

# Advanced Risk Management

## Computer Exercise Week 1

In this exercise, we compare the RiskMetrics VaR to the (Weighted) Historical Simulation approach. We compare the time patterns of the three VaR measures applied to S&P 500 index returns in the period January 2001 through December 2010. Next, we evaluate the three approaches using backtests.

Efficient programming of the Weighted Historical Simulation method requires a function that can deliver weighted percentiles from a sample. The code for this has been found on the web, and imported in the Jupyter notebook `ComputerExercise1.ipynb`, which also loads the necessary data (using the pandas `DataReader` connected to Yahoo! Finance; this does not always work properly, and alternatively the data can be imported from `SP500.csv`). The notebook will need to be completed for this exercise.

1. Calculate the 1%, one-day VaR for S&P 500 index returns for each day in the evaluation period (January 2001 through December 2010), using each of the three methods, and keep the result in three vectors / arrays. The scripts already contain the definition of a weight vector  $w$ , based on a historical period  $m = 250$ , and a parameter  $\eta = \lambda = 0.94$  for the WHS and RM methods. Note that WHS and the  $\sigma_{t+1}$  sequence in RM need a start-up sample period, for which we use data from the year 2000 (252 observations).

*Note:* an easy way to implement the RM method to construct  $\sigma_t^2$  is to use the `series.ewm()` function from pandas. Note that in that function,  $\alpha = 1 - \lambda$ , and also that you need to apply this to the *lagged* squared return (so using the `series.shift()` function).

2. Make a figure where each of the three VaR measures are plotted against time. Discuss the similarities and differences.
3. Investigate the effect of changing the  $\eta$  parameter in the WHS method: what happens if we give  $\eta$  a value very close to 1, e.g. 0.999?
4. Construct the hit sequences  $I_{t+1} = \mathbb{I}(R_{t+1} < -VaR_{t+1}^{0.01})$ , for each of the three VaR methods.<sup>1</sup> Next, test unconditional coverage and independence using the methods described in the slides (you may also use Christoffersen's LR tests for comparison). What do you conclude?

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<sup>1</sup> $\mathbb{I}(\cdot)$  is the indicator function, i.e.,  $\mathbb{I}(A) = 1$  if  $A$  is true and 0 otherwise.