

# Trading Geeks

**World Markets** 

Technical Analysis with R

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# Technical Analysis with R

Posted on July 14, 2014 by TradingGeek — 6 Comments ↓

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In this post we'll take a look at how a trader could use R to calculate some basic Technical Analysis indicators. R is a free open-source statistical analysis environment and programming language. It is available for Windows, Mac OS, and Linux operating systems. Installation is easy and quick. For download and installation instructions go to: http://cran.r-project.org.

When developing a trading strategy it's useful to be able to analyze and visualize data and to be able to test your trade-generation rules and their variations and models quickly and with minimum turn-around. While many trading platforms, such as Interactive Brokers, etc.. provide access to historical data via API or straight file download – analyzing that data and prototyping trading strategies often requires writing hundreds of lines of code in programming languages such as Java or C++, or writing cumbersome difficult-to-test formulas in Excel. This requires a significant time investment, regardless of how experience programmer you are. By contrast, a higher-level programming language such as R or Matlab, coupled with their interactive programming environments, allow their users to slice, dice, and analyze data within a fraction of time it takes with C+++, C#, or Java. The amount of code required to develop a trading strategy in R is typically an order of magnitude less as well.

In this example we'll use a simple comma-separate file containing open, high, low, and close price columns (a.k.a. OHLC), along with volume and timestamp values for SPY ETF. In this post we'll demonstrate how to use a free R library to calculate Simple Moving Average (SMA), Exponential Moving Average (EMA), Bollinger Bands (BBands), RSI, and MACD technical analysis indicators. We will append calculated indicators as new columns to our input file so that it can be used for further analysis or trading strategy prototyping in Excel, R, or any other CSV-friendly software package of your choice.

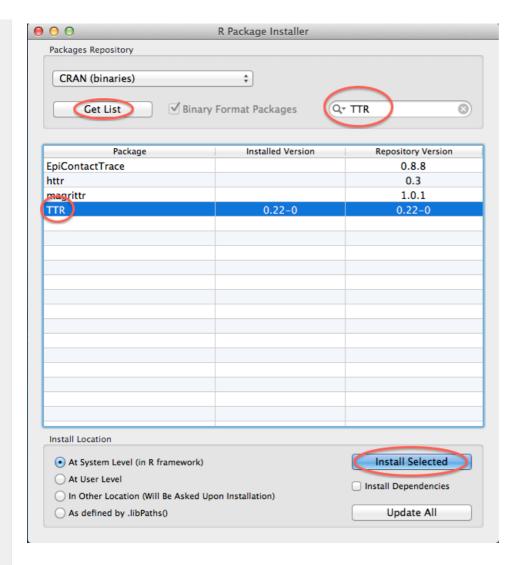
## **Installing Technical Analysis library for R**

1. To calculate Technical Analysis with R we will be using a free open-source library called "TTR" (Technical Trading Rules). This step includes instructions for installing TTR library, assuming you already have installed R on your computer. This steps only needs to be performed once per R installation on a computer.

To install the library on your computer:

- 1) Start R environment on your computer, then in the menu select: Packages & Data -> Package Installer
- 2) In Package Installer type "TTR" in the Package Search field, and click "Get List" button.
- 3) Select package "TTR" and click "Install Selected".





#### **Loading Historical Data (Input)**

For demo purposes we will use daily historical prices for SPY ETF from September 2013 through May 2014. Click here to download the data file. This input file for this example was generated using IB Historical Data Downloader.

2. We are going to start off by opening R shell and loading "TTR" library, which is a free R extension that contains functions for calculating some of the most common indicators.

```
> library("TTR")
```

3. The next step is to import our data file with historical prices into R environment. We will load data from sample CSV file into R environment and store it a "data frame", which an R variable type for storing data in table format in memory.

```
> data = read.csv(file="spy_historical_data.txt")
```

To display first few rows of the "data" table:

```
> head(data)
```

This by default shows first 6 rows of data along with column names (table header). To see how many rows you have in the "data" table:

```
> nrow(data) [1] 187
```

This shows we have 187 data records in our SPY data file, for 187 trading days between Sep 3, 2013 – May 31, 2014.

We can also list table column names using "colnames" functions as follows:

```
> colnames(data)
```



```
R Console
      Q+ Help Search
> library("TTR")
Loading required package: xts
Loading required package: zoo
Attaching package: 'zoo'
The following objects are masked from 'package:base':
    as.Date, as.Date.numeric
> data = read.csv(file="spy_historical_data.txt")
> head(data)
          HIGH
                  LOW CLOSE VOLUME BAR_SIZE DATE_TIME
    OPEN
1 165.36 165.58 163.65 164.35 1317248
                                        DAY_1 2013-09-03
2 164.34 166.09 164.13 166.04 898364
                                        DAY_1 2013-09-04
3 166.13 166.40 165.65 165.98 582773
                                        DAY_1 2013-09-05
4 165.88 166.98 164.48 165.84 1462634
                                        DAY_1 2013-09-06
5 166.15 167.80 166.15 167.79 814071
                                        DAY_1 2013-09-09
6 168.06 168.90 167.64 168.70 976159
                                        DAY_1 2013-09-10
nrow(data)
[1] 187
 colnames(data)
[1] "OPEN"
                "HIGH"
                            "LOW"
                                        "CLOSE"
                                                                "BAR SIZE" "DATE TIME"
                                                    "VOLUME"
```

## **Moving Averages**

4. Let's now calculate 20-day Simple Moving Average (SMA) of the CLOSE price column using TTR library's R function "SMA":

```
> sma20 < - SMA(data, n=20)
```

Now, let's see first 50 values of the "sma20" array:

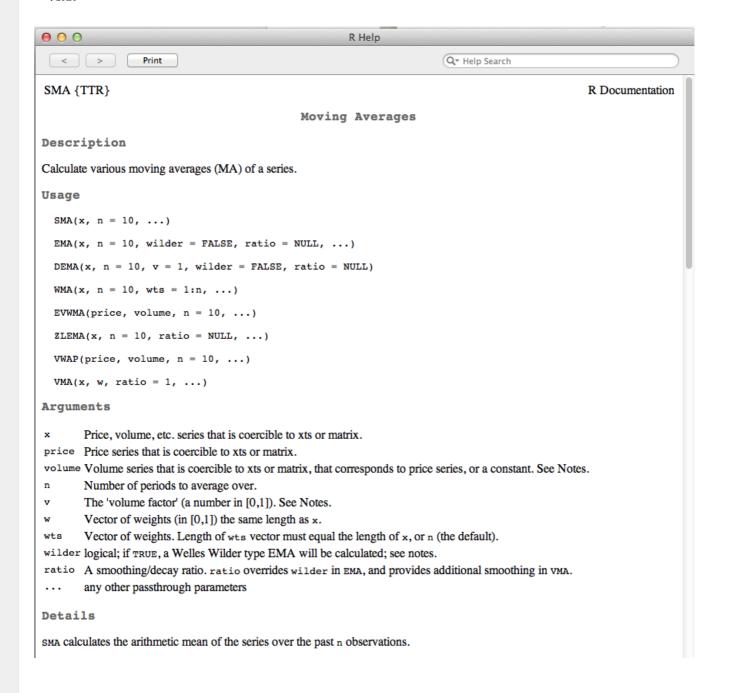
```
> head(sma20, n=50)
```

```
> we pass data frame 'data'
                             ffunction c() creates an array of strings, here with single
> and a query in the square
                             element "CLOSE", specifying the column in data frame
> brackets. In this query we
                             that SMA will be calculated from.
> simply pass the name of
> the column for SMA use
                                               parameter n specifies the
                                               "length" of moving average
> sma20 <- SMA(data[c('CLOSE')],n=20)
> head(sma20, n=50)
            NA
 [1]
[10]
                                 NA
                                           NA
            NA 169.0180 169.2705 169.3810 169.4550 169.6050 169.5805 169.4430 169.2565
[19]
[28] 169.2370 169.2810 169.3375 169.3240 169.2610 169.3010 169.4840 169.7165 170.0050
[37] 170.2835 170.5560 170.8970 171.2940 171.6825 172.0680 172.4905 172.8485 173.3240
[46] 173.8450 174.4000 174.7250 175.0640 175.3665
```

Here we used function SMA from TTR library we loaded above, telling it to calculate 20-day average (value of parameter "n"), of the "CLOSE" column from data frame "data". The function returns an array of SMA values and stores it in a new variable called "sma20".

You can bring up the help with a detailed description of the function and it's parameters using? followed by the function name, as below. It is always a good idea to read help pages for the functions you are using, since they will list all optional parameters that you can use to tweak the output. Also, many functions have variations or related functions, which could be helpful in various circumstances and will be listed on the help page.





5. Calculating Exponential Moving Average is similarly easy, just use a different function, this time EMA(). Notice that we calculate EMA for 14-period length

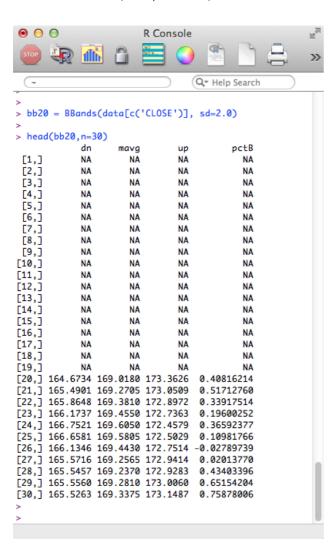
## **Bollinger Bands**

6. To calculate Bollinger Bands indicator we use the BBands function. There is a number of optional parameters that it takes, so we'll provide several examples. In the example below we call BBands passing it data frame 'data' with a query that specifies that we want to use values from 'CLOSE' column, just as we've been doing above to SMA and EMA calculations above. Second parameter 'sd' takes the number of standard deviations for upper and lower bands. Since we don't pass value for 'n' – BBands uses 20-period moving average by default. The output contains several columns: 'dn' for "lower" band, 'mavg' for the moving average, 'up' for the "upper" band, and pctB, which quantifies a security's price relative to the upper and lower Bollinger Band, a detailed description of it can be found here.



- %B equals 1 when price is at the upper band
- %B equals 0 when price is at the lower band
- %B is above 1 when price is above the upper band
- %B is below 0 when price is below the lower band
- %B is above .50 when price is above the middle band (20-day SMA)
- %B is below .50 when price is below the middle band (20-day SMA)

> bb20 = BBands(data, sd=2.0)



6.1 Now we'd like to create a new data frame containing all input data from the 'data' frame, plus Bollinger Bands data we just calculated.

```
> dataPlusBB = data.frame(data,bb20)
```

The data.frame() function takes any number of data frames and joins them row-wise into a new data frame, so that elements from corresponding rows are "joined" together in the result.

# 6.2 Bollinger Bands plot:

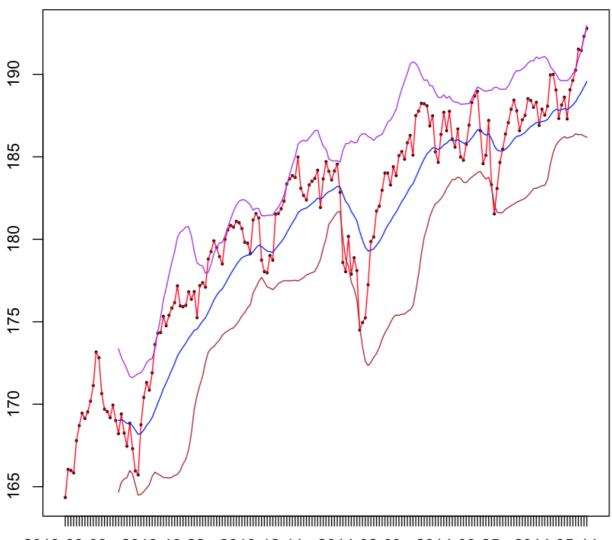
- > plot(dataPlusBB\$DATE\_TIME,allData\$CLOSE)
- > lines(dataPlusBB\$CLOSE, col = 'red')
- > lines(dataPlusBB\$up, col = 'purple')
- > lines(dataPlusBB\$dn, col = 'brown')
- > lines(dataPlusBB\$mavg, col = 'blue')



```
R Console
        8
                                                                                                                                 Q+ Help Search
  dataPlusBB = data.frame(data,bb20)
> head(dataPlusBB, n=30)

    OPEN HIGH LOW CLOSE VOLUME BAR_SIZE DATE_TIME

1 165.36 165.58 163.65 164.35 1317248 DAY_1 2013-09-03
                                                                                                 mavg
NA
                                                                                                                           pctB
NA
                                                                                                                up
NA
   164.34 166.09 164.13 166.04
166.13 166.40 165.65 165.98
                                         898364
582773
                                                                                                                             NA
NA
                                                        DAY_1 2013-09-04
                                                                                        NA
                                                                                                    NΔ
                                                                                                                NA
NA
                                                        DAY_1 2013-09-05
                                                                                        NA
                                                                                                    NA
   165.88 166.98 164.48 165.84 1462634
166.15 167.80 166.15 167.79 814071
                                                        DAY_1 2013-09-06
DAY_1 2013-09-09
                                                                                                                             NA
NA
                                                                                        NA
                                                                                                    NΑ
                                                                                                                NA
NA
   168.06 168.90 167.64 168.70
168.64 169.61 168.35 169.45
                                                                                                                             NA
NA
                                           976159
                                                        DAY 1 2013-09-10
                                                                                        NA
                                                                                                    NΔ
                                                                                                                NA
NA
NA
                                                        DAY_1 2013-09-11
                                                                                        NA
                                           826807
                                                                                                    NA
                                                        DAY_1 2013-09-12
DAY_1 2013-09-13
                                                                                                                             NA
NA
    169.35 169.74 168.72 169.14
                                          752439
                                                                                        NA
                                                                                                    NΔ
    169.03 169.59 168.58 169.53
                                           657959
                                                                                        NA
                                                                                                    NA
10 171.00 171.61 169.34 170.18 1079380 11 170.10 171.22 170.05 171.13 695315
                                                        DAY_1 2013-09-16
                                                                                        NA
                                                                                                    NΑ
                                                                                                                             NA
NA
NA
                                                                                                                NA
NA
NA
NA
                                                        DAY_1 2013-09-17
                                                                                        NA
                                                                                                    NA
12 171.11 173.52 170.58 173.16 1703056
                                                        DAY 1 2013-09-18
                                                                                        NA
                                                                                                    NΔ
13 173.46 173.86 172.59 172.82 1164763
                                                         DAY_1 2013-09-19
                                                                                        NA
14 172.12 172.50 170.57 170.64 1236445
15 171.04 171.17 169.39 169.70 936418
                                                                                                               NA
NA
                                                        DAY_1 2013-09-20
                                                                                        NA
                                                                                                    NΔ
                                                                                                                             NA
                                         936418
859227
                                                         DAY_1 2013-09-23
                                                                                        NA
                                                                                                    NA
                                                                                                                             NA
                                                                                                                NA
NA
16 169.65 170.53 169.21 169.55
                                                        DAY_1 2013-09-24
                                                                                        NA
                                                                                                    NΑ
                                                                                                                             NA
   169.33 169.98 168.89 169.19 1102872
                                                         DAY_1 2013-09-25
18 169.33 170.17 169.05 169.94 742390
19 169.65 169.66 168.47 169.01 909434
20 167.98 168.97 167.15 168.22 1365546
                                                        DAY 1 2013-09-26
                                                                                       NA
                                                                                                    NA
                                                                                                                NA
                                                                                                                             NA
                                                        DAY_1 2013-09-27 NA NA NA NA NA DAY_1 2013-09-30 164.6734 169.0180 173.3626 0.4081621
21 168.65 169.69 167.97 169.40 1107371
                                                         DAY_1 2013-10-01 165.2739 169.0544 172.8348 0.5457114
22 168.65 169.34 167.83 168.25 1015636
23 168.47 169.23 166.84 167.46 1611752
                                                        DAY_1 2013-10-02 165.4615 168.9778 172.4940 0.3965128 DAY_1 2013-10-03 165.5519 168.8332 172.1145 0.2907486
24 167.65 169.06 167.53 168.84 877451
                                                        DAY_1 2013-10-04 165.9810 168.8339 171.6867 0.5010746
25 167.41 168.90 167.01 167.30
                                                         DAY_1 2013-10-07 165.7654 168.6878 171.6101 0.2625566
                                                        DAY 1 2013-10-08 165.1186 168.4270 171.7355 0.1256440
26 167.42 167.64 165.16 165.95 1641395
27 165.98 166.29 164.53 165.72 1570025
                                                         DAY_1 2013-10-09 164.4843 168.1692 171.8541 0.1676676
                                                        DAY_1 2013-10-10 164.5332 168.2245 171.9158 0.5711753 DAY_1 2013-10-11 164.7076 168.4327 172.1577 0.7654092
28 166.43 169.26 165.57 168.75 1758254
29 168.95 170.57 168.70 170.41
30 169.54 171.42 168.96 171.31 1045432
                                                        DAY_1 2013-10-14 164.8956 168.7067 172.5179 0.8415357
  plot(dataPlusBB$DATE_TIME,allData$CLOSE)
  lines(dataPlusBB$CLOSE, col = 'red')
lines(dataPlusBB$up, col = 'purple')
lines(dataPlusBB$dn, col = 'brown')
   lines(dataPlusBB$mavg, col = 'blue')
```



2013-09-03 2013-10-22 2013-12-11 2014-02-03 2014-03-25 2014-05-14

6.3 Alternatively, we can specify explicitly what type of moving average should be used as the basis for Bollinger Bands using function parameter 'maType', which simply take a moving average function name. Refer to ?SMA help page to see different types of moving averages supported in TTR library. For example, if you'd like to calculate an EMA Bollinger Bands, you can pass EMA to maType. Notice that in this example we are overriding default length parameter for moving average, using 14-period average this time.

> bbEMA = BBands(data, sd=2.0, n=14, maType=EMA)

## **RSI - Relative Strength Indicator**

7. RSI. To calculate RSI we use the RSI() function. You can use ?RSI command in R shell to get details for the function parameters. Basically, it's very similar to the functions we used above to generate moving averages. It has two required parameters: time series (such as 'CLOSE' column from our 'data' data frame, and 'n' integer value for the "length" of the RSI indicator.

```
> rsi14 = RSI(data, n=14)
```

Here the first parameter to RSI function is: data, which is a statement that says "take column named 'CLOSE' from the 'data' table, and return it as a list of values, and the second parameter is n=14, where the parameter name is 'n', and the value 14 indicates that we want to calculate 14-day RSI values on the close prices.



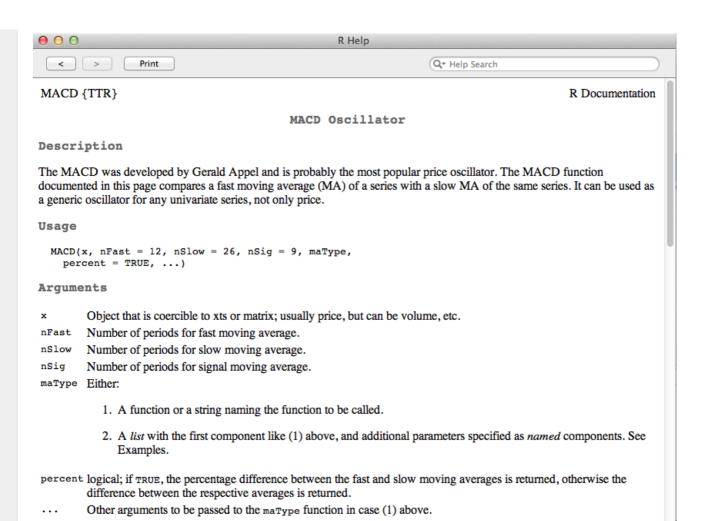
```
R Console
                                                                                   8
                                                    Q- Help Search
> head(data)
          HIGH
                  LOW CLOSE VOLUME BAR_SIZE DATE_TIME
   OPEN
1 165.36 165.58 163.65 164.35 1317248
                                         DAY_1 2013-09-03
2 164.34 166.09 164.13 166.04 898364
                                         DAY_1 2013-09-04
3 166.13 166.40 165.65 165.98 582773
                                         DAY_1 2013-09-05
4 165.88 166.98 164.48 165.84 1462634
                                         DAY_1 2013-09-06
5 166.15 167.80 166.15 167.79 814071
                                         DAY_1 2013-09-09
6 168.06 168.90 167.64 168.70 976159
                                         DAY_1 2013-09-10
> rsi14 = RSI(data[c('CLOSE')], n=14)
> head(rsi14, n=30)
                   NA
 [1]
           NA
                             NA
                                                        NA
                                                                 NA
 [9]
          NA
                   NA
                            NA
                                      NA
                                               NA
                                                        NA 70.12792 69.28576
[17] 67.19997 69.27516 63.87828 59.62866 63.53128 57.67929 53.99952 58.92871
[25] 52.20579 47.12976 46.30372 56.99685 61.51818 63.74387
```

## **MACD**

8. The MACD function takes several arguments:

- 1. input data series (such as 'CLOSE' price)
- 2. number of periods for "fast" moving average
- 3. number of periods for "slow" moving average
- 4. number of periods for the "signal" line

You can also optionally specify moving average function you want to use for MACD moving averages. See a screenshot of the help page below (you can also use ?MACD command in R shell to open the help page yourself):



Let's calculate a standard (12,26,9) MACD indicator using this function. We'll be using standard simple moving averages, so, we'll specify SMA function in 'maType' parameter:

> macd = MACD(data, nFast=12, nSlow=26, nSig=9, maType=SMA)

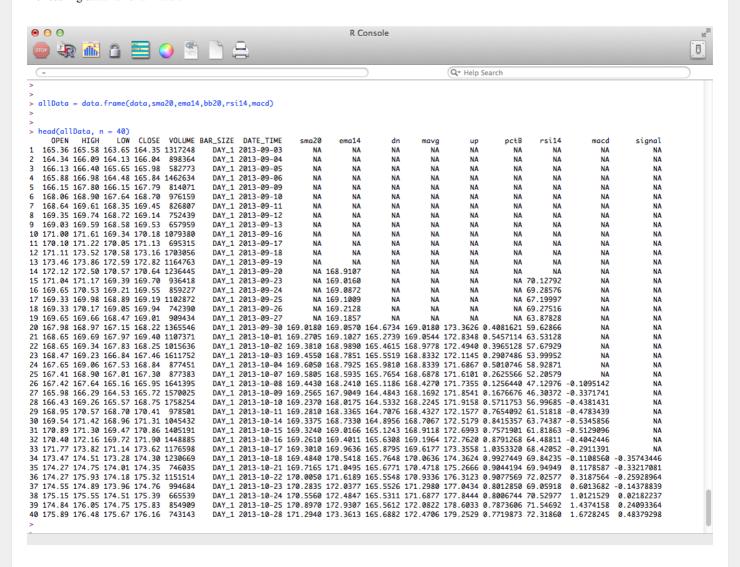
```
R Console
                                                                                               8
                                                           Q+ Help Search
> macd = MACD(data[c('CLOSE')], nFast=12, nSlow=26, nSig=9, maType=SMA)
> tail(macd, n =10)
            macd
                    signal
[178,] 0.6311686 0.6339976
[179,] 0.5305574 0.6303503
[180,] 0.3802553 0.6081955
[181,] 0.2910297 0.5761129
[182,] 0.3096272 0.5464777
[183,] 0.3165816 0.5091552
[184,] 0.3878241 0.4707256
[185,] 0.4475288 0.4402350
[186,] 0.4603753 0.4172164
[187,] 0.4944879 0.4020297
```

#### Join All Data Together

9. Now, we join all of the indicators calculated above with the original input data into a single data frame:



The data.frame() function takes any number of data frames and joins them row-wise, so that elements from corresponding rows are "glued" together in the resulting data.frame 'allData'.



#### Write to text file

And, finally, we write contents of 'allData' data frame to a comma-separated values file. We use write.table() function, which contains a large number of optional parameters. A detailed help page is available using command "?write.table" in R shell.

```
> write.table(allData, file="spy with indicators.csv", na="", sep=",", row.names = FALSE)
```

When we call write.table() function we pass the following arguments:

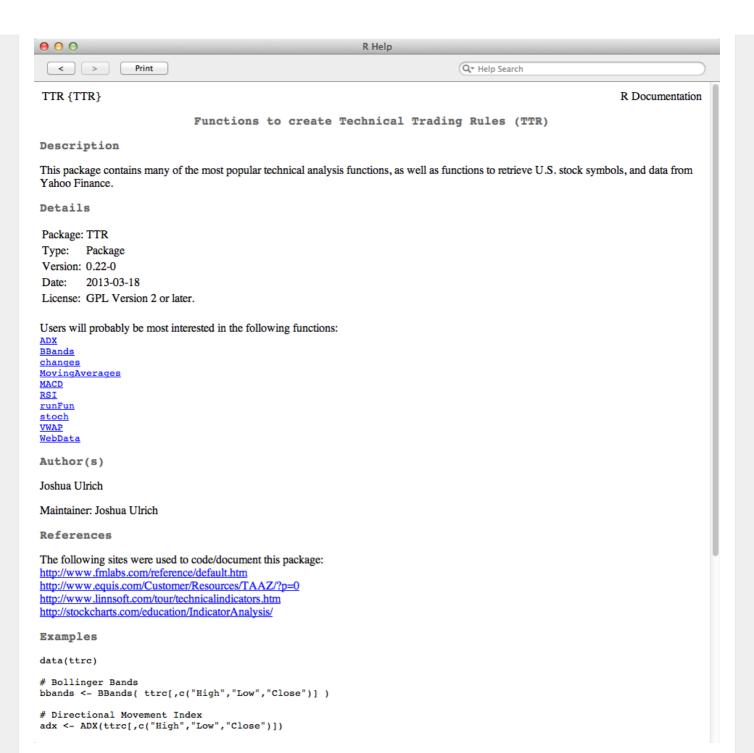
- allData this is simply a reference to the data frame containing data to be written to the output file.
- file = "..." this is the path and name of the file we are creating.
- na = "" makes sure that cells in the data frame that contain R value "NA" will contain empty values in the output file. Some cells have NA for rows where there were not enough data to generate a corresponding indicator value (for example first 19 rows for 20-day SMA).
- sep = "," sets column separator to comma (hence comma-separated values file). To create a tab-separated file (really a preferred format for serious software systems) use: sep = "\t".
- row.names = FALSE it is important to set this value, otherwise first column in the output file will contain row numbers.

The resulting file is available here. Right-click and select "Save Linked File As..." Downloaded file can be opened in Excel or text editor.

10. There are more functions and features available in the "TTR" library. You can find out more by bringing up TTR's help page:

> ?TTR





#### **CONCLUSION**

R provides a convenient and versatile environment for data analysis and calculations. In addition to thousands of free open-source statistical, mathematical libraries and algorithms, R contains a great number of functions and libraries for reading and writing data to/from files, databases, URLs, Web Services, etc... That, combined with the conciseness of the language, is a powerful combination that can help traders save precious time. Traders can significantly cut down the time required to prototype and backtest trading strategies using R. There are also methods to integrate R with mainstream programming languages such as Java and C++. Don't hesitate to post a comment or send as a message via Contact Us form if you have any questions regarding this material.

Finally, we'd like to mention a couple of books that have been very helpful in our development efforts. The first book — "Quantitative Trading with R" is a great mix of financial data analysis insights and application of R to backtesting, data exploration, and analysis. It has a number of great code examples and goes over a number of useful R packages. This is a good intro-to-intermediate level book for people who would like to build and backtest their own trading strategies.

The second book – "Mastering R for Quantitative Finance" – is a real gem. It contains more advanced information for traders with a good understanding of derivatives instruments and stronger mathematical background. We found that this book is a great follow up for the "Quantitative Trading with R". In addition to great R code samples and packages it contains overviews of a number of advanced (and practical!) quantitative finance models and algorithms, and lets you get your feet wet with R code straight away.







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#### 6 comments on "Technical Analysis with R"



Egor U fimtsev says: November 18, 2014 at 12:26 am

Great post! Thank you.

#### Reply



Bill Toomey says: November 25, 2014 at 7:20 am

- 1) can you use the downloaded data to make charts, with the indicators or oscillators?
- 2) can other perameters be used to screen for the right candidates? I don't want a thousand stocks to sift through.
- 3) is this a search screen or stocks have to be entered manually?
- 4) will all search criteria be updated automatically?
- 5) million other questions, but these seem the most relevant at this time.

You did a hell of a job doing all this work.

Is there a possibility that I could have you tweak a couple of things in the MACD?

# Reply



TradingGeek says:

May 6, 2015 at 12:58 pm

Dш,

Yes, you can definitely plot any time series data in R, including indicators, similarly to Bollinger Bands plot example in my post.

#### Reply



Joe Toh says: April 17, 2015 at 6:11 pm

wow this is really great better than a lot of other stuff i have read trying to understand how to build my own trading platform i can have control over. Would be great if there was a back testing guide as well

#### Reply



TradingGeek says: May 6, 2015 at 1:01 pm

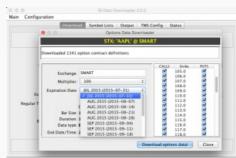


| Joe,  Thank you! I'll be happy to discuss backtesting and answer your questions if you drop me a line via the Contact Us form on the right.  Best Regards  |
|--|
| Reply  |
| ea-builder.net says: July 1, 2015 at 1:53 am  Thank you for sharing the link to the tutorial page, educative post here by the way!   |
| Reply  |
| Leave a Reply  |
| Your email address will not be published. Required fields are marked *   |
| Name *   |
| E-mail *   |
| Website  |
| Comment  |
|  |
|  |
| Post Comment   |
|  |
|  |
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- Runs on Windows, MacOS, Linux.
- Automatically handles IB API pacing violations, no restrictions on duration due to pacing limitations!

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More Information

\*Older version of IB Data Downloader (2.1) without support for options historical data available here for a reduced price.

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