Writing R Extensions in Rust

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1 Introduction

Novel methods in data science and statistics with supporting software often have a broader impact than methods introduced without software. Supporting software is typically written in a high-level language, with performance-critical parts calling libraries written in C, C++, FORTRAN, etc. We recommend Rust for performance-critical components of a Python or R package, and we specifically address developing Rust-based R packages in this paper. Rust "empowers everyone to build reliable and efficient software" as performant as C/C++. (See The Computer Language Benchmarks Game.) Rust has been rated the "most loved programming language" in the Stack Overflow Annual Developer Survey every year since 2016.

This paper complements *Writing R Extensions*, the official guide for writing R packages, for those who are familiar with Rust and want to write a Rust-based R package. An R package named cargo is on CRAN to aid development. It provides complete bindings for all of R's API, but idiomatic Rust functions are also available and often avoid the need to directly call R's API. Examples on R packages on CRAN developed using the cargo package include salso, caviarpd, and fangs.

The rextendr package provides another approach to develop Rust-based R packages. It aims to provide extensive automatic conversion between R types (e.g., vectors, lists, data.frames, etc.) and Rust types, including handling thorny issues such as R's missing value NA and R's fluidity in the storage mode of vectors. The advantages of the cargo package's approach include its transparency, low overhead, extensibility, and CRAN policy compliance.

We assume the toolchain for building R packages is installed. Use RTools on Windows and follow these instructions on MacOS. Also, install the cargo package from CRAN using install.packages("cargo") and install the Rust toolchain as show in file.show(system.file("template/INSTALL", package="cargo")) or use cargo::install().

2 Methods

2.1 Getting started

Start a new Rust-based R package using, for example, cargo::new_package("/path/to/package/foo") to generate the foo package. Or, in RStudio, select "File → New Project... → New Directory → Rust-based R Package (using cargo package)". The resulting package is a complete R package with the typical directory structure, plus a few Rust-specific items. The binary package does not depend on Rust.

2.2 Calling a Rust function

Note that there are several uses of .Call() among the scripts in the R directory. The function in R/myrnorm.R, for example, has .Call(.myrnorm, n, mean, sd) which executes the Rust function myrnorm defined in src/rust/src/lib.rs:

```
mod registration;
    use roxido::*:
     #[roxido]
     fn myrnorm(n: Rval, mean: Rval, sd: Rval) -> Rval {
       unsafe {
         use rbindings::*;
         use std::convert::TryFrom;
         let (mean, sd) = (Rf_asReal(mean.0), Rf_asReal(sd.0));
         let length = isize::try_from(Rf_asInteger(n.0)).unwrap();
10
         let vec = Rf_protect(Rf_allocVector(REALSXP, length));
11
         let slice = Rval(vec).slice_mut_double().unwrap();
12
         GetRNGstate():
13
         for x in slice { *x = Rf_rnorm(mean, sd); }
14
         PutRNGstate();
15
        Rf unprotect(1):
16
17
         Rval(vec)
18
19
```

All Rust functions with the #[roxido] attribute take arguments of type Rval and return a value of type Rval. Among other things, the #[roxido] attribute wraps the body of the function in a call to Rust's std::panic::catch_unwind since unwinding from Rust code into foreign code is undefined behavior and will likely crash R. When a panic is caught, it is turned into an R error, showing the corresponding message in the R console and giving the line number. The package developer is encouraged to study the definition of the #[roxido] attribute in src/rust/roxido_macro/src/lib.rs.

2.3 Low-level interface to R's API

The myrnorm function above illustrates how to directly use R's API in Rust. Note that the statement use rbindings::* provides direct access to R's API through Rust bindings. These are automatically generated by the bindgen utility from R header files. The documentation for the Rust bindings can be browsed by running cargo::api_documentation() when the current working directory is the package root. Note that most of the functions in the rbindings module require an SEXP value, i.e., a pointer to R's internal SEXPREC structure. When calling R API functions, the SEXP must be extracted from an Rval value, e.g., mean. 0 as in line 9. Conversely, when returning from a function marked with #[roxido] attribute, wrap the SEXP value x in Rval(x), as in line 17.

When calling an R API function, care should be taken so that the R function does not throw an error. Otherwise, a long

jump occurs over Rust stack frames, preventing Rust from doing its usual freeing of heap allocations and leaking memory. Care must also be taken when calling R API functions that might catch a user interrupt because an interrupt also produces a long jump. One R API function that catches interrupts, for example, is the Rprintf function for printing to R's console.

2.4 High-level interface wrapping R's API

To avoid the pitfalls of directly accessing R API functions and to provide a more idiomatic Rust experience, the cargo package also provides a high-level interface defined in the r module. The high-level interface is not a comprehensive wrapper over R's API, but it covers common use cases and the developer can easily expand it by adding to src/rust/roxido/src/r.rs in the package. The high-level interface provides the check_user_interrupt function. The rprintln! macro is analogous to Rust's standard println! macro, but prints to the R console and returns true if interrupted. Much of the interface is provided by associated functions for the Rval structure. For details, see the documentation using cargo::api_documentation().

The package generated by the cargo::new_package function provides examples of the high-level interface. Consider the convolve2 function from Section 5.10.1 "Calling .Call" of Writing R Extensions. A Rust translation based on the cargo package is in src/rust/src/ lib.rs and shown here:

```
#[roxido]
     fn convolve2(a: Rval. b: Rval) -> Rval {
        let (a, xa) = a.coerce_double(pc).unwrap();
         let (b, xb) = b.coerce_double(pc).unwrap();
         let (ab. xab) =
             Rval::new_vector_double(a.len() + b.len() - 1, pc);
         for xabi in xab.iter_mut() { *xabi = 0.0 }
         for (i, xai) in xa.iter().enumerate() {
9
             for (j, xbj) in xb.iter().enumerate() {
10
                 xab[i + j] += xai * xbj;
11
12
         3
13
         ab
    }
```

Notice on lines 3 and 4 the calls to Rval's coerce_double method. The method returns either a tuple giving a (potentially new) Rval and an f64 slice into it, or an error. A slice into R's memory for vectors of doubles, integers, and logicals can be obtained without a potential memory allocation using x.slice_*() or x.slice_mut_*(x), where x is an Rval.

Notice the argument to the coerce_double method on lines 3 and 4 is pc. The wrapper code provided by the #[roxido] attribute includes let pc = &mut Pc::new(). Many of the functions take a shared mutable reference to a Pc structure. The purpose of Pc is to handle the bookkeeping associated with Rf_protect and Rf_unprotect calls related to R's garbage collection. When an instance of the Pc structure goes out of scope, the Rust compiler automatically inserts a call to its associated drop function which executes Rf_unprotect using its interval protect counter. Not only does the developer not need to manually track the number of protected items, the developer does not need to worry about when a value should be protected. If the method requires a shared mutable reference to a Pc, then protection is needed and automatically handled.

2.5 Embedding Rust code in an R script

Beyond package development, the cargo package also supports defining functions by embedding Rust code directly in an R script. This facilities quick experimentation and testing. See the documentation for the cargo::rust_fn function.

2.6 Workflow

The DESCRIPTION file has SystemRequirements: Cargo (>= 1.XX)..., where 1.XX is a version number, and this should be updated when your code use features from a more recent version of Rust. (One can use cargo-msrv to find the minimum supported Rust version.) As CRAN machines may only occasionally update their Rust installation, one should be somewhat conservative in adopting new Rust features.

The configure script compiles the Rust code in src/rust to a static library using the run function from the tools/cargo_run.R script. For the sake of CRAN policy compliance, notice that the run function is configured to use a temporary directory, only use two cores, and run in offline mode. The static library is folded into the package's shared library through the src/Makevars file.

The cargo::prebuild function provides tools package maintenance. When Rust dependencies updated in the src/rust/Cargo toml file, set directory to the package root and cargo::prebuild(c("authors", "vendor")). This updates src/rust/vendor.tar.xz and, to help in manually updating the Authors@R field of the DESCRIPTION file, creates the file authors-scratch.txt. When roxygen2 documentation is updated in a package's R script, run cargo::prebuild("document"). When wanting to make a new Rust function accessible from R (or when updating the number of arguments to a Rust function), add the appropriate .Call to the package's R code and run cargo::prebuild("register_calls").

3 Discussion

We end with a discussion of a few miscellaneous points to keep in mind when developing. Care should be taken when dealing with R's special values. For example, R's NA integer value corresponds to Rust's i32::MIN. So, NA_integer_ * OL in R equals NA_integer_ but equals O in Rust. Associated functions, such as Rval::is_na_integer, are provided to test against R's special values. See Section 5.10.3 "Missing and special values" of Writing R Extensions for a discussion.

Rust supports "fearless concurrency," making it safe and easy for Rust-based R packages to harness the power of multiple CPU cores. R's internals are fundamentally designed for single-threaded access, however, so any callbacks into R should come from the same thread from which R originally called the Rust code.

R users expect reproducible results when using R's set.seed function. Options are: (i) produce random numbers using R's API (as in the previous myrnorm example) or (ii) seed a Rust random number generator from R's random number generator using the provided random_bytes function. For example, to seed Pcg64Mcg from the rand_pcg Rust crate, use Pcg64Mcg::from_seed(r::random_bytes::<16>()).