



OPTIMIZING R CODE WITH RCPP

Welcome to the course

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R vs C++

R

- Great, flexible
- Slow
- Interpreted

C++

- Compiled
- More difficult
- Fast



Motivation

- Use Rcpp to make your code faster
- No need to know all of C++
- Focus on writing simple C++ functions



Course structure

- Introduction - basic C++ syntax
- C++ functions and control flow
- Vector classes
- Case studies

Measure performance

□ loopy version of `max`

```
slowmax <- function(x) {  
  res <- x[1]  
  for ( i in 2:length(x) ) {  
    if( x[i] > res ) res <- x[i]  
  }  
  res  
}
```

Comparing performance with the `microbenchmark` □

```
library(microbenchmark)  
  
x <- rnorm(1e6)  
microbenchmark( slowmax(x), max(x) )  
Unit: milliseconds  
      expr      min       lq      mean     median        uq      max     neval  
slowmax(x) 31.649452 34.29454 36.344912 35.435299 37.188249 90.363038    100  
      max(x)  1.563559  1.74036  1.939367  1.847045  2.014684  3.340052    100
```



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Evaluating simple C++ expressions with evalCpp

```
library(Rcpp)

evalCpp( "40 + 2" )
42

evalCpp( "exp(1.0)" )
2.718282

evalCpp( "sqrt(4.0)" )
2
```

Using `std::numeric_limits<int>::max()` to get the biggest representable

32 bit signed integer, aka `int`

```
evalCpp( "std::numeric_limits<int>::max()" )
2147483647

2^31-1
2147483647
```



Basic number types

C++ has rich set of number types

- Integer numbers: `int`
- Floating point numbers: `double`

Basic number types

R

Literal numbers are `double`

```
x <- 42

storage.mode(x)
"double"
```

Integers need the `L` suffix

```
y <- 42L
storage.mode(y)
"integer"

z <- as.integer(42)
storage.mode(z)
"integer"
```

C++

Suffixing with `.0` forces a `double`

```
y <- evalCpp( "42.0" )

storage.mode(y)
"double"
```

Literal integers are `int`

```
library(Rcpp)

# Literal integers are `int`
x <- evalCpp( "42" )

storage.mode(x)
"integer"
```



Casting

Explicit casting with `(double)`

```
# Explicit cast
y <- evalCpp( "(double) (40 + 2)" )

storage.mode(y)
"double"
```

Beware of the integer division

```
# Integer division
evalCpp( "13 / 4" )
3

# Explicit cast, and hence use of double division
evalCpp( "(double)13 / 4" )
3.25
```

```
# Automatic conversion in R
13L / 4L
3.25
```



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Let's practice!



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Inline functions with `cppFunction`

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Limits of evalCpp

```
evalCpp("40 + 2")  
42
```

```
evalCpp("PI")  
3.141593
```

```
evalCpp("exp(1)")  
2.718282
```



cppFunction

Define a C++ function with `cppFunction()`

```
library(Rcpp)

cppFunction("int fun() {
  int x = 37 ;
  return x ;
}")
```

Call that function from R

```
fun()

37
```

Internal things Rcpp does on your behalf

```
cppFunction("int fun(){  
  int x = 37 ;  
  return x ;  
}", verbose = TRUE )
```

Generated code for function definition:

```
-----  
  
#include <Rcpp.h>  
  
using namespace Rcpp;  
  
// [[Rcpp::export]]  
int fun(){  
  int x = 37 ;  
  return x ;  
}
```

Generated extern "C" functions

```
-----  
  
#include <Rcpp.h>  
// fun  
int fun();  
RcppExport SEXP sourceCpp_1_fun() {  
  BEGIN_RCPP  
    Rcpp::RObject rcpp_result_gen;  
    Rcpp::RNGScope rcpp_rngScope_gen;  
    rcpp_result_gen = Rcpp::wrap(fun());  
    return rcpp_result_gen;  
  END_RCPP  
}
```

Internal things Rcpp does on your behalf

Generated R functions

```
`.sourceCpp_1_DLLInfo` <- dyn.load('/private/var/folders/r_/1b2gjtsd7j92jbbpz4t7ps340000gn/T/Rtmp:
-x86_64-apple-darwin15.6.0-0.12.16/sourcecpp_4bb22c766031/sourceCpp_2.so')
```

```
fun <- Rcpp::sourceCppFunction(function() {}, FALSE, `sourceCpp 1 DLLInfo`, 'sourceCpp 1 fun')
```

```
rm(`.sourceCpp 1 DLLInfo`)
```

Building shared library

```
DIR: /private/var/folders/r_/1b2gjtsd7j92jbbpz4t7ps340000gn/T/Rtmp18dL6H/sourceCpp-x86_64-apple-darwin16/sourcecpp 4bb22c766031
```

```
/Library/Frameworks/R.framework/Resources/bin/R CMD SHLIB -o 'sourceCpp_2.so' 'file4bb247d077c.cpp'
clang++ -I/Library/Frameworks/R.framework/Resources/include -DNDEBUG -I"/Library/Frameworks/R.framework/Resources/3.4/Resources/library/Rcpp/include" -I"/private/var/folders/r_/1b2gjtsd7j92jbbpz4t7ps340000gn/000000gn/T/Rtmp000000/sourceCpp-x86_64-apple-darwin15.6.0-0.12.16" -I/usr/local/include -fPIC -Wno-unused-result -Wno-unused-parameter -Wno-namespace -O3 -c file4bb247d077c.cpp -o file4bb247d077c.o
clang++ -dynamiclib -Wl,-headerpad_max_install_names -undefined dynamic_lookup -single_module -multiply_defined suppress -L/Library/Frameworks/R.framework/Resources/lib -L/usr/local/lib -o sourceCpp_2.so file4bb247d077c.o -F/Library/Frameworks/R.framework/.. -framework R -Wl,-framework -Wl,CoreFoundation
```




cppFunction

Define a C++ function with `cppFunction()`

```
library(Rcpp)

cppFunction("int fun() {
  int x = 37 ;
  return x ;
}")
```

Call that function from R.

```
fun()

37
```



Dynamic vs Static

R is **dynamically** typed

```
x <- "hello"

x
"hello"

typeof(x)
"character"

x <- 42L

x
42

typeof(x)
"integer"
```

C++ is **statically** typed.

```
// Define x as a double

double x = 42.0 ;

// Cannot redefine it as an int
// ----> that would not compile

int x = 14 ;
```



Type declaration of function arguments and return value

```
types of arguments x and y: double
      |           |
      v           v
```

```
double add( double x, double y ){

    // body of the function
    // ...

}
```



Type declaration of function arguments and return value

```
return type: double  
|  
v
```

```
double add( double x, double y ){  
  
    // body of the function  
    // ...  
    // ...  
}
```



Type declaration of function arguments and return value

```
return type: double
|
|  name of the function: add
|  |
|  |  types of arguments x and y: double
|  |  |
|  |  |
|  |  |
v    v    v    v
```

```
double add( double x, double y ){

    // body of the function
    // ...
    // ...
}
```



An addition example

C++ function to add two double.

```
cppFunction( "  
double add( double x, double y){  
    double res = x + y ;  
    return res ;  
}  
" )  
  
add( 30, 12 )
```

Equivalent R code

```
addr <- function(x, y) {  
    res <- x + y  
    res  
}
```



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Let's practice!



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Debugging

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Print to the console

A function that uses `Rprintf()` to print a message on the console

```
cppFunction( '  
int fun(){  
  
    // Some values  
    int x = 42 ;  
  
    // Printing a message to the R console  
    Rprintf( "some message in the console, x=%d\\n", x ) ;  
  
    // Return some int  
    return 76 ;  
}  
' )
```

Rprintf and placeholders

Integer placeholder with %d

```
int x = 42 ;

Rprintf( "some message in the console, x=%d\n", x ) ;

// Prints the following in the console:
some message in the console, x=42
```

String placeholder with %s

```
Rprintf( "roses are %s, violets are %s\n", "red", "blue" ) ;

// Prints the following:
roses are red, violets are blue
```



Print to the console

A function that uses `Rprintf()` to print a message on the console

```
cppFunction( '  
  int fun(){  
    // some values  
    int x = 42 ;  
  
    // printing a message to the R console  
    Rprintf( "some message in the console, x=%d\\n", x ) ;  
  
    // return some int  
    return 76 ;  
  }  
' )
```

Calling the function

```
fun()  
some message in the console, x=42  
76
```



Error messages

A function that only takes numbers between 0 and 20

```
cppFunction( 'int fun(int x){  
  // A simple error message  
  if( x < 0 ) stop( "sorry x should be positive" ) ;  
  
  // A formatted error message  
  if( x > 20 ) stop( "x is too big (x=%d)", x ) ;  
  
  // Return some int  
  return x ;  
' )
```

Calling the function

```
fun(-2)  
Error in fun(-2) : sorry x should be positive  
  
fun(23)  
Error in fun(23) : x is too big (x=23)  
  
tryCatch( fun(24), error = function(e){  
  message("C++ exception caught: ", conditionMessage(e))  
})  
C++ exception caught: x is too big (x=24)
```



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