## the Hurst Exponent ... and financial stuff

motivated by e-mail from Carl F

Once upon a time, a British government bureaucrat named Harold Edwin Hurst studied 800 years of records of the Nile's flooding.

He noticed that there was a tendency for a high flood year to be followed by another high flood year, and for a low flood year to be followed by another low flood year.

Was that accidental ... or was there really some correlation between levels?

Did the height at year 5 have an effect on the height in year 6?

## >Are you talking about river levels ... or financial stuff?

Patience.

To analyze, we might do something like this:

1. Note the heights of the n flood levels:

2. Let **m** be the **M**ean of these levels:

$$\mathbf{M} = (1/n) [\mathbf{h}(1) + \mathbf{h}(2) + ... + \mathbf{h}(n)]$$

Calculate the deviations from the mean:

$$\mathbf{x}(1) = \mathbf{h}(1) - \mathbf{M}$$

$$\mathbf{x}(2) = \mathbf{h}(2) - \mathbf{M}$$

$$\mathbf{x}(\mathbf{n}) = \mathbf{h}(\mathbf{n}) - \mathbf{M}$$

Note that the set of **x**s have zero mean.

Positive x's indicate that the Nile level was above the average.

3. Now calculate the Sums:

$$Y(1) = x(1)$$

$$\mathbf{Y}(2) = \mathbf{x}(1) + \mathbf{x}(2)$$

$$Y(n) = x(1) + x(2) + ... + x(n)$$

Note that the set of partial sums, the Y's, are sums of zero-mean variables.

They will be positive if there's a preponderance of positive x's.

Note, too, that Y(k) = Y(k-1) + x(k).

4. Let  $\mathbf{R}(n) = MAX[\mathbf{Y}(k)] - MIN[\mathbf{Y}(k)]$ 

This difference between the maximum and minimum of the n values is called the Range

5. Let  $\mathbf{s}(\mathbf{n})$  be the standard deviation of the set of  $\mathbf{n}$  h-values.

As it turns out, the probability theorist William Feller proved that if a series of random variables (like the x's) had finite standard deviation and were independent, then the so-called R/s statistic (formed over n observations) would increase in proportion to  $n^{1/2}$  (for large values of n).

#### >Huh? The so-called R/s statistic?

Yes. Apparently lots of people are interested in this animal. (See this **PDF stuff**)

This guy, R/s, is called the rescaled range

Anyway, we now have:

$$\mathbf{R}(n) / \mathbf{s}(n) \sim k \mathbf{n}^{1/2}$$
 ... where k is some constant

If that were true, then we'd expect that:

$$\log(\mathbf{R/s}) \sim \log(\mathbf{k}) + (1/2)\log(\mathbf{n})$$

So, if we were to plot  $log(\mathbf{R/s})$  vs  $log(\mathbf{n})$ , we'd expect it to be approximately a straight line with slope (1/2).

#### >A logarithm to what base?

It doesn't matter.

Anyway, what Hurst apparently found, was that the plot had a slope closer to 0.7 (rather than 0.5).

#### >So, what's that mean?

I guess it means that the annual Nile levels weren't independent, but this year's level might be expected to affect next year's level. Indeed, if the slope of the  $log(\mathbf{R} / \mathbf{s})$  vs  $log(\mathbf{n})$  "best fit line" is **H**, then we'd expect:

$$\mathbf{R} / \mathbf{s} \sim \mathbf{kn}^{\mathbf{H}}$$

>Don't tell me! That **H** is the Hurst Exponent, right?

You got it.

>So what's it got to do with financial stuff?

Patience.

>So where's the spreadsheet?

Patience.

The interesting thing is that many things seem to exhibit this long term patterns or dependence ... seven years of plenty followed by seven years of plenty.

>Sounds like a biblical reference.

Yes. It's called the Joseph Effect

>Do you realize that don't have a single picture? A picture is worth a thousand ...

# **Hurst Examples**

Okay, let's look at 300 daily returns for Exxon stock.

We'll call them h(1), h(2), ... h(300).

We calculate the Mean of these 300 returns. We'll call it M.

M = (1/300) [h(1) + h(2) + ... + h(300)]

Then we calculate x(1), x(2), ... x(300), the 300 deviations from the Mean: x(1) = h(1) - M, x(2) = h(2) - M, ... x(300) = h(300) - M.

These devations are shown in green, in Figure 1.

(The average of these deviations is zero!)

Now we calculate the Y's::

$$Y(1) = x(1), Y(2) = x(1)+x(2), ... Y(300) = x(1)+x(2)+...x(300).$$

The Y's are shown in red, in Figure 1.

Now we find the maximum Y and the minimum Y and subtract them.

That's the Range,  $\mathbf{R} = \text{Max}[Y] - \text{Min}[Y] \dots$  in blue.

Finally we calculate the Standard Deviation of the h's:

$$s = STDEV[h(k)]$$

>And you get a Hurst exponent ... somehow?

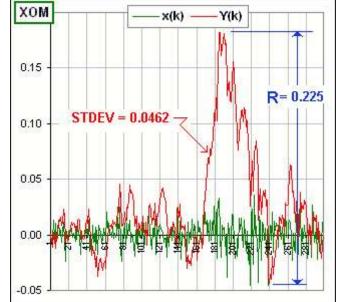
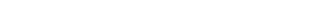


Figure 1



Okay, from the above scheme we note two magic numbers:

$$\mathbf{n} = 300, \mathbf{R} / \mathbf{s} = 0.225 / 0.0462 = 4.87.$$

That'll give us one point on our log(R/s) vs log(n) chart, namely

$$log(300) = 5.70$$
 and  $log(4.87) = 1.58$ .

Now we repeat the above scheme for 310 points, then 320 points etc. etc., each time generating a point on our chart, and ...

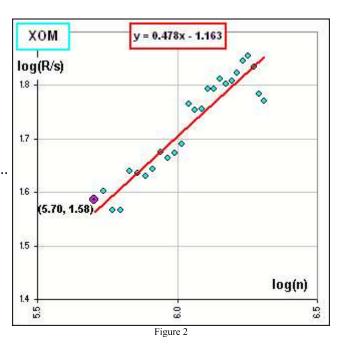
## >Just give us the chart, okay?

Okay, see Figure 2

You see our first point? We calculated points up to n = 550.

## >And the Hurst exponent is ... uh, the slope?

Yes. At least it's an *estimate* of the Hurst Exponent  $\mathbf{H} = 0.478$ .



>Pretty close to 1/2, eh?
Yes, and that'd imply that daily returns for XOM are random, uncorrelated, a Brownian motion, independent ...

>Yeah, yeah. Do you always get that? Patience ...



For a great read on Hurst stuff, see bearcave.com

gummy stuff