

FIN 4500

Chapter 10

Market Risk

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- **Market risk (measured by value at risk)** is the risk related to the uncertainty of a financial institution (FI)'s **earnings** on its trading portfolio caused by changes in market conditions
 - **Related** to systematic risk; but **not** exactly same as market risk -- looks at the downside only
- Risks such as interest rate risk, credit risk, liquidity risk and foreign exchange risk affect market risk
- It can be measured over periods as short as one day
- Usually measured in terms of dollar exposure amount or as a relative amount against some benchmark



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Market Risk Measures

We discuss different ways to measure market risk in this lecture

- RiskMetrics
- Historic or back simulation
- Monte Carlo simulation
- Expected shortfall
- Regulatory models



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History of RiskMetrics Model

- Developed by J.P. Morgan (JPM) in 1992
 - A daily report measuring a financial institution's market risk
- JPM had a large portfolio of assets in 1994
 - 14 active trading locations
 - 120 independent units trading
 - Fixed income securities; Foreign exchange; Commodities
 - Derivatives; Emerging market securities; Proprietary assets
- It is an independent commercial product
 - 2008, listed on New York Stock Exchange
 - 2010, acquired by MSCI for \$1.55 billion



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RiskMetrics is on VaR

- Value at Risk (*VaR*) again
 - Definition: The **worst** loss over a given target holding period at a given confidence level under normal market condition
- What question does *VaR* address?

Q1: Given a certain market change or shock, how much could your portfolio suffer?

Q2: If it turns out to be a bad day tomorrow, what is the worst loss of your investment?



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Examples for a “Bad Day”

- To define a “bad day” in such a way that the day is so bad, or the loss is so severe that such a day (or loss) occurs under normal market condition only once out of every 20 trading days, put another way, the chance of the occurrence (loss) is only 5%
- If it turns out to be a bad day tomorrow, what will be the worst loss of your investment, given that day happens once out of every 20 trading days?



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Percentile Values for the Normal Distribution (Review)

- If X (*loss*) is normally distributed with
 - mean = m
 - standard deviation = s
- Then
 - Probability ($X > m + 1.645 s$) = 0.05
 - Probability ($X > m + 1.96 s$) = 0.025
 - Probability ($X > m + 2.330 s$) = 0.01



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Key Elements of Calculating VaR

- **Holding period:** target time horizon during which you hold your investment position, also target measuring period
 - i.e., for how long?
- **Confidence level**
 - How bad it goes?
- Probability **distribution** of return



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DEAR and N-Day VaR

- One-day VaR, or Daily VaR is usually calculated, especially in the case of Riskmetrics model. It is usually termed **Daily Earning at Risk, DEAR**
- **More-than-one-day** VaR can be derived from DEAR from following formula (under the assumption that market volatility is constant over time):

$$\text{N-Day VaR} = \text{DEAR} \times \sqrt{N}$$



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VaR through a Risk Factor

Market risk = **Estimated potential loss** under adverse circumstances

VaR = \$ value of the position \times Price volatility of the position (**for other assets**)

\$ Value of the position	Price sensitivity of the position	Potential adverse move (for bonds) in yield
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Details of the RiskMetrics model

- Normal distribution is assumed for market change
- One-day holding period
- 99% confidence level
- Benchmark of market risk management



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Basic Methodology and Process

- Calculating DEAR figures for **each** of the business lines (risk factors) – **Standalone** risk
 - Fixed-income securities
 - Foreign Exchange (FX)
 - Equity
 - ...
- Portfolio **Aggregation** – Portfolio Risk
 - Different trading positions aggregated
 - Different risk factors aggregated
 - Correlation effect considered



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1. Market Risk of Fixed-Income Securities

\$ value price Potential
VaR = of the \times sensitivity of \times adverse move
 position the position in yield

This is equivalent to: $dP = P \times \left(-\frac{D}{1+r} \right) \times dr$

- P: bond price or the dollar value of the position
- D: duration of a bond
 - Duration is a measure of the sensitivity of the price of a bond or other debt instrument to a change in interest rates.
- $-D/(1+r)$: price sensitivity of the position per unit of interest rate change (modified duration)
- dr: change in interest rate



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$$dP = P \times \left(-\frac{D}{1+r}\right) \times dr$$

The price change of the bond (dP) is caused by dr.

VaR here is about the change in market interest rate

D is the duration of the bond; P and r are the price and yield of the bond.

1. An increase in interest rate leads to a lower price
2. We try to figure out the price decline when interest rate is abnormally high

The above expression is equivalent to DEAR:

Dollar value of position × price sensitivity × potential adverse move in yield



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Example:

Suppose a bank has a \$1 million market value position in zero-coupon bonds of 7 years to maturity with a face value of \$1,631,483. Today's yield on these bonds is **7.243%** per annum. (suppose compounded annually)

$$dP = P \times \left(-\frac{D}{1+r} \right) \times dr$$

1. An increase in interest rate leads to a lower price
2. We try to figure out the price decline when interest rate is abnormally high

Note: $1,631,483 / 1.07243^7 = \1 million



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Defining Extreme Negative Change

- Define **bad yield changes** such that there is only a **1 percent** chance that yield changes will exceed this amount in either direction
- A yield increase
- **Assume** bond yield changes follow a normal distribution
 - **Mean 0**
 - **Standard deviation is 10 bps**



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Percentile Values for the Normal Distribution

- If X (loss) is normally distributed with
 - mean = m
 - standard deviation = s
- Then
 - Probability ($X > m + 1.645 s$) = 0.05
 - Probability ($X > m + 1.96 s$) = 0.025
 - Probability ($X > m + 2.330 s$) = 0.01
 - Under the normal distribution, there is a 1% chance that the interest rate increases more than $2.33 \times 10\text{bp} = 23.3 \text{ bp}$



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DEAR for Bond Value

$$dP = P \times \left(-\frac{D}{1+r} \right) \times dr$$

A negative price change means a loss to the bond:

- For the 7-year zero coupon bond,

$$\begin{aligned}\text{DEAR} &= \text{Dollar value of position} \times \text{price sensitivity} \times \text{potential adverse move in yield} \\ &= \$1,000,000 \times (-7/1.07243) \times 0.00233 \\ &= -\$15,210\end{aligned}$$

- On average, in 99 trading days out of 100, the loss on this position will not exceed \$15,210 over a one-day horizon.



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VAR for N days of the Bond Holding

- The variance for yield changes over N days = $N s^2$
 - Daily yield changes are independent from other
- The standard deviation for yield change over N days = \sqrt{Ns}
- To calculate the potential loss for more than one day:
Market value at risk (VAR) = DEAR $\times \sqrt{N}$
- Example:
For a **10-day period**, $VAR = \$15,210 \times \sqrt{10} = \$48,098$
- At 1% VaR, the firm may lose \$48,098 in 10 days



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2. Market Risk of Foreign Exchange

Suppose the bank has a €800,000 (Euro) trading position in spot market. If the exchange rate is $\text{€}1 = \$1.25$ then:

- Dollar amount of position = $800,000 \times 1.25 = \$1 \text{ mil.}$

Suppose that the daily changes in the $\$/\text{€}$ exchange rate over the past year have a mean 0 and standard deviation (s) 0.00565, then:

- 99% of time, adverse moves of the exchange rate will not exceed 2.33 s, i.e., $0.0131645 (=2.33 \times 0.00565)$
- Thus, DEAR = \$1 million $\times 0.0131645 = \$13,164.$



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3. Market Risk of Equities

Suppose the bank holds a \$1 million trading position in stocks that reflect a U.S. stock market index (e.g., the Wilshire 5000). So here $\beta=1$.

Suppose that the daily changes in U.S. stock market returns have a mean 0 and standard deviation 2%, then 99% of time, downward moves of stock returns will not exceed 2.33 s (i.e., 0.0466) over a one-day horizon.

- $\text{DEAR} = \$1,000,000 \times 0.0466 = \$46,600$



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Market Risk of Equities

- What is the DEAR if the a bank holds a \$1 million equity portfolio with $\beta = 1.25$?
- $\text{DEAR} = \$1,000,000 \times 1.25 \times 2.33 \times 0.02 = \$58,250$



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Aggregating DEAR Estimates

- **Cannot simply sum up individual DEARs.**
- In order to aggregate the DEARs from individual exposures we require the correlation matrix.

	7-year zero	\$/Euro €	U.S. Stock index
7-year zero	-----	-0.2	0.4
\$/Euro €		-----	0.1
U.S. stock index			-----

- FX is for foreign exchanges
 - $\text{Corr}(\text{zero}, \text{FX}) = -0.2$
 - $\text{Corr}(\text{zero}, \text{index}) = 0.4$
 - $\text{Corr}(\text{FX}, \text{index}) = 0.1$



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Calculation

- From previous examples, we already know that the daily earning at risk (DEAR) for zero-coupon bonds is \$15,210, DEAR for FX is \$13,164, DEAR for stocks (if $\beta = 1$) is \$46,600.
- Then three-asset case:
- $$\text{DEAR portfolio} = [\text{DEAR}_a^2 + \text{DEAR}_b^2 + \text{DEAR}_c^2 + 2r_{ab} \times \text{DEAR}_a \times \text{DEAR}_b + 2r_{ac} \times \text{DEAR}_a \times \text{DEAR}_c + 2r_{bc} \times \text{DEAR}_b \times \text{DEAR}_c]^{1/2}$$
$$= [15,210^2 + 13,164^2 + 46,600^2 + 2 \times (-0.2) \times 15,210 \times 13,164 + 2 \times 0.4 \times 15,210 \times 46,600 + 2 \times 0.1 \times 13,164 \times 46,600]^{1/2}$$
$$= \$56,443$$



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Criticisms and Shortcomings of RiskMetrics

There are events that assumption of a **symmetric normal distribution** for all asset returns. For some assets, such as options and short-term securities (bonds), this is highly questionable.



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Other market risk measures:

i) Historic or Back Simulation

- Basic idea: Revalue portfolio based on actual prices (returns) on the assets that existed yesterday, the day before that, etc. (usually previous 500 days)
- Then calculate 1% worst-case (5th lowest value of 500 days) outcomes
- Only 1% of the outcomes were lower



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Example: VaR of historical distribution

Probability	A	Probability	B
50%	\$ 100 m	50%	\$ 100m
49%	\$ 80 m	49%	\$ 92m
1%	\$-920 m	0.25%	\$ -920m
		0.75%	\$-1704m

What are VaRs of the two distributions at 1% level?

- \$920m



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ii) Monte Carlo Simulation VaR

To overcome problem of limited number of observations, synthesize additional observations

- Perhaps 10,000 synthetic observations

Employ historic correlations and the random number generator to synthesize observations

Order the synthetic data and calculate VaR

- VAR at the 1 percent confidence level is the 100th worst simulated loss out of 10,000 observations



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Criticisms on VaR

- It does not say **how much a position can lose** on the exceptional hundredth case (Beyond VaR).
- There **isn't enough uniformity** in VAR systems, so the numbers are not comparable between institutions.
- From January 2013, regulators have replaced VaR with the **expected shortfall** measure as the main measure of market risk.

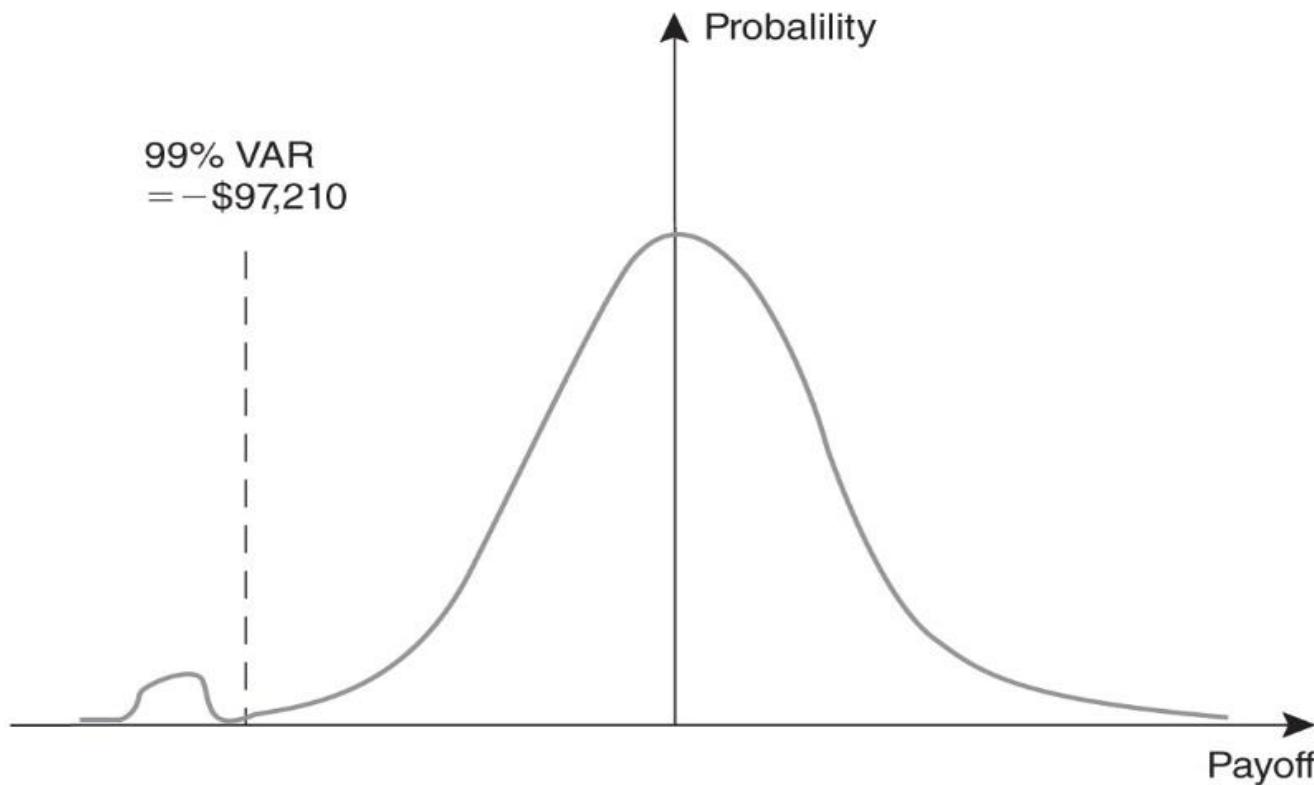


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iii) Expected Shortfall

- Expected Shortfall = Conditional VAR = Expected Tail Loss
- Average of the losses in the tail of the distribution beyond the 99th percentile

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Example: Expected Shortfall

Probability	A	Probability	B
50%	\$ 100 m	50%	\$ 100m
49%	\$ 80 m	49%	\$ 92m
1%	\$-920 m	0.25%	\$ -920m
		0.75%	\$-1704m

What are expected shortfall of the two distributions at 1% level?

$$ES(A) = -920m$$

$$\begin{aligned} ES(B) &= 0.25*(-920) + 0.75*(-1,704) \\ &= -1,508m \end{aligned}$$



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iv) Market Risk Regulations Under Basel III

- Partial risk factor approach
 - 5 risk classes
 - 20 asset buckets
 - Risk weights
 - Obtain capital requirement across different buckets
- Fuller risk factor approach
 - Replace risk classes using risk factors
- Large bank internal models (**following BIS requirements**)
 - Adverse change in rates in 99% percentile
 - Minimum holding period of 10 days
 - Include a “stress” VaR – 10-day, 99% percentile VaR with model inputs incorporating historical data from a one-year period of significant financial stress



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