

Introduction

While many tools currently exist within R to manage different stages of the quantitative trading process, no single mechanism exists to manage the entire workflow from [data management](#) and [alpha exploration](#) to [signal generation](#) and [post-trade analysis](#).

After a brief discussion on R-sig-Finance in 2006 regarding the pros and cons of a complete R workflow, the author decided that the R community needed an option to manage as much of the process from within R as possible.

More details, as well as examples of the **quantmod** package, can be found online at <http://www.quantmod.com>

What quantmod IS:

- ▶ A **workflow tool** to manage the various steps involved in quantitative financial modelling and trading. *100% R workflow.*
- ▶ An **unobtrusive wrapper to R** functionality, offering the analyst full access to both core and contributed tools without having to learn multiple interfaces, all while streamlining the process by removing non-core programming tasks.
- ▶ A **new way to manage financial data in R** - regardless of frequency, source, or class - through an innovative uniform interface
- ▶ Easy to extend and integrate into any current modelling workflow -- **use what you like and only what you like.**

What quantmod IS NOT:

- ▶ It is **NOT** a replacement for *Rmetrics*, *PerformanceAnalytics*, *portfolio*, or any other statistical or financial package in R.
- ▶ It is **NOT** a simplification of current tools - its sole purpose is to standardize the interface to certain tools - speeding the process of model development for trading.
- ▶ It is **NOT** meant to be used alone. Rather, it is meant to complement the current R tools, with a focus on workflow efficiencies and through the addition of functionality not available elsewhere in R.
- ▶ Most importantly - **It is NOT complete...**

The quantmod workflow

Pre-Modelling

Managing data for trading can be a challenge, as an analyst is presented with data of varying frequency and source, which must be processed into one data object for model construction purposes.

```
getSymbols("IBM", src="yahoo",
           return.class="its")
```

Simple interface to fetch data from a variety of sources and coerce to the specified class.

```
setSymbolsLookup(IBM='MySQL')
```

Set defaults to streamline process

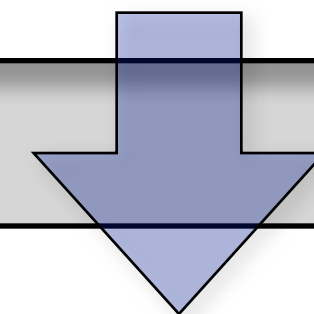
```
buildData(Next(Op(T))~OpCl(T))
```

Given a formula, automatically construct a dataset *without* explicitly loading or managing the underlying data.

The result is a data object that can be used for external analysis.

```
specifyModel(Next(Op(T))~OpCl(T))
```

Creates a quantmod object for use within the quantmod workflow. Data may also be extracted from the object with a call to `modelData`.



Modelling

Once the data has been processed it can be used by any function within R, either as an extracted data object, or as a **quantmod** object. Within the **quantmod** workflow the next step is `buildModel`, a wrapper function to many of R's most applicable univariate fitting methods.

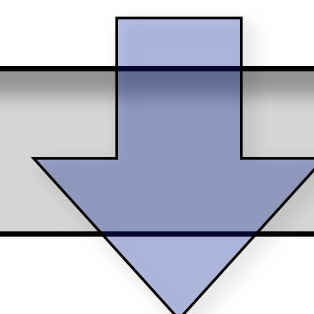
Currently implemented `buildModel` methods include:

```
lm [stats], glm [stats], loess [stats], ppr [stats],
rpart [rpart], tree [tree], randomForest [randomForest],
mars [mda], polymars [polyspline], lars [lars], rq [quantreg], lqs [MASS],
rlm [MASS], nnet [nnet].
```

```
buildModel(my.quantmod.object, method="ppr", training.per=c('2006-01-01','2006-03-01'))
```

Simply pass a model specified with `specifyModel` and specify the method desired. Any further arguments to the underlying method can be included after the training period argument.

Additional wrappers for new methods may added by the user via `buildModel.skeleton`.



Post-Modelling

After a model has been constructed, it is desirable to analyse the fit, as well as apply new data to examine the model's potential return and risk. With an emphasis on tools external to the **quantmod** package, a variety of methods are available to **extract the fitted model**, as well as **calculate a return series** given additional trading rules, such as leverage, stop-loss rules, and transaction cost accounting.

"Trade" model and evaluate ...

```
traded<-tradeModel(x, leverage=2,
                  trade.rule=end.of.day)
```

Simulate trading of model over full dataset calculating basic return and risk measures.

Additional "trade.rules" may be user specified.

... using standard R tools

```
fittedModel(my.quantmod)
```

Extract fitted object. Examine residuals, coefficients, etc.

```
monthlyReturn(traded)
```

Get returns suitable for *PerformanceAnalytics* analysis.

...or quantmod tools.

```
modelReturns(traded):
```

Summary return measures

```
modelRisk(traded):
```

Summary risk measures

```
modelAnalysis(traded):
```

Summary of risk and return

The future of quantmod

As development moves toward a release version of 1.0, some particular areas of interest are:

- ▶ Continue to integrate packages of interest to the finance community into the quantmod workflow.
- ▶ Continue to add new `buildModel` wrappers to extend the options during the modelling stage of development
- ▶ Continue to add new data source methods to `getSymbols`, including ODBC and additional database drivers, internet downloads (public and commercial), and proprietary data feeds (Bloomberg, Interactive Brokers, etc.)
- ▶ Improve model analysis routines within the package, to minimize any gaps in typical workflow usage
- ▶ Add a `modelSignificance` function, to include Monte-Carlo studies, as well as exploration of random portfolios.
- ▶ New graphics for risk, return and significance analysis
- ▶ Add mechanisms to manage stored models.
- ▶ **Solicit input and contributions from the R community.**

Acknowledgments

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