

# Asset Pricing: Mean Variance Analysis

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# Portfolio Selection

- Portfolio selection is one of the most important problem in both academy and practice of financial economics.
- Markowitz (1952) is the first academic paper to seriously discuss the trade-off in portfolio selection.
- The latter developed inter-temporal Capital Asset Pricing Model of Merton (1973) takes care of the multiperiod nature of investment-consumption trade-off.
- In this vein of literature, we usually refer **portfolio selection problem** to both of them.
- In this class, we mainly focus on the Markowitz (1952).

## Is Mean Variance Investors a special case?

- It seems that Markowitz (1952) assume the utility function from intuition.
- Does the utility function just employs first and second order moments a reasonable application?
- Is it a strong assumption to employ the mean-variance utility function?

## Is Mean Variance Investors a special case?

- The answer is **NO**. Actually, Mean-variance analysis is quite general.
- Let's assume a utility function  $U(X)$ , there is an equivalent utility function  $e^{U(X)}$ . It will generate same rank for same  $X$ .
- Let's apply Taylor Expansion:

$$e^{U(X)} \simeq e^{U'(X)X - \frac{1}{2}U''(X)X^2},$$

Especially for ranking order.

$$U(X) \sim U'(X)X + \frac{1}{2}U''(X)X^2 \sim X - \frac{1}{2} \frac{U''(X)}{U'(X)} X^2$$

## Is Mean Variance Investors a special case?

- In your micro class, you should have learned that this is the **absolute risk aversion**:

$$\gamma(X) = -\frac{U''(X)}{U'(X)}$$

- Similarly, we could exponentially translate any utility function to mean-variance utility function!

# Mean-Variance Analysis

- In Markowitz (1952), he brilliantly designs an investor to capture the psychology in investment decision of human-being. We just reframe everything in modern expression.
- Suppose there is one investor with initial wealth  $W_0$ , he does not consume at all at time  $t$ , but will consume everything at time  $t + 1$ .
- There are a risk-free asset and  $N$  risky asset with returns  $R_f$  and  $R$ .

# Mean-Variance Analysis

- The investor choose fraction of  $x_j$  to risky asset  $j$  for  $j = 1, \dots, N$ . The final wealth is

$$W = W_0 x' R + W_0 (1 - x' 1_N) R_f = W_0 R_f + W_0 x (R - R_f).$$

$$R_P = x' R + (1 - x' 1_N) R_f = R_f + x (R - R_f).$$

- The investor's problem is to find the optimal  $x$  to maximize  $E[U(W)]$ , i.e.,

$$\max_x E[U(R_f + x(R - R_f))]$$

## Mean-Variance Analysis

- When the utility function follows a set of relative loose assumptions, we set

$$E[U(R_p)] = E(R_p) - \frac{A}{2} \text{Var}(R_p) = x' \mu - \frac{A}{2} x' \Sigma x$$

$$\text{s.t. } x' \mathbf{1}_N = 1$$

- F.O.C.

$$\mu - A \Sigma x - \lambda \mathbf{1} = 0$$

$$x' \mathbf{1}_N = 1$$

which yields

$$x^* = \frac{1}{A} \Sigma^{-1} (\mu - \lambda^* \mathbf{1}_N),$$

where

$$\lambda^* = \frac{\mu' \Sigma^{-1} \mathbf{1}_N - A}{\mathbf{1}_N' \Sigma^{-1} \mathbf{1}_N}, \text{ special case, } x^* = \frac{\mu - r_f}{A \sigma^2}$$



# Mean-Variance Portfolio Performance

- In most of times, mean-variance portfolio is not best, even not the relative good.
- By checking the historical data, we could observe that mean-variance portfolio could be easily beaten by equal-weight or minimum-variance portfolio.
- What's wrong with Markowitz?

# Parameter uncertainty

- When we run the MVA, we assume the parameter is a constant. What if the parameter is a random variable as well?
- There are two main challenges:
  1. Parameter uncertainty.
  2. Estimation risk.
- One potential reason of failure of MVA is that Markowitz may be right, but how to get the right answer?

## MVP: a portfolio that is easy to estimate

- Estimation risk is mainly from estimation of **mean** less than **variance**.

$$\hat{\mu} \sim N(\mu, \Sigma / T)$$

$$\hat{\sigma} \sim W_N(T - 1, \Sigma) / T$$

- One could estimate variance more precisely.
- How about the weighting scheme relies less on mean but more on variance?
- In Zhou and Kan (2007), They set up a three fund separation and show that the solution could help to mitigate the estimation risk.

## 1/N: a portfolio without estimation

- If there is estimation risk, how about not estimate at all?
- $1/N$  is one easy way to get rid of estimation, but also diversify.
- In practice, DeMiguel, Garlappi and Uppal (2009), Tu and Zhou (2011) show that MVA could frequently be beaten by  $1/N$ .

## Constraint: give up opportunity set for less estimation risk

- Sometimes, economic constraint could help.
- Like the estimated equity premium should be above 0.
- DeMiguel, Garlappi, Uppal (2009): More choices mean more opportunity, but could also mean more estimation risk.

# Transaction cost

- Markowitz assume a world without transaction cost.
- DeMiguel, Martin-Utrera, Nogales and Uppal (2020), if there is transaction cost, the cost could hinder some **wrong** trade.

# Do we really want diversification?

- Diversification is because you don't know what to do. –Warren Buffett.
- Many of the household, they don't diversify their portfolio at all.

# Conclusion

- MVA is the starting point of modern finance in both academy and industry.
- Markowitz opens a magic box. Somehow, it seems that most of us believe he is **right**.
- If the mean-variance portfolio does not make money for you, the world is **wrong**.