4 \ll padding \ length \ll 255 \tag{3}$$

# 4. MemDecrypt Implementation

This paper focuses on SSH decryption using AES-CTR and AES-CBC in virtualized environments using *MemDecrypt*. The following paragraphs present implementation and evaluation details. The framework is implemented on the Xen hypervisor [45]. Xen's small trusted computing base makes it potentially less prone to vulnerabilities than hypervisors with larger footprints. Furthermore, the LibVMI library ("LibVMI," n.d.) for Xen enables efficient memory access to live memory of

Windows or Linux virtual machines. As the Xen hypervisor<sub>362</sub> has minimal functionality a privileged virtual machine (Dom0)<sub>363</sub> manages the hypervisor and provides network and virtual disk<sub>364</sub> device access to other virtual machines. Network access for the virtual machines is through a Dom0 virtual software bridge. The *MemDecrypt* components either all run on, or are initiated, from Dom0.

The *MemDecrypt* implementation architecture for virtualized environments is illustrated in Figure 3. An isolated hypervisor supports two unprivileged virtual machines, shown in the centre and right of the figure, and one privileged virtual machine shown on the left. Test client applications execute on the virtual machine on the right, targeting server applications executing on the virtual machine, shown in the centre.

# 322 4.1. Data Collection

For virtualized environments, virtual machine network traffic 323 is inspected by redirecting each packet to a local queue using 324 an iptables rule and NetFilterQueue 0.8.1 [46], and analyzing 325 protocol fields using Scapy 2.3 [47]. When unusual activity is<sub>365</sub> 326 detected, the component stores the network packet and decon-366 327 structs the message. Memory is extracted for any 2 outgoing<sub>367</sub> 328 SSH messages after a New Keys message. Linux memory ex-368 329 traction uses PyVMI and LibVMI libraries, whereas Windows<sub>369</sub> 330 extraction applies Volatility framework user plugins. 331 370

MemDecrypt obtains useful data from the SSH initialization<sub>371</sub> 332 stage. Client and server versions, and application if available<sub>372</sub> 333 are obtained from the protocol version exchange. The encryp-373 334 tion algorithm is determined from the "Key Exchange" mes-374 335 sages. Also, if initialization has completed, i.e. the "New Keys"<sub>375</sub> 336 has been transmitted, user-level read/write program memory<sub>376</sub> 337 extraction is triggered for two outgoing packets in the network<sub>377</sub> 338 session. Memory extracts are not required for consecutive pack-378 339 ets or to be immediately after the "New Keys" message. 340 379

#### 341 4.2. Memory Analysis

Analysis approaches vary according to encryption mode and operating system. For AES-CTR, two steps are required to discover candidate IVs and keys in memory, whereas AES-CBC requires only key discovery. For Windows, discovery is pertormed by iteratively analyzing multiple memory files extracted to different times, whereas, for Linux, a single heap file is analyzed.

For AES-CTR, candidate IVs are discovered first. As IVs388 349 increase but are likely to be located at the same memory  $\mathrm{address}_{_{389}}$ 350 over different extracts, memory blocks that change is subject<sub>390</sub> 351 to further analysis. If the 16-byte value at a memory address<sub>301</sub> 352 increments by the number of encrypted blocks in the previous 353 packet, then the address contents are a candidate IV.  $Supposing_{393}$ 354 that value at location p in capture y at the time a is compared<sub>394</sub> 355 with the value at location p in capture y at time b. Then, if the 356 values are IVs and represented by  $IV_{pya}$  and  $IV_{pyb}$  respectively, then  $IV_{pyb} = IV_{pya} + n$ , where *n* is the number of AES encrypted<sup>395</sup> 357 358 network blocks that have been sent between the time a and b in<sub>396</sub> 359 that session. For example, if the value of a 16-byte memory<sub>397</sub> 360 block is 123456 and two network packets with, say, 10 and 5398 361

encrypted blocks are sent and captured, then a value of 123471 at the same position in the later extract identifies a candidate AES-CTR IV. Algorithm 1 shows the process.

Data: extract folders  $fldr_a$ ,  $fldr_b$  and packets  $pkt_a$ ,  $pkt_b$ Result: Z = candidate IVs delta := blocks[ $pkt_a:pkt_b$ ]; for file  $f_1$  in  $fldr_a$  do  $f_2$  = match  $(f_1, fldr_b)$ ; if  $f_1 <> f_2$  then | for i = 0 to  $size(f_1)$  inc 4 do | if  $val(f_2[i:i+16]) - val(f_1[i:i+16]) = delta$  then | Z +=  $f_1[i:i+16]$ ; | end | end | end | end

Algorithm 1: AES-CTR IV Memory Analysis

To discover AES candidate keys for AES-CTR and AES-CBC, the memory extract files are analysed. Key segment entropies are calculated for key length segment sizes. If an entropy exceeds a threshold, the segment is compared with the equivalent segment in a later extract, and if the segments are identical, the segment is a candidate encryption key. For example, a 256-bit key length, a 32-byte memory segment entropy of 4.9, and a 32-byte AES threshold of 4.65 determines the segment to be of interest. An identical match to the segment at the same location in a later memory extract identifies a candidate key. The identified candidate IVs and keys provide input to the decrypt analysis stage. Heuristic testing determined that AES entropy thresholds of 4.65 for 256-bit keys, 4.0 for 192-bit keys, and 3.4 for 128-bit keys ensured the inclusion of all keys in candidate sets while minimizing set size.

#### 4.3. Decrypt Analysis

The component iterates through each candidate key for each candidate IV until decrypts are validated. The first ciphertext block is decrypted for each combination with pycrypto 2.6.1 [48]. For a correct decrypt the first four plaintext bytes are the packet length and Equation (2) holds. For additional validation, the decrypted padding length is checked with Equation (3). With a valid key and IVs, *MemDecrypt* decrypts each block and deconstructs the SSH plaintext stream. For SSH authorization requests, the 'password' type plaintext yields the remote user credentials and for SSH connection requests, the channel type, and channel request decrypts. For SFTP, all plaintext is produced including *initialization, file attribute, file open, write* and *close* message types fields. All plaintext is written to file for evaluation.

# 4.4. Testbed

The physical environment is a Core 2 Duo Dell personal computer with 40 GB of disk storage and 3 GB of RAM. It hosts the hypervisor, a Dom0 privileged virtual machine, an untrusted

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Figure 3: MemDecrypt Virtualization Architecture

Windows virtual machine, and an untrusted Ubuntu virtual ma-436 399 chine. The hypervisor is Xen Project 4.4.1 and the Dom0 hy-437 400 pervisor console is Debian release 3.16.0-4-amd64 version 1. 438 401 Tests run on Windows client and Linux server virtual ma-439 402 chines. One client runs a standard Windows 7 SP1 operating440 403 system with 512 MB of allocated memory and 30 GB of disk441 404 space. Another client runs a Windows 10 (10.0.16299) oper-442 405 ating system with 2 GB of memory and 40 GB of disk. Win-443 406 dows operating systems support a number of SSH clients [49].444 407 The selected PuTTY suite [23] is widely used [49] so may be<sub>445</sub> 408 used by suspect actors. However, other SSH client applica-446 409 tions should produce similar results. The untrusted Linux server<sub>447</sub> 410 virtual machine runs an Ubuntu 14.04 build ("Trusty") with448 411 512 MB of allocated memory and 4 GB of disk storage. SSH449 412 server functionality is provided by openssh-server. To remove<sub>450</sub> 413 unnecessary communications with external agents, the dnsmasq451 414 package is installed and configured to respond to DNS requests452 415 with the server virtual machine IP address. 416 453

### 417 5. Evaluation

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*MemDecrypt* is evaluated by running a sequence of experi-456
 ments. The experimental set-up is described followed by the457
 presentation and review of results. Possible countermeasures to458
 *MemDecrypt* results are discussed.

### 422 5.1. Experimental Set-up

Experiments are performed with variable file sizes, key<sup>462</sup> lengths, modes of operation, operating systems, and operating<sup>463</sup> system versions. In each instance, the 'pscp' program is<sup>464</sup> executed from the Windows command line using requests of<sup>465</sup> the form: 466

# pscp -P nnnn filename name@ipaddress:/home/name

where *nnnn* is the target port, *filename* is the file being<sub>470</sub>
transmitted, *name* is a user account on the target Ubuntu server,<sub>471</sub> *ipaddress* is the target server IP address and */home/name* is the<sub>472</sub>
Ubuntu server target folder for the transmitted file. An Ubuntu<sub>473</sub>
service is started from the bash command line to listen to client<sub>474</sub>

SSH messages with requests of the form:

# /usr/sbin/sshd -f /root/sshd\_config -d -p nnnn

where *nnnn* is the service receiving port number and *sshd\_config* contains configuration details such as encryption algorithms supported by the server.

Sets of experiments investigate decrypting SSH traffic encrypted with AES under different conditions. One set evaluates decrypt effectiveness for Windows 7 and Windows 10 clients. A second set evaluates the effectiveness of 128-bit, 192-bit and 256-bit keys on Windows 10 clients in AES-CTR mode. A third set evaluates *MemDecrypt* effectiveness with 256-bit keys in AES-CBC and AES-CTR modes on Windows 10 clients. To evaluate file invariability, a fourth set uploads 30 files in text, pdf, Excel, and executable formats between 1 KB and 500 KB for Windows clients in AES-CTR mode using 256-bit keys. Experiments also assess decrypt effectiveness with Ubuntu server for AES-CBC and AES-CTR with 256-bit keys.

#### 5.2. Test Results

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In each experiment, encryption keys, and for AES-CTR initialization vectors, were discovered and valid plaintext produced for all SSH and SFTP fields. For example, with a client command of 'pscp -P 2222 plaintext.txt peter@192.168.137.85:/home/peter' and plaintext.txt of 'An outcropping of limestone beside the path that had a silhouette...', the interesting decrypted fields are depicted in Figure 4. *MemDecrypt* also produces other SSH fields such as request identifiers, and file offsets. As observed earlier, the probability of an incorrect combination generating a packet length meeting Equation (2) is 0.0000002% (1 in 4,294,967,275). *MemDecrypt* decrypts SSH traffic with a high degree of certainty.

Analysis durations for producing correct plaintext determines *MemDecrypt*'s usefulness. For example, if plaintext is produced during the network session *MemDecrypt* can assist in the prevention of further malicious activity, perhaps by dropping packets or hijacking the session.

The first experiment compares the relative performance of Windows 7 and Windows 10 client virtual machines. For

SSH authorisation request: name: peter service: ssh-connection auth type: none SSH authorisation request: name: peter service: ssh-connection auth type: password: SSH session ignore message SSH channel open: channeltype: session SSH channel request: channel: simple@putty.projects.tartarus.org SSH channel request: subsystem: sftp SFTP Initialisation: Version no: 3 Stat: Data: /home/peter SFTP Open: Data: /home/peter SFTP Open: Data: /home/peter/plaintext Write: Data: An outcropping of limestone beside the path that had a silhouette like a man〙s face, a marshy spot beside the river where the waterfowl were easily startled, a tall tree that looked like a man with his arms upraised Close: Data: SSH session close:

#### Figure 4: SSH Decrypt Output

AES-CTR, two memory extracts are required for the analysis<sub>521</sub> 475 whereas, for CBC, one extract suffices. Memory analysis typ-522 476 ically executes for approximately nine seconds for Windows 7523 477 clients and 16 seconds for Windows 10 clients with a maximum<sub>524</sub> 478 of 25.1 seconds. Decrypt analysis durations varied between 525 479 0.2 and 34.1 seconds averaging at 4.5 seconds. The variance<sub>526</sub> 480 is linked to the candidate IV set size and the ordinality of the527 481 correct IV within the file set. 528 482

The second experiment compares analysis time durations for<sup>529</sup> 483 different CTR key sizes on Windows 10 clients. Shorter key530 484 lengths require lower entropy thresholds, so more candidate en-531 485 cryption keys are discovered in-memory analysis. Figure 5 il-532 486 lustrates a typical distribution of 32-byte entropy segments in<sup>533</sup> 487 read/write memory. This maps the count of memory segments534 488 exceeding an entropy with an entropy levels so that for exam-535 489 ple whereas out of 264,813 segments exceeding 0.0 entropy,536 490 188,602 (i.e. 72.1%) exceed 2.0, 2,628 (i.e. 0.99%) exceed 4.5.537 491 So, for example, in one test sequence memory analysis yielded<sup>538</sup> 492 candidate key set sizes of 272 for 256-bit key lengths, 1123 for539 493 192-bit key lengths, and 5658 for 128-bit key lengths. With540 494 these set sizes, decrypt analysis durations are longer for shorter541 495 key lengths as illustrated in Figure 6. 542 496

The third experiment compares analysis time durations on<sup>543</sup> Windows 10 clients for 256-bit key sizes in AES-CTR and<sup>544</sup> AES-CBC. The CBC memory analysis takes approximately 16<sup>545</sup> seconds which is similar to CTR. However, the CBC decrypt<sup>546</sup> analysis duration is faster with a minimum of 0.07 seconds as<sup>547</sup> iterating through potential IVs is not required.

For experiments accessing Ubuntu server memory with the 503 default encryption algorithm, i.e. AES with 256-bit key length<sup>549</sup> 504 and CTR mode, all client and server packets are correctly de-550 505 crypted. The data collection component obtains process lists<sub>551</sub> 506 and extracts process heap from the Ubuntu virtual machine in<sub>552</sub> 507 0.3 seconds. Memory analysis finds approximately 320 keys<sub>553</sub> 508 and 3 initialization vectors in 6 seconds, and decrypt analysis<sub>554</sub> 509 decrypts the session successfully in 37 seconds. 510 555

MemDecrypt performance may suffice when extracts are ob-556 511 tained for Windows clients or Ubuntu servers. Nevertheless,557 512 strategies to enhance performance include improving memory<sub>558</sub> 513 extraction for Windows clients, pre-testing with known SSH559 514 client and server applications, pipelining, multi-threading, and 560 515 implementing in a low-level language instead of Python. A561 516 custom extract engine using PyVMI and LibVMI libraries to562 517 replace Volatility plugins improves Windows memory extrac-563 518 tion performance. Pre-testing SSH client and server applica-564 519 tions may determine the distance between key and IV memory<sub>565</sub> 520

locations. Cryptographic libraries generally request memory to hold crypto data structures ('malloc') when algorithms are agreed which occurs after the handshake so data is usually on the heap. The data structures can include fields such as encryption/decryption flag, key size, keys etc so for an algorithm, AES-CTR with 256 bit keys, the data structures may be invariant. For example, with PuTTY 'pscp', distances are 968 bytes for 256-bit and 192-bit keys and 728 bytes for 128-bit-keys and are invariant with operating system version or transmitted file size. Where the distance is known, and the program identified from the SSH version message, memory analysis and decrypt analysis components take one second. Multi-threading supports simultaneous analysis of multiple files and decrypts while pipelining between components enables analysis to terminate when the correct plaintext is obtained.

So, *MemDecrypt* decrypts SSH sessions with high probability independent of file size, operating system type or version, key length, or mode. Furthermore, with SSH application pretesting, analysis and decrypt decryption completes in 1 second. With unknown SSH applications, the plaintext is produced in under 60 seconds for 192-bit and 256-bit keys. Although in experiments, MemDecrypt decrypts sessions with exfiltrated files of 100 bytes, the risk exists that extracts are not acquired in terse SSH sessions. The risk might be mitigated by pausing the virtual machine. Decrypting sessions with SSH key rotation [50] is not currently implemented but the planned MemDecrypt approach is considering each rotation as a separate session with its own candidate keys and IVs.

## 5.3. Countermeasures

Countermeasures may prevent or delay MemDecrypt discovery of cryptographic artefacts. Invalid assumptions can invalidate the methodology. Candidate encryption keys are assumed to be high entropy, static for a network session, and in the same memory location. For entropy, less randomness, i.e. lower entropy, makes key regions less evident but key unpredictability is an essential requirement. For key staticity, MemDecrypt requires two extractions for AES-CTR, key changes would be required between each outgoing packet which could cause excessive transmission delays. Key location changes could delay decryption. However, tests on a Linux heap extract produced delays of less than 0.5 seconds. MemDecrypt assumes candidate AES-CTR IVs are located at the same memory locations in each extract and values to increment by the sum of payload blocks in the previous packets. As with keys, tests where IV memory addresses changed induced delay of 0.5 seconds. As



Figure 5: Typical Memory Segment Entropy Distribution



Figure 6: Key Length Analysis Durations

a result, the measure may not suffice. AES-CTR IVs incre-589 566 ments make them detectable when stored in the clear in mem-590 567 ory. Another delaying measure is encrypting artefacts with an591 568 additional key. However, this key may be discoverable, and 592 569 furthermore, the additional encryption and decryption for each593 570 packet, or block, may have an unacceptable performance im-594 571 pact. Obfuscation the artefacts may be more effective. For595 572 example, splitting key and IV strings and interpolating vari-596 573 able data between splits will limit MemDecrypt performance,597 574 and possibly effectiveness. This technique is faster and less de-575 tectable than an additional encryption layer. .A more effective 576 counter-measure is preventing memory access to artefacts. For<sup>598</sup> 577 example, Intel [51] and AMD [52] may develop virtual ma-578 chine encryption where encryption keys are absent from virtual<sub>600</sub> 579 machine memory. Although this can offer privacy, malicious<sup>601</sup> 580 behaviour is then hidden so administrators may seek to disable602 581 603 the feature. 582 604

# 583 6. Conclusions and Future Work

The *MemDecrypt* framework rapidly discovers crypto-<sub>610</sub> graphic artefacts and decrypts SSH communications in virtual-<sup>611</sup> ized environments. This can assist in detecting, and preventing<sup>612</sup><sub>613</sub> insider attackers from extracting and encrypting confidential in-<sub>614</sub> formation to external locations. *MemDecrypt* can be extended<sub>615</sub> to technologies where memory acquisition of live secure sessions is enabled. Decrypting SSH sessions may be illegal without approval so cryptographic artefact sets could be retained with the associated network traffic for decryption once approval is obtained. High performance makes the framework applicable so future work should apply multithreading and pipelining techniques before being extended to other non-virtualized use cases, secure protocols, encryption algorithms, and malware that use encrypted communications channels.

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