# **Enclosures:** language-based restriction of untrusted libraries Extended Abstract

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### 1. Motivation

Programming has changed; programming languages have not. Modern software development has embraced abstraction and reusable software components. Programs build on open-source libraries (aka packages) that offer diverse, tested functionality and increase programmer productivity. In the limit, an application becomes a collection of packages orchestrated by application-specific code. Modern languages have evolved extensive public libraries and tools to publish, find, download, use, and update public packages, for example, Python modules [3], Golang packages [16], Ruby gems [4], and Rust crates [5].

Although languages support the use of packages, few, if any, provide a strong mechanism to deal with their inherent insecurity and fragility. Packages come with challenges: (1) they have no formal specification of what they do (or do not do); (2) their developer is typically unknown, thus untrusted; (3) they lack traceable dependency management – a package can import unknown, untrusted dependencies; and (4) most important, programs run in a single trust domain that does not segregate code or data from different packages. In general, a developer's trust in a public package often seems to be based on its popularity or a shallow code review. Careful inspection is both impractical, since importing a single package may incorporate hundreds or thousands of transitively dependent packages [29, 30], or infeasible, as a package's code may change frequently. As a result, an application becomes a patchwork of code from untrusted and unverified sources.

Malevolent individuals have been quick to exploit the opportunity to insert malicious code in a popular package [9, 10, 14, 44], via IDEs [35], or to substitute modified clones [11–13,25]. These attacks are easy to implement and provide unimpeded access to hundreds, if not thousands, of applications, as they use conventional programming constructs to insert code that steals private information or opens backdoors. Examples include malicious Python packages that stole SSH and GPG keys [10,13] from the local file system. More generally, even legitimate third-party libraries may implement undocumented functionality that operates outside of its advertised scope. For example, the Facebook iOS SDK, intended to identify users, shared device information with Facebook without user consent [43].

#### 2. Limitations of the State of the Art

Although software isolation is a very long-studied topic in the systems, programming languages, and security communities [7, 8, 15, 17, 18, 20, 22, 22–24, 26, 28, 31, 32, 34, 37, 39, 40], previous approaches do not offer a clear solution for package isolation and security: (1) pure systems approaches introduce new low-level abstractions that may not match programming language requirements [7, 15, 22, 26, 31, 32, 40] or may require application refactoring [8, 23, 24]; (2) pure language approaches, e.g., Rust or Javascript isolates, are limited to a single language and thus only apply to code written in this language; (3) mixed approaches, e.g., Erim [37], Hodor [17], and Glamdring [20], do not take into account deep dependencies in the transitive dependency graph and the consequent need for complex access rights. These mixed systems offer the same isolation guarantees across a program, which requires a developer to manually modify import dependencies to achieve their desired isolation granularity, a process that can be cumbersome or infeasible.

# 3. Key Insights

Packages, while the source of security and fragility problems, have characteristics that make a solution possible. They consist of code and data usually written to be able to run as part of any program, which means they must have clearly defined entry points, no dependencies on the program's environment, and must bring along their dependencies. Languages lack a mechanism for taking a package and executing it and its dependencies in a restricted environment where the package cannot access the state of the entire program or the system on which it is executing.

We propose a new programming language construct that provides a developer with fine-grain control over the resources that a package can access, even in modern software with complex dependency graphs. The abstraction underlying this construct is language-independent, so it can be incorporated into most languages. Its implementation in these languages needs support from a hardware isolation mechanism that is not tied to a single language implementation since programs are typically constructed from components written in several languages. Fortunately, architectural features provide trustworthy, finegrain, hardware-based mechanisms that can enforce access control within a virtual address space [1, 6, 19, 36, 41]. These

features are low level and difficult to use, so they have not been widely accepted. Moreover, without agreement on how to use them, they prevent language inter-operability.

This paper introduces *enclosure*, a programing construct that binds a memory view and system calls allowed to a closure, restricting its access to a program's resources according to user-defined policies. The memory view defines the code and data accessible by the closure, and is automatically derived from the closure's package dependencies. User-defined policies can restrict the closure's memory view or extend it, by selectively enabling read, write, or execute access rights on packages. They can also selectively authorize system calls.

Enclosure policies are enforced at run time by LITTERBOX, a language-independent framework that uses hardware mechanisms to provide strong uniform isolation guarantees, even for packages written in unsafe languages. LITTERBOX exposes a high-level API that abstracts the language-specific program resources and is thus reusable across programming languages. LITTERBOX can utilize different hardware technologies for isolation and hides the intricacies of hardware.

#### 4. Main Artifacts

Enclosures consist of two separate parts: (1) frontend language-specific support, implemented by a language's compiler and runtime, and (2) the backend responsible for using hardware to enforce the closure's memory view and filter system calls (see Figure 3).

Language support for *enclosures* requires programming language's syntax, compiler, and runtime extensions. The syntax is extended to declare *enclosures* and specify user-defined policies. The compiler identifies the closure's package dependencies and relies on the linker to segregate their code and data on separate memory pages. The runtime manages dynamically allocated objects on a per-package basis on separate memory segments, called arenas. Creation, modification, and transitions to *enclosures* restrictive execution environments are managed by calling the backend that enforces isolation based on hardware mechanisms.

We implemented a full-fledged *enclosure* extension for Go, and a prototype one for Python, both based on the LITTERBOX backend.

The LITTERBOX backend exposes a language-independent small API to manage *enclosures*, hides low-level intricacies and supports different hardware isolation mechanisms (Intel VT-x and Intel MPK).

We evaluate our Go *enclosure* extension based on LITTER-BOX. The evaluation uses popular Github Go packages and proposes to benchmark the performance of small applications, derived from each package's "hello world" sample code, to determine the worst-case performance overheads of LITTER-BOX. In these applications, *enclosures* are used, in vastly different ways, to safely leverage the *unmodified* public pack-

age. In one example, we isolate FastHTTP [38], a popular library with 370K lines of code from over 100 contributors so that it cannot access the memory outside of the *enclosure*, and can only perform network system calls. In another example, we isolate an untrusted, user-specific webserver handler from the main HTTP stack. We also leverage *enclosures* to safely expose senstive data to the popular Bild [33] image processing library, while preventing modifications or leakage (*e.g.*, via system calls).

To understand our performance results, we perform a combination of microbenchmarks that exercise the low-level hardware mechanisms (changes in protection keys for MPK, transitions with VT-x), combined with the performance evaluation of our macrobenchmarks. The results show that VT-x has lower overheads for memory-bound workloads than MPK. System call interposition with VT-x is comparable in cost to the use of a protected container layer such as Dune [7] or gVisor/Sentry [42], but more expensive than the eBPF patched [27] seccomp [2, 21] approach taken by our MPK implementation.

# 5. Key Results and Contributions

This paper makes the following contributions:

- The enclosure programming construct, a simple way to safely execute closures leveraging untrusted packages with deep dependency graphs according to fine-grained userdefined policies.
- LITTERBOX, a language-independent framework that enforces *enclosure*-defined policies with strong hardware isolation mechanisms. LITTERBOX currently supports either Intel VT-x (and its general-purpose extended page tables) or the emerging, specialized Intel Memory Protection Keys (MPK).
- The implementation of *enclosures* based on LITTERBOX for the Go language, demonstrating low overheads for realworld applications, and for Python, exhibiting support for highly dynamic languages.

## 6. Why ASPLOS

This paper spans all three aspects of ASPLOS. We address a significant deficiency of programming languages with a language-agnostic system that uses processor mechanisms to extend the operating system address space model with isolation, which can be used to protect against threats from software packages.

## 7. Citation for Most Influential Paper Award

This paper describes the original proposal to use enclosures (which we now understand as closures with restricted memory and system privileges) as a way to express trust in software components used to assemble applications.

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