Semi-static replication using artificial neural networks Advanced topics in Finance

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## 1 Semi-static replication

To date, the pricing and sensitivity computation of path-dependent derivatives, such as American-style options, is involved due to the absence of analytical valuation formulas. Practitioners therefore resort to numerical approximation routines, for most path-dependent trades. Risk-management of exotic portfolios, which requires many simulated future prices and sensitivities, can therefore be a major computational challenge for financial institutions.

With this problem in mind, we consider the concept of semi-static replication or hedging. A hedge is an investment strategy, intended to offset potential losses or gains involved with trading derivatives. A traditional hedge is achieved by constructing a dynamic replicating portfolio, i.e. a portfolio of assets that mirrors the value of the traded derivative. Such a portfolio must be rebalanced continuously through time as the market moves, by selling or buying assets. In contrast, a static hedge is a portfolio of assets that mirrors the value of a derivative without the need of updating the portfolio-composition through time. The weights of the portfolio are so to speak *static*. By decomposing the exotic derivative into a portfolio of vanilla options, one can simplify its risk-assessment considerably.

This topic concerns the semi-static replication algorithm using neural networks, originally proposed by [2]. The core of the algorithm relies on the approximation power of interpretable, artificial neural networks, which allows one to reduce the replication error to any desirable level.

## 1.1 Project description

For this project you will familiarize yourself with pricing Bermudan options in a Monte Carlo (MC) simulation framework. A general and thorough introduction to MC methods in financial modelling can be found in [1]. A classic method for pricing American-style options in an MC environment is the least-square method (LSM) popularized by F. Longstaff and E. Schwartz [3]. Their paper is a good introduction to the valuation of callable derivatives.

The first objective is to set up an MC model to simulate a stock  $S_t$ . The Black-Scholes model is a good starting point. You may choose any programming language.

Second you will implement a numerical pricing routine for a Bermudan option. Propose reasonable model parameters and contract specifications. Test your implementations!

The main objective is to construct a semi-static replication for your Bermudan option. Use the algorithm described in [2]. Experiment with several degrees of freedom that the algorithm offers. Test the accuracy and convergence by comparing to the LSM pricer.

## References

- [1] Paul Glasserman. Monte Carlo methods in financial engineering. Vol. 53. Springer, 2004.
- [2] Vikranth Lokeshwar, Vikram Bharadwaj, and Shashi Jain. "Explainable neural network for pricing and universal static hedging of contingent claims". In: *Applied Mathematics and Computation* 417 (2022), p. 126775.
- [3] Francis A Longstaff and Eduardo S Schwartz. "Valuing American options by simulation: a simple least-squares approach". In: *The review of financial studies* 14.1 (2001), pp. 113–147.