



Python for Finance

EuroScipy 2012 in Brussels

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26. August 2012

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“Simplicity is the ultimate sophistication.”

Steve Jobs

**... and Python provides quite simply the
most simple programming environment.**

WHY PYTHON FOR FINANCE (1)?

easy-to-learn

**easy-to-
comprehend**



**highly
productive**

**good
performance**

Lecture at Saarland University, Germany

**“Numerical Methods for the Market-Based
Valuation of Options”**

by Dr. Yves J. Hilpisch

<http://mathfin.visixion.com>

Python used to illustrate numerical
methods and financial models.

MBV_Lecture_16012012 - DEXISION Wiki - Mozilla Firefox

development.dexision.com/DEXisionWiki/MBV_Lecture_16012012

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Page

- Immutable Page
- Info
- Attachments
- More Actions:

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- Login

Numerical Methods for the Market-Based Valuation of Options

10. Lecture/Tutorial on 16. January 2012

This lecture is completely dedicated to realistic Short Rate modeling. The lecture focuses on the Cox-Ingersoll-Ross (1985) square-root diffusion model and shows how to calibrate it to German Bund yields and how to simulate it based on a simple Euler discretization scheme.

- Slides of the Lecture: [@ Slides as PDF](#) (as of 15 Jan 2012)
- Python Scripts displayed in the slides: [@ MBV Python 16012012.zip](#)
- Article of Cox-Ingersoll-Ross(1985): [@ Cox Ingersoll Ross 1985.pdf](#)
- Article of Dai-Singleton (2000): [@ Dai Singleton 2000.pdf](#)
- Article of Lord-Koekkoek-van Dijk (2008): [@ Lord Koekkoek van Dijk 2008.pdf](#)

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```

IPython
...: r = 0.06          # risk-less short rate
...:
...: M = 50           # time steps
...: I = 5000         # number of simulated stock price paths
...:
...: dt = T/M         # time increment
...: df = exp(-r*dt)  # discount factor per time increment
...:

In [7]: ## Generate Stock Price Paths
...: S = zeros((M+1,I),'d')
...: S[0,:] = S0
...: for t in range(1,M+1):
...:     ran = standard_normal(I)
...:     S[t,:] = S[t-1,:]*exp((r-0.5*(vol**2))*dt + vol*sqrt(dt)*ran)
...:

In [8]: ## Inner Value with for Loops
...: h = zeros((M+1,I),'d')
...: for m in range(M):
...:     for i in range(I):
...:         h[m,i]=max(K-S[m,i],0)
...:

In [9]: ## Inner Value with Numpy Array Operation
...: h = maximum(K-S,0)

In [10]: |

```

Technical necessities (like indexing) make it difficult to grasp the economics behind the code

Easy-to-understand since highly compact and quite close to mathematics

Finance Book

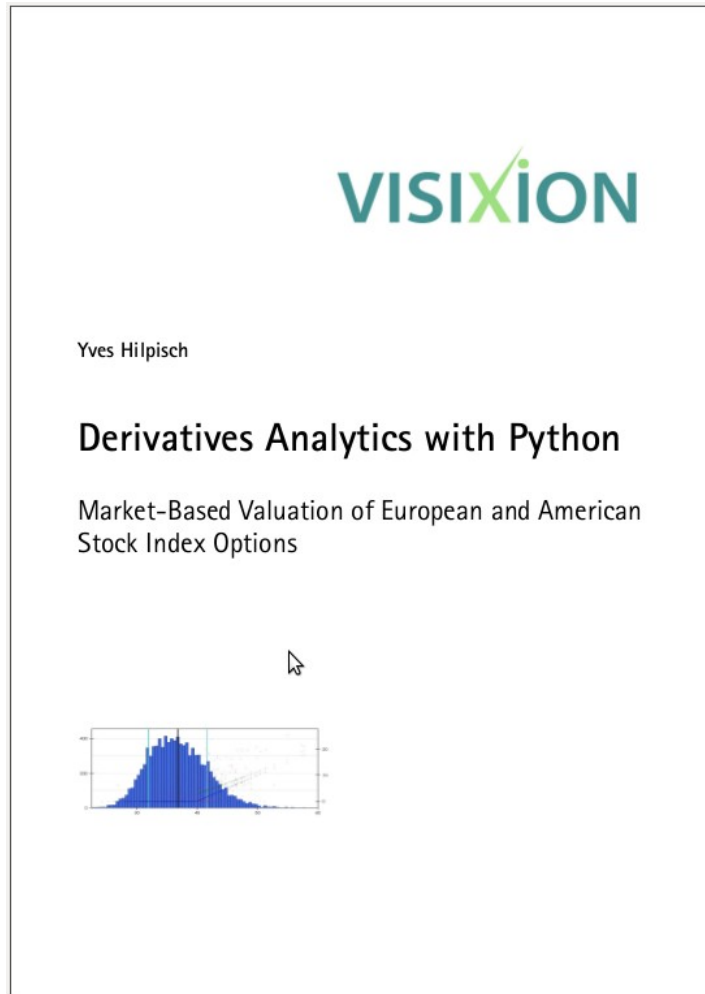
“Derivatives Analytics with Python”

by Dr. Yves J. Hilpisch

323 pages, available upon request

<http://www.visixion.com>

Python used to illustrate numerical methods and financial models.



Topics covered in the book:

- financial data analysis
 - basic option models
 - Fourier-based option pricing
 - Monte Carlo simulation
 - model calibration
 - market-based valuation
 - dynamic option hedging
- with self-contained set of Python scripts

Derivatives Analytics On Demand

DEXISION

by Visixion GmbH

<http://www.dexision.com>

**Full-fledged, commercial analytics suite
with core implemented in Python.**



```
https://analytics.dexision.com/DEXISIONeval.py?  
user=online&company=visixion&pwd=qwertzui  
&paths=10000&steps=50  
&portfolio=MS2009/Heston_CIR  
&format=xml
```

On Demand = Web Service
= Universal Integrability

Research Paper

“Fast Monte Carlo Valuation of American Options” (presented @ EuroScipy 2011)

by Dr. Yves J. Hilpisch

<http://www.visixion.com>

Python & NumPy used to implement fast Monte Carlo algorithm.

“Fast Least Squares Monte Carlo Simulation for American Option

We know least-squares Monte Carlo simulation to price an American option is time consuming because it involves optimal exercise decision on every step of a large number of simulation (in the least square case, to run a polynomial regression on cash flows and decide whether it is optimal to exercise or not). I once shared a simple **Matlab** file to illustrate the least squares Monte Carlo simulation. The situation becomes worse if we allow the presence of stochastic volatility and interest rate, typically **my codes run quite a few minutes** for 50,000 number of simulations.

In the paper "Fast Monte Carlo Valuation of American Options under Stochastic Volatility and Interest Rates" by Y. Hilpisch, the author demonstrates with **Python** script that the Least-Squares Monte Carlo (LSM) algorithm with control variates takes only **less than one second** to achieve satisfying accurateness. The overall statistics taken from the paper are as follows, AMAZING!”

from <http://www.mathfinance.cn>

“... a Matlab code implementing the algorithm of Longstaff and Schwartz (2001) takes **dozens of minutes** to compute a single option price ...”

Medvedev and Scaillet (2009)

2 Seconds

DEXiSION

**unified
platform**

**powerful
libraries**



multi-purpose

open source

Client Project

for

Eurex Frankfurt AG

by Visixion GmbH

<http://www.visixion.com>

**Python used to replace heterogeneous
IT landscape in certain areas.**

“Visixion GmbH has developed and conducted a focused Python training for selected people at Eurex, one of the world's leading derivatives exchanges. The major goal is to replace in certain areas a heterogeneous IT infrastructure (including, amongst others, Matlab and R) by Python as the main programming environment. Requirements are increased productivity, fast development cycles, easy collaboration, easy-to-maintain solutions and high performance.”

from <http://www.visixion.com>

Python libraries

used at

Visixion GmbH

For financial applications, Visixion regularly uses a select few Python libraries.



NumPy – fast, efficient array manipulations

SciPy – scientific computing

matplotlib – 2d and 3d plotting

pandas – convenient data analysis

Cython – C extensions for Python

PyTables – database optimized for fast I/O operations

Everyday tasks

at

Visixion GmbH

Python used to implement and automate a number of administrative tasks.



Trials of DEXISION — management of user registrations

Contacts for DX Evo — management of contacts

Documentation of DEXISION — use of SPHINX

After Sales — semi-automated after sales email system

Credit Card Processing — Python scripting

... and many more tasks

Regulatory requirements

by

Securities Exchange Commission (SEC)

Python-based models required for cash flow “waterfalls” in official ABS filings.

“We are proposing to require that most ABS issuers file a computer program that gives effect to the flow of funds, or “waterfall,” provisions of the transaction. We are proposing that the computer program be filed on EDGAR in the form of downloadable source code in Python. Python, as we will discuss further below, is an open source interpreted programming language. Under our proposal, an investor would be able to download the source code for the waterfall computer program and run the program on the investor’s own computer (properly configured with a Python interpreter). The waterfall computer program would be required to allow use of the asset data files that we are also proposing today. This proposed requirement is designed to make it easier for an investor to conduct a thorough investment analysis of the ABS offering at the time of its initial investment decision.”

from <http://www.sec.gov/rules/proposed/2010/33-9117.pdf>



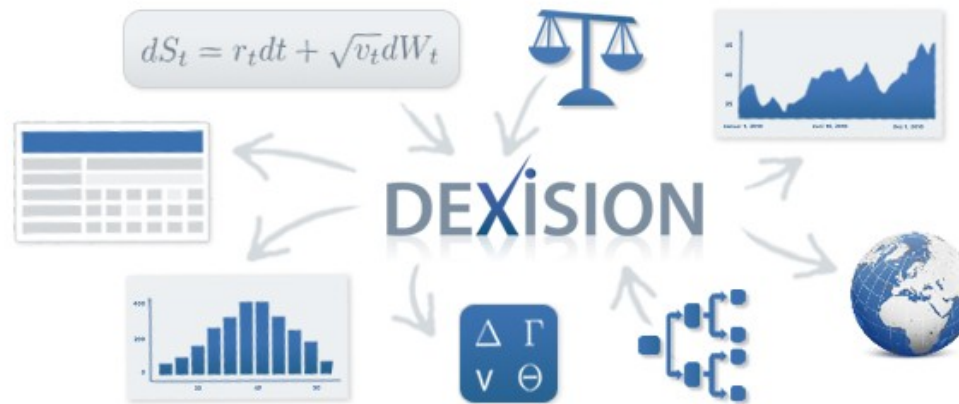
Finance – Financial Advisory Services

Derivatives Analytics – Commercial Analytics Suites

Python Programming – Consulting, Training, Development



... is Visixion's secret sauce



Visit www.visixion.com to learn more about our company and services.

Visit www.dexision.com and www.dxevo.com to learn more about our derivatives analytics suites.

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