

# Portfolio Theory

## Lecture 1

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# Structure

- 1 Instructions
- 2 Grading
- 3 Introduction to Portfolio Theory

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- 1.. Active work at seminar (max. 3 absence)
- 2.. Bloomberg 5 Stocks → Covar and Correl Matrix
- 3.. Two tests ( $\Sigma 30$  p., each 15 p., vØ min. 60 %)
- No satisfy condition 1-3 → "F"
- 1st test - 4/04/2016, 2nd test - 16/05/2016
- Correction test (30 points)
- Literature: **ELTON, E.; Modern portfolio theory and investment analysis**

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- Prerequisite  $1 + 2\sqrt{\quad}$
- Score of both tests:
- A: [27,30)
- B: [25,27)
- C: [23,25)
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- E: [18,21)
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- Portfolio:  $\sum_{i=1}^n w_i A_i$ ;  $\sum_{i=1}^n w_i = 1$ ;  $X w_i \dots weigh; A_i \dots asset$
- Conditions of assets - identifiability, mesurability (price)
- Investment:  $f(r, \sigma, l)$
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- $r_i = \ln(P_{t+k}) - \ln(P_t)$

- $r_i = \frac{P_{t+k} - P_t}{P_t}$

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- Uncertainty in the future development  $\implies$  random variable  $X$  (discrete random variable)

$\implies$  Characteristic of RV  $E(X), \sigma^2(X) \implies$  **Mean Variance Portfolio**

- Mean

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- $E(c) = c$ , where  $c$  is a constant
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# Risk

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( $\sigma, s$ )

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# The relation between RVs

- **Covariance... (cov(X, Y),  $\sigma_{X, Y}$ )**

$$\text{cov}(X, Y) = E\{[X - E(X)][Y - E(Y)]\};$$

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- The absolute dimension of covar is relativized
- $\rho_{XY} = \frac{\text{cov}(X, Y)}{\sigma_X \sigma_Y}$
- Reflect the degree of **linear** dependence
- Interval for correlation  $\langle -1; 1 \rangle$  (falling/rising)
- $\rho_{XY} = 1$ ... points lie on a straight line
- Square of correlation coefficient...  $r^2$  (coefficient of determination from OLS)

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