## IE523: Financial Computing Fall, 2017

Programming Assignment 6: Using Fast-Fourier Transforms (FFTs) to filter Tick Data Due Date: 27 October 2017

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This programming assignment is about using the Fast Fourier Transform (FFT) algorithm to clean-up/process financial data. I am only going to cover the computational aspects of this procedure. To learn about the theory behind what we are going to do, you might want to look at Oppenheim and Schafer's classic text [1]. We will use the implementation of the FFT algorithm in NEWMAT.

I am going to give you the required "functional basics" for what an FFT is etc. There is a lot more to this topic than what I am going to cover here. The easiest way to get to the foundations of FFT is this – any periodic signal x(t) with period T (i.e. x(t+T)=x(t) for any t) can be written as a sum-of-sinewaves (click this wikipedia page for an illustrative example). That is,

$$x(t) = C_0 + \sum_{i=1}^{\infty} \left\{ A_i Sin\left( \left( i \times \frac{2\pi t}{T} \right) \right) + B_i Cos\left( \left( i \times \frac{2\pi t}{T} \right) \right) \right\}. \tag{1}$$

The terms  $A_i$  and  $B_i$  denote the *amplitude* (i.e. strength) of the sinewave/cosinewave whose frequency is  $\frac{i}{T}$  Hz – the larger these numbers are, the more "significant" is the "contribution" of this frequency-component to the value of  $x(\bullet)$ . To be a little more precise, the larger the value of  $\sqrt{A_i^2 + B_i^2}$ , there is a larger contribution from the  $\frac{i}{T}$  Hz component.

In essence, we are are going to take the ticker data for a given duration (in our case, it is for a day), and we are going to assume that it is a single-period of a (fictitious) periodic waveform. Consequently, we can write this ticker data "pattern" as a sum of sinewaves and cosinewaves. The summation is over a large number of such terms, but some of the sinewaves/cosinewaves might have a small contribution (i.e.  $\sqrt{A_i^2+B_i^2}$  is small, compared to the rest) – we just drop them – and we get a (smoother) "approximation" of the ticker data pattern. Such filtered/smoothened version of the data can be used in numerous ways – one of them is to do short-term prediction, possibly. Another, could be to come up with triggers for automated-trades, but that requires some experimentation on your part.

If the ticker data has n-many entries over a time period of T, it turns out we can generate the values of  $A_i$  and  $B_i$  ( $0 \le i \le n$ ) from the Fast-Fourier Transform (FFT) routine. The version in NEWMAT (click here for the NEWMAT documentation) that we will use has the format RealFFT(X, F, G);, where X is the (real-valued) ticker data array, and F (resp. G) is the real-part (imaginary-part) of the FFT of X. With reference to equation 1, it can be shown that for  $1 \le i \le \frac{n}{2} + 1$ ,

$$C_0 = \frac{1}{n}F(1); A_i = \frac{2}{n}F(i+1); B_i = \frac{2}{n}G(i+1).$$

To reconstruct the filtered tick data, you pick those components of F and G that contribute significantly (compared to the others) to the original signal. You compute a magnitude array whose *i*-th entry is  $\sqrt{\mathsf{F}(i)^2 + \mathsf{G}(i)^2}$ . Following this, you sort the entries of magnitude and pick the top-5, top-10, top-15 values of magnitude (and these are the sinewave and cosinewave components that are the "strongest" in the original tick data). After you picked the top, stronger components, in the F and G arrays, you zero-out the remaining entries of the F and G arrays, as their contributions are insignificant. You reconstruct the signal using the inverse of the FFT, which is RealFFTI(F, G, X); in the NEWMAT library. This is how the red, black, blue curves of figure 2 are generated.

In this programming assignment you are going to reconstruct a filteredversion of a (highly noisy/fluctuating) price-path of an instrument<sup>1</sup>.

Using the hint.cpp provided on Compass, and the video instructions, I want you to write a C++ program that takes the ticker/price-path data and takes as command-line inputs: (1) the #significant-terms in the fourier-series/fourier-expansion of the price-path, (2) the #data-points in the ticker-data, (3) input-file name that contains the ticker-data, and (4) the output-file that should contain the filtered-data (after the program completes). A sample output is shown in figure 1. The video instructions also tell you how to generate a sample output as shown in figure 2.

Here is what I want from you for this programming assignment

- 1. A short write-up that explains what your code does. No more than a page.
- 2. C++ code with appropriate Class definitions along the lines of hint.cpp that accomplishes what is required.

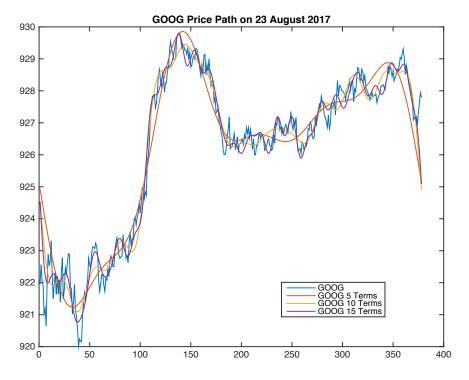
## References

[1] A.V. Oppenheim and R.W. Schafer. *Digital Signal Processing*. Prentice Hall, 1975.

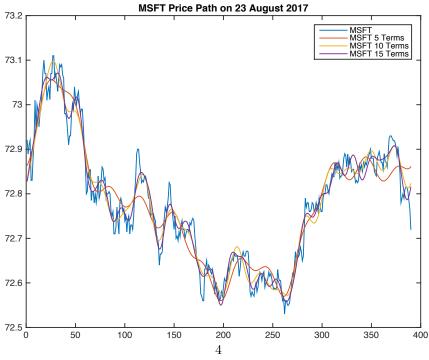
 $<sup>^1\</sup>mathrm{You}$  can get the second-by-second price-path of GOOG and MSFT recorded at COB on 23 August, 2017. The GOOG data has 378 data-points, while the MSFT data has 390 data-points.

```
wirelessprv-10-195-110-35:Debug sreenivas$ ./FFT1 5 378 GOOG_AUG23_2017 GOOG_AUG23_2017_5_Term
Input File Name: GOOG_AUG23_2017
Number of data points in the input file = 378
Number of dominant terms in the FFT = 5
Output File Name: GOOG_AUG23_2017_5_Term
wirelessprv-10-195-110-35:Debug sreenivas$ ./FFT1 10 378 GOOG_AUG23_2017 GOOG_AUG23_2017_10_Term
Input File Name: GOOG_AUG23_2017
Number of data points in the input file = 378
Number of dominant terms in the FFT = 10
Output File Name: GOOG_AUG23_2017_10_Term
wirelessprv-10-195-110-35:Debug sreenivas$ ./FFT1 15 378 GOOG_AUG23_2017 GOOG_AUG23_2017_15_Term
Input File Name: GOOG_AUG23_2017
Number of data points in the input file = 378
Number of dominant terms in the FFT = 15
Output File Name: GOOG_AUG23_2017_15_Term
wirelessprv-10-195-110-35:Debug sreenivas$ ./FFT1 5 390 MSFT_AUG23_2017 MSFT_AUG23_2017_5_Term
Input File Name: MSFT_AUG23_2017
Number of data points in the input file = 390
Number of dominant terms in the FFT = 5
Output File Name: MSFT_AUG23_2017_5_Term
wirelessprv-10-195-110-35:Debug sreenivas$ ./FFT1 10 390 MSFT_AUG23_2017 MSFT_AUG23_2017_10_Term
Input File Name: MSFT_AUG23_2017
Number of data points in the input file = 390
Number of dominant terms in the FFT = 10
Output File Name: MSFT_AUG23_2017_10_Term
wirelessprv-10-195-110-35:Debug sreenivas$ ./FFT1 15 390 MSFT_AUG23_2017 MSFT_AUG23_2017_15_Term
Input File Name: MSFT_AUG23_2017
Number of data points in the input file = 390
Number of dominant terms in the FFT = 15
Output File Name: MSFT_AUG23_2017_15_Term
wirelessprv-10-195-110-35:Debug sreenivas$
```

Figure 1: A sample output.



(a) The original, and fitered-price-paths for  ${\sf GOOG}$  on 23 August 2017



(b) The original, and fitered-price-paths for  ${\sf MSFT}$  on 23 August 2017

Figure 2: The original, and fitered-price-paths for  ${\sf GOOG}$  and  ${\sf MSFT}$  on 23 August 2017.