## Mathematical Modeling Seminar

Modern Portfolio Theory

& Capital Asset Pricing Model

(Introduction)

Illes Farkas September 10, 2024

BMETE15MF78 github.com/fij/btup



Information classification: Public

#### **About Citi**

CEO

Jane Fraser

220 000+ colleagues globally

Managing Director, Citi Country Officer, and Banking Head for Hungary

Veronika Spanarova

3 000+ in Budapest





## About myself

2004 Physics PhD at Eotvos University, Advisor: Tamas Vicsek

– 2017 Eotvos Univ. / Hung. Acad. of Sci.

Habilitation, DSc

2017 – Citi HU MQA (Markets Quantitative Analysis)

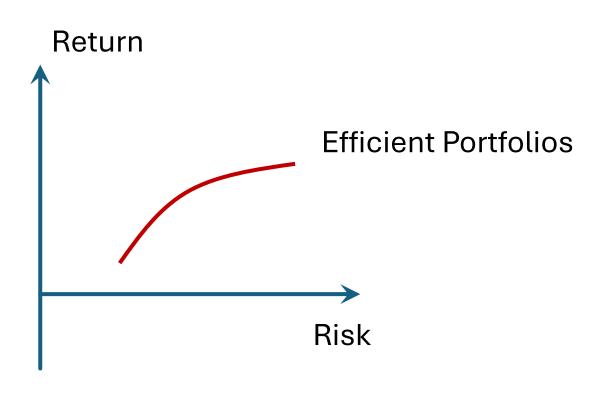


# Agenda

A brief introduction to return, risk, and portfolios

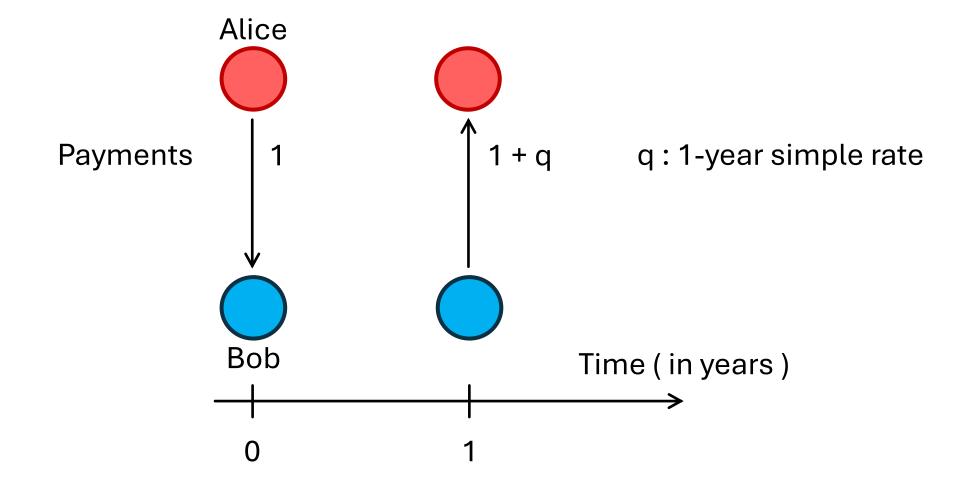
Modern Portfolio Theory (MPT)

Capital Asset
Pricing Model (CAPM)

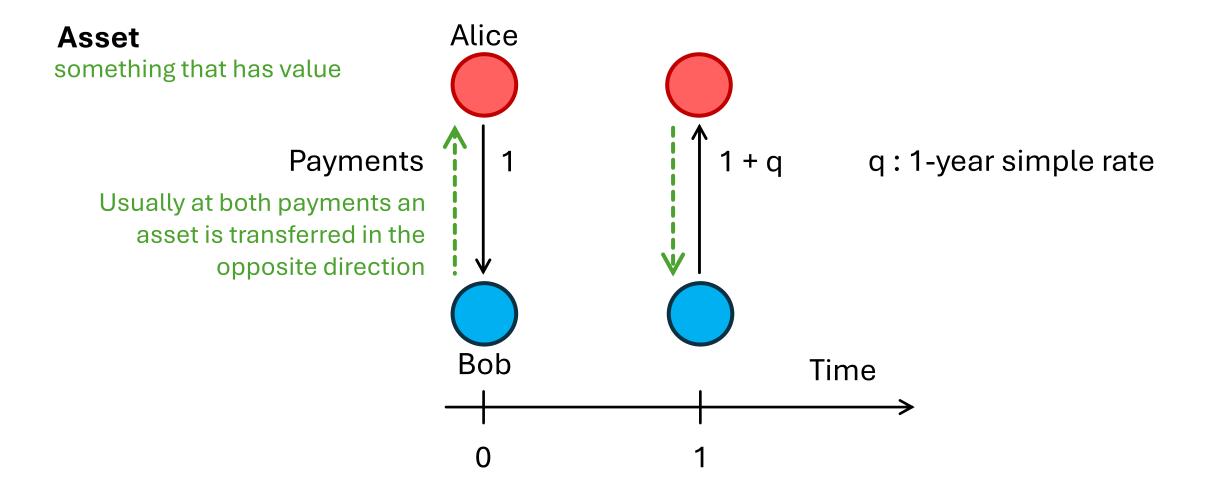




## Return









#### **Portfolio**

A linear combination of assets

For example, 1 unit of MSFT and 1 unit of AAPL

Normalization to sum of weights = 1 gives: 0.5 MSFT + 0.5 AAPL



#### Risk

(for a single asset)



Any contract contains numbers that will be known only in the future

Risk quantifies the <u>uncertainty</u> of a <u>future</u> value, for example, the future price of an asset



We don't know the future, but we can **forecast** 

A simple forecast for the uncertainty of an asset's future price is the same asset's past volatility



# Why forecast the return?

q can be used for discounting

discounting can be applied to – for example – bond pricing



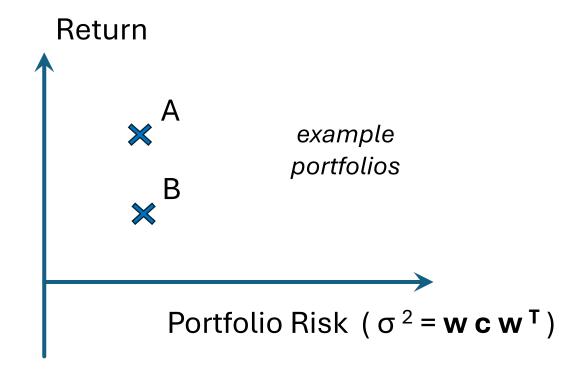
#### N risky assets:

Variable weights  $w_i$  w row Fixed yearly returns  $r_i$  r and covariance  $c_{ij}$  c matrix

What is the max q?

(q does have a max, for example,  $q \le \max r_i$ )

Equivalently: What is the min  $\sigma^2$ ?





## What is the min $\sigma^2$ ?

Fixed: covariance matrix and return. Variable: weight vector.

Find min  $\sigma^2$  with 2 constraints : sum of weights is 1 , portfolio return is q.

# Lagrange method





## What is the min $\sigma^2$ ?

Following the description of the task and the Lagrange method, let's apply two new scalar variables,  $-\lambda_1$  and  $-\lambda_q$ , and minimize the Lagrange function  $\mathcal{L}\left(\mathbf{w}, \lambda_1, \lambda_q\right) = \mathbf{w} \mathbf{c} \mathbf{w}^T - \lambda_1 \left(\mathbf{w} \mathbf{1}^T - 1\right) - \lambda_q \left(\mathbf{w} \mathbf{r}^T - q\right)$ .

The necessary  $\mathbf{0} = \nabla \mathcal{L}$  condition for a  $(\mathbf{w}, \lambda_1, \lambda_q)$  vector to be the location of a local minimum has three parts :

(1) 
$$\mathbf{0} = \frac{\partial \mathcal{L}}{\partial \mathbf{w}} = \mathbf{c} \, \mathbf{w}^{\mathrm{T}} - \lambda_{1} \, \mathbf{1}^{\mathrm{T}} - \lambda_{q} \, \mathbf{r}^{\mathrm{T}}$$

(2) 
$$0 = \frac{\partial \mathcal{L}}{\partial \lambda_1} = 1 - \mathbf{w} \mathbf{1}^{\mathrm{T}}$$

(3) 
$$0 = \frac{\partial \mathcal{L}}{\partial \lambda_{q}} = q - \mathbf{w} \, \mathbf{r}^{T}$$



# What is the min $\sigma^2$ ? Equivalently: max q?

$$A = \begin{pmatrix} \mathbf{1} \ \mathbf{c}^{-1} \ \mathbf{1}^{\mathrm{T}} & \mathbf{r} \ \mathbf{c}^{-1} \ \mathbf{1}^{\mathrm{T}} \\ \mathbf{r} \ \mathbf{c}^{-1} \ \mathbf{1}^{\mathrm{T}} & \mathbf{r} \ \mathbf{c}^{-1} \ \mathbf{r}^{\mathrm{T}} \end{pmatrix}$$

$$\frac{1}{K^2} = \frac{1}{A_{22} - (A_{12})^2 / A_{11}}, \quad q_0 = \frac{A_{12}}{A_{11}}, \quad \sigma_0^2 = \frac{1}{A_{11}}$$

$$\sigma^{2}(q) = \frac{1}{K^{2}}(q - q_{0})^{2} + \sigma_{0}^{2}$$

$$q(\sigma^2) = q_0 + K\sqrt{\sigma^2 - \sigma_0^2}$$

Efficient Frontier (EF) of the risky assets only

#### Numerical issues

$$c^{-1}$$

$$A^{-1}$$

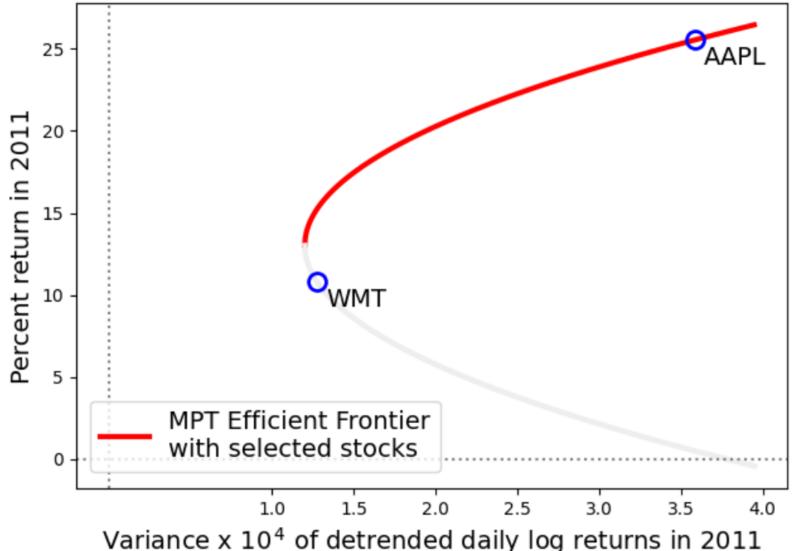


Example:

**Efficient Frontier** of 2 risky assets

Data source:

kaggle.com/dgawlik/nyse

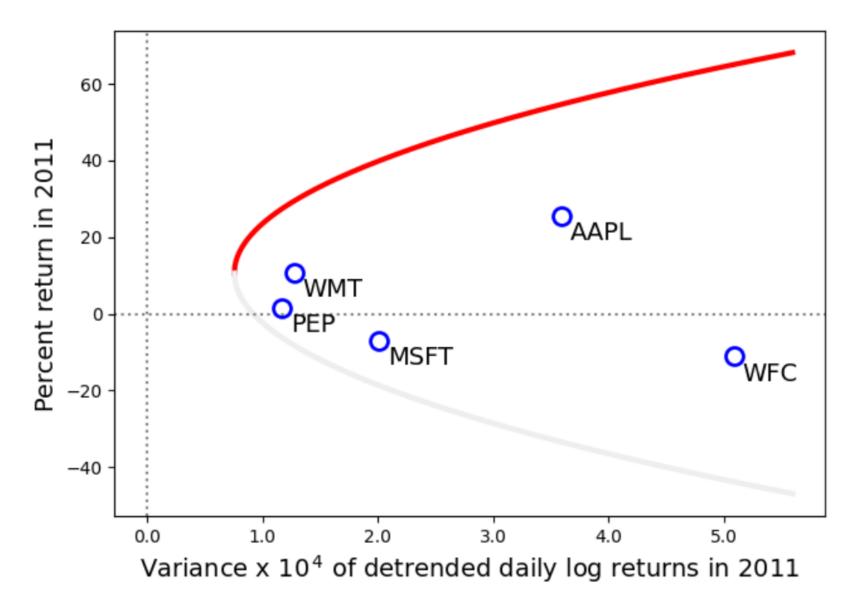






Example:

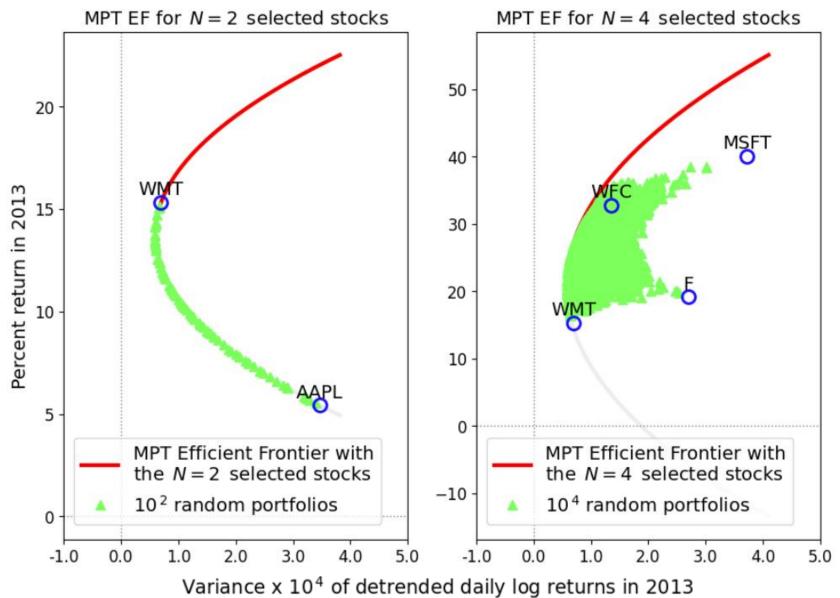
Efficient Frontier of 5 risky assets





Example:

Rnd portfolios of risky assets





Variable change:  $\sigma^2 \rightarrow \sigma$ 

$$q(\sigma) = q_0 + K \sqrt{\sigma^2 - \sigma_0^2} \quad \text{with} \quad \sigma^2 \ge \sigma_0^2$$

$$\frac{\sigma^2}{\sigma_0^2} - \frac{(q - q_0)^2}{K^2 \sigma_0^2} = 1$$

Recall that in the MPT only the  $(\sigma > \sigma_0, q > q_0)$  quadrant of the hyperbola is used.

From the above standard equation form note that the center of the hyperbola is at ( $\sigma = 0$ ,  $q = q_0$ ).

Take the  $\sigma o \infty$  limit (meaning also  $q o \infty$ ) to see that the asymptote of the hyperbola is  $q = q_0 + K\sigma$ .



Efficient Frontier (EF) of *N* risky assets plus 1 risk-free asset:

Line containing the Risk-Free point and tangent to the Risky EF

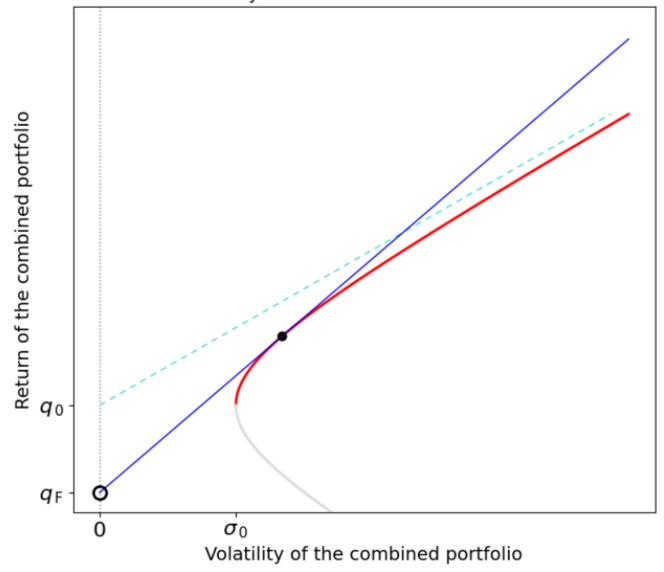
Efficient Frontier (EF) of the risky assets

EF of the combined (risky + risk-free) portfolios

Asymptote  $(q = q_0 + K\sigma)$  of the EF of risky assets

- O Risk-Free asset
- Tangency point (T)

Illustration of the Efficient Frontier of the combined portfolio of risky assets and the risk-free asset

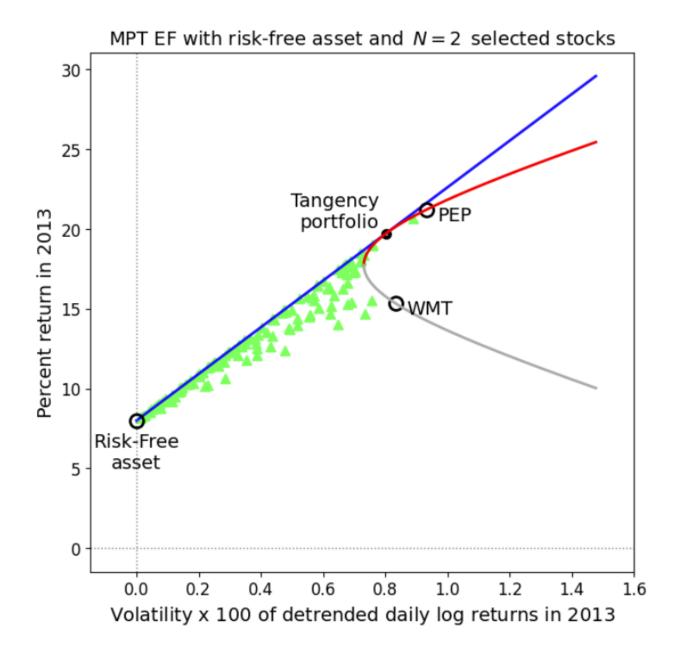




Example:

risk-free asset + 2 risky assets

Efficient Frontier Random portfolios





MPT  $\sigma$  full risk

CAPM β non-diversifiable risk



#### What does the MPT do?

Modern Portfolio Theory (MPT) uses the Efficient Market Hypothesis (EMH) to calculate

- (i) the Efficient Frontier (EF) of portfolios containing only risky assets
- (ii) and the Capital Market Line (CML), which is the EF of the combined (risk-free + risky) portfolios.

The EF of risky assets and the CML are tangent at the tangency point.

The coordinates of the tangency point are the volatility and return of the tangency portfolio.

The tangency portfolio has no risk-free asset. It has relative risky asset weights equal to those of the market portfolio.

The Capital Market Line (CML) compares return with the full risk, which is quantified as the volatility.

#### What does the CAPM do?

The Capital Asset Pricing Model was developed in the 1960s by Jack Treynor and others based on the MPT.

The CAPM compares a risky portfolio's return with the amount of its non-diversifiable risk (also called: systematic risk).

#### Notes

- 1. This non-diversifiable risk will quantified as the  $\beta$  value defined below.
- 2. Diversifiable risk is also called specific risk, or unsystematic risk, or idiosyncratic risk.



# β of a portfolio P

(P can be a single asset)

# Equivalent definitions (M is the market portfolio)

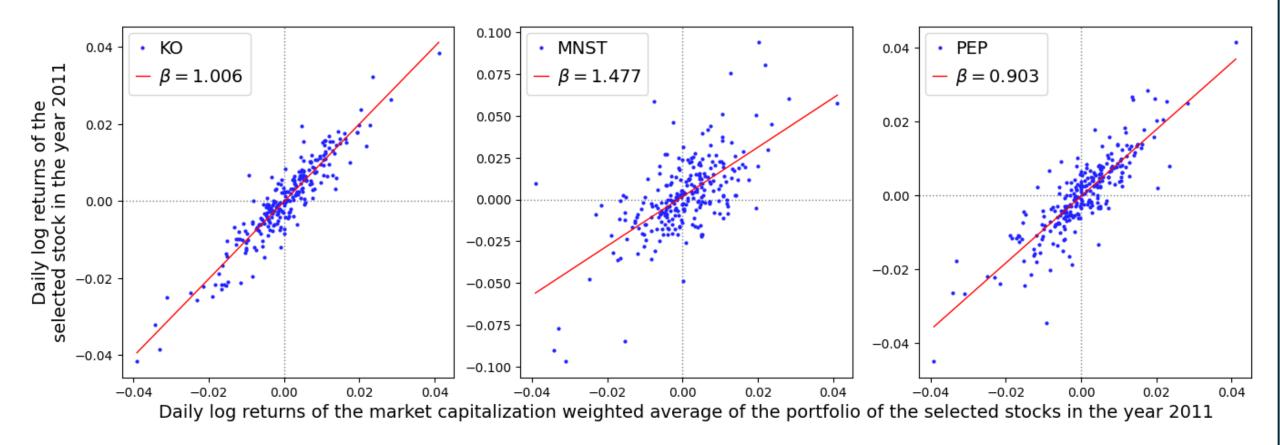
$$\beta_{P} = \frac{Cov(P, M)}{Var(M)}$$

 $\beta_P \quad \begin{array}{l} \text{is the slope of the linear fit to the scatter plot} \\ \text{displaying P (vertical coordinate) vs M (horizontal)} \end{array}$ 

 $\beta_P$  is the non-diversifiable (also called: systematic) risk of the portfolio P



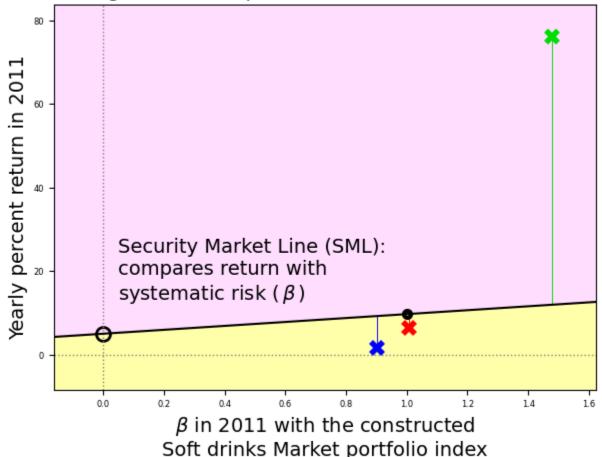
Example: Market is 3 stocks Pepsi, Coke, Monster Beverages





# Example: Market is 3 stocks

Comparing three stocks to the market capitalization weighted market portfolio index created from them



- Soft drinks Market portfolio index (M) constructed from the soft drink stocks and their market caps
   Risk-Free asset
- Security Market Line (SML): the CAPM pricing of a portfolio that has the given  $\beta$
- Overvalued assets compared to the index
  - Undervalued assets compared to the index
- X KO (Coca Cola)
  - Jensen's  $\alpha = -3.34$
- MNST (Monster Beverages)
  - Jensen's  $\alpha = 64.31$
- PEP (Pepsi)
  - Jensen's  $\alpha = -7.68$



Thank you

Questions

