

## Lesson 4.1 Exercises: Measuring Market Risk

### Module 4: The Risk Problem

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Digital Finance — BSc Course

## Exercise 1: VaR from Sorted Returns

**Scenario:** You manage a CHF 500,000 equity portfolio. Over the past 200 trading days, you recorded daily returns. The 10 worst daily returns (sorted) are:

Rank (worst)	Daily Return
1st	-4.8%
2nd	-3.9%
3rd	-3.4%
4th	-3.1%
5th	-2.7%
6th	-2.4%
7th	-2.2%
8th	-2.0%
9th	-1.8%
10th	-1.6%

### Tasks:

- What is the 95% daily VaR as a percentage? (Hint: 5% of 200 = ?)
- Convert this to a CHF amount for the CHF 500,000 portfolio.
- What is the 95% Expected Shortfall (ES) as a percentage?
- In one sentence, explain what the ES number tells you that VaR does not.

*Difficulty: Introductory — tests the “sort and count” intuition.*

## Exercise 2: Monte Carlo — The Coin-Flip Risk Game

**Scenario:** You play a coin-flip game 10 times. Each flip:

- Heads (50%): you **win CHF 120**
- Tails (50%): you **lose CHF 100**

**Tasks:**

- What is the **expected profit** from playing 10 rounds? Show the calculation.
- A friend says “positive expected value means I cannot lose money.” Explain why this is wrong.
- You simulate 8 players, each playing 10 rounds. Their total profits/losses are: +CHF 340, –CHF 80, +CHF 120, –CHF 420, +CHF 560, –CHF 200, +CHF 240, –CHF 300. Sort these from worst to best and estimate the “87.5% VaR” of this game. (Hint: 1 out of 8 = 12.5%.)
- Why would 10,000 simulated players give a more reliable VaR estimate than 8 players?

*Difficulty: Introductory–Intermediate — builds Monte Carlo intuition from scratch.*

## Exercise 3: Three Roads to VaR

**Scenario:** A portfolio has the following characteristics based on 500 days of historical data:

- Mean daily return: +0.03%
- Daily standard deviation: 1.4%
- The 25th worst historical return: -3.1%

**Tasks:**

- Calculate the 95% VaR using the **variance-covariance method**. (Use:  $VaR \approx -(mean - 1.65 \times \sigma)$ .)
- What is the 95% VaR using **historical simulation**? (Hint: 5% of 500 = ?)
- The two answers differ. Give one reason **why** the methods produce different results.
- Which method would you trust more if the return data has fat tails? Justify your answer.

*Difficulty: Intermediate — requires applying and comparing two methods.*

## Exercise 4: Diversification in Action

**Scenario:** You consider two assets for a portfolio:

	Stock A	Stock B
Expected annual return	8%	12%
Annual volatility	15%	25%

The correlation between A and B is  $\rho = 0.2$ .

**Tasks:**

- Calculate the portfolio expected return if you invest 60% in A and 40% in B.
- Calculate the portfolio volatility using  $\sigma_p = \sqrt{w_A^2\sigma_A^2 + w_B^2\sigma_B^2 + 2w_Aw_B\rho\sigma_A\sigma_B}$ .
- Compare the portfolio volatility to the weighted average of the two volatilities ( $0.6 \times 15\% + 0.4 \times 25\%$ ). By how many percentage points did diversification reduce risk?
- Recalculate the portfolio volatility if  $\rho = 1.0$ . What happens to the diversification benefit?

*Difficulty: Intermediate — requires the portfolio variance formula.*

## Exercise 5: Why the Bell Curve Lies

**Scenario:** Under a normal distribution, a return of  $-3\sigma$  or worse should occur with probability 0.13% (about once in 740 trading days, or roughly once every 3 years).

You examine 20 years of daily stock index data (approximately 5,040 trading days) and find **28 days** with returns worse than  $-3\sigma$ .

### Tasks:

- Under the normal distribution, how many  $-3\sigma$  events would you **expect** in 5,040 days?
- How many times more frequently did extreme losses actually occur compared to the normal prediction?
- Explain in 2–3 sentences what “fat tails” means and why this matters for risk management.
- A colleague says: “We should just ignore outliers — they are rare anomalies.” Write a one-paragraph response explaining why this is dangerous.

*Difficulty: Intermediate — requires reasoning about distributional assumptions.*

## Exercise 6: Rolling vs EWMA Volatility

**Scenario:** You observe the following 5 daily returns for a stock: +0.5%, -0.3%, +0.8%, -3.5% (shock!), +0.2%.

### Tasks:

- a Calculate the **simple standard deviation** of all 5 returns. (Treat the mean as 0 for simplicity.)
- b Now calculate the standard deviation using only the **last 3 returns** (rolling window of 3). How does it differ from (a)?
- c In qualitative terms (no calculation needed), would an EWMA estimate ( $\lambda = 0.94$ ) after these 5 days be **closer to** the rolling-3 estimate or the full-sample estimate? Why?
- d Why do risk managers prefer EWMA or GARCH over simple rolling windows in practice?

*Difficulty: Intermediate — combines computation with conceptual reasoning.*

## Exercise 7: When Diversification Fails

**Scenario:** A fund holds 50% stocks and 50% corporate bonds. In normal times, the correlation between stocks and corporate bonds is  $\rho = 0.30$ . During a financial crisis, the correlation jumps to  $\rho = 0.85$ . Both assets have an annual volatility of 18%.

### Tasks:

- a) Calculate the portfolio volatility in normal times ( $\rho = 0.30$ ).
- b) Calculate the portfolio volatility during the crisis ( $\rho = 0.85$ ).
- c) By what percentage did portfolio risk increase from normal times to the crisis?
- d) A risk model estimated the portfolio's VaR using normal-time correlations. Was this VaR estimate too high, too low, or correct during the crisis? Explain.
- e) Name one asset class that historically maintained a **low or negative** correlation with stocks during crises. Why is this valuable?

*Difficulty: Advanced — requires portfolio math and qualitative analysis.*

## Exercise 8: Comprehensive Case — Startup Risk Report

**Scenario:** You are a risk analyst at a fintech startup that manages CHF 10 million in client assets across a simple portfolio: 70% stocks (annual vol 16%), 30% bonds (annual vol 6%), correlation =  $-0.10$ .

### Tasks:

- a Calculate the portfolio's annual volatility.
- b Convert to daily volatility (divide by  $\sqrt{252}$ ).
- c Estimate the 95% daily VaR in CHF using the variance-covariance method ( $\text{VaR} \approx 1.65 \times \sigma_{\text{daily}} \times \text{portfolio value}$ ).
- d Your CTO asks: "What is the worst-case daily loss?" Explain why VaR does **not** answer this question and suggest a complementary measure.
- e Write a 3-sentence "risk summary" for the startup's board, using plain language (no jargon). Include the VaR number, its meaning, and one key caveat.

*Difficulty: Advanced–Integrative — combines all lesson concepts into a realistic scenario.*

## Exercise 1:

- (a) 5% of 200 = 10. The 10th worst return is the 95% VaR =  $-1.6\%$ .
- (b)  $\text{CHF } 500,000 \times 1.6\% = \text{CHF } 8,000$ .
- (c) ES = average of the 10 worst:  $(4.8 + 3.9 + 3.4 + 3.1 + 2.7 + 2.4 + 2.2 + 2.0 + 1.8 + 1.6)/10 = 27.9/10 = -2.79\%$ .
- (d) ES tells you the *average* severity of losses on the worst 5% of days, not just the boundary.

## Exercise 2:

- (a) Expected profit per flip =  $0.5 \times 120 + 0.5 \times (-100) = +10$ . Over 10 rounds: **+CHF 100**.
- (b) Expected value is the *average* over many repetitions. In any single sequence of 10 flips, you can get unlucky and lose money. Variance creates a range of outcomes.
- (c) Sorted:  $-420, -300, -200, -80, +120, +240, +340, +560$ . The 1st worst out of 8 (12.5%) gives 87.5% VaR = **-CHF 420**. (With only 8 observations, this is imprecise.)
- (d) More simulations reduce sampling error. 10,000 paths give a much smoother distribution and more reliable percentile estimates.

## Exercise 3:

- (a)  $\text{VaR} = -(0.03\% - 1.65 \times 1.4\%) = -(-2.28\%) = \text{2.28\%}$ .
- (b) 5% of 500 = 25. The 25th worst =  $-3.1\%$ , so historical VaR =  $3.1\%$ .
- (c) The variance-covariance method assumes normally distributed returns. If the actual distribution has fatter tails, the 5th percentile will be more extreme than the normal approximation.
- (d) Historical simulation, because it uses actual data without assuming a normal shape. Fat-tailed data will naturally produce a larger VaR.

## Answer Key (continued)

### Exercise 4:

- (a)  $E[R_p] = 0.6 \times 8\% + 0.4 \times 12\% = 4.8\% + 4.8\% = \mathbf{9.6\%}$ .
- (b)  $\sigma_p = \sqrt{0.6^2 \times 0.15^2 + 0.4^2 \times 0.25^2 + 2 \times 0.6 \times 0.4 \times 0.2 \times 0.15 \times 0.25} = \sqrt{0.0081 + 0.01 + 0.0036} = \sqrt{0.0217} = \mathbf{14.73\%}$ .
- (c) Weighted average =  $0.6 \times 15\% + 0.4 \times 25\% = 19\%$ . Diversification saved  $19\% - 14.73\% = \mathbf{4.27 \text{ percentage points}}$ .
- (d) If  $\rho = 1.0$ :  $\sigma_p = \sqrt{0.0081 + 0.01 + 0.018} = \sqrt{0.0361} = 19.0\%$ . No diversification benefit — portfolio vol equals weighted average.

### Exercise 5:

- (a) Expected =  $5,040 \times 0.0013 \approx \mathbf{6.6 \text{ events}}$ .
- (b) Actual / expected =  $28/6.6 \approx \mathbf{4.2 \text{ times more often}}$ .
- (c) Fat tails mean the probability of extreme returns is much higher than predicted by a normal distribution. This matters because risk models using normal assumptions systematically underestimate the frequency and severity of crashes.

### Exercise 6:

- (a) Returns: 0.5, -0.3, 0.8, -3.5, 0.2 (%). Assuming mean = 0:  $\sigma = \sqrt{(0.25 + 0.09 + 0.64 + 12.25 + 0.04)/5} = \sqrt{2.654} = \mathbf{1.63\%}$ .
- (b) Last 3: 0.8, -3.5, 0.2.  $\sigma = \sqrt{(0.64 + 12.25 + 0.04)/3} = \sqrt{4.31} = \mathbf{2.08\%}$ . Higher because the shock is a larger proportion.
- (c) Closer to rolling-3 because EWMA places more weight on the recent shock (-3.5%), amplifying its effect relative to the full-sample estimate.

## Answer Key (continued)

### Exercise 7:

- (a)  $\sigma_p = \sqrt{0.5^2 \times 0.18^2 + 0.5^2 \times 0.18^2 + 2 \times 0.5 \times 0.5 \times 0.30 \times 0.18 \times 0.18} = \sqrt{0.0081 + 0.0081 + 0.00486} = \sqrt{0.02106} = \mathbf{14.51\%}$ .
- (b)  $\sigma_p = \sqrt{0.0081 + 0.0081 + 2 \times 0.25 \times 0.85 \times 0.0324} = \sqrt{0.0081 + 0.0081 + 0.01377} = \sqrt{0.02997} = \mathbf{17.31\%}$ .
- (c) Increase =  $(17.31 - 14.51)/14.51 = \mathbf{19.3\%}$  increase in portfolio risk.
- (d) Too low. The model assumed  $\rho = 0.30$ , giving lower portfolio vol. The actual crisis correlation of 0.85 meant less diversification, so true risk was higher than modeled.
- (e) Government bonds (especially U.S. Treasuries) historically maintained negative or low correlation with stocks during crises (flight to safety). This makes them valuable as a hedge.

### Exercise 8:

- (a)  $\sigma_p = \sqrt{0.7^2 \times 0.16^2 + 0.3^2 \times 0.06^2 + 2 \times 0.7 \times 0.3 \times (-0.10) \times 0.16 \times 0.06} = \sqrt{0.012544 + 0.000324 - 0.000403} = \sqrt{0.012465} = \mathbf{11.16\%}$ .
- (b) Daily vol =  $11.16\% / \sqrt{252} = 11.16\% / 15.87 = \mathbf{0.703\%}$ .
- (c) VaR =  $1.65 \times 0.703\% \times 10,000,000 = \mathbf{CHF 116,000}$  (approx.).
- (d) VaR does not give the worst-case loss; it gives the loss exceeded only 5% of the time. Expected Shortfall measures the average loss on those worst 5% days, providing more information about tail severity.
- (e) "On 95% of trading days, we expect client portfolios to lose no more than approximately CHF 116,000. This means on about 1 in 20 trading days, losses could exceed this amount. This estimate assumes recent market conditions continue — in a severe crisis, actual losses could be significantly larger."