Security bugs in embedded interpreters

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Security bugs in embedded interpreters

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Xi Wang  Nickolai Zeldovich  M. Frans Kaashoek

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Abstract

Because embedded interpreters offer flexibility and performance, they are becoming more prevalent, and can be found at nearly every level of the software stack. As one example, the Linux kernel defines languages to describe packet filtering rules and uses embedded interpreters to filter packets at run time. As another example, the RAR archive format allows embedding bytecode in compressed files to describe reversible transformations for decompression. This paper presents an analysis of common pitfalls in embedded interpreter implementations, which can lead to security vulnerabilities, and their impact. We hope that these results are useful both in augmenting existing embedded interpreters and in aiding developers in building new, more secure embedded interpreters.

1 Introduction

Many systems offer customization by allowing third parties to download executable extensions [9]. For flexibility and portability reasons, these systems often define an instruction set, in the form of bytecode, and implement an embedded interpreter to run downloaded bytecode. For performance reasons, they may translate bytecode into machine code before execution [8], using a just-in-time (JIT) compiler. One example is the Berkeley Packet Filter (BPF) [15]. An OS kernel accepts packet filters from user space, in the form of bytecode. The kernel implements an interpreter to execute the BPF bytecode against network packets and drop unwanted ones.

Embedded interpreters raise interesting security concerns. First, many real-world systems do not adopt sandboxing techniques such as process isolation [20] or software fault isolation [28] for embedded interpreters, possibly due to performance considerations. Consequently, a compromise of the interpreter is likely to lead to a compromise of the host system as well. Second, embedded interpreters often validate untrusted bytecode using ad-hoc rules, which is error-prone. Third, the bytecode (e.g., BPF filters) usually accepts input data (e.g., network packets), in which case both the bytecode and its input data may be untrusted, thereby exposing the host system to a wider range of attack vectors. An embedded interpreter must defend against both malicious bytecode and malicious input data; failing to do so can lead to a compromise.

This paper investigates the security implication of deploying embedded interpreters in systems. The first contribution is a case study of how systems use embedded interpreters in practice. As we will show in §2, they are surprisingly widespread. For example, the Linux kernel alone hosts multiple embedded interpreters, which are used for packet filtering [15], system call filtering [7], network monitoring [13], and power management [11]. The Clam AntiVirus (ClamAV) engine runs an interpreter to identify viruses with complex signatures [30], and also runs another interpreter for inspecting RAR files, which can contain bytecode for decompression [17]. Even a TrueType font file can contain bytecode for rendering; the infamous JailbreakMe exploit took advantage of a vulnerability in the TrueType interpreter via a crafted font file, leading to privilege escalation on iOS devices [24].

The second contribution of this paper is a case study of attack vectors for embedded interpreters. In the worst-case scenario, an adversary controls both the bytecode and the input data. To ensure safety, an embedded interpreter may have to regulate memory access, handle undefined operations (e.g., division by zero), and avoid resource exhaustion (e.g., infinite loops). As an example, failing to defend against malicious code and data in BPF can
lead to kernel vulnerabilities, the consequences of which include crashes, information leaks, and even arbitrary code execution. §3 illustrates such vulnerabilities and their attack vectors.

Building on the case study of embedded interpreters, §4 summarizes state-of-the-art defense techniques and provides security guidelines. §5 discusses research directions for improving the security of embedded interpreters. For example, testing embedded interpreters is challenging because one must consider corner cases in both the bytecode and the input to it. Finally, §6 concludes.

2 Embedded interpreters

Figure 1 summarizes embedded interpreters discussed in this paper. Each interpreter is designed to execute bytecode of a hypothetical machine that aims at solving problems in a specific domain, as detailed next.

Linux Socket Monitoring Interface (INET-DIAG). INET-DIAG is designed for socket monitoring. For example, consider the following ss command [13], which monitors sockets with source port in range [21, 1024):

ss 'sport >= :21 and sport < :1024'

The ss command generates the following bytecode and submits it to the kernel:

```
sge 21, L1, rej # if (sport >= 21) goto L1
   # else goto rej
L1: sge 1024, L2, acc # if (sport >= 1024) goto L2
   # else goto acc
L2: jmp rej
acc: nop # accept
rej: # reject
```

The INET-DIAG interpreter executes the bytecode in the kernel and returns a list of sockets for which the execution reaches “accept” (nop).

The INET-DIAG bytecode supports comparisons and forward jumps, but not backward jumps, to avoid loops. Therefore, the interpreter must check that every jump offset must be positive. Failing to reject bytecode that violates this invariant will lead to infinite loops (§3.1).

Berkeley Packet Filter (BPF). BPF is used in many Unix-like OS kernels to filter link-layer packets [15]. Recently, the Linux kernel added support for system call filtering via BPF [7]. BPF uses a register-based virtual machine, which consists of two registers and a small scratch memory. The BPF interpreter executes bytecode to check input data, and returns a boolean result. The Linux kernel also includes a JIT compiler for BPF [4]. BPF supports integer arithmetic, logical operations, branches, and forward jumps. One example of a malicious operation that BPF should prevent is division by zero; failing to prevent it leads to a crash (§3.2). Since the BPF interpreter supports a memory region, failing to zero the memory before use will leak information of the host system (§3.3).

ACPI Machine Language (AML). AML [11] defines ACPI control methods, which instruct the OS kernel how to respond to certain power management events. Because AML bytecode is usually loaded from the firmware, it is considered trusted and allowed to do anything, including accessing arbitrary memory, performing device I/O, and invoking any functions in the kernel. The Linux kernel, however, allows user-space applications to override some control methods. If the permission checks in this override mechanism are insufficient, an adversary can inject and execute arbitrary code in the kernel (§3.4).

Bitcoin. Bitcoin uses an interpreter to define transactions over its network [1]. The Bitcoin interpreter is a stack machine. The input, such as public keys, are embedded in its bytecode as constants. The interpreter returns whether a transaction is valid or not. Besides conditional branches, arithmetic, and logical operations, the interpreter also supports many string and cryptographic operations to validate a transaction.

ClamAV. The ClamAV antivirus engine uses LLVM-based bytecode as signatures for polymorphic malware [30]. LLVM is a register machine that supports arithmetic and logical operations, branches, jumps, and function calls. ClamAV’s interpreter and JIT engine sandbox the bytecode so that all pointers are bounds-checked, loops have timeouts, and external function invocations are disallowed.

TrueType and Type 2 Charstring. TrueType defines a hinting language for rendering fonts [27]. The bytecode manipulates control points in the font outline. The TrueType VM is a stack machine that supports arithmetic and logical operations, branches, loops, and function calls. It also has opcodes to move, align, and interpolate points in various ways. The Type 2 Charstring VM defined in Adobe Type 2 Font [12] is similar to TrueType, except that it does not allow jumps and loops.

Universal Decompressor Virtual Machine (UDVM). UDVM [19] is used by Wireshark, a packet analyzer, to decompress certain stream protocols. UDVM provides 64 KB of memory and a call stack. It supports arithmetic, logical, and some string operations. These instructions can reference memory directly. UDVM also supports branches and loops. UDVM imposes cycle limits on bytecode based on the length of the input data.
Figure 1: Summary of embedded interpreters and their features. Here “arith.” means arithmetic operations; “br.” means conditional branches and forward-only jumps; “func.” means user-defined functions; “ext.” means external function calls; “JIT” indicates whether there is a known JIT implementation.

### RarVM.
RAR files can contain RarVM bytecode that performs some reversible transformation on input data to increase redundancy [17]. RarVM is an x86-like register machine. It provides 8 registers and 64 KB of memory with a stack at the top. It supports arithmetic and logical operations, branches, loops, and function calls. RarVM sandboxes its bytecode in a way similar to ClamAV, but allows some external function calls.

### Pickle.
The Python standard library provides the Pickle [18] module for serializing and deserializing Python objects. The Pickle protocol defines a stack interpreter, and executes bytecode to deserialize Python objects. Pickle’s input data is embedded in its bytecode program. The Pickle interpreter provides opcodes to manipulate Python objects such as dictionary and list, as well as opcodes to load and invoke external Python libraries. Therefore, inappropriate use of the Pickle library often leads to privilege escalation attacks, or arbitrary code execution in remote machines, as described in Figure 2.

### 3 Vulnerabilities in embedded interpreters
An embedded interpreter that receives bytecode from an untrusted source must validate it before execution. In addition, if input data to the bytecode is also untrusted, the interpreter must execute the bytecode defensively. This section illustrates common vulnerabilities found in embedded interpreters that fail to do so. Figure 2 summarizes the vulnerabilities studied in this section.

#### 3.1 Resource exhaustion
When an embedded interpreter runs bytecode, it should be able to control resource consumption. If the bytecode supports jumps [11, 17, 30], it is possible to construct backward jumps that lead to infinite loops; the interpreter should constrain such jumps. Similarly, if the bytecode supports subroutines, the interpreter should guard against infinite recursion that will lead to stack overflows.

Figure 3 shows a vulnerable code snippet, from the INET-DIAG interpreter in the Linux kernel, as well as the corresponding patch. The interpreter increases the instruction pointer by `inet_diag_bc_op->yes` when the current instruction evaluates to true. To forbid backward jumps, the code defines “yes” as an unsigned integer; but it forgets to validate that `yes` is non-zero, leaving the interpreter vulnerable to infinite loops.

A general way to constrain infinite loops or infinite recursion is to limit the number of executed instructions and the depth of nested function calls. Every time an instruction is executed or the depth of call stack is increased, the counter is incremented. The interpreter aborts the execution when the counter reaches a limit. In complex interpreters, however, resource consumption can happen in many places in the code. Implementing ad-hoc watchdog counters becomes non-trivial and error-prone, as we can find in CVE-2010-2286 and CVE-2011-3627. Without careful plans for restricting resources, it is hard to avoid DoS in embedded interpreters.

#### 3.2 Arithmetic errors
Embedded interpreters that provide arithmetic instructions are prone to arithmetic errors. These errors may come from unexpected arithmetic behaviors of the target machine. For example, when handling a signed division instruction, an interpreter should check that the divisor is non-zero, and that the quotient does not overflow (i.e., not `INT_MIN / -1`); otherwise, the division might trigger a machine exception and potentially result in program termination.

Checking for overflow conditions can be tricky and error-prone [29]. Figure 4 shows the ClamAV interpreter...
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Figure 2: Examples of vulnerabilities of embedded interpreters.

```c
struct inet_diag_bc_op {
    unsigned char code; // opcode
    unsigned char yes; // instruction length
    unsigned short no; // conditional jump offset
};
const void *bc = bytecode;
while (len > 0) {
    struct inet_diag_bc_op *op = bc;
    ...
    if (op->yes < min_len // min_len is at least 4
        || op->yes > len + 4 || op->yes & 3)
        return EINVAL;
    bc += op->yes;
    len -= op->yes;
}
```

Figure 3: The patch that fixes CVE-2011-2213. The vulnerability was missing validation of INET-DIAG instructions in the Linux kernel, which results in an infinite loop if op->yes is zero.

```
case OP_SDIV:
{
    int64_t a = BINOPS(0); // dividend
    int64_t b = BINOPS(1); // divisor
    if (b == 0 || (a == -1 && b == INT64_MIN))
        return CL_EBYTECODE;
    value->v = a / b;
    break;
}
```

Figure 4: Incorrect handling of the signed division opcode in ClamAV’s interpreter. The correct check to avoid signed division overflow should swap a and b (i.e., a == INT64_MIN && b == -1).

3.3 Information leak

When an embedded interpreter exposes unintended information to the bytecode in its input or in its execution environment, malicious users can extract this information by crafting bytecode and observing the result of its execution. This type of vulnerability often happens when an embedded interpreter simulates register files, scratch memory, or uses a stack for executing the bytecode. If these buffers were not properly initialized, malicious bytecode could output uninitialized values and obtain sensitive information about the host system.

Figure 5 shows code from the BPF interpreter in the OpenBSD kernel, which did not zero out the mem array on the kernel stack. A malicious filter might return the value of an unused memory slot as the number of accepted bytes, potentially exposing kernel randomness to userspace, and thereby breaking security mechanisms that depend on randomness, such as Address Space Layout Randomization (ASLR) [23]. A similar vulnerability (CVE-2012-3729) was discovered in the Linux kernel.

3.4 Arbitrary code execution

Enabling external calls breaks the isolation between the interpreter and the host system, and can lead to arbitrary code execution in the host system if not carefully designed. Unless both the bytecode and the input come from trusted
3.5 Memory corruption

Many embedded interpreters are written in an unsafe language, and programming errors can lead to memory corruption errors. Examples include mishandling of the execution stack (Figure 6), omitting bounds checks when executing string operations, etc. We do not dive further into these problems since they are the result of implementation errors, as opposed to design issues specific to embedded interpreters.

3.6 JIT spraying

In order to speed up execution, some embedded interpreters [15, 30] use a JIT engine to compile their bytecode into native instructions. JITted bytecode introduces a new attack vector called JIT spraying [2, 21], in which attackers encode shell code as constants in benign-looking bytecode. These constants can be strung together to form code gadgets that facilitate return-oriented programming [22].

For example, when specially constructed BPF bytecode is compiled and loaded into the kernel, attackers can trigger another memory corruption vulnerability, and jump into the middle of the JIT-compiled code, where the attacker-controlled constants are interpreted as native machine instructions.

JIT spraying works for two reasons. First, JITted bytecode usually resides in pages which are concurrently writable and executable. This can effectively disable existing protection techniques, such as DEP (Data Execution Prevention) and SMEP (Supervisor Mode Execution Protection) [14]. Second, JIT engines transform bytecode from untrusted sources in a rather predictable way. Attackers can force the JIT engine to generate many copies of the same gadget throughout the memory, diminishing the protection provided by ASLR [23].

4 Security guidelines

§3 shows that it is non-trivial to design and implement a secure embedded interpreter. In this section, we suggest some guidelines for improving the security of embedded interpreters.

Process isolation. When performance is not a critical factor, one can consider securing an embedded interpreter via process isolation. For example, web browsers such as Chrome [20] isolate the execution of JavaScript for different web pages in separate OS processes. As another example, RarVM bytecode can execute in a dedicated process because the overhead of creating a process is amortized over the cost of decompressing a RAR file.

This approach has several limitations. First, it incurs performance overhead due to inter-process communication (IPC), which makes it less appropriate for performance-critical applications such as packet filtering. Second, it cannot prevent semantic bugs, where a compromised interpreter can produce wrong results (e.g., incorrect files decompressed from RarVM). Third, process isolation is difficult to apply inside OS kernels.

Limiting resource consumption. If an embedded interpreter runs within the context of the host system, it is critical to ensure that the execution of bytecode does not exhaust the host system’s resources. In particular, in
order to provide jumps or subroutines, interpreters should have a plan for monitoring and constraining the processor time and memory that bytecode utilizes. Whenever the bytecode violates the resource utilization policy, the interpreter should be able to detect and reclaim allocated resources, thereby avoiding DoS attacks on the host system. As illustrated by INET-DIAG and BPF, allowing only forward jumps, or limiting the number of executed instructions or execution time is necessary to constrain the resource usage of embedded interpreters.

**Limiting feature sets.** One interesting observation is that the more expressive a bytecode design is, the more invariants an interpreter implementation must maintain, which consequently enables a wider range of possible attack vectors. A developer designing an embedded interpreter should consider the trade-off between flexibility and security in their design. For instance, Bitcoin chose to disable certain instructions [1] to reduce attack vectors after several arithmetic errors were discovered in its implementation (see §3.2). In this vein, INET-DIAG, which does not support arithmetic operations by design, is more immune to arithmetic errors such as division by zero. If the embedded interpreter needs to provide a Turing-complete instruction set, extra care should be taken in its implementation.

**Limiting calls to host.** When a bytecode program needs to interact with or to process external input given by the host machine, interpreters should define a clean interface between them. For example, in designing a new Pickle protocol, one could define a set of safe Python libraries that Pickle programs can invoke. Unlike Pickle, BPF bytecode has a clean input and output interface to a host machine; it takes a packet as the input, and outputs a bit indicating whether the input packet is filtered or not.

5 Research problems

**Testing embedded interpreters.** Symbolic testing tools such as KLEE [3] and SAGE [10] explore code paths and construct input data to trigger bugs. To make those tools effective in testing bytecode interpreters with high coverage, one needs to consider how to construct not only untrusted input data, but also untrusted bytecode, as control flow decisions in interpreters are highly dependent on the bytecode, and symbolically exploring all the paths can easily lead to path explosion.

For example, a naïve approach is to generate a random bytecode program for testing. However, this bytecode program is likely to be malformed and simply rejected by the interpreter, and thus is ineffective for exploring code paths of the interpreter’s implementation. An alternative approach is to develop a specific generator tailored for each interpreter. How to effectively derive bytecode instances that have both high coverage and little path duplication remains an open problem.

Moreover, the prevalence of JIT compilation poses another intriguing research problem: how to systematically test the correctness of JITted bytecode? The traditional symbolic testing paradigm does not fit JIT schemes well because the generated native code, which itself is the output of the symbolic bytecode, also needs to be symbolically executed. Scheduling heuristics are necessary to explore “interesting” bytecode programs first, instead of naively checking all possible bytecode programs. Furthermore, to symbolically execute JITted bytecode, one needs to model the symbolic engine at the native machine instruction level. An alternative may be to transform the machine code back to some intermediate representation, and then prove its equivalence to the original bytecode.

**Build extensible interpreters.** Since it is error-prone to build an interpreter from scratch, one strategy is to reuse sound bytecode formats and construct an extensible interpreter, which consists of reusable components, similar to the Xoc extensible compiler [5]. Developers can build and customize an interpreter by choosing a set of components, such as whether the interpreter supports integer arithmetic, or whether it allows loops. For example, Seccomp [7], a security mechanism for isolating processes, reuses the existing BPF interpreter to run BPF bytecode for specifying system call filtering rules, instead of implementing an interpreter from scratch. One research question is whether a single extensible interpreter can address sometimes-conflicting requirements of different use cases, such as minimal runtime complexity, high throughput, low latency for short bytecode, performance isolation, and support for general-purpose C-like programs.

6 Conclusion

In this paper, we analyzed security bugs found in embedded interpreters, classified their effects, and suggested ways to reduce common vulnerabilities. We hope our results can shed some light on how to design secure embedded interpreters in the future.

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