

Financial Informatics

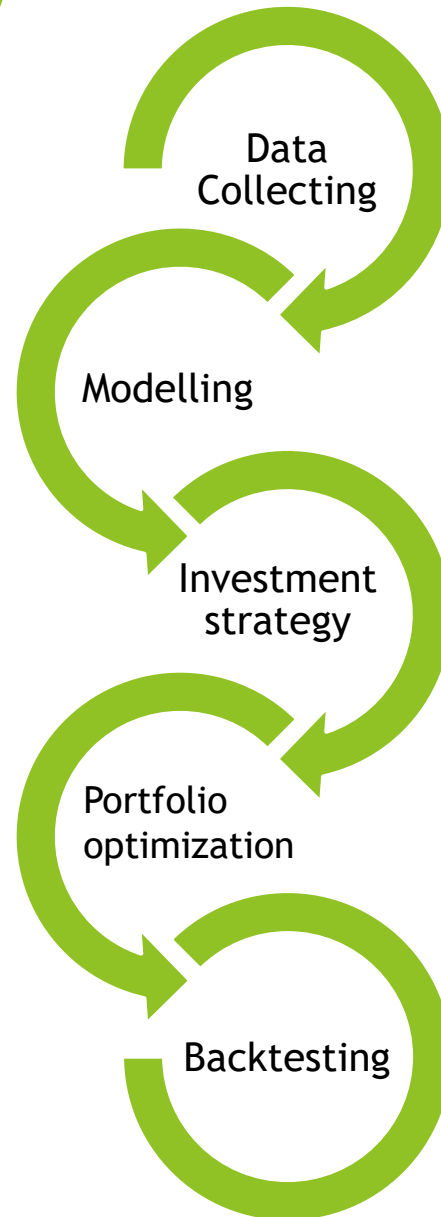
- ▶ Final Presentation

Yumi Kim

Obejective

- ▶ How much can I forecast the future price?

Process Overview



1. Data Collecting

Dow Jones Industrial Average



1. Good representation of US market
2. Big market cap
3. 30 stocks : X Survivorship Bias

Ex) Apple: 2015

1. Data Collecting

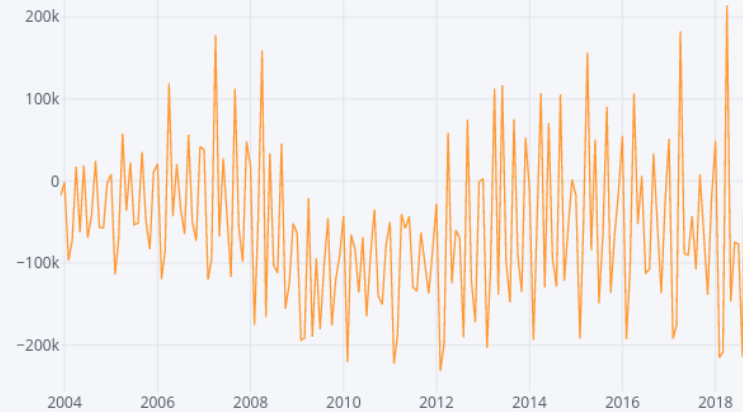
Unemployment Rate



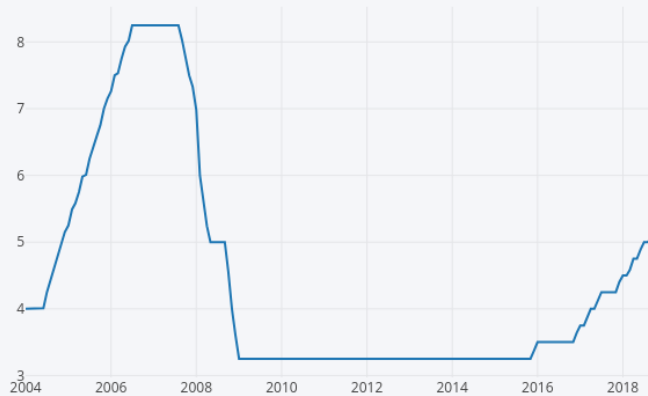
Purchasing Managers Index



Federal Deficit or Surplus



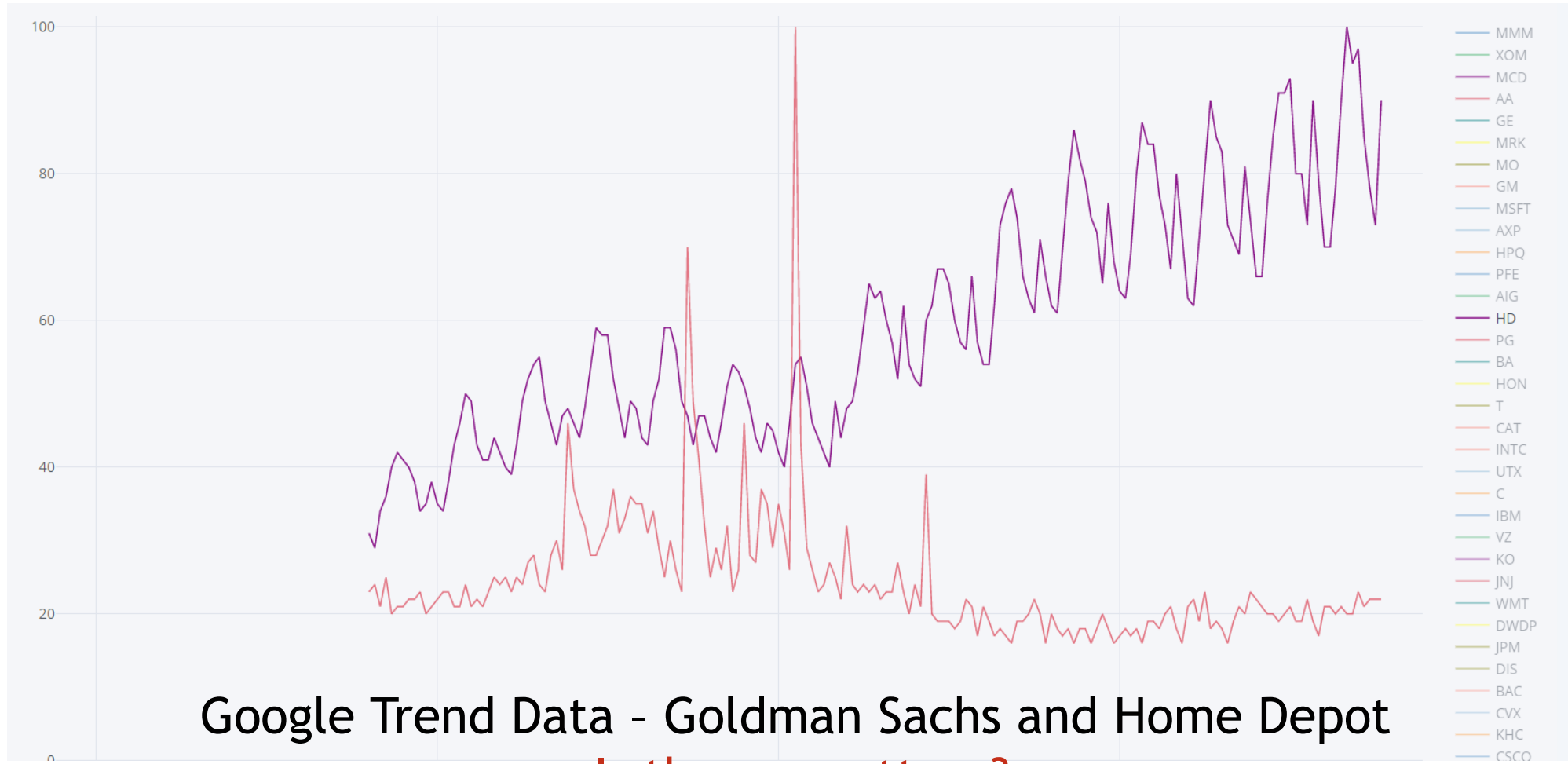
Bank Loan Prime Rate



Dollar Index



1. Data Collecting



Google Trend Data - Goldman Sachs and Home Depot

Is there a pattern?

1. Data Collecting

1. Different Time range

1. Jan 2004 to Present
2. Dollar index: no data for November 2018
3. Missing data: ARIMA forecast

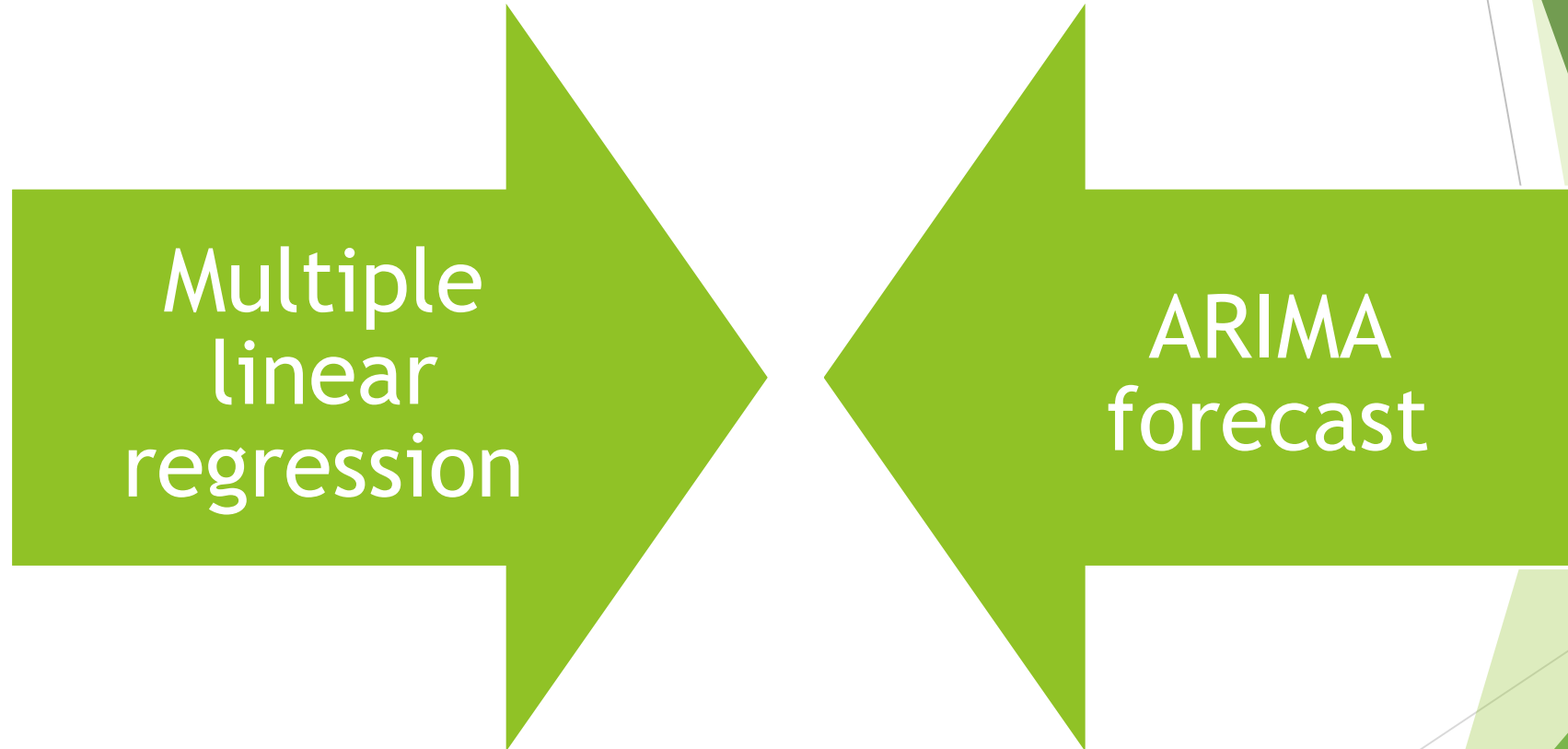
2. Different Time frequency

1. Monthly terms
2. Forecasting results -> Monthly
3. Lagged independent variables

2. Divide the Dataset

1. Training set : 2004-02 to 2013 -11
2. Backtesting set : 2013 - 12 to 2018-11

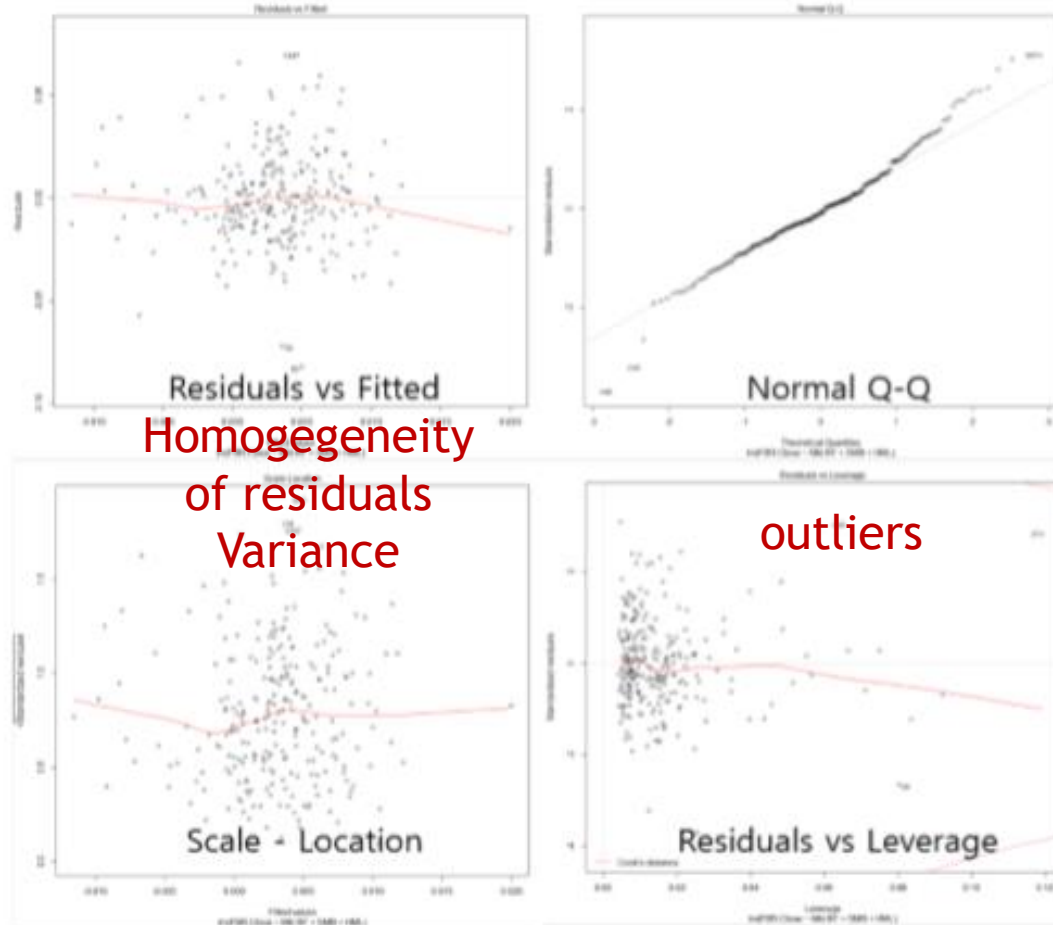
2. Forecasting Model



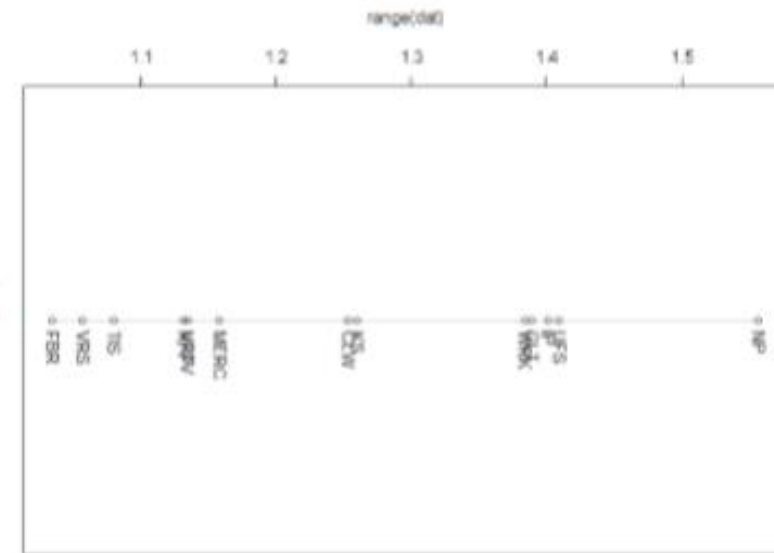
2. Forecasting Model - Regression

Linearity of the data

Normality of Residuals



Variance inflation factors



Multicollinearity

Purchasing Managers Index Example

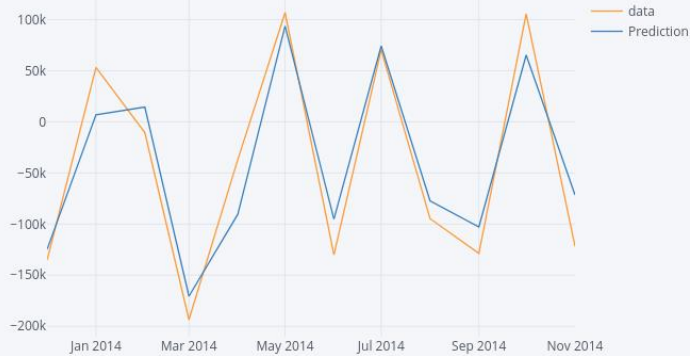
2. Forecasting Model - ARIMA model

```
In [126]: trend_list = []
          for column in trend:
              temp = auto_arima(trend[column], start_p=1, start_q=1,
                               max_p=3, max_q=3, m=12,
                               start_P=0, seasonal=True,
                               d=1, D=1, trace=True,
                               error_action='ignore',
                               suppress_warnings=True,
                               stepwise=True)
              trend_list.append(temp)
```

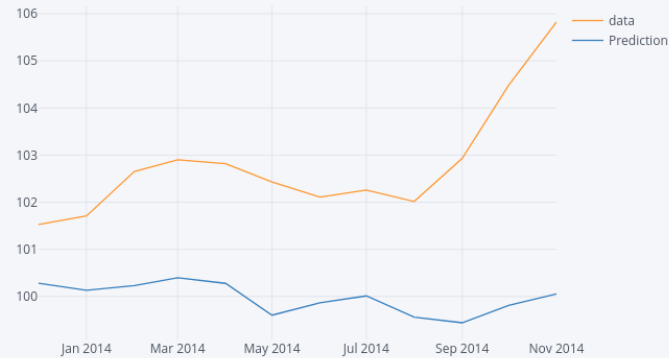
```
Fit ARIMA: order=(1, 1, 1) seasonal_order=(0, 1, 1, 12); AIC=866.235, BIC=881.764, Fit time=3.274 seconds
Fit ARIMA: order=(0, 1, 0) seasonal_order=(0, 1, 0, 12); AIC=986.669, BIC=992.881, Fit time=0.040 seconds
Fit ARIMA: order=(1, 1, 0) seasonal_order=(1, 1, 0, 12); AIC=936.644, BIC=949.068, Fit time=0.642 seconds
Fit ARIMA: order=(0, 1, 1) seasonal_order=(0, 1, 1, 12); AIC=864.247, BIC=876.671, Fit time=2.293 seconds
Fit ARIMA: order=(0, 1, 1) seasonal_order=(1, 1, 1, 12); AIC=866.145, BIC=881.675, Fit time=3.942 seconds
Fit ARIMA: order=(0, 1, 1) seasonal_order=(0, 1, 0, 12); AIC=933.125, BIC=942.443, Fit time=0.198 seconds
Fit ARIMA: order=(0, 1, 1) seasonal_order=(0, 1, 2, 12); AIC=866.110, BIC=881.640, Fit time=8.920 seconds
Fit ARIMA: order=(0, 1, 1) seasonal_order=(1, 1, 2, 12); AIC=866.450, BIC=885.086, Fit time=9.699 seconds
Fit ARIMA: order=(0, 1, 0) seasonal_order=(0, 1, 1, 12); AIC=934.376, BIC=943.694, Fit time=1.206 seconds
Fit ARIMA: order=(0, 1, 2) seasonal_order=(0, 1, 1, 12); AIC=866.234, BIC=881.764, Fit time=3.454 seconds
Fit ARIMA: order=(1, 1, 2) seasonal_order=(0, 1, 1, 12); AIC=867.818, BIC=886.453, Fit time=4.094 seconds
Total fit time: 37.767 seconds
```

2. Forecasting Model - ARIMA model

Federal Deficit or Surplus

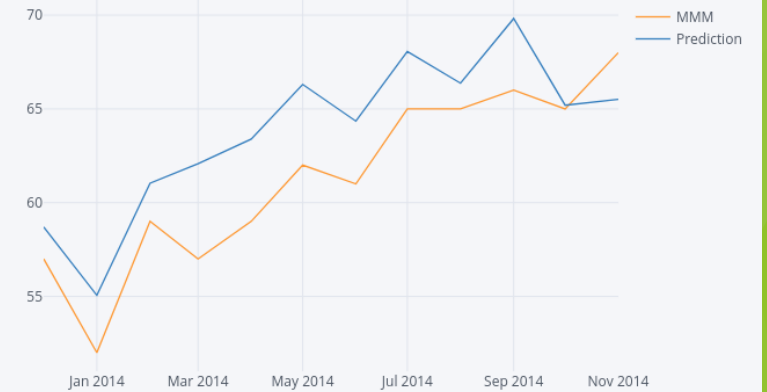


Dollar Index

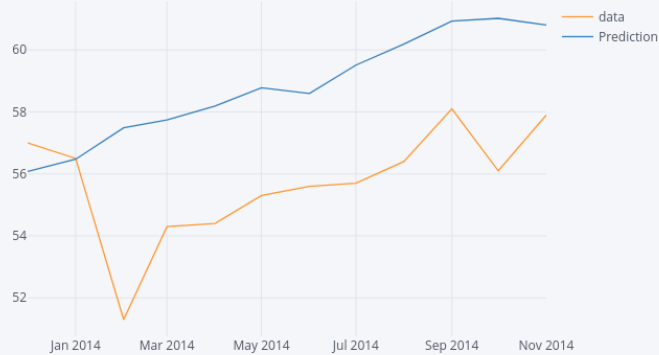


2014

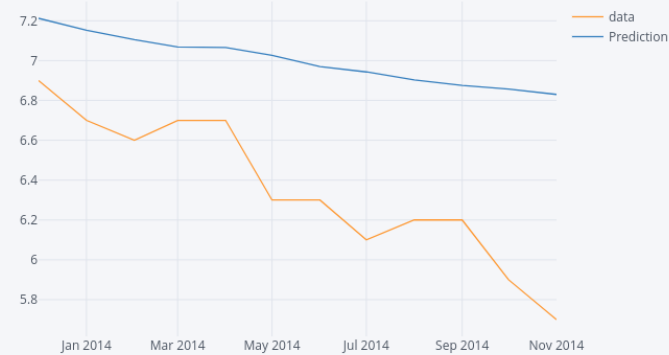
Google Trend - 3M



Purchasing Managers Index

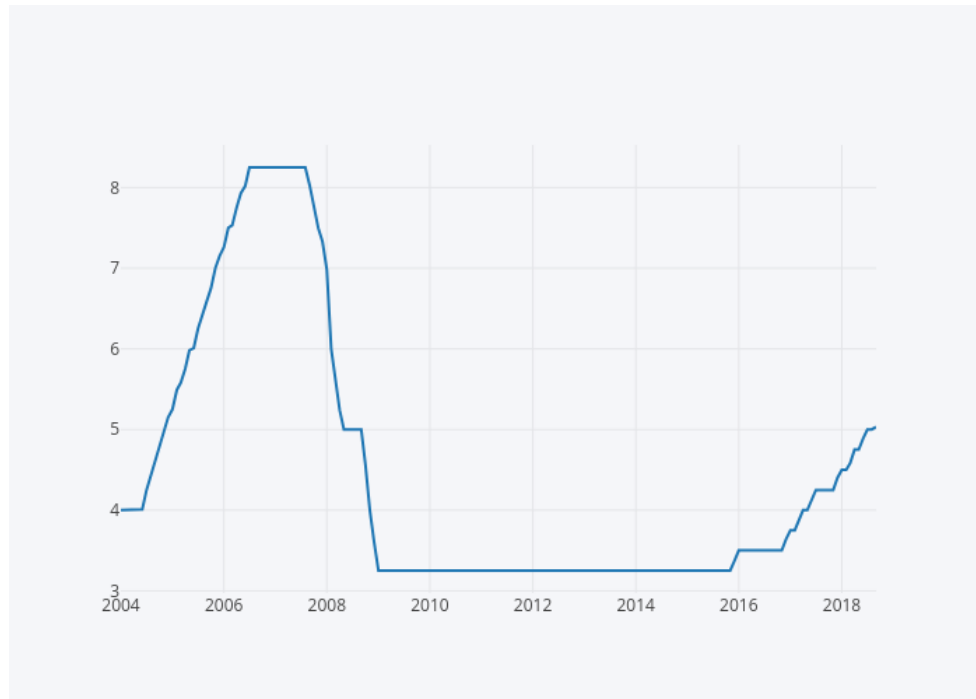


Unemployment Rate

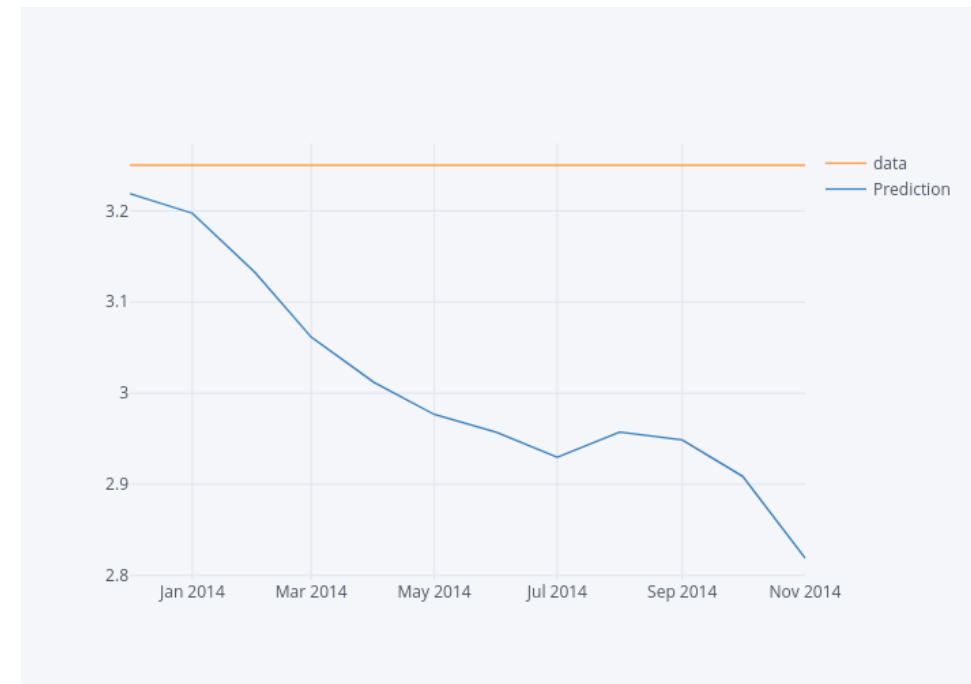


2. Forecasting Model - ARIMA model

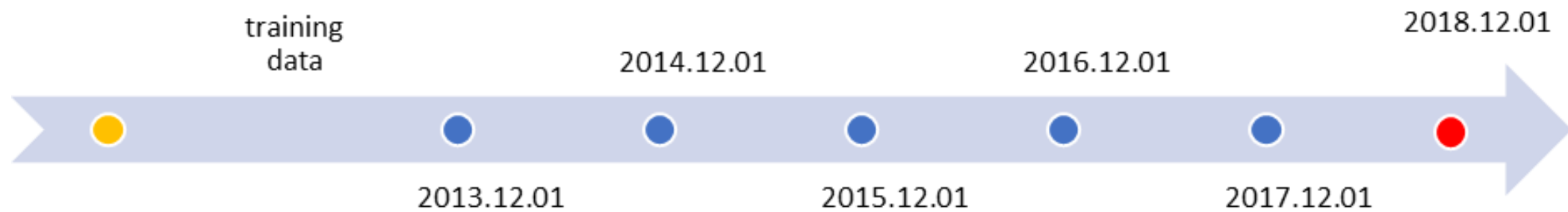
Bank Loan Prime Rate



Forecast



3. Backtesting Process



4. Investment Strategy

- ▶ conditions in addition to the investment decision rules.
- ▶ My initial investment is \$100,000 (sadly I do not have this much in real life)
- ▶ Money gains are reinvested

4. Investment Strategy

- ▶ *I only buy and sell once a year on December 1st and the 2nd.*
- ▶ Calculate 1 year average return for each of the stocks using my forecasting models
- ▶ Select top 5 stocks that has highest expected return for my portfolio
- ▶ Figure out an optimal portfolio weight by drawing efficient frontier graph and finding a maximum sharpe ratio point

4. Investment Strategy

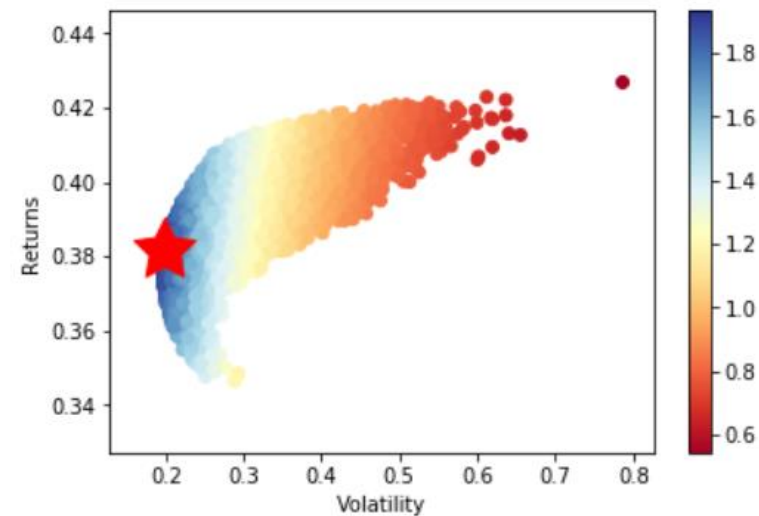
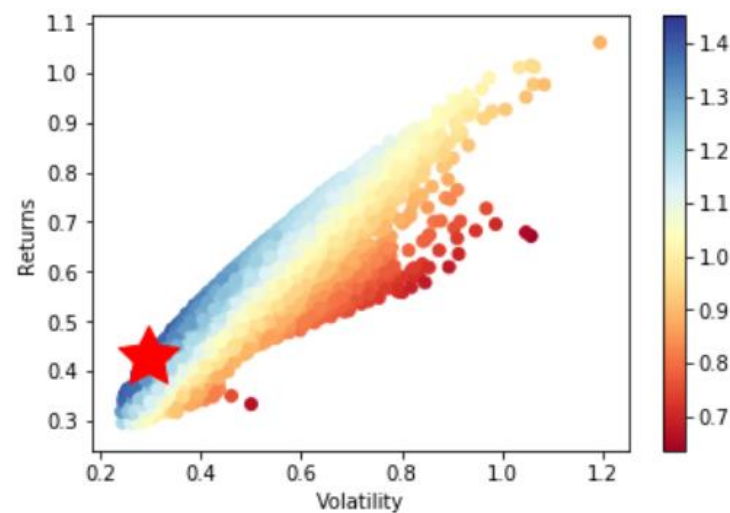
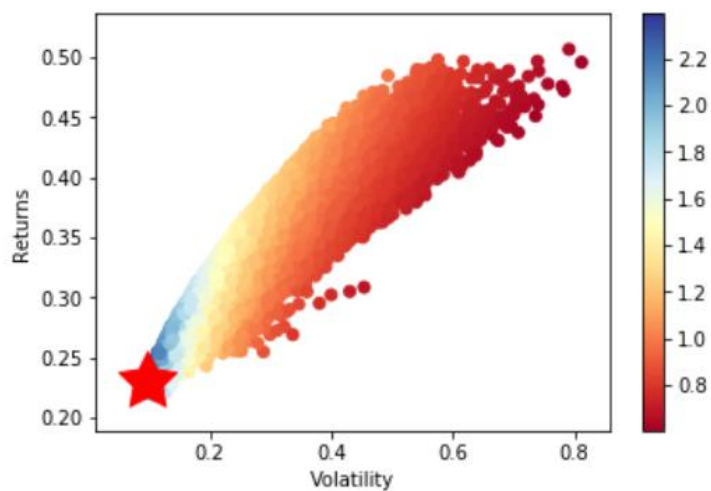
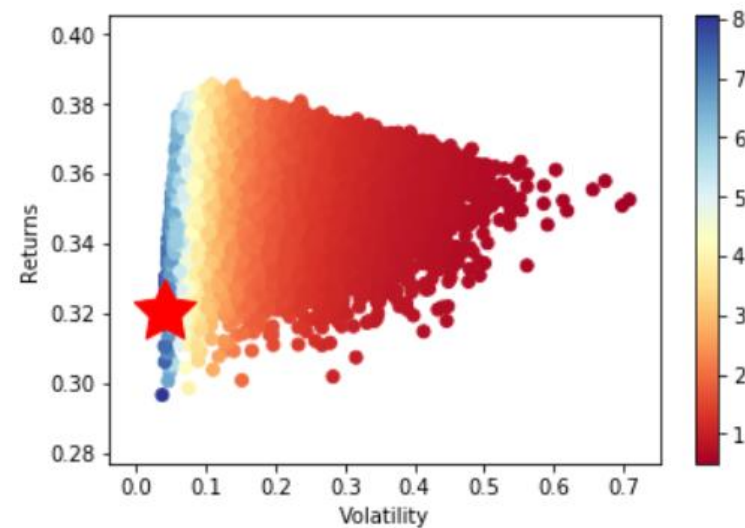
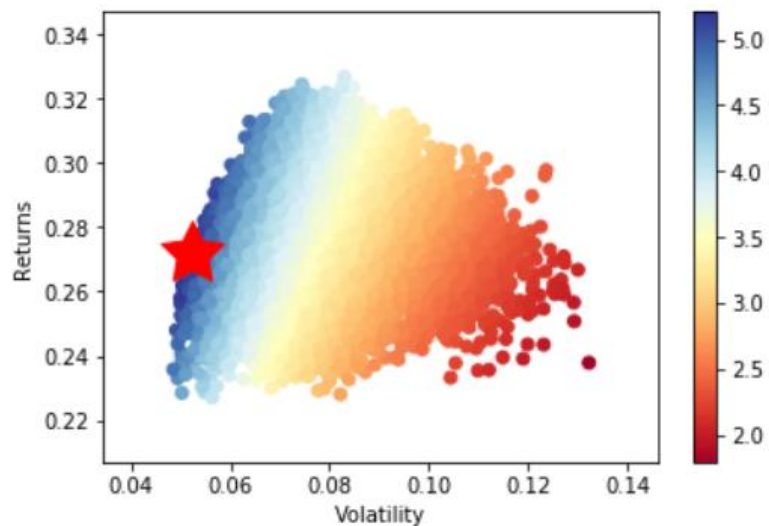
✓ make changes to my current portfolio according to the optimal portfolio calculation

1) Sell whatever I decided to sell on December 1st

2) Buy whatever I decided to buy on December 2nd

-> realize my loss or gain before buying so that I can reinvest my money if there is any gain.

5. Portfolio optimization



5. Portfolio optimization

```
ret      0.381604
stdev    0.197560
sharpe   1.931589
TRY      0.058199
HON      0.141758
AA       0.348781
AIG      0.422935
C        0.028327
Name: 14374, dtype: float64
```

```
ret      0.428975
stdev    0.295625
sharpe   1.451080
AA       0.124056
TRY      0.070883
HON      0.174574
C        0.026935
AIG      0.603552
Name: 10412, dtype: float64
```

```
ret      0.320590
stdev    0.039809
sharpe   8.053163
AA       0.031318
C        0.051973
AIG      0.374081
TRY      0.010850
BAC      0.531778
Name: 20439, dtype: float64
```

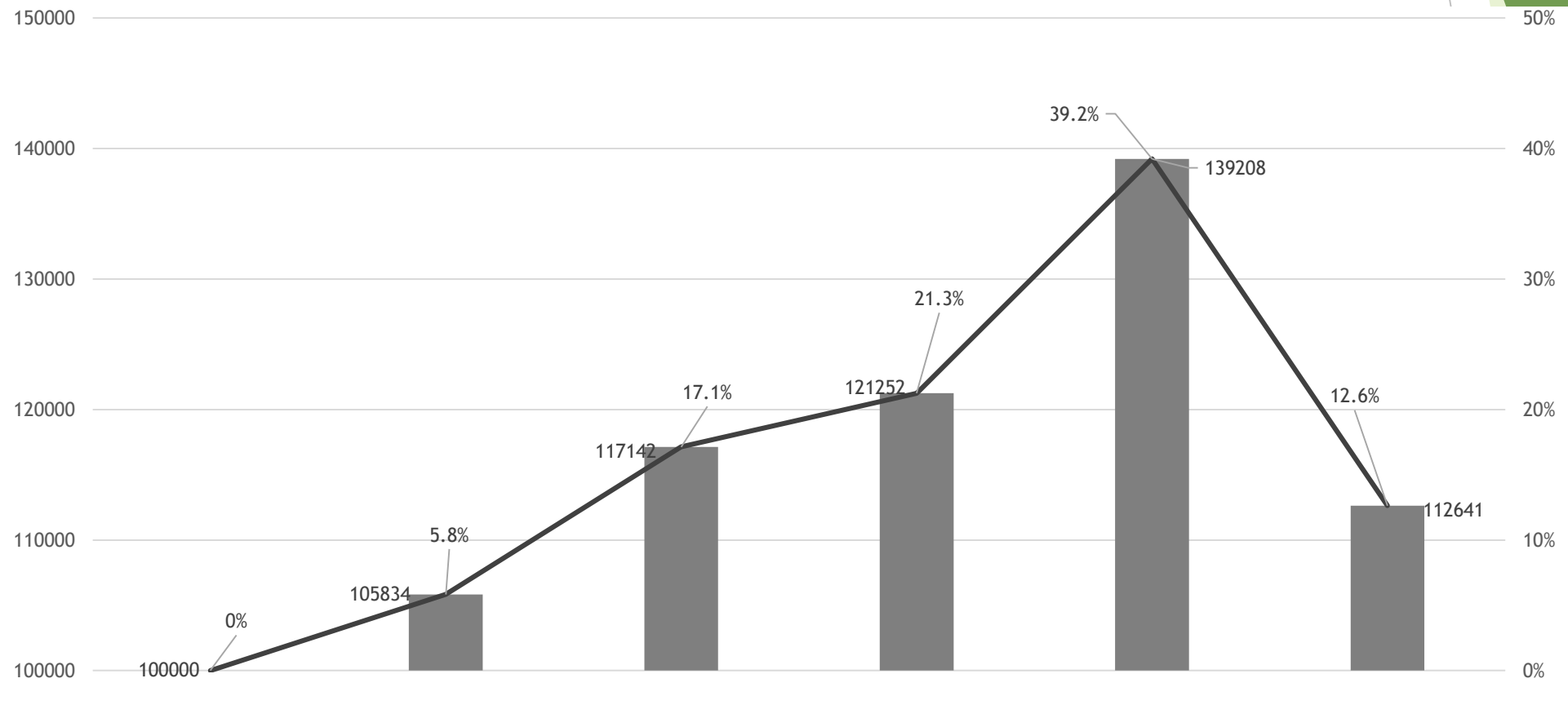
```
ret      0.271705
stdev    0.052184
sharpe   5.206664
AIG      0.054353
C        0.472458
AA       0.011174
CAT      0.027263
BAC      0.434752
Name: 10229, dtype: float64
```

```
ret      0.302727
stdev    0.125707
sharpe   2.408196
AA       0.010220
TRY      0.010207
C        0.185974
HON      0.057599
AIG      0.736000
Name: 8543, dtype: float64
```

6. Evaluation

	2013-12-01	2014-12-01	2015-12-01	2016-12-01	2017-12-01	2018-12-01
Current Portfolio (weight %)	C (47%) BAC (43%) AIG (5%) AA (0%) CAT (0%)	BAC (53%) AIG (37%) TRV (0%) C (0%) AA (0%)	AIG (74%) C (19%) HON (0%) AA (0%) TRV (0%)	AIG (60%) HON (17%) AA (12%) TRV (0%) C (0%)	AIG (42%) AA (35%) HON (14%) TRV (0%) C (0%)	X (Sell everything)
Gain	X (initial investment)	\$5,834	\$11,308	\$4,110	\$ 17,956	X
Loss	X (initial investment)	X	X	X	X	\$26,567

6. Evaluation



American International Group Inc
NYSE: AIG

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40.77 USD -2.41 (5.58%) ↓

Closed: Dec 4, 7:04 PM EST · Disclaimer
After hours 40.85 +0.080 (0.20%)

1 day 5 days 1 month 6 months YTD 1 year **5 years** Max



Alcoa Corp
NYSE: AA

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30.40 USD -1.61 (5.01%) ↓

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After hours 30.45 +0.050 (0.16%)

1 day 5 days 1 month 6 months YTD 1 year **5 years** Max



Honeywell International Inc.
NYSE: HON

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142.68 USD -6.30 (4.23%) ↓

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After hours 142.98 +0.30 (0.21%)

1 day 5 days 1 month 6 months YTD 1 year **5 years** Max



- ▶ Alcoa Shares Fall as Tariffs, Energy Costs Weigh on Forecast
- ▶ general insurance business failed to show improvement

7. Investment decision for 2019

- ▶ According to my model, optimal portfolio for 2019 is
- ▶ Alcoa Corp (60%)
- ▶ Honeywell International Inc (33%)
- ▶ Caterpillar Inc (6%)