

Stock Market Analysis & Prediction

By: Seung Chi





Malkiel's Monkey

- Compare S&P 500 Index against a Portfolio of 20 randomly selected stocks
- Time span of 5+ years from 2013-01 to 2018-06

"A blindfolded monkey throwing darts at a newspaper's financial pages could select a portfolio that would do just as well as one carefully selected by experts." -Burton Malkiel in *A Random Walk Down Wall Street*





S&P 500 vs Portfolio: What would make me more money?

Stock Prices

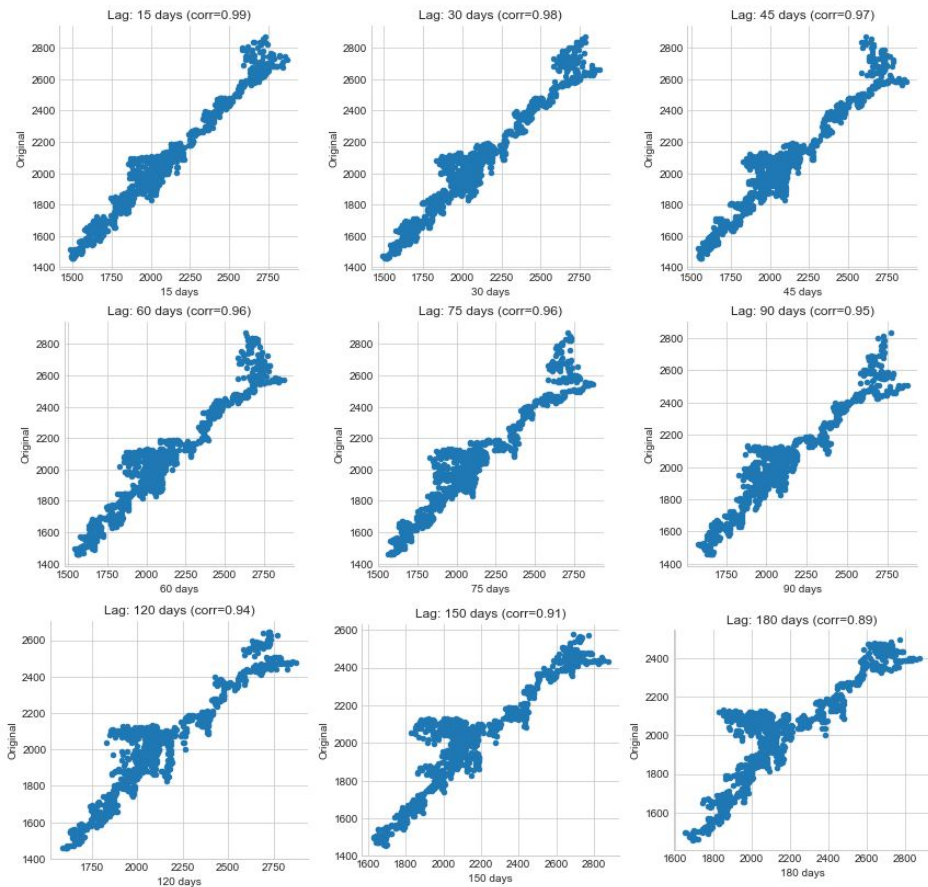


Normalized Stock Prices

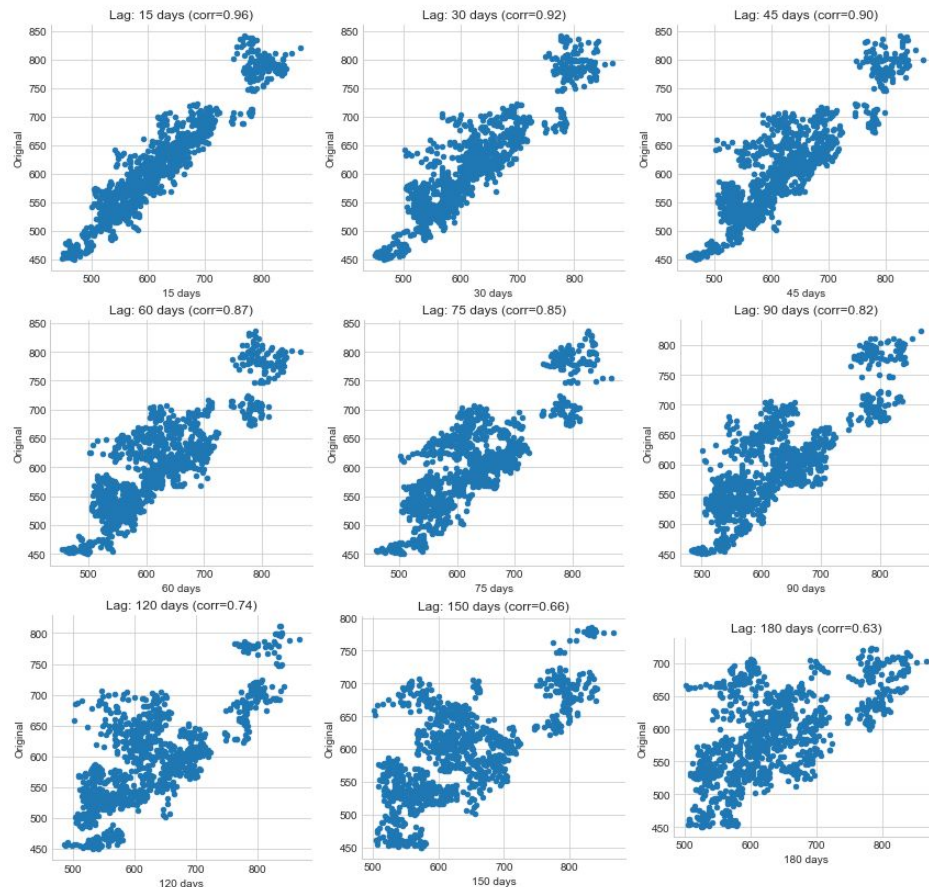


Scatter Plots Comparison of Autocorrelation with Time Lags

Time Lag Scatter Plots of S&P500



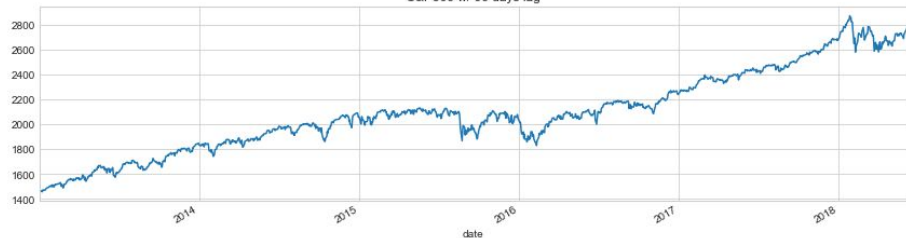
Time Lag Scatter Plots of Portfolio



Random Walk Process: Non-stationary



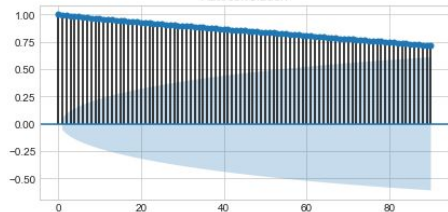
S&P500 w/ 90 days lag



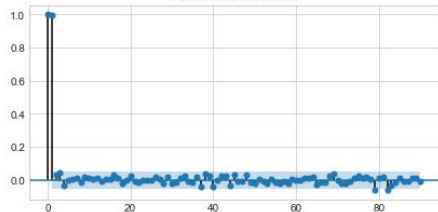
Portfolio w/ 90 days lag



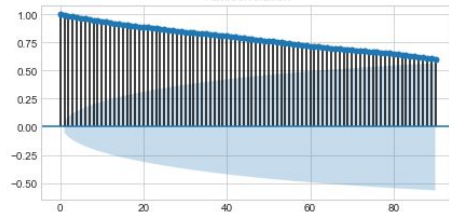
Autocorrelation



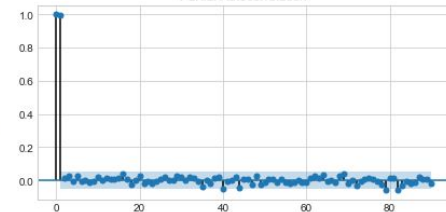
Partial Autocorrelation



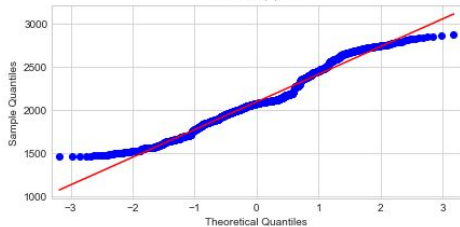
Autocorrelation



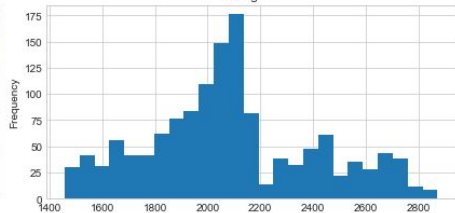
Partial Autocorrelation



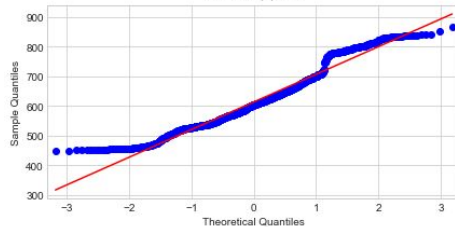
Normal QQ Plot



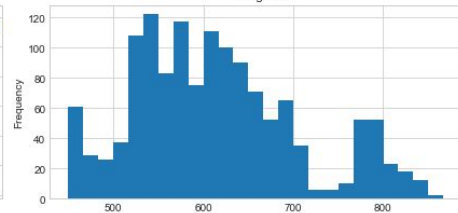
Histogram



Normal QQ Plot

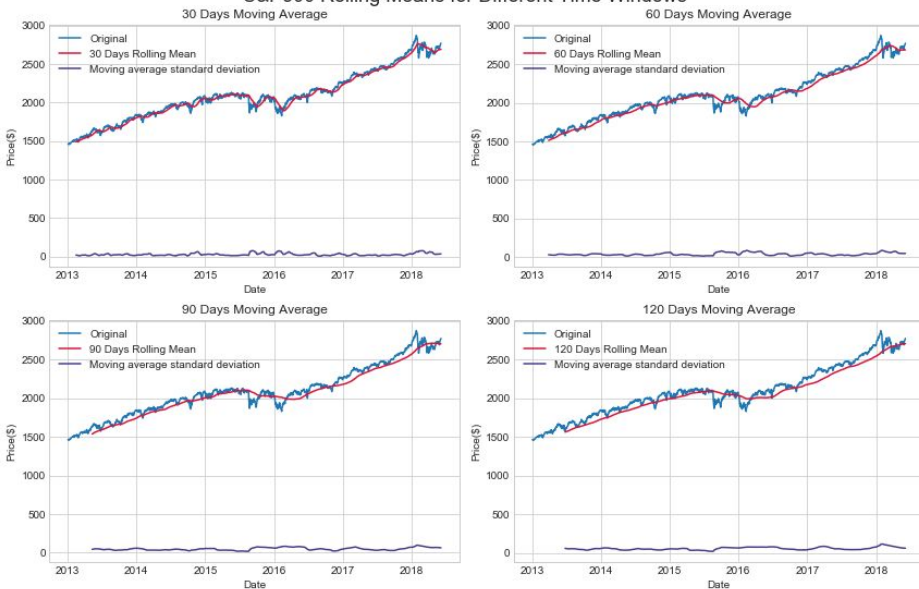


Histogram



Rolling Means for Trend Visualization

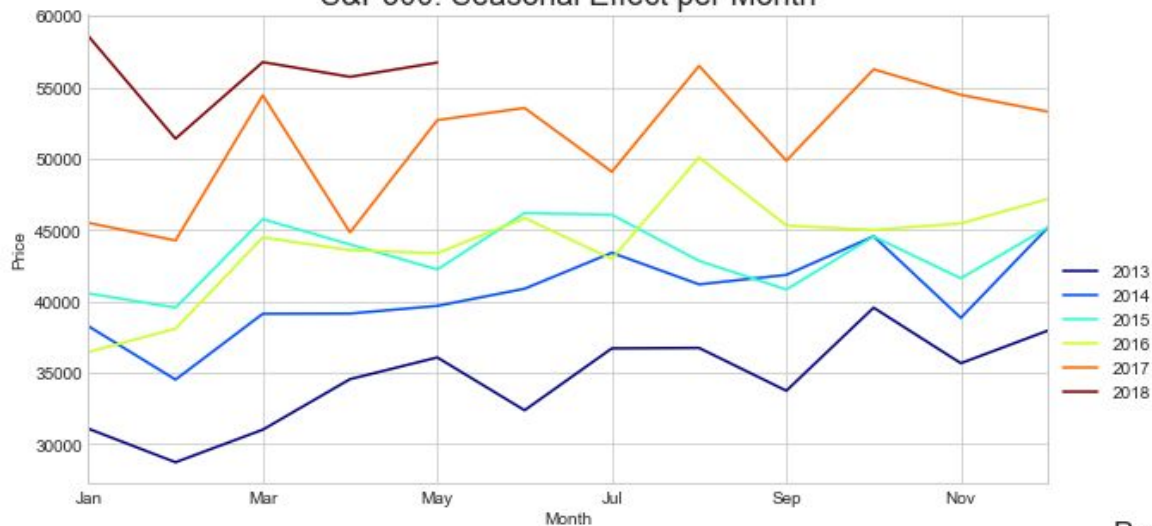
S&P500 Rolling Means for Different Time Windows



Portfolio Rolling Means for Different Time Windows



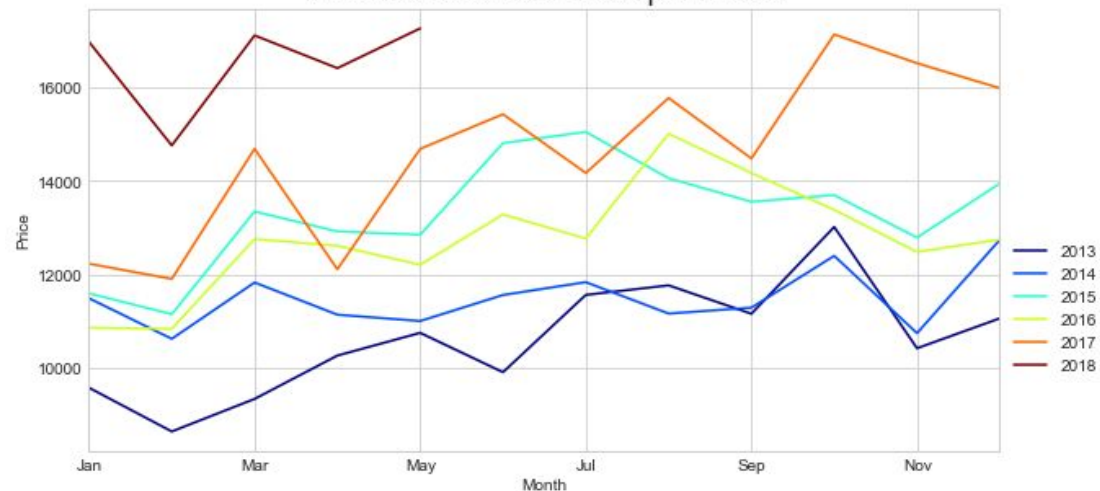
S&P500: Seasonal Effect per Month

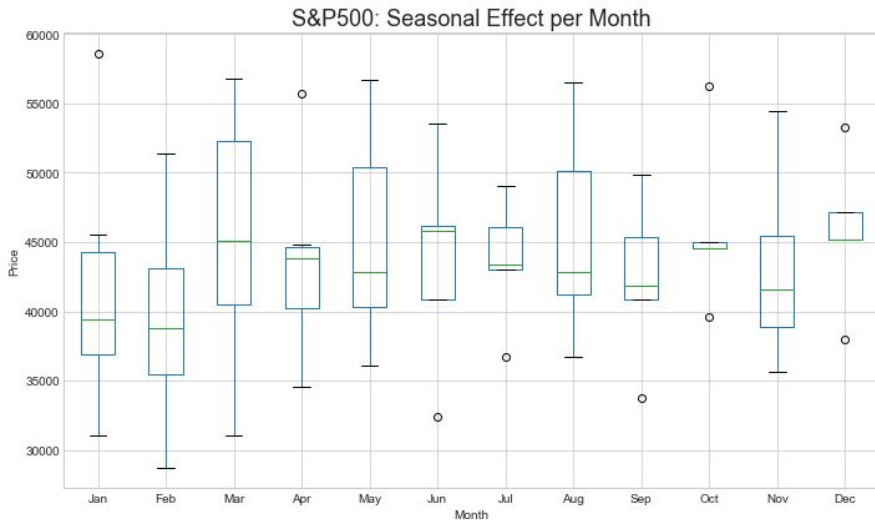


Seasonal Effect per Month for each Year

- Note quarterly earnings season: December, March, June, and September

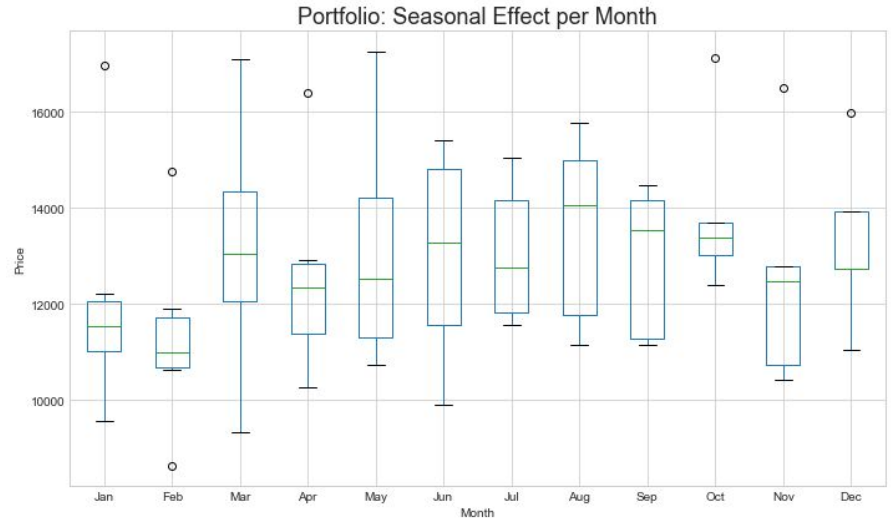
Portfolio: Seasonal Effect per Month



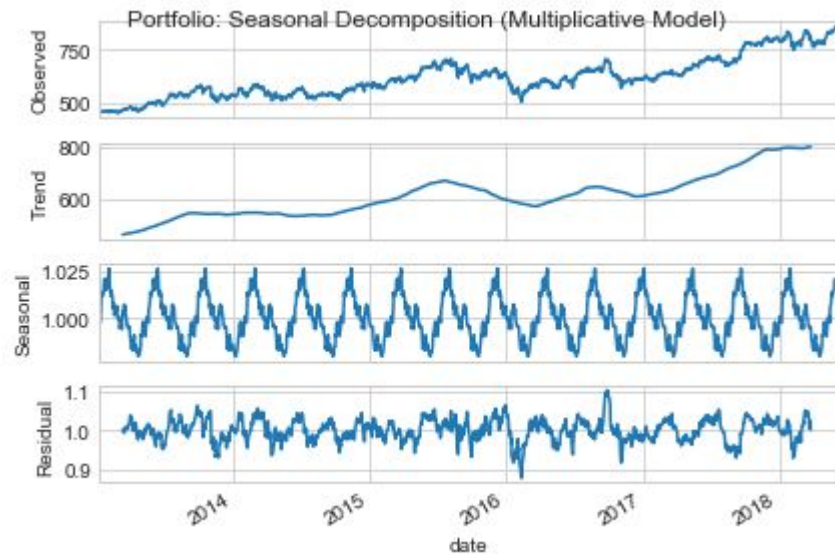
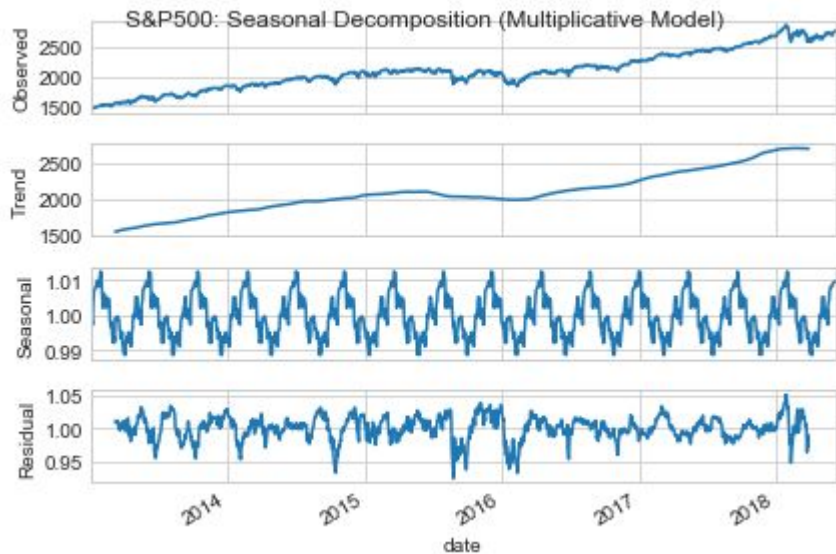


- Note quarterly earnings season: December, March, June, and September

Seasonal Effect: Boxplots per Month



Seasonal Decomposition for Noise



Augmented Dickey-Fuller Test

- **H0**: Unit root is present in the time series and thus is non-stationary.
- **H1**: The time series is stationary.
- **α** : 0.05



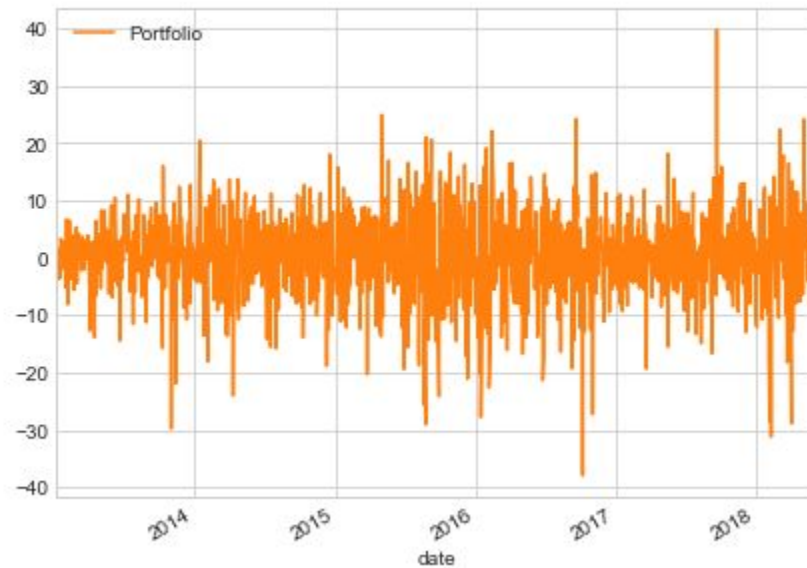
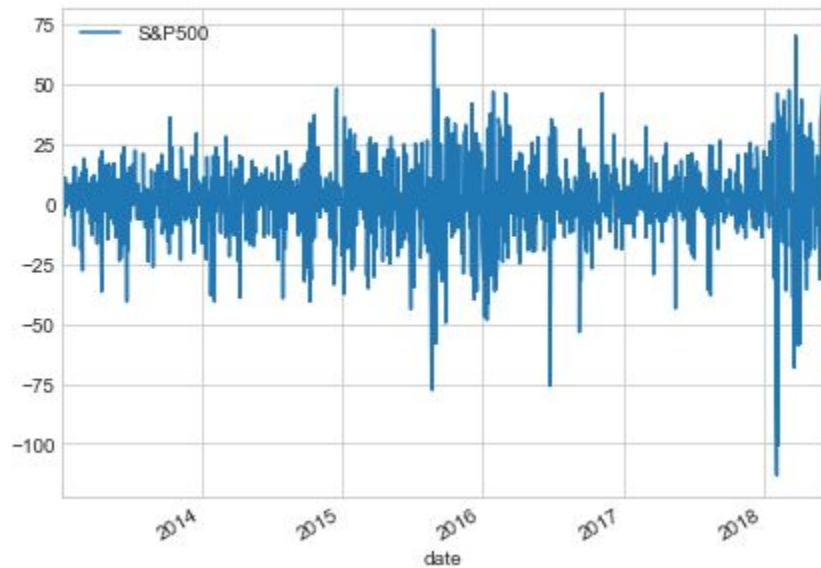
	Test Statistics	P-Value
S&P 500	-0.7115	0.8437
Portfolio	-0.7246	0.8403
S&P 500 (1st Diff)	-21.3979	0.0000
Portfolio (1st Diff)	-19.4453	0.0000

Critical Value (5%)	Critical Value (1%)
-2.8637	-3.4352



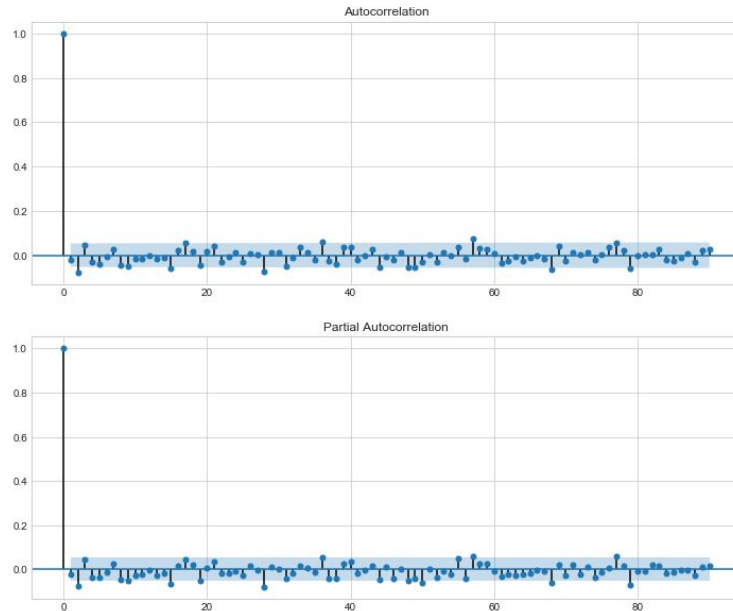
White Noise

Stock Price First Order Differences

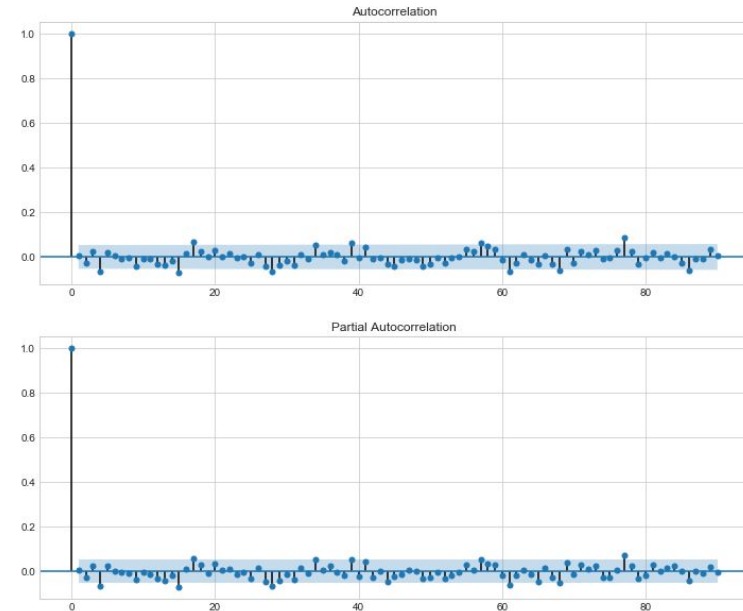


ACF & PACF of First Order Difference

First Order Difference: S&P500 w/ 90 days lag



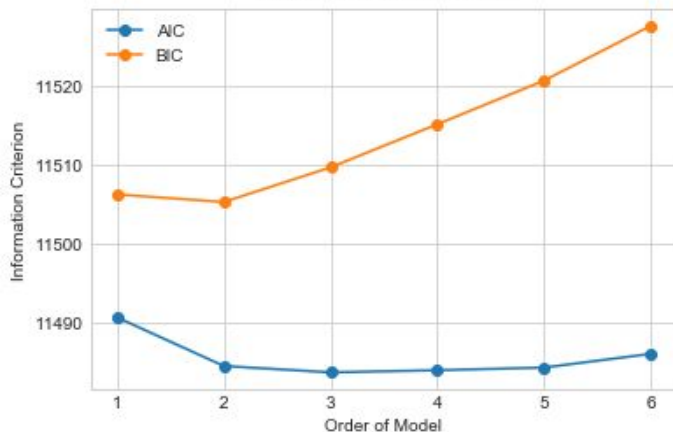
First Order Difference: Portfolio w/ 90 days lag



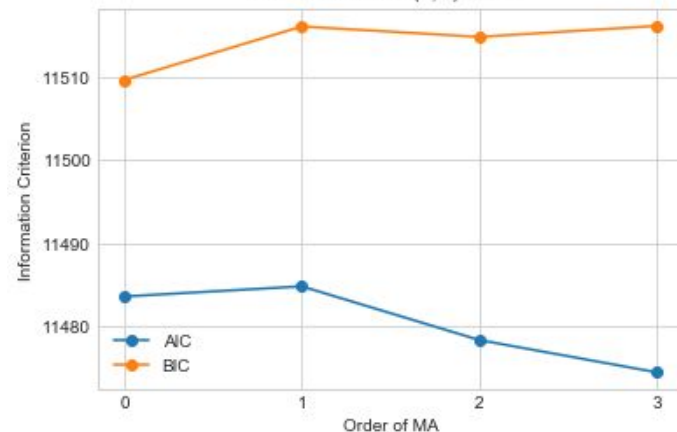
ARIMA Model Order Selection with AIC & BIC



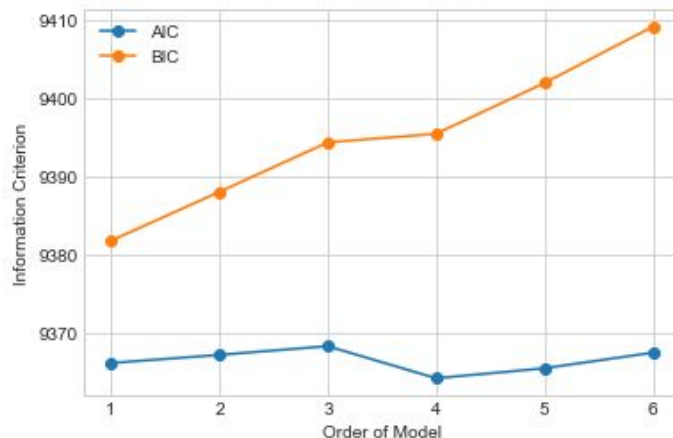
S&P500: AR Model Orders



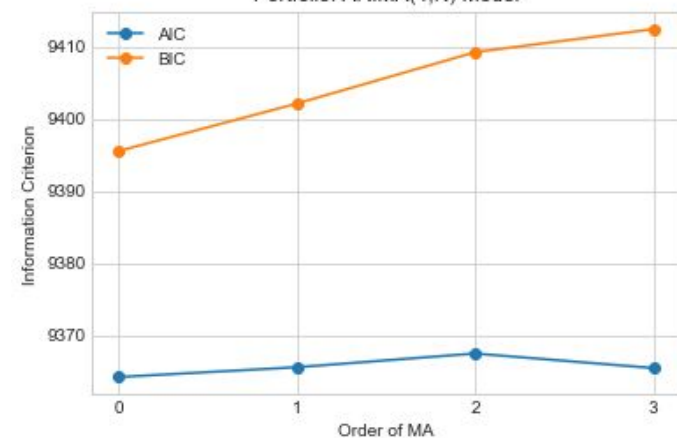
S&P500: ARIMA(3,N) Model



Portfolio: AR Model Orders



Portfolio: ARIMA(4,N) Model





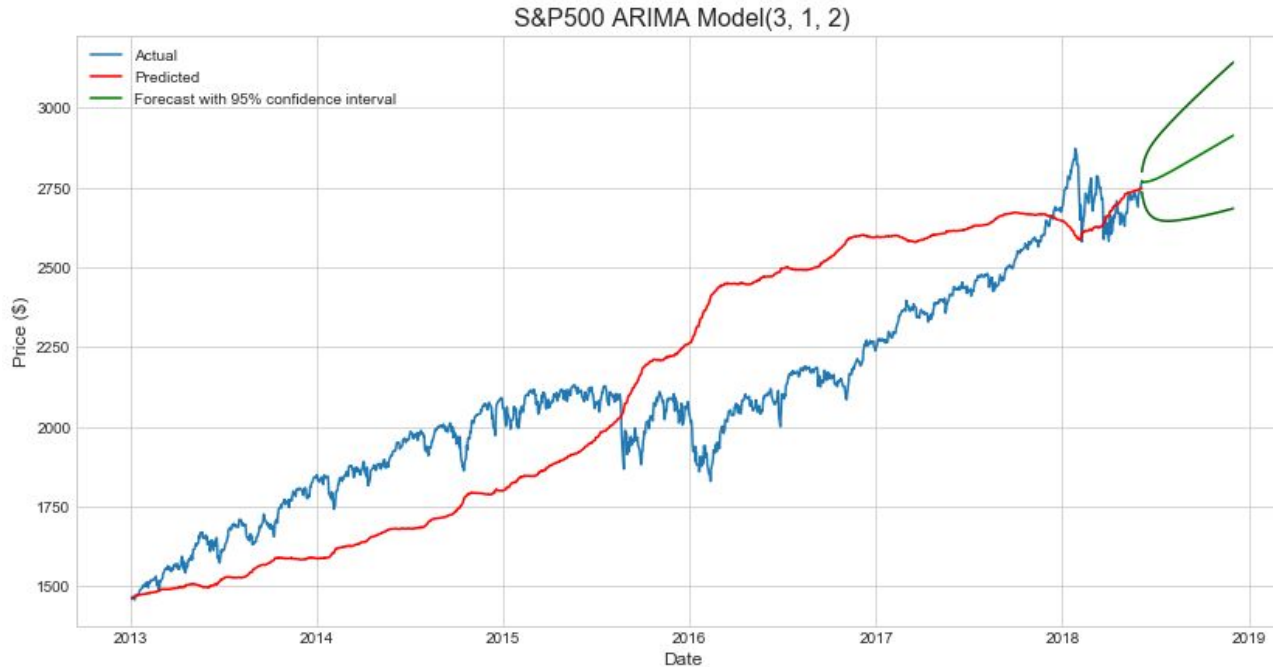
S&P 500 ARIMA Model (3, 1, 0)



*Prediction from
Jan 2018 to Jun
2018:*

2836.67 Mean
Squared Error

S&P 500 ARIMA Model (3, 1, 2)

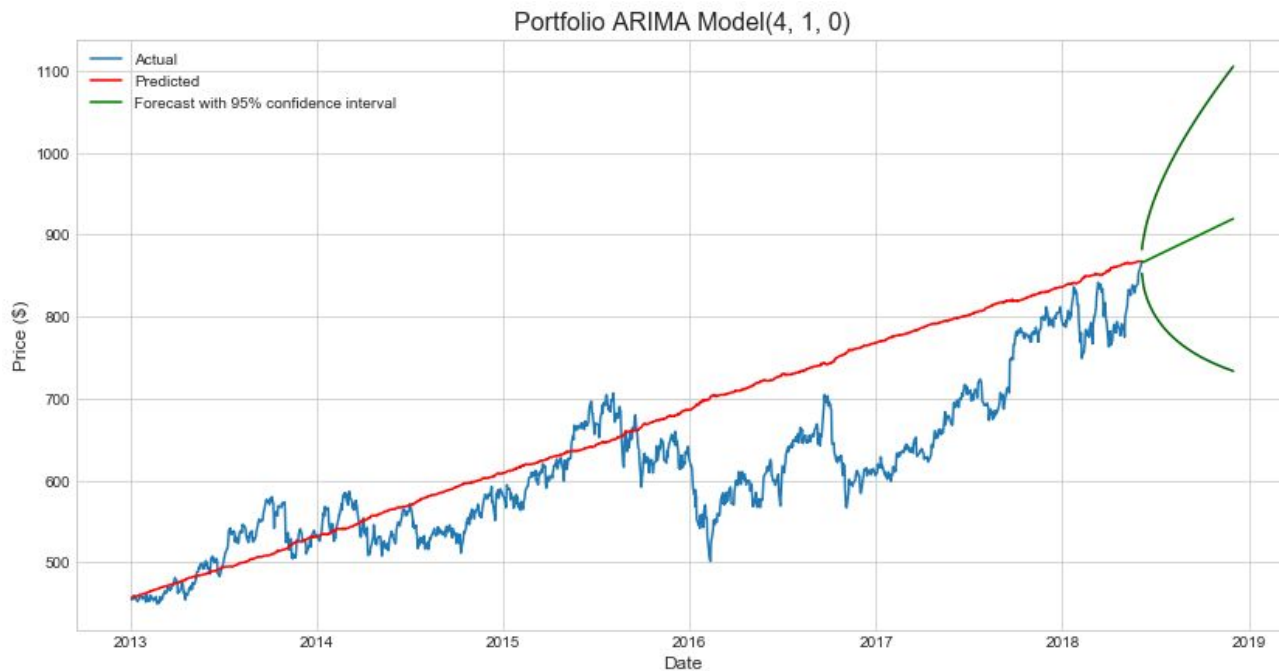


*Prediction from
Jan 2018 to Jun
2018:*

2547.11 Mean
Squared Error



Stocks Portfolio ARIMA Model (4, 1, 0)



*Prediction from
Jan 2018 to Jun
2018:*

676.02 Mean
Squared Error



Stocks Portfolio ARIMA Model (4, 1, 3)



*Prediction from
Jan 2018 to Jun
2018:*

620.93 Mean
Squared Error

Beyond this Project

- Use different indexes and/or stocks for time series analysis and model performance
- SARIMAX
- RNN
- NLP for finance articles, social media feeds, quarterly earning reports, etc.

