This note describes Rcpp sugar which has been introduced in version 0.8.3 of Rcpp (Eddelbuettel et al., 2019; Eddelbuettel and François, 2011). Rcpp sugar brings a higher-level of abstraction to C++ code written using the Rcpp API. Rcpp sugar is based on expression templates (Abrahams and Gurtovoy, 2004; Vandevoorde and Josuttis, 2003) and provides some ‘syntactic sugar’ facilities directly in Rcpp. This is similar to how RcppArmadillo (Eddelbuettel et al., 2018) offers linear algebra C++ classes based on Armadillo (Sanderson, 2010).

### 1. Motivation
Rcpp facilitates development of internal compiled code in an R package by abstracting low-level details of the R API (R Core Team, 2018) into a consistent set of C++ classes.

Code written using Rcpp classes is easier to read, write and maintain, without loosing performance. Consider the following code example which provides a function foo as a C++ extension to R by using the Rcpp API:

```cpp
RcppExport SEXP foo(SEXP x, SEXP y) {
    Rcpp::NumericVector xx(x), yy(y);
    int n = xx.size();
    Rcpp::NumericVector res(n);
    double x_ = 0.0, y_ = 0.0;
    for (int i=0; i<n; i++) {
        x_ = xx[i];
        y_ = yy[i];
        if (x_ < y_) {
            res[i] = x_ * x_;
        } else {
            res[i] = -(y_ * y_);
        }
    }
    return res;
}
```

The goal of the function foo code is simple. Given two numeric vectors, we create a third one. This is typical low-level C++ code that that could be written much more consicely in R thanks to vectorisation as shown in the next example.

```r
def foo <- function(x, y) {
    ifelse(x < y, x * x, -(y * y))
}
```

Put succinctly, the motivation of Rcpp sugar is to bring a subset of the high-level R syntax in C++. Hence, with Rcpp sugar, the C++ version of foo now becomes:

```cpp
Rcpp::NumericVector foo(Rcpp::NumericVector x, Rcpp::NumericVector y) {
    return ifelse(x < y, x * x, -(y * y));
}
```

Apart from being strongly-typed and the need for explicit return statement, the code is now identical between highly-vectorised R and C++.

Rcpp sugar is written using expression templates and lazy evaluation techniques (Abrahams and Gurtovoy, 2004; Vandevoorde and Josuttis, 2003). This not only allows a much nicer high-level syntax, but also makes it rather efficient (as we detail in section 4 below).

### 2. Operators
Rcpp sugar takes advantage of C++ operator overloading. The next few sections discuss several examples.

#### 2.1. Binary arithmetic operators
Rcpp sugar defines the usual binary arithmetic operators: `+`, `-`, `*`, `/`.

```cpp
// two numeric vectors of the same size
NumericVector x;
NumericVector y;
// expressions involving two vectors
NumericVector res = x + y;
NumericVector res = x - y;
NumericVector res = x * y;
NumericVector res = x / y;
// one vector, one single value
NumericVector res = x + 2.0;
NumericVector res = 2.0 - x;
NumericVector res = y * 2.0;
NumericVector res = 2.0 / y;
// two expressions
NumericVector res = x * y + y / 2.0;
NumericVector res = x * (y - 2.0);
NumericVector res = x / (y * y);
```

The left hand side (lhs) and the right hand side (rhs) of each binary arithmetic expression must be of the same type (for example they should be both numeric expressions).

The lhs and the rhs can either have the same size or one of them could be a primitive value of the appropriate type, for example adding a NumericVector and a double.

#### 2.2. Binary logical operators
Binary logical operators create a logical sugar expression from either two sugar expressions of the same type or one sugar expression and a primitive value of the associated type.

```cpp
// two integer vectors of the same size
NumericVector x;
NumericVector y;
// expressions involving two vectors
```

The left side and the right side of each binary logical expression must be of the same type (for example they should be both numeric expressions).

The lhs and the rhs can either have the same size or one of them could be a primitive value of the appropriate type, for example adding a NumericVector and a double.
LogicalVector res = x < y;
LogicalVector res = x > y;
LogicalVector res = x <= y;
LogicalVector res = x >= y;
LogicalVector res = x == y;
LogicalVector res = x != y;

// one vector, one single value
LogicalVector res = x < 2;
LogicalVector res = 2 > x;
LogicalVector res = y <= 2;
LogicalVector res = 2 != y;

// two expressions
LogicalVector res = (x + y) < (x*x);
LogicalVector res = (x + y) >= (x*x);
LogicalVector res = (x + y) == (x*x);

2.3. Unary operators. The unary operator can be used to negate a (numeric) sugar expression. Whereas the unary operator! negates a logical sugar expression:

// a numeric vector
NumericVector x;

// negate x
NumericVector res = -x;

// use it as part of a numerical expression
NumericVector res = -x * (x + 2.0);

// two integer vectors of the same size
NumericVector y;
NumericVector z;

// negate the logical expression “y < z”
LogicalVector res = !(y < z);

3. Functions

Rcpp sugar defines functions that closely match the behavior of R functions of the same name.

3.1. Functions producing a single logical result. Given a logical sugar expression, the all function identifies if all the elements are TRUE. Similarly, the any function identifies if any the element is TRUE when given a logical sugar expression.

IntegerVector x = seq_len(1000);
all(x*x < 3);
any(x*x < 3);

Either call to all and any creates an object of a class that has member functions is_true, is_false, is_na and a conversion to SEXP operator.

One important thing to highlight is that all is lazy. Unlike R, there is no need to fully evaluate the expression. In the example above, the result of all is fully resolved after evaluating only the two first indices of the expression x * x < 3. Any is lazy too, so it will only need to resolve the first element of the example above.

3.1.1. Conversion to bool. One important thing to note concerns the conversion to the bool type. In order to respect the concept of missing values (NA) in R, expressions generated by any or all can not be converted to bool. Instead one must use is_true, is_false or is_na:

// wrong: will generate a compile error
bool res = any(x < y);

// ok
bool res = is_true(any(x < y));
bool res = is_false(any(x < y));
bool res = is_na(any(x < y));

3.2. Functions producing sugar expressions.

3.2.1. is_na. Given a sugar expression of any type, is_na (just like the other functions in this section) produces a logical sugar expression of the same length. Each element of the result expression evaluates to TRUE if the corresponding input is a missing value, or FALSE otherwise.

3.2.2. seq_along. Given a sugar expression of any type, seq_along creates an integer sugar expression whose values go from 1 to the size of the input.

3.2.3. seq_len. seq_len creates an integer sugar expression whose i-th element expands to i. Seq_len is particularly useful in conjunction with sapply and lapply.

3.2.4. pmin and pmax. Given two sugar expressions of the same type and size, or one expression and one primitive value of the appropriate type, pmin (pmax) generates a sugar expression of the same type whose i-th element expands to the lowest (highest) value between the i-th element of the first expression and the i-th element of the second expression.
3.2.5. ifelse. Given a logical sugar expression and either:

- two compatible sugar expression (same type, same size)
- one sugar expression and one compatible primitive

`ifelse` expands to a sugar expression whose \( i \text{-th} \) element is the \( i \text{-th} \) element of the first expression if the \( i \text{-th} \) element of the condition expands to `TRUE` or the \( i \text{-th} \) of the second expression if the \( i \text{-th} \) element of the condition expands to `FALSE`, or the appropriate missing value otherwise.

```cpp
IntegerVector x;
IntegerVector y;
ifelse(x < y, x, (x+y)*y)
ifelse(x > y, x, 2)
```

3.2.6. sapply. `sapply` applies a C++ function to each element of the given expression to create a new expression. The type of the resulting expression is deduced by the compiler from the result type of the function.

The function can be a free C++ function such as the overload generated by the template function below:

```cpp
template <typename T>
T square(const T& x){
    return x * x;
}sapply(seq_len(10), square<int>);
```

Alternatively, the function can be a functor whose type has a nested type called `result_type`

```cpp
template <typename T>
struct square : std::unary_function<T, T> {
    T operator()(const T& x){
        return x * x;
    }
}sapply(seq_len(10), square<int>());
```

3.2.7. apply. `apply` is similar to `sapply` except that the result is always an list expression (an expression of type `VECSXP`).

3.2.8. sign. Given a numeric or integer expression, `sign` expands to an expression whose values are one of 1, 0, -1 or NA, depending on the sign of the input expression.

```cpp
IntegerVector xx;
sign(xx)
sign(xx * xx)
```

3.2.9. diff. The \( i \text{-th} \) element of the result of `diff` is the difference between the \((i+1)\text{-th}\) and the \(i\text{-th}\) element of the input expression. Supported types are integer and numeric.

```cpp
IntegerVector xx;
diff(xx)
```

3.3. Mathematical functions. For the following set of functions, generally speaking, the \( i \text{-th} \) element of the result of the given function (say, `abs`) is the result of applying that function to this \( i \text{-th} \) element of the input expression. Supported types are integer and numeric.

```cpp
IntegerVector x;
abs(x)
exp(x)
floor(x)
ceil(x)
pow(x, z)  // x to the power of z
```

3.4. The d/q/p/r statistical functions. The framework provided by Rcpp sugar also permits easy and efficient access the density, distribution function, quantile and random number generation functions by R in the Rmath library.

Currently, most of these functions are vectorised for the first element which denote size. Consequently, these calls works in C++ just as they would in R:

```cpp
x1 = dnorm(y1, 0, 1);  // density of y1 at m=0, sd=1
x2 = qnorm(y2, 0, 1);  // quantiles of y2
x3 = pnorm(y3, 0, 1);  // distribution of y3
x4 = rnorm(n, 0, 1);   // 'n' RNG draws of N(0, 1)
```

Similar d/q/p/r functions are provided for the most common distributions: beta, binom, cauchy, chisq, exp, f, gamma, geom, hyper, Inorm, logis, nbeta, nbinom, nbinom_mm, nchisq, nf, norm, nt, pois, t, unif, and weibull.

Note that the parameterization used in these sugar functions may differ between the top-level functions exposed in an R session. For example, the internal `rexp` is parameterized by `scale`, whereas the R-level stats:::rexp is parameterized by `rate`. Consult Distribution Functions for more details on the parameterization used for these sugar functions.

One point to note is that the programmer using these functions needs to initialize the state of the random number generator as detailed in Section 6.3 of the ‘Writing R Extensions’ manual (R Core Team, 2018). A nice C++ solution for this is to use a `scoped` class that sets the random number generator on entry to a block and resets it on exit. We offer the RNGScope class which allows code such as

```cpp
RcppExport SEXP getRGamma() {
    RNGScope scope;
    NumericVector x = rgamma(10, 1, 1);
    return x;
}
```

As there is some computational overhead involved in using RNGScope, we are not wrapping it around each inner function. Rather, the user of these functions (i.e. you) should place an RNGScope at the appropriate level of your code.
4. Performance

TBD

5. Implementation

This section details some of the techniques used in the implementation of Rcpp sugar. Note that the user need not to be familiar with the implementation details in order to use Rcpp sugar, so this section can be skipped upon a first read of the paper.

Writing Rcpp sugar functions is fairly repetitive and follows a well-structured pattern. So once the basic concepts are mastered (which may take time given the inherent complexities in template programming), it should be possible to extend the set of function further following the established pattern.

5.1. The curiously recurring template pattern. Expression templates such as those used by Rcpp sugar use a technique called the Curiously Recurring Template Pattern (CRTP). The general form of CRTP is:

```cpp
// The Curiously Recurring Template Pattern (CRTP)
template <typename T>
struct base {
    // ...
};
struct derived : base<derived> {
    // ...
};
```

The base class is templated by the class that derives from it: derived. This shifts the relationship between a base class and a derived class as it allows the base class to access methods of the derived class.

5.2. The VectorBase class. The CRTP is used as the basis for Rcpp sugar with the VectorBase class template. All sugar expression derive from one class generated by the VectorBase template. The current definition of VectorBase is given here:

```cpp
template <int RTYPE, bool na, typename VECTOR>
class VectorBase {
    public:
        struct r_type :
            traits::integral_constant<int, RTYPE> {}; 
        struct can_have_na :
            traits::integral_constant<bool, na> {}; 
        typedef typename
            traits::storage_type<RTYPE>::type
            stored_type;
        VECTOR& get_ref() {
            return static_cast<VECTOR&>(*this);
        }
        inline stored_type operator[](int i) const {
            return static_cast<VECTOR*>(this)->operator[](i);
        }
        inline int size() const {
            return static_cast<VECTOR*>(this)->size();
        }
    };
}
```

The VectorBase template has three parameters:

- RTYPE: This controls the type of expression (INTSXP, REALSXP, ...)
- na: This embeds in the derived type information about whether instances may contain missing values. Rcpp vector types (IntegerVector, ...) derive from VectorBase with this parameter set to true because there is no way to know at compile-time if the vector will contain missing values at run-time. However, this parameter is set to false for types that are generated by sugar expressions as these are guaranteed to produce expressions that are without missing values. An example is the is_na function. This parameter is used in several places as part of the compile time dispatch to limit the occurrence of redundant operations.
- VECTOR: This parameter is the key of Rcpp sugar. This is the manifestation of CRTP. The indexing operator and the size method of VectorBase use a static cast of this to the VECTOR type to forward calls to the actual method of the derived class.

5.3. Example: sapply. As an example, the current implementation of sapply, supported by the template class Rcpp::sugar::Sapply is given below:

```cpp
template <int RTYPE, bool NA, typename T, typename Function>
class Sapply : public VectorBase<
    Rcpp::traits::r_sexptype_traits<
        typename ::Rcpp::traits::result_of<Function>::type
    >::rtype, 
    true, 
    Sapply<RTYPE, NA, T, Function>
>
    public:
        typedef typename
            ::Rcpp::traits::result_of<Function>::type
        RESULT_R_TYPE;
        typedef Rcpp::VectorBase<RTYPE, NA, T> VEC;
        typedef typename
            Rcpp::traits::r_vector_element_converter<
                RESULT_R_TYPE>::type
        converter_type;
```

4. | https://cran.r-project.org/package=Rcpp
typedef typename Rcpp::traits::storage_type<
    RESULT_R_TYPE>::type STORAGE;

Sapply(const VEC& vec_, Function fun_) :
    vec(vec_), fun(fun_){}

inline
    STORAGE
    operator[]( int i ) const {
        return
            converter_type::get(fun(vec[i]));
    }

inline
    int
    size() const {
        return
            vec.size();
    }

private:
    const VEC& vec;
    Function fun;
};

// sugar
template <int RTYPE, bool _NA_,
    typename T, typename Function>
inline
    sugar::Sapply<RTYPE, _NA_, T, Function>
sapply(const Rcpp::VectorBase<RTYPE,_NA_,T>& t,
    Function fun) {
    return
        sugar::Sapply<RTYPE,_NA_,T,Function>(t, fun);
}

5.3.1. The sapply function. sapply is a template function that takes
two arguments.

• The first argument is a sugar expression, which we recog-
nize because of the relationship with the VectorBase class
    template.
• The second argument is the function to apply.

The sapply function itself does not do anything, it is just used
to trigger compiler detection of the template parameters that will
be used in the sugar::Sapply template.

5.3.2. Detection of return type of the function. In order to decide which
kind of expression is built, the Sapply template class queries the
template argument via the Rcpp::traits::result_of template.

typedef typename
    ::Rcpp::traits::result_of<Function>::type
    result_type;

The result_of type trait is implemented as such:

template <typename T>
struct result_of{
    typedef typename T::result_type type;
};

template <typename RESULT_TYPE,
    typename INPUT_TYPE>
struct result_of<RESULT_TYPE (*)(INPUT_TYPE)> {
    typedef RESULT_TYPE type;
};

The generic definition of result_of targets functors with a
nested result_type type.

The second definition is a partial specialization targeting function
pointers.

5.3.3. Identification of expression type. Based on the result type of
the function, the r_sexptype_traits trait is used to identify the
expression type.

class private:
    const RTYPE vec;
    Function fun;
};

5.3.4. Converter. The r_vector_element_converter class is used
to convert an object of the function's result type to the actual
storage type suitable for the sugar expression.

typedef typename
    Rcpp::traits::r_vector_element_converter<
    typename
        ::Rcpp::traits::result_of<Function>::type
    >::type
    converter_type;

5.3.5. Storage type. The storage_type trait is used to get access
to the storage type associated with a sugar expression type. For
example, the storage type of a REALSXP expression is double.

typedef typename
    Rcpp::traits::storage_type<RESULT_R_TYPE>::type
    STORAGE;

5.3.6. Input expression base type. The input expression — the expres-
sion over which sapply runs — is also typedef'ed for convenience:

typedef Rcpp::VectorBase<RTYPE, NA, T> VEC;

5.3.7. Output expression base type. In order to be part of the Rcpp
sugar system, the type generated by the Sapply class template
must inherit from VectorBase.

template <int RTYPE, bool NA,
    typename T, typename Function>
class Sapply :
    public VectorBase<
        typename
            ::Rcpp::traits::result_of<Function>::type
    >::rtype,
    true,
    Sapply<RTYPE,NA,T,Function> >

The expression built by Sapply depends on the result type of
the function, may contain missing values, and the third argument
is the manifestation of the CRTP.

5.3.8. Constructor. The constructor of the Sapply class template is
straightforward, it simply consists of holding the reference to the
input expression and the function.
Sapply(const VEC& vec_, Function fun_):
  vec(vec_), fun(fun_){}

private:
  const VEC& vec;
  Function fun;

5.3.9. Implementation. The indexing operator and the size member function is what the VectorBase expects. The size of the result expression is the same as the size of the input expression and the \( i \)th element of the result is simply retrieved by applying the function and the converter. Both these methods are inline to maximize performance:

```cpp
inline STORAGE operator[](int i) const {
  return converter_type::get(fun(vec[i]));
}
inline int size() const {
  return vec.size();
}
```

6. Summary

TBD

References


