

Name	.....(doubleclick and fill in).....
Student number	.....(dubbelclick and fill in).....

## E\_EOR3\_EFIN

19 December 2017 – 15:15 – 18:00

1. Following files will be provided to you to work and save your work in
  - a. word.docx
  - b. excel.xlsx
  - c. matlab.m
  - d. sp500Returns.csv
2. You might want to make a copy of these files and right away rename them into, e.g. word\_yourstudentnumber.docx, in case something goes wrong and you have to resume to the original files.
3. Important!!! Save your work regularly with CTRL+s
4. After finishing the exam submit your solution files digitally. Follow the instructions at the end of this documents. Files have to be submitted one after another.

***Type your answers in the respective text fields***

### 1. Data

- a) The following table shows summary statistics for S&P 500 data. Name three essential facts about the return data/distribution you can infer/learn from these statistics and explain in one sentence your reasoning. [9 points] - [ ]

S&P 500 Statistics

January 1929 to June 2015, daily returns

Mean	0.019%
Standard deviation	1.15%
Min	-22.9%
Max	15.4%
Skewness	-0.4
Kurtosis	22.1
Autocorrelation (one lag) of returns	2.9%
Autocorrelation (one lag) of squared returns	21.7%

- Returns are not normally distributed since slightly skewed and large kurtosis
- Return distribution is fat tailed given large kurtosis value
- Low autocorrelation in returns hints towards no predictability in returns
- Substantial autocorrelation in squared returns hints towards predictability in squared in returns and is first indication of volatility clustering

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## 2. Factor Models

- a) Name three different approaches to come up with a factor specification for a multi-factor model. [6 points] - [   ]

- Macroeconomic approach
- Fundamental approach
- Statistical approach

- b) State the most commonly quoted equation of the CAPM. Define all components of the model and in particular state what type of systematic-risk the employed factors proxy for. [10 points] - [   ]

The most commonly quoted equation for the CAPM is  $E(R_i) = R_f + \beta_i [E(R_m) - R_f]$

- So the CAPM states that the expected return on any stock  $i$  is equal to the risk-free rate of interest,  $R_f$ , plus a risk premium.
- This risk premium is equal to the risk premium per unit of risk, also known as the market risk premium,  $[E(R_m) - R_f]$ , multiplied by the measure of how risky the stock is, known as 'beta',  $\beta_i$
- Excess return proxies for market wide risk

## 3. Volatility Modeling

- a) Describe in 2-3 sentences how the MA model and the EWMA model differ in modeling volatility. Which model is in your opinion more reasonable to use from an economic perspective [8 points] - [   ]

The MA model uses equally weighted historical observations to calculate and estimator for future volatility, whereas the EWMA model exponentially weights historical observations. That is, more recent observations have a higher weight in calculating the variance than older observations. Therefore, the EWMA model is economically more reasonable since more recent events should have a stronger impact on future volatility than events further back in the past.

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b) In the following you see a model which can be used to model variance.

$$y_t = \mu + \epsilon_t \text{ with } \epsilon_t = \sigma_t u_t$$

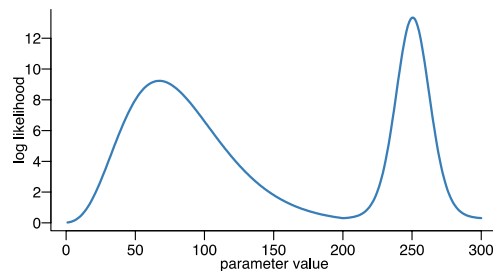
$$\sigma_t^2 = \omega + \alpha \epsilon_{t-1}^2 + \beta \sigma_{t-1}^2$$

First, give the precise name of the model. Second, list all parameters of the model and give an economical interpretation of those parameters. [10 points] - [ ]

- The model is an AR(1) for the return process and a GARCH(1,1) for the variance process
- The parameters are  $\mu$  (expected return over one time interval),  $\omega$  (roughly the long-run mean of variance),  $\alpha$  (news factor),  $\beta$  (memory factor)

#### 4. Model Estimation

a) Assume the log-likelihood function of a model has the form depicted in the following graph. What problem arises when estimating the model parameters with maximum likelihood for such a model? [6 points] - [ ]



The maximization algorithm could get stuck in a local minima which results in a parameter estimate of around 70 versus the globally optimal parameter estimate of around 250.

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b) Suppose the following model is given

$$y_t = m + \epsilon_t \text{ with } \epsilon_t = \sigma_t u_t$$

$$\sigma_t^2 = \omega + \alpha \epsilon_{t-1}^2$$

with  $u_t \sim N(0,1)$ . The normal density function is given by

$$f(x) = \frac{1}{\sqrt{2\pi}\sigma} \exp\left(-\frac{1}{2} \frac{(x-\mu)^2}{\sigma^2}\right)$$

Write down the density  $f(y_2|y_1)$  for the given model.

[8 points] - [ ]

$$f(x) = \frac{1}{\sqrt{2\pi(\omega + \alpha \epsilon_{t-1}^2)}} \exp\left(-\frac{1}{2} \frac{(x-m)^2}{(\omega + \alpha \epsilon_{t-1}^2)}\right)$$

## 5. Value-at-Risk Forecasting

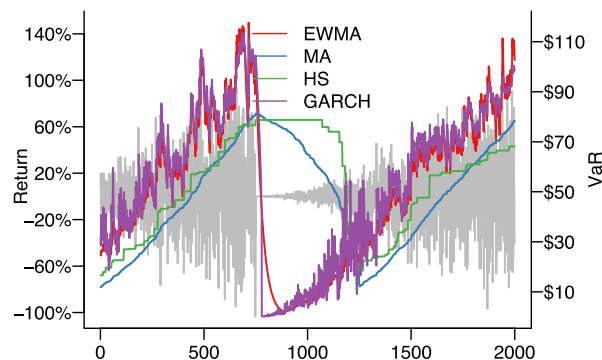
a) Outline one disadvantages of obtaining a VaR forecasts using a parametric method combined with a GARCH model.

[5 points] - [ ]

Parametric methods are based on estimating some distribution of the data, from which a VaR forecast is obtained. this inevitably means that estimation error and model risk become a serious concern, often making the choice of model difficult.

b) Argue which of the models depicted in the following graph used to forecast value-at-risk values you prefer the least and why.

[6 points] - [ ]



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I dislike the most HS model since it takes the most time to adapt to a change market environment in terms of changed volatility. Therefore, it can produce for a prolonged period of time a biased VaR forecast.

## 6. Multiple Choice

The answer of the following multiple choice questions have to be stored in the file **excel.xlsx** on the sheet "**Multiple Choice Solutions**". To indicate the solution use i, ii, iii, iv, respectively. Each correct answer earns you 3 points. [42 points] - [ ]

- a) Factor models can be used to
- (i) price assets
  - (ii) evaluate the performance of fund managers
  - (iii) manage risk
  - (iv) **All** of the above

....

...

## 7. Programming

All the following questions have to be solved in the file **matlab.m**. While programming remember to save regularly. The outcome/results of running your code has to be stored for each sub question in the file **excel.xlsx** on the sheet "**Matlab Programming Solutions**".

- a) Use the matlab function "*importdata*" or "*csvread*" to import the file "*sp500Returns.csv*" which contains S&P 500 return data. Calculate the
- (i) mean
  - (ii) standard deviation
  - (iii) the autocorrelation of the returns based on the first lag
  - (iv) the autocorrelation of the squared returns based on the first lag

[20 points] - [ ]

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- b) In the “*matlab.m*” file there are two functions provided to you: “*portfolioVaR*” and “*simPathFunc*”. The goal is to use those two functions to simulate/calculate the 5% VaR of a portfolio consisting of one stock. All needed input parameters are predefined in “*matlab.m*” under “8 b) Start run MC simulation to calculate VaR”. In the two provide functions there are three bugs. In order to calculate the 5% VaR one needs to call the functions accordingly and debug.

[15 points] - [ ]

- c) Use matlab code to program a function (“*bsOption*”) that calculates the Black & Scholes call option price. The formula which needs to be implemented is given by

$$C = S_0 N(d_1) - e^{-r(T-t)} K N(d_2)$$

with  $d_1 = \frac{\ln\left(\frac{S_0}{K}\right) + \left(r + \frac{\sigma^2}{2}\right)(T-t)}{\sigma\sqrt{(T-t)}}$  and  $d_2 = d_1 - \sigma\sqrt{(T-t)}$ . The  $N(\cdot)$  denotes the CDF of a standard normal distribution. Calculate the value for the Black & Scholes formula for the parameter values given in the following:  $S_0 = 100$  is the stock price today,  $K = 100$  is the strike price,  $r = 0.05$  is the risk free interest rate,  $(T - t) = 0.5$  is the time to maturity,  $\sigma = 0.2$  is the volatility of the stock. Matlab functions that you might want to use: `normcdf()`, `exp()`, `log()`.

[20 points] - [ ]

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## HANDING IN YOUR EXAM

- Save your files as
  - `word_yourstudentnumber.docx` (e.g. `word_1234567.docx`)
  - `excel_yourstudentnumber.xlsx` (e.g. `excel_123456.xlsx`)
  - `matlab_yourstudentnumber.m` (e.g. `matlab_123456.m`)
- Submit all three files separately:
  - Click on the link “Submit Exam” and log on with your VU-net-ID (you can change the language of the website by clicking on the flag in the right top corner).
  - Upload your document and click on the button “inleveren/submit”.
  - Green check mark?
- Your document has been submitted, leave the hall quietly!