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# Aversion to Risk and Optimal Portfolio Selection in the Mean- Variance Framework

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20135 – Theory of Finance, Part I  
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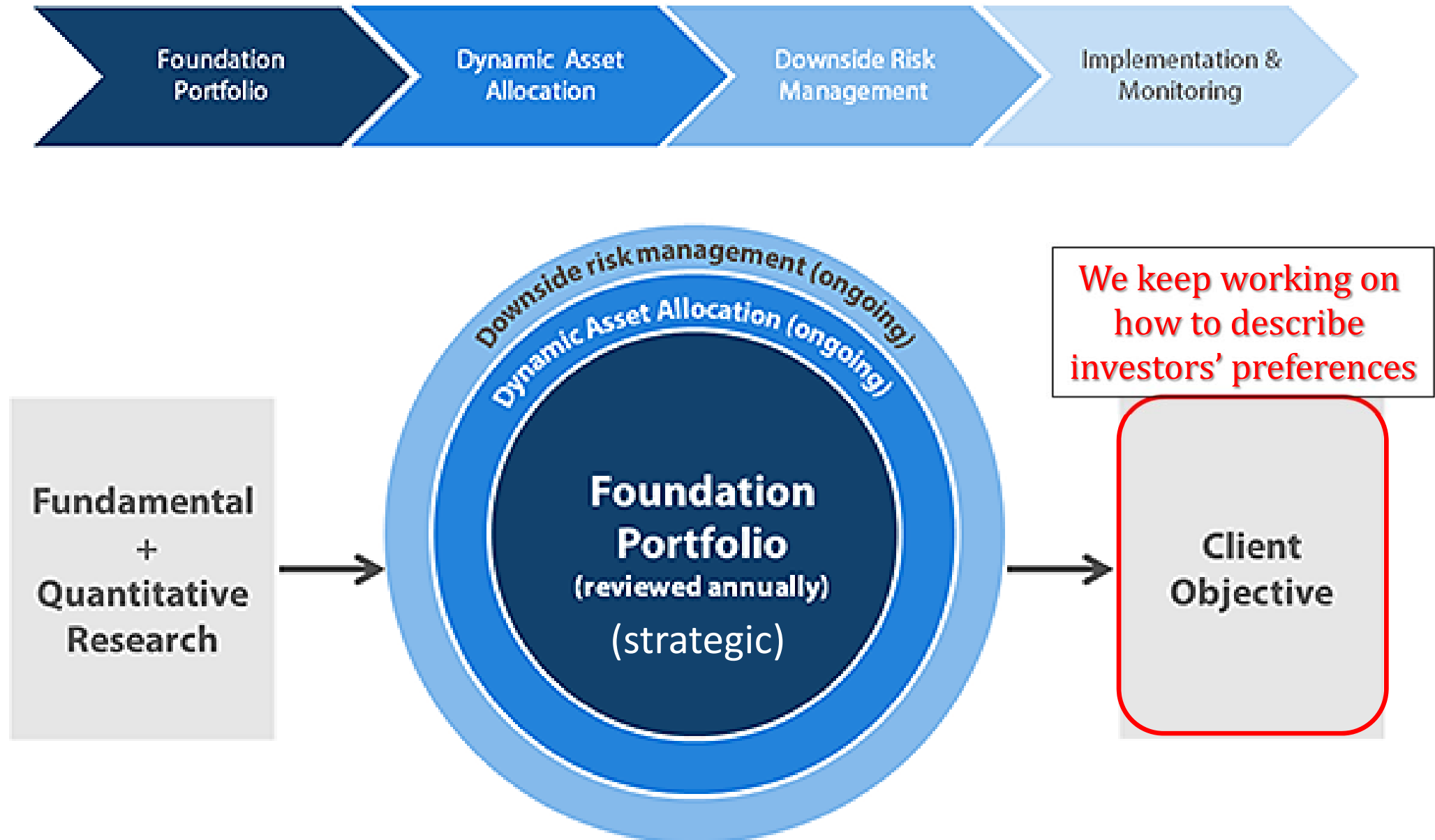
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# Outline and objectives

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- Four alternative ways to provide foundations to mean-variance preferences
  - Guidolin-Pedio, chapter 4, sec. 2.1
- Indifference curves in mean-variance space
  - Guidolin-Pedio, chapter 4, sec. 2.2
- Optimal mean-variance portfolio selection
  - Guidolin-Pedio, chapter 4, sec. 2.3
- The separation theorem
  - Guidolin-Pedio, chapter 4, sec. 2.3

# Outline and objectives



# The Foundations of Mean-Variance Analysis

- One can show that a non-satiated investor with quadratic utility is characterized by an expected utility functional with structure:

$$\begin{aligned} E[U(W)] &= E[W] - \frac{1}{2}\kappa E[W^2] = E[W] - \frac{1}{2}\kappa[\text{Var}[W] + (E[W])^2] \\ &= E[W] \left(1 - \frac{1}{2}\kappa E[W]\right) - \frac{1}{2}\kappa \text{Var}[W] \end{aligned}$$

- It explicitly trades off the variance of terminal wealth with its mean because  $W < 1/\kappa$  implies that  $E[W] < 1/\kappa < 2/\kappa$  which is necessary and sufficient for  $(1 - 1/2\kappa E[W]) > 0$
  - Quadratic utility isn't monotone increasing and may imply  $\text{ARA}, \text{RRA} < 0$
- More generally, a MV framework is characterized by

$$E[U(W)] = \Gamma(E[W], \text{Var}[W]),$$

i.e., by dependence of the VNM functional only on mean and variance

- If  $U(\cdot)$  is quadratic, then  $\Gamma(\cdot)$  will be linear in mean and variance
- **A MV objective can be justified on grounds other than as the expected value of a quadratic utility function**
- There are at least **three additional ways** of justifying a MV objective

# The Foundations of Mean-Variance Analysis

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A MV functional,  $E[U(W)] = \Gamma(E[W], \text{Var}[W])$ , can be micro-founded on: (i) quadratic utility, (ii) a Taylor expansion to any general VNM utility  $U(\cdot)$ , (iii) the EUT when joint return distribution is normal, (iv) directly

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- First, a quadratic approximation (i.e., 2nd-order Taylor expansion), see the Appendix for details
- Second,  $E[U(W)] = \Gamma(E[W], \text{Var}[W])$  may derive from an application of the EUT when the rates of return are described according to a multivariate Normal distribution
  - Normal distributions are characterized entirely by their means (expectations), variances, and covariances;
  - Linear combinations of Normal random variables are also Normal (hence, terminal wealth, or the rate of return on a portfolio of assets with Normally distributed returns, is also Normally distributed)
- Third, often a MV objective is directly assumed, on the grounds that such a criterion is plausible, without recourse to deep assumptions
- Less innocent than it seems, as it implies investors ignore features of the distribution of asset returns besides mean and variance

# Mean-Variance of Terminal Wealth or Ptf. Returns?

- E.g., any skewness in the distribution would be ignored
- A less obvious feature not captured by just variance, is the thickness of the tails of a distribution; an index of this tendency is the kurtosis
- The problems with MV are not over – normally MV objectives are applied to portfolio returns,  $W_{t+1} = (1 + R_{PF,t+1})W_t$  but note that:

$$E_t[W_{t+1}] = E_t[(1 + R_{PF,t+1})]W_t = (1 + E_t[R_{PF,t+1}])W_t$$

$$Var_t[W_{t+1}] = Var_t[(1 + R_{PF,t+1})]W_t^2 = Var_t[R_{PF,t+1}]W_t^2$$

- Therefore, plugging into  $E_t[U(W_{t+1})] = E[W_{t+1}](1 - 0.5\kappa E[W_{t+1}]) - 0.5\kappa Var_t[W_{t+1}]$  and dropping  $(1 - 0.5\kappa E[W_{t+1}])$  one has:

$$E_t[U(W_{t+1})] = (1 + E_t[R_{PF,t+1}])W_t - \frac{1}{2}\kappa Var_t[R_{PF,t+1}]W_t^2$$

$$= \left\{ (1 + E_t[R_{PF,t+1}]) - \frac{1}{2}\kappa Var_t[R_{PF,t+1}]W_t \right\} W_t$$

$$\propto E_t[R_{PF,t+1}] - \frac{1}{2}\kappa Var_t[R_{PF,t+1}]W_t$$

Not the same as:

$$E_t[R_{PF,t+1}] - \frac{1}{2}\kappa Var_t[R_{PF,t+1}]$$

- We call the MV functions that depend on moments of portfolio returns

$$G(E_t[R_{PF,t+1}], Var_t[R_{PF,t+1}]) = G(\mu_{PF}, \sigma_{PF}^2)$$

# MV Indifference Curves and Their Meaning

The loci in the mean-standard deviation space of the infinite combinations  $(\mu_{PF}, \sigma_{PF})$  that yield some fixed level of identical MV utility as measured by  $G(\mu_{PF}, \sigma_{PF}^2)$  is called a MV indifference curve

- How can we represent MV preference of ptf. returns?

- Consider some small, countervailing changes in  $\mu_{PF}$  and  $\sigma_{PF}^2$  to keep the total level of the MV satisfaction constant at some initial level:

$$0 = dG(\mu_{PF}, \sigma_{PF}^2) = \left. \frac{\partial G(\mu_{PF}, \sigma_{PF}^2)}{\partial \mu_{PF}} \right|_{G=\bar{G}} d\mu_{PF} + \left. \frac{\partial G(\mu_{PF}, \sigma_{PF}^2)}{\partial \sigma_{PF}^2} \right|_{G=\bar{G}} d\sigma_{PF}^2$$

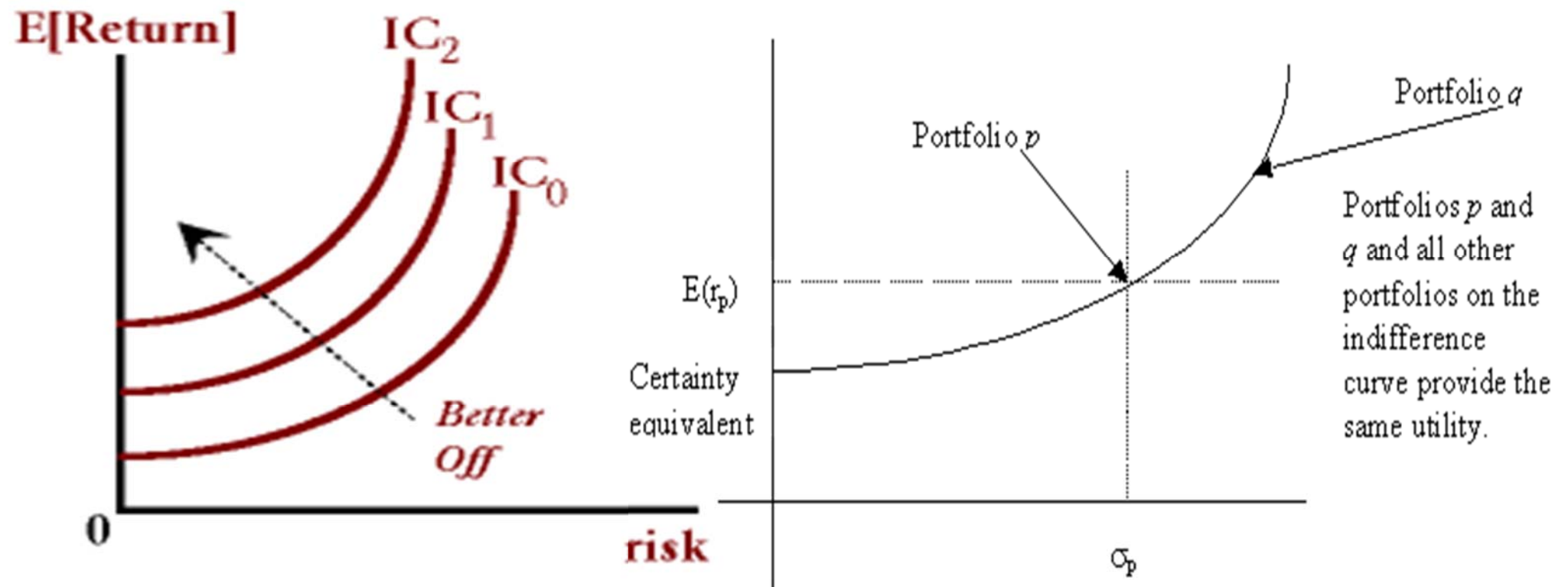
- Solving to find the implied local slope when MV satisfaction is constant:

- This is the slope of a MV indifference curve
- $$\alpha(\bar{G}) \equiv \left. \frac{d\mu_{PF}}{d\sigma_{PF}^2} \right|_{G=\bar{G}} = - \frac{\left. \frac{\partial G(\mu_{PF}, \sigma_{PF}^2)}{\partial \sigma_{PF}^2} \right|_{G=\bar{G}}}{\left. \frac{\partial G(\mu_{PF}, \sigma_{PF}^2)}{\partial \mu_{PF}} \right|_{G=\bar{G}}} > 0$$

- Because for positive  $\sigma$ ,  $\sigma_{PF}^2$  is a monotone increasing function of std. dev., if the slope of the loci is positive as  $\sigma_{PF}^2$  increases, the same must be true of increase in standard deviation,  $\sigma_{PF}$

- The issue now concerns the type of concavity of the indifference curves, because the earlier definition fails to rule out any case

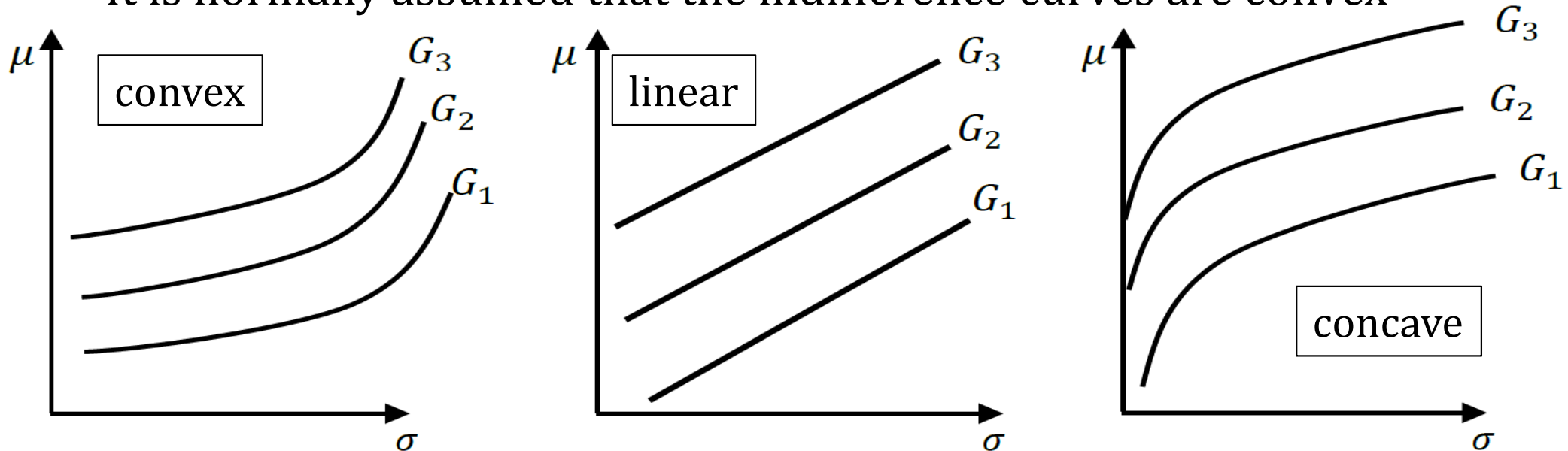
# MV Indifference Curves and Their Meaning





# MV Indifference Curves and Their Meaning

- It is normally assumed that the indifference curves are convex



- The justification for this type of convexity is:

① **Plausibility**, reasonable that, at higher levels of risk, the increments to expected return needed to compensate for increments in risk are larger

② As an implication of **quadratic VNM utility**:  $E_t[U(W_{t+1})] = \mu_{PF} - \frac{1}{2} \kappa \sigma_{PF}^2$

$$\left. \frac{d\mu_{PF}}{d\sigma_{PF}} \right|_{G=\bar{G}} = \kappa \sigma_{PF} > 0 \quad \left. \frac{d^2\mu_{PF}}{d(\sigma_{PF})^2} \right|_{G=\bar{G}} = \kappa > 0$$

i.e., provided the investor is risk-averse, indifference curves are convex

③ As an implication of a negative exponential VNM  $U(\cdot)$  when **returns are jointly normally distributed**

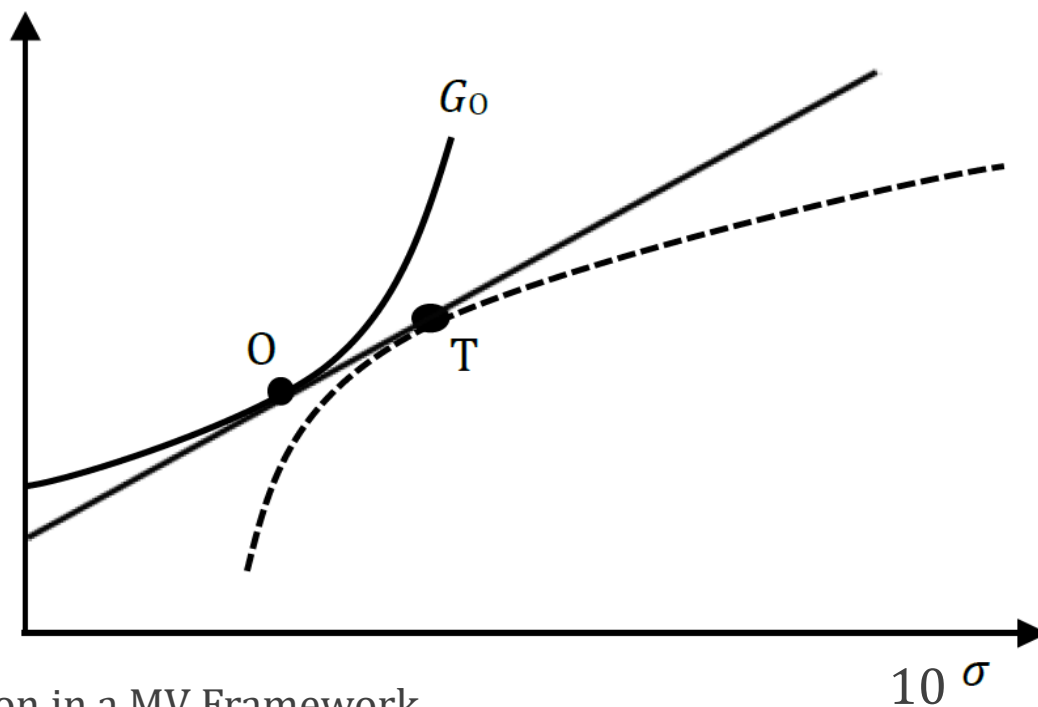
# Optimal MV Portfolio Selection

For each investor, the optimal MV investor lies at the tangency btw. the highest indifference curve and the CML; as a result all investors will demand a unique, risky tangency ptf., the **separation theorem**

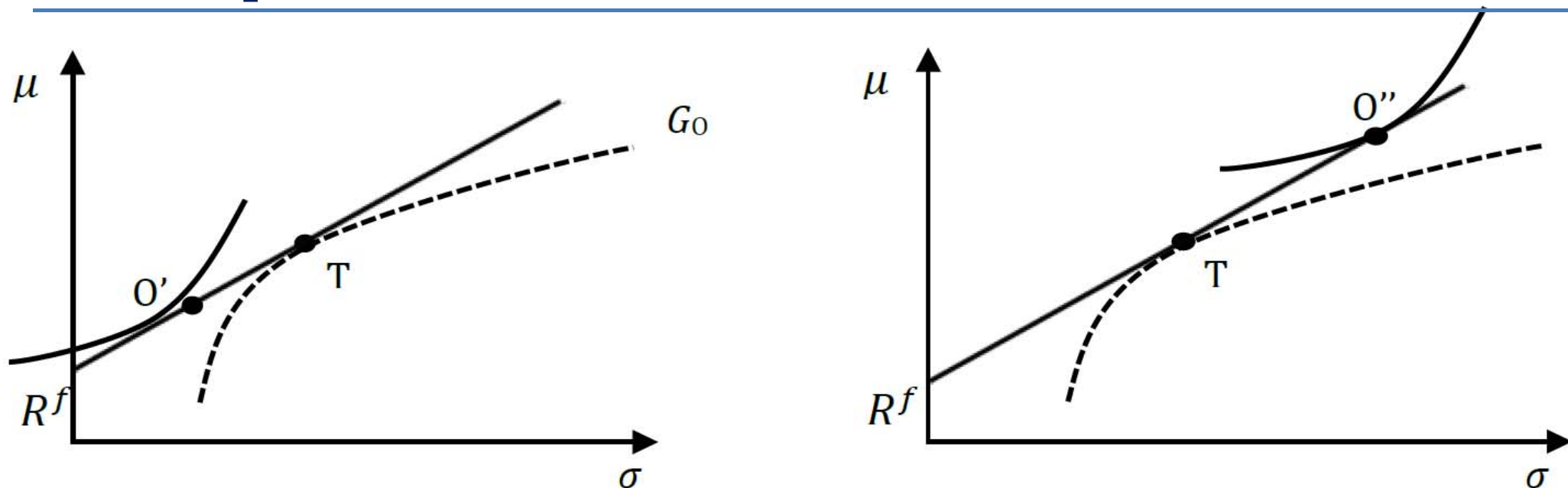
④ Because linear or concave indifference curves would **otherwise lead to predictions that are inconsistent with observed behavior**

- Ready to assemble all the MV machinery:
  - The minimum-variance frontier and the efficient set
  - Indifference curves describing MV-type preferences
- The optimal MV ptf. for one investor lies then on the highest indifference curve attainable s.t. being feasible == on or below CML
- The tangency condition gives that at the optimum it must be  $R^f$

$$\alpha(G_O) = \frac{\mu_T - R^f}{\sigma_T} = SR_T$$



# The Separation Theorem

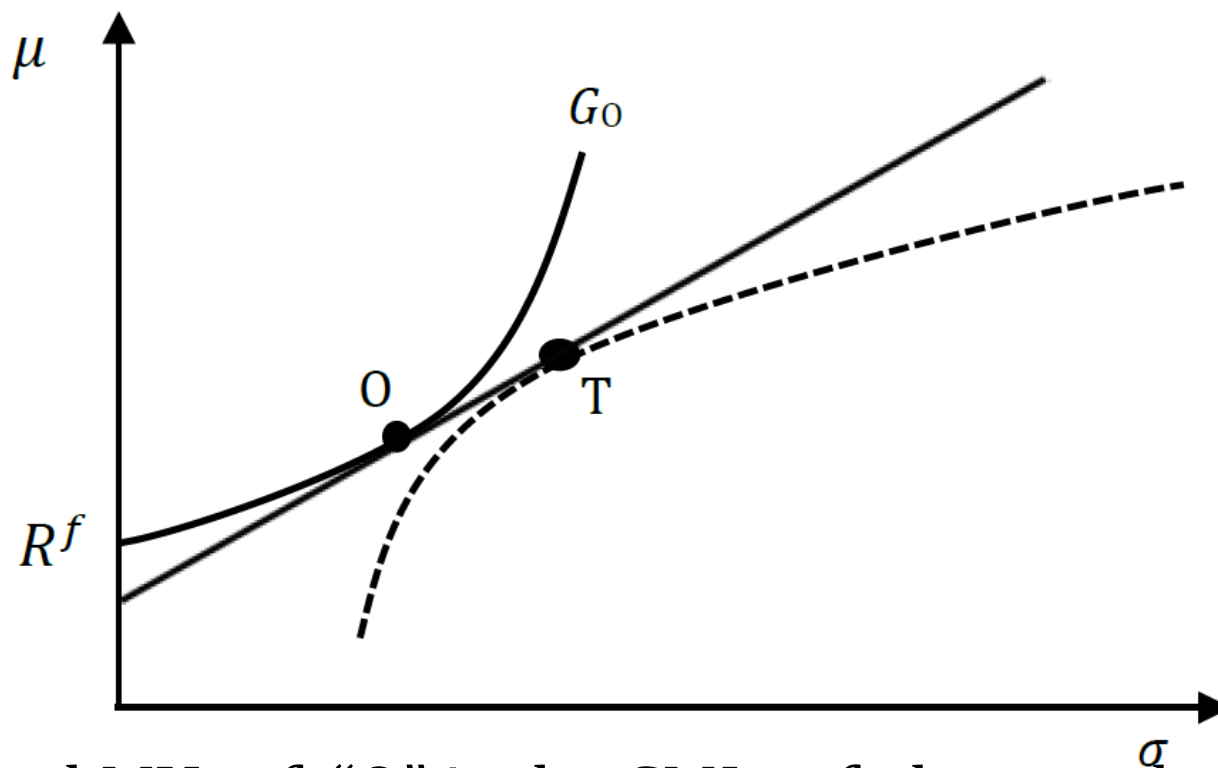


- On the left, the case of an extremely risk-averse, cautious investor who leaves almost all of her wealth in cash
- On the right, an aggressive investor who levers her initial wealth by borrowing to invest more than 100% in the tangency portfolio
- In the case of quadratic utility or when expected utility may be approximated by a MV objective, the optimal share is the solution to:

$$\max_{\omega_t} (1 + R^f) + E[(R_{T,t+1} - R^f)\omega_t] - \frac{1}{2}\kappa \text{Var}[(R_{T,t+1} - R^f)\omega_t]$$

$$\Leftrightarrow \max_{\omega_t} E[(R_{T,t+1} - R^f)]\omega_t - \frac{1}{2}\kappa\omega_t^2\sigma^2$$

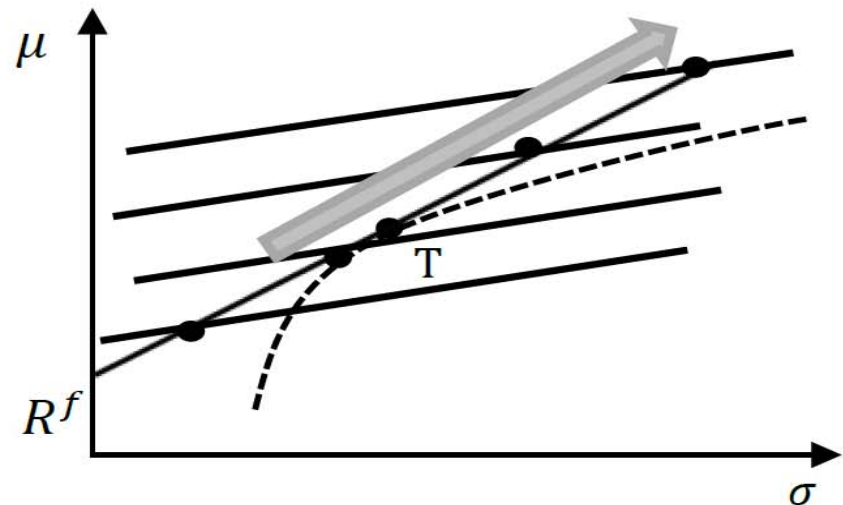
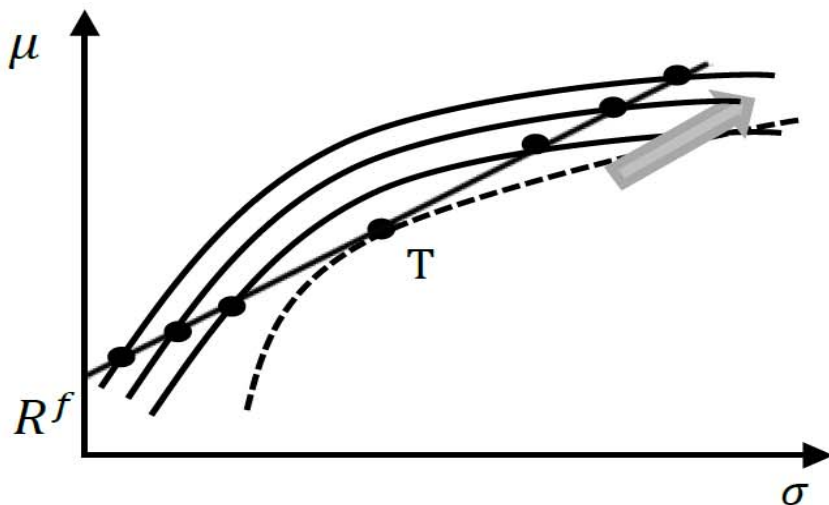
# The Separation Theorem



- The optimal MV ptf. “O” is the CML ptf. that reaches the highest possible indifference curve
- «O» is by construction a linear combination btw. the tangency ptf. «T» and the risk-free asset, because it is on the CML
- Investors with different indifference curves will then require different mixes of risk-free asset and tangency ptf.

# Optimal MV Portfolio Selection

- The FOC leads to the expression:
$$\hat{\omega}_t = \frac{E[(R_{T,t+1} - R^f)]}{\kappa \sigma^2}$$
- The greater the excess expected return (risk premium), the larger the holding of the risky portfolio
- The riskier the portfolio T, the lower the holding of the risky asset
- The greater the risk tolerance (i.e. the smaller is  $\kappa$ ), the higher the holding of the risky portfolio
- If one were not to assume convex indifference curves, an investor will borrow an infinite amount of cash at the riskless rate and to invest a share that diverges to infinity in T, which makes little sense



# Appendix

- Denote the level of wealth by  $\tilde{W}$ . Taking a Taylor's series expansion of utility around expected wealth

$$U(\tilde{W}) = U(E[\tilde{W}]) + U'(E[\tilde{W}])[\tilde{W} - E[\tilde{W}]] \\ + \frac{1}{2}U''(E[\tilde{W}])[\tilde{W} - E[\tilde{W}]]^2 + R_3$$

- Here  $R_3$  is the error that depends on terms involving  $[\tilde{W} - E[\tilde{W}]]^3$  and higher
- Taking the expectation of the expansion

$$E[U(\tilde{W})] = U(E[\tilde{W}]) + \frac{1}{2}U''(E[\tilde{W}])\sigma(\tilde{W})^2 + E[R_3]$$

- The expected error is

$$E[R_3] = \sum_{n=3}^{\infty} \frac{1}{n!} U^{(n)}(E[\tilde{W}]) m^n(\tilde{W})$$

