



Financial Market Analysis (FMAx)

Module 6

“Asset Allocation and Diversification”

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Preamble:

Why should you care about portfolio allocation?

- You might be an investor.
- Your institution might be an investor.
- As a policymaker, you'll be interested in investor behavior.
- Your country may be interested in what drives international investment.

Preamble:

In this module we will...

1. Review statistical concepts related to return and risk.
2. Emphasize the importance of correlation.
3. Explore how to choose an “optimal portfolio”.
 - Of 2 assets
 - Of $n > 2$ assets
4. Do the same for an international portfolio.

An Introduction

- Concepts -

Portfolio Theory - Harry Markowitz (1952)

Investments are compared in terms of trade-off between...

- (-) ■ Risk (variance)
- (+) ■ Return (expected reward)



An investor who cares only about risk and return, will always prefer...

- Highest mean return for given amount of risk; and
- Lowest risk given the mean return.

An Introduction

- Concepts -

Insights from H. Markowitz:

- Diversification does not rely on returns being uncorrelated, but rather on having them be imperfectly correlated.
- Risk reduction from diversification is limited by the extent to which returns are correlated.

Less correl → more benefits } from diversification
More " → less " }

An Introduction

- Review of Statistics -

Expected Returns:

Using historical data:

$$E(r) = r_g = \left[(1 + r_1)(1 + r_2)(1 + r_3) \dots (1 + r_T) \right]^{\frac{1}{T}} - 1$$

$$E(r) = r_a = \frac{r_1 + r_2 + r_3 + \dots + r_T}{T}$$

An Introduction

- Review of Statistics -

Risk: (Variance or Standard Deviation of Returns)

Using historical data:

$$Var(r) = r_g = \frac{(r_1 - E(r))^2 + (r_2 - E(r))^2 + \dots (r_T - E(r))^2}{T}$$

An Introduction

- Review of Statistics -

Correlation: (Degree of co movement between two variables.)

Correlation coefficient ranges from:

+ 1 (perfect co-movement)

0 (variables are independent)

- 1 (perfect negative correlation)

$$Cov(r_A, r_B) = \frac{\sum_{t=1}^T (r_{A,t} - E(r_A))(r_{B,t} - E(r_B))}{T}$$

$$\rho_{AB} = \frac{Cov(r_A, r_B)}{\sigma_A \sigma_B}$$

Introducing Two Risky Assets

Define Portfolio ***P*** containing two risky assets (portfolios):
Bonds (***D***) and Equity (***E***), Weights ***w_D*** and ***w_E***

Expected rate of return:
$$E(r_P) = w_D E(r_D) + w_E E(r_E)$$

Correlation coefficient ρ_{DE} :
$$\rho_{DE} = \frac{Cov(r_D, r_E)}{\sigma_D \sigma_E}$$

Introducing Two Risky Assets

Risk of P :

$$\begin{aligned} \text{Var}(P) &= \sigma_P^2 = E[r_P - E(r_P)]^2 \\ &= w_D^2 \sigma_D^2 + w_E^2 \sigma_E^2 + 2w_D w_E \rho_{DE} \sigma_D \sigma_E \end{aligned}$$

Question: What is the largest possible value for ρ_{DE} ?

When $\rho_{DE}=1$ (perfect correlation):

$$\begin{aligned} \text{Var}(P) &= \sigma_P^2 = w_D^2 \sigma_D^2 + w_E^2 \sigma_E^2 + 2w_D w_E \sigma_D \sigma_E \\ &= (w_D \sigma_D + w_E \sigma_E)^2 \\ &\Rightarrow \sigma_P = w_D \sigma_D + w_E \sigma_E \end{aligned}$$

Introducing Two Risky Assets

Unless correlation between D and E is perfect:

$$\sigma_P < w_D \sigma_D + w_E \sigma_E$$

Note that:

- Expected return of P is unaffected by the correlations
- We often call the difference between the weighted average of individual σ 's and σ_P the “gains from diversification”.
- Hedge asset: negative correlation with other assets ($\rho_{DE} < 0$)

Introducing Two Risky Assets

In the extreme case of a perfect hedge ($\rho_{DE} = -1$):

$$\sigma_p^2 = (w_D \sigma_D - w_E \sigma_E)^2$$

$$\sigma_p = \text{abs}(w_D \sigma_D - w_E \sigma_E)$$

Can construct a **zero risk portfolio**:

$$\sigma_p = w_D \sigma_D - w_E \sigma_E = 0, \quad w_D + w_E = 1$$

$$\Rightarrow w_D = \frac{\sigma_E}{\sigma_D + \sigma_E}, w_E = \frac{\sigma_D}{\sigma_D + \sigma_E} = 1 - w_D$$

Graphical Representation

- Two-Assets Portfolio -

Example:

$$E(r_D) = 2\%, E(r_E) = 6\%, \sigma_D = 5\%, \sigma_E = 10\%, \rho_{DE} = 0.2$$

Return and Risk:

$$E(r_p) = 0.02w_D + 0.06w_E$$

$$\sigma_p^2 = (0.05)^2 w_D^2 + (0.10)^2 w_E^2 + 2 \cdot 0.05 \cdot 0.10 \cdot 0.2 \cdot w_D w_E$$

$$= 0.025w_D^2 + 0.01w_E^2 + 0.002w_D w_E$$

Graphical Representation

- Two-Assets Portfolio -

Minimizing Risk:

$$\text{Min } \sigma_p^2 = \text{Min } w_D^2 \sigma_D^2 + w_E^2 \sigma_E^2 + 2w_D w_E \rho \sigma_D \sigma_E$$

$$\text{s.t.}:: w_D + w_E = 1, \text{ or } w_E = 1 - w_D$$

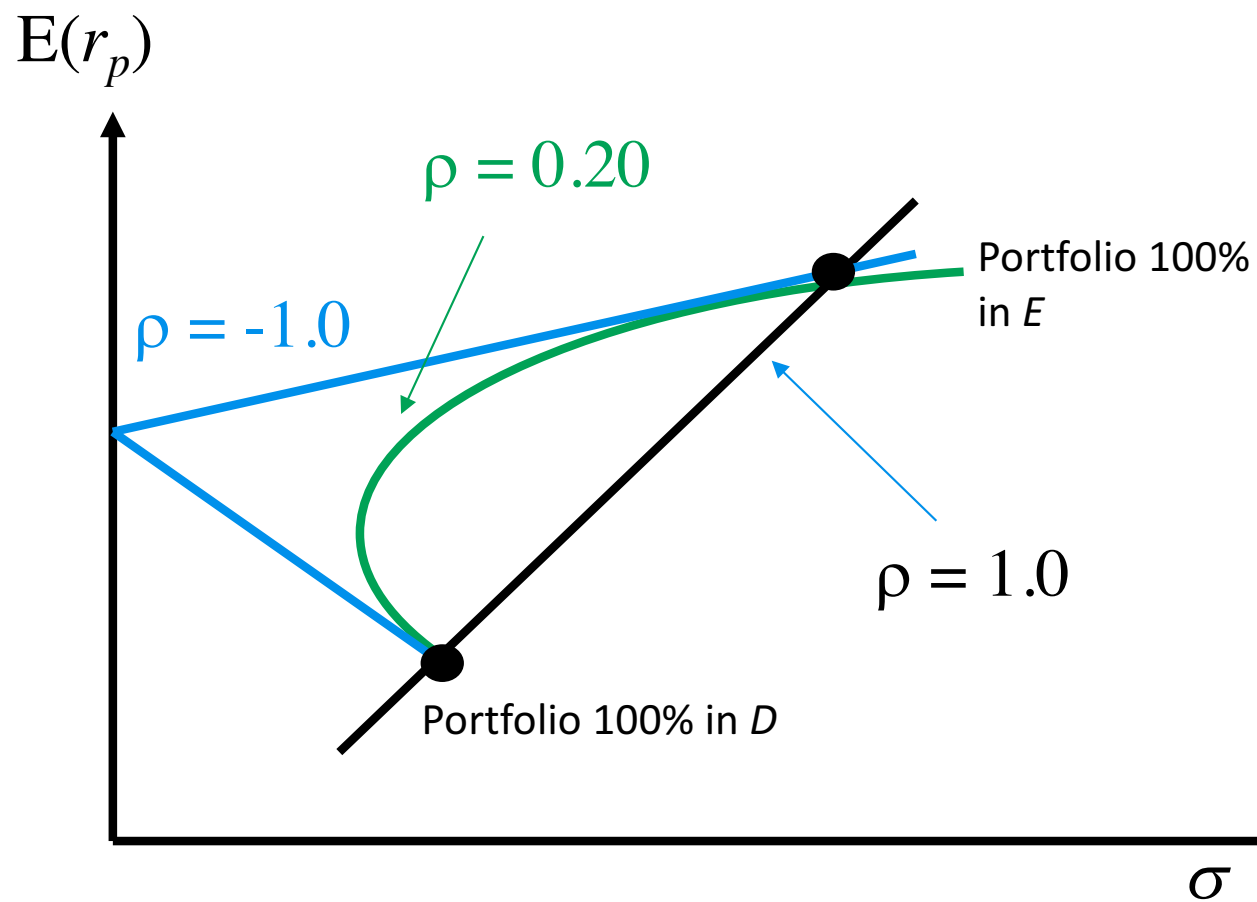
Solving the above for w_D , w_E

$$w_{\min}(D) = \frac{\sigma_E^2 - \rho_{DE} \sigma_D \sigma_E}{\sigma_E^2 + \sigma_D^2 - 2\rho_{DE} \sigma_D \sigma_E}$$

$$w_{\min}(E) = 1 - w_{\min}(D)$$

Graphical Representation

- Two-Assets Portfolio -



Graphical Representation

- Two-Assets Portfolio -

Benefits from Diversification:

- Come from imperfect correlation between returns.
- The smaller ρ , the greater the benefits from diversification.
- If $\rho = 1$, no risk reduction is possible.
- Adding extra assets with lower correlation with the existing ones decreases total risk of the portfolio.
- Diversification can eliminate some, but not all risk.

Comparing Different Portfolios

- Two-Assets -

The Risk-Free Asset:

IF it is possible to borrow/lend at the risk-free rate r_f ,

THEN the portfolio selection problem is to maximize the excess return over the risk-free rate, for a given amount of risk:

$$\begin{aligned} \text{Max} \quad & \frac{\overbrace{E(r_p) - r_f}^{\text{excess ret}}}{\underbrace{\sigma_p}_{\text{risk}}} = \frac{w_D (E(r_D) - r_f) + w_E (E(r_E) - r_f)}{\sqrt{\underbrace{w_D^2 \sigma_D^2 + w_E^2 \sigma_E^2 + 2w_D w_E \rho \sigma_D \sigma_E}_{\text{var p}}}} \\ \text{s.t.} \quad & \underline{w_D + w_E = 1} \end{aligned}$$

Comparing Different Portfolios

- Two-Assets -

Our Numerical Example:

- Assume $r_f = 0.9\%$
- Define **A** as the minimum-variance portfolio obtained earlier
($w_D = 0.84$, $w_E = 0.16$)
- “Capital allocation line” (CAL):** combinations of **A** and the risk-free asset.
- Slope of **CAL** = “reward-to-variability”, or **Sharpe ratio**:

$$S_A = \frac{E(r_A) - r_f}{\sigma_A} = \frac{2.57 - 0.9}{4.78} = 0.350$$

Handwritten annotations in red:
- A bracket above $E(r_A) - r_f$ with $E(r_A)$ written above it.
- r_f written above the minus sign.
- σ_A written below the denominator.
- S_A written above the final result.

Comparing Different Portfolios

- Two-Assets -

Consider an alternative portfolio B:

$$W_D = 0.65, W_E = 0.35$$

Is it better than portfolio A?

Yes, $S_B > S_A$

$$S_B = \frac{E(r_B) - r_f}{\sigma_B} = \frac{5.2 - 0.9}{3.4} = 0.478$$

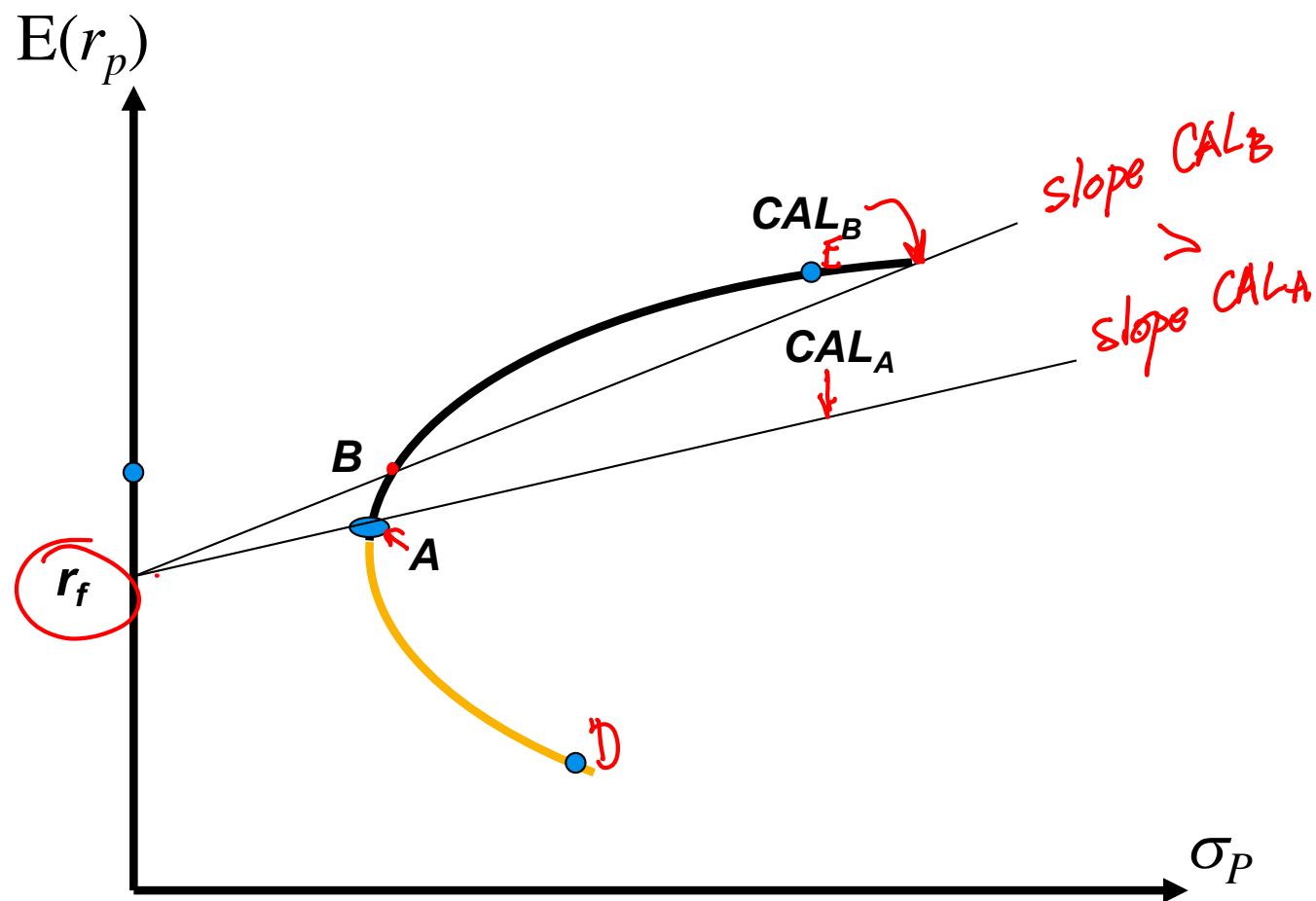
The optimal portfolio will be such that the reward-to-variability ratio is maximized (depends on r_f):

2 assets
 $N = 2$

$$\underset{w_i}{\text{Max}} S_p = \frac{E(r_p) - r_f}{\sigma_p} \text{ s.t. } \sum_{i=1}^N w_i = 1$$

Comparing Different Portfolios

- Two-Assets -



Selecting the Best Portfolio

- Two-Assets -

The Optimization Problem:

$$Sp \quad \text{Max} \quad \frac{E(r_p) - r_f}{\sigma_p} = \frac{w_D (E(r_D) - r_f) + w_E (E(r_E) - r_f)}{\sqrt{w_D^2 \sigma_D^2 + w_E^2 \sigma_E^2 + 2w_D w_E \rho \sigma_D \sigma_E}}$$

$$s.t. \quad \underline{w_D + w_E = 1}$$

$\frac{dSp}{dw_D} = 0$

After some algebra, and using $\underline{w_E = 1 - w_D}$:

$$\underline{w_D^*} = \frac{(E(r_D) - r_f) \sigma_E^2 - (E(r_E) - r_f) \text{cov}(r_D, r_E)}{(E(r_D) - r_f) \sigma_E^2 + (E(r_E) - r_f) \sigma_D^2 - (E(r_D) - r_f + E(r_E) - r_f) \text{cov}(r_D, r_E)}$$

Selecting the Best Portfolio

- Two-Assets -

Expressing the Numerator in Matrix Notation: ^{5'} Excess Ret

$$(E1) \quad \begin{bmatrix} w_D^* \\ w_E^* \end{bmatrix} = \frac{\overset{2 \times 2}{\begin{bmatrix} \sigma_E^2 & -\text{COV}(r_D, r_E) \\ -\text{COV}(r_D, r_E) & \sigma_D^2 \end{bmatrix}} \cdot \overset{2 \times 1}{\begin{bmatrix} E(r_D) - r_f \\ E(r_E) - r_f \end{bmatrix}}}{\underbrace{\left((E(r_D) - r_f) \sigma_E^2 + (E(r_E) - r_f) \sigma_D^2 - (E(r_D) - r_f + E(r_E) - r_f) \text{COV}(r_D, r_E) \right)}_{z_1 + z_2}}$$

Let's call the numerator of (E1) a column vector \mathbf{z} , which will be:

$$(E2) \quad \begin{bmatrix} z_1 \\ z_2 \end{bmatrix} = \begin{bmatrix} \sigma_E^2 & -\text{COV}(r_D, r_E) \\ -\text{COV}(r_D, r_E) & \sigma_D^2 \end{bmatrix} \begin{bmatrix} E(r_D) - r_f \\ E(r_E) - r_f \end{bmatrix}$$

$$\begin{bmatrix} z_1 \\ z_2 \end{bmatrix} = \overset{2 \times 2}{S^{-1}} \left(\overset{2 \times 1}{R} - \overset{2 \times 1}{R_f} \right)$$

Selecting the Best Portfolio

- Two-Assets -

You can verify that the denominator of (E1) is equal to the sum of the z 's.

Therefore, the solution to the weights of the optimal portfolio P^* is:

$$(E3) \quad \begin{bmatrix} \cdot w_D^* \\ \cdot w_E^* \end{bmatrix} = \frac{\overset{z}{\begin{bmatrix} z_1 \\ z_2 \end{bmatrix}}}{z_1 + z_2}$$

2×1

Selecting the Best Portfolio

- Two-Assets -

Example:

$$w_D^* = 0.34, w_E^* = 0.66$$

$$E(r_{p^*}) = 4.7\%, \sigma_{p^*} = 7.2\%, S_{p^*} = 0.524$$

$> S_B > S_A$

This is the “tangency portfolio” P^* ; no other portfolio achieves a higher reward-to-variability (Sharpe ratio) with respect to the risk-free rate.

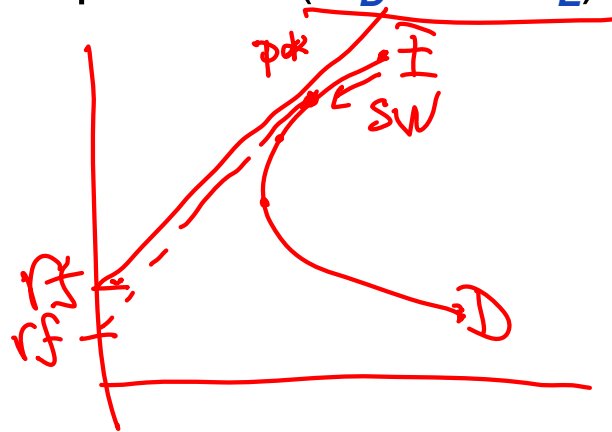
Selecting the Best Portfolio

- Two-Assets -

Questions:

If the risk-free rate declines (monetary loosening), what happens to...

- the composition of the optimal portfolio (w_D and w_E)?
- its mean return?
- its risk?
- its Sharpe ratio?



Selecting the Best Portfolio

- Two-Assets -

Answers:

If the risk-free rate declines (monetary loosening), then...

- Optimal portfolio P^* shifts toward the Southwest: $\uparrow w_D$ and $\downarrow w_E$
- Both mean return and risk decline
- Sharpe ratio increases

Recap of Optimal Portfolio

- Two-Assets -

Main Ideas:

- Investor chooses the combination of D , E that maximizes reward-to-variability relative to the risk-free rate.
- This reward to variability = **Sharpe ratio** = slope of the **CAL**. *3 ways → opt portf*
- Two methods...
 - Algebraic (matrix solution) $\begin{bmatrix} z_1 \\ z_2 \end{bmatrix} = S^{-1} \left(R - R_f \right)$ *Excess Ret*
 - Numerical (using Solver) $S \rightarrow \max S$ *subject $w_D + w_E = 1$* $\begin{bmatrix} w_D^* \\ w_E^* \end{bmatrix} = \frac{\begin{bmatrix} z_1 \\ z_2 \end{bmatrix}}{z_1 + z_2}$ *sum of z 's*
 $w_E = 1 - w_D$
- Recall: benefits to diversification depend on (imperfect) correlation between D and E .

Recap of Optimal Portfolio

- Two-Assets -

Questions:

If the correlation between D and E increases, what happens to...

- the composition of the optimal portfolio (w_D and w_E)?
- its mean return?
- its risk?

Recap of Optimal Portfolio

- Two-Assets -

Answers:

If the correlation between D and E increases, then:

- the optimal portfolio P^* shifts to the Northeast: $\downarrow w_D$ and $\uparrow w_E$
- (in this case, it means even shorting D)
- Both mean return and risk increase
- **Sharpe ratio** increases slightly (from 0.450 to 0.454)

Completing the Investor Decision

- Two-Assets -

What next?

We have (1) the tangency portfolio P^* and (2) the riskless asset. But each investor must now decide how much to invest in each.

- Will depend on personal preference (risk aversion or tolerance).

This can be expressed by a utility function:

satisfaction
enjoyment

$$U = E(r_C) - 0.5A\sigma_C^2$$

(+) return

(-) risk

scaling factor

risk aversion

C

P^*

r_f

where A = degree of risk aversion;
if $A = 0$, risk-neutral

Completing the Investor Decision

- Two-Assets -

Individual Investor Choice:

Maximize utility subject to the tangency portfolio and the riskless asset, to obtain the proportions to be invested in each (w_P^* and w_{rf})

The resulting portfolio will be called **C**.

$$\begin{aligned} \text{Max} U &= E(r_C) - 0.5 A \sigma_C^2 \\ &= w_P^* E(r_P^*) + r_f (1 - w_P^*) - 0.5 A w_P^{*2} \sigma_P^2 \end{aligned}$$

In our example, assuming risk aversion $A = 9.4$, solve for w_P^* :

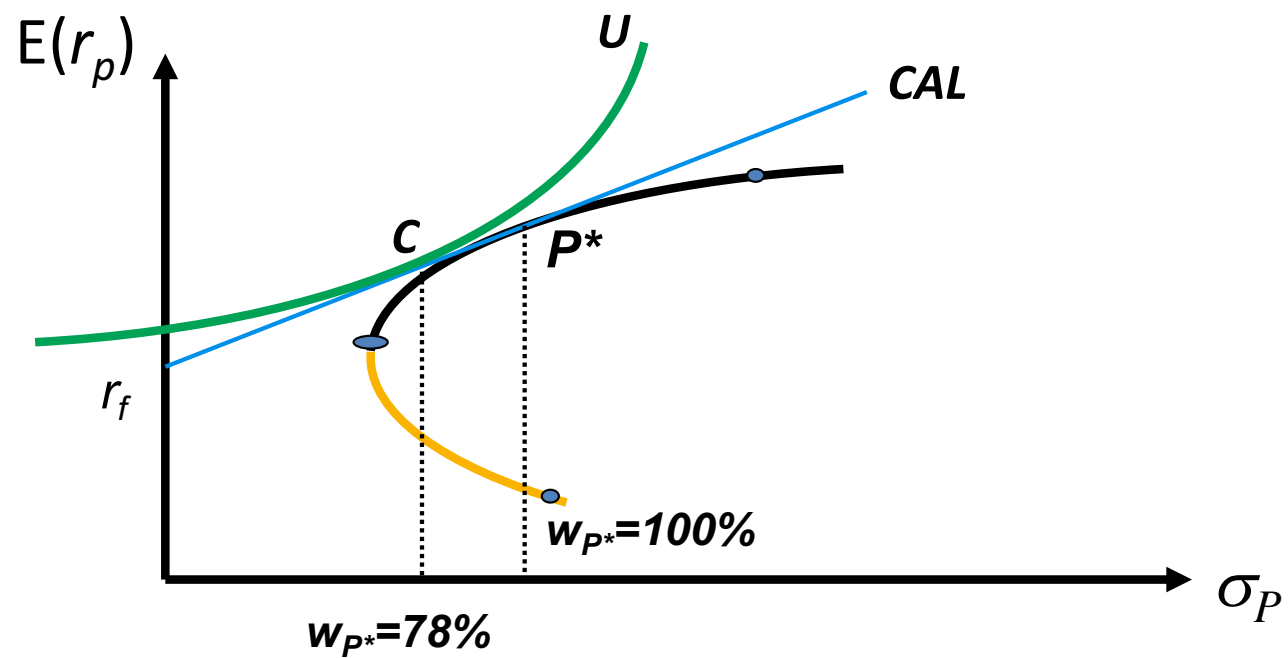
$$\frac{dU}{dw_P^*} = 0$$

$$\Rightarrow w_P^* = \frac{0.0466 - 0.009}{2 \times 0.5 \times 9.4 \times 0.0051} = 78\%$$

22% in r_f

Completing the Investor Decision

- Two-Assets -



Completing the Investor Decision

- Two-Assets -

Separation Property:

- Technical information guides the decision to choose the optimal portfolio of risky assets P^* :
 - Mean returns, relative to risk-free rate
 - Volatilities
 - Correlation
- The choice of ultimate investor position (how much in P^* , how much in r_f) depends on individual preferences (A).
- The two decisions are *separate*.

Generalizing to n Assets

- Part 1 -

Maximize reward-to-variability, subject to all weights summing to 1.

The solution, w_i^* , is the same matrix as before, now generalized to N assets:

N : # risky assets

R : The column vector: expected returns

r_f : risk-free rate

w : The column vector: portfolio shares

S : $N \times N$ variance-covariance matrix

$$\left\{ \begin{array}{l} \underset{(N,1)}{1} \underset{(N,1)}{z} \underset{(N,1)}{3} = \underset{(N,N)}{S}^{-1} \underset{(N,1)}{[R - r_f]} \\ w_i^* = \frac{z_i}{\sum z} \end{array} \right.$$

Generalizing to n Assets

- Part 1 -

Finding the optimal portfolio, step-by-step:

#1 - Construct an **Excess Return** (ER) matrix for the N assets.

$$ER = \begin{bmatrix} r_{A,1} - \bar{r}_A & r_{B,1} - \bar{r}_B & \text{L} & r_{N,1} - \bar{r}_N \\ r_{A,2} - \bar{r}_A & r_{B,2} - \bar{r}_B & \text{L} & r_{N,2} - \bar{r}_N \\ \text{M} & \text{M} & \text{O} & \text{M} \\ r_{A,T} - \bar{r}_A & r_{B,T} - \bar{r}_B & \text{L} & r_{N,T} - \bar{r}_N \end{bmatrix}$$

T : # observations

N : # risky assets

(T rows, N columns)

Generalizing to n Assets

- Part 1 -

Finding the optimal portfolio, step-by-step:

#2 - Multiply **ER** by its transpose, divide by the number of time observations, to obtain the **Variance-Covariance Matrix (S)**.

$$S = \underbrace{ER^T}_{(N,T)} \times \underbrace{ER}_{(T,N)} / T = \begin{bmatrix} \sigma_{rA}^2 & Cov(r_A, r_B) & L & Cov(r_A, r_N) \\ Cov(r_A, r_B) & \sigma_{rB}^2 & L & Cov(r_B, r_N) \\ M & M & O & M \\ Cov(r_A, r_N) & Cov(r_B, r_N) & L & \sigma_{rN}^2 \end{bmatrix}$$

(N rows, N columns)

Generalizing to n Assets

- Part 1 -

Finding the optimal portfolio, step-by-step:

#3 - Find the inverse of **S** and multiply it by the difference between the mean returns and the risk-free rate (**R** - **r_f**). This gives us the **z** vector.

#4 - The optimal portfolio weights **w_i^{*}** will be equal to the **z** vector divided by the sum of **z**'s.

$$\begin{cases} \mathbf{z} = \mathbf{S}^{-1} [\mathbf{R} - r_f] \\ w_i^* = \frac{z_i}{\sum z} \end{cases}$$

Generalizing to n Assets

- Part 2 -

With the optimal portfolio obtained (\mathbf{P}^*), compute the (1) expected or mean return, (2) variance, and (3) standard deviation.

Expected or Mean Return:
$$\underbrace{E(r_{P^*})}_{(1,1)} = \underbrace{\mathbf{W}_{P^*}^T}_{(1,N)} \underbrace{\mathbf{R}}_{(N,1)}$$

Variance:
$$\underbrace{\sigma_{P^*}^2}_{(1,1)} = \underbrace{\mathbf{W}_{P^*}^T}_{(1,N)} \underbrace{\Sigma}_{(N,N)} \underbrace{\mathbf{W}_{P^*}}_{(N,1)}$$

Standard Deviation
$$\underbrace{\sigma_{P^*}}_{(1,1)} = \sqrt{\underbrace{\sigma_{P^*}^2}_{(1,1)}}$$

Building the Entire Frontier

- n Assets -

- You have computed the optimal portfolio P^* , which holds for a certain level of the risk-free rate.
- Vary r_f and compute a second optimal portfolio P^{**} .
 - *Can choose any arbitrary r_f*
- The frontier can be generated as a series of linear combinations of P^* and P^{**} .

Building the Entire Frontier

- n Assets -

The mean return and standard deviation of each combination of P^* and P^{**} can then be computed:

Mean Return: $E(r_{P^*,P^{**}}) = \alpha E(r_{P^*}) + (1 - \alpha)E(r_{P^{**}})$

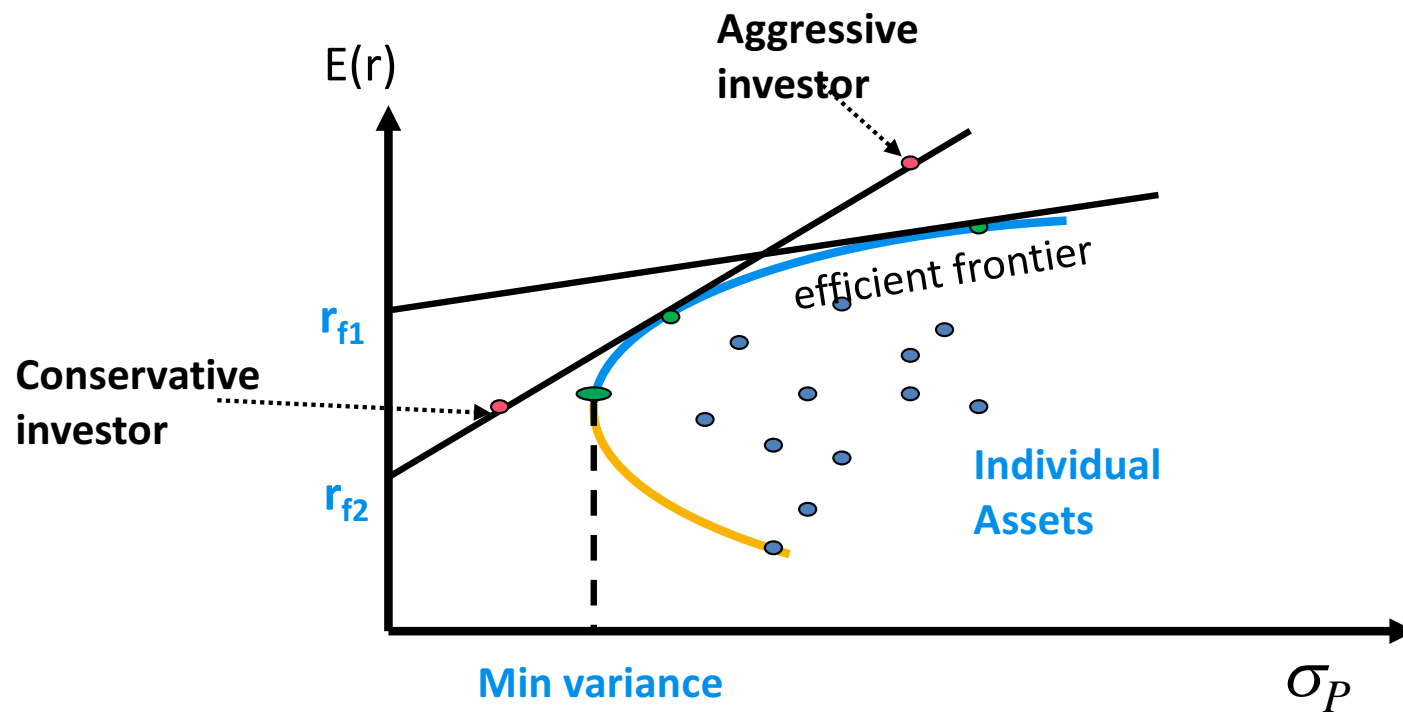
Standard Deviation: $\sigma_{EP} = \sqrt{\alpha^2 \sigma_{P^*}^2 + (1 - \alpha)^2 \sigma_{P^{**}}^2 + 2\alpha(1 - \alpha)\text{Cov}(P^*, P^{**})}$

Covariance between two market portfolios:

$$\text{Cov}_{(1,1)}(P^*, P^{**}) = \underbrace{W_{P^*}^T}_{(1,N)} \underbrace{\Sigma}_{(N,N)} \underbrace{W_{P^{**}}}_{(N,1)}$$

Building the Entire Frontier

- n Assets -



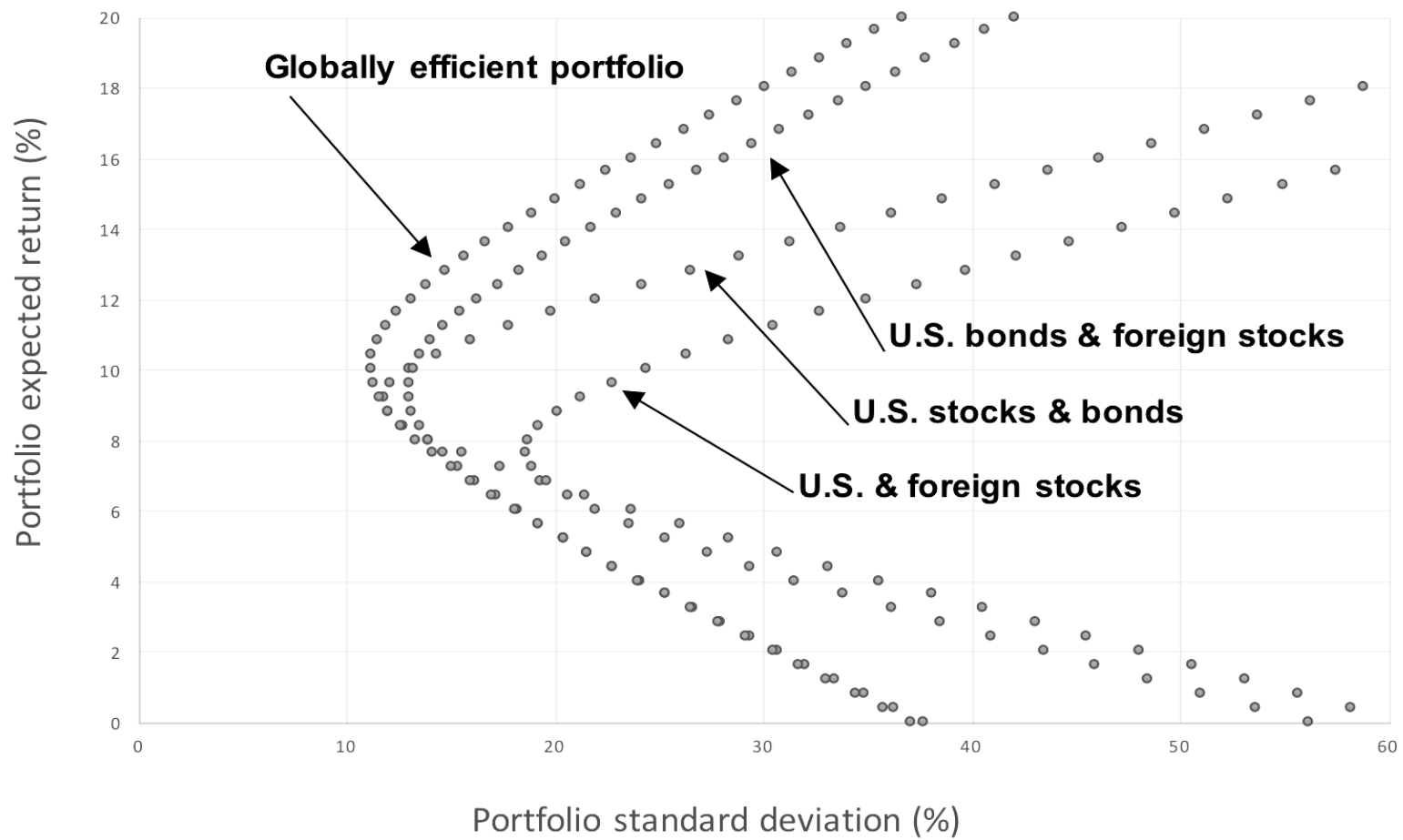
International Diversification

- Part 1 -

The **main principles** related to diversification within the domestic market continue to apply when diversifying internationally:

- Including additional (international) assets that are imperfectly correlated with domestic assets will produce gains (risk reduction).
- But not all risk can be eliminated.
- Currency fluctuations introduce an additional element (Part 2).

Globally Efficient Portfolio



International Diversification

- Part 2 -

Investing across international borders introduces additional risk-return elements coming from currency fluctuations.

What should an investor do?

1. Nothing.
2. Hedge their foreign currency exposure (in different ways).

International Diversification

- Part 2 -

Example: A Japanese investor wants to buy U.S. stock [Apple, Inc.].

Must buy dollars today at the spot exchange rate (S_0 , ¥/\$) in order to buy the shares at today's price ($P_{A,0}$).

Today's (Nov 30, 2015) cost (in ¥) is therefore:

- $P_{A,0} \times S_0$
- $P_{A,0} = \$118.88$, $S_0 = 123.26$ ¥/\$

Cash flow in one year: if unhedged, can sell the shares and exchange US\$ for ¥ at the spot rates:

- $P_{A,1} \times S_1$

International Diversification

- Part 2 -

Example: A Japanese investor wants to buy U.S. stock [Apple, Inc.].

Suppose Apple's stock price rises by 5% in one year:

- $P_{A,1} = \$118.88 \times (1 + 0.05) = \mathbf{\$124.82}$

Regarding the exchange rate, suppose there are two possible scenarios (6% depreciation or appreciation):

- $S_{1,d} = 123.26 \times (1 + 0.06) = \mathbf{130.66 \text{ ¥/\$}}$

- $S_{1,a} = 123.26 \times (1 - 0.06) = \mathbf{115.86 \text{ ¥/\$}}$

International Diversification

- Part 2 -

Unhedged Return:

$$r_U = \left(\frac{P_{A,1} \times S_1 - P_{A,0} \times S_0}{P_{A,0} \times S_0} \right)$$

$$r_U \approx (r_A + r_{FX})$$

r_A : return on US stock in \$

r_{FX} : % change in the spot exchange rate (1\$=S Yen)

$$r_{FX} = \frac{S_1 - S_0}{S_0}$$

$$r_{U,d} \left(\frac{124.82 \times 130.66 - 118.88 \times 123.26}{118.88 \times 123.26} \right) = 11.3\% \quad r_{U,a} = ?$$

International Diversification

- Part 2 -

Full currency hedging:

Each investment in a foreign stock is fully hedged by a forward position; the investor agrees today to sell at the 1-year forward rate.

$$F_{1,0} = 121.23 \text{ ¥/\$}$$

Cash flow (per share) one year from now:

$$CF_{1,d} = (118.88 \times 121.23) + (124.82 - 118.88) \times 130.66 = \text{¥}15,188$$

$$CF_{1,a} = (118.82 \times 121.23) + (124.82 - 118.88) \times 115.86 = \text{¥}15,101$$

International Diversification

- Part 2 -

Hedged Return:

$$r_H = \frac{\overbrace{P_{A,0} \times F_{1,0} + (P_{A,1} - P_{A,0}) \times S_1}^{\text{Value in Japanese Yen of the American Stock at time 1}} - \overbrace{P_{A,0} \times S_0}^{\text{Initial Investment}}}{\overbrace{P_{A,0} \times S_0}^{\text{Initial Investment}}}$$

$$r_H - r_U = \frac{F_{1,0} - S_1}{S_0} \approx \text{Forward return}$$

$$r_{H,d} = \left(\frac{(118.88 \times 121.23) + (124.82 - 118.88) \times 130.66 - (118.88 \times 123.26)}{118.88 \times 123.26} \right) = 3.7\%$$

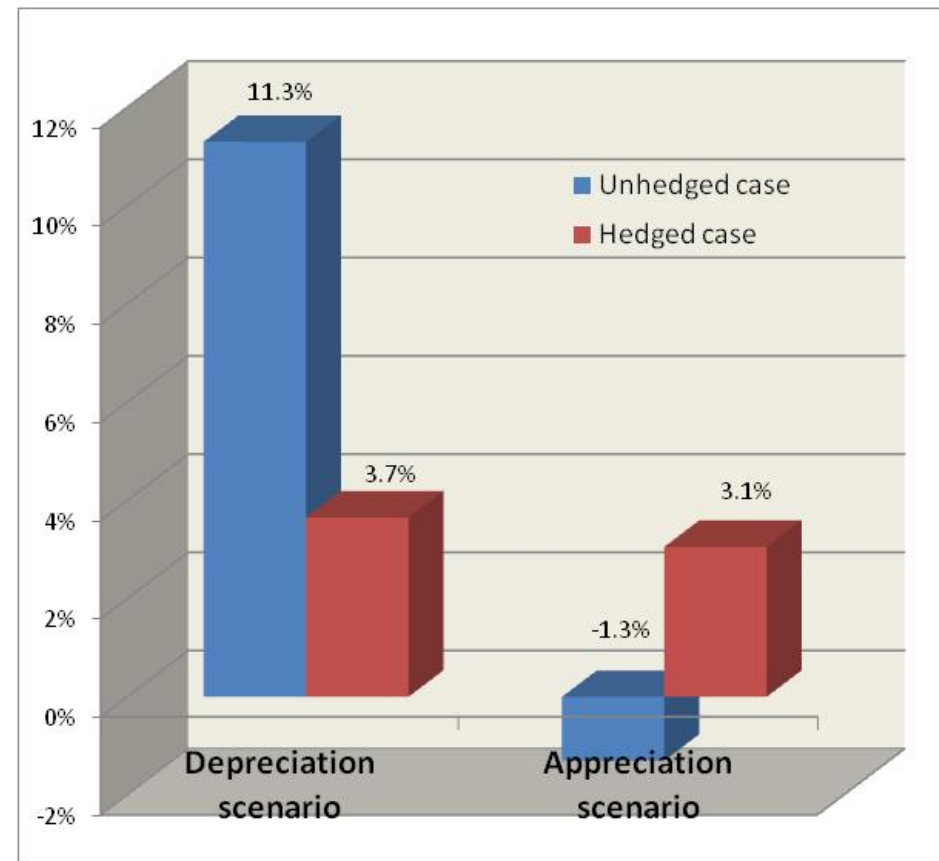
$$r_{H,a} = ?$$

International Diversification

- Part 2 -

Two Strategy Comparison:

- As expected, much less variation under hedging (although exchange rate risk is not eliminated entirely).
- Hedging misses out on potentially large returns.
- Risk vs Reward yet again.
- Alternative hedging strategies: using Markowitz approach, incorporating $\rho_{s,p}$



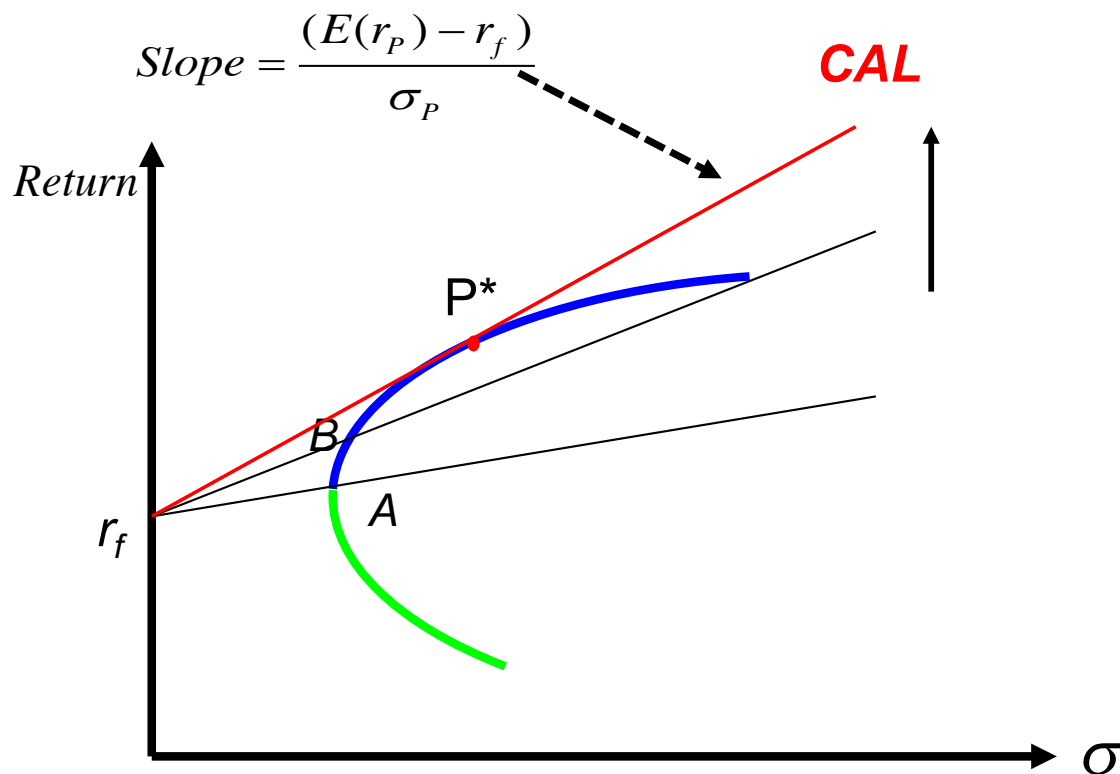
Wrap-Up

Portfolio allocation main messages:

- Diversification benefits come from **imperfect** correlation ($\rho < 1$)
 - $\text{Var}(\text{portfolio}) < \text{Weighted average of Var}(\text{individual assets})$
- If r_f is available, then portfolio choice maximizes excess return (over r_f) relative to the additional risk: P^*
 - In other words, maximizes the **Sharpe ratio** or **Reward-to-variability** (slope of **CAL**)
- **Finally**, investor chooses a combination of P^* and r_f according to risk attitude
- **Separation Property**

Wrap-Up

Portfolio allocation problem, in a nutshell:



By choosing another portfolio (B vs. A),
the CAL becomes steeper.

↓

The Sharpe Ratio of the portfolio
increases.

↓

This continues until the CAL is tangent
to the investment opportunity set.

↓

**The optimal portfolio P*
maximizes the Sharpe Ratio**