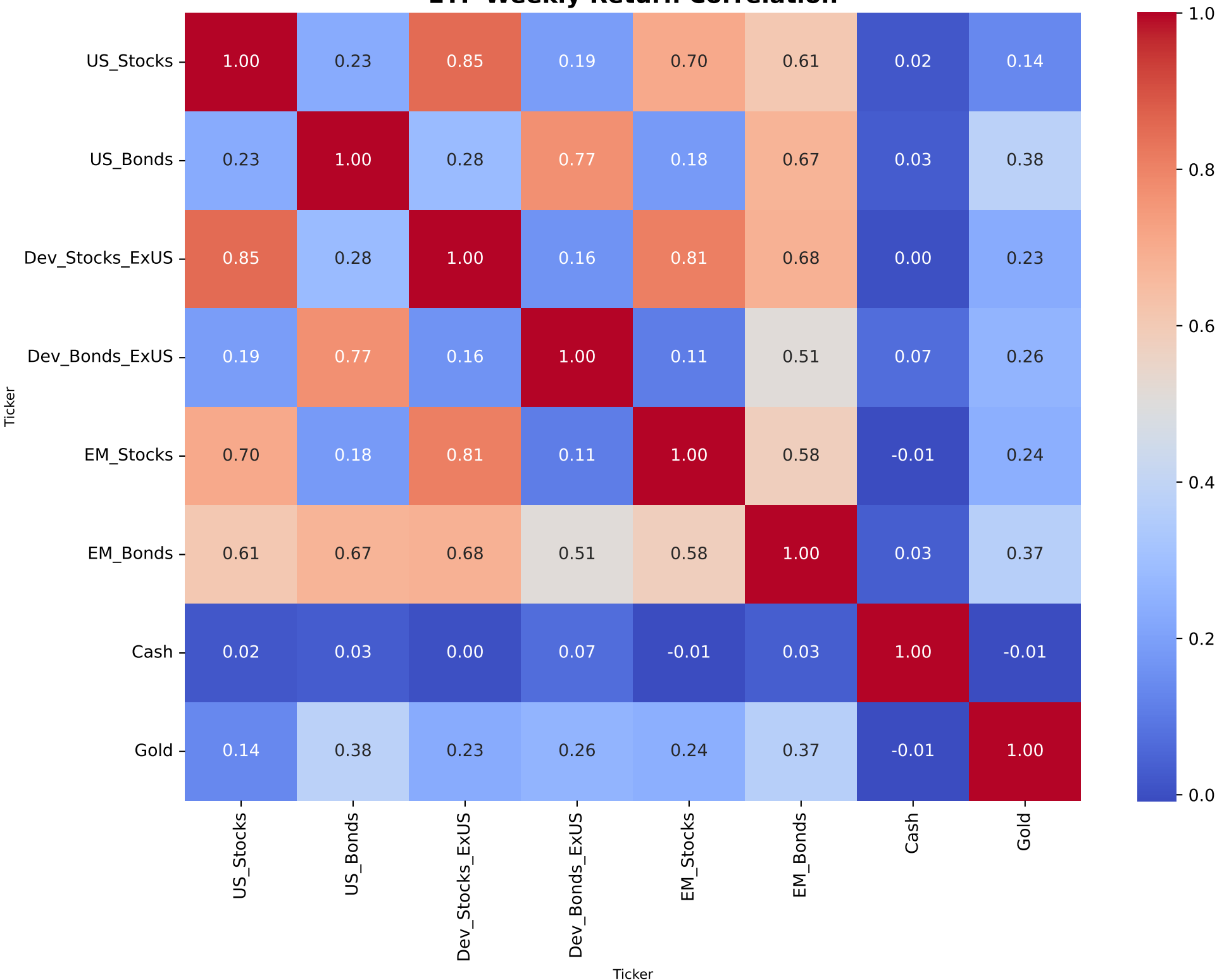
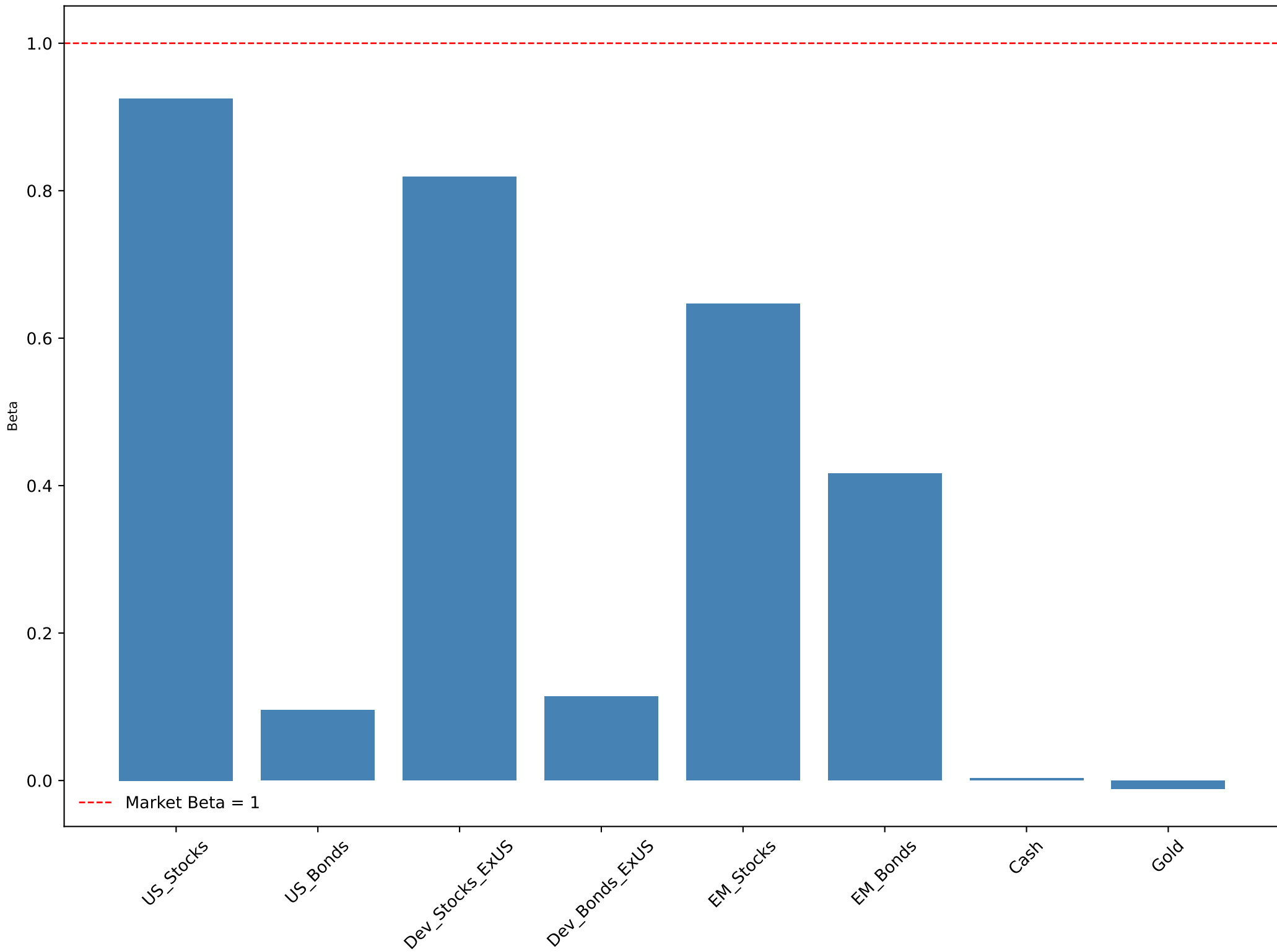


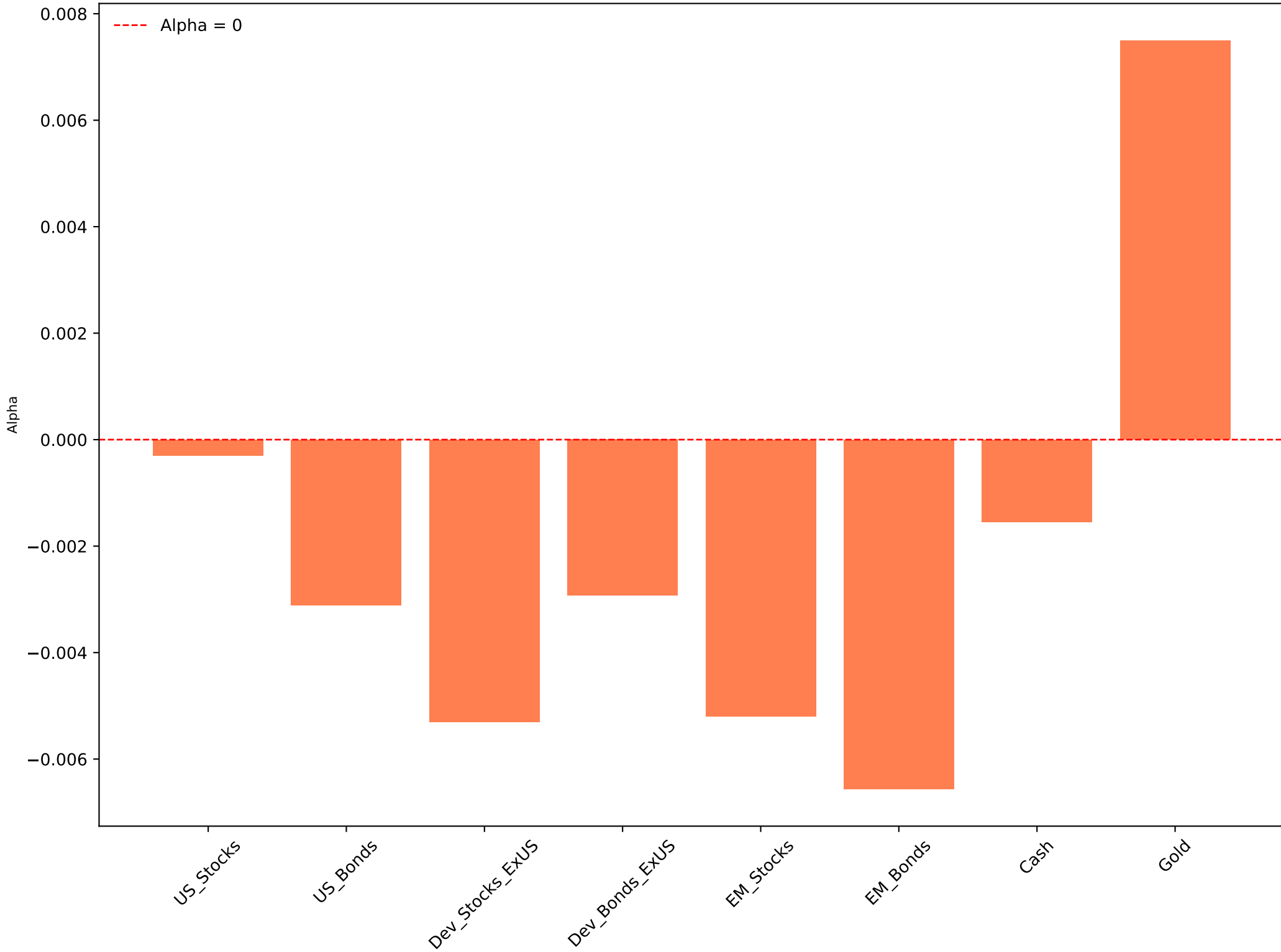
# ETF Weekly Return Correlation



## CAPM Beta

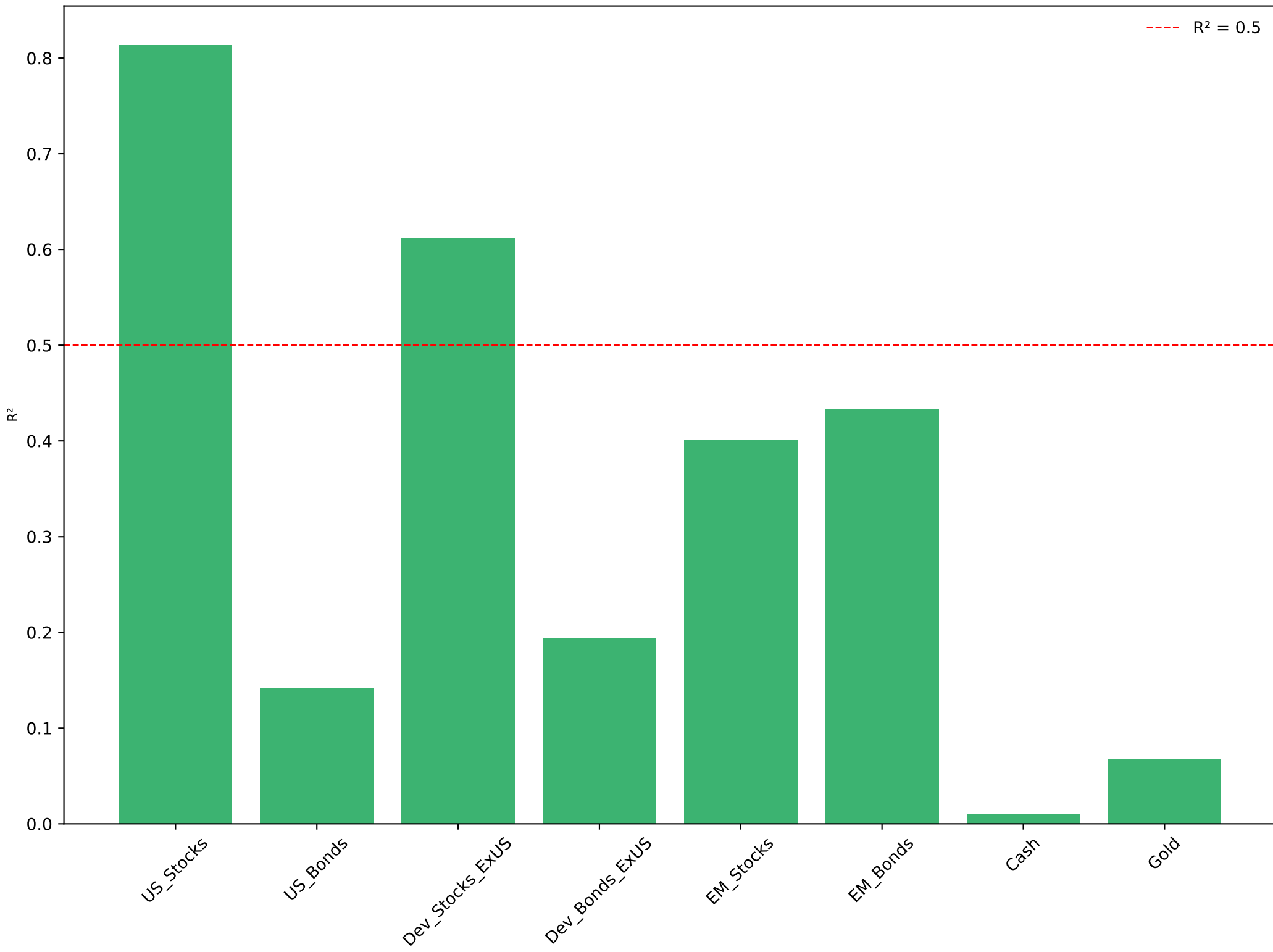


## CAPM Alpha



**Multi-Factor Model R<sup>2</sup>**

--- R<sup>2</sup> = 0.5



## Regression Summary: CAPM & Multi-Factor Model

### US\_Stocks:

CAPM Beta: 0.925  
CAPM Alpha: -0.0297%  
MFC R<sup>2</sup>: 0.814

### US\_Bonds:

CAPM Beta: 0.096  
CAPM Alpha: -0.3114%  
MFC R<sup>2</sup>: 0.141

### Dev\_Stocks\_ExUS:

CAPM Beta: 0.819  
CAPM Alpha: -0.5303%  
MFC R<sup>2</sup>: 0.612

### Dev\_Bonds\_ExUS:

CAPM Beta: 0.114  
CAPM Alpha: -0.2928%  
MFC R<sup>2</sup>: 0.194

### EM\_Stocks:

CAPM Beta: 0.647  
CAPM Alpha: -0.5199%  
MFC R<sup>2</sup>: 0.401

### EM\_Bonds:

CAPM Beta: 0.416  
CAPM Alpha: -0.6557%  
MFC R<sup>2</sup>: 0.433

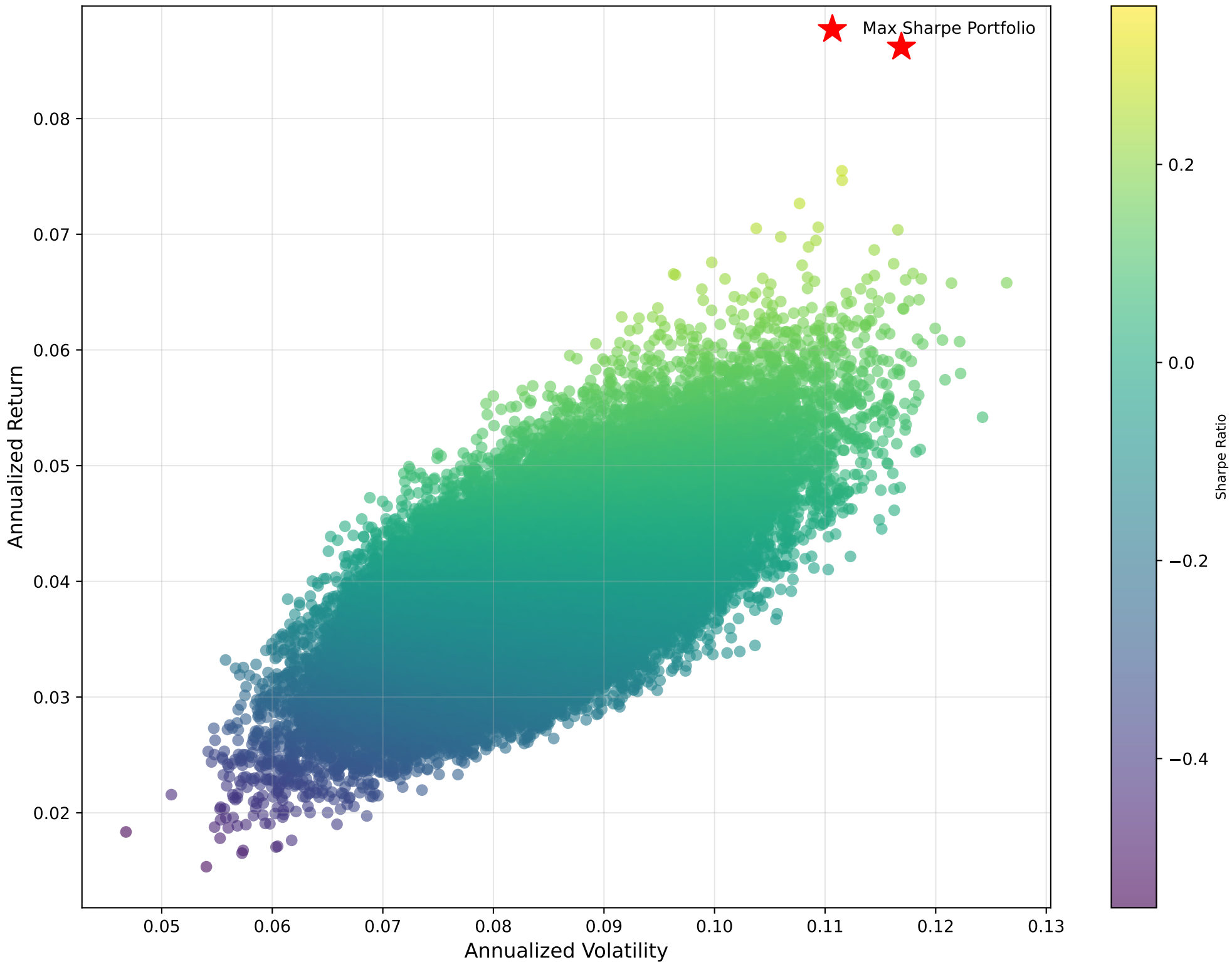
### Cash:

CAPM Beta: 0.003  
CAPM Alpha: -0.1546%  
MFC R<sup>2</sup>: 0.010

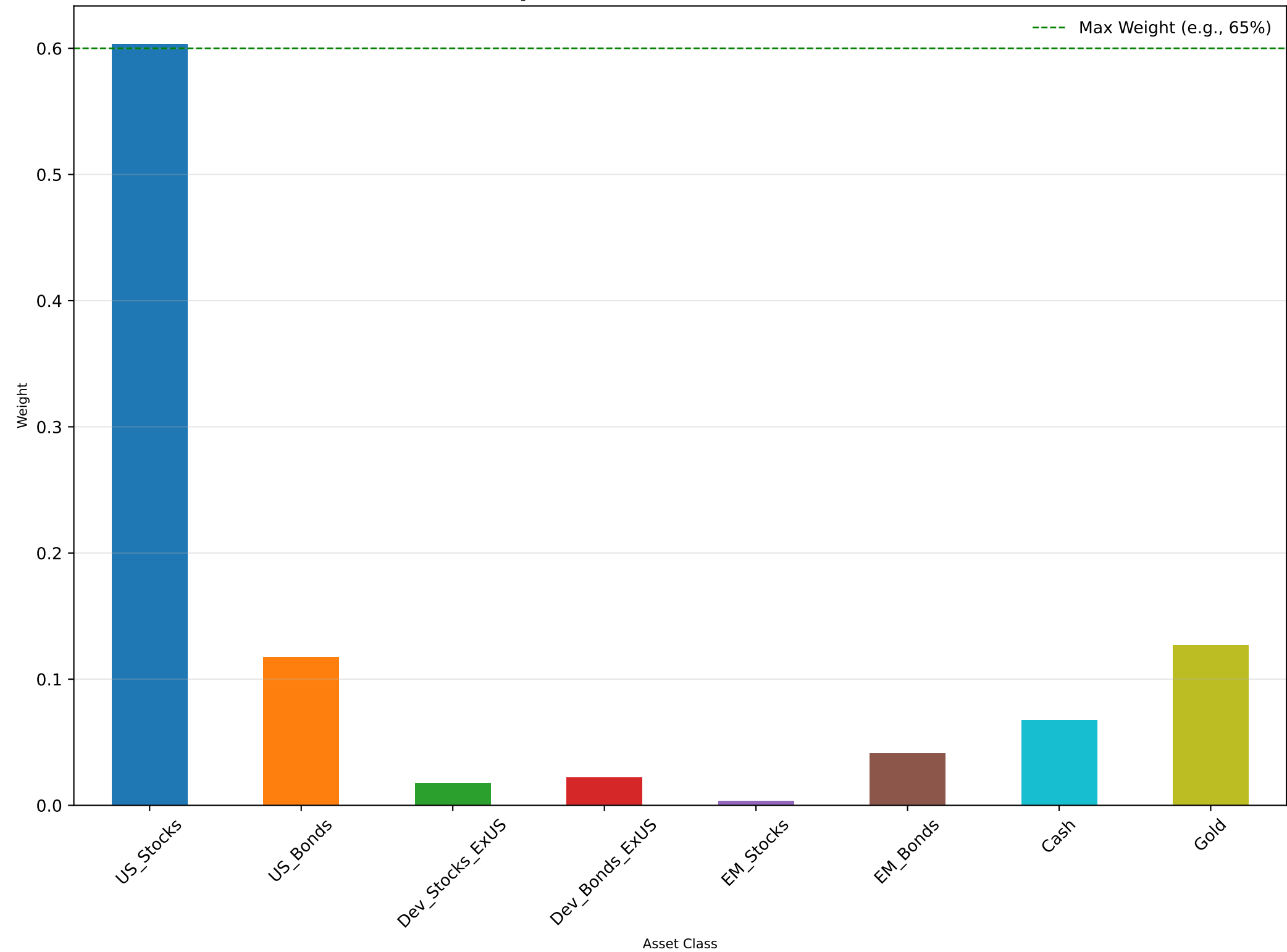
### Gold:

CAPM Beta: -0.012  
CAPM Alpha: 0.7490%  
MFC R<sup>2</sup>: 0.068

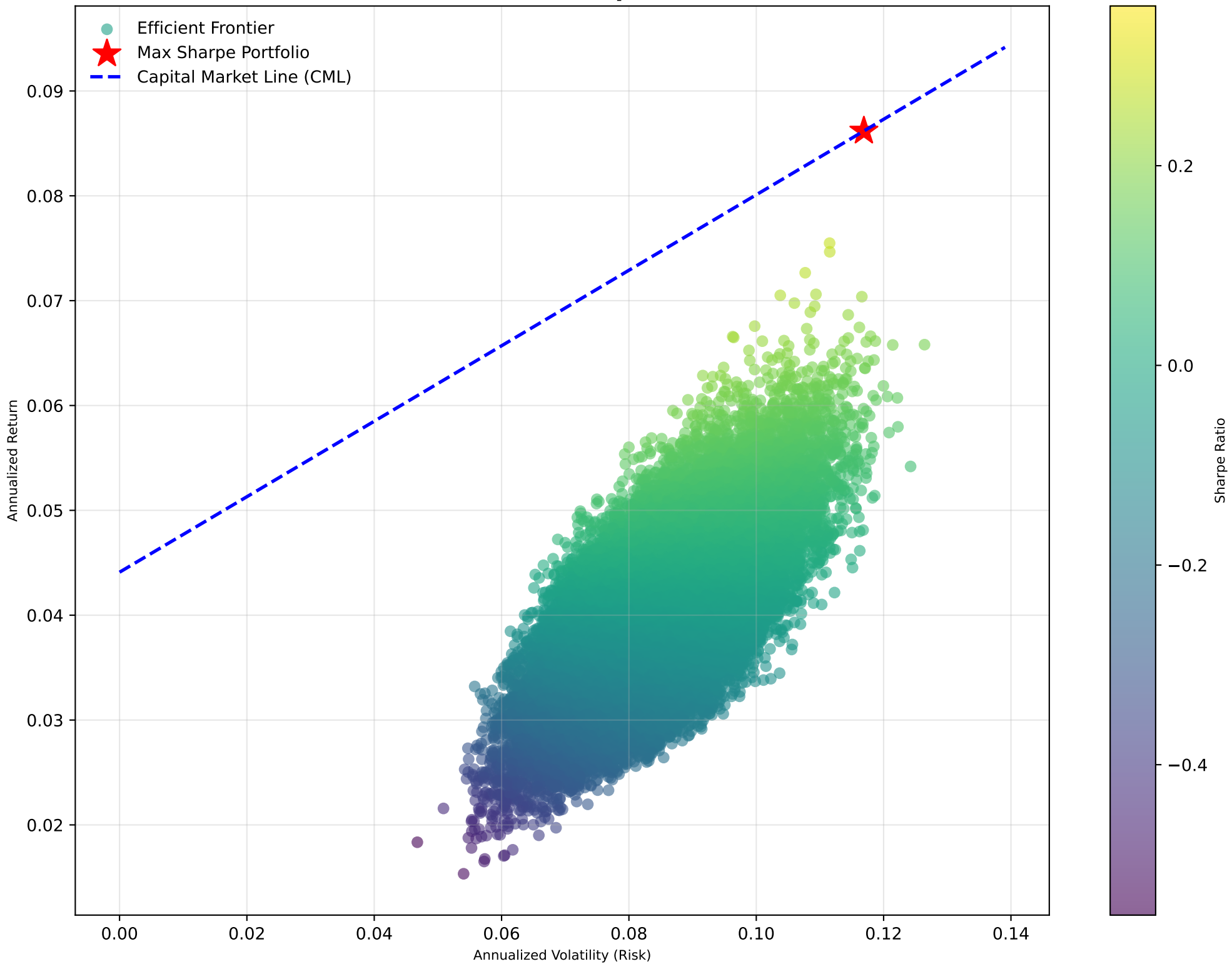
Efficient Frontier with Constraints



# Optimal Portfolio Allocation



# Efficient Frontier with Capital Market Line





### Optimal Portfolio Summary

Expected Annual Return: 8.62%  
Expected Annual Volatility: 11.69%  
Max Sharpe Ratio: 0.36

#### Allocation:

Asset_Class	Weight
US_Stocks	0.6034
US_Bonds	0.1176
Dev_Stocks_ExUS	0.0177
Dev_Bonds_ExUS	0.0224
EM_Stocks	0.0035
EM_Bonds	0.0411
Cash	0.0676
Gold	0.1268

Data Columns:  
US\_Stocks, US\_Bonds, Dev\_Stocks\_ExUS, Dev\_Bonds\_ExUS, EM\_Stocks, EM\_Bonds, Cash, Gold

Parsed Portfolio Details:  
Tickers: {'US\_Stocks': 'VOO', 'US\_Bonds': 'AGG', 'Dev\_Stocks\_ExUS': 'SCHF', 'Dev\_Bonds\_ExUS': 'BNDX', 'EM\_Stocks': 'VWO', 'EM\_Bonds': 'EMB', 'Cash': 'BIL', 'Gold': 'GLD'}  
Risk-Free Rate: 0.0441  
Constraints: {'US\_Stocks': {'max': 0.65, 'min': 0.1}, 'US\_Bonds': {'max': 0.5, 'min': 0.1}, 'Dev\_Stocks\_ExUS': {'max': 0.4}, 'Dev\_Bonds\_ExUS': {'max': 0.4}, 'EM\_Stocks': {'max': 0.15}, 'EM\_Bonds': {'max': 0.15}, 'Cash': {'max': 0.1, 'min': 0.05}, 'Gold': {'max': 0.15, 'min': 0.05}}

Descriptive Statistics for ETF Weekly Returns (Annualized where appropriate):  
Mean (Ann.) Std Dev (Ann.) Skewness Kurtosis Max Return \

Ticker	Mean (Ann.)	Std Dev (Ann.)	Skewness	Kurtosis	Max Return \
US_Stocks	0.1201	0.1738	-0.6203	6.0159	0.1213
US_Bonds	-0.0086	0.0519	-0.0828	9.3329	0.0503
Dev_Stocks_ExUS	0.0476	0.1721	-0.4638	5.4759	0.1216
Dev_Bonds_ExUS	-0.0045	0.0444	-0.9670	4.6920	0.0204
EM_Stocks	0.0334	0.1863	-0.3965	2.0592	0.0940
EM_Bonds	-0.0139	0.0999	-1.9445	20.7643	0.0709
Cash	0.0002	0.0066	-2.0986	4.9929	0.0015
Gold	0.1136	0.1430	0.0317	1.7712	0.0866

Ticker	Min Return	Sharpe Ratio
US_Stocks	-0.1490	0.4375
US_Bonds	-0.0509	-1.0161
Dev_Stocks_ExUS	-0.1440	0.0206
Dev_Bonds_ExUS	-0.0355	-1.0947
EM_Stocks	-0.1331	-0.0575
EM_Bonds	-0.1322	-0.5809
Cash	-0.0036	-6.6405
Gold	-0.0906	0.4862

Downside and Tail Risk Statistics:

	VaR (5%)	CVaR (5%)	Max Drawdown	Beta (vs US_Stocks) \
US_Stocks	-0.0342	-0.0580	-0.3208	1.0000
US_Bonds	-0.0113	-0.0165	-0.2305	0.0683
Dev_Stocks_ExUS	-0.0354	-0.0556	-0.3758	0.8446
Dev_Bonds_ExUS	-0.0098	-0.0168	-0.2038	0.0485
EM_Stocks	-0.0415	-0.0586	-0.3896	0.7555
EM_Bonds	-0.0191	-0.0335	-0.3379	0.3486
Cash	-0.0025	-0.0031	-0.0056	0.0006
Gold	-0.0305	-0.0412	-0.1983	0.1113

	Avg GARCH Vol
US_Stocks	0.0228
US_Bonds	0.0067
Dev_Stocks_ExUS	0.0225
Dev_Bonds_ExUS	0.0060
EM_Stocks	0.0251
EM_Bonds	0.0127
Cash	0.0007
Gold	0.0195

Optimal Portfolio Allocation (with Constraints):

Asset Class	Weight
0 US_Stocks	0.6034
1 US_Bonds	0.1176
2 Dev_Stocks_ExUS	0.0177
3 Dev_Bonds_ExUS	0.0224
4 EM_Stocks	0.0035
5 EM_Bonds	0.0411
6 Cash	0.0676
7 Gold	0.1268

Expected Annual Return: 0.0862  
Expected Annual Volatility: 0.1169  
Max Sharpe Ratio: 0.3600

Minimum Volatility Portfolio (No Constraints):

Ticker	
US_Stocks	0.1017
US_Bonds	0.3451
Dev_Stocks_ExUS	0.0080
Dev_Bonds_ExUS	0.3497
EM_Stocks	0.0001
EM_Bonds	0.0065
Cash	0.0977
Gold	0.0912

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Minimum Volatility Portfolio  
Expected Annual Return: 0.0183  
Expected Annual Volatility: 0.0468  
Max Sharpe Ratio: -0.5507

Minimum Variance Portfolio Weights:

Asset	Weight
US_Stocks	0.1017
US_Bonds	0.3451
Dev_Stocks_ExUS	0.0080
Dev_Bonds_ExUS	0.3497
EM_Stocks	0.0001
EM_Bonds	0.0065
Cash	0.0977