

Portfolio Optimisation

Problem statement for QST-Hack2025, January 28–31, 2025







Introducing the challenge

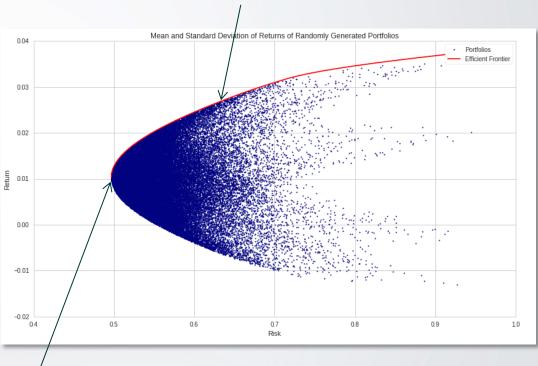
Portfolio optimisation is the financial optimisation problem of selecting a portfolio of assets to invest in that maximizes return for a given level of risk.

In a Mean-Variance portfolio optimisation problem the selection is done based on stock market timeseries data from which important statistical quantities about the asset pool is extracted:

- Expected asset returns, $\mu \in \mathbb{R}^n$
- Covariance between assets, $\Sigma \in \mathbb{R}^{n \times n}$

Correlations between assets affects the total risk of the portfolio, leading to an *efficient frontier* as illustrated in the figure.

Mean-Variance efficient frontier



Global minimum-variance portfolio

Mean-Variance optimisation, https://hudsonthames.org/portfolio-optimisation-with-portfoliolab-mean-variance-optimisation/ Sakuler et al. (2023) https://arxiv.org/pdf/2303.12601



Problem formulation

Consider Mean-Variance portfolio optimisation for an asset pool of n assets. A portfolio is defined as a vector of weights $w \in \mathbb{R}^n$ indicating how much of the budget B is invested in each asset.

In the simplest case, w is a vector of binary decision variables such that $w \in \{0,1\}^n$.

The available budget is B, which must spent, but not exceeded. This is expressed as the budget constraint:

$$\sum_{i=1}^n w_i = B$$
 or in matrix form $1^{ op} oldsymbol{w} = B$.

The optimisation problem of minimizing the portfolio variance can be expressed as:

$$\min_{\boldsymbol{w}} \ \boldsymbol{w}^{\top} \boldsymbol{\Sigma} \boldsymbol{w} - q \boldsymbol{\mu}^{\top} \boldsymbol{w} \quad \text{ subject to } \quad \boldsymbol{1}^{\top} \boldsymbol{w} = B$$

where q > 0 is a risk tolerance factor.

Challenge

- o Express the Mean-Variance portfolio optimisation problem as a QUBO problem.
- Implement a working QAOA solution to the problem and test it on data, e.g. following the procedure in this IBM Qiskit tutorial (ref. below)
- Generate new data sets with strong and weak correlations between assets and investigate the QAOA solvers performance.
- o Adapt model to include constaints on e.g. budget, number of assets invested in, level of risk...

Sakuler et al. (2023) https://arxiv.org/pdf/2303.12601 Quadratic Unconstrained Binary Optimization (QUBO) https://pennylane.ai/qml/demos/tutorial_QUBO IBM Qiskit tutorial https://qiskit-community.github.io/qiskit-finance/tutorials/01_portfolio_optimization.html

