

Financial Time-Series Tools

xts and chartSeries

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Part I - xts

- The Idea Behind xts
- User Benefits
- Developer Benefits
- Summary





Part II - quantmod

- Why quantmod
- getSymbols
- chartSeries
- Summary



Extensible Time-Series

Jeffrey A. Ryan and Joshua M. Ulrich

http://xts.r-forge.r-project.org

The Idea

Provide for uniform handling of R's different time-based data classes, maximizing native format information preservation and allowing for user level customization and extension, while simplifying cross-class interoperability. (from the xts DESCRIPTION file)

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Simplify time-series data!

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- 2. Requires indexing based on a recognized timebased class

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Any of POSIXct, Date, chron, timeDate, yearmon, or yearqtr

- 3. Allows arbitrary hidden attributes with xtsAttributes
- 4. Tools for lossless conversion among classes as.xts, try.xts, reclass, and Reclass

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Let's start by looking at using xts...

Using xts

- as.xts()
- Time-based tools

first(), last(), [.xts, to.period(), and period.apply()

reclass()

Create an object

• Convert automatically with as.xts():

ts, data.frame, matrix, zoo, timeSeries, its, irts, and xts.

- Add additional meta-data with ... arg at construction, or with xtsAttributes
- xts() constructor also available

Create an object

• Convert automatically with as.xts():

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- Add additional meta-data with ... arg at construction, or with xtsAttributes
- xts() constructor also available

You now have a time-based object!

Time-based object means ...

Time-based object means ...

... time-aware tools!

first and last

Provide a time-based equivalent of head() and tail()

• Allow for natural-language subsetting

find the first or last '3 weeks' or '5 months' of a dataset, regardless of underlying periodicity. e.g. last (MSFT, '3 weeks') works as well on minute data as it does on daily.

• Positive and negative indexing

'-3 weeks' returns all data except the first or last 3 weeks.

> first(MSF	FT,'2 weeks	s')				
	MSFT.Open	MSFT.High	MSFT.Low	MSFT.Close	MSFT.Volume	MSFT.Adjusted
2007-01-03	29.91	30.25	29.40	29.86	76935100	29.35
2007-01-04	29.70	29.97	29.44	29.81	45774500	29.30
2007-01-05	29.63	29.75	29.45	29.64	44607200	29.13
2007-01-08	29.65	30.10	29.53	29.93	50220200	29.41
2007-01-09	30.00	30.18	29.73	29.96	44636600	29.44
2007-01-10	29.80	29.89	29.43	29.66	55017400	29.15
2007-01-11	29.76	30.75	29.65	30.70	99464300	30.17
2007-01-12	30.65	31.39	30.64	31.21	103972500	30.67

> last(MSFT	,'2 months	s')				
	MSFT.Open	MŚFT.High	MSFT.Low	MSFT.Close	MSFT.Volume	MSFT.Adjusted
2008-03-03	27.24	27.39	26.87	26.99	76544300	26.99
2008-03-04	27.02	27.63	26.96	27.59	86904000	27.59
2008-03-05	27.75	28.41	27.70	28.12	106433600	28.12
2008-03-06	28.06	28.17	27.50	27.57	91127700	27.57
2008-03-07	27.34	28.07	27.32	27.87	77597600	27.87
2008-03-10	27.83	28.26	27.75	28.05	72175100	28.05
2008-03-11	28.40	29.34	28.38	29.28	98740700	29.28
2008-03-12	29.43	29.49	28.54	28.63	75885400	28.63
2008-03-13	28.54	28.99	28.16	28.62	84552200	28.62
2008-03-14	28.72	29.01	27.64	27.96	105201700	27.96
2008-03-17	27.30	28.73	27.28	28.30	84490100	28.30
2008-03-18	28.67	29.48	28.67	29.42	83323800	29.42
2008-03-19	29.38	29.59	28.62	28.62	61442100	28.62
2008-03-20	28.74	29.22	28.59	29.18	60170200	29.18
2008-03-24	29.33	29.40	29.06	29.17	48294700	29.17
2008-03-25	29.33	29.37	28.94	29.14	49149000	29.14
2008-03-26	29.03	29.07	28.38	28.56	45855300	28.56
2008-03-27	28.48	28.49	28.00	28.05	47688900	28.05
2008-03-28	28.23	28.43	27.83	27.91	49244000	27.91
2008-03-31	27.88	28.59	27.84	28.38	46762400	28.38
2008-04-01	28.83	29.54	28.63	29.50	65774200	29.50

[.xts

Extends the ISO 8601-style of range specification to the standard R-style single-bracket subsetting mechanism using [from/to] or [from::to]

> MSFT['200	07-03-01/20	107-03-22 ']]			
	MSFT.Open	MSFT.High	MSFT.Low	MSFT.Close	MSFT.Volume	MSFT.Adjusted
2007-03-01	27.82	28.33	27.73	28.09	80175700	27.70
2007-03-02	28.02	28.16	27.76	27.76	63254700	27.38
2007-03-05	27.49	27.91	27.41	27.55	56454300	27.17
2007-03-06	27.80	27.94	27.65	27.83	49361800	27.45
2007-03-07	27.76	27.90	27.55	27.61	52044700	27.23
2007-03-08	27.72	27.85	26.60	27.32	72175200	26.94
2007-03-09	27.42	27.48	27.03	27.29	80125000	26.91
2007-03-12	27.18	27.48	27.13	27.44	36516400	27.06
2007-03-13	27.25	27.40	26.71	26.72	75169500	26.35
2007-03-14	26.82	27.40	26.73	27.40	75730300	27.02
2007-03-15	27.32	27.47	27.20	27.28	51757100	26.90
2007-03-16	27.35	27.48	27.20	27.33	65055300	26.95
2007-03-19	27.34	27.83	27.20	27.83	49412000	27.45
2007-03-20	27.93	28.16	27.76	27.84	47902400	27.46
2007-03-21	27.90	28.52	27.56	28.52	72808200	28.13
2007-03-22	28.52	28.55	28.01	28.27	47934900	27.88
>						
>				and the second		
2007-03-22	28.52	28.55	28.01	28.27	47934900	27.88
2887-83-21	86.75	28.52	27.56	28.52	72898299	28.13
2887-83-28	27.93	28.16	27.76	27.84	47982488	27.46

[.xts

Extends the ISO 8601-style of range specification to the standard R-style single-bracket subsetting mechanism using [from/to] or [from::to]

> MSFT['200	07-03-01/20	007-03-22']			
_	MSFT.Open	MSFT.High	MSFT.Low	MSFT.Close	MSFT.Volume	MSFT.Adjusted
2007-03-01	27.82	28.33	27.73	28.09	80175700	27.70
2007-03-02	28.02	28.16	27.76	27.76	63254700	27.38
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2007-03-06	27.80	27.94	27.65	27.83	49361800	27.45
2007-03-07	27.76	27.90	27.55	27.61	52044700	27.23
2007-03-08	27.72	27.85	26.60	27.32	72175200	26.94
2007-03-09	27.42	27.48	27.03	27.29	80125000	26.91
2007-03-12	27.18	27.48	27.13	27.44	36516400	27.06
2007-03-13	27.25	27.40	26.71	26.72	75169500	26.35
2007-03-14	26.82	27.40	26.73	27.40	75730300	27.02
2007-03-15	27.32	27.47	27.20	27.28	51757100	26.90
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2007-03-21	27.90	28.52	27.56	28.52	72808200	28.13
2007-03-22	28.52	28.55	28.01	28.27	47934900	27.88
>						
2007-03-22	28.52	28.55	28.01	28.27	47934966	27.88
2007-03-21	66.75	28.52	27.56	28.52	72868266	28.13
2887-83-28	27.93	28.16	27.76	27.84	47982488	27.46

This works on any periodicity or index class!

fast periodicity conversion

> to	o.mont	thly(MSFT)					
		MSFT.Open	MSFT.High	MSFT.Low	MSFT.Close	MSFT.Volume	MSFT.Adjusted
Jan	2007	29.91	31.48	29.40	30.86	1324518200	30.33
Feb	2007	30.84	30.94	27.79	28.17	1290850900	27.78
Mar	2007	27.82	28.55	26.60	27.87	1269506500	27.48
Apr	2007	27.89	30.74	27.56	29.94	958964900	29.53
May	2007	29.94	31.16	29.90	30.69	1327154700	30.36
Jun	2007	30.79	30.90	29.04	29.47	1181412800	29.16
Jul	2007	29.67	31.84	28.95	28.99	1295548000	28.68
Aug	2007	28.95	30.10	27.51	28.73	1228579500	28.52
Sep	2007	28.50	29.85	28.27	29.46	1117419500	29.25
Oct	2007	29.46	37.00	29.29	36.81	1771226400	36.55
Nov	2007	36.53	37.50	32.68	33.60	1829448700	33.47
Dec	2007	33.50	36.72	32.63	35.60	1064817100	35.46
Jan	2008	35.79	35.96	31.04	32.60	1950301600	32.47
Feb	2008	31.06	33.25	27.02	27.20	2323373900	27.20
Mar	2008	27.24	29.59	26.87	28.38	1451582800	28.38
Apr	2008	28.83	29.54	28.63	29.50	65774200	29.50
Apr	2008	28.83	29.54	28.63	29.50	65774200	29.50
Mar	2008	27.24	29.59	26.87	28.38	1451582800	28.38
Feb	2008	31.06	33.25	27.02	27.20	2323373908	27.20
Jan	2888	35.79	35.96	31.04	32.68	1958381688	32.47
					35.68		

to the periodicity of univariate and OHLC data.

Convert from one periodicity to another - e.g. daily to monthly, or hourly to daily with one function.

fast periodicity conversion

> to	o.mont	thly(MSFT)					
		MSFT Open	MSFT.High	MSFT.Low	MSFT.Close	MSFT.Volume	MSFT.Adjusted
Jan	2007	29.91	31.48	29.40	30.86	1324518200	30.33
Feb	2007	30.84	30.94	27.79	28.17	1290850900	27.78
Mar	2007	27.82	28.55	26.60	27.87	1269506500	27.48
Apr	2007	27.89	30.74	27.56	29.94	958964900	29.53
May	2007	29.94	31.16	29.90	30.69	1327154700	30.36
Jun	2007	30.79	30.90	29.04	29.47	1181412800	29.16
Jul	2007	29.67	31.84	28.95	28.99	1295548000	28.68
Aug	2007	28.95	30.10	27.51	28.73	1228579500	28.52
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Dec	2007	33.50	36.72	32.63	35.60	1064817100	35.46
Jan	2008	35.79	35.96	31.04	32.60	1950301600	32.47
Feb	2008	31.06	33.25	27.02	27.20	2323373900	27.20
Mar	2008	27.24	29.59	26.87	28.38	1451582800	28.38
Apr	2008	28.83	29.54	28.63	29.50	65774200	29.50
Apr	2008	28.83	29.54	28.63	29.58	65774200	29.50
Mar	2008	27.24	29.59	26.87	28.38	1451582800	28.38
Feb	2008	31.86	33.25	27.82	27.26	2323373900	27.20
nan	5888	32.19	35.95	31.84	35.68	JAPRENTERN	32.47

indexAt allows control of resultant index class and style. Possible option include startof, firstof, lastof, endof, yearmon, and yearqtr to the periodicity of univariate and OHLC data.

Convert from one periodicity to another - e.g. daily to monthly, or hourly to daily with one function.

fast periodicity conversion

> tc	.mont	thly(MSFT)					
		MSFT.Open	MSFT.High	MSFT.Low	MSFT.Close	MSFT.Volume	MSFT.Adjusted
Jan	2007	29.91	31.48	29.40	30.86	1324518200	30.33
Feb	2007	30.84	30.94	27.79	28.17	1290850900	27.78
Mar	2007	27.82	28.55	26.60	27.87	1269506500	27.48
Apr	2007	27.89	30.74	27.56	29.94	958964900	29.53
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Jun	2007	30.79	30.90	29.04	29.47	1181412800	29.16
Jul	2007	29.67	31.84	28.95	28.99	1295548000	28.68
Aug	2007	28.95	30.10	27.51	28.73	1228579500	28.52
Sep	2007	28.50	29.85	28.27	29.46	1117419500	29.25
Oct	2007	29.46	37.00	29.29	36.81	1771226400	36.55
Nov	2007	36.53	37.50	32.68	33.60	1829448700	33.47
Dec	2007	33.50	36.72	32.63	35.60	1064817100	35.46
Jan	2008	35.79	35.96	31.04	32.60	1950301600	32.47
Feb	2008	31.06	33.25	27.02	27.20	2323373900	27.20
Mar	2008	27.24	29.59	26.87	28.38	1451582800	28.38
Apr	2008	28.83	29.54	28.63	29.50	65774200	29.50
Apr	2008	28.83	29.54	28.63	29.58	65774200	29.50
Mar	2008	27.24	29.59	26.87	28.38	1451582800	28.38
Feb	2008	31.06	33.25	27.02	27.20	2323373900	27.20
Jan	5888	35.79	35.96	31.84	32.68	1958381688	32.47

indexAt allows control of resultant index class and style. Possible option include startof, firstof, lastof, endof, yearmon, and yearqtr to the periodicity of univariate and OHLC data.

Convert from one periodicity to another - e.g. daily to monthly, or hourly to daily with one function.

> Additional Wrappers: to.minutes to.hourly to.daily to.weekly to.monthly to.quarterly to.yearly

Aggregate by period period.apply

Apply any function on specified periods.

> apply.mor	nthly(MSFT,	function(x)) { mean(Hi((x)) })			
2007-01-31	2007-02-28	2007-03-30	2007-04-30	2007-05-31	2007-06-29	2007-07-31	
30.81300	29.49474	27.92318	28.91900	30.91636	30.35095	30.43667	
2007-08-31	2007-09-28	2007-10-31	2007-11-30	2007-12-31	2008-01-31	2008-02-29	
29.00435	29.13105	31.50435	35.00619	35.31400	34.02238	29.07050	
2008-03-31	2008-04-01						
28.75650	29.54000						
28.75658	29.54000	and the second second	-	and the second second	-	the second second	
5009-03-3T	2008-04-01						

apply.monthly(MSFT, function(x) mean(Hi(x))) returns the monthly average Hi for MSFT

Aggregate by period period.apply

Apply any function on specified periods.

> apply.mor	nthly(MSFT,	function(x)) { mean(Hi)	(x)) })			
2007-01-31	2007-02-28	2007-03-30	2007-04-30	2007-05-31	2007-06-29	2007-07-31	
30.81300	29.49474	27.92318	28.91900	30.91636	30.35095	30.43667	
2007-08-31	2007-09-28	2007-10-31	2007-11-30	2007-12-31	2008-01-31	2008-02-29	
29.00435	29.13105	31.50435	35.00619	35.31400	34.02238	29.07050	
2008-03-31	2008-04-01						
28.75650	29.54000						
28.75650	29.54868			-		the second s	
5888-83-3T	5888-84-8T						

apply.monthly(MSFT, function(x) mean(Hi(x))) returns the monthly average Hi for MSFT

Additional Wrappers: apply.daily, apply.weekly, apply.monthly, apply.quarterly, apply.yearly
reclass and Reclass

Return data converted to xts with as.xts back to its original class.

reclass and Reclass

> str(timeSeries(MSFT, rownames(MSFT), title='Meielisalp2008'))
Formal class 'timeSeries' [package "fSeries"] with 8 slots
@ Data : num [1:313, 1:6] 29.9 29.7 29.6 29.6 30.0
attr(*, "dimnames")=List of 2
\$: atomic [1:313] 2007-01-03 2007-01-04 2007-01-05 2007-01-08
attr(*, "control")= Named chr "GMT"
attr(*, "names")= chr "FinCenter"
\$: chr [1:6] "MSFT.Open" "MSFT.High" "MSFT.Low" "MSFT.Close"
@ positions : atomic [1:313] 2007-01-03 2007-01-04 2007-01-05 2007-01-08
attr(*, "control")= Named chr "GMT"
attr(*, "names")= chr "FinCenter"
@ format : chr "%Y-%m-%d"
@ FinCenter : chr "GMT"
@ units : chr [1:6] "MSFT.Open" "MSFT.High" "MSFT.Low" "MSFT.Close"
.@recordIDs :'data.frame': 0 obs. of 0 variables
@ title : chr "Meielisalp2008"
@ documentation: chr "Mon Jun 23 19:29:22 2008"
Start with a time Sori

Return data converted to xts with as.xts back to its original class.

reclass and Reclass

> str(timeSeries(MSFT, rownames(MSFT), title='Meielisalp2008')) Formal class 'timeSeries' [package "fSeries"] with 8 slots ..@ Data : num [1:313, 1:6] 29.9 29.7 29.6 29.6 30.0- attr(*, "dimnames")=List of 2\$: atomic [1:313] 2007-01-03 2007-01-04 2007-01-05 2007-01-08- attr(*, "control")= Named chr "GMT" attr(*, "names")= chr "FinCenter"\$: chr [1:6] "MSFT.Open" "MSFT.High" "MSFT.Low" "MSFT.Close"@ positions : atomic [1:313] 2007-01-03 2007-01-04 2007-01-05 2007-01-08- attr(*, "control")= Named chr "GMT" attr(*, "names")= chr "FinCenter" : chr "%Y-%m-%d" ..@ format ..@ FinCenter : chr "GMT" : chr [1:6] "MSFT.Open" "MSFT.High" "MSFT.Low" "MSFT.Close"@ units ..@ recordIDs :'data.frame': 0 obs. of 0 variables ..@ title : chr "Meielisalp2008" ..@ documentation: chr "Mon Jun 23 19:29:22 2008"

Start with a **timeSeries**

Return data converted to xts with as.xts back to its original class.

> str(x <- as.xts(timeSeries(MSFT, rownames(MSFT), title='Meielisalp2008'), by="JA Ryan")) An 'xts' object from 2007-01-03 to 2008-04-01 containing: Data: num [1:313, 1:6] 29.9 29.7 29.6 29.6 30.0 ... - attr(*, "dimnames")=List of 2 ...\$: chr [1:313] "2007-01-03" "2007-01-04" "2007-01-05" "2007-01-08"\$: chr [1:6] "MSFT.Open" "MSFT.High" "MSFT.Low" "MSFT.Close" ... Indexed by: POSIXct[1:313], format: "2007-01-03" "2007-01-04" "2007-01-05" "2007-01-08" ... Original class: 'timeSeries' xts Attributes: List of 6 Convert to **xts** \$ format : chr "%Y_%m_%d" \$ FinCenter : chr "GMT" \$ recordIDs :'data.frame': 0 obs. of 0 variables \$ title : chr "Meielisalp2008" \$ documentation: chr "Mon Jun 23 19:42:59 2008" : chr "JA Ryan" \$ by

reclass and Reclass

> str(timeSeries(MSFT, rownames(MSFT), title='Meielisalp2008')) Formal class 'timeSeries' [package "fSeries"] with 8 slots ..@ Data : num [1:313, 1:6] 29.9 29.7 29.6 29.6 30.0- attr(*, "dimnames")=List of 2 ...\$: atomic [1:313] 2007-01-03 2007-01-04 2007-01-05 2007-01-08- attr(*, "control")= Named chr "GMT" attr(*, "names")= chr "FinCenter"\$: chr [1:6] "MSFT.Open" "MSFT.High" "MSFT.Low" "MSFT.Close"@ positions : atomic [1:313] 2007-01-03 2007-01-04 2007-01-05 2007-01-08- attr(*, "control")= Named chr "GMT" attr(*, "names")= chr "FinCenter" : chr "%Y-%m-%d" ..@ format ..@ FinCenter : chr "GMT" : chr [1:6] "MSFT.Open" "MSFT.High" "MSFT.Low" "MSFT.Close"@ units ..@ recordIDs :'data.frame': 0 obs. of 0 variables ..@ title : chr "Meielisalp2008" ..@ documentation: chr "Mon Jun 23 19:29:22 2008"

Start with a **timeSeries**

Return data converted to xts with as.xts back to its original class.

> str(x <- as.xts(timeSeries(MSFT, rownames(MSFT), title='Meielisalp2008'), by="JA Ryan")) An 'xts' object from 2007-01-03 to 2008-04-01 containing: Data: num [1:313, 1:6] 29.9 29.7 29.6 29.6 30.0 ... - attr(*, "dimnames")=List of 2 ...\$: chr [1:313] "2007-01-03" "2007-01-04" "2007-01-05" "2007-01-08"\$: chr [1:6] "MSFT.Open" "MSFT.High" "MSFT.Low" "MSFT.Close" ... Indexed by: POSIXct[1:313], format: "2007-01-03" "2007-01-04" "2007-01-05" "2007-01-08" ... Original class: 'timeSeries' xts Attributes: List of 6 Convert to **xts** : chr "%Y-%m-%d" \$ format \$ FinCenter : chr "GMT" \$ recordIDs :'data.frame': 0 obs. of 0 variables \$ title : chr "Meielisalp2008" \$ documentation: chr "Mon Jun 23 19:42:59 2008" \$ by : chr "JA Ryan" xtsAttributes store meta-data

Convert back without losing information using reclass

```
> str(reclass(x))
Formal class 'timeSeries' [package "fSeries"] with 8 slots
  ..@ Data
                 : num [1:313, 1:6] 29.9 29.7 29.6 29.6 30.0 ...
 ....- attr(*, "dimnames")=List of 2
  .....$ : atomic [1:313] 2007-01-03 2007-01-04 2007-01-05 2007-01-08 ...
 ..... attr(*, "control")= Named chr "GMT"
  ..... attr(*, "names")= chr "FinCenter"
  .....$ : chr [1:6] "MSFT.Open" "MSFT.High" "MSFT.Low" "MSFT.Close" ...
  ...@ positions : atomic [1:313] 2007-01-03 2007-01-04 2007-01-05 2007-01-08 ...
  ....- attr(*, "control")= Named chr "GMT"
  ..... attr(*, "names")= chr "FinCenter"
                : chr "%Y_%m_%d"
  ..@ format
  ..@ FinCenter : chr "GMT"
  ..@ units : chr [1:6] "MSFT.Open" "MSFT.High" "MSFT.Low" "MSFT.Close" ...
  ..@ recordIDs :'data.frame':
                                      0 obs. of 0 variables
  ..@ title : chr "Meielisalp2008"
  ..@ documentation: chr "Mon Jun 23 19:42:59 2008"
  ..@ documentation: chr "Mon Jun 23 19:42:59 2008"
 .. d title
                 : chr "Metellsalp2008"
```

converting back to *timeSeries* from *xts* maintains the original attributes, e.g. @title and @documentation

as.xts and reclass example

> getSymbols("SBUX",return='timeSeries')
[1] "SBUX"
>

> is.timeSeries(SBUX)
[1] TRUE
>

download a timeSeries of SBUX

as.xts and reclass example

> SBUX['2008-06']
Error in `[.timeSeries`(SBUX, "2008-06") :
subscript out of bounds

attempting to subset xts-style results in an error

as.xts and reclass example the solution?

> x <- as.xts(SBUX)['2008-06']
> x

	SBUX.Open	SBUX.High	SBUX.Low	SBUX.Close	SBUX.Volume	SBUX.Adjusted
2008-06-02	18.17	18.17	17.63	17.93	10877200	17.93
2008-06-03	17.93	18.13	17.40	17.75	13076200	17.75
2008-06-04	17.72	18.34	17.72	18.12	15915400	18.12
2008-06-05	18.15	18.52	18.01	18.52	13662400	18.52
2008-06-06	18.35	18.35	17.64	17.67	12236500	17.67
2008-06-09	17.71	18.20	17.37	17.52	16788400	17.52
2008-06-10	17.33	17.93	17.25	17.84	9761300	17.84
2008-06-11	17.94	17.94	17.55	17.57	11351100	17.57
2008-06-12	17.76	18.06	17.66	17.82	8571900	17.82
2008-06-13	17.95	18.20	17.83	18.17	10910400	18.17
2008-06-16	18.01	18.56	17.89	18.35	8295000	18.35
2008-06-17	18.37	18.47	18.07	18.12	6369500	18.12
2008-06-18	18.00	18.09	17.66	17.77	8452600	17.77
2008-06-19	17.73	18.06	17.38	17.99	9215800	17.99
2008-06-20	17.77	17.82	17.18	17.23	13066200	17.23
2008-06-23	17.26	17.49	16.27	16.30	19602100	16.30
2008-06-24	16.36	16.92	16.25	16.57	12763800	16.57

first convert with as.xts

as.xts and reclass example

then reclass back to timeSeries

> is.timeS	eries(x)					
[1] FALSE						
> x <- rec	lass(x)					
<pre>> is.timeSe</pre>	eries(x)					
[1] TRUE						
> X						
	SBUX.Open	SBUX.High	SBUX.Low	SBUX.Close	SBUX.Volume	SBUX.Adjusted
2008-06-02	18.17	18.17	17.63	17.93	10877200	17.93
2008-06-03	17.93	18.13	17.40	17.75	13076200	17.75
2008-06-04	17.72	18.34	17.72	18.12	15915400	18.12
2008-06-05	18.15	18.52	18.01	18.52	13662400	18.52
2008-06-06	18.35	18.35	17.64	17.67	12236500	17.67
2008-06-09	17.71	18.20	17.37	17.52	16788400	17.52
2008-06-10	17.33	17.93	17.25	17.84	9761300	17.84
2008-06-11	17.94	17.94	17.55	17.57	11351100	17.57
2008-06-12	17.76	18.06	17.66	17.82	8571900	17.82
2008-06-13	17.95	18.20	17.83	18.17	10910400	18.17
2008-06-16	18.01	18.56	17.89	18.35	8295000	18.35
2008-06-17	18.37	18.47	18.07	18.12	6369500	18.12
2008-06-18	18.00	18.09	17.66	17.77	8452600	17.77
2008-06-19	17.73	18.06	17.38	17.99	9215800	17.99
2008-06-20	17.77	17.82	17.18	17.23	13066200	17.23
2008-06-23	17.26	17.49	16.27	16.30	19602100	16.30
2008-06-24	16.36	16.92	16.25	16.57	12763800	16.57

as.xts and reclass example

then reclass back to timeSeries

<pre>> is.timeSe [1] FALSE > x <- recl > is.timeSe [1] TRUE</pre>	eries(x) ass(x) eries(x)					
> x	CRUV Open CRU					CRUV Adjusted
2008-06-02	18 17		Xts-st	yle	10877200	17 93
2008-06-03	17.93				13076200	17.75
2008-06-04	17.72	SUP	settin	gona	15915400	18.12
2008-06-05	18.15	Gac		8 011 0	13662400	18.52
2008-06-06	18.35	4	imasa	rioc	12236500	17.67
2008-06-09	17.71	U	imese		16788400	17.52
2008-06-10	17.33				9761300	17.84
2008-06-11	17.94		ohied	^t/	11351100	17.57
2008-06-12	17.76				85/1900	17.82
2008-06-13	17.95	10 56	17 00	10 25	2205000	
2008-06-17	18.37	18 17	18.07	18 17	6369500	10.55
2008-06-18	18 00	18 09	17 66	17 77	8452600	17 77
2008-06-19	17.73	18.06	17.38	17.99	9215800	17.99
2008-06-20	17.77	17.82	17.18	17.23	13066200	17.23
2008-06-23	17.26	17.49	16.27	16.30	19602100	16.30
2008-06-24	16.36	16.92	16.25	16.57	12763800	16.57

Reclass attempts to take *any* function call and force it to return an object that matches the class of the object you passed in.

EMA from TTR returns a vector

> EM4	A(CL(MSFT)))[1:20]							
[1]	NA	NA	NA	NA	NA	NA	NA	NA	
[9]	NA	30.30300	30.42973	30.55341	30.58370	30.61212	30.69901	30.65373	
[17]	30.64396	30.62324	30.59720	30.64498					
2									
									and the second

EMA from TTR returns a vector

> EM/	A(Cl(MSFT)))[1:20]						
[1]	NA	NA	NA	NA	NA	NA	NA	NA
[9]	NA	30.30300	30.42973	30.55341	30.58370	30.61212	30.69901	30.65373
[17]	30.64396	30.62324	30.59720	30.64498				
>								

Wrapped in Reclass, and the result is the original xts class

> Reclass(El	MA(CI(MSFT)))[1:20]		
2007-01-03	NA			
2007-01-04	NA			
2007-01-05	NA			
2007-01-08	NA			
2007-01-09	NA			
2007-01-10	NA			
2007-01-11	NA			
2007-01-12	NA			
2007-01-16	NA			
2007-01-17 3	30.30300			
2007-01-18	30.42973			
2007-01-19	30.55341			
2007-01-22 3	30.58370			
2007-01-23	30.61212			
2007-01-24	30.69901			
2007-01-25	30.65373			
2007-01-26	30.64396			
2007-01-29	30.62324			
2007-01-30	30.59720			
2007-01-31	30.64498			
2007-01-31 :	30.64498			
2007-01-30 (30.59720			
2007-01-29 (30.62324			
2007-01-26 :	30.64396			

Using xts internally to manage time-based data in your own functions and packages.

Four (4) options for handling R's time-based classes in functions:

Write methods for all possible inputs

Four (4) options for handling R's time-based classes in functions:

Write methods for all possible inputs (9 classes!)

Data Classes: matrix, data.frame, ts, zoo, its, irts, timeSeries, xts, vectors

Four (4) options for handling R's time-based classes in functions:

Write methods for all possible inputs
 Choose one class to accept

Data Classes: matrix, data.frame, ts, zoo, its, irts, timeSeries, xts, vectors

Four (4) options for handling R's time-based classes in functions:

- Write methods for all possible inputs
 Choose one class to accept
- 3) Convert internally to ... (matrix?)

Data Classes: matrix, data.frame, ts, zoo, its, irts, timeSeries, xts, vectors

Four (4) options for handling R's time-based classes in functions:

- Write methods for all possible inputs
- 2) Choose one class to accept
- 3) Convert internally to ... (matrix?)
- 4) Use xts functions to manage the process

Data Classes: matrix, data.frame, ts, zoo, its, irts, timeSeries, xts, vectors

try.xts and reclass

Two simple functions let you...

- Accept all common time-series in R
- Manage one type of object internally
- Return original class to the user

try.xts and reclass

Two simple functions let you...

- Accept all common time-series in R
- Manage one type of object internally
- Return original class to the user

which translates to ...

- <u>Less code</u> to write and maintain
- Increased reliability and flexibility
- Freedom to <u>focus on core development</u> tasks



Convert, if possible, an incoming object to xts Use is.xts to test and branch if desired



Convert, if possible, an incoming object to xts Use is.xts to test and branch if desired

reclass

Convert, if possible, back to the original class

... an example?

period.apply using try.xts & reclass

```
period.apply <-
function (x, INDEX, FUN, ...)
{
    x <- try.xts(x, error = FALSE)
    FUN <- match.fun(FUN)
    xx <- sapply(1:(length(INDEX) - 1), function(y) {
        FUN(x[(INDEX[y] + 1):INDEX[y + 1]], ...)
    })
    reclass(xx, x[INDEX])
}</pre>
```

period.apply using try.xts & reclass

```
period.apply <-
function (x, INDEX, FUN, ...)
{
    x <- try.xts(x, error = FALSE)
    FUN <- match.fun(FUN)
    xx <- sapply(1:(length(INDEX) - 1), function(y) {
        FUN(x[(INDEX[y] + 1):INDEX[y + 1]], ...)
    })
    reclass(xx, x[INDEX])
}</pre>
```

Two simple additions allows the period.apply function to accept, and ultimately return, any class of time-series object. By setting error=FALSE, it is even possible to accept non-xts coercible args. Truly universal data acceptance.

Using try.xts

using the incoming data, attempt to convert



Using try.xts

add any additional args to xts constructor



Using try.xts

FALSE means success isn't required



Using reclass

first argument - result of internal calculations



Using reclass

second argument - the original object (more or less)



the original result from try.xts

Using reclass

second argument - the original object (more or less)

reclass(xx, match.to=x)

the original result from try.xts

the match.to argument is the template for reindexing as an xts object.

}

```
period.apply <-
function (x, INDEX, FUN, ...)
{
    x <- try.xts(x, error = FALSE)
    FUN <- match.fun(FUN)
    xx <- sapply(1:(length(INDEX) - 1), function(y) {
        FUN(x[(INDEX[y] + 1):INDEX[y + 1]], ...)
    })
    reclass(xx, x[INDEX])</pre>
```

Using try.xts and reclass

{

}

```
period.apply <-
function (x, INDEX, FUN, ...)
    x <- try.xts(x, error = FALSE)</pre>
    FUN <- match.fun(FUN)</pre>
    xx <- sapply(1:(length(INDEX) - 1), function(y) {</pre>
         FUN(x[(INDEX[y] + 1):INDEX[y + 1]], \ldots)
    })
    reclass(xx, x[INDEX])
```

try.xts

Attempt to convert to xts, if not possible - continue on. In this case, it isn't necessary that we have an xts object, it is only to provide the user with a seemless experience

```
period.apply <-
function (x, INDEX, FUN, ...)
{
    x <- try.xts(x, error = FALSE)
    FUN <- match.fun(FUN)
    xx <- sapply(1:(length(INDEX) - 1), function(y) {
        FUN(x[(INDEX[y] + 1):INDEX[y + 1]], ...)
    })
    reclass(xx, x[INDEX])</pre>
```

main calculations

Proceed with function work. It is important to keep the original x variable untouched, otherwise the data may be lost or corrupted by non-xts aware functions

```
period.apply <-
function (x, INDEX, FUN, ...)
{
    x <- try.xts(x, error = FALSE)
    FUN <- match.fun(FUN)
    xx <- sapply(1:(length(INDEX) - 1), function(y) {
        FUN(x[(INDEX[y] + 1):INDEX[y + 1]], ...)
    })
    reclass(xx, x[INDEX])</pre>
```

reclass

xx is the result of the function call, before attempting the reclass. In this case the data is shorter than the original, and must be modified for reclass to work correctly.
• zoo modified for time

zoo modified for time
new time-aware tools

- zoo modified for time
- new time-aware tools
- increased developer productivity

zoo modified for time
new time-aware tools
increased developer productivity
Now on to quantmod and charts!

quantmod

Jeffrey A. Ryan



www.quantmod.com

quantmod.r-forge.r-project.org





Data (getSymbols)



Data (getSymbols)

Visuals (chartSeries)



Data (getSymbols)

Visuals (chartSeries)

Model (buildModel)



Data (getSymbols)

Visuals (chartSeries)

Model (buildModel)

Test (tradeModel)



Model (buildModel)

Test (tradeModel)

Single Data Interface getSymbols

- One wrapper function for all data sources
- Extensible by simple naming convention
- auto.assign into specified environment
- Settable return class

getSymbols

oanda	FRED (Federal Reserve Bank of St. Louis)	RData/rda	
Yahoo! Finance	Google Finance	MySQL	
SQLite	CSV	IBrokers	

getSymbols



getSymbols



Simple to extend to other data sources

Example I Download data from Yahoo!

Specify src = "yahoo" to getSymbols call

> getSymbol	s("YHOO",	src="yahod	»")				
[1] "YHOO"							
> head(YHOO)						
	YHOO.Open	YHOO.High	YHO0.Low	YHO0.Close	YHOO.Volume	YHOO.Adjusted	
2007-01-03	25.85	26.26	25.26	25.61	26352700	25.61	
2007-01-04	25.64	26.92	25.52	26.85	32512200	26.85	
2007-01-05	26.70	27.87	26.66	27.74	64264600	27.74	
2007-01-08	27.70	28.04	27.43	27.92	25713700	27.92	
2007-01-09	28.00	28.05	27.41	27.58	25621500	27.58	
2007-01-10	27.48	28.92	27.44	28.70	40240000	28.70	
2							
	and its second second						
2007-01-10	27.48	28.92	27.44	28.70	48248888	28.70	

Example I Download data from Yahoo!

Specify src = "yahoo" to getSymbols call

> getSymbol	s("YHOO",	src="yahoo	»")				
[1] "YHOO"							
> head(YHOO	0						
	YHO0.Open	YHOO.High	YHO0.Low	YH00.Close	YH00.Volume	YHOO.Adjusted	
2007-01-03	25.85	26.26	25.26	25.61	26352700	25.61	
2007-01-04	25.64	26.92	25.52	26.85	32512200	26.85	
2007-01-05	26.70	27.87	26.66	27.74	64264600	27.74	
2007-01-08	27.70	28.04	27.43	27.92	25713700	27.92	
2007-01-09	28.00	28.05	27.41	27.58	25621500	27.58	
2007-01-10	27.48	28.92	27.44	28.70	40240000	28.70	
2							
	and the second second	and the second second second	-	and the second	and the second second second	and the second	and the second division of the second divisio
2007-01-10	27.48	28.92	27.44	28.78	48248888	28.76	

showSymbols returns information on what has been loaded



Example IIDownload from FRED and Google in one call

Use setSymbolLookup to change default source for certain symbols

> setSymbolLookup(DEXJPUS=list(src='FRED'),YH00=list(src='google'))

> getSymbols("DEXJPUS;YH00")

[1] "DEXJPUS" "YHOO"

Example IIDownload from FRED and Google in one call

Use setSymbolLookup to change default source for certain symbols





get highly configurable quotes from Yahoo! and others

• getQuote

get highly configurable quotes from Yahoo! and others

• getFinancials

retrieve fundamental data from Google/Reuters

• getQuote

get highly configurable quotes from Yahoo! and others

• getFinancials

retrieve fundamental data from Google/Reuters

• getFX & getMetals

Get currency and metal prices from Oanda.com

• getQuote

get highly configurable quotes from Yahoo! and others

• getFinancials

retrieve fundamental data from Google/Reuters

• getFX & getMetals

Get currency and metal prices from Oanda.com

• getDividends

Get dividend data from Yahoo!

• getQuote

get highly configurable quotes from Yahoo! and others

Now, on to the charts...

retrieve fundamental data from Google/Reuters

getFX & getMetals

Get currency and metal prices from Oanda.com

Visualization chartSeries











Most time-series plotting in R is derived from standard line charts

All useful, but not really financial



Jan 63 May 61 May 61 May 61 May 62 May 64 May 65 Ma

Charting in R An example posted to addictedtor.free.fr by Dirk Eddelbuettel shows what is possible with some 200+ lines of code...

Jan 03 May 01 Jul 02 Sep 04 Moy UT Jan 02 May 03 May 01 2007 2007 2007 2007 2008 2008 2008

Charting in R







chartSeries(IBM,TA='addBBands();addBBands(draw="p");addVo()',subset='2008')



chartSeries(IBM,TA='addBBands();addBBands(draw="p");addVo()',subset='2008')

- Overview
- Customizing the look chartTheme and reChart

- Overview
- Customizing the look chartTheme and reChart
- zoomChart and zooom

- Overview
- Customizing the look chartTheme and reChart
- zoomChart and zooom
- Adding TA indicators
 Built-in
 ad-hoc additions with addTA
 custom indicators with newTA





• Works interactively or from scripts



- Works interactively or from scripts
- Built-in facility for bars, candles, and lines



- Works interactively or from scripts
- Built-in facility for bars, candles, and lines
- Manages layout dynamically

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- Works interactively or from scripts
- Built-in facility for bars, candles, and lines
- Manages layout dynamically
- Add and remove elements at will
- Highly configurable
- Fully extensible

chartSeries can draw 3 styles of charts lines



lineChart(IBM, subset='last 4 months', TA=NULL)

chartSeries can draw 3 styles of charts ohlc & hlc bars



chartSeries can draw 3 styles of charts candlesticks



candleChart(IBM, subset='last 4 months', TA=NULL)

chartTheme

Charts use "themes" to coordinate colors using the theme argument to chartSeries

theme = chartTheme("white")



theme = chartTheme("black")



theme = chartTheme("white.mono")



theme = chartTheme("black.mono")



theme = chartTheme("beige")



Easy to modify themes













Modify drawn charts with reChart



Modify drawn charts with reChart



> reChart(theme='white', type='bars')



Modify drawn charts with reChart



> reChart(theme='white', type='bars')





Functions to zoom-in and zoom-out of a chart

all of 2007



10 -



now 2008!

IBM [2008-01-02/2008-06-24] 130 Last 123.46 $\frac{1}{44} \frac{1}{44} \frac$ 125 120 115 110 105 100 Volume: 20 7,552,900 15 10 5 1 | | | | | | | | Jan 02 Jan 22 Apr 14 Apr 28 May 12 May 27 Jun 09 Feb 04 Feb 19 Mar 03 Mar 17 Mar 31 Jun 23 2008 2008 2008 2008 2008 2008 2008 2008 2008 2008 2008 2008 2008 2008 2008 2008 2008 2008 2008 8002 2008 2008 2008 2008 2008 2008 Apr 28 Jan 02 Jan 22 Feb 04 Feb 19 Mar 03 Mar 17 Mar 31 Apr 14 May 12 May 27 Jun 09 **Jun 23**

now 2008!

IBM [2008-01-02/2008-06-24] 130 Last 123.46 $\{\mu_{1},\mu_{$ 125 120 115 110 105 100 Volume: 20 7,552,90p 15 10 5 Jan 02 Apr 14 Apr 28 May 12 May 27 Jun 09 Jan 22 Feb 04 Feb 19 Mar 03 Mar 31 Jun 23 Mar 17 2008 Jan 02 Jan 22 Feb 04 Feb 19 Mar 03 Mar 17 Mar 31 Apr 14 Apr 28 May 12 May 27 Jun 09 **Jun 23** Works just like subsetting in xts

Chart Additions

Adding data to charts is easy and fast
Chart Additions

Adding data to charts is easy and fast

Using the TA argument to chartSeries

Chart Additions

Adding data to charts is easy and fast

Using the TA argument to chartSeries Interactively with addTA and friends

TA stands for (T)echnical (A)analysis

Built-in TA functionality from quantmod and TTR

addADX	addATR	addBBands
addCCI	addCMF	addCMO
addDEMA	addDPO	addEMA
addEnvelope	addEVWMA	addExpiry
addMACD	addMomentum	addROC
addRSI	addSAR	addSMI
addTRIX	addVo	addWMA
addWPR	addZLEMA	more to come!!!!

chartSeries(IBM, TA=NULL)



chartSeries(IBM, TA=NULL)

By default TA="addVo()", setting to NULL causes just the price series to be displayed

chartSeries(IBM,TA = "addMACD();addBBands()")

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chartSeries(IBM,TA=NULL)



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Now with Bollinger Bands under the series





With a De-trended Price Oscillator



Custom TA

Custom TA

addTA add data directly to a chart

Custom TA

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newTA create new TA functions easily



Provide a mechanism to create TA additions on-demand, using only raw data



The newest TTR package includes a volatility function to calculate different measures of volatility



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e.g. volatility(OHLC(IBM), calc = 'garman.klass')



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e.g. volatility(OHLC(IBM), calc = 'garman.klass')

returns the Garman-Klass volatility



To add this to the IBM chart:





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addTA

The result is displayed just like any built-in TA



addTA

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What if you want something simple & more flexible like addVolatility()?





Provide a mechanism to create functional TA additions based on user functions



newTA automatically creates the code needed!

```
> addVolatility <- newTA(volatility, preFUN=OHLC, col=4,lwd=2)
> 
> class(addVolatility)
[1] "function"
>
```



simply call the new function





done!



single interface to data with getSymbols

- single interface to data with getSymbols
- fast and flexible visualization in chartSeries

- single interface to data with getSymbols
- fast and flexible visualization in chartSeries
- big plans for the future!



Financial Time-Series Tools

xts and chartSeries

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www.quantmod.com/Rmetrics2008