

2-3 July, 2020

Jörg Kienitz and Nikolai Nowaczyk

present

## Machine Learning for Option Pricing, Calibration and Hedging

### MASTERCLASS

The goal of this two-day workshop is to provide a detailed overview of machine learning techniques applied for finance. We offer insights into the latest techniques of using such techniques for modelling financial markets where we focus on pricing and calibration.

We not only tackle the theory but give practical guidance and live demonstrations of the computational methods involved. After introducing the subject we cover Gaussian Process Regression and Artificial Neural Networks and show how such methods can be applied to solve option pricing problems, speed up the calculation of xVAs or apply them for hedging.

We further show how to use existing pricing libraries to interact with machine learning environments often set up in Python.

We explain how to set up the methods mainly in Python using Keras, Tensorflow or SciKit Learn. We give many examples which are directly related to financial mathematics and can be explored further after the course. All the material is available as Jupyter notebooks. For Gaussian Processes we use Matlab and Python examples.

This workshop covers the fundamentals and it illustrates the application of state-of-the-art machine learning applications for application to Mathematical Finance.

## Course Highlights

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This workshop covers the latest techniques for mastering the application of Gaussian Process Regression methods and Artificial Neural Networks techniques. We consider the theoretical underpinnings and give finance related examples in Matlab and/or Python. Especially we cover:

- Overview of some Machine Learning techniques mainly Deep Learning
- Implementation and Examples for pricing, calibration and hedging
- Gaussian Process Regression for option pricing
- The maths of Neural Networks (with examples)
- Deep learning for pricing using term structure models
- Deep learning for calibrating Stochastic Volatility Models

## Course Methodology

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Presentation and examples (Matlab/**Jupyter Notebooks**)

## Prerequisites

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We aim to introduce all concepts from scratch but a good understanding of basic math (linear algebra, optimization, probability and calculus) would be useful.

## Who should attend?

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Quant developers wishing to supplement their professional expertise with a foundation in Machine Learning.



## Course Content

### Machine Learning and Finance Overview

#### *- Machine Learning*

- Supervised Learning for Classification, Regression
- Unsupervised Learning
- Self-supervised Learning
- Reinforcement Learning

#### *- Finance*

- Pricing and hedging
- Calibration
- Simulation and exposure

### Machine Learning and Finance – Programming Overview

#### *- ML and Financial Applications - Technology Overview*

- Python, Tensorflow, Keras
- C++, Java, Matlab, QuantLib/ORE

#### *- Interfacing*

- Python – Excel (xlwings)
- Python - QuantLib/ORE
- Python - Matlab

#### *- Some illustrations*

- Exposure for Bermudan Swaptions in Tensorflow
- Hull-White with PDE in Python using QL
- Monte Carl - Simulation in Tensorflow

### Artificial Neural Networks in Finance – introduction and examples I

#### *- Introduction to Artificial Neural Networks*

- Construction
- ANN at work

#### *- ANN math recap (with examples)*

- on Linear Algebra
- on Optimization: Stochastic gradient descent, ...
- on Autodifferentiation: Backpropagation

#### *- Illustration: Learning a function*

#### *- It's only an approximation!*

#### *- Illustration for pricing:*

- Black-Scholes Merton Model
- Term-Structure Models
- Heston

#### *- Preprocessing/feature engineering*

#### *- Overfitting / underfitting*

#### *- Train, validate, test*

#### *- Hyperparameters*

#### *- Different types of networks*

- FNN - Feed Forward
- CNN - Convolutional
- RNN - Recursive
- LSTM - Long Short Term Memory
- VAE – Variational Autoencoders
- GAN - Generative Adversarial Networks

### Artificial Neural Networks in Finance – introduction and examples II

#### *- Calibration basics*

#### *- Illustration: Deep calibration*

- Heston Model
- Rough Bergomi Model

#### *- Hedging basics*

#### *- LSTMs revisited*

#### *- Illustration: Deep Hedging*

### Gaussian Process Regression (GPR)

#### *- Intro to GPR and Regression*

- How does it work?
- train, validate, test
- Covariance Functions

#### *- Pricing models and methods*

#### *- GPR and Option Pricing (Heston, American options, ...)*

#### *- Variational Autoencoder*

### AOB

#### *- ML and Model Validation*

#### *- Perspectives*

## About the Speakers

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### Jörg Kienitz

**Jörg** is partner at Quaternion Risk Management and owner of the finciraaptor website (finciraaptor.de). He is primarily involved in consulting on model validation, model development and model implementation. Furthermore, Jörg acts as a trainer for public and onsite classes.

He lectures at the universities of Wuppertal where is an assistant professor and Cape Town where is adjunct associate professor. The topics are advanced financial modeling, numerical methods, stochastics and machine/statistical learning. Further to the academic engagements Jörg talks on finance conferences such as Quant Minds or WBS Quant conference.

Jörg holds a Ph.D. in stochastic analysis and probability theory and authored several papers and four books “Monte Carlo Object Oriented Frameworks in C++” (with Daniel J. Duffy) “Financial Modelling” (with Daniel Wetterau), “Interest Rate Derivatives Explained I” and “Interest Rate Derivatives Explained II” (with Peter Caspers).

### Nikolai Nowaczyk

**Nikolai** is a senior consultant at Quaternion Risk Management. He is primarily involved in consulting on model validation, model development and model implementation.

He talks on Mathematical Finance and Tech conferences including WBS Quant Conference or PyData. The topics are on financial modeling, numerical methods and data analytics. He contributed to the famous SciPy library.

Nikolai holds a Ph.D. in differential geometry and authored several papers.

## What do you receive?

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The course price includes coffee, tea, lunch and refreshments.— and Day 1 will be followed by drinks and an opportunity to mingle socially.

You will be issued with a certificate of attendance upon completion.



## Attention

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This course takes place in the form of a series of short seminars and does not involve practical work by the participants. However all code and resources used are provided after the course.

## Further Information

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**Dates:** 2 Days – July 2—3rd, 2020

**Venue:** Central London (TBA)

**Cost:** £1999 (exc VAT)

## Registration

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Please Return Application form by email to [jacob@moneyscience.com](mailto:jacob@moneyscience.com) or by post to:

### Financial Training

MoneyScience Ltd c/o Jacob Bettany,

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## Group Discounts

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10% for 2 delegates, 20% for 3 or more delegates. (not eligible for 'early bird')

## Enquiries

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**Jacob Bettany, Managing Director**

**Tel:** +44 (0) 1275 540563

**e-mail:** [jacob@moneyscience.com](mailto:jacob@moneyscience.com)

**Skype:** MoneyScience

## Registration Form

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How did you hear about this Course?	
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**SIGNED** .....

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If a person which has registered for this course is unable to attend for whatever reasons, a substitute representative may be appointed to participate in advance. Cancellation will be accepted only in written form no later than twenty calendar days prior to the date of the course while a cancellation fee in the amount of 10% of the price or block price will be charged. Cancellation of participation within a period of less than twenty calendar days prior to the date of the course is not possible for technical and organisational reasons. MoneyScience reserve the right at all times to cancel participation or cancel the entire seminar for whatever unspecified reasons, including possible force majeure. In this case, the price will be refunded in full to the applying participant.

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### Tuition Language

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### Registration

Clients who decided to participate, should submit their registration by mail to us in advance. Subject to availability, the participant will then receive a confirmation of participation. In some case the number of participants is strictly limited to preserve an effective and focused learning environment.

### Seminar Prices

The quoted seminar prices are per person and include all course material, lunches and refreshments, The price does not include hotel accommodation. Quoted prices are exclusive of VAT.

### Discounts

Bulk discounts are offered when submitting an application for the participation of more than one person. Please contact [jacob@money-science.com](mailto:jacob@money-science.com) for further details.

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