

Predictive Modeling and Fixed Income

Jack Schlosser

- Fixed Income Research
- Hypothesis
- Data Collection
- Model Creation
- Results
- Conclusion/Takeaways

Fixed Income Assets

- Cover a broad selection of assets designed to provide fixed payments over a certain period
- Often derive value from overall market conditions through demand
- Misconception that they are “safe”
- Individual assets priced based on yield vs risk

Types of Fixed-Income Investments



Goal Use various methods of predictive modeling to generate alpha through analysis of fixed income markets

Data

- FRED (macroeconomic data)
- The AGG, the gold standard for measuring the U.S. fixed income market

Process

- Machine learning (ElasticNet regression) to predict volatility
- Use predicted volatility as investment signal (Buy/hold or sell)

Optimization

- Optimized model hyperparameters (L1 & L2)
- 5-Fold Cross Validation
- RMSE optimized

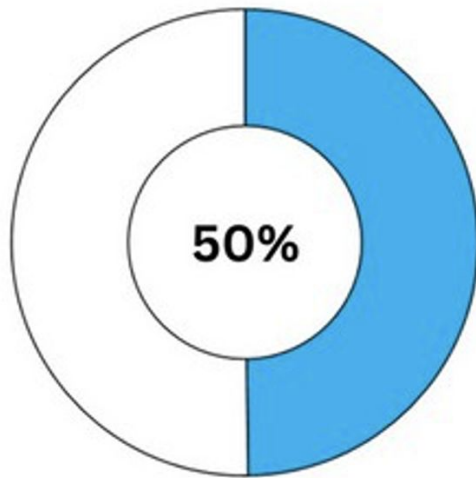
Final Signal deduced from strategy returns vs basic market returns

FRED (Economic Data)

- Macro Economic Predictors: Interest rate, Inflation rate, Unemployment, Economic Output, Market Liquidity, Commodities pricing.



\$53 Trillion US bond market



Bloomberg US Aggregate Index

Bloomberg Aggregate Index (AGG)

- Gold Standard for assessing the US Fixed Income market
- Tracks roughly half the overall bond Market (~28 Trillion estimated asset value today)
- Index is diversified across the various types of assets in the U.S. fixed income market

ElasticNet Regularization:

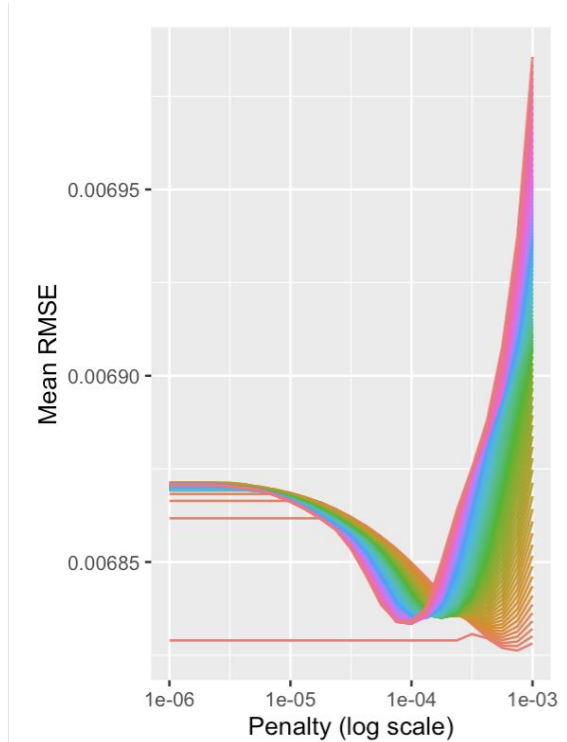
$$\frac{\sum_{i=1}^n (y_i - x_i^T \hat{\beta})^2}{2n} + \lambda \left(\frac{1-\alpha}{2} \sum_{j=1}^m \hat{\beta}_j^2 + \alpha \sum_{j=1}^m |\hat{\beta}_j| \right)$$

Volatility Prediction

- Model Predicts volatility for the AGG using time-series data and training data from FRED
- Uses ElasticNet Regularization to optimize volatility projections

Investment Strategy

- Select a volatility threshold from predicted values
- Signal investment if predicted value for that period is above threshold



Hyperparameters vs model
performance visualisation

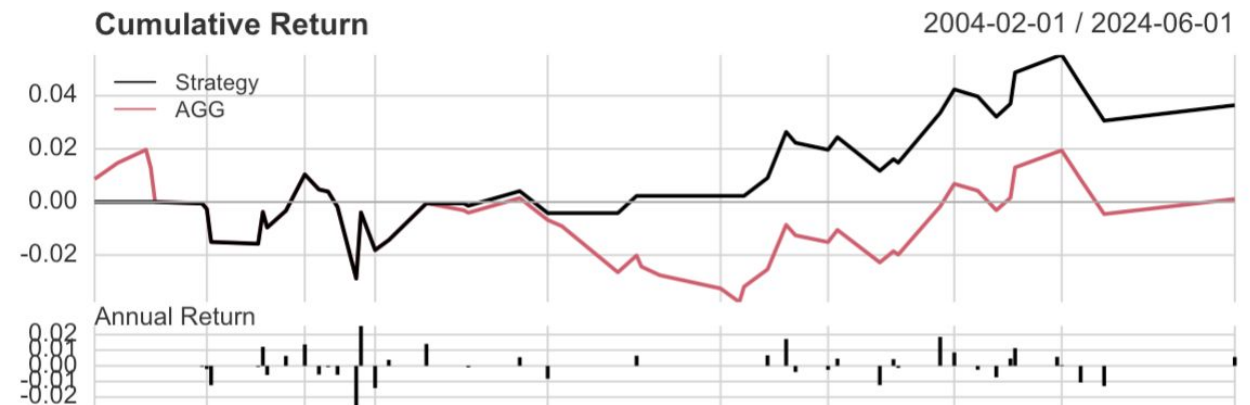
Strategy Returns

- Mean AGG return (Monthly): .007%
- Mean Strategy Returns (Monthly): .074%
- **Alpha: .067% Monthly**

Cumulative returns:

- AGG total return: 1.9%
- Strategy total return: 21.8%
- **Alpha: ~19.5%**

Strategy vs AGG Performance



Final Thoughts/Takeaways

- Volatility Prediction can be a powerful signal for market projection
- Even fixed income assets can be predicted and modeled

Shortcomings

- Volatility threshold was not fully optimized
- Only focused on overall market prediction rather than individual assets

Next Steps

- Predict individual assets within fixed income markets rather than the overall market
- Research the relationship between volatility and asset value for other asset types
- Research more on the role of fixed income assets

Thank You

