## ETC4500/ETC5450 Advanced R programming

Week 7: Object-oriented programming (part 2)
arp.numbat.space


## Outline

1 Assignments
2 Programming paradigms

## 3 Object oriented programming

## Outline

## 1 Assignments

## 2 Programming paradigms

## 3 Object oriented programming

## Assignment 2

■ Questions?
■ Due 19 April 2024

## Outline

## 1 Assignments

2 Programming paradigms
3 Object oriented programming

## Programming paradigms

Functional programming (W5)

- Functions are created and used like any other object.
$\square$ Output should only depend on the function's inputs.


## Programming paradigms

Functional programming (W5)

- Functions are created and used like any other object.
- Output should only depend on the function's inputs.

Object-oriented programming (W6-W7)

- Functions are associated with object types.
- Methods of the same 'function' produce object-specific output.


## Programming paradigms

Literate programming (W7)
■ Natural language is interspersed with code.

- Aimed at prioritising documentation/comments.

■ Now used to create reproducible reports/documents.

## Programming paradigms

Literate programming (W7)

- Natural language is interspersed with code.
$\square$ Aimed at prioritising documentation/comments.
■ Now used to create reproducible reports/documents.
Reactive programming (W8)
■ Objects are expressed using code based on inputs.
- When inputs change, the object's value updates.


## Outline

## 1 Assignments

## 2 Programming paradigms

## 3 Object oriented programming

## Object oriented programming

## S3

- The 00 system used by most of CRAN.
$\square$ Very simple (and 'limited’) compared to other systems.


## Object oriented programming

## S3

- The 00 system used by most of CRAN.

■ Very simple (and 'limited’) compared to other systems.

## vctrs

$\square$ Builds upon S3 to make creating vectors easier.
■ Good practices inherited by default.

## S3 Recap: Objects and methods

Unlike most 00 systems where methods belong to objects/data, S3 methods belong to 'generic' functions. Recall that functions in $R$ are objects like any other.

## S3 Recap: Objects and methods

Unlike most OO systems where methods belong to objects/data, S3 methods belong to 'generic' functions.

Recall that functions in $R$ are objects like any other.

- Self awareness

In S3, there is no concept of 'self' since the relevant objects are available as function arguments. However S3 is self-aware of registered methods, allowing NextMethod () to call the S3 method of the inherited class.

## S3 Recap: S3 dispatch

To use S3, we call the generic function (e.g. plot()). plot
function ( $x, y, \ldots$ )
UseMethod("plot")
<bytecode: 0x55d378d131c8>
<environment: namespace:base>

## S3 Recap: S3 dispatch

## This function looks at the inputs and dispatches (uses) the appropriate method for the input variable class/type.

```
stats:::plot.density
function (x, main = NULL, xlab = NULL, ylab = "Density", type = "l",
    zero.line = TRUE, ...)
{
    if (is.null(xlab))
        xlab <- paste("N =", x$n, " Bandwidth =", formatC(x$bw))
    if (is.null(main))
        main <- sub("[.]default", "", deparse(x$call))
    plot.default(x, main = main, xlab = xlab, ylab = ylab, type = type,
            ...)
    if (zero.line)
    abline(h = 0, lwd = 0.25, col = "gray")
```


## S3 Recap: S3 dispatch

## If there isn't a registered method for the object, the default method for the generic will be used.

```
graphics:::plot.default
function (x, y = NULL, type = "p", xlim = NULL, ylim = NULL,
    log = "", main = NULL, sub = NULL, xlab = NULL, ylab = NULL,
    ann = par("ann"), axes = TRUE, frame.plot = axes, panel.first = NULL,
    panel.last = NULL, asp = NA, xgap.axis = NA, ygap.axis = NA,
    ...)
{
    localAxis <- function(..., col, bg, pch, cex, lty, lwd) Axis(...)
    localBox <- function(..., col, bg, pch, cex, lty, lwd) box(...)
    localWindow <- function(..., col, bg, pch, cex, lty, lwd) plot.window(...)
    localTitle <- function(..., col, bg, pch, cex, lty, lwd) title(...)
    xlabel <- if (!missing(x))

\section*{Creating an S3 generic}

S3 generics are work like any ordinary function, but they include Usemethod () which calls the appropriate method.

J Your turn!
Create an S3 generic called "reverse".
This function will reverse objects. For example,
■ reverse("stressed") becomes "desserts",
- reverse(7919) becomes 9197,

■ reverse(1.9599) becomes 9959.1.

\section*{Writing S3 methods}

An S3 method is an ordinary function with some constraints:
■ The function's name is of the form <generic>. <class>,
- The function's arguments match the generic's arguments,
\(\square\) The function is registered as an S3 method (for packages).
This looks like:
```

\#' Documentation for the method
\#' @method <generic> <class>
<generic>.<class> <- function(<generic args>, <method args>, ...) {
\# The code for the method
}

```

\section*{Writing S3 methods}

\section*{J Your turn!}

Write methods for reversing character, integer, and double objects.
■ reverse("stressed") becomes "desserts",
- reverse(7919L) becomes 9197L,

■ reverse(1.9599) becomes 9959.1.
Hint: stringi::stri_reverse() will reverse a string.
The integer and double methods should return an integer and double respectively.

\section*{Writing S3 defaults}

What if we tried to reverse the current date; reverse(Sys.Date())?

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J Your turn!
Question: what should the default behaviour be?

\section*{Writing S3 defaults}

What if we tried to reverse the current date; reverse(Sys.Date())?

J Your turn!
Question: what should the default behaviour be?
- Raise an error?

■ Return a reversed string?
■ Something else entirely?

\section*{Creating your own S3 objects}

\section*{S3 methods are (mostly) dispatched based on the class().}
```

class("stressed")

```
[1] "character"

\section*{class(7919L)}
[1] "integer"
class(1.9599)
[1] "numeric"

\section*{Creating your own S3 objects}

To create an S3 object, we add a class to an object. This is usually done with structure(), for example:
```

e <- structure(list(numerator = 2721, denominator = 1001), class = "fraction")
e

```
```

\$numerator
[1] 2721

```
\$denominator
[1] 1001
attr(,"class")
[1] "fraction"

\section*{Creating your own S3 objects}

The structure() function is usually only used within other functions made for end-users. For example,

■ lm() returns a list with class " lm ", and
■ tibble() returns a data.frame (list) with classes "tbl_df", "tbl", and "data.frame".

\section*{Creating your own S3 objects}

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■ lm () returns a list with class " lm ", and
\(\square\) tibble() returns a data.frame (list) with classes "tbl_df", "tbl", and "data.frame".

\section*{d Your turn!}

Create fraction(), which returns fraction objects.
This function should check that the inputs are suitable

\section*{Creating your own S3 objects}

The fraction class doesn't yet have any methods, so it inherits methods from its list type.

Usually we would create a method for printing S3 objects.
```

print.fraction <- function(x, ...) {
paste(x$numerator, x$denominator, sep = "/")
}
e

```

2721/1001

\section*{Creating your own S3 objects}
J. Your turn!

Create a reverse() method for the fraction object class, which inverts the numerator and denominator.

Finished early?
Write a method for converting a fraction into a number.

\section*{Creating your own S3 vectors (with vctrs)}

The vctrs package is helpful for creating custom vectors.
It is built upon S 3 , so the same approach for creating S3 generics and S3 methods also applies to vctrs.
- S3 or vctrs?
- Regular S3 is useful for creating singular objects

■ vctrs is useful for creating vectorised objects

\section*{Creating your own S3 vectors (with vctrs)}

Why vctrs?
vctrs simplifies the complicated parts in creating vectors
■ easy subsetting
- nice printing
- predictable recycling
- casting / coercion
- tidyverse compatibility

\section*{Examples of vctrs packages}

Lots of vctrs including:
■ IP addresses
- Spatial geometries
- Time
- uncertainty
https://github.com/krlmlr/awesome-vctrs

\section*{Some packages l've made that use vctrs}
- distributional

Distributions of various shapes in vectors
- mixtime

Time points/intervals of various granularities in vectors
- graphvec

Graph factors, storing graph edges between levels.
- fabletools

Custom data frames 'mable’, ‘fable’, and 'dable’.

\section*{Creating a new vctr}

The basic way to produce a vctr is with vctrs: : new_vctr(). Just like structure (), you provide an object and its new class. attendance <- vctrs::new_vctr(c(80, 70, 75, 50), class = "percent") attendance
<percent[4]>
[1] 80707550

\section*{Creating a new vctr}

As with S3, functions provide ways for users to create vectors.
```

percent <- function(x) {
vctrs::new_vctr(x, class = "percent")
}
attendance <- percent(c(80, 70, 75, 50))
attendance

```
<percent[4]>
[1] 80707550

\section*{Creating a new vctr}

Don't forget to check the inputs, vctrs provides helpful functions to make this easier and provide informative errors.
```

percent <- function(x) {
vctrs::vec_assert(x, numeric())
vctrs::new_vctr(x, class = "percent")
}
percent("80%")

```
Error in 'percent()':
! 'x' must be a vector with type <double>.
Instead, it has type <character>.

\section*{Creating a new vctr}

It's useful to provide default arguments in this function which creates a length 0 vector (similar to how empty vectors are created with numeric() and character()).
```

percent <- function(x = numeric()) {
vctrs::vec_assert(x, numeric())
vctrs::new_vctr(x, class = "percent")
}
percent()

```
<percent[0]>

\section*{Creating a new vctr}

While vctrs provides a nice print method, we need to specify how our vector should be formatted.
```

format.percent <- function(x, ...) {
paste0(vctrs::vec_data(x), "%")
}
attendance
<percent[4]>
[1] 80% 70% 75% 50%

```

\section*{The rcrd type}

A special type of vctr is a record (rcrd).
A record is a list containing equal length vectors, and its size is the length its vectors rather than its list.

9 Record indexing
Usually in R, indexing happens across the list. With the record type, indexing happens within the list's vectors.

\section*{The rcrd type}

\section*{- Length of a data frame}

Usually the length of data refers to the number of rows, but in \(R\) it is the number of columns since it is a list.
length (mtcars)
[1] 11
In vctrs, data is a record so we get the number of rows.
vctrs: :vec_size(mtcars)
[1] 32

\section*{Creating a new rcrd}

A record is created with the vctrs: : new_rord() function.
```

wallet <- vctrs::new_rcrd(
list(amt = c(10, 38), unit = c("AU\$", "¥")), class = "currency"
)
format.currency <- function(x, ...) {
paste0(vctrs::field(x, "unit"), vctrs::field(x, "amt"))
}
wallet

```
<currency[2]>
[1] AU\$10 \(¥ 38\)

\section*{Creating a new rcrd}

J Your turn!
Rewrite the fraction() function to use the rcrd data type.
You will also need to update the methods:
■ Obtain the numerator and denominator with field().
- Replace the print method with a format method.
- Remove the print. fraction method with rm().

\section*{The list_of type}
list_of() vectors require list elements to be the same type.
It can be created with list_of(), or more easily converted to with as_list_of(). It behaves identically to new_vctr().
```

vctrs::as_list_of(list(80, 70, 75, 50), .ptype = numeric())

```
<list_of<double>[4]>
[[1]]
[1] 80
[[2]]
[1] 70
[[3]]
[1] 75

\section*{Prototypes}

Notice the .ptype when we used as_list_of()?
ptype is shorthand for prototype, which is a size-0 vector.
Q Prototype attributes!
Prototypes contains all relevant attributes of the object, such as class, dimension, and levels of factors.

\section*{Prototypes}

\section*{Obtain prototypes of a vector with vctrs: :vec_ptype().}
```

vctrs::vec_ptype(1:10)

```
```

integer(0)

```
```

vctrs::vec_ptype(rnorm(10))

```
numeric(0)
vctrs::vec_ptype(factor(letters))
factor()
Levels: \(a b c d e f g h i j k l m n o p q r s t u v w x y z\)
vctrs::vec_ptype(attendance)
<percent[0]>

\section*{vctr, rcrd, or list_of?}

\section*{S Your turn!}

What's better? The vctr type or list_of?

\section*{vctr, rcrd, or list_of?}

\section*{J Your turn!}

What's better? The vctr type or list_of?
It depends! If your vector is based on...
- a single atomic vector (like percent) then vctr,
\(\square\) two or more atomic vectors (like fraction), then rcrd,
- complicated objects (like lm), then list_of.

\section*{That's it! You have created a new vector for R!}
i Time to celebrate with a break!
Ask questions, try using your new vector in various ways.

\section*{Methods for vctrs}

While our new vectors looks pretty and fits right in with our tidy tibbles, it isn't very useful yet.
- Adding features

Since vctrs is built upon S3, the same approach for creating generic functions and methods applies to vctrs.

\section*{Methods for vctrs}

While our new vectors looks pretty and fits right in with our tidy tibbles, it isn't very useful yet.
- Adding features

Since vctrs is built upon S 3 , the same approach for creating generic functions and methods applies to vctrs.

However there are also some important vector specific methods which should be written to improve usability.

\section*{(Proto)typing}

We saw earlier how \(R\) coerces vectors of different types.
c("desserts", 10)
[1] "desserts" "10"
c(pi, 0L)
[1] 3.140 .00
\(c(-1\), TRUE, FALSE)
[1] \(-1 \quad 1 \quad 0\)
c(1, Sys.Date())
[1] 119850

\section*{(Proto)typing}

When combining or comparing vectors of different types, R will (usually) coerce to the 'richest' type.
double date-time character

\section*{(Proto)typing}
vctrs doesn't make any assumptions about how to coerce your vector, and instead raises an error.
```

library(vctrs)
vec_c(attendance, 0.8)
Error in `vec_c()`:
! Can't combine `..1` <percent> and `..2` <double>.

```

\section*{(Proto)typing}

\section*{We can specify what the common ('richest') type is by writing vctrs::vec_ptype2() methods.}
```

\#' @export
vec_ptype2.percent.double <- function(x, y, ...) {
percent() \# Prototype since this produces size-0
}
vctrs::vec_ptype2(attendance, 0.8)
<percent[0]>

```
```

vctrs::vec_ptype2(0.8, attendance)

```
```

vctrs::vec_ptype2(0.8, attendance)

```
```

Error:
! Can't combine `0.8` <double> and `attendance` <percent>.

```

\section*{(Proto)typing}

Common typing uses double-dispatch.
We need to define the common type in both directions.
```

\#' @export
vec_ptype2.double.percent <- function(x, y, ...) {
percent() \# Prototype since this produces size-0
}
vctrs::vec_ptype2(attendance, 0.8)
<percent[0]>
vctrs::vec_ptype2(0.8, attendance)
<percent[0]>

```

\section*{(Proto)typing}

J Your turn!
Write methods that define the common (proto)type between fraction and double as fraction -> double.

\section*{Double dispatch}
```

Unfortunately c() from base R can't (yet) be changed to support double-dispatch with S3. Usually this isn't a problem,

```
```

c(attendance, attendance)

```
c(attendance, attendance)
<percent[8]>
[1] 80% 70% 75% 50% 80% 70% 75% 50%
c(attendance, 0.8)
<percent[5]>
[1] 80% 70% 75% 50% 0.8%
```


## Double dispatch

but if your class isn't used in the first argument...
$c(0.8$, attendance)
[1] 0.880 .070 .075 .050 .0
... your common (proto)type will be ignored!

## Double dispatch

vctrs uses double dispatch when needed, and using vctrs: :vec_c() fixes many coercion problems in R.

```
vctrs::vec_c(0.8, attendance)
```

<percent[5]>
[1] $0.8 \%$ 80\% 70\% 75\% 50\%

```
vctrs::vec_c(1, Sys.Date())
```

Error in 'vctrs: :vec_c()':
! Can't combine `..1' <double> and '..2` <date>.

## Double dispatch

i Double dispatch inheritence
Double dispatch in vctrs doesn't work with inheritance and SO:

- NextMethod() can't be used
- Default methods aren't inherited/used.


## Casting and coercion

! Converting percentages
Notice earlier how combining percentages with numbers gave the incorrect result?
This is because we haven't written a method for converting numbers into percentages.

The vctrs:: vec_cast() generic is used to convert/coerce ('cast') one type into another. Time to write more methods!

## Casting and coercion

vctrs: : vec_cast() also uses double dispatch.

```
vec_cast.double.percent <- function(x, to, ...) {
    vec_data(x)/100
}
vec_cast.percent.double <- function(x, to, ...) {
    percent(x*100)
}
vec_cast(0.8, percent())
```

<percent[1]>
[1] 80\%
vec_cast(percent(80), double())

## Casting and coercion

With both vec_ptype2() and vec_cast() methods for percentages and doubles it is now possible to combine them.

```
vctrs::vec_c(0.8, attendance)
```

<percent[5]>
[1] 80\% 80\% 70\% 75\% 50\%

We can also use coercion to easily perform comparisons.

```
attendance > 0.7
```

[1] TRUE FALSE TRUE FALSE

## Casting and coercion

J Your turn!
Write a method for casting from a fraction to a double. Does this work with as.numeric()?

## Math and arithmetic

Methods also need to be written for math and arithmetic. vec_math () implements mathematical functions like

```
mean(attendance)
```

<percent[1]>
[1] 68.75\%
vec_arith() implements arithmetic operations like
attendance + percent(0.1)
Error in `vec_arith()`:
! <percent> + <percent> is not permitted

## Math and arithmetic

Since attendance is a simple numeric, the default vec_math method works fine. The default vec_math function is essentially:

```
vec_math.percent <- function(.fn, .x, ...) {
    out <- vec_math_base(.fn, .x, ...)
    vec_restore(out, .x)
}
```

1 Apply the math to the underlying numbers
2. Restore the percentage class

## Math and arithmetic

```
Unlike double dispatch in vec_ptype2() and vec_cast(), we currently need to implement our own secondary dispatch for vec_arith().
```

```
vec_arith.percent <- function(op, x, y, ...) {
```

vec_arith.percent <- function(op, x, y, ...) {
UseMethod("vec_arith.percent", y)
UseMethod("vec_arith.percent", y)
}
}
vec_arith.percent.default <- function(op, x, y, ...) {
vec_arith.percent.default <- function(op, x, y, ...) {
stop_incompatible_op(op, x, y)
stop_incompatible_op(op, x, y)
}

```
}
```


## Math and arithmetic

## Then we can create methods for arithmetic.

```
vec_arith.percent.percent <- function(op, x, y, ...) {
    out <- vec_arith_base(op, x, y)
    vec_restore(out, to = percent())
}
percent(40) + percent(20)
```

<percent[1]>
[1] 60\%

## Math and arithmetic

## Then we can create methods for arithmetic.

```
vec_arith.percent.numeric <- function(op, x, y, ...) {
    out <- vec_arith_base(op, x, vec_cast(y, percent()))
    vec_restore(out, to = percent())
}
percent(40) + 0.3
```

<percent[1]>
[1] 70\%
$0.3+\operatorname{percent}(40)$
Error in 'vec_arith()':
! <double> + <percent> is not permitted

## Math and arithmetic

## Then we can create methods for arithmetic.

```
vec_arith.numeric.percent <- function(op, x, y, ...) {
    out <- vec_arith_base(op, vec_cast(x, percent()), y)
    vec_restore(out, to = percent())
}
percent(40) + 0.3
```

<percent[1]>
[1] 70\%
$0.3+\operatorname{percent}(40)$
<percent[1]>
[1] 70\%

## Math and arithmetic

## J Your turn!

Add support for math and arithmetic for the fraction class.
Hint: cast your fraction to a double and then use the base math/arith function, returning a double is fine.

Finished early?
Try to extend vec_arith() so that it retains the fraction class for,,$+- \star$, / operations.

