

Using C and C++ with R

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Plan

Calling foreign languages

Built-in C interface

The Rcpp package

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Foreign languages

- ▶ C , C++
- ▶ Fortran
- ▶ Java¹.

Other scripting languages

- ▶ R/Perl² and R/Python³ bidirectional interfaces.
- ▶ There is also the `system()` function for direct access to OS functions.

¹<http://www.rforge.net/rJava/>

²<http://www.omegahat.org/RSPerl/>

³<http://www.omegahat.org/RSPython/>

Robert Gentleman, in *R Programming for Bioinformatics*, 2008, about R's built-in C interfaces

Since R is not compiled, in some situations its performance can be substantially improved by writing code in a compiled language. There are also reasons not to write code in other languages, and in particular we caution against premature optimization, prototyping in R is often cost effective. And in our experience very few routines need to be implemented in other languages for efficiency reasons. Another substantial reason not to use an implementation in some other language is increased complexity. The use of another language almost always results in higher maintenance costs and less stability. In addition, any extensions or enhancements of the code will require someone that is proficient in both R and the other language.

Rcpp does make some of the above caution statements slightly less critical.

- ▶ **Why?** R is getting slow or is not doing well in terms of memory management: for example for loops that can't be vectorised, recursion, ...
- ▶ **When?** R can't do better **and** the slow code has been identified → Rprof

- ▶ **Why?** R is getting slow or is not doing well in terms of memory management: for example for loops that can't be vectorised, recursion, ...
 - ▶ **When?** R can't do better **and** the slow code has been identified → Rprof
-
- ▶ **Why?** Re-using existing infrastructure

Requirement for C/C++

Working compilers. On Windows, Rtools^{1,2}. On Mac, Xcode^{3,4}.

1. <http://cran.r-project.org/bin/windows/Rtools/>
2. <http://cran.r-project.org/doc/manuals/R-admin.html#The-Windows-toolset>
3. http://cran.r-project.org/doc/manuals/R-admin.html#Installing-R-under-_0028Mac_0029-OS-X
4. <http://cran.r-project.org/doc/manuals/R-admin.html#Mac-OS-X>

We will be using the following packages:

- ▶ `inline` and the `cfunction` to write inline C code that is compiled on the fly. (There is also a `cxxfunction` for C++ code).
- ▶ `Rcpp`, illustrating some of its functionality as well as the `cppFunction` for inline/on the fly compilation of C++ code.

Example

We have a DNA sequence, represented by a string of A, C, G and T and we want to compute the GC content.

```
x <- "ACCGGGTTTT"
gccountr <- function(x) table(strsplit(x, "")[[1]])
gccountr(x)

##
##  A  C  G  T
##  1  2  3  4
```

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The R C API

- ▶ Very frequent in R but has its quirks.
- ▶ Better know how to program in C.
- ▶ Documentation is not always easy to follow: R-Ext, R Internals as well as R and other package's code.

.C

- ▶ Not recommended.
- ▶ Arguments and return values must be *primitives* (vectors of doubles or integers).

.Call

- ▶ Accepts any R data structures as arguments and return values as SEXP.
- ▶ Manual memory management: allocate memory, protect objects to avoid them being garbage collected and subsequently unprotect them.

S (or symbolic) expression

SEXP is a super-type that matches all R data structures. Each data type has its own SEXP sub-type.

- ▶ REALSXP and INTSXP for double and integer vectors
- ▶ LGLSXP and STRSXP for logical and character vectors
- ▶ VECSXP for a list (NB: R lists are called vectors at the C level)
- ▶ ...

Function input and outputs are always SEXP and will have to be coerced to the appropriate SXP sub-type.

Rinternals.h defines all C functions, data types and macros.

```
file.path(R.home(), "include", "Rinternals.h")
```

```
## [1] "/usr/local/lib64/R/include/Rinternals.h"
```

```
library("inline")

## From Hadley Wickham, devtools wiki, adapted from inspect.c
## https://github.com/hadley/devtools/wiki/C-interface
sexp_type <- cfunction(c(x = "ANY"), '
  switch (TYPEOF(x)) {
    case NILSXP:      return mkString("NILSXP");
    case SYMSXP:      return mkString("SYMSXP");
    case LISTSXP:     return mkString("LISTSXP");
    case CLOSXP:      return mkString("CLOSXP");
    case ENVSXP:      return mkString("ENVSXP");
    case PROMSXP:     return mkString("PROMSXP");
    case LANGSXP:     return mkString("LANGSXP");
    case SPECIALSXP:  return mkString("SPECIALSXP");
    case BUILTINSXP:  return mkString("BUILTINSXP");
    case CHARSXP:     return mkString("CHARSXP");
    case LGLSXP:      return mkString("LGLSXP");
    case INTSXP:      return mkString("INTSXP");
    case REALSXP:     return mkString("REALSXP");
    case CPLXSXP:     return mkString("CPLXSXP");
    case STRSXP:      return mkString("STRSXP");
    case DOTSXP:      return mkString("DOTSXP");
    case ANYSXP:      return mkString("ANYSXP");
    case VECSXP:      return mkString("VECSXP");
    case EXPRSXP:     return mkString("EXPRSXP");
    case BCODESXP:    return mkString("BCODESXP");
    case EXTPTRSXP:   return mkString("EXTPTRSXP");
    case WEAKREFSXP:  return mkString("WEAKREFSXP");
    case S4SXP:       return mkString("S4SXP");
    case RAWSXP:      return mkString("RAWSXP");
    default:          return mkString("<unknown>");
  }
')
```

```
source("src/sexp.R")
sexp_type(1:3)

## [1] "INTSXP"

sexp_type(10L)

## [1] "INTSXP"

sexp_type(TRUE)

## [1] "LGLSXP"

sexp_type(letters)

## [1] "STRSXP"

sexp_type(list(a = 1, b = letters))

## [1] "VECSXP"

sexp_type(1s)

## [1] "CLOSXP"
```

Garbage collection

Every R object that is created at the C level (not function arguments, that R is already aware of) must be PROTECTED to avoid being garbage collected. Before the return statement, these must be explicitly UNPROTECTED.

```
SEXP x;  
PROTECT(x = ... )  
## do stuff  
UNPROTECT(1)  
return(x)
```


Object creation

1. Allocate memory: `allocVector`, `allocMatrix`, `alloc3DArray`
2. Initialise objects: `memset`

```
SEXP x;  
PROTECT(x = allocVector(INTSXP, 10) )  
memset(INTEGER(x), 0, 10 * sizeof(int))  
## do stuff  
UNPROTECT(1)  
return(x)
```

Accessing/setting SXP elements

- ▶ `REAL(x)[i]` if `x` is a `REALSXP`
- ▶ `INTEGER(x)[i]` if `x` is a `INTSXP`
- ▶ `LOGICAL(x)[i]` if `x` is a `LGLSXP`
- ▶ ...
- ▶ `STRING_ELT(x, i)` to access individual `CHARSXP` elements of a `STRSXP`
- ▶ `VECTOR_ELT(x, i)` to access individual elements of a `VECSXP`
- ▶ `SET_STRING_ELT(str, i, x)` to set an element in a string.
- ▶ `SET_VECTOR_ELT(vec, i, x)` to set an element in a list.

```

1  SEXP gccount(SEXP inseq) {
2      int i, l;
3      char p;
4      SEXP ans, dnaseq;
5
6      PROTECT(dnaseq = STRING_ELT(inseq, 0)); // a CHARSXP
7      l = length(dnaseq);
8
9      PROTECT(ans = allocVector(INTSXP, 4));
10     memset(INTEGER(ans), 0, 4 * sizeof(int));
11
12     for (i = 0; i < l; i++) {
13         p = CHAR(dnaseq)[i];
14         if (p == 'A')
15             INTEGER(ans)[0]++;
16         else if (p == 'C')
17             INTEGER(ans)[1]++;
18         else if (p == 'G')
19             INTEGER(ans)[2]++;
20         else if (p == 'T')
21             INTEGER(ans)[3]++;
22         else
23             error("Wrong alphabet");
24     }
25     UNPROTECT(2);
26     return(ans);
27 }

```

1. `ingccount`: embedding the C directly in R using the `inline` package.
2. `gcccount`: writing the C into its own code file and using `.Call`.

./src/ingccount.R

```
library("inline")

ingccount <- cfunction(
  sig = c(inseq = "character"),
  body = "
int i, l;
char p;
SEXP ans, dnaseq;
PROTECT(dnaseq = STRING_ELT(inseq, 0)); // a CHARSXP
l = length(dnaseq);
PROTECT(ans = allocVector(INTSXP, 4));
memset(INTEGER(ans), 0, 4 * sizeof(int));
for (i = 0; i < l; i++) {
  p = CHAR(dnaseq)[i];
  if (p == \'A\')
    INTEGER(ans)[0]++;
  else if (p == \'C\')
    INTEGER(ans)[1]++;
  else if (p == \'G\')
    INTEGER(ans)[2]++;
  else if (p == \'T\')
    INTEGER(ans)[3]++;
  else
    Rf_error(\'"Wrong alphabet"');
}
UNPROTECT(2);
return(ans);
")
```

```
source("../src/ingccount.R")  
ingccount(x)
```

```
## [1] 1 2 3 4
```

```
#include <R.h>
#include <Rdefines.h>

SEXP gccount(SEXP inseq) {
    int i, l;
    char p;
    SEXP ans, dnaseq;

    PROTECT(dnaseq = STRING_ELT(inseq, 0)); // a CHARSXP
    l = length(dnaseq);

    PROTECT(ans = allocVector(INTSXP, 4));
    memset(INTEGER(ans), 0, 4 * sizeof(int));

    for (i = 0; i < l; i++) {
        p = CHAR(dnaseq)[i];
        if (p == 'A')
            INTEGER(ans)[0]++;
        else if (p == 'C')
            INTEGER(ans)[1]++;
        else if (p == 'G')
            INTEGER(ans)[2]++;
        else if (p == 'T')
            INTEGER(ans)[3]++;
        else
            error("Wrong alphabet");
    }
    UNPROTECT(2);
    return(ans);
}
```

Use directly

1. Create a shared library: R CMD SHLIB gccount.c
2. Load the shared object: `dyn.load("gccount.so")`
3. Create an R function that uses it:

```
gccountC <-  
  function(inseq) .Call("gccount", inseq)
```

4. Use you C code:

```
gccountC(x)  
## [1] 1 2 3 4
```


In a package

- ▶ The C code comes in the `src` directory.
- ▶ The R wrapper will be

```
gccount <- function(inseq)
  .Call("gccount", inseq, PACKAGE = "mypackage")
```

- ▶ Document the R function
- ▶ Export the R function and `useDynLib(mypackge)` in the `NAMESPACE`

```
library(sequences)
gccount

## function (inseq)
## {
##     .Call("gccount", inseq, PACKAGE = "sequences")
## }
## <environment: namespace:sequences>

gccount(x)

## [1] 1 2 3 4
```

We could check that

```
if (typeof(inseq) != STRSXP)
  error("Need a character vector!");
```

although

```
gccountC(123)

## Error in gccountC(123): STRING_ELT() can only be
## applied to a 'character vector', not a 'double'
```

and type checking could easily be done at the R level. There is also `isReal(x)`, `isInteger(x)`, ... for atomic vectors.

There is of course much more to this . . . see references at the end.

Benchmarking

```
library(microbenchmark)
microbenchmark(gccountr(x),
               ingccount(x),
               gccountC(x),
               times = 1e4)
```

```
## Unit: nanoseconds
```

##	expr	min	lq	mean	median	uq	max	neval	cld
##	gccountr(x)	95184	106242	139893.770	110044.5	182182.0	2275109	10000	c
##	ingccount(x)	437	981	1669.779	1557.0	2079.5	22804	10000	a
##	gccountC(x)	4999	6191	10740.245	10340.0	12631.5	1469298	10000	b

Could we do better in \mathbb{R} ? (should be asked first, really)

Could we do better in R ? (should be asked first, really)

```
gccountr2 <-  
  function(x) tabulate(factor(strsplit(x, "")[[1]]))
```

Could we do better in R ? (should be asked first, really)

```
gccountr2 <-  
  function(x) tabulate(factor(strsplit(x, "")[[1]]))
```

```
microbenchmark(gccountr(x),  
               gccountr2(x),  
               ingccount(x),  
               gccountC(x),  
               times = 1e4)
```

```
## Unit: nanoseconds
```

##	expr	min	lq	mean	median	uq	max	neval	cld
##	gccountr(x)	96509	109564	157968.353	167718.5	195618.5	2937812	10000	d
##	gccountr2(x)	50999	61123	87099.968	90570.5	108124.0	2297525	10000	c
##	ingccount(x)	462	1456	2139.202	1898.5	2866.5	58338	10000	a
##	gccountC(x)	9810	16579	22248.607	21183.5	27590.0	143155	10000	b

But, obviously, table and tabular do much more than gccount.

Calling foreign languages

Built-in C interface

The Rcpp package

The Rcpp package

- ▶ Dirk Eddelbuettel and Romain Francois, with contributions by Douglas Bates, John Chambers and JJ Allaire.
- ▶ A flexible framework that facilitates the integration of R and C/C++ .
- ▶ <http://www.rcpp.org/>
- ▶ It comes with **loads** of documentation and examples:
`vignette(package = "Rcpp")`.
- ▶ All basic R types are implemented as C++ classes.
- ▶ No need to worry about garbage collection.

Associated packages

- ▶ `RcppArmadillo` – Armadillo templated C++ library for linear algebra.
- ▶ `RcppEigen` – high-performance Eigen linear algebra library.
- ▶ `RInside` – use R from inside another C++ by wrapping the existing R embedding API in an easy-to-use C++ class.

C++ classes

Scalar	Vector	Matrix
double	NumericVector	NumericMatrix
int	IntegerVector	IntegerMatrix
string	CharacterVector	CharacterMatrix
bool	LogicalVector	LogicalMatrix

And Function, List, DataFrame ...

Automatic conversions from R (C) to C++ (R) using as (wrap).

1. `ingccount2`: embedding the C++ directly in R using the `Rcpp::cppFunction` package.
2. `gccount2`: in a package, writing the C++ into its own code file and using `.Call`.
3. `gccountX`: using `sourceCpp` to source the C++ file and export the function to R .

```
1 IntegerVector ingccount2(CharacterVector inseq) {
2   IntegerVector ans(4);
3   std::string s = Rcpp::as<std::string>(inseq[0]);
4   int n = inseq[0].size();
5   for (int i = 0; i < n; i++) {
6     if (s[i] == 'A')
7       ans[0]++;
8     else if (s[i] == 'C')
9       ans[1]++;
10    else if (s[i] == 'G')
11      ans[2]++;
12    else if (s[i] == 'T')
13      ans[3]++;
14    else
15      Rf_error("\nWrong alphabet\n");
16  }
17  return wrap(ans);
18 }
```

```
library("Rcpp")

cppFunction("
IntegerVector ingccount2(CharacterVector inseq) {
  IntegerVector ans(4);
  std::string s = Rcpp::as<std::string>(inseq[0]);
  int n = inseq[0].size();
  for (int i = 0; i < n; i++) {
    if (s[i] == 'A')
      ans[0]++;
    else if (s[i] == 'C')
      ans[1]++;
    else if (s[i] == 'G')
      ans[2]++;
    else if (s[i] == 'T')
      ans[3]++;
    else
      Rf_error("\nWrong alphabet\n");
  }
  return wrap(ans);
}
")
```

```
x <- "ACCGGGTTTT"
source("src/ingccount2.R")
ingccount2(x)

## [1] 1 2 3 4
```


./src/gccount2.cpp

```
#include <Rcpp.h>

using namespace Rcpp;

RcppExport SEXP gccount2(SEXP inseq)
{
  Rcpp::IntegerVector ans(4);
  Rcpp::CharacterVector dnaseq(inseq);
  std::string s = Rcpp::as<std::string>(dnaseq[0]);

  for (int i = 0; i < s.size(); i++) {
    char p = s[i];
    if (p=='A')
      ans[0]++;
    else if (p=='C')
      ans[1]++;
    else if (p=='G')
      ans[2]++;
    else if (p=='T')
      ans[3]++;
    else
      Rf_error("Wrong alphabet");
  }

  return(ans);
}
```

In a package

1. You will need a Makevars file in the src directory.
2. Modify DESCRIPTION file:
Depends: Rcpp (>= 0.10.1)
LinkingTo: Rcpp
3. Create an R function that uses it

```
gccount2 <- function(inseq)  
  .Call("gccount2", inseq, PACKAGE = "mypackage")
```

4. Document the R function
5. Export the R function and useDynLib(mypackge) in the
NAMESPACE

Check the sequences package. But see Rcpp.package.skeleton below.

Using sourceCpp

- ▶ Write the C++ code into a `cpp` file, including headers and dedicated export statement (see next slide).
- ▶ Source it and use the R function.

```
sourceCpp("src/gccountX.cpp")  
gccountX(x)  
## [1] 1 2 3 4
```

```
#include <Rcpp.h>
using namespace Rcpp;

// [[Rcpp::export]]
IntegerVector gccountX(CharacterVector inseq) {
  IntegerVector ans(4);
  std::string s = Rcpp::as<std::string>(inseq[0]);

  for (int i = 0; i < s.size(); i++) {
    if (s[i] == 'A')
      ans[0]++;
    else if (s[i] == 'C')
      ans[1]++;
    else if (s[i] == 'G')
      ans[2]++;
    else if (s[i] == 'T')
      ans[3]++;
    else
      Rf_error("Wrong alphabet");
  }
  return(ans);
}
```

sugar

sugar (for *syntactic sugar*) is a set of C++ functions that (mostly) work and look like their R counterparts. Allows for example compact vectorised expression. Looks like R with the C++ efficiency.

(Rcpp-sugar vignette/paper)

- ▶ Vectorised arithmetic and logical operators: +, >, !, ...
- ▶ Functions: seq_len, seq, sapply, rnorm, abs, sum, ...

```
1 NumericVector cumsum1(NumericVector x){
2   // initialize an accumulator variable
3   double acc = 0;
4   // initialize the result vector
5   NumericVector res(x.size());
6   for(int i = 0; i < x.size(); i++){
7     acc += x[i];
8     res[i] = acc;
9   }
10  return res;
11 }
```

```
1 NumericVector cumsum1(NumericVector x){
2   // initialize an accumulator variable
3   double acc = 0;
4   // initialize the result vector
5   NumericVector res(x.size());
6   for(int i = 0; i < x.size(); i++){
7     acc += x[i];
8     res[i] = acc;
9   }
10  return res;
11 }
```

```
1 NumericVector cumsum2(NumericVector x){
2   return cumsum(x); // compute + return result
3 }
```

Translate these R functions into C or C++

```
sum
rowSums
pdistR <- function(x, ys)
  sqrt( (x - ys) ^ 2 )
sety <- function(x, y) {
  x[x > 0] <- y
  x[x < 0] <- -y
  x
}
lgl_biggerY <- function(x, y) x > y
biggerY <- function(x, y) x[x > y]
foo <- function(x, y) ifelse(x < y, x*x, -(y*y))
```

When possible, write two versions; one with an explicit for loop and another using sugar vectorised functions.

Hints: The `nrow` and `ncol` functions can be used to extract matrix dimensions. The matrix subsetting operator is `()` (instead of `[]`). To specify all indices, use the underscore.

Benchmark the R and C++ implementations.

Modification of the function arguments!

```
1 // [[Rcpp::export]]
2 IntegerVector modifyX(IntegerVector x) {
3     int n = x.size();
4     for (int i = 0; i < n; i++) {
5         x[i] = i;
6     }
7     return x;
8 }
```

```
sourceCpp("src/modify.cpp")
```

```
(x <- 3:1)
```

```
## [1] 3 2 1
```

```
modifyX(x)
```

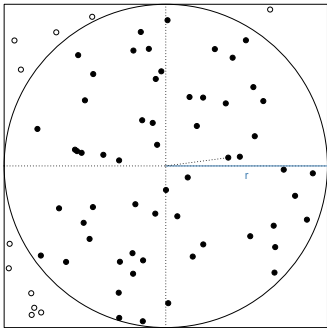
```
## [1] 0 1 2
```

```
x
```

```
## [1] 0 1 2
```

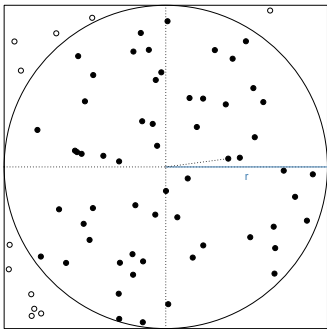
Cloning

```
1 IntegerVector nomodifyX(IntegerVector x) {  
2     IntegerVector y = clone(x);  
3     int n = x.size();  
4     for (int i = 0; i < n; i++) {  
5         y[i] = i;  
6     }  
7     return y;  
8 }
```



$$\frac{d}{n} = \frac{\pi r^2}{4r^2} = \pi/4$$

$$\pi \approx \frac{4d}{n}$$



$$\frac{d}{n} = \frac{\pi r^2}{4r^2} = \pi/4$$
$$\pi \approx \frac{4d}{n}$$

```
piR <- function(N) {  
  x <- runif(N)  
  y <- runif(N)  
  d <- sqrt(x^2 + y^2)  
  4 * sum(d < 1.0) / N  
}
```

```
piR <- function(N) {  
  x <- runif(N)  
  y <- runif(N)  
  d <- sqrt(x^2 + y^2)  
  return(4 * sum(d < 1.0) / N)  
}
```

```
piR <- function(N) {  
  x <- runif(N)  
  y <- runif(N)  
  d <- sqrt(x^2 + y^2)  
  return(4 * sum(d < 1.0) / N)  
}
```

```
#include <Rcpp.h>  
using namespace Rcpp;  
// [[Rcpp::export]]  
double piSugar(const int N) {  
  RNGScope scope; // ensure RNG gets set/reset  
  NumericVector x = runif(N);  
  NumericVector y = runif(N);  
  NumericVector d = sqrt(x*x + y*y);  
  return 4.0 * sum(d < 1.0) / N;  
}
```

```
source("src/pi.R")

library("Rcpp")
sourceCpp("src/pi.cpp")

N <- 1e6
set.seed(42)
resR <- piR(N)

set.seed(42)
resCpp <- piSugar(N)
stopifnot(identical(resR, resCpp))
```



```
library(rbenchmark)
res <- benchmark(piR(N), piSugar(N),
                  order="relative")
print(res[,1:4])
```

##	test	replications	elapsed	relative
## 2	piSugar(N)	100	4.868	1.000
## 1	piR(N)	100	15.272	3.137

Missing values

There are type specific `NA_REAL`, `NA_INTEGER`, `NA_STRING`, `NA_LOGICAL`. A vector can be tested with `is_na`. To test a scalar, use `R_IsNA`.

Sugar also provides `all` and `any`.

```
is.na
foo <- function(x, y) ifelse(x < y, x*x, -(y*y))
```

Recursion

```
fr <- function(n) {  
  if (n < 2) return(n)  
  return(fr(n-1) + fr(n-2))  
}
```

Calling a function

```
// [[Rcpp::export]]  
NumericVector callFunction(NumericVector x,  
    Function f) {  
    NumericVector res = f(x);  
    return res;  
}
```

```
## in R  
callFunction(x, summary)
```

sapply in C++

```
double square( double x ){  
    return x*x ;  
}  
  
// [[Rcpp::export]]  
NumericVector applyC(NumericVector xx){  
    return sapply(xx, square);  
}
```

Rcpp modules

Using S4 Reference Classes to reflect C++ classes and methods (see the **Rcpp-modules** vignette).

Interface to the Standard template library

C++ library with data structure and algorithms: vectors, arrays, stacks, iterators, accumulators, ... (see the **Rcpp-sugar** vignette).

```
1 NumericVector cumsum3(NumericVector x) {  
2     NumericVector res(x.size());  
3     std::partial_sum(x.begin(), x.end(), res.begin());  
4     return res;  
5 }
```

Using Rcpp in packages

```
Rcpp::package.skeleton("mypackage")
```

```
mypackage
|-- DESCRIPTION
|-- man
|   |-- mypackage-package.Rd
|   -- rcpp_hello_world.Rd
|-- NAMESPACE
|-- R
|   -- rcpp_hello_world.R
|-- Read-and-delete-me
-- src
    |-- Makevars
    |-- Makevars.win
    |-- rcpp_hello_world.cpp
    -- rcpp_hello_world.h
```



```
Rcpp.package.skeleton("mypackage", attribute = TRUE)
Rcpp.package.skeleton("mypackage", module = TRUE)
Rcpp.package.skeleton("mypackage",
                      cpp_files = c("convolve.cpp"))
```

Further reading

- ▶ Writing R Extensions, R Core team.
- ▶ Robert Gentleman, R Programming for Bioinformatics, 2008.
- ▶ Rcpp documentation and Rcpp.org.
- ▶ Dirk Eddelbuettel, Seamless R and C++ Integration with Rcpp, Springer, 2013.
- ▶ Dirk Eddelbuettel and Romain Francois, *Rcpp: Seamless R and C++ Integration*, Journal of Statistical Software, Vol. 40, Issue 8, Apr 2011, <http://www.jstatsoft.org/v40/i08/>.
- ▶ Relevant devtools sections: *C interface* and *Rcpp*.

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- ▶ Course web page and more material:
<https://github.com/lgatto/TeachingMaterial>

Thank you for you attention