

TA Review (Lecture #2)

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October 9th, 2024



Agenda

- Lecture review (measuring and evaluating performance)
- Hedging and tracking
- Homework / Questions

Lecture Review

Log returns

Let r denote the log-return:

$$r_t \equiv \log(1 + r_t)$$

Log returns are particularly useful when dealing with compounding returns across different time horizons.

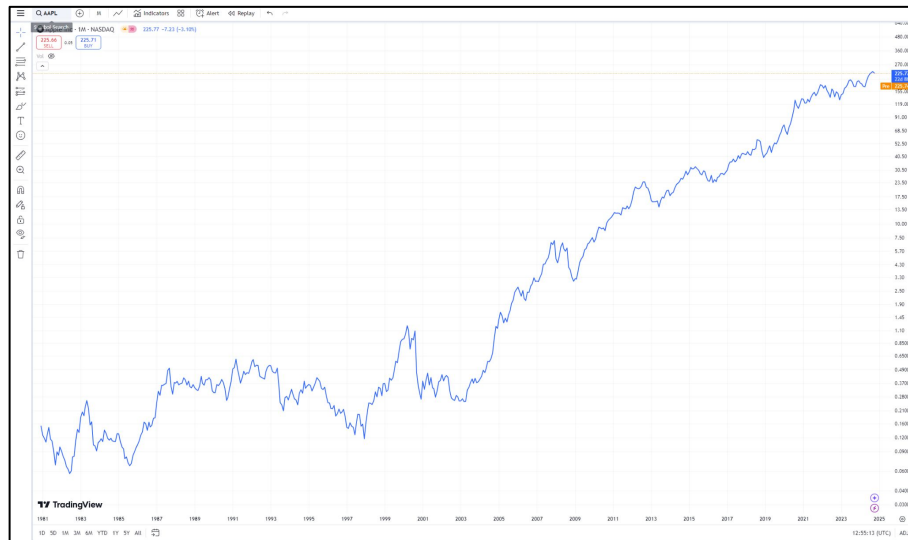
$$r_{t,t+h} \equiv \log(1 + r_{t,t+h}) = \sum_{i=1}^h r_{t+i}$$

Thus, the cumulative return from t to $t + h$ is just the sum of one-period returns.



Why log returns?

- Log returns represent the continuously-compounded return
- Log returns *may* have more friendly distributions when modeled (note that a common assumption is log-normal prices; we live in a GBM world)
- Often times we may look at log prices
- Log returns are additive



Annualizing Returns and Volatility

- Assuming i.i.d log returns:

$$\mathbb{E} [r_{t,t+h}] = h (\mathbb{E} [r_t])$$

$$\text{var} [r_{t,t+h}] = h (\text{var} [r_t])$$

- Are these assumptions reasonable?
- Quoting convention
 - Consider interest rates quoting convention

Skewness is defined as the (scaled) third centralized moment of the distribution:

$$\varsigma = \frac{\mathbb{E} \left[(x - \mu)^3 \right]}{\sigma^3}$$

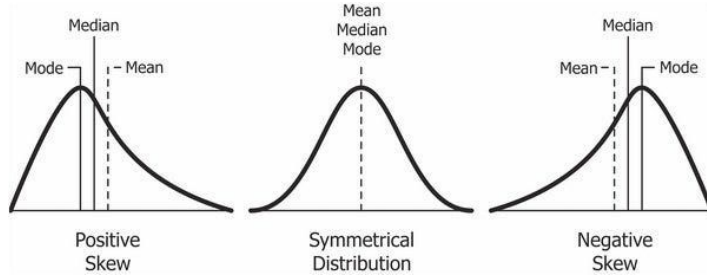
Kurtosis is defined as

$$\kappa = \frac{\mathbb{E} \left[(x - \mu)^4 \right]}{\sigma^4}$$

A normal distribution has kurtosis equal to 3, so *excess kurtosis* refers to $\kappa - 3$.

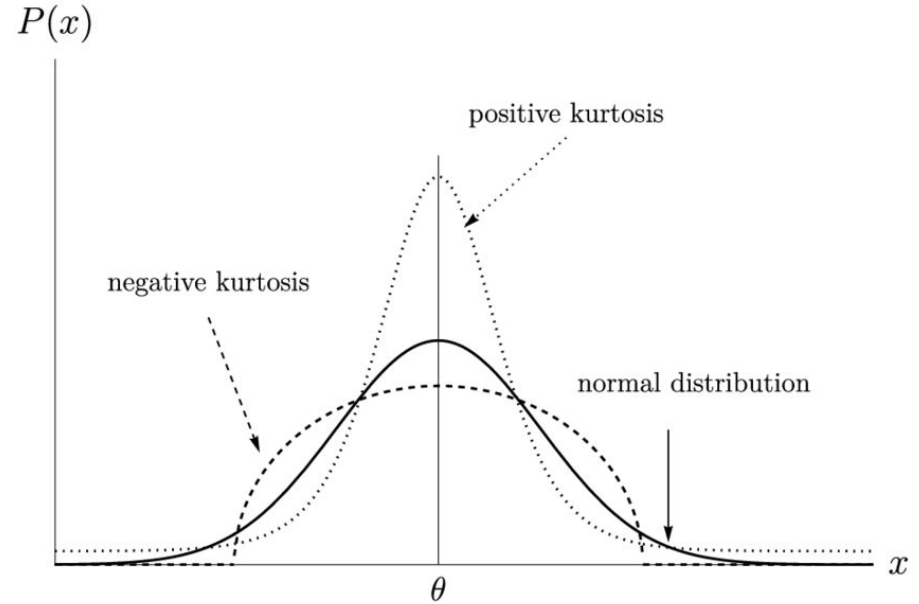


Higher Moments Visualized



Source: Diva Dugar

(<https://codeburst.io/2-important-statistics-terms-you-need-to-know-in-data-science-skewness-and-kurtosis-388fef94eeaa>)



Source: Research Gate

(https://www.researchgate.net/figure/Examples-of-positive-negative-and-zero-excess-kurtosis_fig4_373105776)

Other Distribution Quantifications

- VaR
- CVaR (expected shortfall)
- Maximum drawdown

The VaR expressed as a return rate is then,

$$r_{\pi, \tau}^{\text{VaR}} = F_{\tau}^{r(-1)}(\pi)$$

where F_{τ}^r is the cdf of the return distribution.

The VaR in terms of returns is simply the π quantile of the observed returns.

Note: Think about how the values here relate to our distribution properties (moments, etc.) – what are we trying to measure here?

VaR Estimation

"an airbag that works all the time, except when you have a car accident" – Einhorn

- VaR requires a deep understanding of distribution tails, which are rarely realized
- Estimation considerations:
 - Historical quantile?
 - Fit parameters of an imposed distribution?
 - Monte Carlo?

Factor decomposition of return variation

A **Linear Factor Decomposition (LFD)** of \tilde{r}^i onto the factor \mathbf{x}_t is given by the regression,

$$\tilde{r}_t^i = \alpha + \beta^{i,x} \mathbf{x}_t + \epsilon_t$$

- ▶ The **variation** in returns is decomposed into the **variation** explained by the benchmark, \mathbf{x}_t and by the residual, ϵ_t .
- ▶ These factors, \mathbf{x} , in the LFD should give a high R-squared in the regression if they really explain the **variation** of returns well.



Treynor's measure is an alternative measure of the risk-reward tradeoff. For the return of asset, i ,

$$\text{Treynor Ratio} = \frac{\mathbb{E}[\tilde{r}^i]}{\beta^{i,m}}$$

The **information ratio** refers to the Sharpe Ratio of the non-factor component of the return: $\alpha + \epsilon_t$.

$$\text{IR} = \frac{\alpha}{\sigma_\epsilon}$$

where σ_ϵ and α come from

$$\tilde{r}_t^i = \alpha + \beta^{i,j} \tilde{r}_t^j + \epsilon_t$$

Hedging & Tracking

Net exposure

Investor is long \$1 of i and hedges by selling h \$ of j .

- ▶ Time t net exposure is,

$$\epsilon_t = r_t^i - h r_t^j$$

- ▶ This net exposure after hedging is known as **basis**.
- ▶ A position in i is perfectly hedged over horizon t if $\epsilon_t = 0$ with probability one.



What is a “basis” in industry?

- Broadly speaking, the difference between two (or more) instruments
- The basis is a more meaningful concept when the instruments are correlated
 - Sure, I can talk about the BTC - 3mo. TBill basis, but this is a very broad idea
- Examples:
 - Spot - Future
 - Brent - WTI
- More specifically, it is the risk held after hedging instrument A with instrument B

Basis risk

$$\epsilon_t = r_t^i - h r_t^j$$

Basis risk refers to volatility in ϵ_t , denoted as σ_ϵ .

$$\sigma_\epsilon^2 = \sigma_i^2 + h^2 \sigma_j^2 - 2h \sigma_i \sigma_j \rho_{i,j}$$

- ▶ Denoted as σ_ϵ^2 because basis is the error in the hedge.
- ▶ For $\rho_{i,j} = \pm 1$, the basis risk can be eliminated.



Optimal hedge ratio

The **optimal hedge ratio**, h^* , minimizes basis risk.

$$\begin{aligned} h^* &= \arg \min_h \sigma_\epsilon^2 \\ &= \arg \min_h \{ \sigma_i^2 + h^2 \sigma_j^2 - 2h \sigma_i \sigma_j \rho_{i,j} \} \end{aligned}$$

Solve by taking derivative,

$$h^* = \frac{\sigma_i}{\sigma_j} \rho_{i,j}$$

- ▶ Higher correlation implies larger hedge ratio, h .
- ▶ High relative volatility of i implies larger hedge ratio.
- ▶ With negative correlation, must go long the hedging security.



Basis as a regression residual

From the previous slide, we can write

$$r_t^i = \beta^{i,j} r_t^j + \epsilon_t$$

where

$$\beta^{i,j} = h^*$$

- ▶ The optimal hedge ratio, h^* , is simply a regression beta!
- ▶ Optimized basis risk is simply the regression residual variance.
- ▶ (Thus the notation of using ϵ to denote basis.)



Include an intercept?

In regression for optimal hedge ratio, should we include a constant, (alpha?) Depends on our purpose...

- ▶ Do we want to explain the total return (including the mean) or simply the excess-mean return?
- ▶ In short samples, mean returns may be estimated inaccurately, (whether in r^i or \tilde{r}^i), so we may want to include α (eliminate means) to focus on explaining variation.



Investment with hedging a factor

- ▶ Suppose a hedge fund wants to trade on information regarding a certain asset return, r^i .
- ▶ But does not want the trade to be subject to the overall market factor, r^m .
- ▶ More generally, imagine anyone that wants to trade on the performance of return r^i **relative** to another factor r^j .

This idea of trading on specific information while hedging out broader market movements is the origination of the term, hedge funds.



Building the market-hedged position

A hedge fund would first run the regression

$$\tilde{r}_t^i = \alpha + \beta^{i,m} \tilde{r}_t^m + \epsilon_t$$

- ▶ Then the hedge-fund can go long \tilde{r}^i , while shorting $\beta^{i,m}$ times the overall market.
- ▶ The fund is then holding

$$\tilde{r}_t^i - \beta^{i,m} \tilde{r}_t^m = \alpha + \epsilon_t$$



Properties of the market-hedged position

$$\tilde{r}_t^i - \beta^{i,m} \tilde{r}_t^m = \alpha + \epsilon_t$$

- ▶ This hedged position has mean excess return α ; volatility σ_ϵ .
- ▶ Compared to simply going long \tilde{r}^i , the strategy is no longer subject to the volatility coming from $\beta^{i,m} \tilde{r}_t^m$.
- ▶ This allows the hedge fund to minimize the variance of the **hedged** position.



Tracking portfolios

Regress

$$\tilde{r}_t^i = \alpha + \beta \tilde{r}_t^j + \epsilon_t$$

- ▶ ϵ is known as the **tracking error** of \tilde{r}^i relative to \tilde{r}^j .
- ▶ R-squared measures how well j tracks i .
- ▶ The Information Ratio, α/σ_ϵ , measures the tradeoff between obtaining extra mean return α at the cost of taking on tracking error ϵ from the target portfolio.

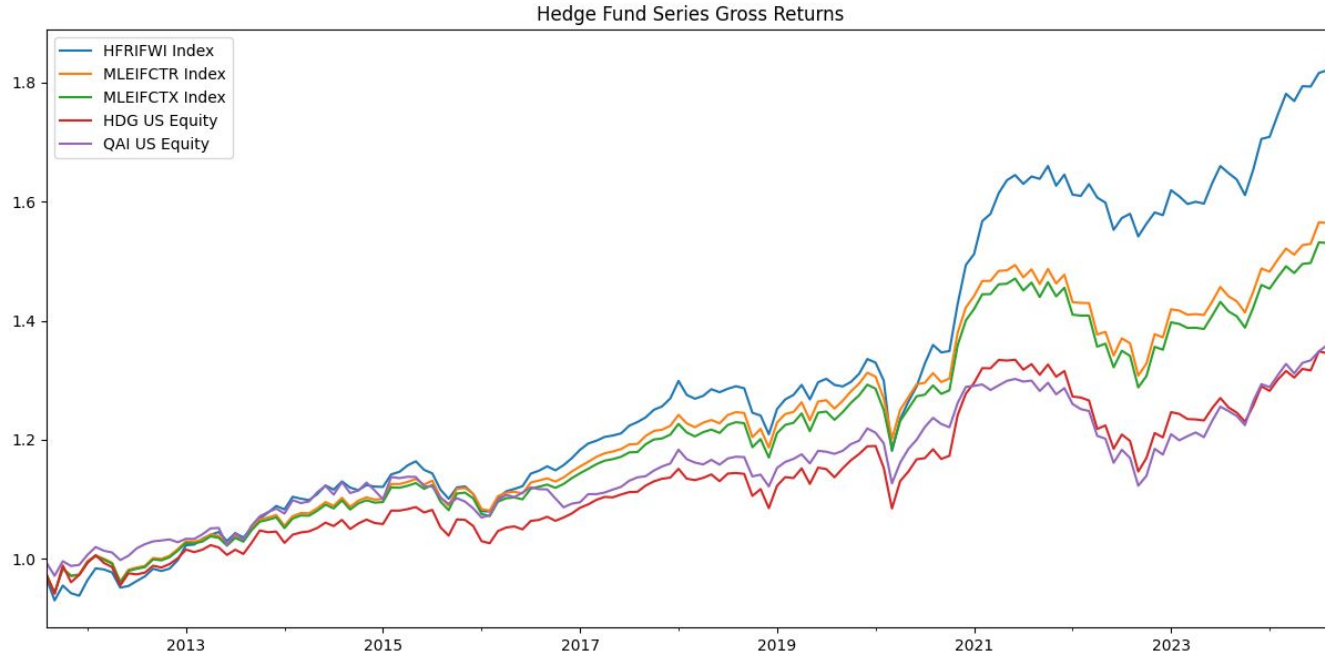
Of course, this is just another way of looking at the hedging problem.



Homework #2

What is HDG?

What is the proposed benefit to HDG?



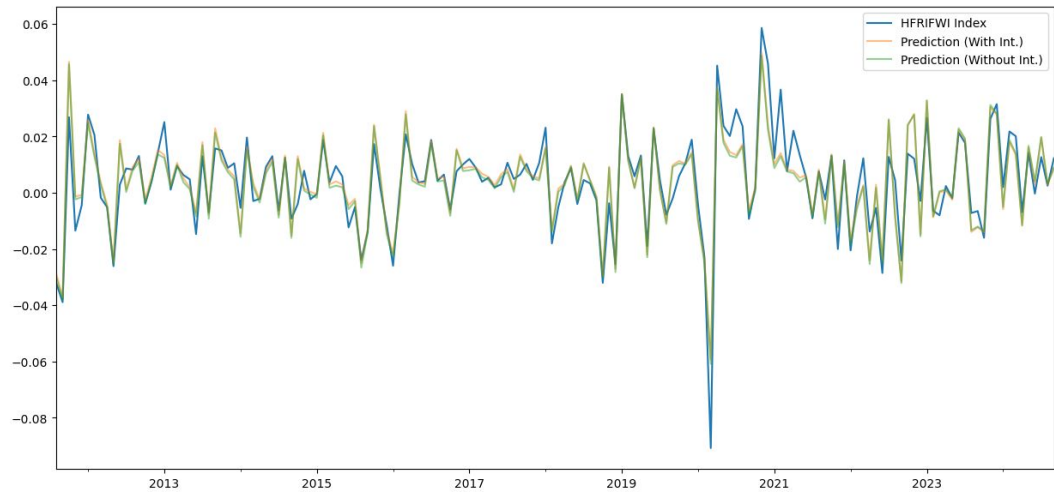
Annualizing Statistics

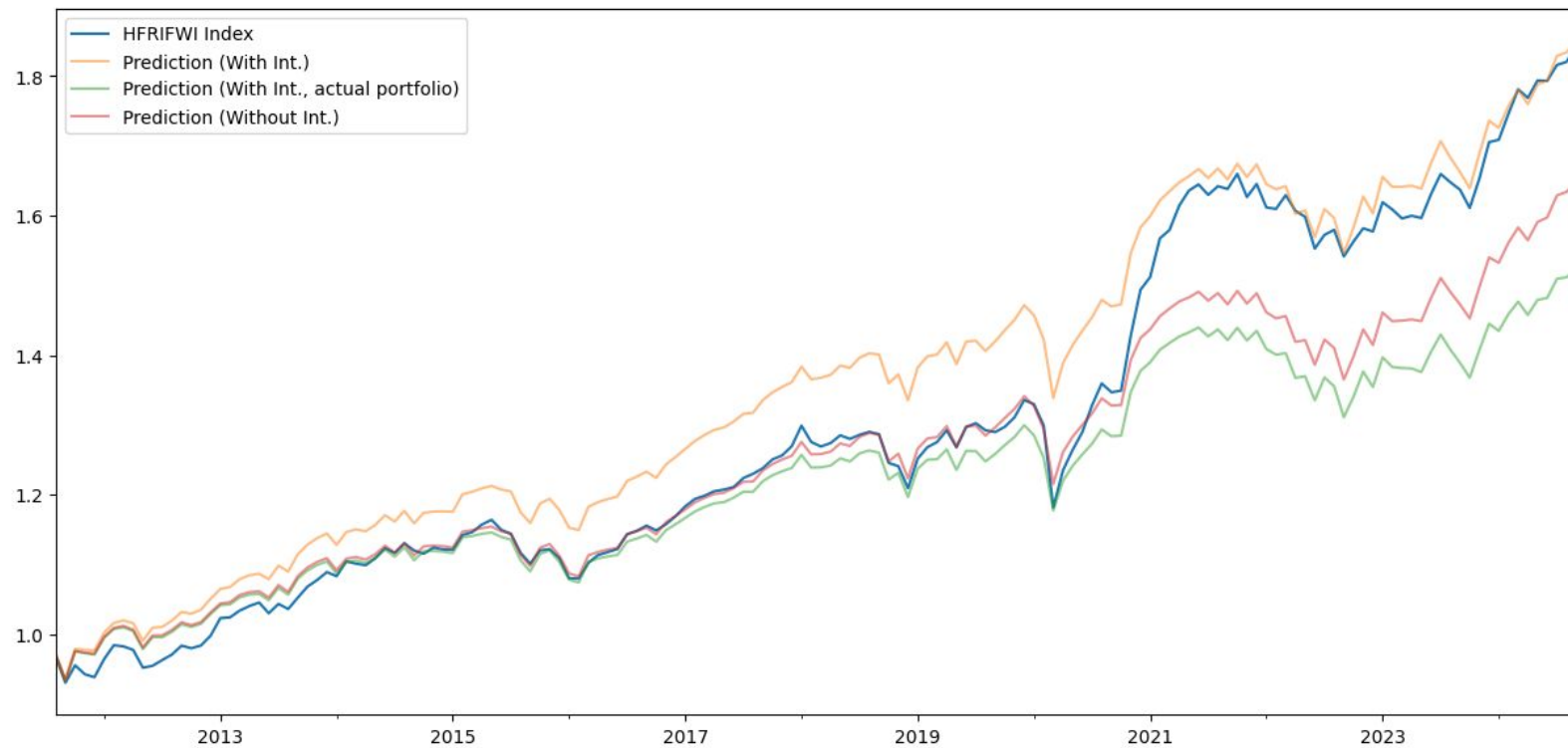
- Treynor
- Information Ratio

The intercept term

- Should we include an intercept term for replication?

$$\tilde{r}_t^i = \alpha + \beta \tilde{r}_t^j + \epsilon_t$$





Questions?