

## Portfolio Issues

### Module 14.2 Return Attribution

## Overview

- Performance attribution – focus on decomposing managerial performance
  - Alpha = Managed return – Benchmark return
  - EV change = Asset change – Liability change
- Return attribution – allocate alpha to various managerial decision
- Risk attribution – allocate excess return variance to various managerial decisions



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## Return Attribution

- Return attribution decomposes the total excess return into a variety of statistics including excess return by stock, sector, sector allocation decision, security selection decision, and interaction
  - Numerous applications
  - Aid in investment decision-making



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## Basic Identities

- Value of managed and benchmark portfolios

$$\Pi_{M,t} = \sum_{j=1}^{N_M} N_{M,j,t} P_{j,t} \quad \Pi_{B,t} = \sum_{j=1}^{N_B} N_{B,j,t} P_{j,t}$$

N–number of shares, P–price, n–unique shares

- Return on managed and benchmark portfolios

$$\tilde{R}_{M,t} = \sum_{j=1}^{N_M} w_{M,j,t} \tilde{R}_{j,t} \quad \tilde{R}_{B,t} = \sum_{j=1}^{N_B} w_{B,j,t} \tilde{R}_{j,t}$$

w–weight, R–discretely compounded, periodic return

$$w_{M,j,t} = \frac{N_{M,j,t} P_{M,j,t}}{\sum_{j=1}^{N_M} N_{M,j,t} P_{M,j,t}} \quad w_{B,j,t} = \frac{N_{B,j,t} P_{B,j,t}}{\sum_{j=1}^{N_B} N_{B,j,t} P_{B,j,t}} \quad \tilde{R}_{j,t} = \frac{P_{j,t+1}}{P_{j,t}} - 1$$



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## Return Attribution Example

Figure 14.2.1. Inputs for return attribution

	A	B	C	D	E
1 Performance Attribution					
2 Asset Allocation					
3					
4					
5		Weights	Return	Weights	Return
6 Stocks		60.00%	6.00%	70.00%	7.00%
7 Bonds		40.00%	3.00%	25.00%	2.50%
8 Cash		0.00%	1.00%	5.00%	1.20%
9 Total Weights		100.00%		100.00%	
10 Return			4.8000%		5.5850%
11 Excess Return					0.7850%



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## Return Attribution Example

Figure 14.2.2. Return attribution analysis

	A	B	C	D	E	F	G	H
1 Performance Attribution								
2 Asset Allocation								
3								
4								
5		Weights	Return	Weights	Return	SAD	SSD	Interaction
6 Stocks		60.00%	6.00%	70.00%	7.00%	0.6000%	0.6000%	0.1000%
7 Bonds		40.00%	3.00%	25.00%	2.50%	-0.4500%	-0.2000%	0.0750%
8 Cash		0.00%	1.00%	5.00%	1.20%	0.0500%	0.0000%	0.0100%
9 Total Weights		100.00%		100.00%				
10 Return			4.8000%		5.5850%	0.2000%	0.4000%	0.1850%
11 Excess Return					0.7850%			0.7850%

SAD – sector allocation decision  
SSD – security selection decision



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## Excess Return

- Excess return:  $ER_t = \tilde{R}_{M,t} - \tilde{R}_{B,t} = \sum_{j=1}^{n_M} w_{M,j,t} \tilde{R}_{j,t} - \sum_{j=1}^{n_B} w_{B,j,t} \tilde{R}_{j,t}$
- Excess return decomposed:  

$$ER_t = SAD_t + SSD_t + I_t = \sum_{k=1}^K (SAW_{M,k,t} - SAW_{B,k,t}) \tilde{R}_{B,k,t}$$

$$+ \sum_{k=1}^K SAW_{B,k,t} (\tilde{R}_{M,k,t} - \tilde{R}_{B,k,t}) + \sum_{k=1}^K (SAW_{M,k,t} - SAW_{B,k,t}) (\tilde{R}_{M,k,t} - \tilde{R}_{B,k,t})$$

$$= \sum_{k=1}^K SAW_{M,k,t} \tilde{R}_{M,k,t} - SAW_{B,k,t} \tilde{R}_{B,k,t}$$



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## Raw Attribution

- Excess sector allocation weights (EW)

$$EW_{k,t} = (SAW_{M,k,t} - SAW_{B,k,t}); t, k$$

- t – period of time; k – sector
- M – manager; B – benchmark
- SAW – sector allocation weight

	SAW(B)	SAW(M)	EW
Stocks	60.00%	70.00%	10.00%
Bonds	40.00%	25.00%	-15.00%
Cash	0.00%	5.00%	5.00%
Total Weights	100.00%	100.00%	0.00%



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## Sector Allocation Weights

- SAW:  $SAW_{M,k,t} = \sum_{j=1}^{n_M} w_{M,j,t} I_{Sector_k}(j)$   $SAW_{B,k,t} = \sum_{j=1}^{n_B} w_{B,j,t} I_{Sector_k}(j)$
- Indicator function:  $I_{Sector_k}(j) = 1$  if in sector else 0
- Identities:  $1.0 = \sum_{k=1}^K SAW_{M,k,t}$   $1.0 = \sum_{k=1}^K SAW_{B,k,t}$
- Weighted average return for each sector

$$\tilde{R}_{M,k,t} = \sum_{j=1}^{n_M} \left( \frac{w_{M,j,t}}{SAW_{M,k,t}} \right) \tilde{R}_{j,t} I_{Sector_k}(j) \quad \tilde{R}_{B,k,t} = \sum_{j=1}^{n_B} \left( \frac{w_{B,j,t}}{SAW_{B,k,t}} \right) \tilde{R}_{j,t} I_{Sector_k}(j)$$



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## Excess Return Attribution

- Excess sector return (ER)  

$$ER_{k,t} = (\tilde{R}_{M,k,t} - \tilde{R}_{B,k,t}); t, k$$
- Sector allocation decision (SAD)  

$$SAD_{k,t} = (SAW_{M,k,t} - SAW_{B,k,t}) \tilde{R}_{B,k,t}$$
- Security selection decision (SSD)  

$$SSD_{k,t} = SAW_{B,k,t} (\tilde{R}_{M,k,t} - \tilde{R}_{B,k,t})$$
- Interaction (I)  

$$I_{k,t} = (SAW_{M,k,t} - SAW_{B,k,t}) (\tilde{R}_{M,k,t} - \tilde{R}_{B,k,t})$$



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## Time Series Problem

Excess return is only additive across time (t) when forced with a time series adjustment term. The decomposition terms (sector allocation decision SAD, security selection decision SSD, and interaction I) are additive across sectors (k) at a point in time:

$$ER = SAD + SSD + I + I_{TS} = \sum_{t=1}^T ER_t = \sum_{t=1}^T SAD_t + \sum_{t=1}^T SSD_t + \sum_{t=1}^T I_t + I_{TS},$$

where

$$SAD_t = \sum_{k=1}^K SAD_{k,t},$$

$$SSD_t = \sum_{k=1}^K SSD_{k,t}, \text{ and}$$

$$I_t = \sum_{k=1}^K I_{k,t}.$$



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## Time Series Solution

We define the time series adjustment term as simply a plug figure to account for the non-additivity of the decomposition process or

$$I_{TS} = ER - SAD - SSD - I = \sum_{t=1}^T ER_t - \sum_{t=1}^T SAD_t - \sum_{t=1}^T SSD_t - \sum_{t=1}^T I_t.$$

Hence for each measurement period (e.g., a quarter), reported statistics include excess return (by subperiods and by sectors) and allocation decisions (also by subperiods and by sectors).

$$ER_t = SAD_t + SSD_t + I_t = \sum_{k=1}^K (SAW_{M,k,t} - SAW_{B,k,t}) \tilde{R}_{B,k,t}$$

$$+ \sum_{k=1}^K SAW_{B,k,t} (\tilde{R}_{M,k,t} - \tilde{R}_{B,k,t}) + \sum_{k=1}^K (SAW_{M,k,t} - SAW_{B,k,t}) (\tilde{R}_{M,k,t} - \tilde{R}_{B,k,t})$$

$$= \sum_{k=1}^K SAW_{M,k,t} \tilde{R}_{M,k,t} - \sum_{k=1}^K SAW_{B,k,t} \tilde{R}_{B,k,t}$$



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## Return Identities

$$\begin{aligned}\tilde{R}_M &= \sum_{j=1}^{n_M} w_{M,j} \tilde{R}_j = \sum_{k=1}^K \text{SAR}_{M,k} = \sum_{k=1}^K \text{SAW}_{M,k} \tilde{R}_{M,k} && \text{return on managed portfolio} \\ \text{SAR}_{M,k} &= \text{SAW}_{M,k} \tilde{R}_{M,k} && \text{managed, weight-adjusted, sector allocation return} \\ \tilde{R}_B &= \sum_{j=1}^{n_B} w_{B,j} \tilde{R}_j = \sum_{k=1}^K \text{SAR}_{B,k} = \sum_{k=1}^K \text{SAW}_{B,k} \tilde{R}_{B,k} && \text{return on benchmark portfolio} \\ \text{SAR}_{B,k} &= \text{SAW}_{B,k} \tilde{R}_{B,k} && \text{benchmark, weight-adjusted, sector allocation return}\end{aligned}$$



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## Summary

- Return attribution decomposes the reported alpha into various managerial decision categories
- Two common categories
  - Sector allocation decision
  - Security selection decision
- Quantitative details explored



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