# Apply functions by time

### MANIPULATING TIME SERIES DATA WITH XTS AND ZOO IN R



**Jeffrey Ryan** Creator of xts and quantmod



## Topics

- Applying functions on discrete periods or intervals
- Two main approaches
  - period.apply() 0
  - split() 0



## Apply by period

### period.apply(x, INDEX, FUN, ...)

- period.apply() extends R's apply functions to time
- Pass an object x to be modified  $\bullet$
- **INDEX** is the vector of **end points** of a period
- **FUN** is the function to apply
- Additional arguments are passed to **FUN** (if needed)



## Finding endpoints

endpoints(x, on = "years")

- Defined as the index of the last observation per interval  $\bullet$
- Intervals are defined with the on argument
  - Uses "days", "years", "quarters", etc.
- Always starts on 0 and ends on the last observation  $\bullet$



## period.apply() in action

```
edhec_4yr <- edhec["1997/2001"]
ep <- endpoints(edhec_4yr, "years")</pre>
period.apply(edhec_4yr, INDEX = ep, FUN = mean)
```

|            | Convertible Arbitrage |
|------------|-----------------------|
| 1997-12-31 | 0.01159167            |
| 1998-12-31 | 0.00270000            |
| 1999-12-31 | 0.01251667            |
| 2000-12-31 | 0.01377500            |
| 2001-12-31 | 0.01086667            |

Shortcut functions: apply.monthly() , apply.yearly() , apply.quarterly() , etc.



### split.xts

- Split data into chunks of time
- Great control for discrete periods
- Uses standard period names

```
# S3 method for class xts
split(x, f = "months")
edhec.qtrs <- split(edhec[, 1], f = "quarters")
edhec.qtrs[[3]]</pre>
```

|            | Convertible Arbitrage |
|------------|-----------------------|
| 1997-07-31 | 0.0193                |
| 1997-08-31 | 0.0134                |
| 1007_00_30 | <u> </u>              |

### R datacamp

# Let's practice!



# **Converting periodicity**

MANIPULATING TIME SERIES DATA WITH XTS AND ZOO IN R



Jeffrey Ryan Creator of xts and quantmod



## **Time series aggregation**

- Useful to convert a univariate series to range bars
  - OHLC: Open, High, Low, and Close
- Summary of a particular period
  - Starting, maximum, minimum and ending value 0



## Aggregate using xts

```
to.period(x,
    period = "months",
    k = 1,
    indexAt,
    name = NULL,
    OHLC = TRUE,
    ...)
```

- period controls aggregation period
- name string renames column roots
- indexAt allows for index alignment



## Aggregate OHLC

to.period(edhec["1997/2001", 1], "years", name = "EDHEC")

|            | EDHEC.Open | EDHEC.High | EDHEC.Low | EDHEC.Close |
|------------|------------|------------|-----------|-------------|
| 1997-12-31 | 0.0119     | 0.0212     | 0.0000    | 0.0068      |
| 1998-12-31 | 0.0145     | 0.0269     | -0.0319   | 0.0113      |
| 1999-12-31 | 0.0219     | 0.0243     | 0.0045    | 0.0140      |
| 2000-12-31 | 0.0227     | 0.0267     | -0.0081   | -0.0002     |
| 2001-12-31 | 0.0344     | 0.0344     | -0.0094   | -0.0094     |



## Aggregate OHLC (cont.)

to.period(edhec["1997/2001", 1], "years", name = "EDHEC", indexAt = "firstof")

|            | EDHEC.Open | EDHEC.High | EDHEC.Low | EDHEC.Close |
|------------|------------|------------|-----------|-------------|
| 1997-12-01 | 0.0119     | 0.0212     | 0.0000    | 0.0068      |
| 1998-12-01 | 0.0145     | 0.0269     | -0.0319   | 0.0113      |
| 1999-12-01 | 0.0219     | 0.0243     | 0.0045    | 0.0140      |
| 2000-12-01 | 0.0227     | 0.0267     | -0.0081   | -0.0002     |
| 2001-12-01 | 0.0344     | 0.0344     | -0.0094   | -0.0094     |



## Aggregate without range bars

- You can aggregate without range bars
- xts offers two main methods for this
  - Force a univariate series in to.period() 0

```
\# OHLC = FALSE
to.period(object[, j], period = "years",
            name = "NAME", OHLC = FALSE)
```

Extract the period values directly 

```
# Extract directly
object[endpoints(object, "years"), j]
```



|            | Convertible Art | oitrage |
|------------|-----------------|---------|
| 1997-12-31 |                 | 0.0068  |
| 1998-12-31 |                 | 0.0113  |
| 1999-12-31 |                 | 0.0140  |

# Extract directly
edhec[endpoints(edhec, "years"), 1]

|            | Convertible Arbitrage |
|------------|-----------------------|
| 1997-12-31 | 0.0068                |
| 1998-12-31 | 0.0113                |
| 1999-12-31 | 0.0140                |

### R datacamp

# Let's practice!



# **Rolling functions**

### MANIPULATING TIME SERIES DATA WITH XTS AND ZOO IN R



Jeffrey Ryan Creator of xts and quantmod











| "2016-01" "20 | 016-02" "2016-03" | "2016-04" | "2016-05" | "2016-06" |
|---------------|-------------------|-----------|-----------|-----------|
|---------------|-------------------|-----------|-----------|-----------|



| "2016-01" "2016-02" "2016-03" | "2016-04" | "2016-05" | "2016-06" |
|-------------------------------|-----------|-----------|-----------|
|-------------------------------|-----------|-----------|-----------|



| "2016-01" "2 | 2016-02" | "2016-03" | "2016-04" | "2016-05" | "2016-06" |
|--------------|----------|-----------|-----------|-----------|-----------|
|--------------|----------|-----------|-----------|-----------|-----------|



| "2016-01" "2016-02" | "2016-03" | "2016-04" | "2016-05" | "2016-06" |
|---------------------|-----------|-----------|-----------|-----------|
|---------------------|-----------|-----------|-----------|-----------|



| "2016-01" "2016-02" "2016-03" | "2016-04" | "2016-05" | "2016-06" |
|-------------------------------|-----------|-----------|-----------|
|-------------------------------|-----------|-----------|-----------|



| "2016-01" " | '2016-02" | "2016-03" | "2016-04" | "2016-05" | "2016-06" |
|-------------|-----------|-----------|-----------|-----------|-----------|
|-------------|-----------|-----------|-----------|-----------|-----------|



## **Discrete rolling windows**

- split() to break up by period
- lapply() cumulative functions

cumsum(), cumprod(), cummin(), cummax() 0

x <- xts(c(1, 2, 3), as.Date("2016-01-01") + 0:2)</pre> cbind(x, cumsum(x))

|            | 1 | 2 |
|------------|---|---|
| 2016-01-01 | 1 | 1 |
| 2016-01-02 | 2 | 3 |
| 2016-01-03 | 3 | 6 |



## Discrete rolling windows

edhec.yrs <- split(edhec[, 1], f = "years")
edhec.yrs <- lapply(edhec.yrs, cumsum)
edhec.ytd <- do.call(rbind, edhec.yrs)</pre>

cbind(edhec.ytd, edhec[, 1])["2007-10/2008-03"]

|            | Convertible.Arbitrage | Convertible.Arbitrage.1 |  |
|------------|-----------------------|-------------------------|--|
| 2007-10-31 | 0.0594                | 0.0177                  |  |
| 2007-11-30 | 0.0463                | -0.0131                 |  |
| 2007-12-31 | 0.0386                | -0.0077                 |  |
| 2008-01-31 | -0.0009               | -0.0009                 |  |
| 2008-02-29 | -0.0092               | -0.0083                 |  |
| 2008-03-31 | -0.0409               | -0.0317                 |  |

### R datacamp

## **Continuous rolling windows**

```
rollapply(data, width, FUN, ...,
          by = 1, by.column = TRUE,
          fill = if (na.pad) NA,
          na.pad = TRUE, partial = TRUE,
          align = c("right", "center", "left"))
```

- data is your xts object
- width is the the window size
- **FUN** is your function to apply
- Can add additional arguments to your function



## **Continuous rolling windows**

rollapply(edhec["200701/08", 1], 3, mean)

|            | Convertible Arbitrage |
|------------|-----------------------|
| 2007-01-31 | NA                    |
| 2007-02-28 | NA                    |
| 2007-03-31 | 0.010233333           |
| 2007-04-30 | 0.006766667           |
| 2007-05-31 | 0.006533333           |
| 2007-06-30 | 0.004900000           |
| 2007-07-31 | 0.002266667           |
| 2007-08-31 | -0.006233333          |

tacamp

# Let's practice!

