

Detecting Environment-Sensitive Malware

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Problem Outline

- ▶ Thousands of new malware samples surface every day
 - ▶ Automation of analysis is necessary → Dynamic malware analysis
 - ▶ Sample is executed in a monitored environment (emulator, virtual machine)
 - ▶ Secure Systems Lab developed Anubis ("Analyzing Unknown Binaries")
 - ▶ Public malware analysis sandbox: <http://anubis.iseclab.org/>
- ▶ **BUT:** Malware can discover that it is being analyzed
 - ▶ Environment-sensitive malware checks for characteristics of the sandbox: CPU bugs, timing, Windows product ID, username, hardware serials, ...
 - ▶ Malware exhibits no malicious activity in the sandbox ("analysis evasion")
- How can we detect analysis evasion?

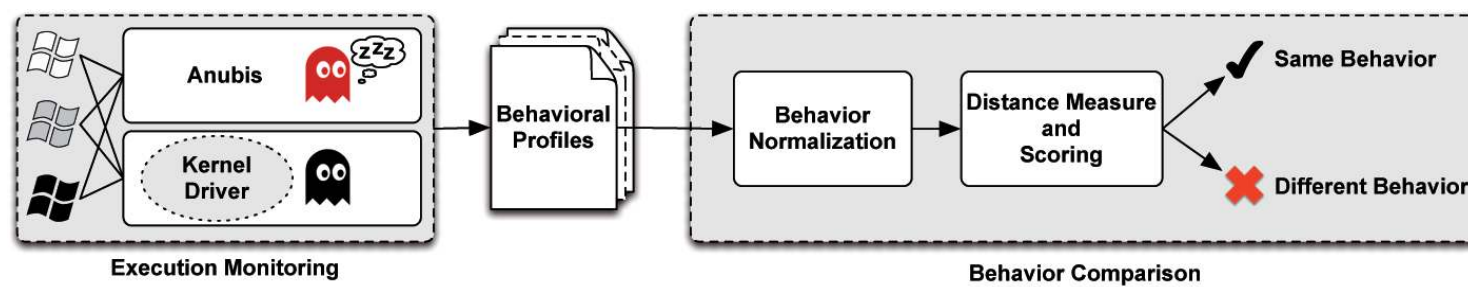


Figure 1: System Overview

Approach

- ▶ Build a verification system for Anubis to uncover evasion techniques

Execution Monitoring

- ▶ Windows kernel driver intercepts and logs system calls on a real host
- ▶ Logs are converted to behavioral profiles:
Malware behavior as a set of operations on operating system resources

```
file|C:\foo.exe|write:1
process|C:\Windows\foo.exe|create:0
network|tcp_conn_attempt_to_host|www.foobar.com
registry|HKLM\System\CurrentControlSet\Services|set_value('xy'):1
```

Behavior Comparison

- ▶ Comparison of behavior in Anubis and on real host with driver
- ▶ Different Windows installations → normalize behavior
 1. Remove noise
 2. Generalize username
 3. Generalize environment (hardware, language)
 4. Randomization detection
 5. Repetition detection (file infectors)
 6. Filesystem and registry generalization (ignore missing resources)
- ▶ 3 executions in each sandbox (Anubis and real host)
- ▶ Intra-sandbox distance = variations between executions
- ▶ Inter-sandbox distance = variations between sandboxes
- ▶ Inter-sandbox distance – Intra-sandbox distance = evasion score [0,1]
- ▶ If evasion score \geq threshold → different behavior; else same behavior
- ▶ Use findings to improve Anubis and prevent analysis evasion

Evaluation

Experiments with 4 different sandboxes

- Anubis, Driver with Anubis image, Driver with German image, Driver with other image (different user, .NET, ...)

Training Dataset

- ▶ 185 malware samples
- ▶ Used to optimize normalization and scoring
- ▶ Manual classification
- ▶ Reached 99.5% accuracy @ threshold 0.4

Test Dataset

- ▶ 1686 malware samples
- ▶ Used to verify our system
- ▶ 25.56% samples above threshold
- ▶ Spot tests to find reasons for evasion

- Several new Anubis evasion techniques detected
- Configuration flaws and missing software in Anubis (.NET, JRE, Microsoft Office, etc.)
- Driver vulnerable to bypassing, but we can fix it
- We can use these results to improve Anubis in order to observe a wider variety of malware behavior and thwart evasion!

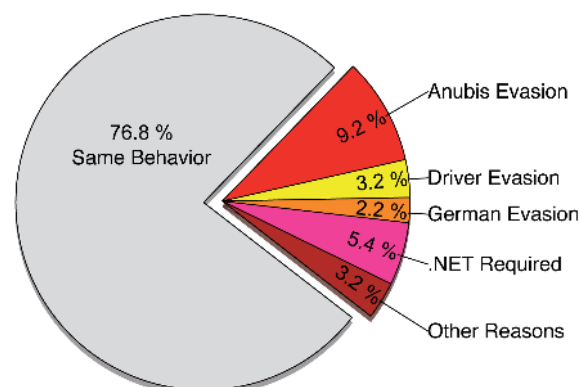


Figure 2: Manual classification of samples in the training dataset

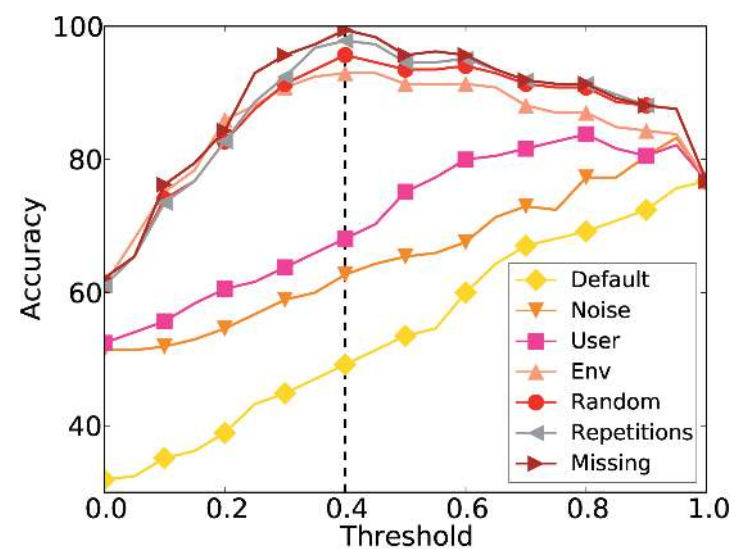


Figure 3: Efficiency of behavior normalization measured by result accuracy

Reference

M. Lindorfer, C. Kolbitsch, Paolo M. C.: "Detecting Environment-Sensitive Malware" in International Symposium on Recent Advances in Intrusion Detection (RAID 2011), 2011