

# Investments

## Topic 7: CAPM

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# Overview of Topic 7

- ① Terminology.
- ② Regression and Beta.
- ③ The CAPM.
- ④ The CAPM's Basic Insight.
- ⑤ CML and SML.
- ⑥ Uses of the CAPM.
- ⑦ Statistical Tests of the CAPM.

# **1. Terminology**

## Terminology

We assume that there are  $N$  risky assets (stocks) and a riskless asset (T-bill).

- The **excess return** of asset  $n$  is the asset's return minus the return on the riskless asset,

$$R_n - R_f.$$

- The **expected excess return** of asset  $n$  is the asset's expected return minus the return on the riskless asset,

$$E(R_n) - R_f.$$

# Market Portfolio

- The **market portfolio** is the value-weighted portfolio of the  $N$  risky assets.
  - The market value (market capitalization) of asset  $n$  is  $P_n s_n$ , where  $P_n$  is the price of one share and  $s_n$  the total number of shares.
  - The market value of the market portfolio is

$$\sum_{n=1}^N P_n s_n.$$

- The weight of asset  $n$  in the market portfolio is

$$\frac{P_n s_n}{\sum_{n=1}^N P_n s_n}.$$

- We denote by  $R_M$  the return on the market portfolio.
  - The **market risk premium** is the expected excess return of the market portfolio,

$$E(R_M) - R_f.$$

## 2. Regression and Beta

# Regression and Beta

- Consider two random variables  $X$  and  $Y$ .
- Fact: We can write  $Y$  as

$$Y = \alpha + \beta X + \epsilon.$$

- $\alpha, \beta$ : constants,
- $\epsilon$ : random variable, such that

$$\text{Cov}(X, \epsilon) = 0 \quad \text{and} \quad E(\epsilon) = 0.$$

- Variation in  $Y$  is decomposed into
  - $\beta X$ : variation that can be “explained” by  $X$ .
  - $\epsilon$ : “unexplained” variation.
- Fact:  $\beta$  is given by

$$\beta = \frac{\text{Cov}(X, Y)}{V(X)}.$$

# The Regression Equation

- Equation

$$Y = \alpha + \beta X + \epsilon$$

is the **regression equation**.

- It is a useful way of thinking about how  $Y$  is generated.
- Mechanism:
  - $\alpha$  and  $\beta$  are given.
  - For each “observation”, an  $X$  and an  $\epsilon$  are randomly drawn.
  - $Y$  is then determined according to regression equation.



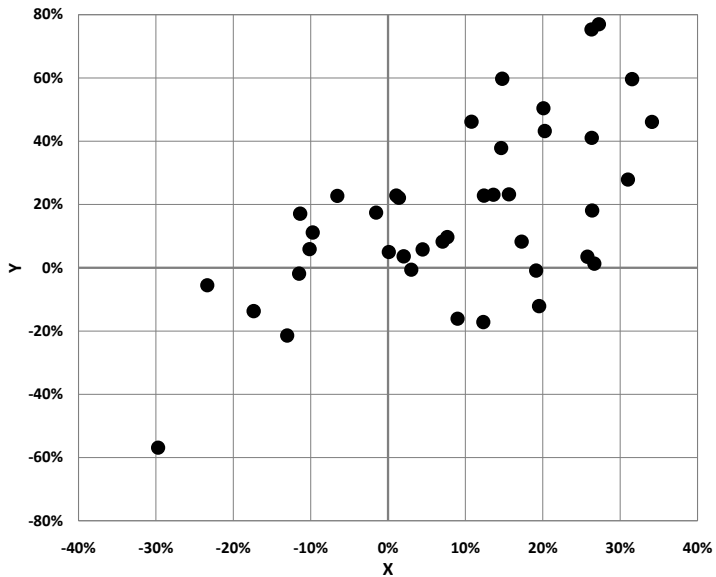
# Regression

- In general, we do not know  $\alpha$  and  $\beta$ .
- However, we can estimate them using regression.
- Regression:
  - We consider the scatterplot of  $Y$  vs.  $X$ .
  - We fit the “best” line to the scatterplot.
  - Suppose that line is

$$Y = a + bX.$$

- $a$  is estimate for  $\alpha$ , and  $b$  is estimate for  $\beta$ .

# A Scatterplot



## Regression Output

Regression output gives:

- Estimate for  $\alpha$ , we call it  $a$ .
  - Standard error of estimate  $a$ , we call it  $s_a$ .
- Estimate for  $\beta$ , we call it  $b$ .
  - Standard error of estimate  $b$ , we call it  $s_b$ .
- Estimate for standard deviation of  $\epsilon$  denoted  $\sigma(\epsilon)$ , we call it  $s(\epsilon)$ .
- R-Squared.

$$\begin{aligned}\text{R-squared} &= \frac{\text{Explained Variance}}{\text{Explained Variance} + \text{Unexplained Variance}} \\ &= \frac{V(bX)}{V(bX) + V(\epsilon)} \\ &= \frac{V(bX)}{V(bX) + s(\epsilon)^2}.\end{aligned}$$

# Regression and Asset Returns

- When studying asset returns, we assume that
  - $X$  is excess return of market portfolio,  $R_M - R_f$ ,
  - $Y$  is excess return of asset  $n$ ,  $R_n - R_f$ .

- Regression equation is

$$R_n - R_f = \alpha_n + \beta_n(R_M - R_f) + \epsilon_n.$$

- Variation in returns of asset  $n$  is decomposed into
  - $\beta_n(R_M - R_f)$ : **Systematic risk**, i.e., risk that is perfectly correlated with the market portfolio.
  - $\epsilon_n$ : **Idiosyncratic risk**, i.e., risk that is uncorrelated with the market portfolio.

# Asset Characteristics

Three characteristics of an asset:

- Alpha,  $\alpha_n$ .
- Beta,  $\beta_n$ .
- Sigma,  $\sigma(\epsilon_n)$ .

# Beta

- Beta:

$$R_n - R_f = \alpha_n + \boxed{\beta_n}(R_M - R_f) + \epsilon_n.$$

- Measures the asset's sensitivity to market movements.
- If the return on the market portfolio is higher by 1%, then the return on asset  $n$  is higher by  $\beta_n$  (holding all else equal).
- Beta is given by

$$\beta_n = \frac{\text{Cov}(R_n, R_M)}{V(R_M)}.$$

## Alpha and Sigma

- Alpha:

$$R_n - R_f = \boxed{\alpha_n} + \beta_n(R_M - R_f) + \epsilon_n.$$

- Measures the asset's attractiveness.

- Sigma:

$$R_n - R_f = \alpha_n + \beta_n(R_M - R_f) + \boxed{\epsilon_n}.$$

- Sigma is the standard deviation of  $\epsilon_n$ . It measures the asset's idiosyncratic risk.

# Regression: Example

IBM vs. CRSP market portfolio. Monthly returns 1/1990 - 9/2022.

```
import pandas as pd
import statsmodels.api as sm
df = pd.read_csv("17reg2022.csv") # Load the data
MktRF = sm.add_constant(df['MktRF']) #adding a constant
model = sm.OLS(df['IBMminusRF'], MktRF).fit()
modelrss = model.resid.std(ddof=MktRF.shape[1]) #model residual standard error
model.summary() # Printing model summary
```

## OLS Regression Results

<b>Dep. Variable:</b>	IBMminusRF		<b>R-squared:</b>	0.231		
<b>Model:</b>	OLS		<b>Adj. R-squared:</b>	0.230		
<b>Method:</b>	Least Squares		<b>F-statistic:</b>	117.8		
<b>Date:</b>	Sat, 12 Nov 2022		<b>Prob (F-statistic):</b>	3.68e-24		
<b>Time:</b>	15:03:53		<b>Log-Likelihood:</b>	-1307.8		
<b>No. Observations:</b>	393		<b>AIC:</b>	2620.		
<b>Df Residuals:</b>	391		<b>BIC:</b>	2627.		
<b>Df Model:</b>	1					
<b>Covariance Type:</b>	nonrobust					
	<b>coef</b>	<b>std err</b>	<b>t</b>	<b>P&gt; t </b>	<b>[0.025</b>	<b>0.975]</b>
<b>const</b>	0.1915	0.345	0.555	0.579	-0.487	0.869
<b>MktRF</b>	0.8351	0.077	10.852	0.000	0.684	0.986



## Regression Output: Example

- Estimate for alpha (monthly):  $a_n = 0.19$ .
  - Standard error of estimate  $s_a = 0.34$ .
- Estimate for beta:  $b_n = 0.84$ .
  - Standard error of estimate  $s_b = 0.08$ .
- R-Square: 23.1%.

## Expected Return

- Regression equation is

$$R_n - R_f = \alpha_n + \beta_n(R_M - R_f) + \epsilon_n.$$

- Taking expectations, we get

$$E(R_n) - R_f = \alpha_n + \beta_n(E(R_M) - R_f).$$

- Expected excess return of asset  $n$  depends on
  - Alpha.
  - Beta.
  - Market risk premium.
- Can we obtain some insight on these?

### 3. The CAPM

# The CAPM

- The CAPM is a theoretical model which provides insight on assets' expected returns.
- Assumptions:
  - Markets are perfect, in particular
    - Trading of assets is costless (including short sales).
    - Investors have the same information (beliefs).
  - There are  $N$  risky assets and a riskless asset.
  - Investors care only about mean and variance.
  - Investors have a one-period horizon.

# Asset Demand

- We first consider the demand for the assets.
- A single investor:
  - Cares only about mean and variance.
  - Chooses a portfolio on the portfolio frontier.
  - Portfolio is a combination of tangent portfolio and riskless asset.
    - Very risk-averse: Portfolio closer to riskless asset.
    - Not very risk-averse: Portfolio closer to tangent portfolio, or even above tangent portfolio.
- Investors as a group:
  - Demand is a combination of tangent portfolio and riskless asset.

## Asset Supply

- We next consider the supply of the assets.
- Supply is  $\sum_{n=1}^N P_n s_n$  dollars of market portfolio, and the riskless asset.

# Market Equilibrium

- In market equilibrium, demand equals supply.
- In particular:

Tangent portfolio coincides with market portfolio

- Example:
  - Suppose that weight of GE is 1% in market portfolio and only 0.7% in tangent portfolio.
  - Supply of GE exceeds demand.
  - Price of GE has to fall.
    - Weight of GE in market portfolio decreases.
    - Weight of GE in tangent portfolio increases.
  - Price has to fall until weights become equal.

# Market Portfolio as a Cake

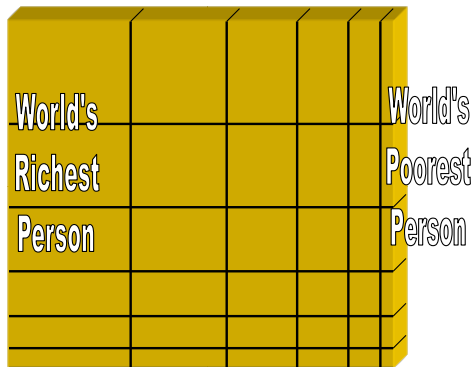
- Let's think about market portfolio as a square cake
- All risky assets (stocks) will be viewed as slices of this cake
- The cake will be sliced
  - Horizontally
  - Varying width of slices will be proportional to market capitalization of each stock





## Equilibrium Again

- All investors collectively hold all assets (demand=supply)
- For every borrower at risk-free rate there is a lender
  - Then all riskless positions net-out across all investors
- We have already observed that everyone will hold the same tangency portfolio
- Given these observations we can now slice the cake vertically according to the wealth of the investor



# The Market Portfolio

- Note that no matter what is the investors wealth, each one has the same proportion invested in each of the stock (the tangency portfolio)
- Looking at the picture, we can compute this proportion: it is the same as proportion of each company in the market portfolio

$$w_i = \frac{\text{total dollar value of asset } i}{\text{total dollar value of all risk securities}}$$

- The tangency portfolio coincides with the Market portfolio

## An Important Property of the Tangent Portfolio

- Suppose that we hold the TP, and decide to
  - increase the weight of a risky asset  $n$
  - decrease the weight of the riskless asset (by the same amount).
- The change in expected return is

$$\frac{dE(R)}{dw_n} = E(R_n) - R_f.$$

- The change in variance is

$$\begin{aligned}\frac{dV(R)}{dw_n} &= 2 \left( w_n V(R_n) + \sum_{m \neq n} w_m \text{Cov}(R_n, R_m) \right) \\ &= 2 \text{Cov}(R_n, R^*),\end{aligned}$$

where  $R^*$  denotes the return on the tangent portfolio.

- Notice that the change in variance involves the covariance of asset  $n$  with the tangent portfolio, and not the variance of asset  $n$ .

# Measuring Asset Risk

- When the asset is examined in isolation:

Variance of asset return.

- When the asset is examined as part of a portfolio:

Covariance between asset return  
and return on the portfolio

## The Buck for the Bang Ratio

- Define the buck for the bang ratio as the ratio of the change in expected return (buck) to the change in variance (bang).

- This ratio is

$$\frac{E(R_n) - R_f}{2\text{Cov}(R_n, R^*)}.$$

- The important property of the TP is that this ratio is independent of the particular asset  $n$ .
- Intuition (next slide for details):
  - 1 Suppose that the buck to the bang ratio is higher for asset  $n$  than for asset  $m$ .
  - 2 Then, by buying  $n$  and selling  $m$ , we can decrease variance of TP, holding expected return constant
- In market equilibrium, tangent portfolio coincides with market portfolio.
- Therefore,  $R^* = R_M$  in the formula above

## Why the Bang for the Buck Ratio is Equal for all Assets

Suppose that the buck for the bang ratio for asset  $n$  ( $BB_n$ ) is greater than for asset  $m$  ( $BB_m$ ). We will show that we can decrease the variance of the TP, holding expected return constant. This will be a contradiction since the TP is a frontier portfolio.

Consider an increase in the weight of asset  $n$  (accompanied by an equal decrease in the weight of the riskless asset), such that the expected return of portfolio increases by  $dE$ . The variance of the portfolio will increase by  $dV_n$  such that

$$\frac{dE}{dV_n} = BB_n \Rightarrow dV_n = \frac{dE}{BB_n}.$$

Consider also a decrease in the weight of asset  $m$ , such that expected return of the portfolio decreases by  $dE$ . The variance of the portfolio will decrease by  $dV_m = dE/BB_m > dE/BB_n = dV_n$ .

# The CAPM

- Since the buck for the bang ratio is the same for all assets, it is also the same for all portfolios.
- Therefore, it is the same for asset  $n$  and the market portfolio, i.e.,

$$\frac{E(R_n) - R_f}{2\text{Cov}(R_n, R_M)} = \frac{E(R_M) - R_f}{2V(R_M)}.$$

- This equation implies that

$$E(R_n) - R_f = \frac{\text{Cov}(R_n, R_M)}{V(R_M)}(E(R_M) - R_f).$$

- This is the CAPM.

# The CAPM, Beta, and Alpha

- Recall that

$$\beta_n = \frac{\text{Cov}(R_n, R_M)}{V(R_M)}.$$

- Therefore, the CAPM is

$$E(R_n) - R_f = \beta_n(E(R_M) - R_f).$$

- Recall that the regression equation implies that

$$E(R_n) - R_f = \alpha_n + \beta_n(E(R_M) - R_f).$$

- Therefore, the CAPM says that  $\alpha_n = 0$ .



## **4. The CAPM's Key Insight**

# The CAPM's Key Insight

- The CAPM is

$$E(R_n) - R_f = \beta_n(E(R_M) - R_f).$$

- An asset's expected return depends on the asset's risk
  - through the asset's beta (systematic risk),
  - and not through the asset's sigma (idiosyncratic risk).
- Key insight:

It is systematic risk and not idiosyncratic risk  
that is priced in the market

In other words:

The relevant measure of asset risk  
is beta and not the variance

## Intuition

- Suppose that an asset has zero beta. The CAPM implies that it has the same expected return as the riskless asset.
  - Intuition: The asset's risk is only idiosyncratic and can be diversified. The asset does not contribute to portfolio risk.
- Suppose that an asset has positive beta. The CAPM implies that it has higher expected return than the riskless asset.
  - Intuition: The asset increases portfolio risk.
- Suppose that an asset has negative beta. The CAPM implies that it has lower expected return than the riskless asset.
  - Intuition: The asset reduces portfolio risk.

# Linearity

- The CAPM is

$$E(R_n) - R_f = \beta_n(E(R_M) - R_f),$$

and implies that an asset's expected return depends on risk only through beta.

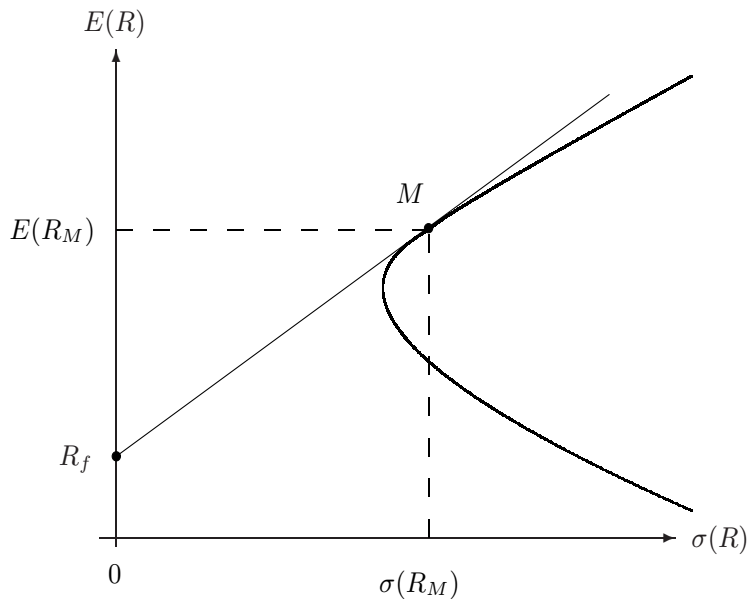
- It also implies that the asset's expected excess return is linear in beta.
- For instance, if beta is 2, then the asset's expected excess return is twice the market risk premium.

## 5. CML and SML

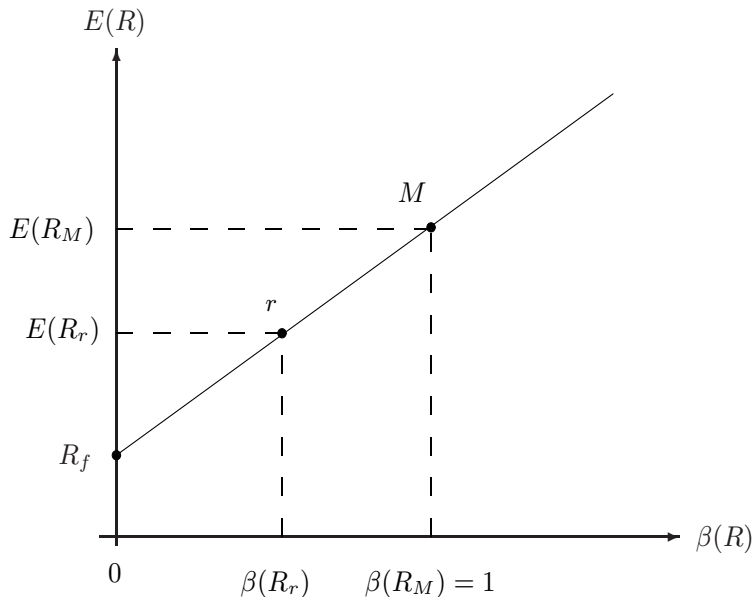
## CML and SML

- Two lines which illustrate the CAPM are:
  - the Capital Market Line (CML),
  - the Security Market Line (SML).

## The Capital Market Line (CML)



## The Security Market Line (SML)

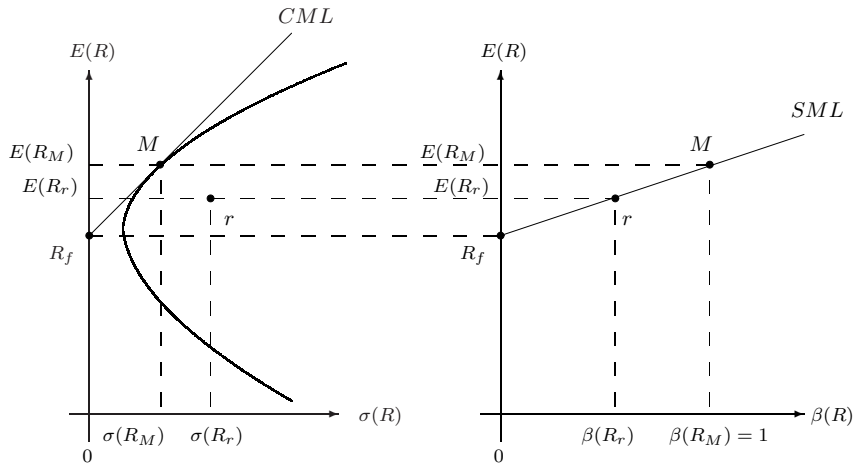




## CML vs. SML

- The CML:
  - is in the standard deviation/expected return space.
  - contains only the frontier portfolios.
- The SML:
  - is in the beta/expected return space.
  - contains all portfolios (according to the CAPM).

## CML vs. SML: Graph



## 6. Uses of the CAPM

# Uses of the CAPM

- Summary so far:
  - Objective: Obtain some insight on stocks' expected returns.
  - Regression equation

$$R_n - R_f = \alpha_n + \beta_n(R_M - R_f) + \epsilon_n,$$

implies that

$$E(R_n) - R_f = \alpha_n + \beta_n(E(R_M) - R_f).$$

- CAPM is

$$E(R_n) - R_f = \beta_n(E(R_M) - R_f),$$

i.e.,  $\alpha_n = 0$ .

- But how can we use the CAPM?

# Uses of the CAPM

- Valuation.
  - Valuation of stocks.
  - Valuation of firms' investments.
  - CAPM provides a risk-adjusted discount rate for the Present Value calculation.
- Performance evaluation.
- Portfolio selection.
  - Estimating expected returns
  - Estimating covariances: This was Sharpe's original intent. Why? 100 assets require estimates of 4950 correlations. In 1950's computers couldn't do it.
- Option pricing: "I applied the CAPM to every moment in an option's life, for every stock price and option value" (Fischer Black)

# Portfolio Selection in a CAPM World

- Suppose that we:
  - Estimate the betas of all stocks.
  - Assume that stocks' expected returns are given by the CAPM.
  - Care only about mean and variance.
- What is our optimal portfolio?

## Portfolio Selection in a Non-CAPM World

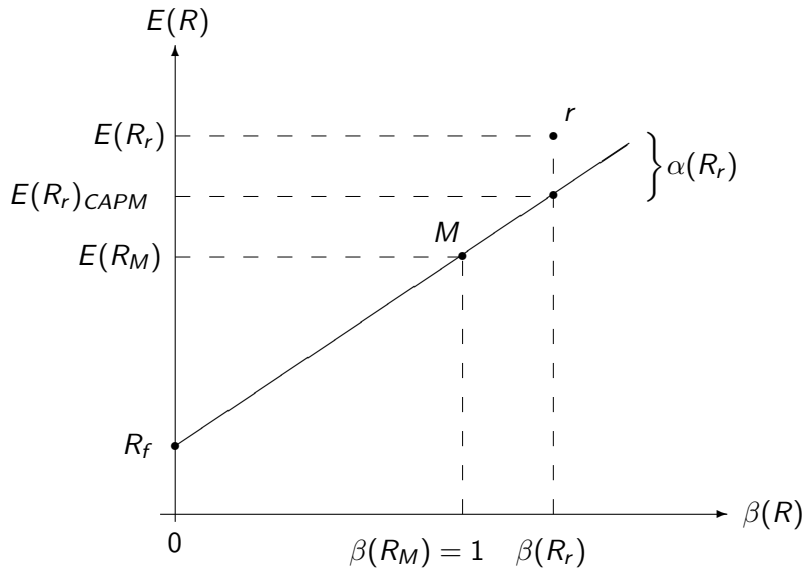
- Portfolio selection in a CAPM world is straightforward.
- The CAPM is still useful, however, because it can guide portfolio selection in a non-CAPM world.
- Suppose that we:
  - Are confident that expected returns of a few stocks are not given by the CAPM.
  - Assume that expected returns of all other stocks are given by the CAPM.
- How would we choose our portfolio?

## Risk Adjustment

- Compared to its weight in the market portfolio, a stock should get greater weight if
  - its expected return is greater than that given by the CAPM,
  - i.e., if its alpha is positive.
- The CAPM is useful because it provides a benchmark to which we can compare a stock's expected return.
- In other words, the CAPM tells us how to adjust the stock's expected return in order to account for risk.



## Back to the SML



## **7. Statistical Tests of the CAPM**

# Statistical Tests of the CAPM

- The CAPM is

$$E(R_n) - R_f = \beta_n(E(R_M) - R_f).$$

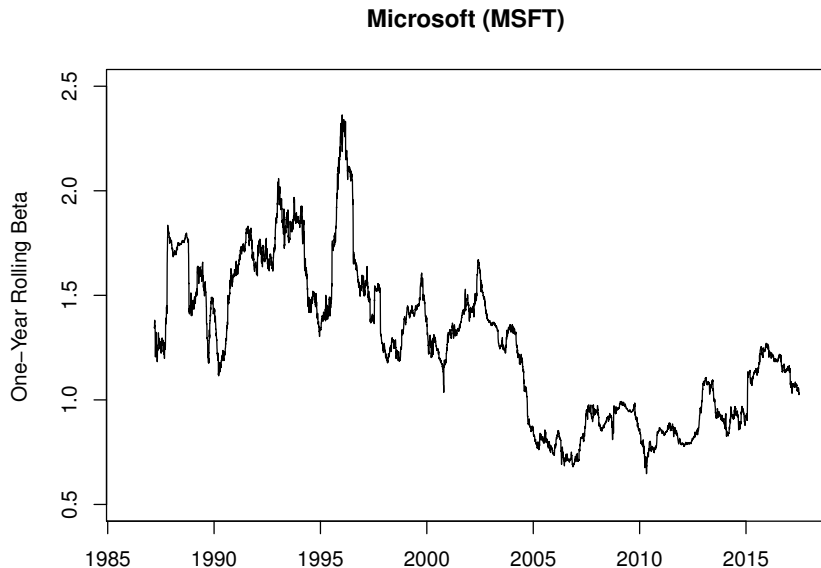
- Implications:

- ① Expected excess returns are linear in beta.
- ② Slope of the line is market risk premium.
- ③ Expected returns depend only on beta.

# A Lot of Data Issues

- Which frequency of data?
  - Monthly, weekly, daily?
- How much data?
  - 2 years, 5 years, 10 years?
- What is the market?
  - S&P 500? Wilshire 5000?
- What is the risk free rate?
  - Treasury bill rate?
- How do betas change with time?
  - Does the relationship between the market and stock returns change over time? How serious are these changes?
  - To assess this, compute rolling estimates betas: Every week, use last 1 year of data and re-run the regressions.

## Time-Variation in Beta



# Remedies

- Can Microsoft's beta move that much?
- Does the past tell us anything about the future?
- How to get more plausible numbers (without throwing out the data)?
- Improving the estimates:
  - Merrill Lynch “adjusts”  $\beta$ s
  - BARRA predicts  $\beta$ s

# The ML Beta

- Use our views to improve estimates
- Suppose the data gives a  $\beta_s$  ( $s$  for sample), but you think that beta is  $\beta_p$  ( $p$  for personal view).
- Form a weighted average:

$$\beta = w_p \beta_p + (1 - w_p) \beta_s,$$

where  $w_p$  is weight you place on your personal view.

- Merrill Lynch takes  $\beta_p = 1$ , and  $w_p = 1/3$ .
  - Why?  $\beta = 1$  is the average of all betas (market's beta)
- You could use any other combinations you want.

# The BARRA Beta

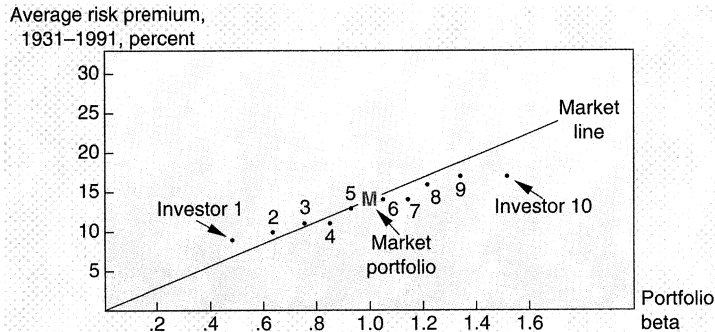
- Can they be predicted? Yes. Run regressions
- Let  $\beta_t$  be today's beta.
- Estimate new beta using past betas: regression

$$\beta_{t+1} = c_0 + c_1\beta_t + \varepsilon_{t+1}$$

- BARRA (sells investment advice) argues this is better than traditional ways of estimating betas.
- Easy to change  $\beta$ s. What do they mean now?



## Implications 1 and 2



Source: Black, Fischer, 1993, Beta and return, *The Journal of Portfolio Management*.

Conclusions:

- Expected excess returns are approximately linear in beta.
- Slope of the line is smaller than market risk premium.

## Implication 3

Do expected returns depend on other factors, in addition to beta?

- They do not seem to depend on sigma (idiosyncratic risk).
- They seem to depend on
  - Size.
  - Liquidity.
  - Value.
  - Momentum.

## Size and Liquidity Effects

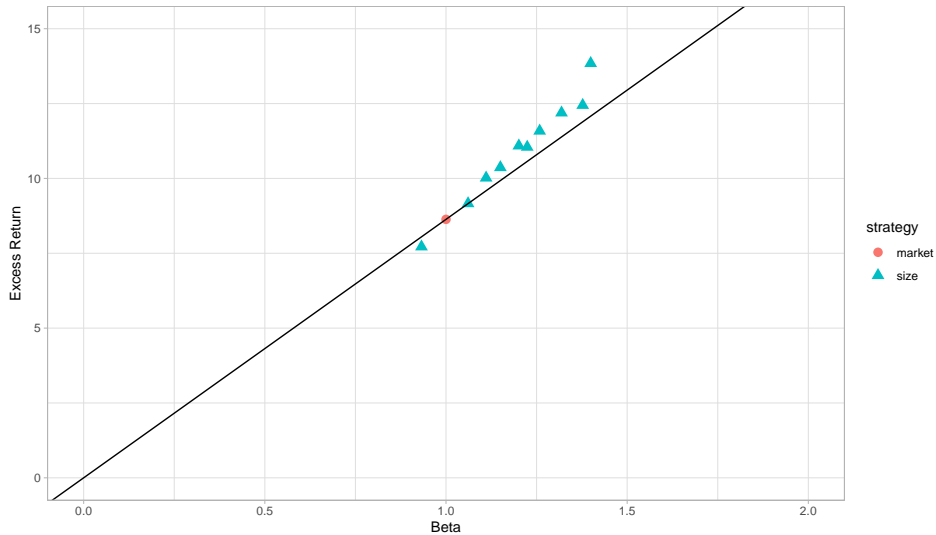
- **Size effect:** Expected returns of small stocks exceed those of large stocks (holding beta equal).
- **Liquidity effect:** Expected returns of low-liquidity stocks exceed those of high-liquidity stocks (holding beta equal).
- The two effects are related because liquidity increases with size.
- Yet, they are not the same effect.

## Size effect: Portfolio construction

- Let's look at all the stocks in CRSP
- Sort stocks into deciles based on market cap at the end of June each year
- Portfolios are held fixed throughout year
- The portfolios for July of year  $t$  to June of  $t + 1$  include all NYSE, AMEX, and NASDAQ stocks for which we have market equity data for June of year  $t$
- Source: Kenneth French's [data library](#)

# Puzzles: Size effect

10 Size Portfolios 1926–2022



# Value Effect

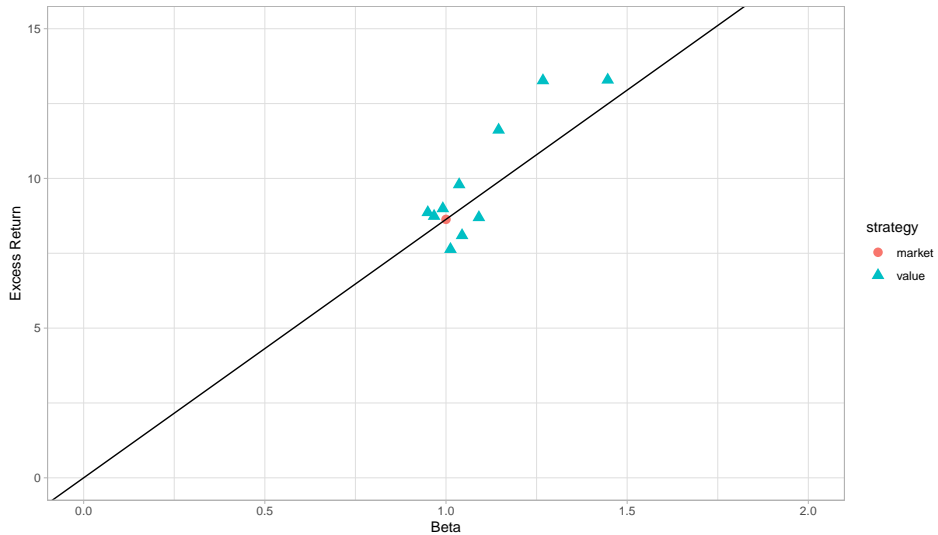
- Compare price to accounting measures, e.g., book value or earnings.
  - High book-to-market ratio: Value stocks.
  - Low book-to-market ratio: Growth stocks.
- **Value effect:** Expected returns of value stocks exceed those of growth stocks (holding beta equal).
- **Reversal effect:** Expected returns of stocks with long history of underperformance exceed those with long history of overperformance (holding beta equal).
- The two effects are related.
  - Long history of underperformance  $\Rightarrow$  High book-to-market ratio.
  - Long history of overperformance  $\Rightarrow$  Low book-to-market ratio.

## Value effect: portfolio construction

- Let's look at all the stocks in CRSP
- Sort stocks into deciles based on book-to-market ratios at the end of June each year; high book-to-market stocks are 'value' stocks
- Portfolios are held fixed throughout year
- The portfolios for July of year  $t$  to June of  $t + 1$  include all NYSE, AMEX, and NASDAQ stocks for which we have market equity data for June of year  $t$

# Puzzles: Value effect

10 Book-to-Market Portfolios 1926–2022





# Momentum Effect

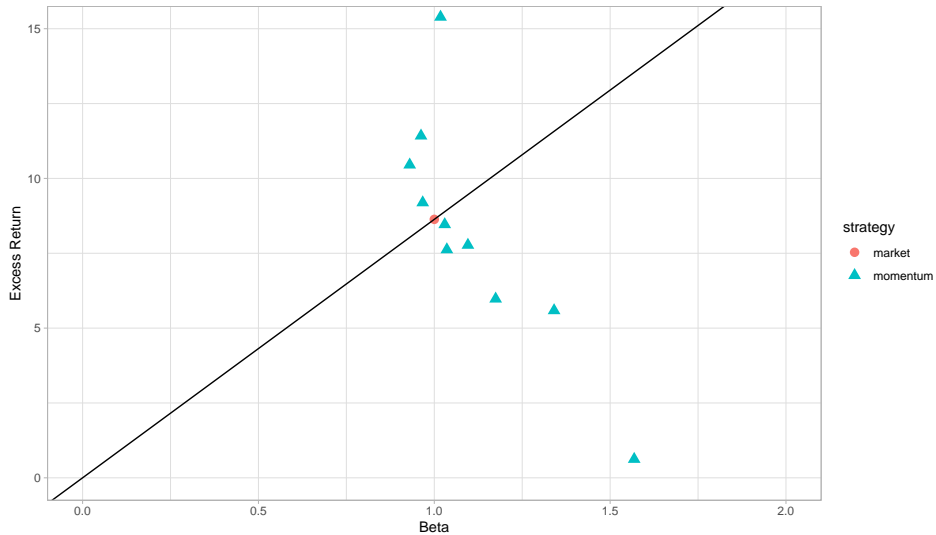
- **Momentum effect:** Expected returns of stocks with short history of overperformance exceed those with short history of underperformance (holding beta equal).
- Momentum is not inconsistent with Reversal/Value.
  - Momentum: Performance over recent history (3 months-1 year) is expected to continue.
  - Reversal: Performance over longer history (3-5 years) is expected to reverse.

## Momentum effect: portfolio construction

- Let's look at all the stocks in CRSP
- Sort stocks into deciles based on prior return (-2 to -12) deciles at the end of June each year; high prior return stocks are 'momentum' stocks
- Portfolios are held fixed throughout year
- The portfolios for July of year  $t$  to June of  $t + 1$  include all NYSE, AMEX, and NASDAQ stocks for which we have market equity data for June of year  $t$  and a stock must have a price for the end of month  $t - 13$  and a good return for  $t - 2$ .

# Puzzles: Momentum effect

10 Momentum Portfolios 1926–2022



## Possible Explanations

- Value, momentum, size and liquidity effects are important challenges to the CAPM.
- Possible explanations.
  - Risk.
  - Irrationality.
  - Frictions.

# Risk

- Assume multiple risk factors.
- Example: Value effect can be explained if
  - There is an additional factor to the market portfolio, carrying a positive risk premium.
  - Value stocks have higher beta with respect to that factor than growth stocks.
- Empirical multi-factor models: Factors are
  - Market portfolio.
  - Value portfolio (HML).
  - Momentum portfolio (WML).
  - Size portfolio (SMB).
- What is economic interpretation of these factors?

# Irrationality

- Assume that investors process information incorrectly.
- Example: Value effect can be explained if
  - Investors are too optimistic about future earnings of some stocks (overpricing them) and too pessimistic about future earnings of other stocks (underpricing them).
- Example: Momentum effect can be explained if
  - Optimism/pessimism builds gradually...
  - ... and this is not anticipated by rational investors.
- Do biases aggregate?
- Rational investors must have limited capital.

# Frictions

- Assume that investors are rational but there are frictions arising because of
  - Transaction costs and illiquidities.
  - Delegation of portfolio management and agency problems.
- Example: Value and momentum effects can be explained if
  - Investors invest through asset managers.
  - Following a manager's poor performance, investors update negatively on manager's ability and withdraw funds gradually.
  - Manager sells stocks following the withdrawals.
- Investors not subject to the frictions must have limited capital.

# Summary

- The CAPM is a simple and intuitive model, used in practice.
- Statistical tests:
  - The CAPM does OK but not great.
  - A four-factor model with market portfolio, value, momentum and size does better than the CAPM.
  - However, statistical tests are subject to measurement and data mining issues.
- One (popular) view: While the CAPM may not be perfect, it is unlikely that a truly perfect model will be found in the foreseeable future. In that sense, the CAPM may be good enough, especially relative to the cost of implementing a more sophisticated model.