

R Object Oriented Programming

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General overview

- R object-oriented programming – in details; after this, you should be able to tackle more complicated OO designs.

Prerequisites

- good knowledge of R (data types, functions, scripting ...)
- object-oriented programming knowledge helpful but not essential

Plan

- 1 Course introduction
- 2 Revision of basic R
- 3 Object-oriented (OO) Programming
- 4 S4 object oriented framework
- 5 S3 object oriented framework
- 6 S4 Reference Classes

1 Course introduction

2 Revision of basic R

3 Object-oriented (OO) Programming

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5 S3 object oriented framework

6 S4 Reference Classes

Course agenda

- Object-oriented programming in R : S3 and S4 class systems
- Package development in R : creating and documenting packages
- Other advanced topics: testing, debugging, profiling, C/C++ interface, parallel computation

Objectives

By the end of the course you should have created a working package written in the S4 class system.

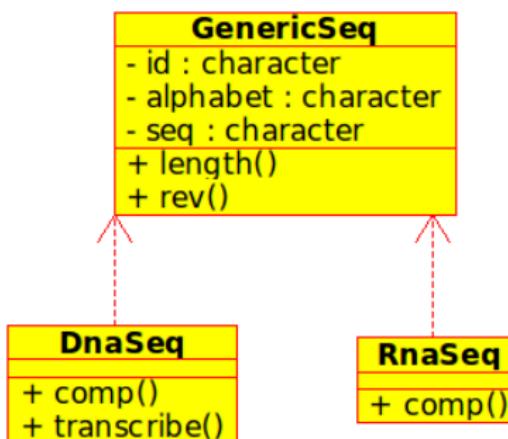
You should be able to use the code as a template for your own work. Our example has been chosen for demonstrative purposes.

Course working example: "sequences" package

Working example

We will make a simple package to handle sequence data.

This package will be able to load a FASTA file and based on sequence type do some operations, like finding the sequence length or reverse sequence. For simplicity we will manipulate single sequences only.

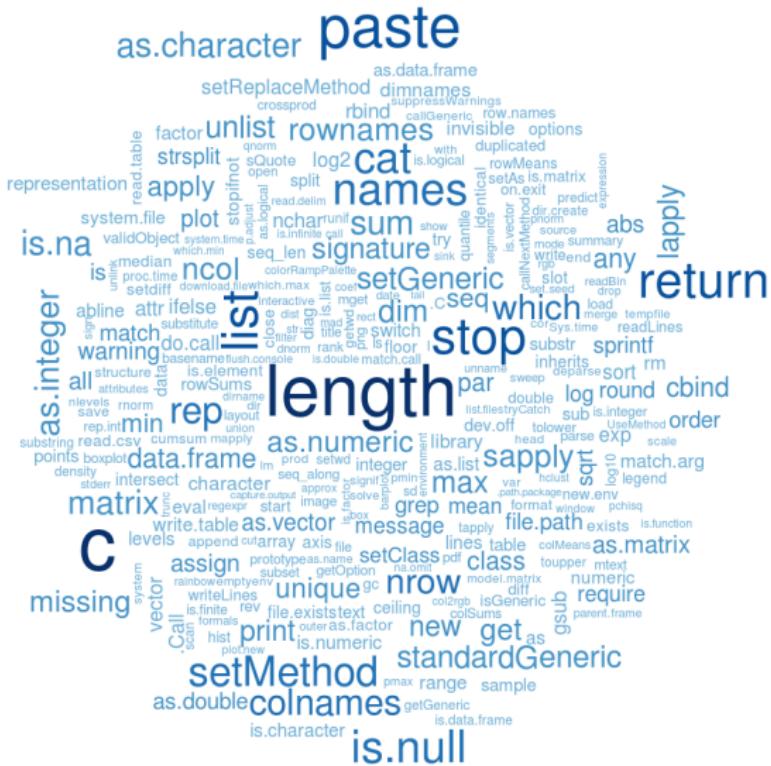


UML class diagram for the "sequences" package

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Basic R functions (size reflects frequency of usage)



Defining functions in R

Simple function with 4 arguments:

```
> # Function to calculate area of rectangle
> area <- function(x1, y1, x2, y2){
+   abs(x2-x1) * abs(y2-y1)
+ }
> area(0, 0, 5, 5)

[1] 25
```

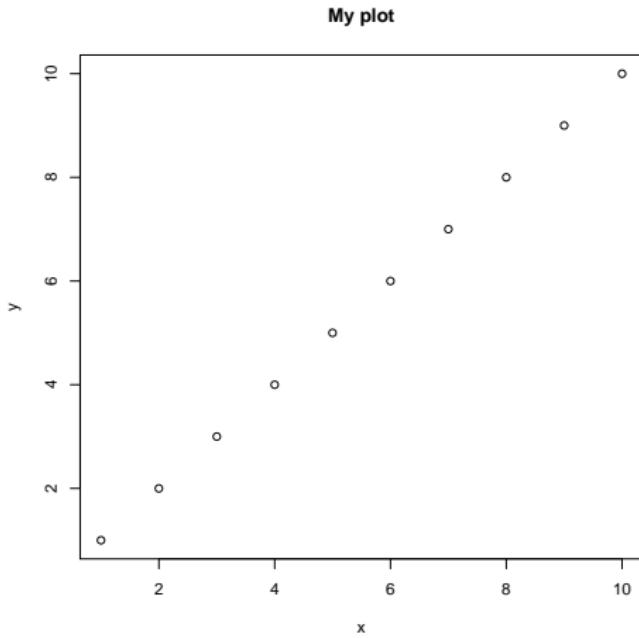
Special argument "..." for any:

```
> # Plot with a message before the plot
> plotMsg <- function(x, y, ...){
+   cat("Plotting", length(x), "data points!\n")
+   plot(x, y, ...)
+ }
```

Output of plotMsg()

```
> plotMsg(1:10, 1:10, main="My plot")
```

Plotting 10 data points!



Useful R function 1/2

- `readLines()` - reads raw lines of text from a file
- `nchar()` - gives number of characters in a string

```
> nchar("Some text")
```

```
[1] 9
```

- `strsplit()` - split a string by some separator

```
> strsplit("Some text", " ")
```

```
[[1]]
```

```
[1] "Some" "text"
```

```
> strsplit("Some text", "")
```

```
[[1]]
```

```
[1] "S" "o" "m" "e" " " "t" "e" "x" "t"
```

- `unique()` - unique elements of a vector

```
> unique(c(1, 1, 2, 2, 3))
```

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

```
> unique(c("a", "b", "a"))
```

```
[1] "a" "b"
```

Useful R function 2/2

- `grep()` - find which elements of vector match regular expression

```
> grep("[AT]+", c("CGC", "TAT", "TATCATA"))
[1] 2 3
```

- `sub()` - replace matches to regular expression

```
> sub("[AT]+", "-", c("CGC", "TAT", "TATCATA"))
[1] "CGC"     "-"       "-CATA"
```

- `chartr()` - translate a string by replacing individual characters

```
> chartr("TA", "AT", "TATCTA")
[1] "ATACAT"
```

- `rev()` - reverse ordering in a vector

```
> rev(c("TAT", "ATT", "TTT"))
[1] "TTT" "ATT" "TAT"
```

- `paste()` - concatenate variables into a string representation

```
> paste(c("A", "T", "A"), collapse="")
[1] "ATA"
```

Lists in R

List is a data structure that can hold a vector of any other variables.

```
> x <- list(a=10, b="text")
> x$a
```

```
[1] 10
```

```
> x[["b"]]
```

```
[1] "text"
```

```
> x[[1]]
```

```
[1] 10
```

```
> names(x)
```

```
[1] "a" "b"
```

Everything in R has a class

Everything in R has a type - in object oriented programming called a **class**.

```
> class(c(1, 2, 3))  
  
[1] "numeric"  
  
> class("Some text")  
  
[1] "character"  
  
> class(matrix(0, nrow=10, ncol=10))  
  
[1] "matrix"  
  
> class(plot)  
  
[1] "function"  
  
> class(table(1:4, 1:4))  
  
[1] "table"
```

Coding standards

- Use <- for assignment rather than =.
- Avoid long lines (80 characters).
- Use spaces for indentation (2 or 4).
- No semi-colons (unless you have several expression in a line).
- Start names with upper case for classes, lower for the rest.
- Use syntax highlighting

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Object-oriented vs Procedural programming

- OOP introduced in 1970s in Smalltalk but gained wider popularity in 1990s with programming languages like C++ and Delphi
- Traditional (procedural) programming - data and functions decoupled
- Object-oriented programming - data and functions tied together in **objects**

OOP concepts

- **Abstraction** - related data is stored and handled together
- **Inheritance** - code reuse by hierarchy of more-to-less general object types (classes)
- **Polymorphism** - the most appropriate function is called based on the dataset (e.g various plot functions)

Procedural vs Object-oriented Programming

Procedural programming

```
> area <-  
+   function(x1,y1,x2,y2){  
+     abs(x2-x1)*abs(y2-y1)  
+   }  
> area(0, 0, 5, 5)  
  
[1] 25
```

Object-oriented programming

```
> setClass("Rectangle",  
+           representation = representation(  
+             x1 = "numeric",  
+             y1 = "numeric",  
+             x2 = "numeric",  
+             y2 = "numeric"))  
+         )  
> setGeneric("area",  
+           function(obj) standardGeneric("area"))  
  
[1] "area"  
  
> setMethod("area", "Rectangle", function(obj) {  
+   abs(obj@x2 - obj@x1) * abs(obj@y2 - obj@y1)  
+ })  
  
[1] "area"  
  
> rect = new("Rectangle", x1=0, y1=0, x2=5, y2=5)  
> area(rect)
```

S3

Older and less formal framework with no explicit class definitions. Many parts of base R use S3, e.g. plotting, linear modelling, ...

- limited introspection, single inheritance, single dispatch, instance-based

S4

Full-fledged object-oriented framework, de-facto standard for most modern packages and required for Bioconductor packages.

- introspection, multiple inheritance, multiple dispatch (introduces a small overhead)

S4 Reference classes

Introduced in R -2.12

- mutable objects, single inheritance, single dispatch, fields and methods in class definition, methods associated with classes (rather than generics)

Course working example

Working example revisited

Working example for this course will be **manipulating DNA/RNA sequence data**.

Functions we would like to have:

- `readFasta()` - read in a single sequence from a FASTA file
- `id()`, `seq()` - return the ID of sequence and the sequence (accessors)
- `rev()` - return reverse DNA/RNA sequence
- `length()` - return DNA/RNA sequence length
- `comp()` - return complementary DNA/RNA sequence
- `transcribe()` - return RNA sequence for DNA sequence

Goal

The final product should be an R package using S4 framework. But we need to get there, so lets start with a procedural and S3 implementation...

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readFasta() **input file**

We will start with the implementation of `readFasta()`. This function should load the data from a FASTA file and somehow represent it in R .

A sample FASTA file:

```
> example dna sequence
agcatacgacgactacgacactacgacatcagacactacagactactac
gactacagacatcagacactacatatttacatcatcagagattatatta
acatcagacatcgacacatcatcatcagcatcat
```

Sequence description

Notice that a sequence is described by the:

- name (`example dna sequence`)
- nucleotide sequence
- sequence alphabet (in case of DNA ATGC, for RNA AUGC)

Defining S4 classes

Defining S4 class

Each class in S4 needs to be defined before it can be used. At this stage data types and inheritance are specified.

```
> setClass("GenericSeq",
+           representation = representation(
+             id = "character",
+             sequence = "character",
+             alphabet = "character"
+           ))
```

Defining S4 classes

S4 class slots

Slots define the **names and types** of variables that are going to be stored in the object. Types can be any of the basic R type or S3/S4 classes. To inspect how basic R types are called use `class()`, e.g.

```
> class("hello")
```

```
[1] "character"
```

S4 objects

Creating S4 objects

Once we have a class definition, we can make an object by filling out the slots. We can directly access the slots using the `@` notation although this is discouraged.

```
> genseq <- new("GenericSeq",  
+                   id="sequence name",  
+                   sequence="AGATACCCCGAAACGA",  
+                   alphabet=c("A", "C", "G", "T")  
+                 )
```

S4 objects

```
> genseq
```

An object of class "GenericSeq"

Slot "id":

```
[1] "sequence name"
```

Slot "sequence":

```
[1] "AGATAACCCGAAACGA"
```

Slot "alphabet":

```
[1] "A" "C" "G" "T"
```

```
> genseq@id
```

```
[1] "sequence name"
```

```
> slot(genseq, "id")
```

```
[1] "sequence name"
```

Naive readFasta() implementation

readFasta() implementation

Read in a sequence from FASTA file and return the id, sequence and alphabet in a list:

```
> readFasta <- function(infile){  
+   lines <- readLines(infile)  
+   header <- grep("^>", lines)  
+   if ( length(header) > 1 ) {  
+     warning("Reading first sequence only.")  
+     lines <- lines[header[1]:(header[2]-1)]  
+     header <- header[1]  
+   }  
+   id <- sub("^> *","",lines[header],perl=TRUE)  
+   sequence <- toupper(paste(lines[(header+1):length(lines)],collapse=""))  
+   alphabet <- unique(strsplit(sequence,"")[[1]])  
+  
+   return.value <- new("GenericSeq", id=id, sequence=sequence, alphabet=alphabet)  
+  
+   return.value  
+ }
```

S4 object from readFasta()

```
> s <- readFasta("aDnaSeq.fasta")
> s
```

An object of class "GenericSeq"

Slot "id":

```
[1] "example dna sequence"
```

Slot "sequence":

```
[1] "AGCATAACGACGACTACGACACTACGACATCAGACACTACAGACTACTACGACTACAGACATCAGACACTACATATTAA"
```

Slot "alphabet":

```
[1] "A" "G" "C" "T"
```

Writing S3/S4 methods: introducing Generics

Classical OO language

GenericSeq
+ id
+ sequence
+ alphabet
id()
seq()
rev()
length()

Class2
+ id
id()

R S3/S4

GenericSeq
+ id
+ sequence
+ alphabet
id()
seq()
rev()
length()

Class2
+ id
id()

Table of generics

Table of
generics

id(obj, ...)

obj is of type GenericSeq

obj is of type Class2

Defining S4 methods

When a generic does not exist already

If a generic `id()` does not exist, we need to create it to be able to use our method.

We create our (hidden) implementation with `setMethod()`.

```
> setGeneric("id", function(obj, ...) standardGeneric("id"))

[1] "id"

> setMethod("id", "GenericSeq", function(obj, ...) obj@id)

[1] "id"

> id(genseq)

[1] "sequence name"
```

Defining S4 methods

When a generic exists

How to check if a generic for e.g. `rev` exists:

- `isGeneric("rev")` will check for S4 generics. If it already exists, we use it with the defined parameter names.
- `show(rev)` will show the source code of `rev` if it exists. If the source contains `UseMethod("rev")` it is an S3 generic. In this case, we need to define a S4 generic **with exactly the same parameters**.
- All primitive function (e.g. `c()`) have implicit generics.

```
> setGeneric("rev", function(x) standardGeneric("rev"))

[1] "rev"

> setMethod("rev", "GenericSeq", function(x
+     paste(rev(unlist(strsplit(x@sequence, ""))),
+           collapse="")))

[1] "rev"
```

```
> rev(genseq)
```

[1] "AGCAAAGCCCCATAGA"

```
> rev(1:5)
```

[1] 5 4 3 2 1

```
> showMethods("rev")
```

Function: rev (package base)

x="ANY"

x="character"

 (inherited from: x="ANY")

x="GenericSeq"

x="integer"

 (inherited from: x="ANY")

S4 accessor methods

It is considered bad practice to use `@` in your code to access slots. It breaks the division between the internal class implementation and class usage.

Instead, create getter and setter methods for all slots you want to expose.

```
> setGeneric("id<-",
+             function(object,value) standardGeneric("id<-"))

[1] "id<-"  
  
> setReplaceMethod("id",
+                     signature(object="GenericSeq",
+                             value="character"),
+                     function(object, value) {
+                         object@id <- value
+                         return(object)
+                     })
  
[1] "id<-"  
  
> id(genseq) <- "new sequence name"
> id(genseq)
```

S4 introspection

Exercise 1: (code: 01_basic_S4.R)

Try the following introspection functions:

```
> showMethods("rev")
> getClass("GenericSeq")
> slotNames(genseq)
> getMethod("rev", "GenericSeq")
> findMethods("rev")
> isGeneric("rev")
```

What do these function output? In some cases the result is an object. Use the introspection functions to find out more about the results (e.g. `class()`, `getClass()`, ...).

Exercise 2: (code as above, solution: 01_basic_S4_solution.R)

Lets complete our GenericSeq implementation with some more methods. Implement getter/setter method `seq()` and getter only `alphabet()`. Then implement the method `length()` to return sequence length. First check if "length" is already a generic though.

Developer vs User

In OOP there is a strong distinction between a developer (i.e. you) who has complete knowledge of the code, and the user who just wants to achieve a certain task.

When to use S4?

- When to create a new class?
 - If there is a clear benefit in terms of data organisation and generic re-usage (e.g. `plot()` function).
- When to create a new generic?
 - Accessors or general functionality (e.g. `normalize()`).
 - If using Bioconductor always check package `BiocGenerics` and other packages you use.

Special methods - show()

You might have noticed that many objects print a custom description instead of a plain list of slots. We can add this functionality by setting `show()` and `print()` methods.

```
> setMethod("show",
+           "GenericSeq",
+           function(object) {
+             cat("Object of class", class(object), "\n")
+             cat(" Id:", id(object), "\n")
+             cat(" Length:", length(object), "\n")
+             cat(" Alphabet:", alphabet(object), "\n")
+             cat(" Sequence:", seq(object), "\n")
+           })

```

```
[1] "show"
```

```
> genseq
```

```
Object of class GenericSeq
Id: new sequence name
Length: 16
Alphabet: A C G T
```

Special methods - print()

The `print()` function already exists, but is not an S4 generic.

```
> setGeneric("print", function(x,...) standardGeneric("print"))
```

```
[1] "print"
```

```
> setMethod("print", "GenericSeq",
+           function(x) {
+             sq <- strsplit(seq(x), "")[[1]]
+             cat(">", id(x), "\n", " 1  ")
+             for (i in 1:length(x)) {
+               if ((i %% 10) == 0)
+                 cat("\n", i, " ")
+                 cat(sq[i])
+               }
+               cat("\n")
+             })
+           })
```

```
[1] "print"
```

```
> print(genseq)

> new sequence name
  1  AGATACCC
 10  GAAACGA
```

Special methods - initialize()

We might need to do some special processing on object creation. We can do this with a custom `initialize()` method.

Use named arguments with default values (otherwise class checking might fail).

```
> setMethod("initialize", "GenericSeq",
+     function(.Object, ..., id="", sequence="", alphabet=""){
+         .Object@id <- id
+         .Object@sequence <- toupper(sequence)
+         .Object@alphabet <- alphabet
+         callNextMethod(.Object, ...) # call parent class initialize()
+     })
[1] "initialize"

> show(new("GenericSeq", id="new seq.", alphabet=c("A", "T"), sequence="atatta"))

Object of class GenericSeq
Id: new seq.
Length: 6
Alphabet: A T
Sequence: ATATTA
```

Inheritance in S4 class system

Implementation of GenericSeq is finished. Now we want to re-use this code and add some extra functionality for DnaSeq and RnaSeq.

We start by defining the new classes that will inherit (contain) our GenericSeq class. It is good practise to provide some default (prototype) values.

```
> setClass("DnaSeq",
+           contains = "GenericSeq",
+           prototype = prototype(
+             id = paste("my DNA sequence", date()),
+             alphabet = c("A", "C", "G", "T"),
+             sequence = character()))
>
> setClass("RnaSeq",
+           contains = "GenericSeq",
+           prototype = prototype(
+             id = paste("my RNA sequence", date()),
+             alphabet = c("A", "C", "G", "U"),
+             sequence = character()))
```

Extending child classes with custom methods

Custom comp() methods in two subclasses

Now we can write the comp() method which is going to work differently for DNA and RNA sequences.

```
> setGeneric("comp",function(object, ...) standardGeneric("comp"))
```

```
[1] "comp"
```

```
> setMethod("comp", "DnaSeq",
+           function(object, ...) {
+             chartr("ACGT", "TGCA", seq(object))
+           })
```

```
[1] "comp"
```

```
> setMethod("comp", "RnaSeq",
+           function(object, ...) {
+             chartr("ACGU", "UGCA", seq(object))
+           })
```

```
[1] "comp"
```

Creating objects of appropriate class

We could use `new()` to create new object instances, but it is tedious and error prone. Instead, we should provide a function that reads in some data and sets the right class for the data.

```
> readFasta <- function(infile){  
+   lines <- readLines(infile)  
+   header <- grep("^>", lines)  
+   if (length(header)>1) {  
+     warning("Reading first sequence only.")  
+     lines <- lines[header[1]:(header[2]-1)]  
+     header <- header[1]  
+   }  
+   .id <- sub("^> *", "", lines[header], perl=TRUE)  
+   .sequence <- toupper(paste(lines[(header+1):length(lines)], collapse=""))  
+   .alphabet <- toupper(unique(strsplit(.sequence, "")[[1]]))  
+   if (all(.alphabet %in% c("A", "C", "G", "T"))) {  
+     newseq <- new("DnaSeq",  
+                   id=.id,  
+                   sequence=.sequence)  
+   } else if (all(.alphabet %in% c("A", "C", "G", "U"))) {  
+     newseq <- new("RnaSeq",  
+                   id=.id,  
+                   sequence=.sequence)  
+   } else {  
+     stop("Alphabet ", .alphabet, " is unknown.")  
+   }  
+   return(newseq)  
+ }
```

Object validity tests

The user can still use `new` in an inconsistent way or change a consistent object in the way that will render it inconsistent (e.g. assign an RNA sequence to an object of class `DnaSeq`). First lets make sure each new object is consistent, e.g. that alphabet matches sequence.

```
> setClass("GenericSeq",
+           representation = representation(
+             id = "character",
+             alphabet = "character",
+             sequence = "character"),
+           validity = function(object) {
+             isValid <- TRUE
+             if (nchar(object@sequence)>0) {
+               chars <- casefold(unique(unlist(strsplit(object@sequence, ""))))
+               isValid <- all(chars %in% casefold(object@alphabet))
+             }
+             if (!isValid)
+               cat("Some characters are not defined in the alphabet.\n")
+             return(isValid)
+           })
```

Validity tests - setters

Now lets make sure the user cannot render the objects inconsistent by modifying the object.

```
> setReplaceMethod("id",
+                   signature(object="GenericSeq",
+                           value="character"),
+                   function(object, value) {
+                     object@id <- value
+                     if (validObject(object))
+                       return(object)
+                   })
+
[1] "id<-"
```

```
> setReplaceMethod("seq",
+                   signature(object="GenericSeq",
+                           value="character"),
+                   function(object, value) {
+                     object@sequence <- value
+                     if (validObject(object))
+                       return(object)
+                   })
+
[1] "seq<-"
```

S4 exercises

Look at the code we wrote so far and understand it. Then solve the following exercise.

Exercise 3: (code: 02_S4_complete.R)

Try again reading the supplied fasta file using

```
x <- readFasta("aDnaSeq.fasta")
```

Inspect the resulting object using object introspection tools. Try to break the resulting object by assigning invalid values to sequence. What happens if you do:

```
seq(x) <- "!"
```

and what if:

```
x@sequence <- "!"
```

Exercise 4: (code as above, solution: 02_transcribe_solution.R)

Implement a new method `transcribe()` of `DnaSeq`. This method should take a `DnaSeq`, replace the T's with U's and return a `RnaSeq` object.

Virtual classes

A class can be marked to be **virtual** so that no objects can be made, but it can only be inherited. In our case, we might want to mark GenericSeq as virtual, to do so just add parameter "VIRTUAL" into class representation.

Class unions

In some cases we might want a slot to contain an object from one of multiple unrelated classes. In that case we would create a "dummy" class to serve as a place holder. For this we can use **class union**, for example `setClassUnion("AOrB", c("A", "B"))` would create a new virtual class AOrB that is a parent class to both A and B.

S4 operator overloading

Overriding operators

Operators in R can also be overridden. For instance `setMethod("[", MyClass,)` will override the subsetting operator `[]` for `MyClass` to give it custom functionality. Other operators like `[[[]]]` and `$` can also be overridden.

```
> setMethod("[",
+           signature = signature(x = "GenericSeq",
+                                   i = "ANY", j = "missing"),
+           function(x, i, j, ..., drop = TRUE) {
+             paste(unlist(strsplit(x@sequence, ""))[i], collapse="")
+           })

[1] "["

> genseq[1:10]

[1] "AGATAACCCG"
```

S4 generics clashes

Same generic name in two packages

What if two R packages, both using S4, provide a different generics definition?

```
> # generic in package1
> setGeneric("score", function(object, ...) standardGeneric("score"))
> # generic in package2
> setGeneric("score", function(x, ...) standardGeneric("score"))
```

Generics masking

Although the difference is only in the name of the argument we are dispatching on, the second generic is going to mask the first one, and any S4 methods that are defined for the first generic in package1 will no longer work.

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Differences of S3 class system to S4

- **Classes are not explicit** - New types are created by manually setting the `class()` attribute.
- **Generics and dispatching by naming convention** - Generics work by an informal naming convention
- **Limited introspection**
- **No validity checking, multiple inheritance, multiple dispatch, virtual classes**

S4 class system is the de-facto standard in Bioconductor, but most of base R is written in S3.

Creating an object in S3

In S3, classes are not explicit, and objects are created by setting the `class()` attribute.

```
> s <- list(id="example", sequence="ACCTAGAT", alphabet=c("A", "C", "G", "T"))
> class(s) <- "GenericSeq"
> s

$id
[1] "example"

$sequence
[1] "ACCTAGAT"

$alphabet
[1] "A" "C" "G" "T"

attr(,"class")
[1] "GenericSeq"

> names(s)

[1] "id"       "sequence" "alphabet"
```

S3 generics and dispatch

Methods are created by naming convention

The method is named as `<generic>.<class>`. The generic that is defined by the usage of the `UseMethod()` command will look for functions of this format in the current workspace. If not function is found it will use `<generic>.default`.

```
> # generic
> id <- function(obj, ...) UseMethod("id")
> # method
> id.GenericSeq <- function(obj, ...) obj$id
>
> id(s)

[1] "example"
```

S3 generics in base R

```
> summary

function (object, ...)
UseMethod("summary")
<bytecode: 0x333e228>
<environment: namespace:base>

> x <- c(1, 4, 2, 1, 4, 2)
> class(x)

[1] "numeric"

> summary(x)

  Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
1.000  1.250  2.000  2.333  3.500  4.000
```

To see what method exist for a generic:

```
> methods(summary)
[1] summary.aov
[3] summary.aspell*
[5] summary.connection
[7] summary.Date
[9] summary.ecdf*
[11] summary.glm
[13] summary.lm
[15] summary.manova
[17] summary.mlm*
[19] summary.packageStatus*
[21] summary.PDF_Stream*
[23] summary.POSIXlt
[25] summary.prcomp*
[27] summary.proc_time
[29] summary.srcref
[31] summary.stl*
[33] summary.tukeysmooth*
see "?methods" for accessing help and source code
```

S3 dispatch

Because there is no `summary.numeric`, the default implementation `summary.default` is used.

```
> x <- c(1, 4, 2, 1, 4, 2)
> class(x)

[1] "numeric"

> summary(x)

  Min. 1st Qu.  Median   Mean 3rd Qu.  Max.
1.000  1.250   2.000   2.333  3.500   4.000

> summary.default(x)

  Min. 1st Qu.  Median   Mean 3rd Qu.  Max.
1.000  1.250   2.000   2.333  3.500   4.000
```

```
> y <- table(c(0, 1, 1, 0), c(1, 0, 1, 1))  
> class(y)
```

```
[1] "table"
```

```
> summary(y)
```

Number of cases in table: 4

Number of factors: 2

Test for independence of all factors:

Chisq = 1.3333, df = 1, p-value = 0.2482

Chi-squared approximation may be incorrect

```
> summary.table(y)
```

Number of cases in table: 4

Number of factors: 2

Test for independence of all factors:

Chisq = 1.3333, df = 1, p-value = 0.2482

Chi-squared approximation may be incorrect

S3 methods exercises

Look at the code we have written so far, understand it, and then solve the following exercise.

Exercise 5:

Explore some of the built-in generics and methods. Try the following commands:

```
methods("summary")
methods(class="lm")
```

Exercise 6: (code:03_GenericSeq.R, solution:03_GenericSeq_solution.R)

Both `length()` and `rev()` are already generic functions, but `alphabet()` is not. Add these methods for class `GenericSeq`:

- `length()` should return the length of the DNA/RNA sequence
- `alphabet()` should return the alphabet of the sequence
- `rev()` should return the sequence in reverse (Hint: try to use functions `strsplit()` and the existing base `rev()` function).

S3 inheritance

Reusing class methods

So far we have written methods for `GenericSeq` that work with any sequence type. Now lets introduce a new class `DnaSeq`. We want to **inherit** all methods from `GenericSeq` - to achieve this simply set the `class` attribute to all applicable class names.

```
> setSeqSubtype <- function(s){  
+   if (all( alphabet(s) %in% c("A", "C", "G", "T") )) {  
+     class(s) <- c("DnaSeq", "GenericSeq")  
+   } else if (all( alphabet(s) %in% c("A", "C", "G", "U") )) {  
+     class(s) <- c("RnaSeq", "GenericSeq")  
+   } else {  
+     stop("Alphabet ", alphabet(s) , " is unknown.")  
+   }  
  
+   return(s)  
+ }  
> s.dna <- setSeqSubtype(s)  
> class(s.dna)  
  
[1] "DnaSeq"      "GenericSeq"
```

DnaSeq methods

Define a DnaSeq method `comp()`. All GenericSeq methods still work with DnaSeq objects, but the `comp()` only works with DnaSeq.

```
> comp <- function(x, ...){ UseMethod("comp") }
> comp.DnaSeq <- function(x, ...)
+           chartr("ACGT", "TGCA", seq(x))
```

S3 inheritance continued

```
> id(s) # works on GenericSeq  
  
[1] "example"  
  
> id(s.dna) # works on DnaSeq, GenericSeq  
  
[1] "example"  
  
> comp(s) # fails with error  
  
Error in UseMethod("comp"): no applicable method for  
'comp' applied to an object of class "GenericSeq"  
  
> comp(s.dna)  
  
[1] "TGGATCTA"
```

S3 dispatch and inheritance

The dispatching will look for appropriate methods for all x (sub-)classes (in order in which they are set).

S3 inheritance exercise

Look at the inheritance code and understand how it works. Then solve the following exercise.

Exercise 7: (code: 04_inherit.R, solution: 04_inherit_solution.R)

Write the `comp()` method for `RnaSeq` class. Since we don't have a RNA FASTA file you will have to make a new `RnaSeq` object by hand and assign the right classes to test your code.

What do you notice about the S3 class system, is it easy to make mistakes? Could you also make your RNA sequence to be of class "lm"?

S3 class system revision

- Classes are implicit (no formal class definition)
- Making new objects is done by simply setting the `class` attribute
- Making class methods is done by defining a generic function `functionName()` and a normal function `functionName.className()`. Methods can be retrieved using the `methods()` function.
- Objects can inherit multiple classes by setting the `class` attribute to a vector of class names
- Many functions in base R use the S3 system
- Easy to make new ad-hoc classes and objects, but also mistakes and inconsistencies

The S4 class system was designed to address some of these concerns.

Mutability in S3 and S4

Mutability

R objects are not **mutable**; R has a **pass-by-value** semantics, consistently with functional programming semantics. Whenever^a you pass an object to a function, a copy is passed as argument; changes made to the object are local to the function call; the original object is unchanged. This is how things work for both S3 and S4 class systems.

^aAlthough, in general, R tries to avoid copying objects unless they are modified.

```
> seq(a)  
  
[1] "ACGTAA"  
  
> comp(a)  
  
[1] "TGCATT"  
  
> seq(a)  
  
[1] "ACGTAA"
```

Plan

1 Course introduction

2 Revision of basic R

3 Object-oriented (OO) Programming

4 S4 object oriented framework

5 S3 object oriented framework

6 **S4 Reference Classes**

Reference classes

- This paradigm uses **pass-by-reference** semantics: invoking a method may modify the content of the fields.
- Methods in this paradigm are associated with the object (rather than to generics)
- Java-like logic.
- See `?ReferenceClasses` for all the details.

Example

```
## here, you would have
> a$seq() ## equivalent of seq(a)
[1] "AGCATG"
> a$comp()
> a$seq()
[1] "TCGTAC"
```

Reference classes - objects and fields

Defining a reference class

Slots → a list of **fields**

```
> Seq <- setRefClass("Seq",  
+                     fields = list(  
+                         id = "character",  
+                         alphabet = "character",  
+                         sequence = "character"))
```

Generator objects

The return value of `setRefClass` is a **generator object** that is used to construct new object of given class.

Reference classes - methods

Defining a reference class

Methods → a list of **functions**

```
> Seq <- setRefClass("Seq",
+                     fields = list(
+                         id = "character",
+                         alphabet = "character",
+                         sequence = "character"),
+                     methods = list(
+                         comp = function() {
+                             "Complements the (DNA) sequence" ## inline docs
+                             sequence <-> chartr("ACGT", "TGCA", .self$sequence)
+                             id <-> paste(.self$id, "-- complemented")
+                         }
+                         ## there can be more, of course
+                     ))
```

Methods can be added either directly in class definition or later by calling `Seq$methods(functionName = function() { ...code... })`.

You also need to know that...

- accessing fields and calling methods is done with the `$` operator.
- the current object can be referred to in a method by the reserved name `.self`.
- Changing fields of an object within methods needs to be done with the `<<-` operator.

```
> s <- Seq$new(id="foo", sequence="GATCATCA")
> s
```

Reference class object of class "Seq"

Field "id":
[1] "foo"
Field "alphabet":
character(0)
Field "sequence":
[1] "GATCATCA"

```
> s$sequence
```

[1] "GATCATCA"

```
> s$comp()
> s$sequence
```

[1] "CTAGTAGT"

Suitable for...

Reference classes are suitable for objects that are *dynamically tracked* by all the code: GUI components, read-only access to files (streams, data bases), internet resources, editing facilities, ...

S4 introspection and methods exercises

Exercise 8: (code: 05_seqRefClass.R)

We implemented some more methods using Reference Classes. Read through the methods and make sure you understand how they work. Then try out the test code in 05_seqRefClass.R. What happens when we assign one Reference Class object to another?

Wrap up

- Object-oriented programming paradigm.
- S3 – easy, but can get unsafe; widely used in R .
- S4 – more verbose, but with more features (explicit classes, introspection, consistency and validity checks, multiple dispatch and inheritance, ...).
- Reference classes – pass-by-reference semantic, Java-like.

- Writing R Extensions, R Core team.
- `devtools` wiki.
- Robert Gentleman, R Programming for Bioinformatics, 2008.

- This work is licensed under a CC BY-SA 3.0 License
- Slides and other material:
<https://github.com/lgatto/TeachingMaterial>

Thank you for your attention.