



Memory Forensics

***Current Practices and Future
Directions***

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...

Binary Analysis

Malware

Web Security

Fuzzing

Memory Forensics

....



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<https://www.s3.eurecom.fr/~balzarot/security-circus>

...
Binary Analysis
Malware
Web Security
Fuzzing
Memory Forensics
....

SHELLPHISH





Mariano Graziano



Fabio Pagani



Andrea Oliveri



fo · ren · sic

Adjective: Of, relating to, or denoting the application of *scientific methods and techniques* to the *investigation* of crime

Memory forensics

The *preservation, collection, validation, identification, analysis, interpretation, documentation, and presentation* of digital evidences extracted from the memory



(my definition)

Memory forensics:

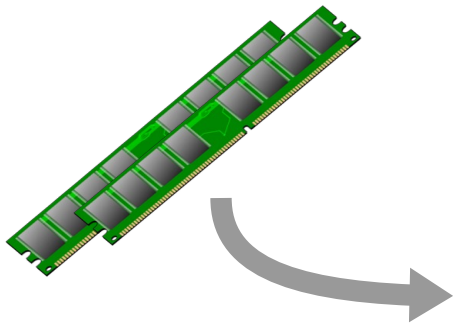
Reverse Engineering on Steroids

Pros

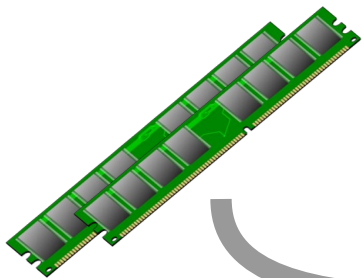
- Attackers often overlook their memory footprint
- Many of the kernel artifacts can be used for forensics
- Even rootkits designed to hide data in a running system need to be located somewhere in memory
- Certain information (loaded kernel modules, open sockets, ...) may be difficult to extract otherwise
- Some malware samples only reside in memory

Cons

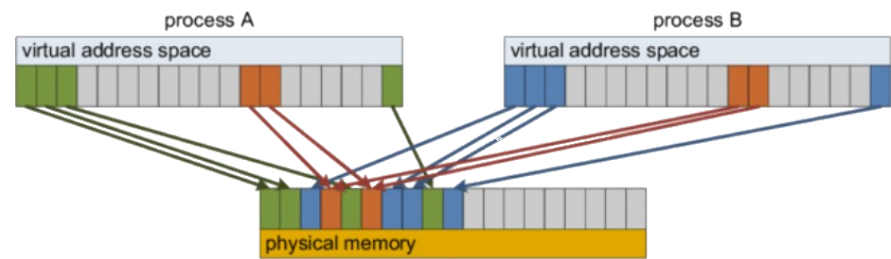
- Memory is difficult to acquire
- The content of the memory keeps changing so even consecutive image acquisitions give different results
- Data collection requires an efficient approach with a small footprint
- Data structures change among different OSs and OS versions

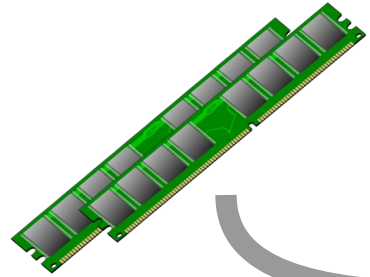
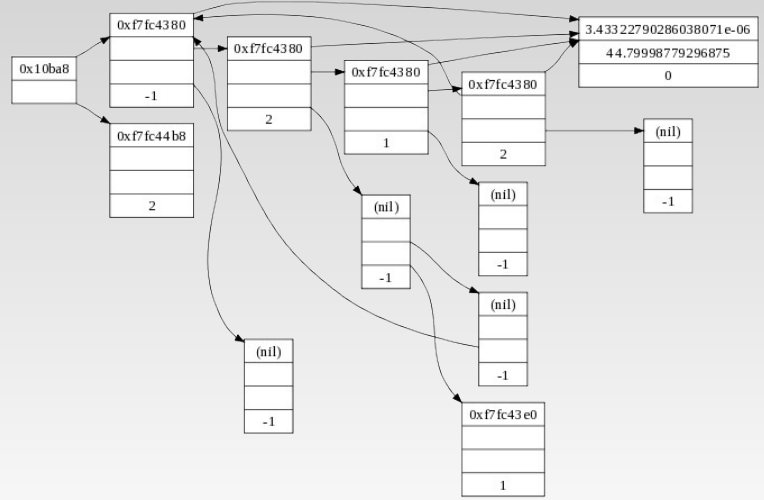


```
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1f 89 45 ec 75 51 3b 4d
89 f2 8b 75 f0 29 ce 19
c4 20 5e 5f 5d c3 66 90
00 31 d2 f7 f1 89 c1 89
eb a5 8d b6 00 00 00 00
c3 8d b4 26 00 00 00 00
ec c7 45 f0 20 00 00 00
```



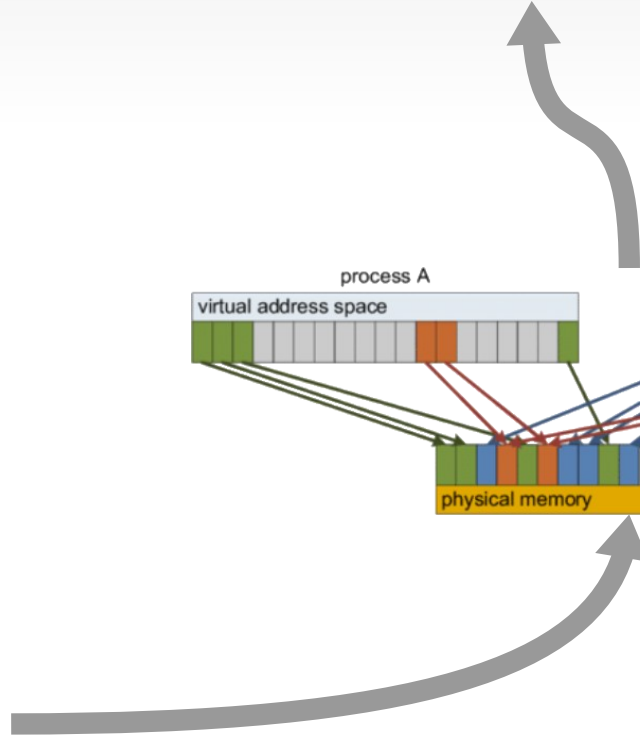
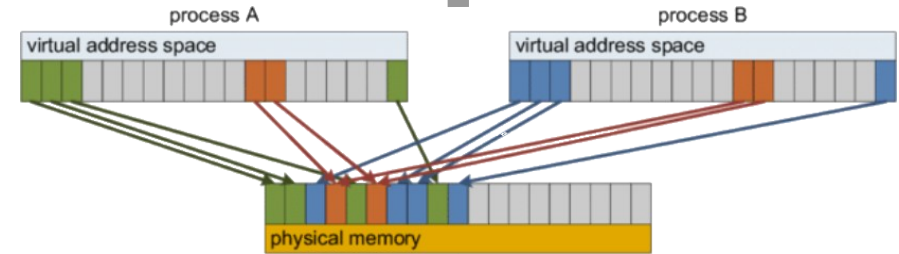
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1f 89 45 ec 75 51 3b 4d
89 f2 8b 75 f0 29 ce 19
c4 20 5e 5f 5d c3 66 90
00 31 d2 f7 f1 89 c1 89
eb a5 8d b6 00 00 00 00
c3 8d b4 26 00 00 00 00
ec c7 45 f0 20 00 00 00
```





```

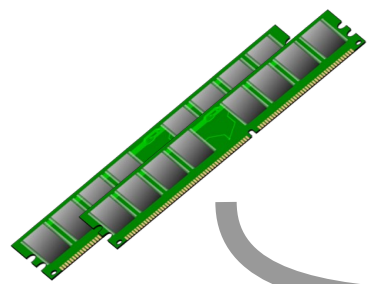
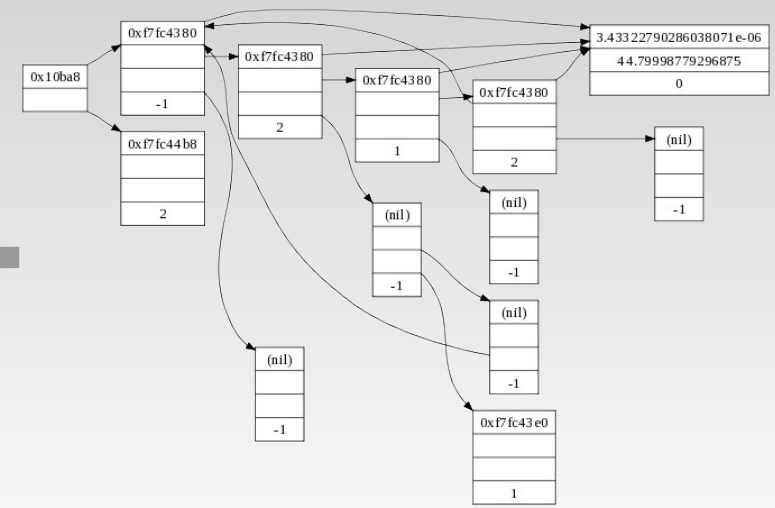
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c4 20 5e 5f 5d c3 66 90
00 31 d2 f7 f1 89 c1 89
eb a5 8d b6 00 00 00 00
c3 8d b4 26 00 00 00 00
ec c7 45 f0 20 00 00 00
  
```



```

C:\volatility-master(1)\volatility-master\python vol.py -f D:\Acquire\centos6\MemoryPhysi
Volatility Foundation Volatility Framework 2.6.1
-----
Name                               Pid  PPid  Thds  Hnds  Time
-----
0xfffffe01203ba900: System           4    0    109   0    2019-04-29
0xfffffe0120ca3040: smss.exe         352   4     2     2    2019-04-29
0xfffffe012242f900: cmd.exe          2600  2576   1     0    2019-04-29
0xfffffe012242d900: postgres.exe      2612  2600   3     0    2019-04-29
0xfffffe012257f800: postgres.exe      3120  2612   2     0    2019-04-29
0xfffffe01225803c0: postgres.exe      3104  2612   2     0    2019-04-29
0xfffffe01224b7900: postgres.exe      2584  2612   3     0    2019-04-29
0xfffffe0122581780: postgres.exe      3096  2612   2     0    2019-04-29
0xfffffe01224af900: postgres.exe      3088  2612   2     0    2019-04-29
0xfffffe012060e900: postgres.exe      3196  2612   2     0    2019-04-29
0xfffffe01224ab900: postgres.exe      3112  2612   2     0    2019-04-29
0xfffffe0121a04000: csrss.exe         440   432   8     0    2019-04-29
0xfffffe01219b2900: wininit.exe       500   432   1     0    2019-04-29
0xfffffe0120524380: services.exe      588   500   3     0    2019-04-29
0xfffffe012205d900: pgsservice.exe   1688   588   6     0    2019-04-29
0xfffffe0121ca8000: comhost.exe      1772  1688   2     0    2019-04-29
0xfffffe01220b4c0: python.exe        1820  1688   0     0    2019-04-29
0xfffffe0121aab900: svchost.exe       644   588   16    0    2019-04-29
0xfffffe0121aed900: svchost.exe       900   588   12    0    2019-04-29
0xfffffe0121ab5900: svchost.exe       944   588   28    0    2019-04-29
0xfffffe0121c29900: svchost.exe      1860   588   15    0    2019-04-29
0xfffffe01220ce300: sqlwriter.exe    1948   588   2     0    2019-04-29
0xfffffe0121a44900: svchost.exe       688   588   6     0    2019-04-29
0xfffffe01220b1900: ReportingServi   1844   588   43    0    2019-04-29
0xfffffe0121c10900: msadsrv.exe      1652   588   19    0    2019-04-29
0xfffffe0121f19900: svchost.exe      2784   588   26    0    2019-04-29
0xfffffe0122871900: msdtc.exe        3804   588   9     0    2019-04-29
0xfffffe0121c53900: spoolsv.exe      1228   588   9     0    2019-04-29
0xfffffe0121adc000: svchost.exe      1336   588   8     0    2019-04-29

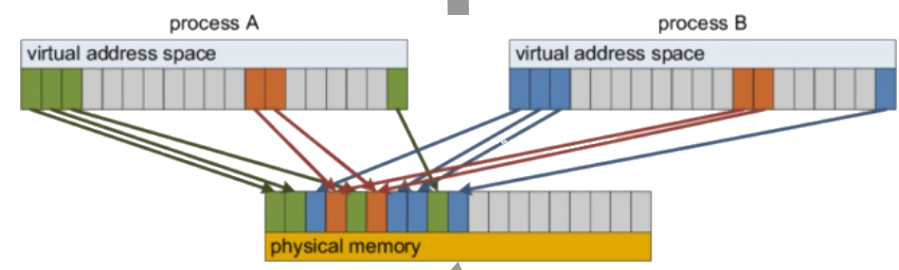
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```

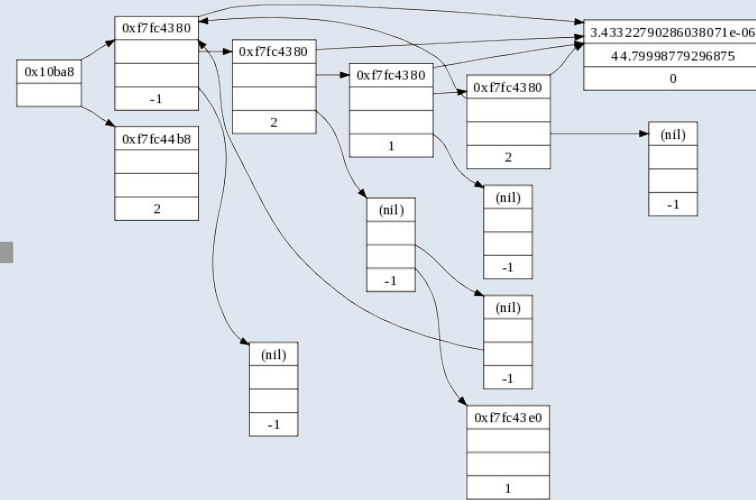
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5e 5f 5d c3 8d 74 26 00
1f 89 45 ec 75 51 3b 4d
89 f2 8b 75 f0 29 ce 19
c4 20 5e 5f 5d c3 66 90
00 31 d2 f7 f1 89 c1 89
eb a5 8d b6 00 00 00 00
c3 8d b4 26 00 00 00 00
ec c7 45 f0 20 00 00 00

```

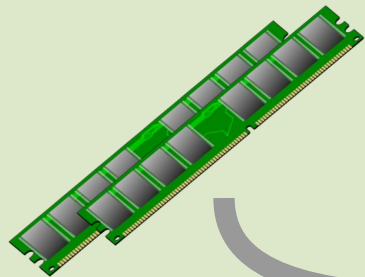


Investigation

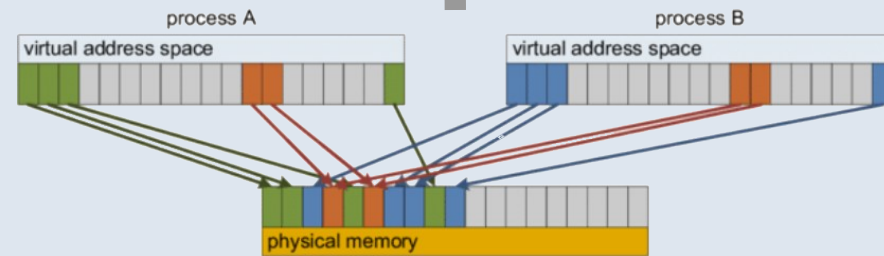
```
C:\volatility-master(1)\volatility-master>python vol.py -f D:\Acquire\centos6\MemoryPhys1
Volatility Foundation Volatility Framework 2.6.1
-----
Name                               Pid  PPid  Thds  Hnds  Time
-----
0xfffffe01203ba900: System           4      0    109    0  2019-04-29
0xfffffe0120ca3040: smss.exe         352     4     2     0  2019-04-29
0xfffffe012242f900: cmd.exe          2600   2576    1     0  2019-04-29
0xfffffe012242d900: postgres.exe      2612   2600    3     0  2019-04-29
0xfffffe012257f800: postgres.exe      3120   2612    2     0  2019-04-29
0xfffffe01225803c0: postgres.exe      3104   2612    2     0  2019-04-29
0xfffffe01224b7900: postgres.exe      2584   2612    3     0  2019-04-29
0xfffffe0122581780: postgres.exe      3096   2612    2     0  2019-04-29
0xfffffe01224af900: postgres.exe      3088   2612    2     0  2019-04-29
0xfffffe012060e900: postgres.exe      3196   2612    2     0  2019-04-29
0xfffffe01224a8900: postgres.exe      3112   2612    2     0  2019-04-29
0xfffffe0121a04000: csrss.exe         440    432    8     0  2019-04-29
0xfffffe01219b2900: wininit.exe       500    432    1     0  2019-04-29
0xfffffe0120524380: services.exe      588    500    3     0  2019-04-29
0xfffffe012205d900: pgsservice.exe   1088   588    6     0  2019-04-29
0xfffffe0121ca8000: comhost.exe      1772   1688    2     0  2019-04-29
0xfffffe01220b4c00: python.exe       1820   1688    0     0  2019-04-29
0xfffffe0121aab900: svchost.exe       644    588   16     0  2019-04-29
0xfffffe0121aed900: svchost.exe       900    588   12     0  2019-04-29
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0xfffffe0121c29900: svchost.exe      1860   588   15     0  2019-04-29
0xfffffe01220ce300: sqlwiter.exe     1948   588    2     0  2019-04-29
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0xfffffe0121f19900: svchost.exe      2784   588   26     0  2019-04-29
0xfffffe0122871900: msdtc.exe        3804   588    9     0  2019-04-29
0xfffffe0121c53900: spoolsv.exe      1228   588    9     0  2019-04-29
0xfffffe0121adc000: svchost.exe      1336   588    8     0  2019-04-29
```



Acquisition



```
75 15 39 f1 76 41 f7 f1
5e 5f 5d c3 8d 74 26 00
1f 89 45 ec 75 51 3b 4d
89 f2 8b 75 f0 29 ce 19
c4 20 5e 5f 5d c3 66 90
00 31 d2 f7 f1 89 c1 89
eb a5 8d b6 00 00 00 00
c3 8d b4 26 00 00 00 00
ec c7 45 f0 20 00 00 00
```



Interpretation

Investigation



*How to traverse
data structures to recover
high-level information*

Acquisition



*How to acquire a
faithful copy of the
physical memory*



*How to recover layout,
location, and
semantics of key
data structures*

Interpretation



(pre-2005)
Carving

Memory Forensics 0.1

Looking for something **you do not know** in something **you know**

Looking for something **you know** in something **you do not know**

Looking for something **you do not know** in something **you know**

– Structured Data Analysis –

Looking for something **you know** in something **you do not know**

– Carving –



Rules/Heuristics
Manually Written

Memory Forensics 1.0

Ad-Hoc

Very Time Consuming



Rules/Heuristics
Manually Written

Difficult to Port to other Systems

Ad-Hoc

Very Time Consuming



Rules/Heuristics
Manually Written

Difficult to Port to other Systems

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Ad-Hoc



Rules/Heuristics
Manually Written

Alternatives?

Lack of metrics to assess
Precision, Reliability, Robustness...

Difficult to Port to other Systems

Very Time Consuming

Ad-Hoc



Rules/Heuristics
Manually Written

Alternatives?

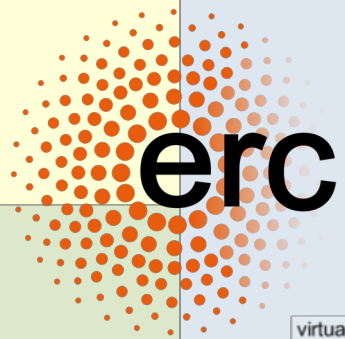
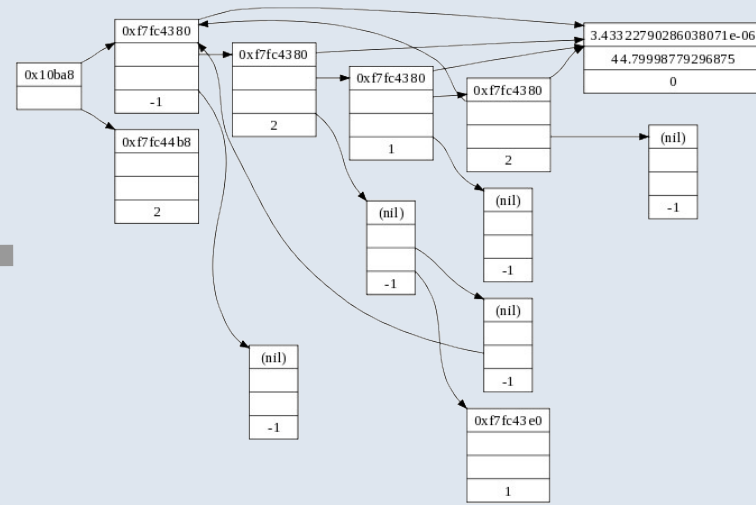
Lack of metrics to assess
Precision, Reliability, Robustness...

Hard to compare different options

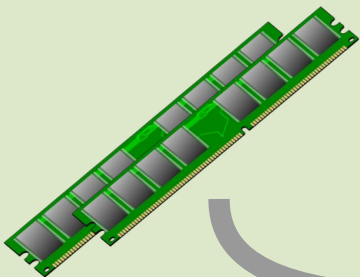
Investigation

```

C:\volatility-master(1)\volatility-master\python vol.py -f D:\Acquire\centos6\MemoryPhysi
Volatility Foundation Volatility Framework 2.6.1
-----
Name                               Pid  PPid  Thds  Hnds  Time
-----
0xfffffe01203ba900\System            4      0    109     0  2019-04-29
0xfffffe0120ca3040:smss.exe          352     4     2     0  2019-04-29
0xfffffe012242f900:cmd.exe            2600   2576    1     0  2019-04-29
0xfffffe012242d900:postgres.exe      2612   2600    3     0  2019-04-29
0xfffffe012257f800:postgres.exe      3120   2612    2     0  2019-04-29
0xfffffe01225803c0:postgres.exe      3104   2612    2     0  2019-04-29
0xfffffe01224b7900:postgres.exe      2584   2612    3     0  2019-04-29
0xfffffe0122581780:postgres.exe      3096   2612    2     0  2019-04-29
0xfffffe01224af900:postgres.exe      3088   2612    2     0  2019-04-29
0xfffffe012060e900:postgres.exe      3196   2612    2     0  2019-04-29
0xfffffe01224ab900:postgres.exe      3112   2612    2     0  2019-04-29
0xfffffe0121a04000:csrss.exe           440    432     8     0  2019-04-29
0xfffffe01219b2900:wininit.exe        500    432     1     0  2019-04-29
0xfffffe0120524380:services.exe       588    500     3     0  2019-04-29
0xfffffe012205d900:pgservice.exe     1088    588     6     0  2019-04-29
0xfffffe0121ca8000:comhost.exe        1772   1688     2     0  2019-04-29
0xfffffe01220b4c0:python.exe          1820   1688     0     0  2019-04-29
0xfffffe0121aab900:svchost.exe         644    588    16     0  2019-04-29
0xfffffe0121aed900:svchost.exe         900    588    12     0  2019-04-29
0xfffffe0121ab5900:svchost.exe         944    588    28     0  2019-04-29
0xfffffe0121c29900:svchost.exe       1860    588    15     0  2019-04-29
0xfffffe01220ce300:sqlwiter.exe       1948    588     2     0  2019-04-29
0xfffffe0121a44900:svchost.exe         688    588     6     0  2019-04-29
0xfffffe01220b1900:ReportingServi    1844    588    43     0  2019-04-29
0xfffffe0121c10900:msmdsrv.exe        1652    588    19     0  2019-04-29
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0xfffffe0121c53900:spoolsv.exe        1228    588     9     0  2019-04-29
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```

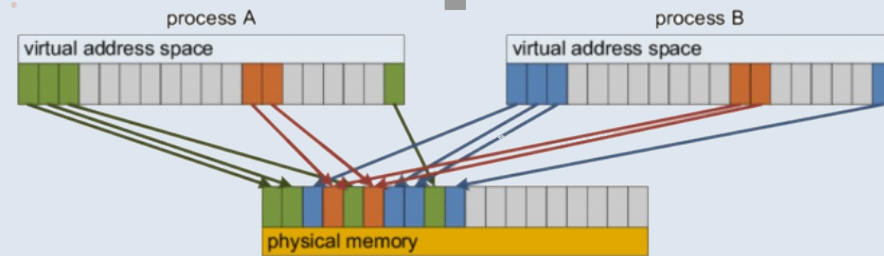


Acquisition



```

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89 f2 8b 75 f0 29 ce 19
c4 20 5e 5f 5d c3 66 90
00 31 d2 f7 f1 89 c1 89
eb a5 8d b6 00 00 00 00
c3 8d b4 26 00 00 00 00
ec c7 45 f0 20 00 00 00
    
```



Interpretation

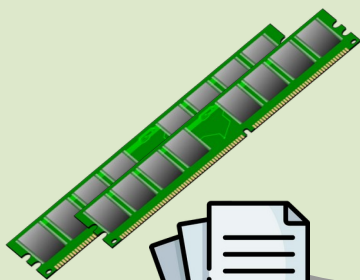
Investigation

```
C:\volatility-master(1)\volatility-master>python vol.py -f D:\Acquire\centos
Volatility Foundation Volatility Framework 2.6.1
Name      Pid  PPid  Thds  Hnds
```

Back to the Whiteboard: a Principled Approach for the Assessment and Design of Memory Forensic Techniques – Usenix 2019

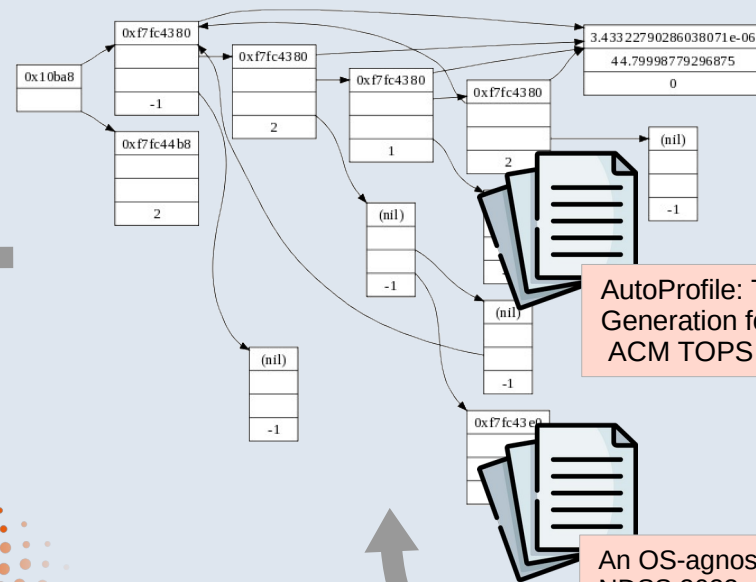
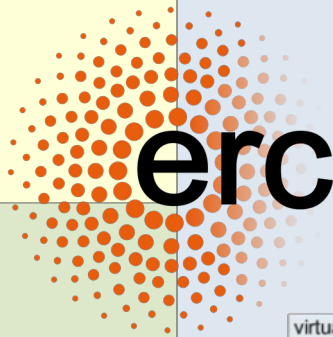
.. 0xffffe01224af900:postgres.exe	3088	2612	2	0	2019-04-29
.. 0xffffe012060e900:postgres.exe	3196	2612	2	0	2019-04-29
.. 0xffffe01224ab900:postgres.exe	3112	2612	2	0	2019-04-29
.. 0xffffe00121a0400:csrss.exe	440	432	8	0	2019-04-29
.. 0xffffe001219b2900:wininit.exe	500	432	1	0	2019-04-29
.. 0xffffe00120524380:services.exe	588	500	3	0	2019-04-29
.. 0xffffe0012205d900:pgservice.exe	1688	588	6	0	2019-04-29
.. 0xffffe00121ca800:comhost.exe	1772	1688	2	0	2019-04-29
.. 0xffffe001220b4c0:python.exe	1820	1688	0	----	2019-04-29
.. 0xffffe00121aab900:svchost.exe	644	588	16	0	2019-04-29
.. 0xffffe00121aed900:svchost.exe	900	588	12	0	2019-04-29
.. 0xffffe00121ab5900:svchost.exe	944	588	28	0	2019-04-29
.. 0xffffe00121c29900:svchost.exe	1860	588	15	0	2019-04-29
.. 0xffffe001220ce300:sqlwrtmr.exe	1948	588	2	0	2019-04-29
.. 0xffffe00121a44900:svchost.exe	688	588	6	0	2019-04-29
.. 0xffffe001220b1900:ReportingServi	1844	588	43	0	2019-04-29
.. 0xffffe00121c10900:msmdsrv.exe	1652	588	19	0	2019-04-29
.. 0xffffe00121f19900:svchost.exe	2784	588	26	0	2019-04-29
.. 0xffffe00122871900:msdtc.exe	3804	588	9	0	2019-04-29
.. 0xffffe00121c53900:spoolsv.exe	1228	588	9	0	2019-04-29
.. 0xffffe00121adc000:svchost.exe	1336	588	8	0	2019-04-29

Acquisition



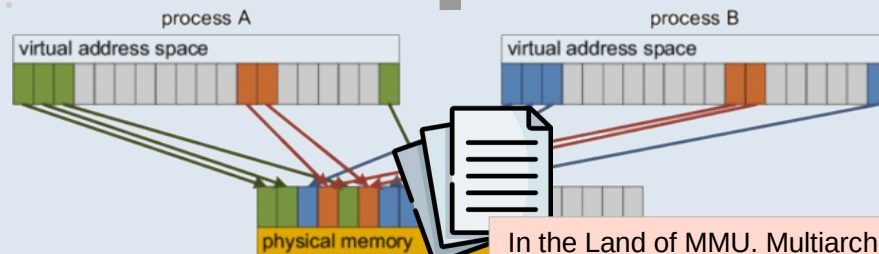
Introducing the Temporal Dimension to Memory Forensics – ACM TOPS 2019

```
75 15 39 f1 76 41 f7 f1
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1f 89 45 ec 75 51 3b 4d
89 f2 8b 75 f0 29 ce 19
c4 20 5e 5f 5d c3 66 90
89
00
00
ec c7 45 f0 20 00 00 00
```



AutoProfile: Towards Automated Profile Generation for Memory Analysis ACM TOPS 2022

An OS-agnostic Approach to Memory Forensics NDSS 2023



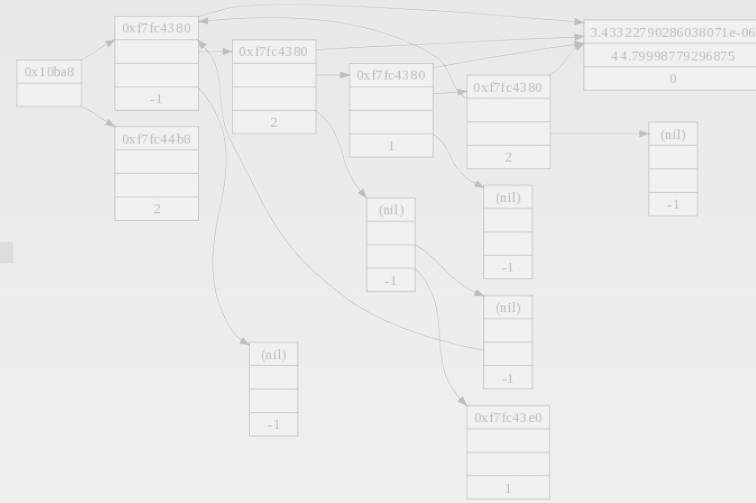
In the Land of MMU. Multiarchitecru, OS-agnostic Virtual Memory Forensics – ACM TOPS 2022

Interpretation

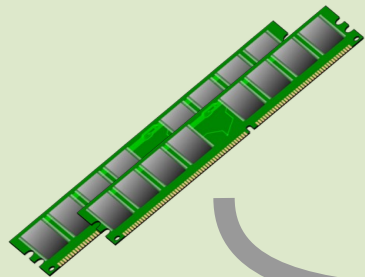
Investigation

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C:\volatility-master(1)\volatility-master\python vol.py -f D:\Acquire\centos6\MemoryPhysical
Volatility Foundation Volatility Framework 2.6.1
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Name                               Pid  PPid  Thds  Hnds  Time
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.. 0xfffffe0122580300:postgres.exe     3104   2612     2     0  2019-04-29
.. 0xfffffe01224b7900:postgres.exe     2584   2612     3     0  2019-04-29
.. 0xfffffe0122581700:postgres.exe     3096   2612     2     0  2019-04-29
.. 0xfffffe01224af900:postgres.exe     3088   2612     2     0  2019-04-29
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0xfffffe0121a04000:csrss.exe          440    432     8     0  2019-04-29
0xfffffe01219b2900:wininit.exe        500    432     1     0  2019-04-29
0xfffffe0120524300:services.exe       588    500     3     0  2019-04-29
.. 0xfffffe0122050900:pgs-service.exe  1688    588     6     0  2019-04-29
.. 0xfffffe0121ca3000:comhost.exe      1772   1688     2     0  2019-04-29
.. 0xfffffe01220b4000:python.exe       1820   1688     0     0  2019-04-29
.. 0xfffffe0121aab000:svchost.exe       644    588    16     0  2019-04-29
.. 0xfffffe0121aed900:svchost.exe       980    588    12     0  2019-04-29
.. 0xfffffe0121ab5900:svchost.exe       944    588    28     0  2019-04-29
.. 0xfffffe0121c29900:svchost.exe     10640   588    15     0  2019-04-29
.. 0xfffffe01228c3000:sqlwiter.exe     1948    588     2     0  2019-04-29
.. 0xfffffe0121a44900:svchost.exe       688    588     6     0  2019-04-29
.. 0xfffffe01220b1900:ReportingServi  1844    588    43     0  2019-04-29
.. 0xfffffe0121c10900:msmdsrv.exe      1652    588    19     0  2019-04-29
.. 0xfffffe0121f10900:svchost.exe      2784    588    26     0  2019-04-29
.. 0xfffffe0122071900:msdtc.exe        3804    588     9     0  2019-04-29
.. 0xfffffe0121c53900:spoolsv.exe      1228    588     9     0  2019-04-29
.. 0xfffffe0121adc000:svchost.exe      1336    588     8     0  2019-04-29
    
```



Acquisition



```

75 15 39 f1 76 41 f7 f1
5e 5f 5d c3 8d 74 26 00
1f 89 45 ec 75 51 3b 4d
89 f2 8b 75 f0 29 ce 19
c4 20 5e 5f 5d c3 66 90
00 31 d2 f7 f1 89 c1 89
eb a5 8d b6 00 00 00 00
c3 8d b4 26 00 00 00 00
ec c7 45 f0 20 00 00 00
    
```



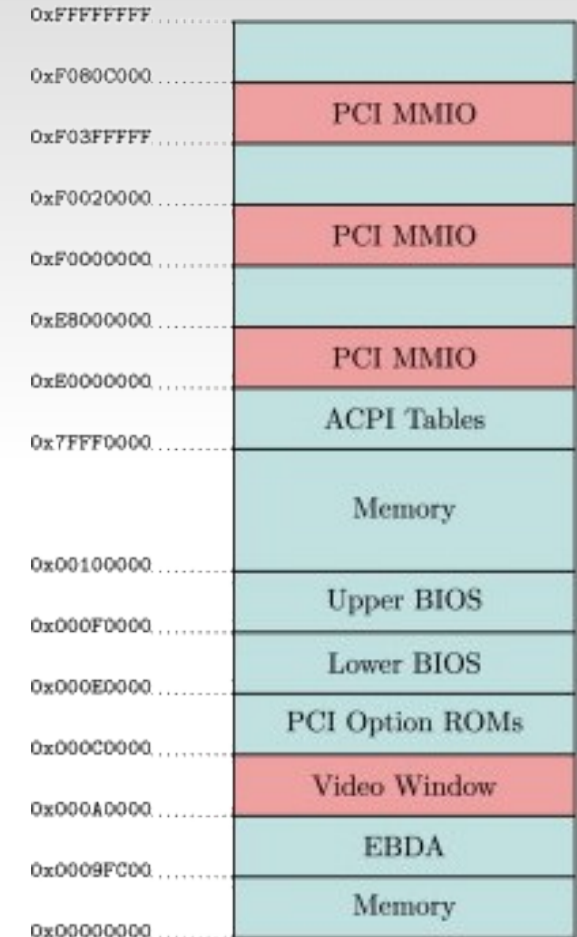
Interpretation

The physical address space is NOT contiguous:

> **sudo cat /proc/iomem**

Hardware peripherals map registers or parts of their integrated memory into the physical address space via **Memory Mapped I/O**

Any attempt to read the memory mapped to a device would probably crash the system



- **Software Acquisition**
 - Use software to read and dump the memory from within the system
- **Hardware Acquisition**
 - Access memory from DMA
 - Firewire, PCI-Express, USB 4, Intel DCI, Jtag
- **VM Acquisition**
 - Atomic acquisition
 - New technologies like AMD Secure Encrypted Virtualization can block any type of memory dump from the hypervisor
- **Crash dumps, hibernation files, ..**
- **Cold boot attacks**

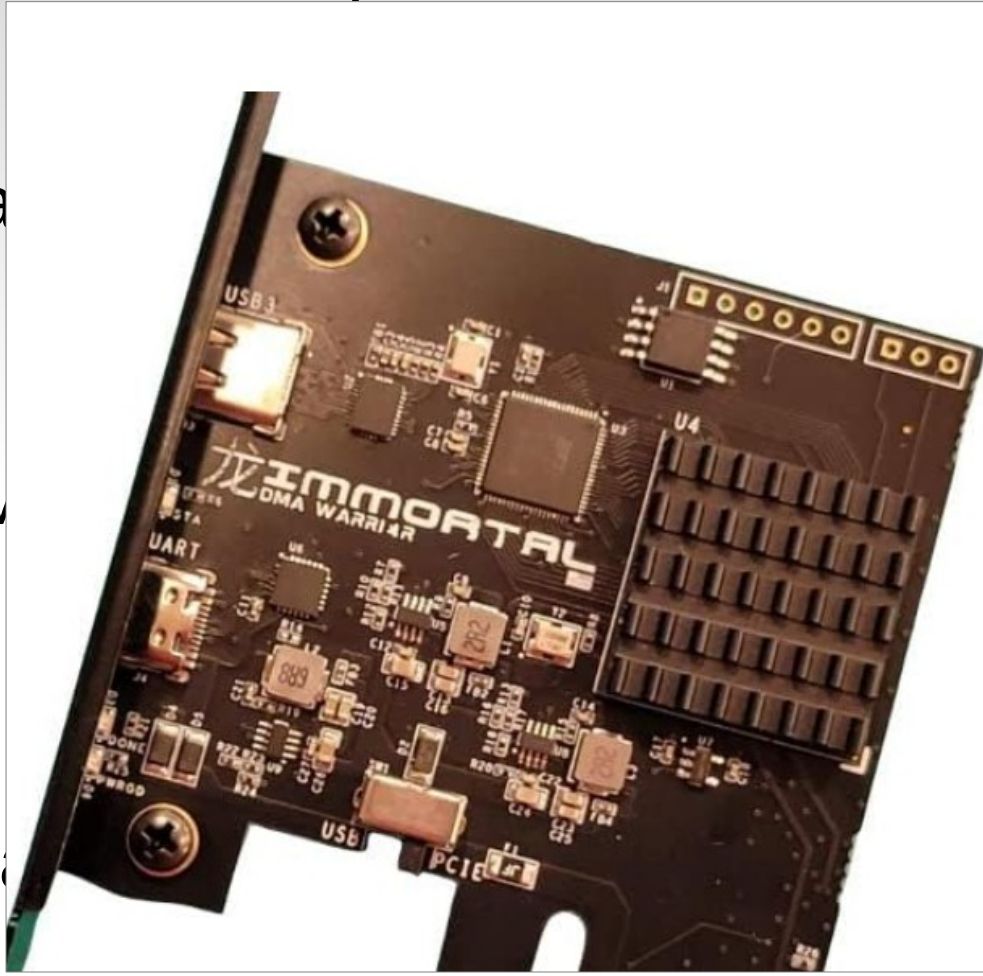
- Software Acquisition


- Hardware

- VM

- Crash

- Cold boot attacks



 Immortal DMA Warrior, FPGA DMA with Custom Unique PCILeech Firmware up to 275 MB/s Speed, FPGA DMA USB-C/PCIe Connection, FPGA USB Firmware Flash Capable, PCILeech DMA, Development Board, DMA, FPGA

Brand: IMMORTAL DMA
5.0 ★★★★★ 1 rating

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Brand	IMMORTAL DMA
Hardware Interface	USB, PCI
Style	Classic

About this item

- Pre-Flashed Individual Custom Firmware (PCILeech): Firmware customized to prevent detection from some of the toughest anti-cheats and malware. Each individual customized firmware of PCILeech is destroyed aftering being flashed to your FPGA DMA device to guarantee individuality.



The Problem of (lack of) Atomicity

A complete memory acquisition takes several minutes, during which the OS is running



The Problem of (lack of) Atomicity

A complete memory acquisition takes several minutes, during which the OS is running

+

When idle, the Linux kernel performs over 300K write operations per second



The Problem of (lack of) Atomicity

A complete memory acquisition takes several minutes, during which the OS is running

+

When idle, the Linux kernel performs over 300K write operations per second

=





Mode	Writes on kernel address space (Millions)		Writes on MMIO regions		Total size (GiB)		Unique physical pages		Time required (ratio)	
	USB	SATA	USB	SATA	USB	SATA	USB	SATA	USB	SATA
Btrfs	874	811	59824	37778	6.01	5.58	249340	249204	1.81x	1.53x
exFAT	1005	938	96112	61772	6.89	6.43	251074	250728	1.79x	1.33x
Ext4	818	757	60692	35696	5.61	5.20	249421	248873	1.76x	1.16x
Ext4 no journal	776	719	61744	36443	5.33	4.95	249439	248864	1.78x	1.10x
F2FS	951	910	61329	36743	6.51	6.23	249406	249379	2.04x	1.33x
NTFS	796	739	61329	38711	5.48	5.09	249411	249129	1.75x	1.31x
FAT32	1404	1317	84456	89542	9.65	9.06	250328	250908	2.39x	1.82x
XFS	632	569	57605	34255	4.41	3.97	249405	249041	1.62x	1x
Btrfs D. I/O	49137	37708	9147061	6707022	344.04	265.19	75037	78885	255.76x	73.00x
exFAT D. I/O	10698	4713	5204034	3950081	73.20	32.11	466	497	109.34x	15.85x
FAT32 D. I/O	16657	6000	9138277	5773820	114.15	40.88	1125	1127	236.71x	19.58x
Network	1336	-	1000453	-	8.64	-	488	-	2.73x	-



SECLISTS.ORG

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List Archive Search

Re: Digital forensics of the physical memory

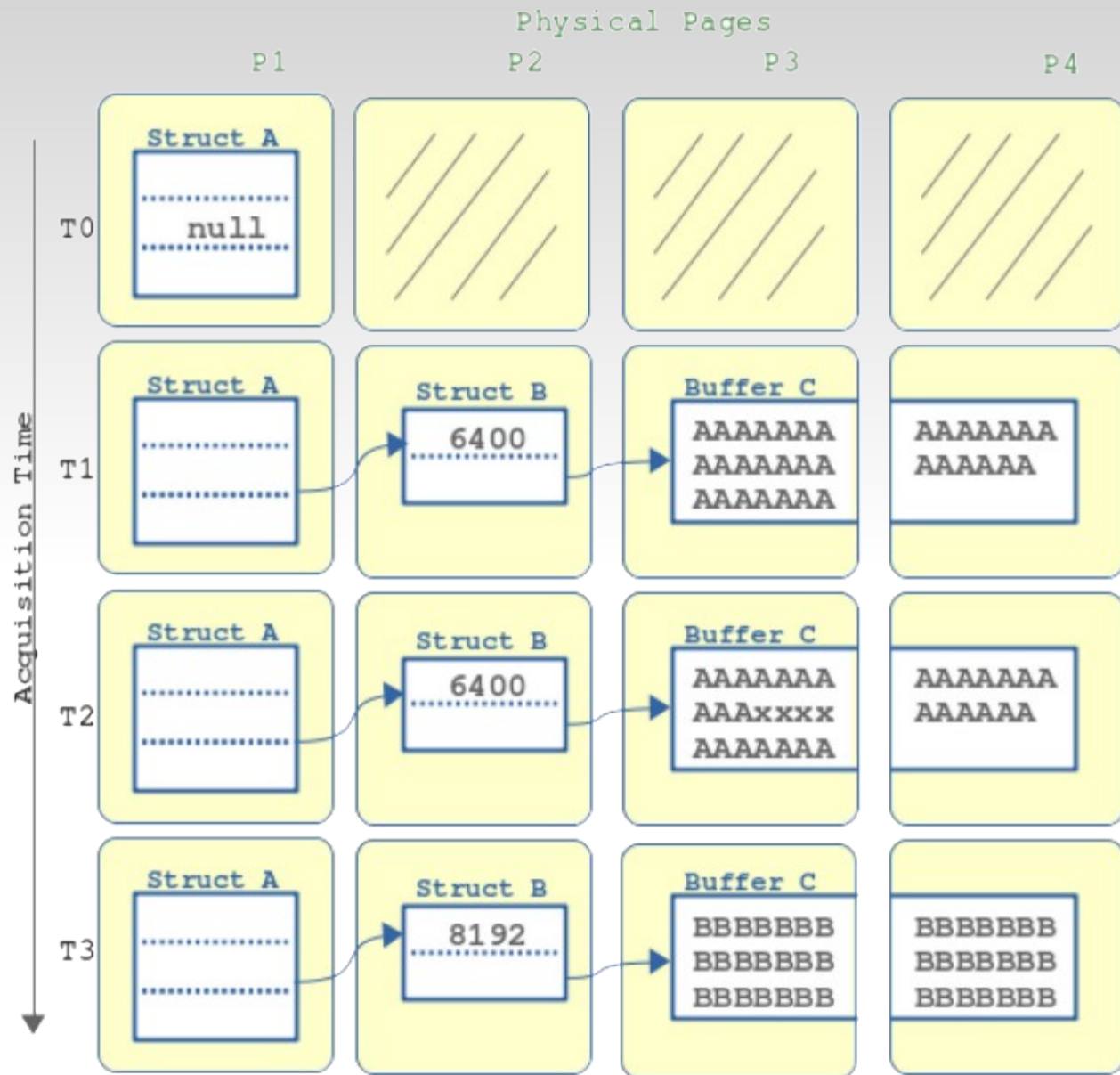
From: Harlan Carvey <keydet89 () yahoo com>

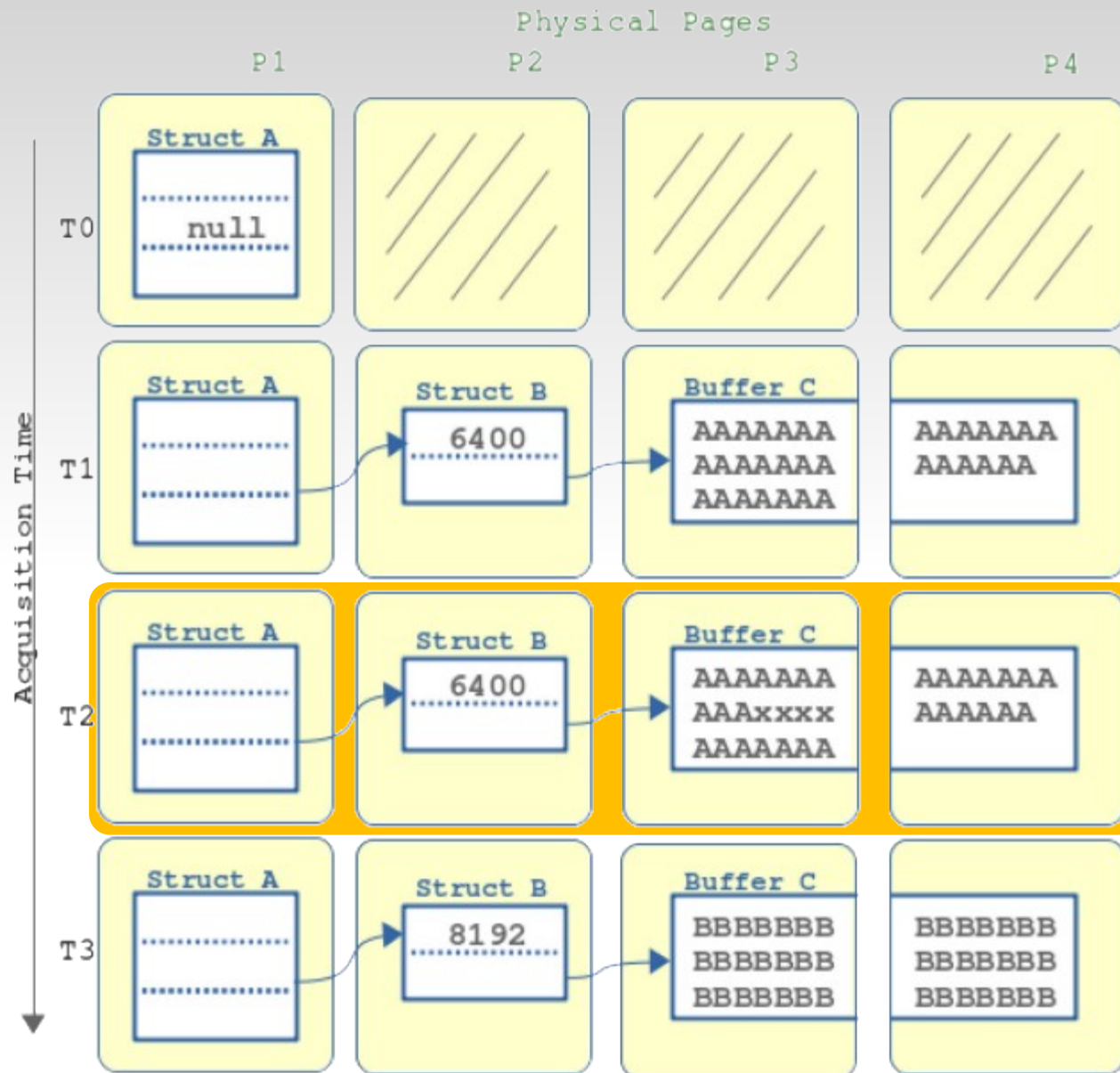
Date: Fri, 17 Jun 2005 09:35:16 -0700 (PDT)

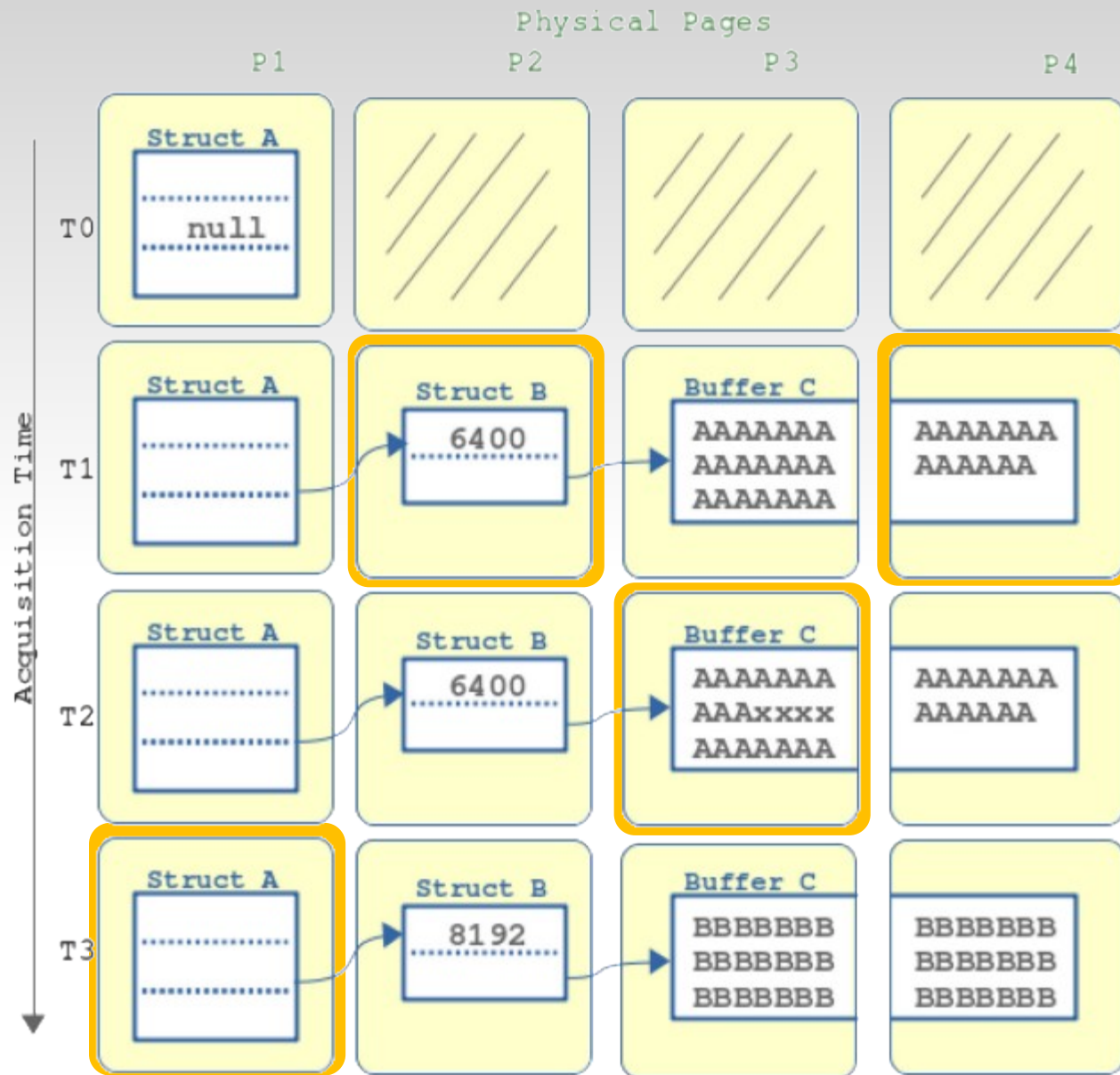
One of the issues in particular is that he starts off by mentioning the FU rootkit and the SQL Slammer worm, both of which are specific to Windows...and then presents examples using only a Linux system. He states in the paper that similar work can be done on Windows systems, but never provided any information to that effect.

Based on entries I made to my blog the other day, I ended up having a conversation w/ someone from MS about this very issue. The issue of using dd.exe to image Physical Memory goes beyond the fact that there don't seem to be any maps describing how physical memory is used by Windows systems, and that memory used by processes consists of both RAM and the pagefile. Additional issues include, as you pointed out, that while the imaging process is occurring, the kernel memory (and even user-mode memory) is changing...so what you end up with is a smear, for want of a better term.

Even tools like pmdump.exe and LiveKD (SysInternals.com) are not sufficient for collecting user-mode memory, b/c they do not lock or suspend memory.











Introducing the Temporal Dimension to Memory Forensics

```
$ ./vol.py -f dump.raw --profile=... --pagetime pslist  
<original pslist output>
```

```
Accessed physical pages: 171
```

```
Acquisition time window: 72s
```

```
[XX-----XxX---xXXX--xX-xX---Xxx-xx-X-XxxX-XXX]
```



Ongoing experiments repeated on 10 dumps



ALL contain inconsistencies in page tables

The kernel is ALWAYS affected

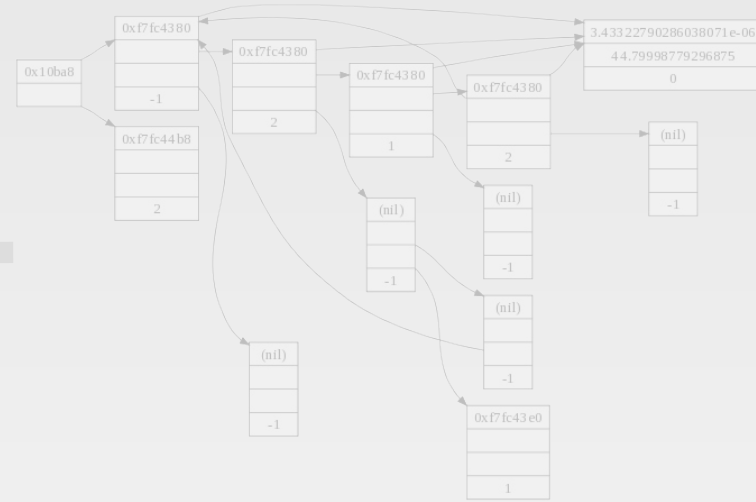
Dozens of processes with corrupted address spaces

Two cases in which the pages of one process get attributed to another

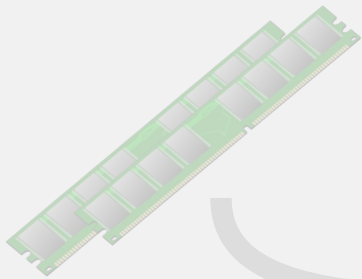
Investigation

```

C:\volatility-master(1)\volatility-master\python vol.py -f D:\Acquire\centos6\MemoryPhysi
Volatility Foundation Volatility Framework 2.6.1
-----
Name                               Pid  PPid  Thds  Hnds  Time
-----
0xfffffe01203ba900\System            4      0    109    0  2019-04-29
0xfffffe0120ca3040:ssms.exe          352     4     2     0  2019-04-29
0xfffffe012242f900:cmd.exe            2600  2576     1     0  2019-04-29
0xfffffe012242d900:postgres.exe       2612  2600     3     0  2019-04-29
.. 0xfffffe012257f600:postgres.exe     3120  2612     2     0  2019-04-29
.. 0xfffffe0122580300:postgres.exe     3104  2612     2     0  2019-04-29
.. 0xfffffe01224b7900:postgres.exe     2584  2612     3     0  2019-04-29
.. 0xfffffe0122581700:postgres.exe     3096  2612     2     0  2019-04-29
.. 0xfffffe01224af900:postgres.exe     3088  2612     2     0  2019-04-29
.. 0xfffffe012080e900:postgres.exe     3196  2612     2     0  2019-04-29
.. 0xfffffe01224a0900:postgres.exe     3112  2612     2     0  2019-04-29
0xfffffe0121a04000:csrss.exe           440    432     8     0  2019-04-29
0xfffffe01219b2900:wininit.exe         500    432     1     0  2019-04-29
0xfffffe0120524300:services.exe       588    500     3     0  2019-04-29
.. 0xfffffe0122050900:pgservice.exe    1688    588     6     0  2019-04-29
.. 0xfffffe0121ca3000:comhost.exe      1772   1688     2     0  2019-04-29
.. 0xfffffe01220b4000:python.exe       1820   1688     0     0  2019-04-29
.. 0xfffffe0121aab000:svchost.exe       644    588    16     0  2019-04-29
.. 0xfffffe0121aed900:svchost.exe       980    588    12     0  2019-04-29
.. 0xfffffe0121ab5900:svchost.exe       944    588    28     0  2019-04-29
.. 0xfffffe0121c20900:svchost.exe      1060    588    15     0  2019-04-29
.. 0xfffffe01228c3000:sqlwiter.exe     1948    588     2     0  2019-04-29
.. 0xfffffe0121a44900:svchost.exe       688    588     6     0  2019-04-29
.. 0xfffffe01220b1900:ReportingServi   1844    588    43     0  2019-04-29
.. 0xfffffe0121c10900:msmdsrv.exe      1652    588    19     0  2019-04-29
.. 0xfffffe0121f10900:svchost.exe      2784    588    26     0  2019-04-29
.. 0xfffffe0122071900:msdtc.exe       3804    588     9     0  2019-04-29
.. 0xfffffe0121c53900:spoolsv.exe      1228    588     8     0  2019-04-29
.. 0xfffffe0121ad0800:svchost.exe      1336    588     8     0  2019-04-29
    
```

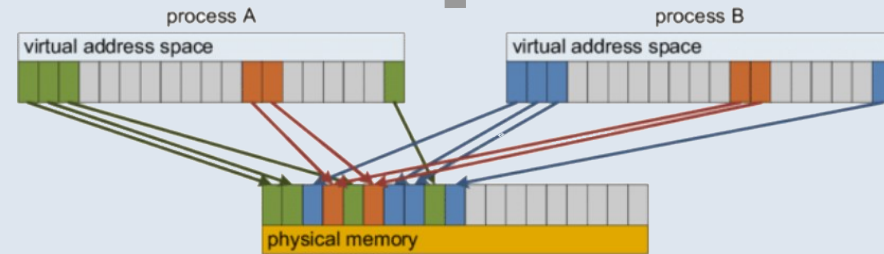


Acquisition

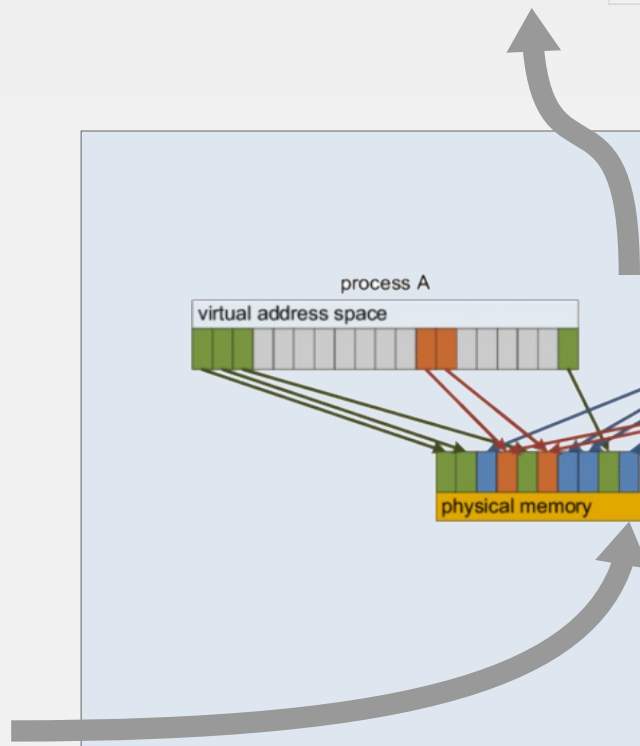


```

75 15 39 f1 76 41 f7 f1
5e 5f 5d c3 8d 74 26 00
1f 89 45 ec 75 51 3b 4d
89 f2 8b 75 f0 29 ce 19
c4 20 5e 5f 5d c3 66 90
00 31 d2 f7 f1 89 c1 89
eb a5 8d b6 00 00 00 00
c3 8d b4 26 00 00 00 00
ec c7 45 f0 20 00 00 00
    
```



Interpretation



Virtual-to-Physical Memory Translation

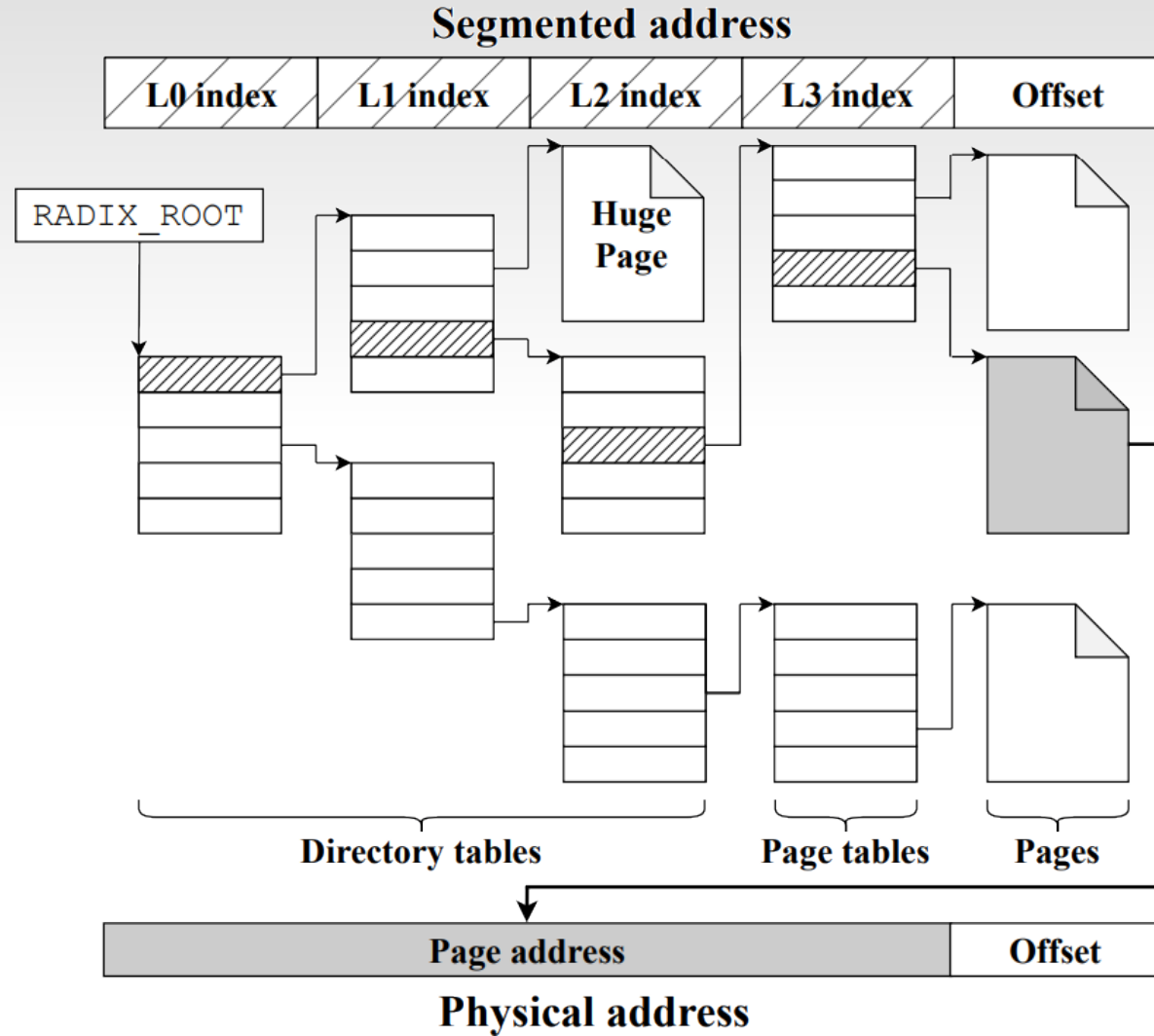


The V2P translation is performed in hardware by the Memory Management Unit (**MMU**) based on in-memory data structures and dedicated CPU registers that are configured by the OS

The translation process can involve **segmentation** and **paging**. Some architectures use one or the other, some use both.

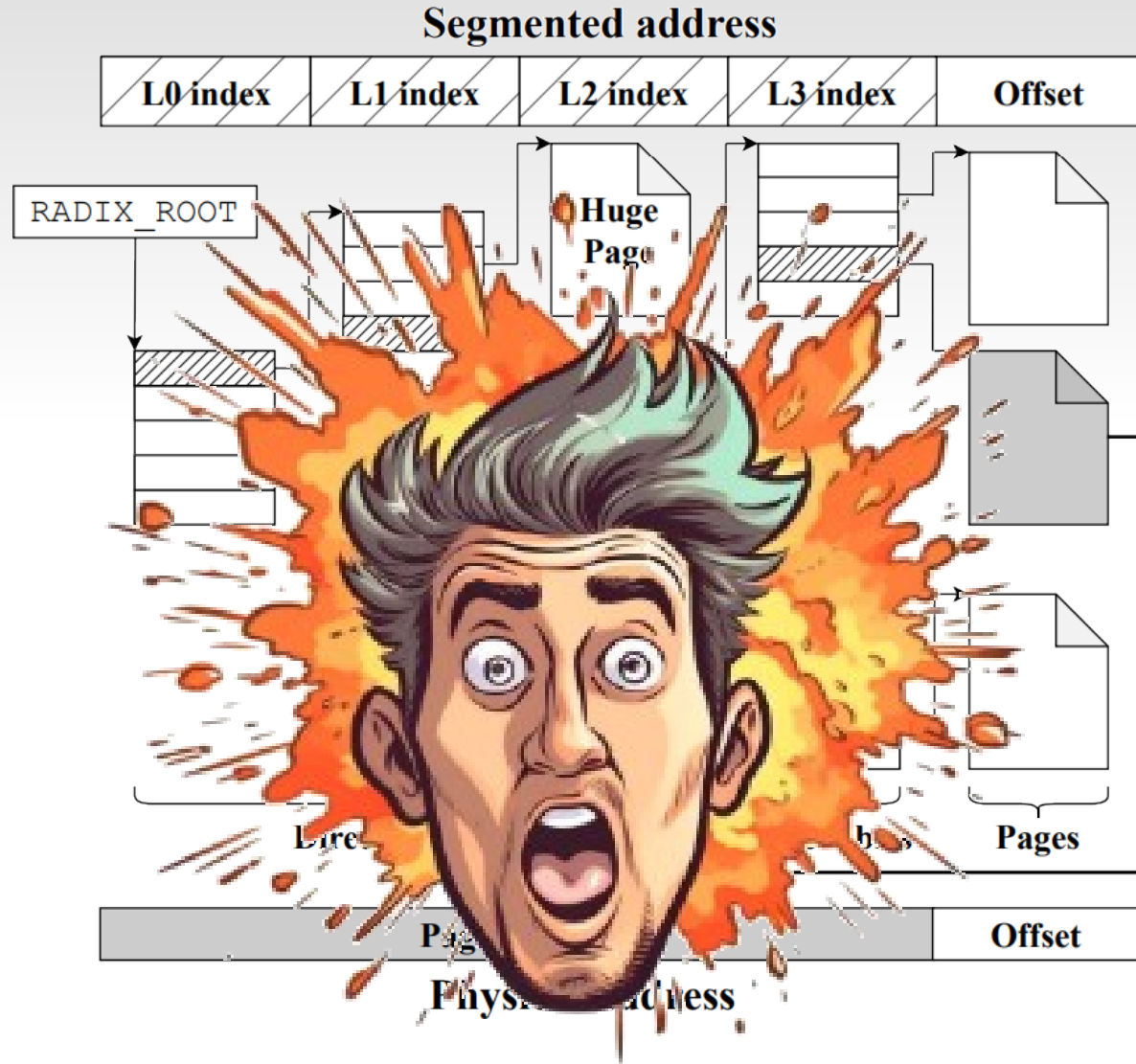


Virtual-to-Physical Memory Translation





Virtual-to-Physical Memory Translation





Multiarchitecture OS-Agnostic Virtual Memory Forensics

radix-tree



hash table

PowerPC™



fully customizable

MIPS



Multiarchitecture OS-Agnostic Virtual Memory Forensics

Want to know more?

In the Land of MMUs: Multiarchitecture OS-Agnostic Virtual Memory Forensics

ANDREA OLIVERI, Eurecom, France

DAVIDE BALZAROTTI, Eurecom, France

The first step required to perform any analysis of a physical memory image is the reconstruction of the virtual address spaces, which allows translating virtual addresses to their corresponding physical offsets. However, this phase is often overlooked and the challenges related to it are rarely discussed in the literature. Practical tools solve the problem by using a set of custom heuristics tailored on a very small number of well-known operating systems running on few architectures.

In this paper, we look for the first time at all the different ways the virtual to physical translation can be operated in 10 different CPU architectures. In each case, we study the inviolable constraints imposed by the MMU that can be used to build signatures to recover the required data structures from memory without any knowledge about the running operating system. We build a proof-of-concept tool to experiment with the extraction of virtual address spaces showing the challenges of performing an OS-agnostic virtual to physical address translation in real-world scenarios. We conduct experiments on a large set of 26 different OSs and a use case on a real hardware device. Finally, we show a possible usage of our technique to retrieve information about user space processes running on an unknown OS without any knowledge of its internals.

CCS Concepts: • **Applied computing** → **System forensics**; • **Security and privacy** → *Operating systems security*.

Additional Key Words and Phrases: memory forensics, OS-agnostic forensics, virtual memory, MMU

ACM Reference Format:

Andrea Oliveri and Davide Balzarotti. 2022. In the Land of MMUs: Multiarchitecture OS-Agnostic Virtual Memory Forensics. 1, 1 (April 2022), 33 pages. <https://doi.org/10.1145/nnnnnnn.nnnnnnn>

1 INTRODUCTION

The problem of recovering semantic information from low-level data is common to many areas of computer security. In particular, this is the main obstacle when performing a physical memory analysis—a task that is key for both memory forensics and virtual machine introspection. The problem, often called the *semantic gap*, captures the challenge of “interpreting low level bits and bytes into a high level semantic state of an in-guest operating system” [35]. However, at a closer look, the semantic gap can be further divided into two different aspects: the reconstruction of the virtual address spaces (which deal with translating pointers expressed as virtual addresses to their physical position in the

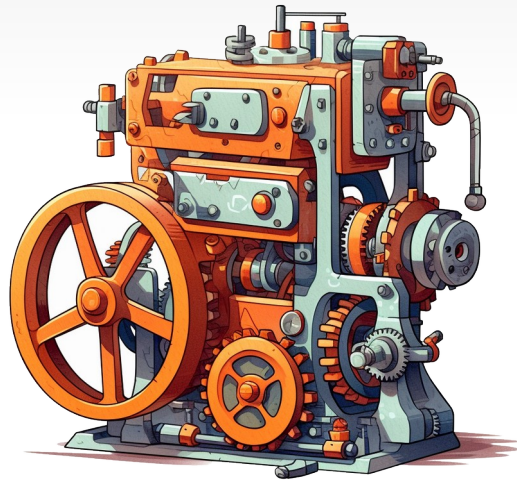


Physical to Virtual Memory Translation

1. **Structural Signatures** derived by inviolable MMU constraints
2. **Validation Rules** based on inviolable constraints imposed by other CPU subsystems
(e.g., pages containing the Interrupt Address Table should be mapped in all VASs)
3. **Binary code analysis** to recover MMU-related CPU registers



Physical to Virtual Memory Translation



MMUShell

<https://github.com/eurecom-s3/mmushell>

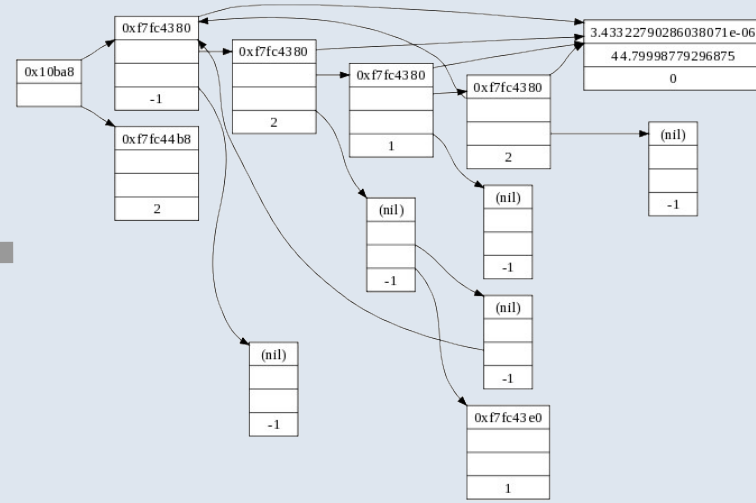


Memory Translation

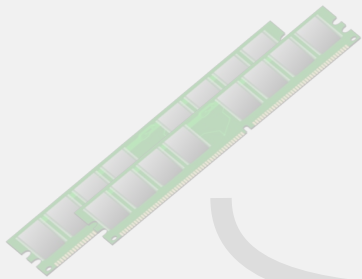
OS	Open-source Kernel type ¹	Architectures MMU modes										
		AArch64 Long	ARM32 Short AMMD64	MIPS32 TLBs	MIPS32 Radix	PowerPC	RISC-V SV32	RISC-V SV48	x86 IA32	x86 PAE		
9Front[24]	H ●										●	
Barrelfish[17]	U ●	●	●	●								
Darwin[4]	H ●		●									
Embox[5]	R ●	●		●	●						●	
FreeBSD	M ●	●	●							●	●	
GenodeOS[6]	m ●		●									
HaikuOS[7]	H ●		●								●	
HelenOS[8]	m ●	●	●	●	●		●					
Linux Buildroot[3]	M ●	●	●	●	●	●	●	●	●	●	●	●
Linux Debian	M ●	●	●	●					●	●		
MacOS 9	n ○								●			
MacOS X	H ○								●			
Minix3[9]	m ●										●	
MorphOS[10]	m ○								●			
NetBSD	M ●	●	●	●					●		●	
Illumos[29]	M ●		●									
QNX[11]	R ○										●	
rCore[13]	M ●	●	●							●	●	
ReactOS[14]	m ●										●	
RedoxOS[15]	m ●		●									
vxWorks[19]	R ○		●									
Windows 10	H ○	●	●									●
Windows 95	M ○										●	
Windows NT	H ○										●	
Windows XP	H ○		●								●	●
XV6[20]	M ●									●		

Investigation

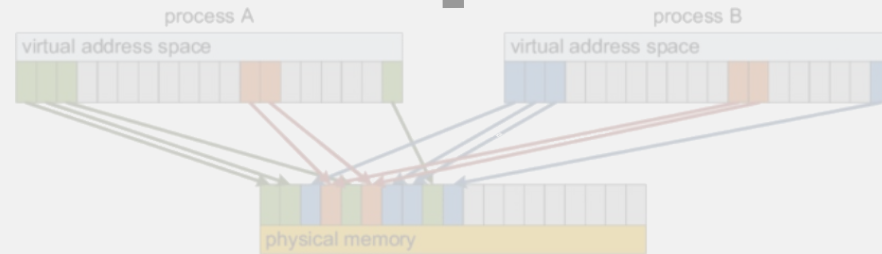
```
C:\volatility-master(1)\volatility-master\python vol.py -f D:\Acquire\centos6\MemoryPhysi
Volatility Foundation Volatility Framework 2.6.1
-----
Name                               Pid    PPid   Thds  Hnds Time
-----
0xfffffe01203ba000\System            4      0      109   0  2019-04-29
0xfffffe0120c43040:ssms.exe          352    4       2   0  2019-04-29
0xfffffe012242f900:cmd.exe            2600   2576    1   0  2019-04-29
0xfffffe012242d900:postgres.exe      2612   2600    3   0  2019-04-29
.. 0xfffffe012257f800:postgres.exe    3120   2612    2   0  2019-04-29
.. 0xfffffe0122580300:postgres.exe    3104   2612    2   0  2019-04-29
.. 0xfffffe01224b7900:postgres.exe    2584   2612    3   0  2019-04-29
.. 0xfffffe0122581700:postgres.exe    3096   2612    2   0  2019-04-29
.. 0xfffffe01224af900:postgres.exe    3088   2612    2   0  2019-04-29
.. 0xfffffe012080e900:postgres.exe    3196   2612    2   0  2019-04-29
.. 0xfffffe01224a0900:postgres.exe    3112   2612    2   0  2019-04-29
0xfffffe0121a04000:csrss.exe          440    432    8   0  2019-04-29
0xfffffe01219b2900:wininit.exe        500    432    1   0  2019-04-29
0xfffffe0120524300:services.exe      588    500    3   0  2019-04-29
.. 0xfffffe0122050900:pgs-service.exe  1688   588    6   0  2019-04-29
.. 0xfffffe0121ca3000:comhost.exe     1772   1688    2   0  2019-04-29
.. 0xfffffe01220b4000:python.exe      1820   1688    0   0  2019-04-29
.. 0xfffffe0121aab000:svchost.exe      644    588   16   0  2019-04-29
.. 0xfffffe0121aed900:svchost.exe     980    588   12   0  2019-04-29
.. 0xfffffe0121ab5900:svchost.exe     944    588   28   0  2019-04-29
.. 0xfffffe0121c20900:svchost.exe    1060   588   15   0  2019-04-29
.. 0xfffffe01228c3000:sqlwiter.exe    1948   588    2   0  2019-04-29
.. 0xfffffe0121a44900:svchost.exe     688    588    6   0  2019-04-29
.. 0xfffffe01220b1900:ReportingServi  1844   588   43   0  2019-04-29
.. 0xfffffe0121c10900:msmsdsv.exe     1652   588   19   0  2019-04-29
.. 0xfffffe0121f19900:svchost.exe    2784   588   26   0  2019-04-29
.. 0xfffffe0122071900:msdtc.exe      3804   588    9   0  2019-04-29
.. 0xfffffe0121c53900:spoolsv.exe     1228   588    8   0  2019-04-29
.. 0xfffffe0121ad0800:svchost.exe    1336   588    8   0  2019-04-29
```



Acquisition



```
75 15 39 f1 76 41 f7 f1
5e 5f 5d c3 8d 74 26 00
1f 89 45 ec 75 51 3b 4d
89 f2 8b 75 f0 29 ce 19
c4 20 5e 5f 5d c3 66 90
00 31 d2 f7 f1 89 c1 89
eb a5 8d b6 00 00 00 00
c3 8d b4 26 00 00 00 00
ec c7 45 f0 20 00 00 00
```



Interpretation



The Problem with Profiles

Memory Forensics is based on **PROFILES**, which contain precise descriptions of all the kernel data structures necessary to perform the analysis.

Q1: Can we automatically generate profiles starting from the dump itself?

Q2: Can we perform some analysis also without any profile?





The Problem with Profiles

The important is NOT how much kernel structures change across kernels

But how much they change **within** a single version – because of user configurations or compiler options.

E.g., The layout of `task_struct` is shaped by more than 60 different `#ifdef`

Modern kernels also support *structure layout randomization* as a form of protection against exploitation



Automated Profile Generation

While the `struct` definitions are lost during the compilation process, they are “reflected” in the code itself.

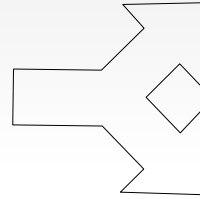


Automated Profile Generation

```
struct creds{
    uint32_t uid;
    uint32_t gid;
};

struct task{
    struct task *next;
    struct creds cred;
#ifdef CONFIG_TIME
    uint64_t start_time;
#endif
    char *name;
};

void setup_task(struct task *t,
                char *new_name,
                int gid)
{
    t->name = new_name;
    t->cred.gid = gid;
#ifdef CONFIG_TIME
    t->start_time = time(NULL);
#endif
}
```



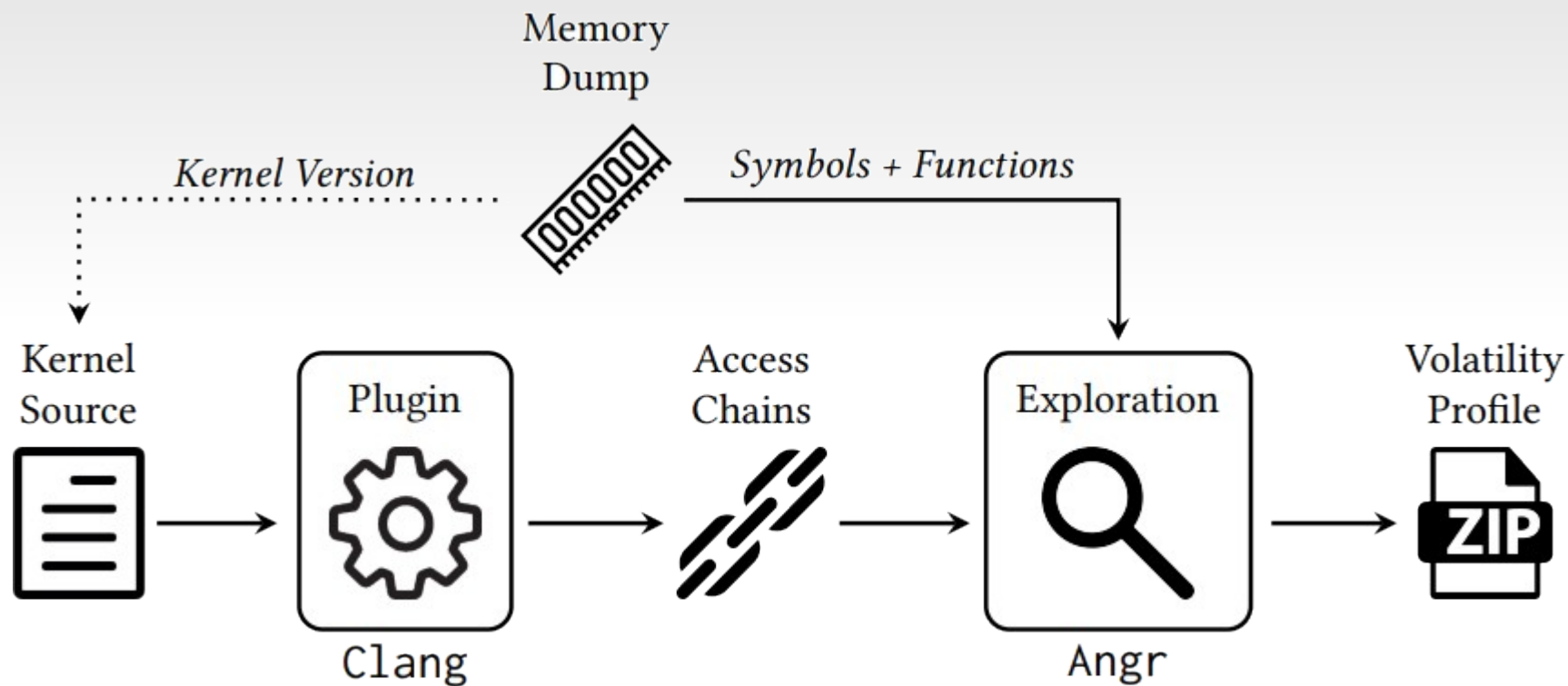
```
mov    QWORD PTR [rdi+0x10],rsi
mov    DWORD PTR [rdi+0xc],edx
ret
```

```
push   rbx
mov    rbx,rdi
mov    QWORD PTR [rdi+0x18],rsi

mov    DWORD PTR [rdi+0xc],edx
xor    edi,edi
call   0x1030 <time@plt>
mov    QWORD PTR [rbx+0x10],rax
pop    rbx
ret
```



Automated Profile Generation



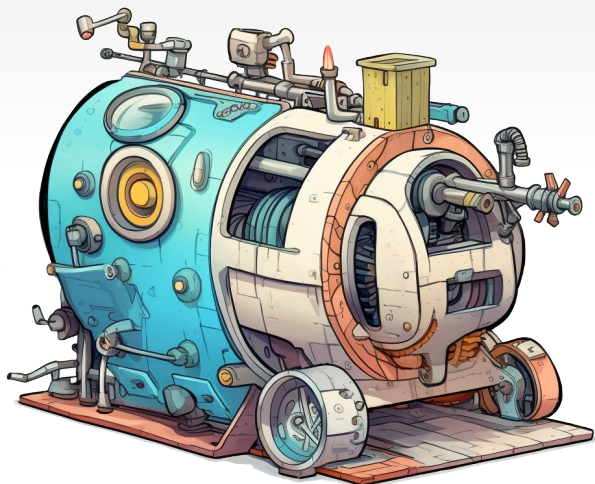


Automated Profile Generation

Version	Release Date	Configuration	Used Fields	Extracted Fields
4.19.37	04/2019	Debian	234	220 (94%)
4.19.37	04/2019	Debian + RANDSTRUCT	234	194 (83%)
5.6.19	03/2020	Raspberry Pi	227	217 (95%)
4.4.71	06/2017	OpenWrt	236	216 (92%)
3.18.94	05/2018	Goldfish (Android)	239	220 (92%)
2.6.38	03/2011	Ubuntu	226	213 (94%)



Automated Profile Generation



Katana

(very very similar solution published one year later)

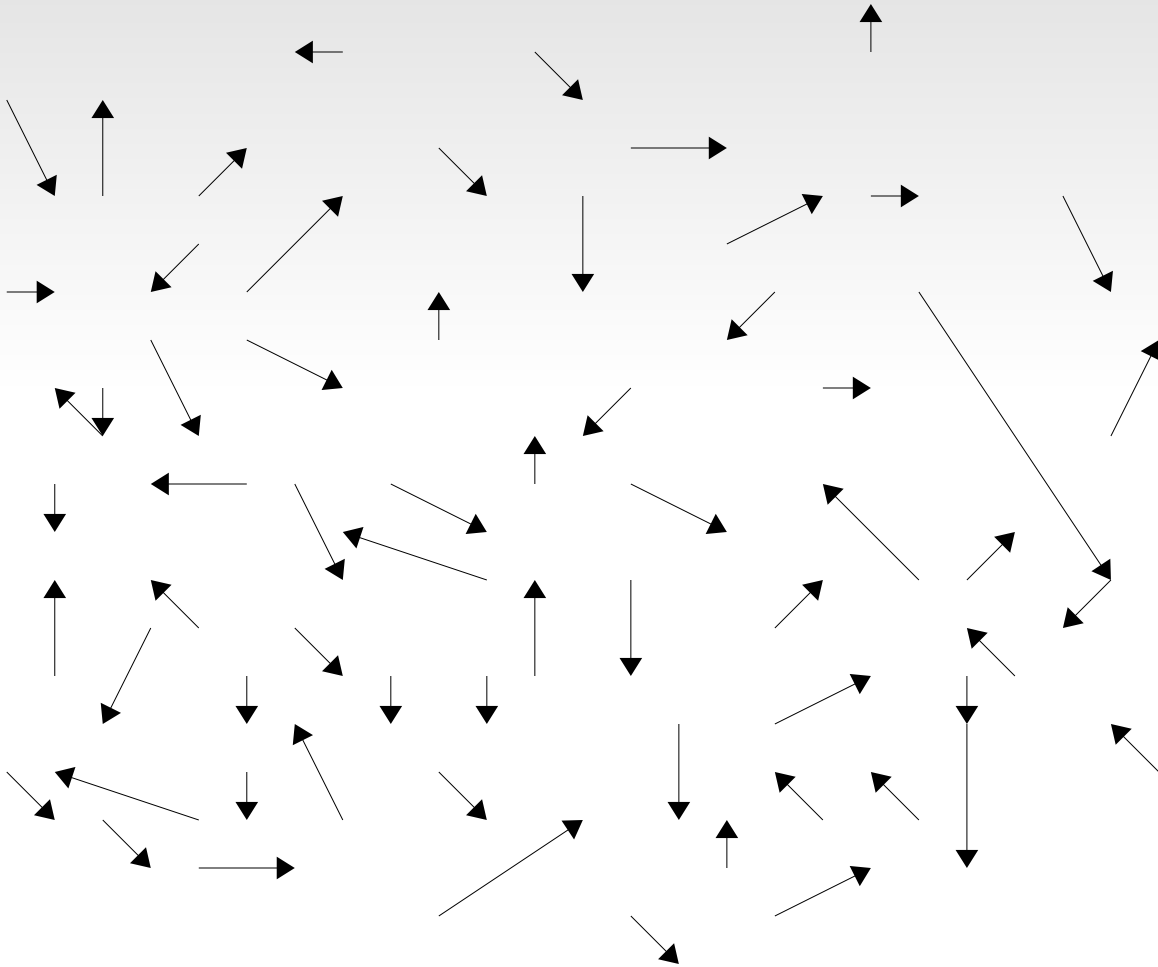
<https://github.com/tum-itsec/katana>



**Look Mum,
no Profiles!**

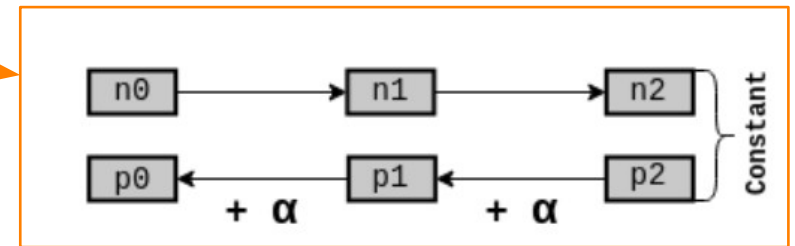
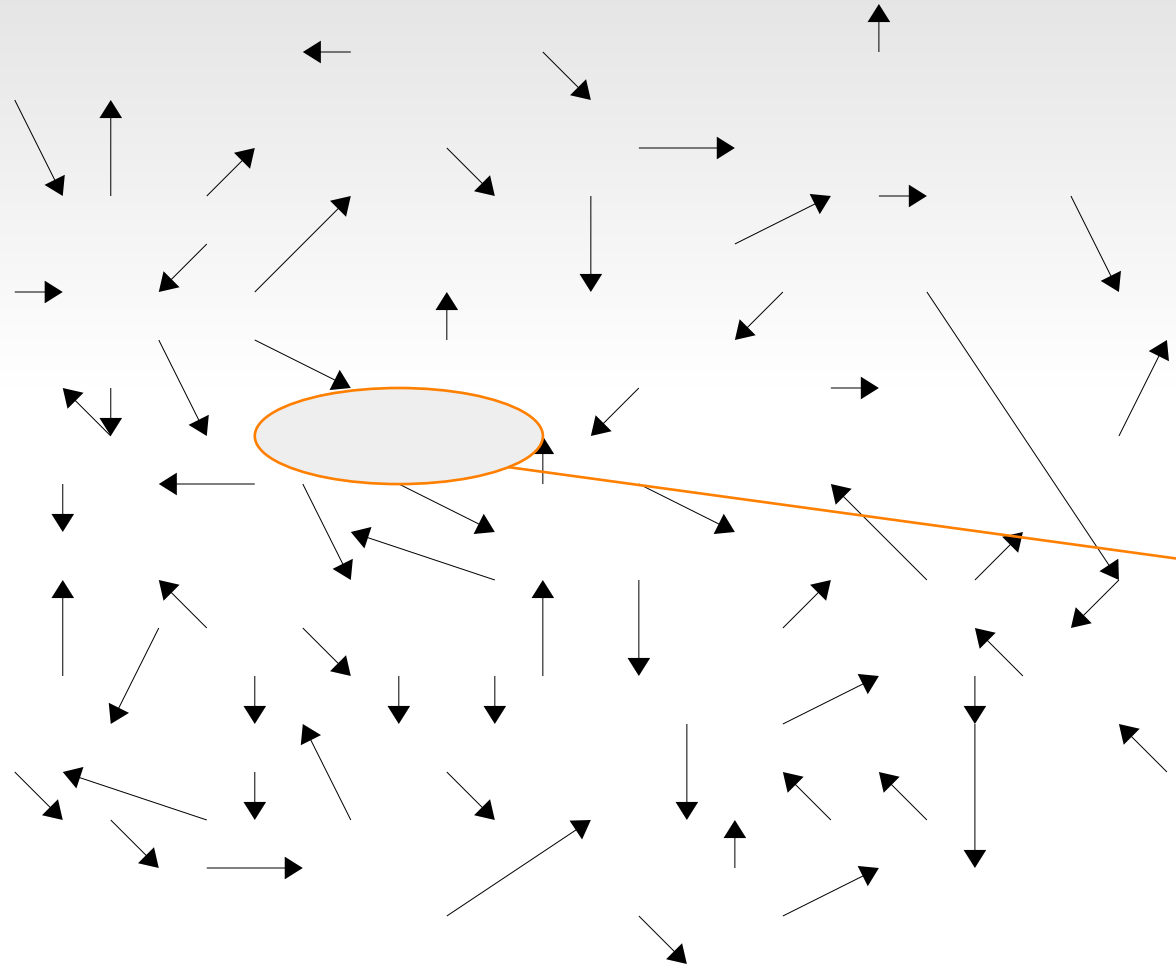


OS-Agnostic Memory Forensics



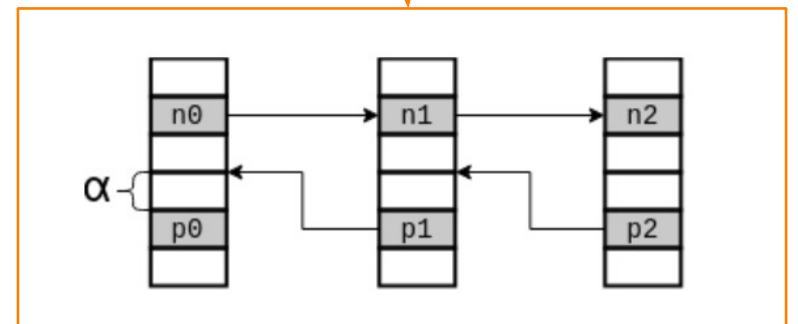
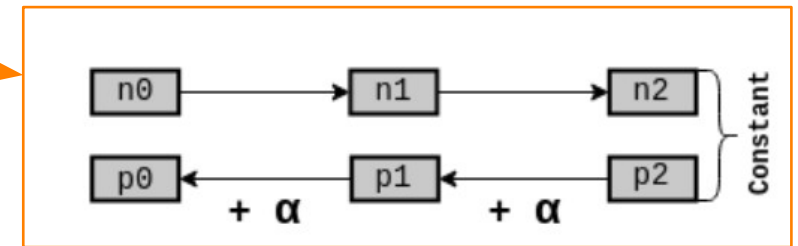
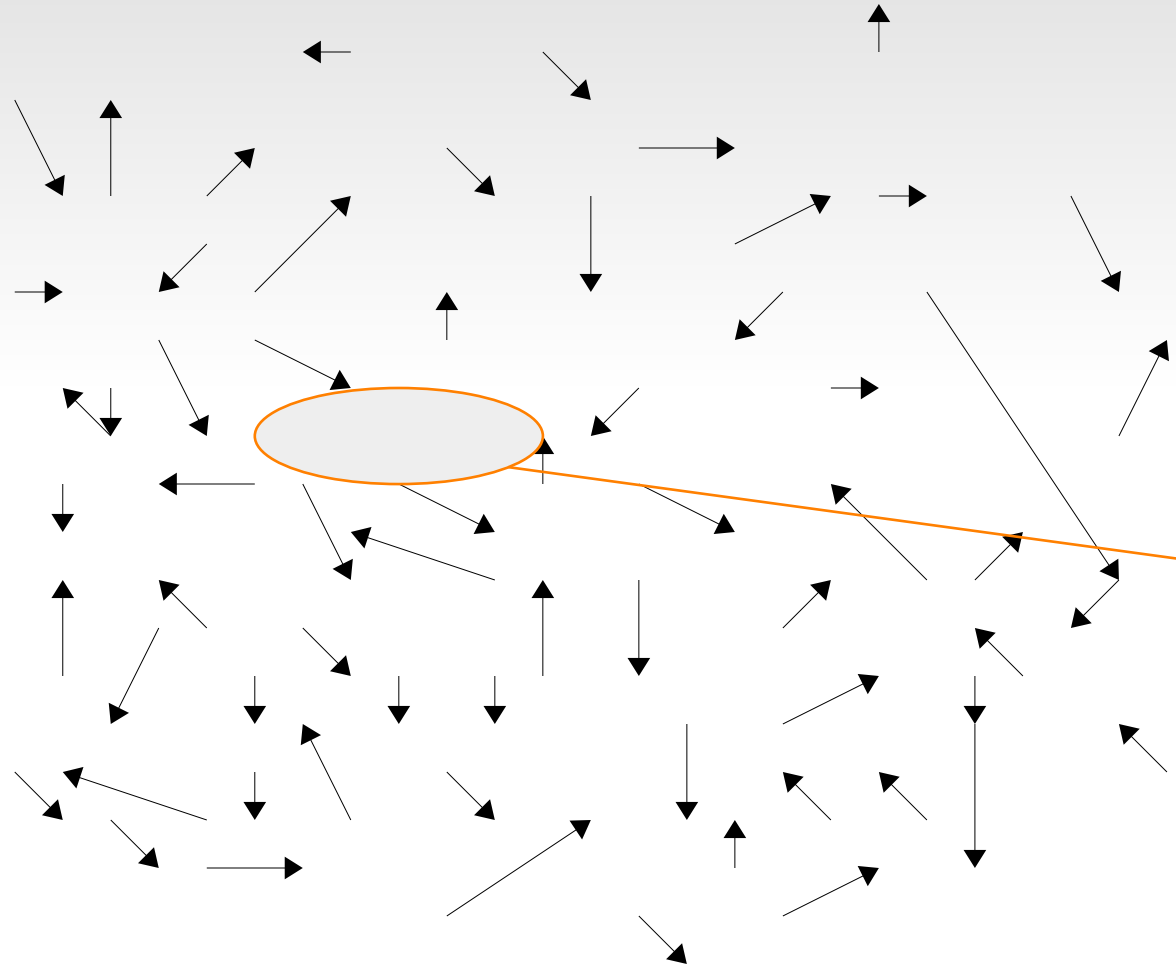


OS-Agnostic Memory Forensics



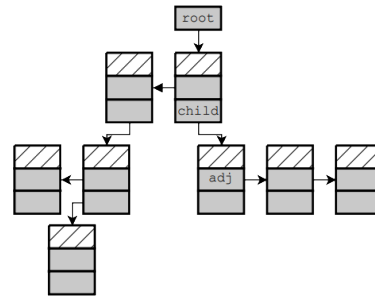
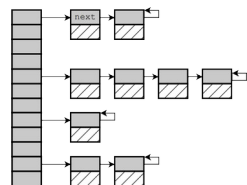
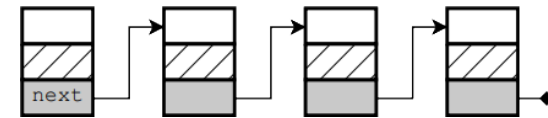
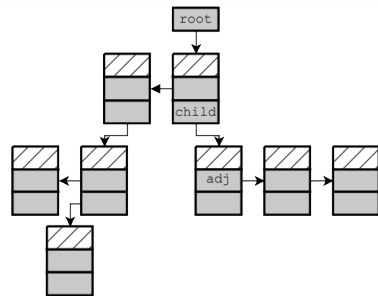
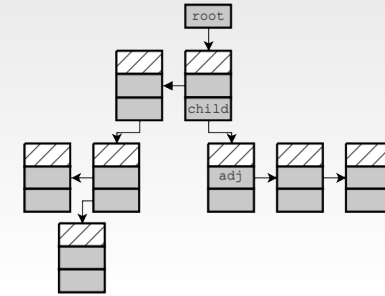
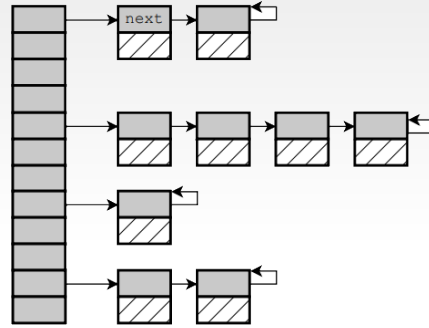
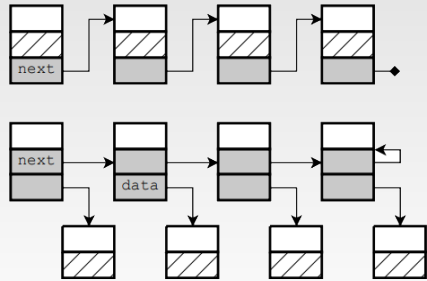


OS-Agnostic Memory Forensics



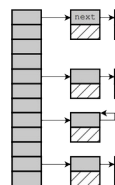
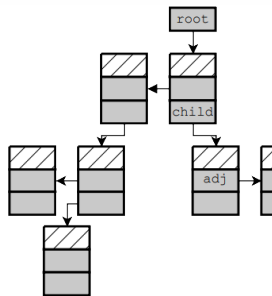
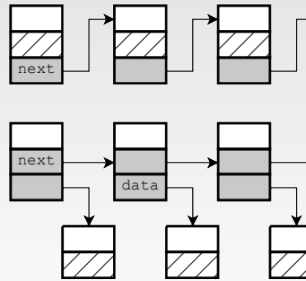


OS-Agnostic Memory Forensics

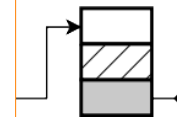




OS-Agnostic Memory Forensics

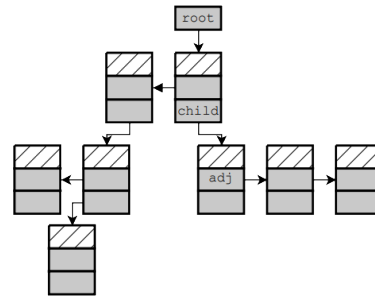
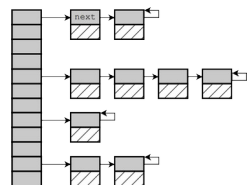
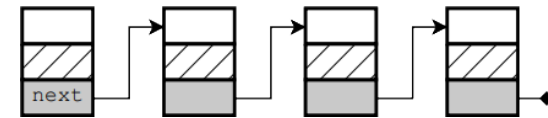
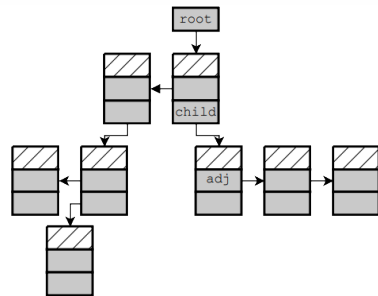
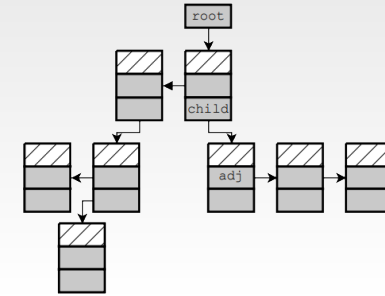
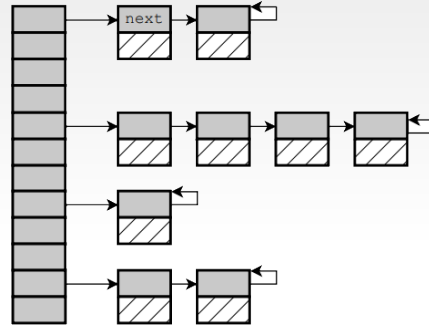
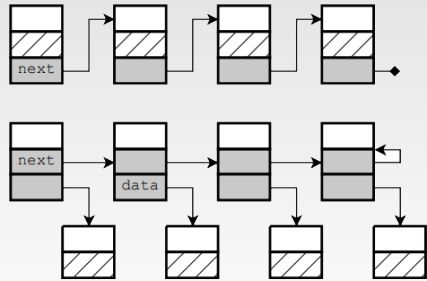


OS	Linear D.-L. L.	Circular D.-L. L.	Trees	Arrays of *structs	Arrays of *strings	Linked Lists
Darwin	11	385	127	1214	1801	35
Embox	0	22	35	1131	795	6
FreeBSD	86	0	993	1008	895	41
HaikuOS	4117	64	0	305	232	1184
HelenOS	25	1173	127	41	45	1
iOS	20	256	192	5234	229	36
Linux	120	3632	1034	693	5947	46
Linux (Aarch64)	110	3362	936	229	4985	43
NetBSD	41	18	1218	1482	406	45
ReactOS	7	200	49	492	325	12
ToaruOS	101	0	14	62	229	15
vxWorks	51	14	199	349	416	13
Windows XP	38	889	228	463	206	20
Windows 10	145	6639	36	0	282	0



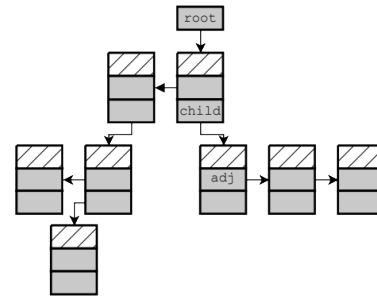
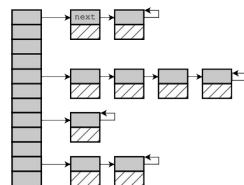
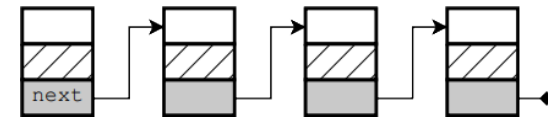
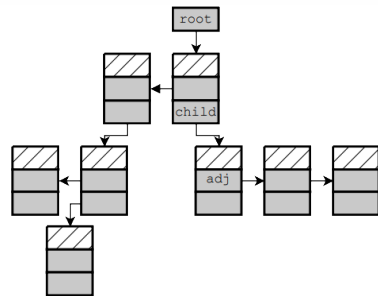
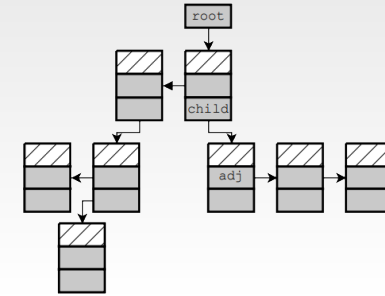
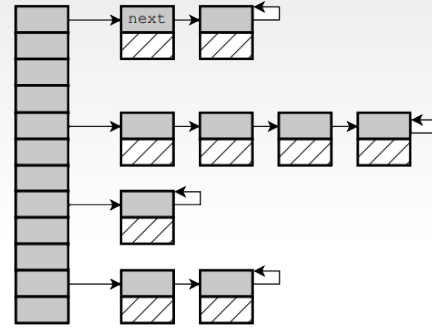
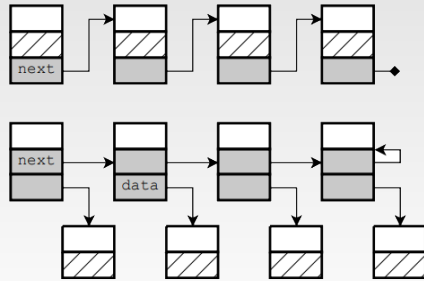


OS-Agnostic Memory Forensics



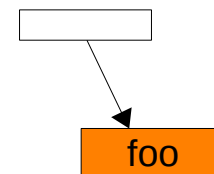
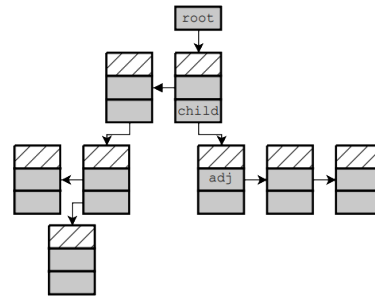
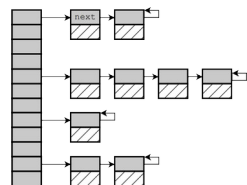
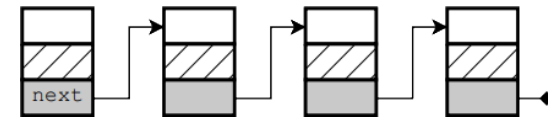
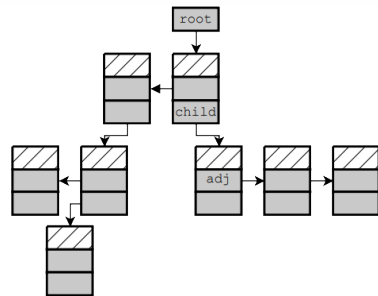
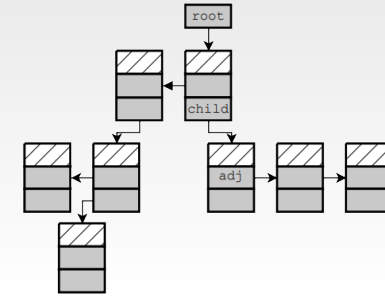
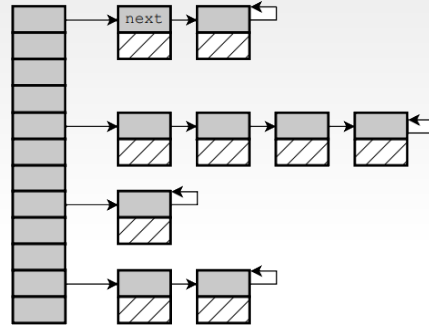
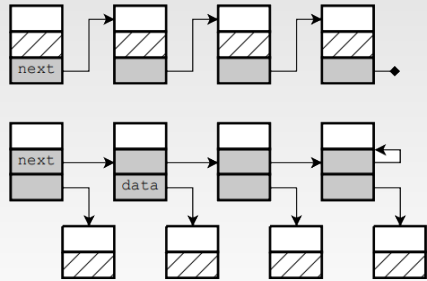


OS-Agnostic Memory Forensics



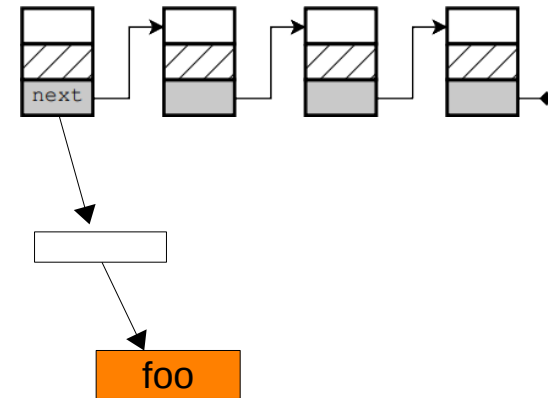
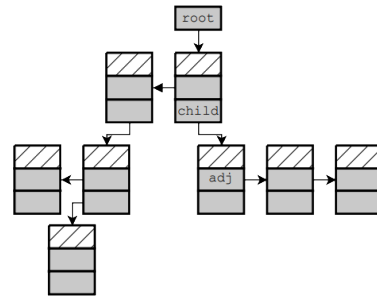
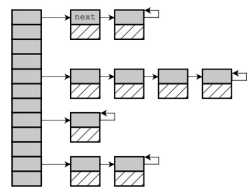
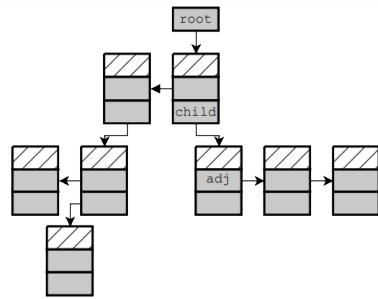
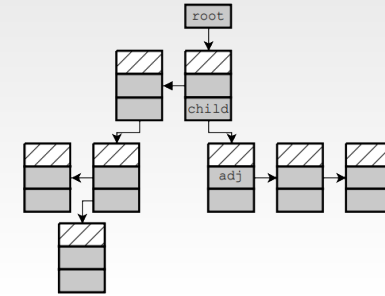
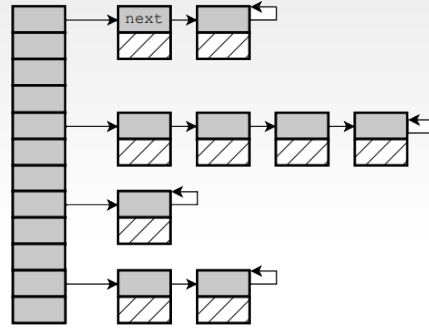
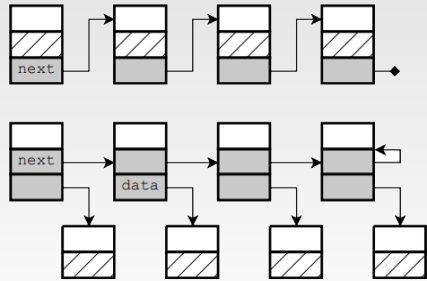


OS-Agnostic Memory Forensics



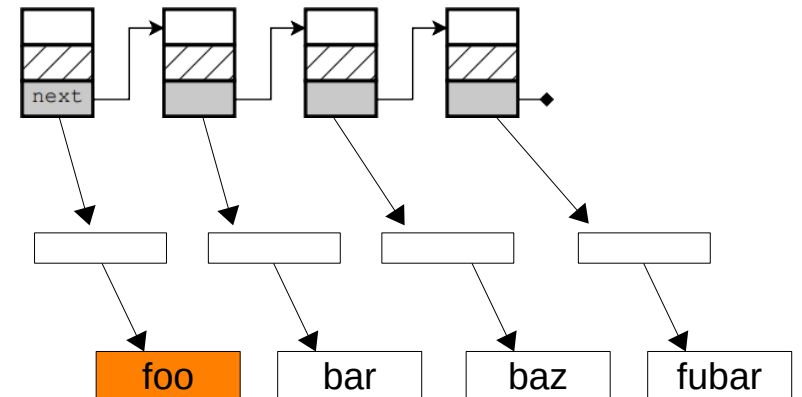
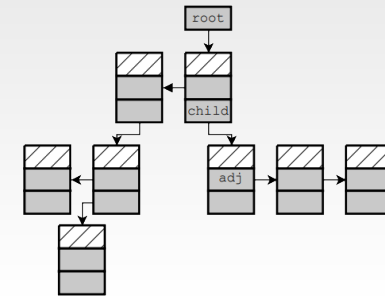
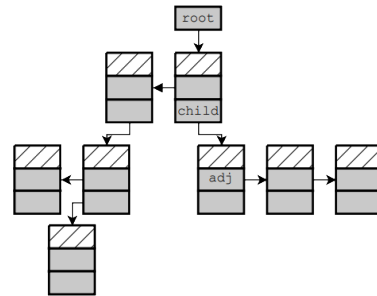
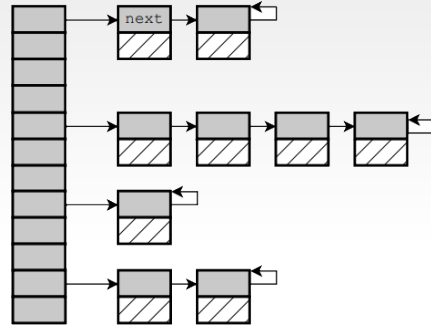
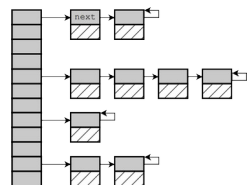
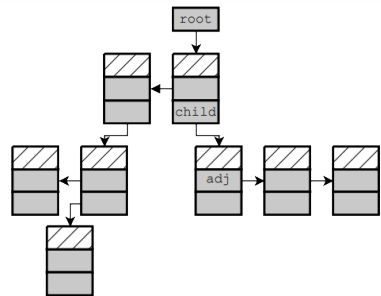
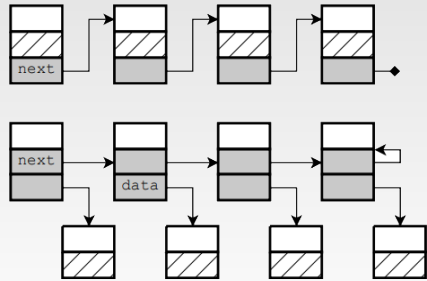


OS-Agnostic Memory Forensics



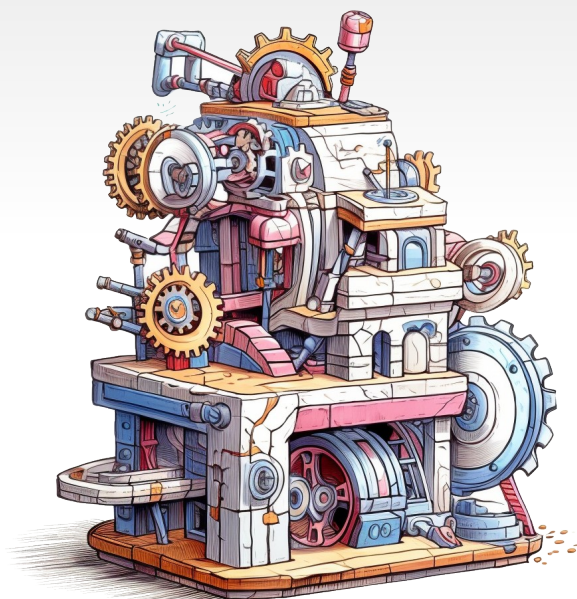


OS-Agnostic Memory Forensics





OS-Agnostic Memory Forensics



Fossil

<https://github.com/eurecom-s3/fossil>



OS-Agnostic Memory Forensics

OS	Kernel modules	Kernel pools	File systems	Other structures
Darwin	●	●	●	● List of network devices ● System locks ● Kernel/user pipes ● Kernel parameters
Embox	●		○	● List of commands
FreeBSD	●		●	
HaikuOS	●	●	○	● Executable libraries ● Kernel/user pipes ● Semaphores
HelenOS	●	●	●	
iOS	○	●	●	● List of network devices ● System locks ● Kernel/user pipes ● Kernel parameters
Linux	●	●	●	● Files in <i>sysfs</i> ● Network protocols
Linux (AArch64)	●	●	●	● Files in <i>sysfs</i> ● Network protocols
NetBSD	●	●	●	● Kernel tasks
ReactOS	○	●	○	
ToaruOS	●		●	● Devices' list ● Processes' environment
vxWorks	○	●	○	● Devices' list ● Open sockets
Windows XP	●	●	○	
Windows 10	●	●	●	





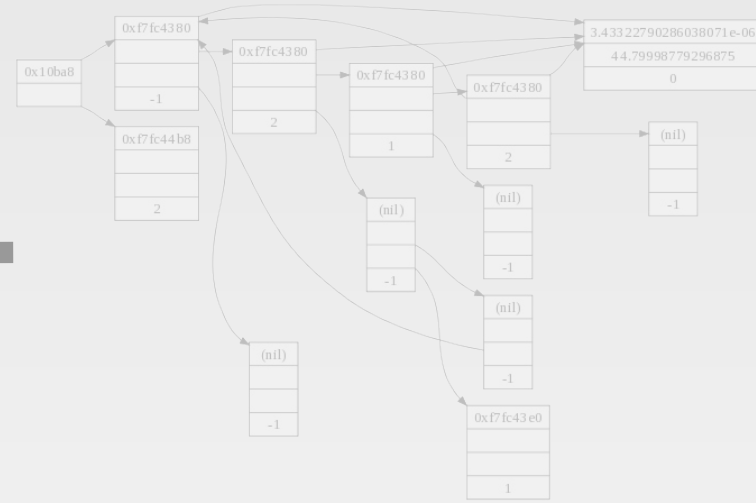
OS-Agnostic Memory Forensics

OS	Process list	Kernel modules	Kernel pools	Filesystem
Darwin	2	10	11	7
Embox	17	○		
FreeBSD	24	31		26
HaikuOS	6	1	11	
HelenOS	4	2	1	1
iOS	2		2	15
Linux	5	28	26	15
Linux (AArch64)	4	22	19	24
NetBSD	2	6	18	○
ReactOS	5		12	
ToaruOS	3	2	3	
vxWorks	4		2	
Windows XP	5	1	2	
Windows 10	41	○	○	○

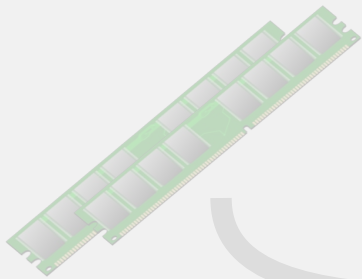


Investigation

```
C:\volatility-master(1)\volatility-master>python vol.py -f D:\Acquire\centos6\MemoryPhys1
Volatility Foundation Volatility Framework 2.6.1
-----
Name                               Pid  PPid  Thds  Hnds  Time
-----
0xfffffe01203ba900: System             4      0    109     0  2019-04-29
0xfffffe0120ca3040: smss.exe           352     4     2     0  2019-04-29
0xfffffe012242f900: cmd.exe            2600   2576    1     0  2019-04-29
0xfffffe012242d900: postgres.exe       2612   2600    3     0  2019-04-29
.. 0xfffffe012257f800: postgres.exe       3120   2612    2     0  2019-04-29
.. 0xfffffe01225803c0: postgres.exe       3104   2612    2     0  2019-04-29
.. 0xfffffe01224b7900: postgres.exe       2584   2612    3     0  2019-04-29
.. 0xfffffe0122581780: postgres.exe       3096   2612    2     0  2019-04-29
.. 0xfffffe01224af900: postgres.exe       3088   2612    2     0  2019-04-29
.. 0xfffffe012060e900: postgres.exe       3196   2612    2     0  2019-04-29
.. 0xfffffe01224ab900: postgres.exe       3112   2612    2     0  2019-04-29
0xfffffe0121a04000: csrss.exe           440    432     8     0  2019-04-29
0xfffffe01219b2900: wininit.exe          500    432     1     0  2019-04-29
0xfffffe0120524380: services.exe        588    500     3     0  2019-04-29
.. 0xfffffe012205d900: pgservice.exe      1688    588     6     0  2019-04-29
.. 0xfffffe0121ca8000: comhost.exe       1772   1688     2     0  2019-04-29
.. 0xfffffe01220b4c0: python.exe          1820   1688     0     0  2019-04-29
.. 0xfffffe0121aab900: svchost.exe         644    588    16     0  2019-04-29
.. 0xfffffe0121aed900: svchost.exe         900    588    12     0  2019-04-29
.. 0xfffffe0121ab5900: svchost.exe         944    588    28     0  2019-04-29
.. 0xfffffe0121c29900: svchost.exe        1860    588    15     0  2019-04-29
.. 0xfffffe01220ce300: sqlwmiter.exe       1948    588     2     0  2019-04-29
.. 0xfffffe0121a44900: svchost.exe         688    588     6     0  2019-04-29
.. 0xfffffe01220b1900: ReportingServi       1844    588    43     0  2019-04-29
.. 0xfffffe0121c10900: msmdsrv.exe         1652    588    19     0  2019-04-29
.. 0xfffffe0121f19900: svchost.exe        2784    588    26     0  2019-04-29
.. 0xfffffe0122871900: msdtc.exe           3804    588     9     0  2019-04-29
.. 0xfffffe0121c53900: spoolsv.exe         1228    588     9     0  2019-04-29
.. 0xfffffe0121adc000: svchost.exe        1336    588     8     0  2019-04-29
```



Acquisition



```
75 15 39 f1 76 41 f7 f1
5e 5f 5d c3 8d 74 26 00
1f 89 45 ec 75 51 3b 4d
89 f2 8b 75 f0 29 ce 19
c4 20 5e 5f 5d c3 66 90
00 31 d2 f7 f1 89 c1 89
eb a5 8d b6 00 00 00 00
c3 8d b4 26 00 00 00 00
ec c7 45 f0 20 00 00 00
```



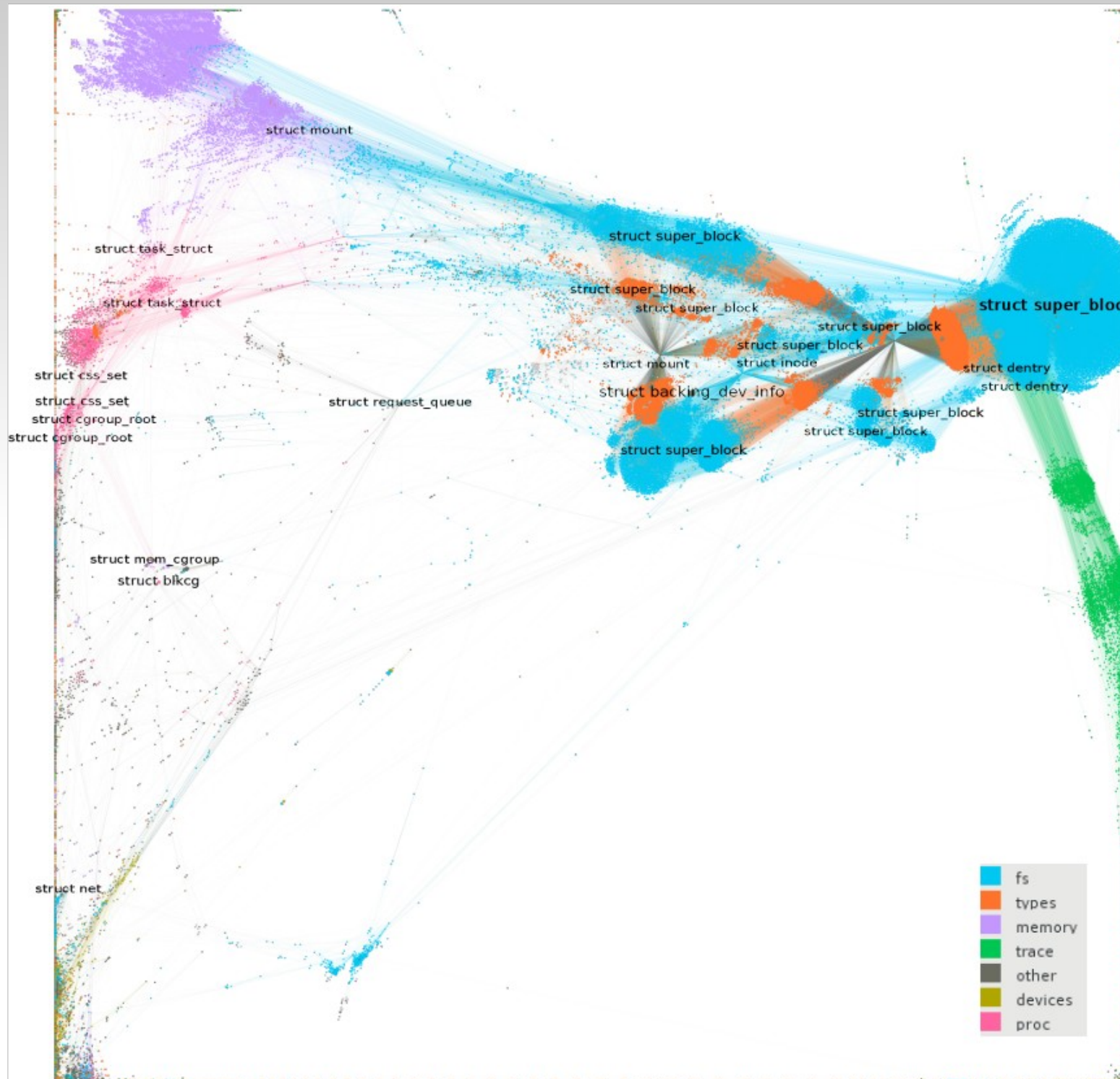
Interpretation



Memory Forensics as a Graph Exploration Problem

The goal of the analyst is to traverse the graph of kernel data structures to locate the information she needs.

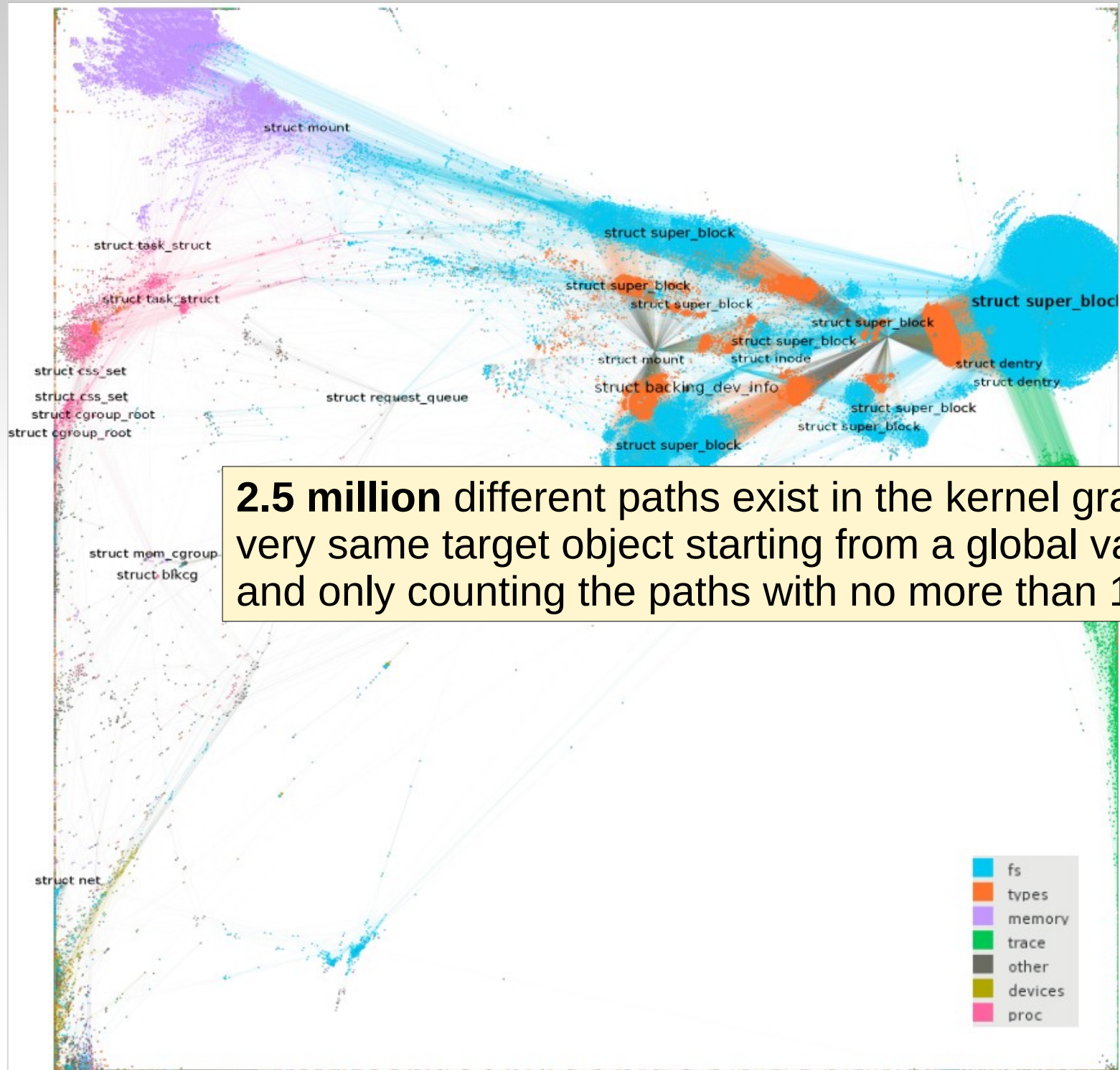
Each rule (e.g., a plugin to list processes) corresponds to a set of paths on the graph.



6K Unique Structures
40K Fields

100K Kernel Objects (nodes)
840K Pointers (edges)

53% of nodes (and 96% of those used by Volatility) are part of a single strongly-connected component



6K Unique Structures
40K Fields

2.5 million different paths exist in the kernel graph to reach the very same target object starting from a global variable, and only counting the paths with no more than 10 edges!!

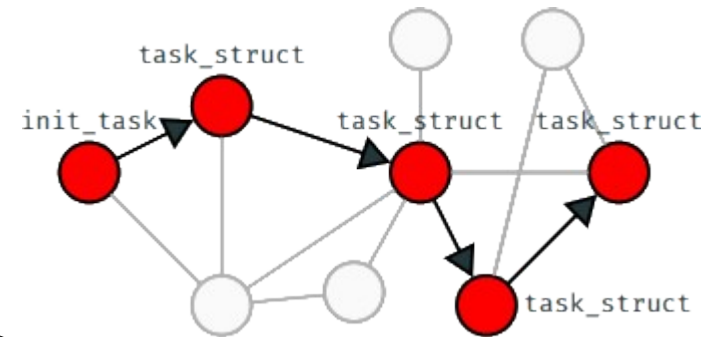
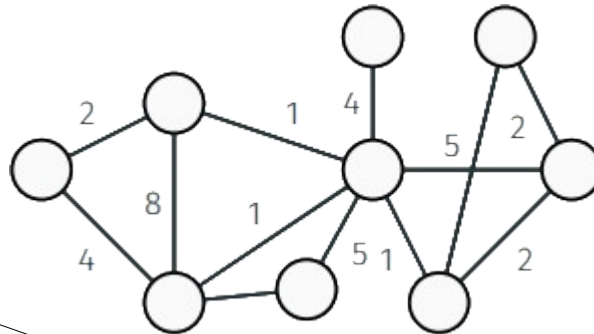
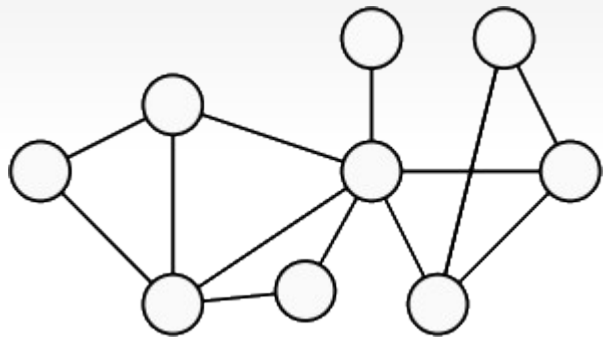
jects (nodes)
 dges)

53% of nodes (and **96% of those used by Volatility**) are part of a single strongly-connected component



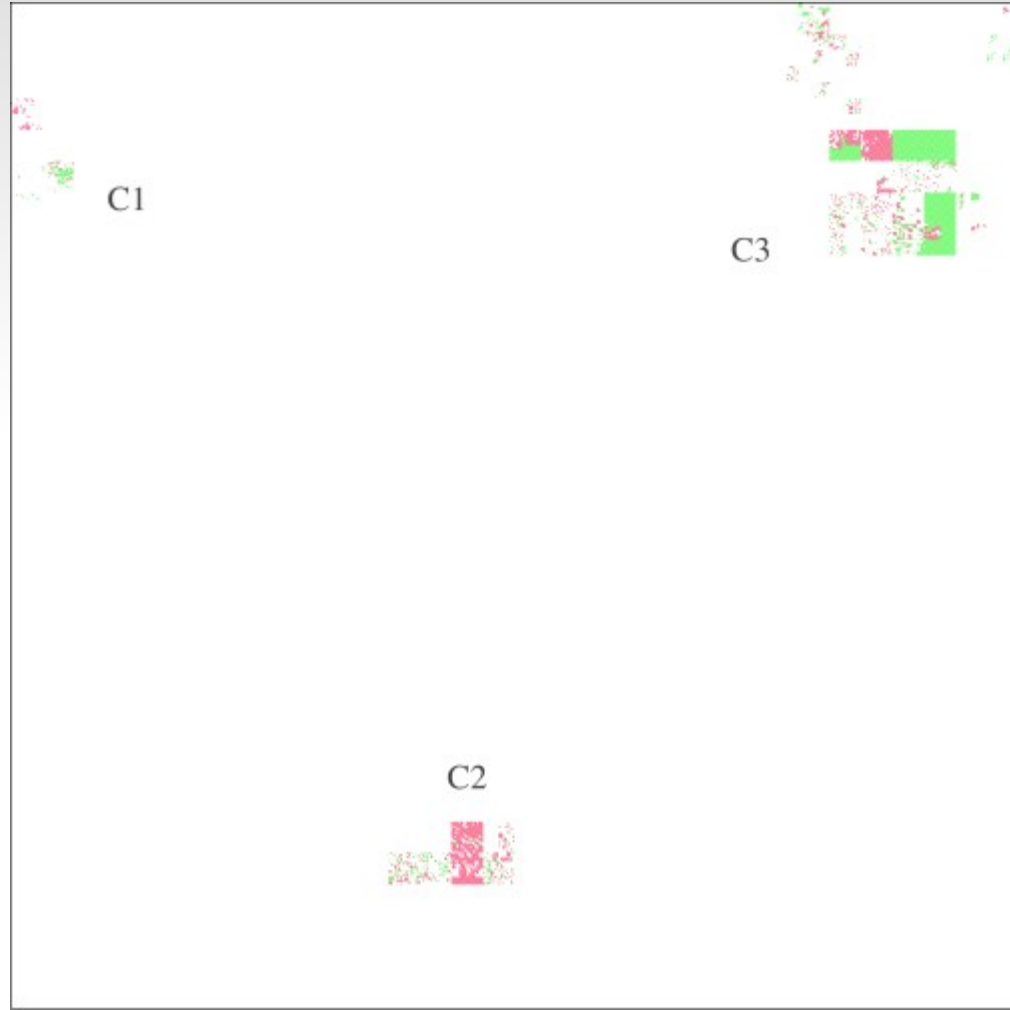
Memory Forensics as a Graph Exploration Problem

Path comparison based on different **metrics**





Memory Forensics as a Graph Exploration Problem

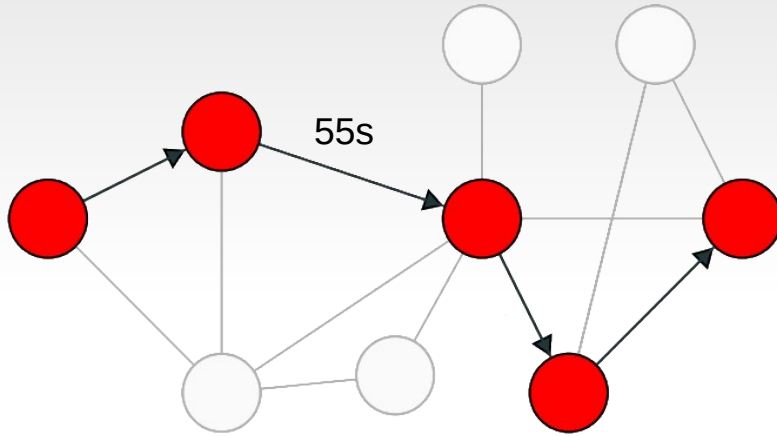




Memory Forensics as a Graph Exploration Problem

Atomicity

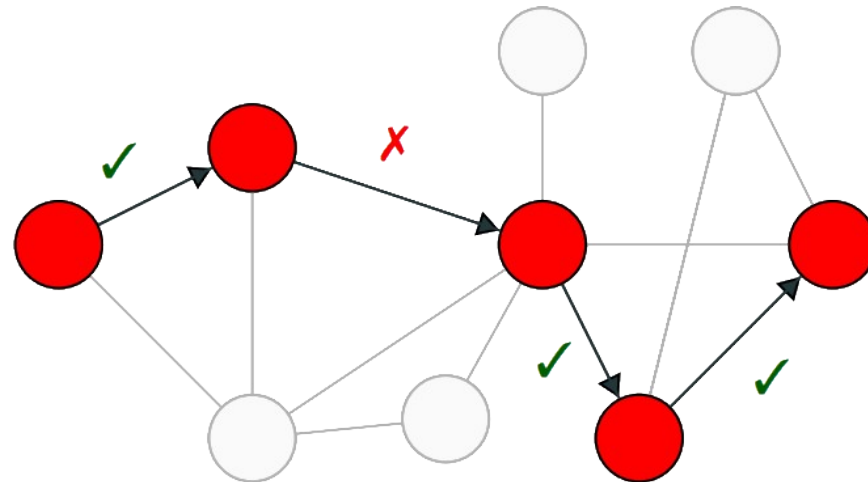
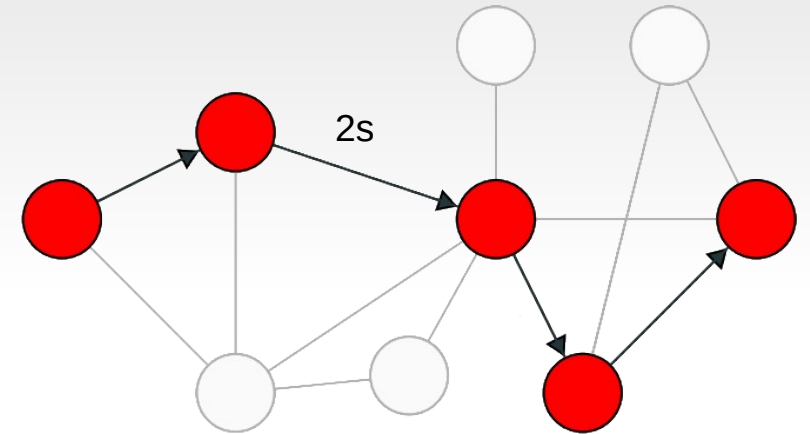
(distance between two structures)



+

Stability


(how often the pointers are updated)





Memory Forensics as a Graph Exploration Problem

Want to know
more?

 **usenix**
THE ADVANCED
COMPUTING SYSTEMS
ASSOCIATION

**Back to the Whiteboard: a Principled Approach
for the Assessment and Design of Memory
Forensic Techniques**

Fabio Pagani and Davide Balzarotti, *EURECOM*

<https://www.usenix.org/conference/usenixsecurity19/presentation/pagani>

This paper is included in the Proceedings of the
28th USENIX Security Symposium.
August 14–16, 2019 • Santa Clara, CA, USA
978-1-939133-06-9

Open access to the Proceedings of the



Memory Forensics 2.0 ?



Manual → Automated



Manual → Automated

Knowledge-based

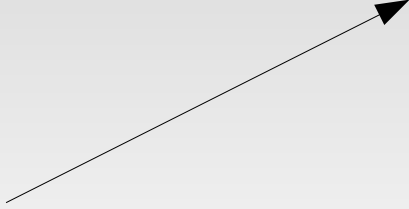
Zero-Knowledge

Quantitative Measurements



Optimal Solutions
(for a given metric)

Heuristics

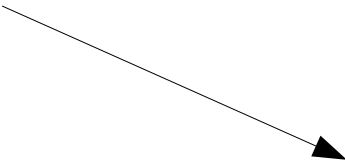


Manual



Automated

Knowledge-based



Zero-Knowledge



"Wet the Appetite" by Midjourney



davide.balzarotti@eurecom.fr



[@balzarot](https://twitter.com/balzarot)



<http://s3.eurecom.fr/~balzarot>