## Active Risk Attribution Model Specifications

Let's assume we have n securities, in m asset classes, which returns,

$$r_t = \mu + \epsilon_t$$

Where  $\epsilon_t \sim N(0, \Sigma_t)$ 

The tracking error can be calculated as:

$$TE_t^2 = gap_t^T \Sigma_t gap_t$$

With:

 $gap_t$ : vector of active positions (nx1) at time t

 $\Sigma_t$ : covariance matrix at time t

Let's consider a particular time t and ignore the t subindex to simplify the notation.

The total contribution per position can be calculated from:

$$TE = \frac{gap^T \ \Sigma_{nxn} \ gap_{nx1}}{TE}$$

Where:

$$TE = gap \cdot \frac{\sum_{nxn} gap_{nx1}}{TE}$$

And then the total contribution from asset i to the TE will be:

$$TE_{i} = gap_{i} \cdot \left[ \frac{\sum_{nxn} gap_{nx1}}{TE} \right]_{i}$$

For the allocation and selection effects, we consider a similar decomposition.

## **Risk Attribution Components**

Let's suppose at a time t:

$$gap = gap_{alloc} + gap_{select}$$

Then, we can define each component  $gap_{alloc,i}$  as the active position on the security i in the asset class j if the investment in the asset class were exactly in the benchmark proportions. Only a multiplicative effect may appear given that the position in the asset class may be higher or smaller than in the benchmark. Therefore:

$$gap_{alloc,i} = w_{b,i,j} * GAP_j$$

Where,

 $gap_{alloc,i}$ : gap allocation for security i

 $w_{b,i}$ : relative weight of the security i in the benchmark inside the asset class j

 $GAP_i$ : active position of the whole asset class j

The  $gap_{selection} = gap - gap_{allocation}$ 

For example, if we have:

		Portfolio	Benchmark	Port	Bench	Gap	Gap
		position	position	Position w/r to	Position w/r to	Allocation	selection
				the asset	the		
				class	asset		
					class		
Equity	SPY	33%	30%	50%	50%	3%	0%
	EZU	33%	30%	50%	50%	3%	0%
FI	AGG	34%	40%				

		Portfolio	Benchmark	Port	Bench	Gap	Gap
		position	position	Position	Position	Allocatio	selection
				w/r to the	w/r to the	n	
				asset class	asset class		
Equity	SPY	27%	30%	45%	50%	0%	-3%
	EZU	33%	30%	55%	50%	0%	3%
FI	AGG	40%	40%				

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gap_allocation_spy = 50% * 0% = 0%
gap_selection_spy = (27%-30%) - 0% = -3%
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For the allocation and selection effects we separate the effects as follows:

$$TE^{2} = gap^{T} \; \Sigma_{nxn} \; gap_{nx1}$$

$$TE^{2} = (gap_{alloc}^{T} + gap_{selec}^{T}) \; \Sigma_{nxn} \; (gap_{alloc} + gap_{selec}^{T})$$

$$TE^{2} = gap_{alloc}^{T} \; \Sigma_{nxn} \; gap_{alloc}^{T} + gap_{selec}^{T} \; \Sigma_{nxn} \; gap_{selec}^{T} + gap_{alloc}^{T} \; \Sigma_{nxn} \; gap_{selec}^{T} + gap_{selec}^{T} \; \Sigma_{nxn} \; gap_{selec}^{T} + gap_{selec}^{T} \; \Sigma_{nxn} \; gap_{alloc}^{T}$$

$$TE^{2} = TE_{alloc}^{2} \; + \; TE_{select}^{2} \; + \; TE_{interaction}^{2}$$

We want to allocate the interaction in a way that makes sense. When gap\_alllocation is zero in a position, the addition should be zero. When gap\_selection is zero in a position, the addition should be zero.

So, separate the interaction and assign to the TE allocation and selection effects

$$gap_{alloc}^T \Sigma_{nxn} gap_{selec}$$
 +  $gap_{selec}^T \Sigma_{nxn} gap_{alloc}$ 
 $TE_{interaction, allocation lead}$  +  $TE_{interaction, selection lead}$ 

And we apply the first term to TE allocation effect. By dividing by TE we obtain the final definition,

$$TE = \frac{\frac{TE_{alloc}^2 + TE_{interact, allocation lead}^2}{TE} + \frac{\frac{TE_{select}^2 + TE_{interact, selection lead}^2}{TE}$$

Where the first term is the TE allocation component, and the second is the TE selection component t.

$$TE_{Allocation\;effect} = \frac{TE_{alloc}^2 + TE_{interact,\;allocation\;lead}^2}{TF}$$

$$TE_{Selection\;effect} = \frac{TE_{select}^2 \; + \; TE_{interact, \; selection\; lead}^2}{TE}$$

If we come back to a previous equation, we can see the decomposition in a simpler and more natural way, passing on the interaction effect:

$$TE^{2} = (gap_{alloc}^{T} + gap_{selec}^{T}) \; \Sigma_{nxn} \; (gap_{alloc} + gap_{selec})$$
 
$$TE^{2} = gap_{alloc}^{T} \; \Sigma_{nxn} \; (gap_{alloc} + gap_{selec}) + \; gap_{selec}^{T} \; \Sigma_{nxn} \; (gap_{alloc} + gap_{selec})$$

And then, dividing by the total tracking error TE:

$$TE = \frac{gap_{alloc}^{T} \ \Sigma_{nxn} \left( gap_{alloc} + gap_{selec} \right)}{TE} + \frac{gap_{selec}^{T} \ \Sigma_{nxn} \left( gap_{alloc} + gap_{selec} \right)}{TE}$$

We get to the first term as the allocation effect and the second term as the selection effect. The same we found before re-allocating the interaction effect. Given that the interaction effect is widely known in performance attribution, I made my first analysis by recognizing it and deciding a way to assign it in the most appropriate way. But clearly, we get to the same result in the "simpler" approach bypassing it.

## Covariance Matrix Parametrization

Individual covariances are calculated using correlation and volatilities

$$Cov(A, B) = \rho_{A,B}\sigma_A\sigma_B$$

Correlations:

Calculated using weekly returns, to minimize time differences among assets

Volatilities:

Calculated using daily returns

Decay factor:

Applied with a half-life of 40 days (about 2-months). Apply to both, volatilities and correlations

Historical window:

1 year for both, volatilities and correlations