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Graduate Program: Software Engineering

Python Course

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1 Introduction

Stock trading is one of profitable activities, in case can predict rightly most of the time. Different traders use various methods to predict it, including news to price data of companies or financial statements such as income statement, balance sheet and cash flow. Unfortunately, there is no data for investors' sentiments, attitudes, and expectations that ultimately affect stock prices. Even so, the prediction is not correct sometimes, it should provide good enough insight for trader to make right decision. In this project we will try based on financial data of companies make predictions for short and long term.

2. Dataset and Features

In order to download the raw data of individual stock from yahoo, in our case for Google, Yahoofinancials library for Python3 is used. This library is a powerful financial data module used for pulling both fundamental and technical data from Yahoo Finance. The advantage of this library is that, all methods returns data as a JSON format which is useful to share data with other systems over REST API interface or save locally in CSV files. To make more precise prediction for stock price of company in short and long term, we need to find most important metrics in Stock Fundamental Analysis. Below are key financial statements for the past years or quarters:

Income Statement – Annual/Quarterly. Show how profitable company.

Balance Sheet – Annual/Quarterly. Shows if enough cash or too much debt.

Cash Flow – Annual/Quarterly. Shows financial state, more valuable than income statement.

Stock Price Exchange – Daily. Data for past 10 years.

Below are key features retrieved from upper mentioned datasets impacting stock price which print output to console:

Stock Exchange Data Source: NasdaqGS

Currency: USD

1. Company Valuation Measures:

- a) Market CAP(company's shares outstanding * current market price of one share)
- b) PE(Price to Earnings Ratio)
- c) Price to Sales Ratio (compares a company's stock price to its revenue)

2. Stock daily trading information:

- a) Current Price
- b) Current Change
- c) Current percent change
- d) Current volume
- e) Daily Low
- f) Daily High
- g) Yearly high
- h) Yearly Low
- i) 50 day moving avg
- j) 200day moving avg
- k) Previous day close price
- 1) Open price
- m) 10days Average daily volume
- n) 30 days Average daily volume
- o) Beta(3y monthly), stock volatility(>1, risky but profitable)

3. Financial Highlights based on Income statement/Cash Flow/Balance Sheet:

- a) Interest Expense
- b) Total Operating Expense
- c) Income Tax Expense
- d) Research and Development Cost
- e) Operating Income
- f) Total Revenue
- g) Cost of Revenue

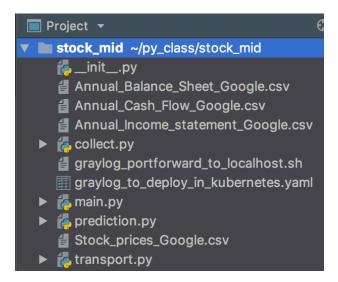
- h) Income Before Tax
- i) Gross Profit
- j) Net Income
- k) Net Income from Continuing Ops
- 1) Book Value(Net Asset=TotalAsset-IntangibleAsset(Patent,Goodwill))
- m) EBITDA(Earnings before interest,tax depreciation and amartization)
- n) Earnings per share
- 4. Dividents and splits. Currently, these values are missing in YahooFinancials dashboard as well:
 - a) Divindent Yield
 - b) Annual average Divident yield
 - c) 5y average divident yield
 - d) Dividend Rate
 - e) Annual average dividend rate
 - f) Payout Ratio
 - g) Ex Evidend Date

3. Project Architecture

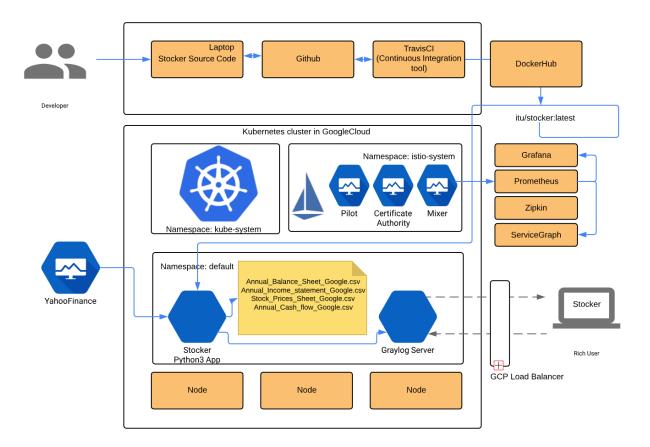
Below are key technologies used and their brief description:

- a) Kubernetes: To deploy application and Graylog2 server.
- b) Istio: Observability, Security and Networking of application.
- c) Github: To store Source Code of our application.
- d) TravisCI: To run test suite during development
- e) DockerHub: To store artifactory, docker image of our application.
- f) Graylog2: For monitoring, metrics, alert and notification of our application.
- g) Python3.7

Project Source Code Structure:



Project Low Level Design(LLD) Chart:

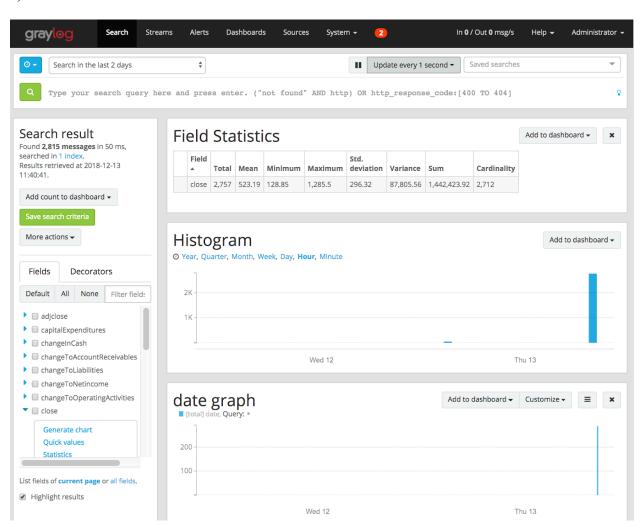


4. Realtime Monitoring

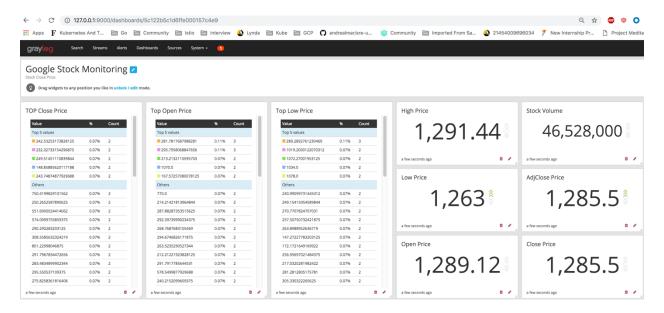
In this project industry leading open source log management platform Graylog is used as Stock monitoring. The main motivations are:

- 1. Analyze data without complete plan, prior to search.
- 2. Scalability in Google Cloud environment, enabling up to several terabytes of workload handling per day.
- 3. Search, aggregate, analyze, visualize and report high speed using Elasticsearch for storage.

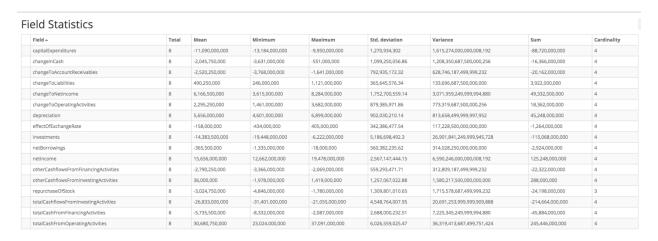
a) Metrics:

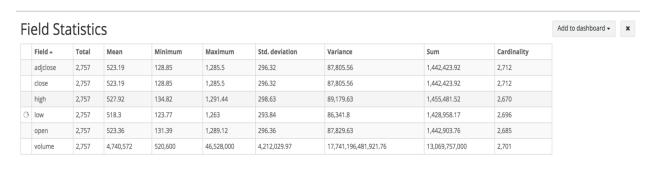


b) Dashboard:



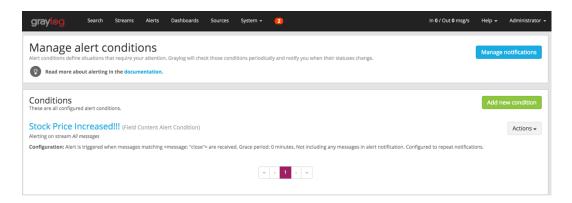
Realtime Statistics for Stock Price, Income Statement, Cash Flow and Balance Sheet:





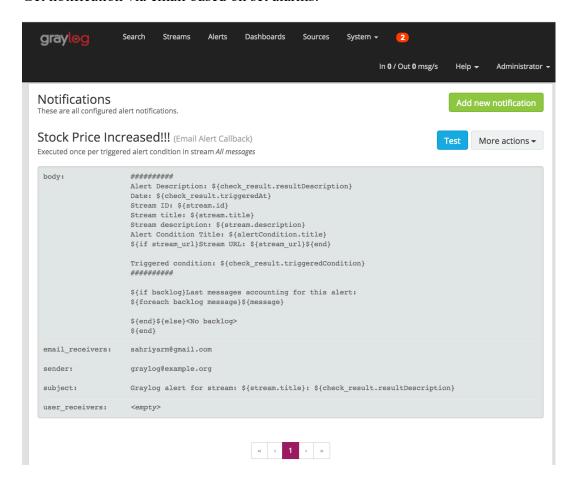
c) Alerts:

Create new alarms based on conditions that matters:



d) Notifications:

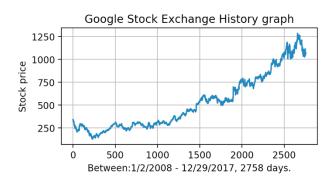
Get notification via email based on set alarms:



5. Prediction

In this step, we will do prediction based on past 10 years daily data collected for Adjclose feature and predict upcoming 60 days, assuming it is long term investment. Meantime, we generated some key features of Company which can help to make right decision. In Prediction phase steps are: Based on saved CSV file, Stock Adjacent Close Price for past 10 years Train Model, Test to measure confidence level and Predict for upcoming 2 month daily.

Console Graph Output:





Console Table Output:

Statistic Analysis:

Stock Exchange Data Source: NasdaqGS

Currency: USD

Valuation Measures

main.market CAP: 742544048128 PE(Price to Earnings Ratio): 40.287464

Price to Sales: 5.717771

Stock Measures

Current Price: 1073.54 Current Change: -0.1899414

Current percent change -0.00017689867

Current volume: 1246498 Daily Low: 1064.994

Daily High: 1088.07 Yearly high: 1291.44 Yearly Low: 984

50 day moving avg: 1069.5326 200day moving avg: 1153.7058 Previous day close price: 1073.73

Open price: 1075.67

10days Average daily volume: 1607487 30 days Average daily volume: 2064629

Beta(3y monthly), stock volatility(>1, risky but profitable): 1.330345

Financial Highlights: Income/Cash/Balance Sheet

Interest Expense: -109000000 Operating Income: 28882000000

Total Operating Expense: 81973000000

Total Revenue: 110855000000 Cost of Revenue: 45583000000 Income Before Tax: 27193000000 Income Tax Expense: 14531000000

Gross Profit 65272000000 Net Income: 12662000000

Net Income from Continuing Ops: 12662000000 Research and Development Cost: 16625000000

Book Value(Net Asset=TotalAsset-IntangibleAsset(Patent,Goodwill)): 169840000000 EBITDA(Earnings before interest,tax depreciation and amartization): 28882000000

Earnings per share: 26.646998679291404

Dividents and splits, Currently, missing in YahooFinancials as well

Divindent Yield None

Annual average Divident yield: None 5y average divident yield: None

Dividend Rate: None

Annual average dividend rate None

Payout Ratio: 0 Ex Evidend Date: -

Operation completed in: 0.03518414497375488 seconds.

confidence: 96 %

Forecast for coming 60 days:

[1192.18867397 1213.24643734 1190.61279088 1213.41802436 1215.37487671 1221.00951923 1234.27039938 1220.03326493 1235.41203456 1239.38231534 1224.9236855 1204.93698029 1191.84397379 1189.73832726 1172.33287172 1128.66790824 1140.57801907 1138.80492954 1128.54843852 1162.48487194 1155.89293886 1131.63078396 1137.34122512 1136.41134063 1148.87765111

 $1105.80464819\ 1147.16911438\ 1159.06566674\ 1099.49466619\ 1083.52153004\ 1137.67128692\ 1111.27866315\ 1104.64382294\ 1079.39233095\ 1106.52027687\ 1139.57020619\ 1115.31608767\ 1099.0491367\ 1077.8844649\ 1081.12480761\ 1078.02885659\ 1108.11807042\ 1087.81858325\ 1067.14854688\ 1067.63351168\ 1069.21279141\ 1058.94016578\ 1078.53574806\ 1084.09986338\ 1131.2968647\ 1121.66924644\ 1128.94163631\ 1137.63634299\ 1106.21565892\ 1115.6448688\ 1091.03209359\ 1082.0418146\ 1081.64192113\ 1106.90283798\ 1104.62481983]$

6. Conclusion

In this project I summarized most of our learnings from this course. It was nice experience, to learn about Python libraries and functions used, at the same time was great to know more about insights of financial data, which is key indicator for successful prediction. Hopefully, by keeping advancing project, could be rich someday ©

7. References

https://finance.yahoo.com/quote/GOOGL/key-statistics?p=GOOGL

https://github.com/JECSand/yahoofinancials

Appendix A Python3.7 Application Source Code

Main.py

```
from __future__ import print_function
import sys
import time
from yahoofinancials import YahooFinancials as YF
import collect
import prediction
DEFAULT\_ARGS = ('GOOGL')
MODULE_ARGS = ('yf', 'yahoofinancial', 'yahoofinancials')
HELP_ARGS = ('-h', '--help')
global mark
global company
mark = '-' * 64
if len(sys.argv) > 1:
     company=sys.argv[1]
else:
    company='Google'
def timeit(f, *args):
    print(mark)
    st = time.time()
    f(*args)
    et = time.time()
    print(mark)
if __name__ == '__main__':
    api = set(s for s in dir(YF) if s.startswith('get_'))
    api.update(MODULE_ARGS)
    api.update(HELP_ARGS)
    ts = sys.argv[1:]
    queries = [q for q in ts if q in api]
    ts = [t for t in ts if not t in queries] or DEFAULT_ARGS
    if [h for h in HELP_ARGS if h in queries]:
        helpapi(queries)
    elif queries:
        customapi(queries, ts)
        a=collect.Collect(ts[0] if 1 == len(ts) else ts)
        timeit(a.data_collect)
        timeit(a.print_console)
        timeit(a.save_csv)
b=prediction.Prediction()
        b.training_data()
        b.testing_data()
        b.predict_price()
```

Collect.py

```
import csv
import sys
import transport as tp
from yahoofinancials import YahooFinancials as YF
import main
class Collect:
                         (self, ticker):
            self.tick = YF(ticker)
            self.d_stock = self.tick.get_historical_price_data('2008-01-01', '2019-01-01',
            self.a_income = self.tick.get_financial_stmts('annual', 'income')
self.a_balance = self.tick.get_financial_stmts('annual', 'balance')
            self.a_cash = self.tick.get_financial_stmts('annual', 'cash')
      def data collect(self):
            try:
                   r = self.tick._cache.keys()
            else:
                  print(main.mark)
                  print(r)
      def print console(self):
            print(main.mark)
            print('Stock Exchange Data Source: ', self.tick.get_stock_exchange())
            print('Currency: ', self.tick.get_currency())
            print(main.mark)
            print(main.mark)
            print('main.market CAP: ',self.tick.get_market_cap())
            print('PE(Price to Earnings Ratio): ', self.tick.get_pe_ratio())
            print('Price to Sales: ', self.tick.get_price_to_sales())
            print(main.mark)
            print('Stock Measures')
            print(main.mark)
            print('Current Price: ',self.tick.get_current_price())
print('Current Change: ', self.tick.get_current_change())
           print('Current Change: ', self.tick.get_current_change())
print('Current percent change',self.tick.get_current_percent_change())
print('Current volume: ',self.tick.get_current_volume())
print('Daily Low: ', self.tick.get_daily_low())
print('Daily High: ', self.tick.get_daily_high())
print('Yearly high: ', self.tick.get_yearly_high())
print('Yearly Low: ', self.tick.get_yearly_low())
print('50 day moving avg: ',self.tick.get_50day_moving_avg())
print('200day moving avg: ',self.tick.get_200day_moving_avg())
print('Previous day close price: ',self.tick.get_prev_close_price())
print('Open price: ',self.tick.get_open_price())
print('10days Average daily volume:
            print('10days Average daily volume:
 ,self.tick.get_three_month_avg_daily_volume())
 print('Beta(3y monthly), stock volatility(>1, risky but profitable):
,self.tick.get_beta())
           print(main.mark)
```

```
print('Financial Highlights: Income/Cash/Balance Sheet')
           print(main.mark)
           print('Interest Expense: ',self.tick.get_interest_expense())
print('Operating Income: ', self.tick.get_operating_income())
           print('Operating Income: ', self.tick.get_operating_income())
print('Total Operating Expense: ',self.tick.get_total_operating_expense())
print('Total Revenue: ',self.tick.get_total_revenue())
print('Cost of Revenue: ',self.tick.get_cost_of_revenue())
print('Income Before Tax: ',self.tick.get_income_before_tax())
print('Income Tax Expense: ',self.tick.get_income_tax_expense())
print('Gross Profit', self.tick.get_gross_profit())
print('Net Income: ', self.tick.get_income())
print('Net Income from Continuing Ops:
 ,self.tick.get_net_income_from_continuing_ops())
  ,self.tick.get_research_and_development())
  ,self.tick.get_book_value())
  .self.tick.get ebit())
           print('Earnings per share: ',self.tick.get_earnings_per_share())
           print(main.mark)
           print(main.mark)
           print('Divindent Yield', self.tick.get_dividend_yield())
           print('Annual average Divident yield: ',self.tick.get_annual_avg_div_yield())
print('5y average divident yield: ',self.tick.get_five_yr_avg_div_yield())
           print('Dividend Rate: ',self.tick.get_dividend_rate())
           print('Annual average dividend rate',self.tick.get_annual_avg_div_rate())
           print('Payout Ratio: ',self.tick.get_payout_ratio())
           print('Ex Evidend Date: ',self.tick.get_exdividend_date())
     def save_csv(self):
           with open('Stock_prices_'+ main.company +'.csv', mode='w') as result_w:
    result = csv.writer(result_w, delimiter=',', quotechar='"',
 quoting=csv.QUOTE MINIMAL)
                  result.writerow(['Date', 'high', 'low', 'adjclose', 'close', 'open',
 volume'l)
                 for k,v in self.d_stock['G00GL'].items():
result.writerow([i['formatted_date'],i['high'],i['low'],i['adjclose'],i['close'],i['op
           with open('Annual_Income_statement_' + main.company + '.csv', mode='w') as
result_w:
                  result = csv.writer(result_w, delimiter=',', quotechar='"',
 quoting=csv.QUOTE_MINIMAL)
                  result.writerow(['Year', 'researchDevelopment', 'incomeBeforeTax',
```

```
'netIncomeApplicableToCommonShares'])
             for i in self.a_income['incomeStatementHistory']['G00GL']:
                 for k, v in i.items():
                      result.writerow(
                                    [k, v['researchDevelopment'], v['incomeBeforeTax'],
v['minorityInterest'], v['netIncome'],
                                    v['effectOfAccountingCharges'],
v['otherOperatingExpenses'], v['interestExpense'],
                                    v['extraordinaryItems'], v['nonRecurring'],
v['otherItems'], v['incomeTaxExpense'],
                                    v['totalRevenue'], v['totalOperatingExpenses'],
v['costOfRevenue'],
                                    v['totalOtherIncomeExpenseNet'],
v['discontinuedOperations'],
                                    v['netIncomeFromContinuingOps'],
v['netIncomeApplicableToCommonShares']])
        # Save Annual Balance Sheet in CSV
        with open('Annual_Balance_Sheet_' + main.company + '.csv', mode='w') as
result_w:
             result = csv.writer(result_w, delimiter=',', quotechar='"',
quoting=csv.QUOTE_MINIMAL)
             result.writerow(['Year', 'intangibleAssets', 'totalLiab',
otherLiab', 'goodWill', 'treasuryStock',
'otherAssets', 'cash', 'totalCurrentLiabilities',
 accountsPavable'l)
             for i in self.a_balance['balanceSheetHistory']['G00GL']:
                 for k, v in i.items():
                      result.writerow(
v['totalStockHotderEquity ], v['otherCulreHtLlab ],
v['totalAssets'], v['commonStock'],
v['otherCurrentAssets'], v['retainedEarnings'], v['otherLiab'],
v['goodWill'], v['treasuryStock'], v['otherAssets'],
v['cash'], v['totalCurrentLiabilities'],
v['otherStockholderEquity'].
                                   v['propertyPlantEquipment'], v['totalCurrentAssets'],
v['longTermInvestments'].
                                   v['netTangibleAssets'], v['shortTermInvestments'],
v['netReceivables'], v['longTermDebt'],
                                   v['accountsPayable']])
        with open('Annual_Cash_Flow_' + main.company + '.csv', mode='w') as result_w:
             result = csv.writer(result_w, delimiter=',', quotechar='"',
quoting=csv.QUOTE MINIMAL)
             result.writerow(['Year', 'investments', 'changeToLiabilities',
```

Transport.py

```
import requests

# Dont forget to port-forward Graylog Server to localhost if server is not running
locally
graylog_url = "http://127.0.0.1:12201/gelf"

def transport(data):
    header = {"Content-type": "application/x-www-form-urlencoded", "Accept":
"text/plain"}
    payload = "{'host':'yahoofinancials_itu.org', 'short_message':'sako'," +
str(data).replace('{', '').replace('}', '') + "}".replace('\'', '"')
    response_code=requests.post(graylog_url, data=payload, headers=header)
    if response_code == '202':
        print('Data was successfully sent to Graylog Server')
    else:
        print('Failed to sent data to Graylog Server')
```

Prediction.py

```
import pandas as pd
import numpy as np
from sklearn.linear_model import LinearRegression
from sklearn import preprocessing, svm
from sklearn.model_selection import train_test_split
import matplotlib.pyplot as plt
import datetime
import main
# Predict 60 days stock price based on close price
class Prediction:
        self.data = pd.read_csv('Stock_prices_'+main.company+'.csv', parse_dates=True)
        predict_out = int(60)
        self.data['Prediction'] = self.data[['adjclose']].shift(-predict_out)
       X = np.array(self.data.drop(['Date', 'Prediction'], 1))
       X = preprocessing.scale(X)
        self.X_forecast = X[-predict_out:]
```

```
X = X[:-predict_out]
       y = np.array(self.data['Prediction'])
       y = y[:-predict_out]
       self.X_train, self.X_test, self.y_train, self.y_test = train_test_split(X, y,
test size=0.2)
   def training_data(self):
       self.clf = LinearRegression()
       self.clf.fit(self.X train, self.y train)
   def testing_data(self):
       confidence = self.clf.score(self.X_test, self.y_test)
       self.forecast_prediction = self.clf.predict(self.X_forecast)
       print("confidence: ", int(confidence*100),'%')
print("Forecast for coming 60 days: ")
       print(main.mark)
       print(self.forecast_prediction)
   def predict_price(self):
       plt.figure(1)
       plt.subplot(221)
       plt.plot(self.data['adjclose'])
       plt.title('Google Stock Exchange History graph')
       plt.grid(True)
       plt.ylabel('Stock price')
       plt.xlabel('Between:1/2/2008 - 12/29/2017, 2758 days.')
       plt.subplot(222)
       plt.title('Google Stock Exchange Prediction graph')
       plt.grid(True)
       plt.plot(self.forecast_prediction)
       current_date=datetime.datetime.today().strftime('%Y-%m-%d')
       plt.xlabel('Starting from '+str(current_date)+' till coming 60 days.')
       plt.show()
```

Graylog Deployment File to run in Kubernetes Cluster

```
apiVersion: v1
kind: Namespace
metadata:
 name: graylog
### Graylog
apiVersion: extensions/v1beta1
kind: Deployment
metadata:
 creationTimestamp: null
 name: graylog
 namespace: graylog
spec:
 replicas: 1
  strategy: {}
  template:
    metadata:
     creationTimestamp: null
```

```
labels:
        service: graylog
    spec:
      containers:
      - env:
        - name: GRAYLOG WEB ENDPOINT URI
          value: http://127.0.0.1:9000/api
        - name: GRAYLOG_ELASTICSEARCH_HOSTS
        - name: GRAYLOG_PASSWORD_SECRET
          value: somesaltpassword
        - name: GRAYLOG ROOT PASSWORD SHA2
          value: 5D5E792708BFA15F0AB42E817B4E69379777D2722E0529DFB031C0B847DB137D
        image: graylog2/server:2.4.3-1
        name: graylog
        ports:
        - containerPort: 9000
        - containerPort: 12201
        resources: {}
      restartPolicy: Always
status: {}
apiVersion: v1
kind: Service
metadata:
  creationTimestamp: null
  labels:
   service: graylog
 name: graylog
 namespace: graylog
spec:
 ports:
  - name: "9000"
   port: 9000
 targetPort: 9000 - name: "12201"
   port: 12201
    targetPort: 12201
   service: graylog
  type: LoadBalancer
  loadBalancer: {}
apiVersion: extensions/v1beta1
kind: Deployment
metadata:
  creationTimestamp: null
  name: elasticsearch
 namespace: graylog
spec:
  replicas: 1
  strategy: {}
  template:
   metadata:
      creationTimestamp: null
      labels:
        service: elasticsearch
    spec:
```

```
containers:
      - args:
        elasticsearch
        - -Des.cluster.name=graylog
        image: elasticsearch:2
        name: elasticsearch
      resources: {}
restartPolicy: Always
status: {}
apiVersion: v1
kind: Service
metadata:
  creationTimestamp: null
  namespace: graylog
  labels:
    service: elasticsearch
 name: elasticsearch
spec:
 clusterIP: None
 ports:
  - name: headless
    port: 55555
    targetPort: 0
  selector:
    service: elasticsearch
status:
 loadBalancer: {}
apiVersion: extensions/v1beta1
kind: Deployment
metadata:
 creationTimestamp: null
 name: mongo
 namespace: graylog
spec:
 replicas: 1
 strategy: {}
template:
   metadata:
    creationTimestamp: null
    labels:
        service: mongo
    spec:
      containers:
      - image: mongo:3
  name: mongo
      resources: {}
restartPolicy: Always
status: {}
apiVersion: v1
kind: Service
metadata:
  creationTimestamp: null
  labels:
    service: mongo
 name: mongo
```

```
namespace: graylog
spec:
    clusterIP: None
    ports:
    - name: headless
        port: 55555
        targetPort: 0
    selector:
        service: mongo
status:
    loadBalancer: {}
---
```

Graylog port-forward to localhost shell script

```
#!/bin/bash
# port-forward graylog
NAMESPACE=${1:-graylog}
export POD=$(kubectl -n $NAMESPACE get pod -l service=graylog -o
jsonpath='{.items[0].metadata.name}')
kubectl port-forward --namespace $NAMESPACE $POD 9000:9000 &
kubectl port-forward --namespace $NAMESPACE $POD 12201:12201
```

Appendix B Google Daily Stock Prices

```
Date, high, low, adjclose, close, open, volume
2018-12-
03,1135.0,1111.72998046875,1116.3599853515625,1116.3599853515625,1132.1600341796875,28
76600
2018-12-
04,1114.239990234375,1060.780029296875,1062.469970703125,1062.469970703125,1112.989990
234375,2281500
2018-12-
06,1079.4200439453125,1042.47998046875,1078.0799560546875,1078.0799560546875,1045.0,23
71800
2018-12-
07,1085.030029296875,1039.3699951171875,1046.5799560546875,1046.5799560546875,1072.229
98046875,2134100
10,1059.5999755859375,1033.0,1053.1800537109375,1053.1800537109375,1042.93994140625,16
82600
2018-12-
11,1070.4000244140625,1050.0999755859375,1061.6500244140625,1061.6500244140625,1066.93
994140625,1692600
2018-12-
12,1091.72998046875,1071.969970703125,1073.72998046875,1073.72998046875,1077.079956054
6875,1447400
```

Appendix C Google Annual Income Statement

```
researchDevelopment
                                incomeBeforeTax
                                                   minorityInterest
                                                                      netIncome
effectOfAccountingCharges sellingGeneralAdministrative
                                                           grossProfit
                                                                           ebit
                                                              extraordinaryItems
operatingIncome
                   otherOperatingExpenses interestExpense
nonRecurring
              otherItems incomeTaxExpense totalRevenue
                                                              totalOperatingExpenses
costOfRevenue totalOtherIncomeExpenseNet discontinuedOperations
netIncomeFromContinuingOps netIncomeApplicableToCommonShares
           16625000000
                          27193000000
                                                                19765000000
12/31/17
                                             12662000000
                               28882000000
                                                 -109000000
                                                                      14531000000
65272000000
               28882000000
110855000000 81973000000
                             45583000000
                                            -1689000000
                                                               12662000000
12662000000
12/31/16
           13948000000
                          241500000000
                                             19478000000
                                                                17470000000
55134000000
               23716000000
                               23716000000
                                                 -124000000
                                                                      4672000000
90272000000
               66556000000
                               35138000000
                                              434000000
                                                            19478000000
                                                                            19478000000
12/31/15
           12282000000
                          19651000000
                                             16348000000
                                                                15183000000
46825000000
               19360000000
                               19360000000
                                                 -104000000
                                                                      3303000000
                               28164000000
                                              291000000
                                                            16348000000
                                                                            16348000000
74989000000
               55629000000
           9832000000 17259000000
                                         14136000000
                                                           13982000000
                                                                           40688000000
12/31/14
16874000000
               16874000000
                                  -101000000
                                                      3639000000
```

Appendix D Google Annual Balance Sheet

```
Year, intangibleAssets, totalLiab, totalStockholderEquity, otherCurrentLiab, totalAssets, co
mmonStock,otherCurrentAssets,retainedEarnings,otherLiab,goodWill,treasuryStock,otherAs
sets, cash, totalCurrentLiabilities, deferredLongTermAssetCharges, otherStockholderEquity,
propertyPlantEquipment,totalCurrentAssets,longTermInvestments,netTangibleAssets,shortT
ermInvestments, netReceivables, longTermDebt, accountsPayable
2017-12-
31,2692000000,44793000000,152502000000,10651000000,197295000000,40247000000,2983000000
,113247000000,16641000000,16747000000,-
992000000,3352000000,10715000000,24183000000,680000000,-
992000000,42383000000,124308000000,7813000000,133063000000,91156000000,18705000000,394
3000000,3137000000
2016-12-
31,3307000000,28461000000,139036000000,5851000000,167497000000,36307000000,3175000000,
105131000000,7770000000,16468000000,-
2402000000,2202000000,12918000000,16756000000,383000000,—
2402000000,34234000000,105408000000,5878000000,119261000000,73415000000,15632000000,39
35000000,2041000000
2015-12-
31,3847000000,27130000000,120331000000,4327000000,147461000000,32982000000,1590000000,
89223000000,5825000000,15869000000,-
1874000000,3432000000,15409000000,19310000000,251000000,—
1874000000,29016000000,90114000000,5183000000,100615000000,565170000000,13459000000,199
5000000,1931000000
2014-12-
31,4607000000,25327000000,103860000000,2803000000,129187000000,28767000000,2637000000,75066000000,5320000000,15599000000,270000000,3363000000,16585000000,167790000000,1760000
00,27000000,23883000000,78656000000,30790000000,83654000000,46048000000,9974000000,2992
000000,1715000000
```

Appendix E Google Annual Cash Flow

```
Year, investments, changeToLiabilities, totalCashflowsFromInvestingActivities, netBorrowin
{\sf gs,totalCashFromFinancingActivities,changeToOperatingActivities,netIncome,changeInCash}
, repurch as e0 fS tock, effect 0 fExchange Rate, total Cash From 0 per ating Activities, depreciation, and the second 
otherCashflowsFromInvestingActivities, changeToAccountReceivables, otherCashflowsFromFin
ancingActivities, changeToNetincome, capitalExpenditures
2017-12-31,-19448000000,1121000000,-31401000000,-86000000,-
8298000000, 3682000000, 12662000000, -2203000000, -
4846000000,405000000,37091000000,6899000000,1419000000,-3768000000,-
3366000000,8284000000,-13184000000
2016-12-31,-18229000000,333000000,-31165000000,-1335000000,-
8332000000,2420000000,19478000000,-3631000000,-3693000000,-
170000000,36036000000,6100000000,-1978000000,-2578000000,-3304000000,7158000000,-
10212000000
2015-12-31,-13635000000,246000000,-23711000000,-23000000,-
4225000000,1618000000,16348000000,-1798000000,-1780000000,-
434000000,26572000000,5024000000,75000000,-2094000000,-2422000000,5609000000,-
2014-12-31,-6222000000,261000000,-21055000000,-18000000,-
2087000000,1461000000,14136000000,-551000000,-1780000000,-
433000000,23024000000,4601000000,628000000,-1641000000,-2069000000,3615000000,-
11014000000
```