



Extracting columns from financial time series



OHLC

- Stands for "Open High Low Close"
- Open and Close: first and last observed prices
- High and Low: largest and smallest observed prices
- Often Volume: sum of all contracts traded



OHLC data

```
> head(DC)
                     DC.Open DC.High DC.Low DC.Close DC.Volume
                       20.84
                               20.85
                                      20.83
 2016-01-16 01:00:00
                                                20.84
                                                            157
 2016-01-16 02:00:00
                                                            214
                       20.85
                               20.85
                                       20.83
                                                20.85
 2016-01-16 03:00:00
                               20.85
                                                20.85
                                                            103
                       20.85
                                       20.84
 2016-01-16 04:00:00
                               20.85
                       20.85
                                       20.84
                                                20.85
                                                            180
 2016-01-16 05:00:00
                       20.85
                               20.85
                                       20.84
                                                20.85
                                                            211
 2016-01-16 06:00:00
                                                             35
                       20.84
                               20.85
                                       20.84
                                                20.85
```



Single-column extractor functions

- Op() opening price
- Hi() high price
- Lo() low price
- Cl() close price
- Vo() traded volume
- Ad() adjusted close price



Single-column extractor functions

```
> # Open price
> dc_open <- Op(DC)</pre>
> head(dc_open, 4)
                      DC.Open
                        20.84
2016-01-16 01:00:00
2016-01-16 02:00:00
                        20.85
 2016-01-16 03:00:00
                        20.85
 2016-01-16 04:00:00
                        20.85
> # High price
> dc_high <- Hi(DC)</pre>
> head(dc_high, 4)
                      DC.High
2016-01-16 01:00:00
                       20.85
2016-01-16 02:00:00
                       20.85
2016-01-16 03:00:00
                       20.85
2016-01-16 04:00:00
                       20.85
```



Multi-column extractor functions

```
> # Extract multiple columns
> dc_ohlc <- OHLC(DC)</pre>
> head(dc_ohlc)
                   DC.Open DC.High DC.Low DC.Close
2016-01-16 01:00:00
                            20.85
                    20.84
                                   20.83
                                            20.84
                    20.85 20.85
                                  20.83
2016-01-16 02:00:00
                                         20.85
                          20.85 20.84
                                          20.85
2016-01-16 03:00:00
                  20.85
2016-01-16 04:00:00
                    20.85
                          20.85 20.84
                                          20.85
2016-01-16 05:00:00
                    20.85 20.85
                                  20.84
                                            20.85
2016-01-16 06:00:00
                            20.85 20.84
                                            20.85
                    20.84
```



getPrice()

- 3 arguments
 - x: object that contains data
 - symbol: optional symbol if x contains multiple symbols
 - prefer: optional preferred price
- If prefer not specified:
 - price, then trade, then close





Extract other columns using getPrice()

```
> head(DC)
                      Price Volume Bid.Price Bid.Size Ask.Price Ask.Size
                         NA
                                NA
 2016-01-16 00:00:07
                                        20.84
                                                   198
                                                            20.85
                                                                        684
 2016-01-16 00:00:08
                                        20.84
                         NA
                                                   198
                                                            20.85
                                                                        683
 2016-01-16 00:00:08
                                                            20.85
                         NA
                                        20.84
                                                                        682
                                                   198
 2016-01-16 00:00:11
                         NA
                                        20.84
                                                   198
                                                            20.85
                                                                        683
 2016-01-16 00:00:25
                                        20.84
                                                            20.85
                                                   198
                                                                        684
 2016-01-16 00:00:44 20.84
                                        20.84
                                                   198
                                                            20.85
                                                                        684
> dc_bid <- getPrice(DC, prefer = "bid")</pre>
> head(dc_bid)
                      Bid.Price
 2016-01-16 00:00:07
                          20.84
 2016-01-16 00:00:08
                          20.84
 2016-01-16 00:00:08
                          20.84
 2016-01-16 00:00:11
                          20.84
                          20.84
 2016-01-16 00:00:25
 2016-01-16 00:00:44
                          20.84
```





Let's practice!





Importing and transforming multiple instruments



Aggregating with Quandl()

- Use collapse argument to aggregate
 - daily
 - weekly
 - monthly
 - quarterly
 - annual
- Always returns last observation for given time period
 - Can cause issues for some columns (e.g. opening price)



Transforming with Quandl()

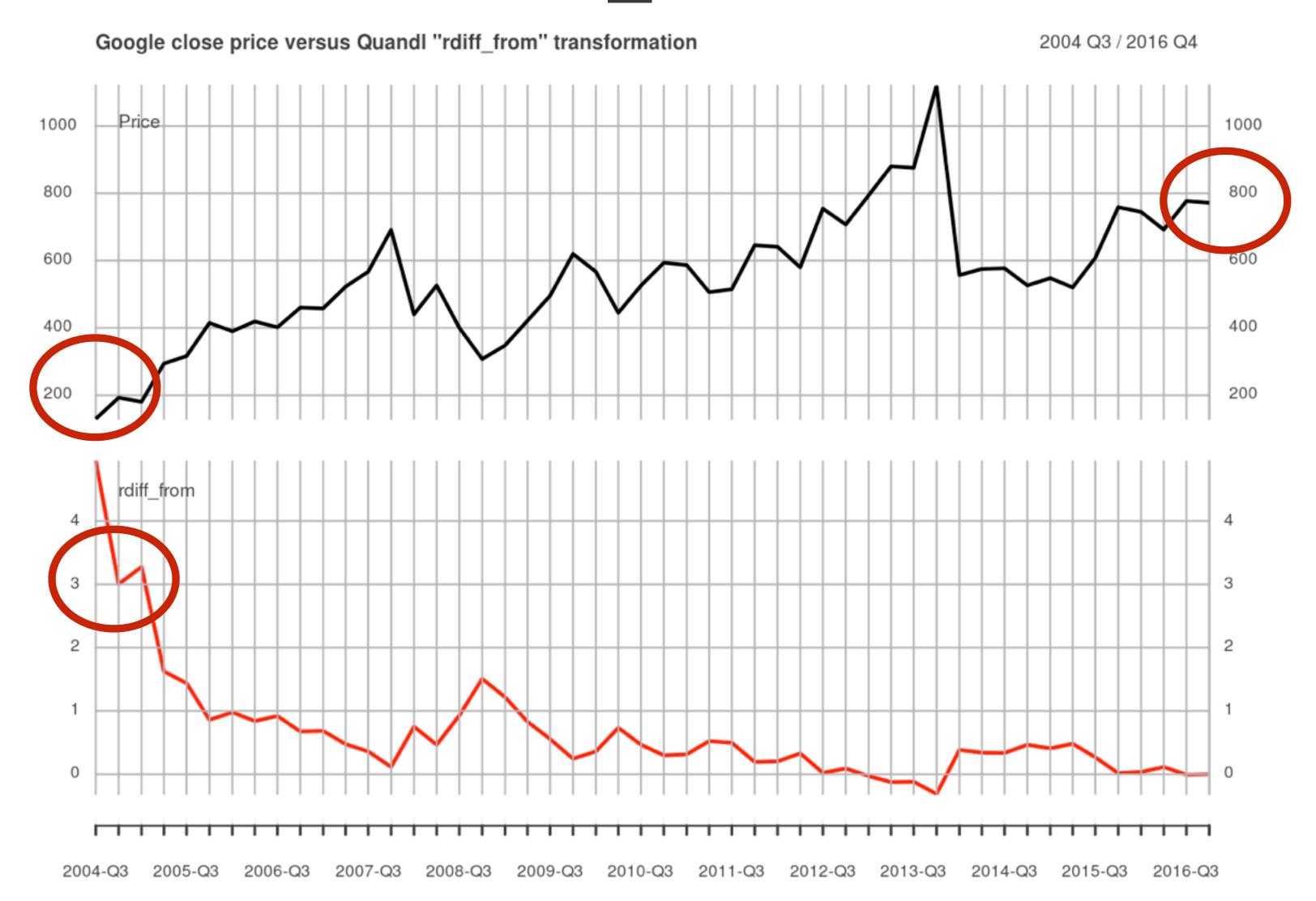
 Use transform argument to perform simple calculations before downloading

Name	Effect	Formula
none	no effect	$y_t' = y_t$
diff	row-on-row change	$y_t' = y_t - y_{t-1}$
rdiff	row-on-row % change	$y_t' = (y_t - y_{t-1})/y_{t-1}$
rdiff-from	latest value as % increment	$y_t' = (y_{latest} - y_t)/y_t$
cumul	cumulative sum	$y_t' = y_0 + y_1 + \dots + y_t$
normalize	scale series to start at 100	$y_t' = y_t \div y_0 * 100$





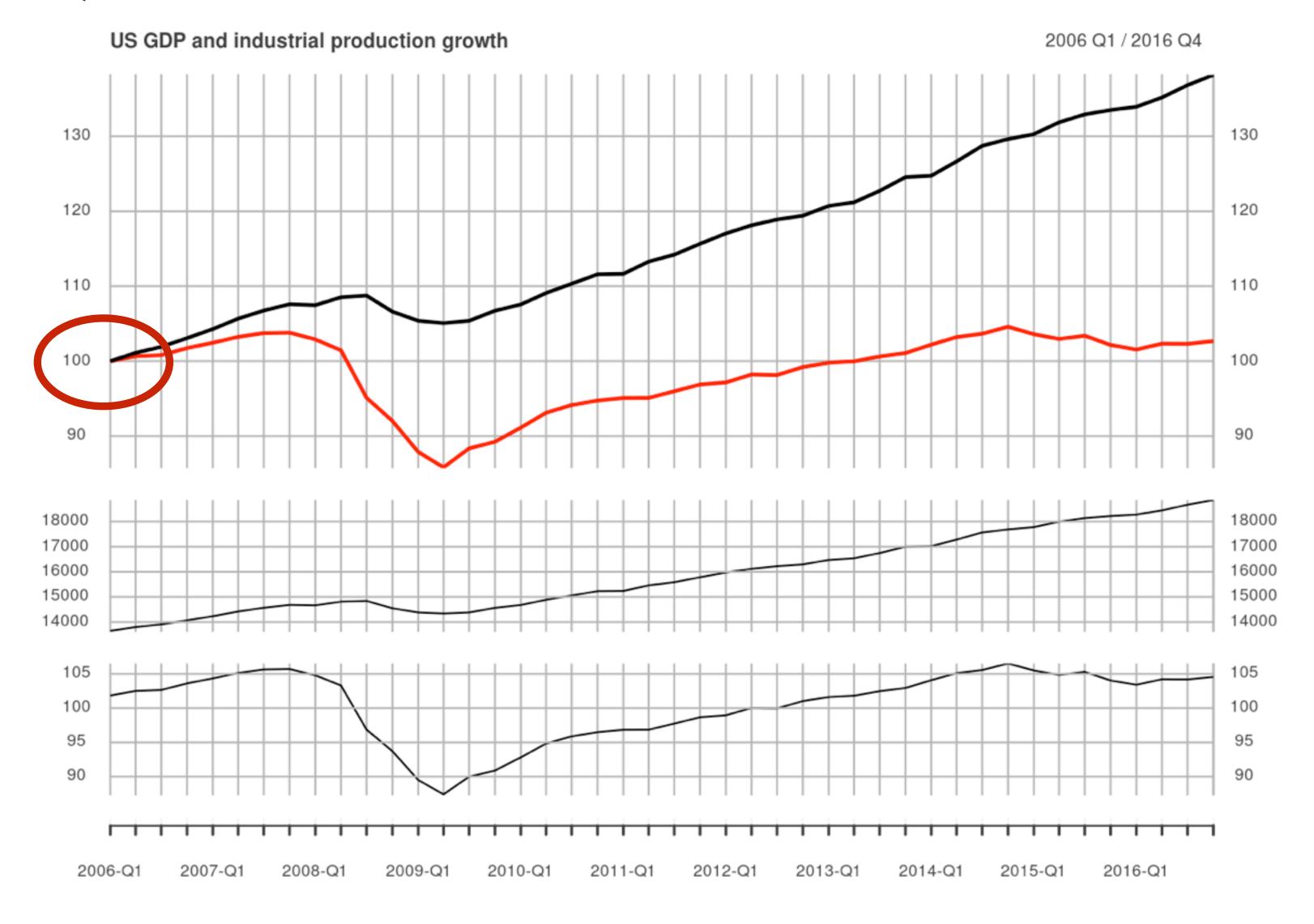
Quandl rdiff_from transformation







Quandl normalize transformation





Download instruments into a custom environment

```
> # Create new environment
> data_env <- new.env()</pre>
> # Use getSymbols to load data into the environment
> getSymbols(c("SPY", "QQQ"), env = data_env, auto.assign = TRUE)
   "SPY" "QQQ"
> # Look at a few rows of the SPY data
> head(data_env$SPY)
            SPY.Open SPY.High SPY.Low SPY.Close SPY.Volume SPY.Adjusted
              142.25
                       142.86
 2007-01-03
                               140.57
                                         141.37
                                                   94807600
                                                                114.8094
 2007-01-04
             141.23
                       142.05
                               140.61
                                         141.67
                                                  69620600
                                                                115.0530
2007-01-05
             141.33
                       141.40
                               140.38
                                         140.54
                                                                114.1353
                                                  76645300
 2007-01-08
              140.82
                       141.41
                               140.25
                                         141.19
                                                  71655000
                                                                114.6632
              141.31
 2007-01-09
                       141.60
                               140.40
                                         141.07
                                                  75680100
                                                                114.5658
                                         141.54
 2007-01-10
              140.58
                       141.57
                               140.30
                                                   72428000
                                                                114.9475
```



Using lapply()

- Loops over all objects in environment
- Combine list of function results into one object using do.call()
 - First argument (what) is the function to be called
 - Second argument (args) is a list of arguments to pass





Extract volume and merge into one object

```
> # Extract volume column from each object
> adjusted_list <- lapply(data_env, Ad)</pre>
> # Merge each list element into one object
> adjusted <- do.call(merge, adjusted_list)</pre>
> head(adjusted)
            QQQ.Adjusted SPY.Adjusted
                39.47694
2007-01-03
                             114.8094
 2007-01-04 40.22558
                             115.0530
 2007-01-05
             40.03385
                             114.1353
 2007-01-08
              40.06124
                             114.6632
 2007-01-09
                40.26210
                             114.5658
 2007-01-10
                40.73684
                             114.9475
> # The above is equivalent to:
> more_typing <- merge(adjusted_list[[1]], adjusted_list[[2]])</pre>
```





Let's practice!