

model

April 14, 2019

```
In [1]: import pandas as pd
import xgboost as xgb
import matplotlib.pyplot as plt
from sklearn.metrics import accuracy_score
import heapq

In [2]: #Preprocessing
col_to_drop = ['fin_neg', 'fin_neu', 'fin_pos', 'fin_subheading', 'fin_title', 'news_kids',
               'news_pos', 'news_score', 'news_title', 'news_url', 'reddit_domain', 'reddit_neg',
               'reddit_num_comments', 'reddit_pos', 'reddit_score', 'reddit_title',
               'symbol', 'tweet_favorites', 'tweet_hashtags',
               'tweet_neg', 'tweet_neu', 'tweet_pos', 'tweet_retweets', 'tweet_text', 'asset_name']

col_to_drop_crypto = ['fin_neg', 'fin_neu', 'fin_pos', 'fin_subheading', 'fin_title', 'news_kids',
                      'news_pos', 'news_score', 'news_title', 'news_url', 'reddit_domain', 'reddit_neg',
                      'reddit_num_comments', 'reddit_pos', 'reddit_score', 'reddit_title',
                      'symbol', 'tweet_favorites', 'tweet_hashtags',
                      'tweet_neg', 'tweet_neu', 'tweet_pos', 'tweet_retweets', 'tweet_text', 'asset_name']

def preprocessing(stock_pair):
    df = stock_pair["data"].drop(columns = col_to_drop,axis=1)
    df = df.astype(float)
    for col in df.columns:
        df[col] = df[col].fillna(df[col].mean())
    return df

def preprocessing_crypto(crypto_pair):
    df = crypto_pair["data"].drop(columns = col_to_drop_crypto,axis=1)
    df = df.astype(float)
    for col in df.columns:
        df[col] = df[col].fillna(df[col].mean())
    return df

In [3]: def create_predictors(df):
    predictors = pd.DataFrame({"sma20":df.open.rolling(window=20).mean()})
    predictors["sma40"] = df.open.rolling(window=40).mean()
    predictors["sma20_1"] = predictors.sma20.shift(1)
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predictors["sma20_increment"] = predictors.sma20.diff()
predictors["sma20_1_increment"] = predictors.sma20_1.diff()
predictors["sma40_increment"] = predictors.sma40.diff()
predictors["vol_increment"] = df.volume.diff()
predictors["vol_rel_increment"] = df.volume.diff() / df.volume
predictors["open_1"] = df.open.shift(1)
predictors["open_incr"] = df.open - df.open.shift(1)
predictors["open"] = df.open
predictors['ema20'] = df.open.ewm(span=20,adjust=False).mean()
predictors["ema20_1"] = predictors.ema20.shift(1)
predictors["ema20_increment"] = predictors.ema20.diff()
predictors['ema40'] = df.open.ewm(span=40,adjust=False).mean()
predictors["ema40_1"] = predictors.ema40.shift(1)
predictors["ema40_increment"] = predictors.ema40.diff()
predictors["ema40_1_increment"] = predictors.ema40_1.diff()
predictors["high"] = df.high
predictors["low"] = df.low
predictors["close"] = df.close
predictors['fin_compound'] = df.fin_compound
predictors['news_compound'] = df.news_compound
predictors['reddit_compound'] = df.reddit_compound
predictors['tweet_compound'] = df.tweet_compound
return predictors.dropna()

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def create_predictors_crypto(df):
    predictors = pd.DataFrame({"sma20":df.open.rolling(window=20).mean()})
    predictors["sma40"] = df.open.rolling(window=40).mean()
    predictors["sma20_1"] = predictors.sma20.shift(1)
    predictors["sma20_increment"] = predictors.sma20.diff()
    predictors["sma40_increment"] = predictors.sma40.diff()
    predictors["sma20_1_increment"] = predictors.sma20_1.diff()
    predictors["vol_increment"] = df.volumefrom.diff()
    predictors["vol_rel_increment"] = df.volumefrom.diff() / df.volumefrom
    predictors["open_1"] = df.open.shift(1)
    predictors["open_incr"] = df.open - df.open.shift(1)
    predictors["open"] = df.open
    predictors['ema20'] = df.open.ewm(span=20,adjust=False).mean()
    predictors['ema40'] = df.open.ewm(span=40,adjust=False).mean()
    predictors["ema20_increment"] = predictors.ema20.diff()
    predictors["ema40_1"] = predictors.ema40.shift(1)
    predictors["ema40_increment"] = predictors.ema40.diff()
    predictors["ema40_1_increment"] = predictors.ema40_1.diff()
    predictors["high"] = df.high
    predictors["low"] = df.low
    predictors["close"] = df.close
    predictors['fin_compound'] = df.fin_compound
    predictors['news_compound'] = df.news_compound

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predictors['reddit_compound'] = df.reddit_compound
predictors['tweet_compound'] = df.tweet_compound
return predictors.dropna()

```

In [4]: *#Create target test and training*

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def create_test_target(Predictors):
    target = pd.DataFrame({"value":Predictors.sma20.shift(-1) - Predictors.sma20}).dropna()
    X = pd.merge(Predictors, target,left_index=True,right_index=True)[Predictors.columns]
    y = pd.merge(Predictors, target,left_index=True,right_index=True)[target.columns]
    train_samples = int(X.shape[0] * 0.65)
    X_train = X.iloc[:train_samples]
    X_test = X.iloc[train_samples:]

    y_train = y.iloc[:train_samples]
    y_test = y.iloc[train_samples:]

    return target,X_train,X_test,y_train,y_test

```

In [5]: *#Creating the model*

```

n_estimators = [150, 200, 250, 450, 500, 550, 1000]
max_depth = [1,2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12]

def model(target,X_train,X_test,y_train,y_test):
    def getBinary(val):
        if val>0:
            return 1
        else:
            return 0

    y_test_binary = pd.DataFrame(y_test["value"].apply(getBinary))

    best_depth = 0
    best_estimator = 0
    max_score = 0

    for n in n_estimators:
        for md in max_depth:
            model = xgb.XGBRegressor(gamma=0.0,n_estimators=n,base_score=0.7,colsamplebytree=1)
            xgbModel = model.fit(X_train,y_train.value.apply(getBinary))
            y_predicted = model.predict(X_test)
            y_predicted_binary = [1 if yp >=0.5 else 0 for yp in y_predicted]
            score = accuracy_score(y_test_binary, y_predicted_binary)
            if score > max_score:
                max_score = score
                best_depth = md
                best_estimator = n
                best_y_predicted_binary = y_predicted_binary

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        best_model = xgbModel
    #     print("Best score is " + str(max_score) + " at depth of " + str(best_depth) + " a
    return y_test_binary,best_y_predicted_binary,max_score,best_model

In [6]: #To merge the predicted values with the original dataframe
def merge_original(y_test_binary,y_predicted_binary,stock_pair):
    y_test_binary['predicted'] = y_predicted_binary
    merged = pd.merge(stock_pair['data'], y_test_binary,left_index=True,right_index=True)
    return merged

In [7]: #Reading the data files
df_stock = pd.read_json("C:\\Users\\rishb\\tradespace\\Code\\Data_Collection\\Hourly-P
df_crypto = pd.read_json("C:\\Users\\rishb\\tradespace\\Code\\Data_Collection\\Hourly-P

In [8]: #For stocks
stock_sybmol_list=['WMT', 'US1.MSFT', 'US1.HD', 'US2.GOOG', 'US2.AAPL', 'US1.WFC',
                  'US1.CVX', 'US1.KO', 'US1.XOM']
stock_name_list = ['Walmart', 'Microsoft', 'Home_Depot',
                  'Alphabet', 'Apple', 'Wells_Fargo',
                  'Chevron', 'Coca-Cola',
                  'Exxon_Mobil']

mylist = list()

for stock,stock_name in zip(stock_sybmol_list,stock_name_list):
    stock = {"stock_name":stock_name, "data": df_stock[df_stock['symbol']==stock]}
    stock["data"]=stock["data"].set_index("created_utc")
    mylist.append(stock)

total_acc = 0
for dict1 in mylist:
    df = preprocessing(dict1)
    Predictors = create_predictors(df)
    target,X_train,X_test,y_train,y_test = create_test_target(Predictors)
    y_test_binary,y_predicted_binary,acc,xgbModel = model(target,X_train,X_test,y_train)
    fig = plt.figure(figsize=(6,6))
    plt.xticks(rotation='vertical')
    plt.bar([i for i in range(len(xgbModel.feature_importances_))], xgbModel.feature_i
    plt.show()
    print(dict1['stock_name'],acc)
    merged = merge_original(y_test_binary,y_predicted_binary,dict1)
    merged['accuracy'] = acc
    total_acc+=acc
    dict1['acc']=acc
    dict1['feature_importance']=xgbModel.feature_importances_.tolist()
    dict1['merged'] = merged
    dict1['stock_name'] = dict1['stock_name']+"_with_predicted"

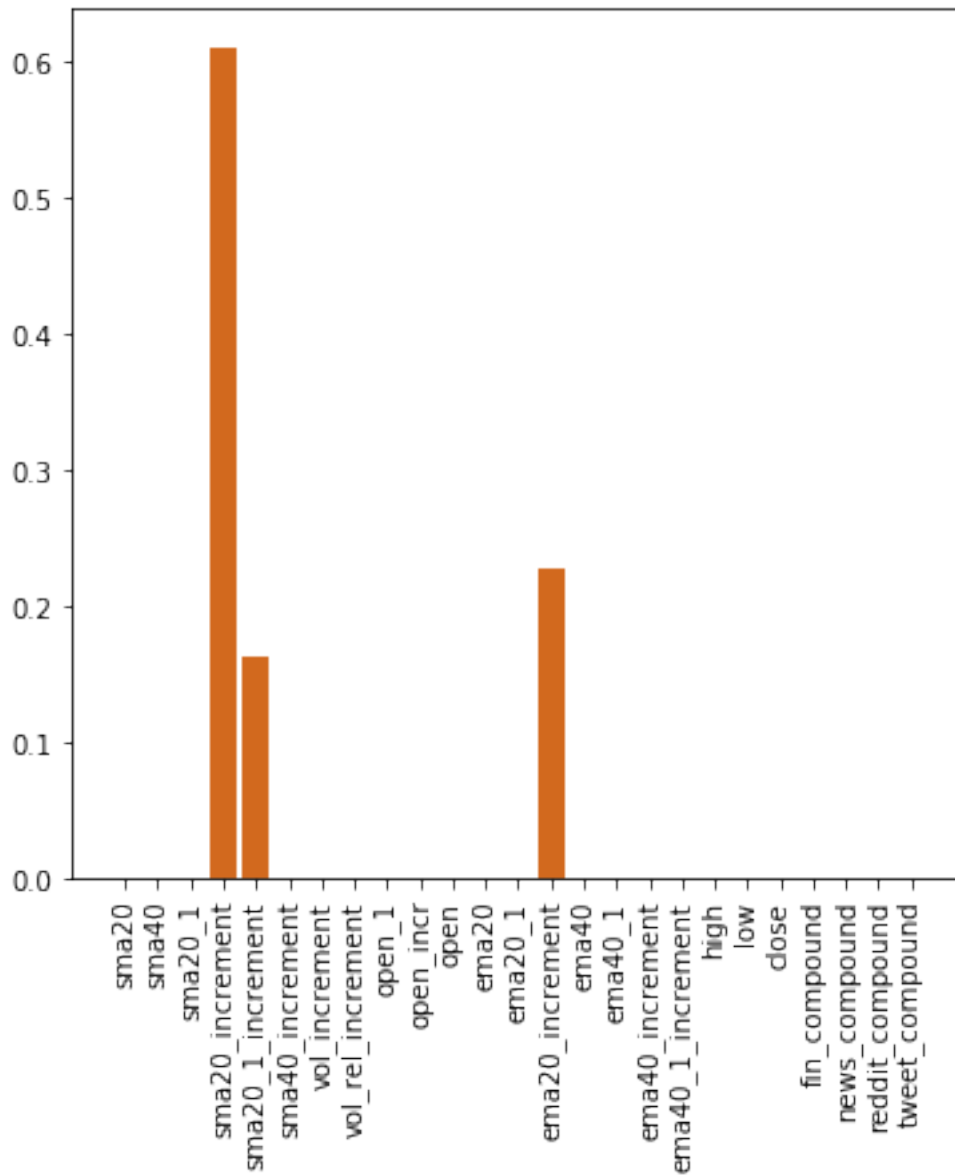
```

```
# dict1["merged"].reset_index().to_json(save_path+dict1['stock_name']+'.json',orien
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print("The average accuracy for stocks is: {}".format(total_acc/9))
```

[illegible]

[illegible]



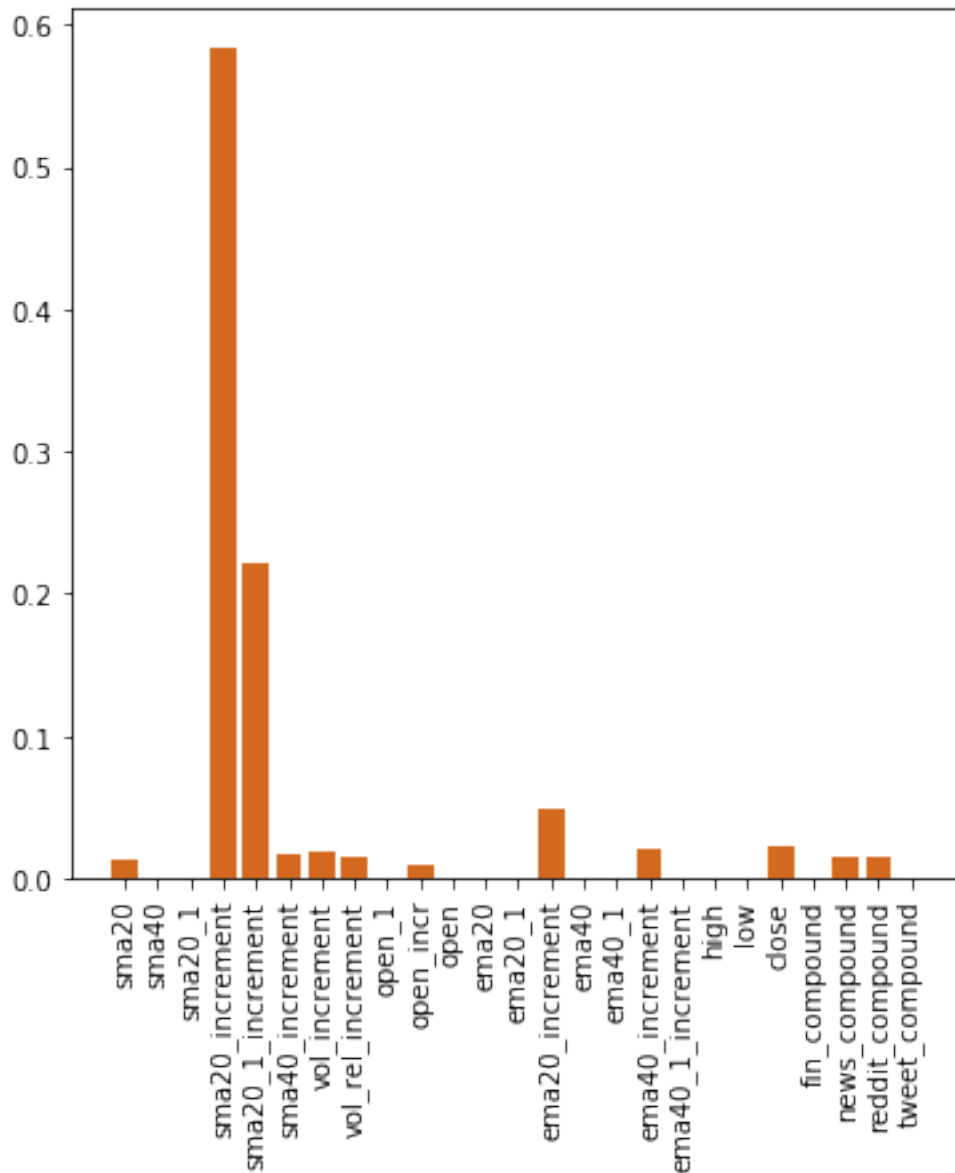
Walmart 0.9343971631205674

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C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is
  if getattr(data, 'base', None) is not None and \
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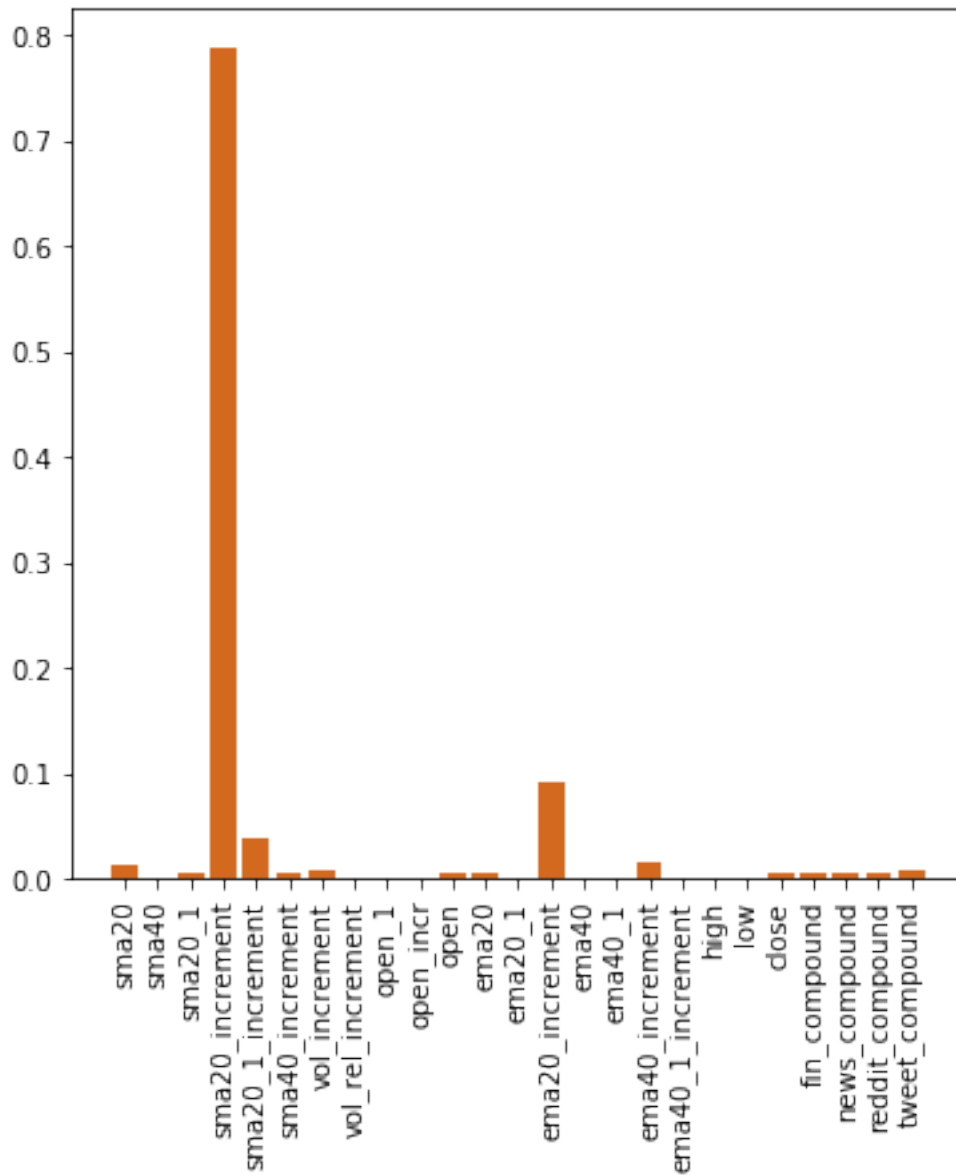
Microsoft 0.9095744680851063

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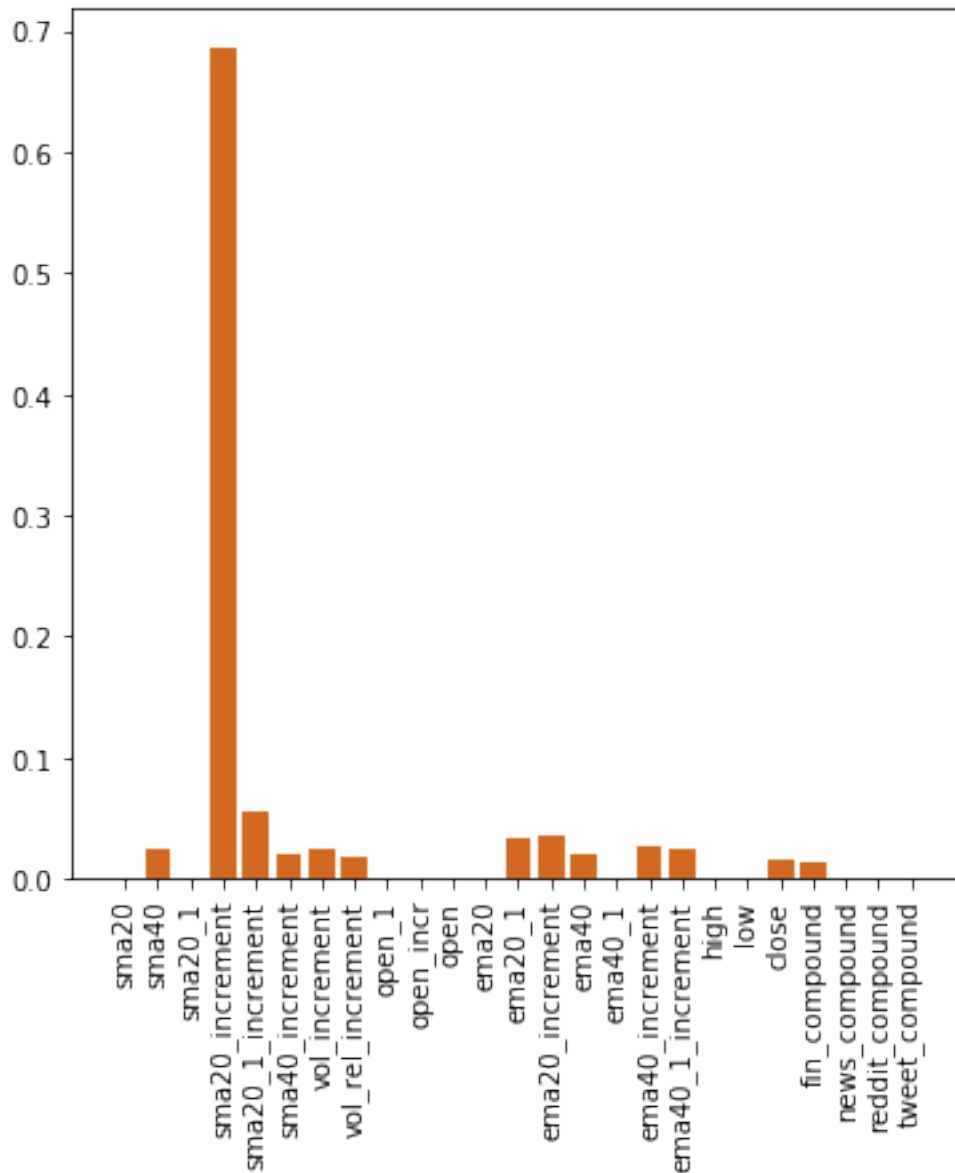
Home_Depot 0.8812056737588653

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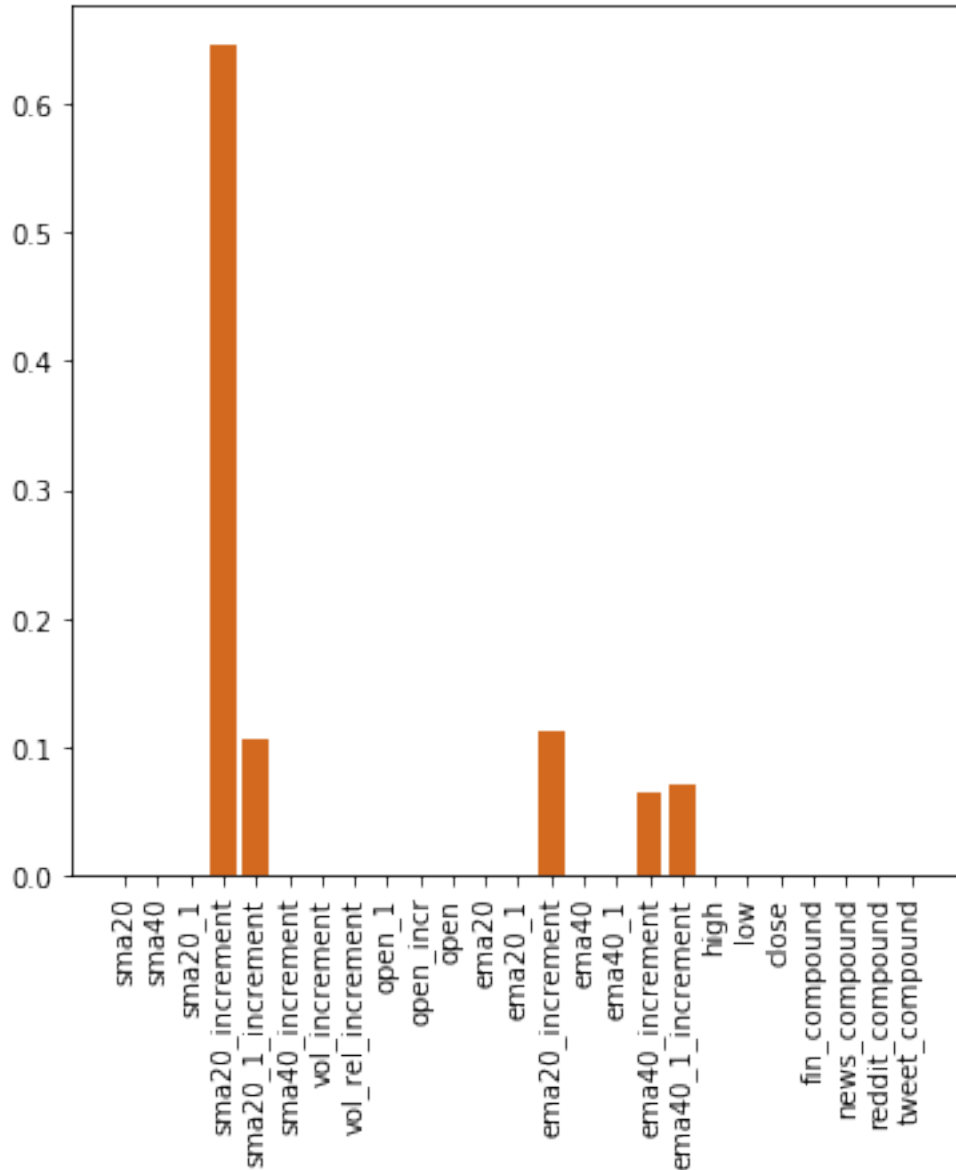


Alphabet 0.9148936170212766

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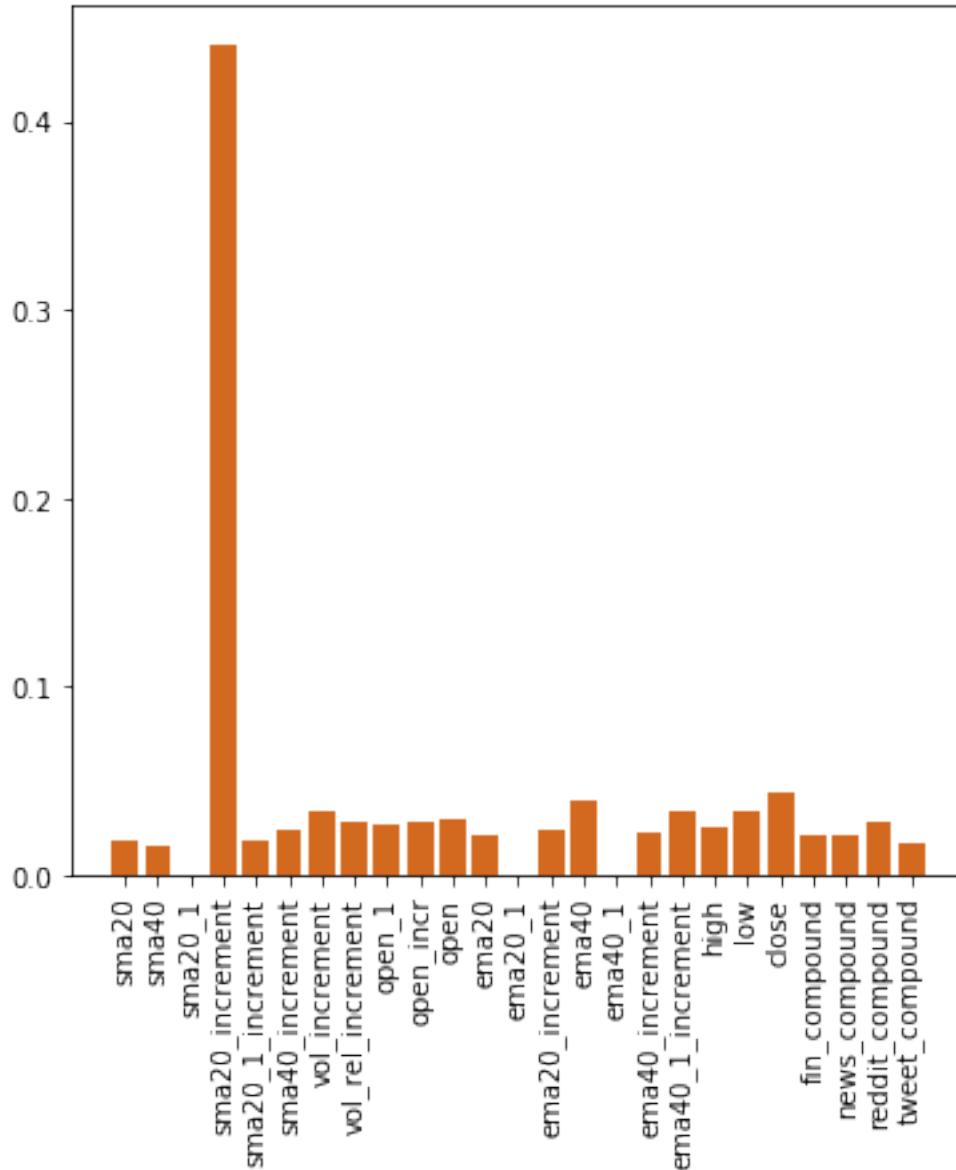


Apple 0.9095744680851063

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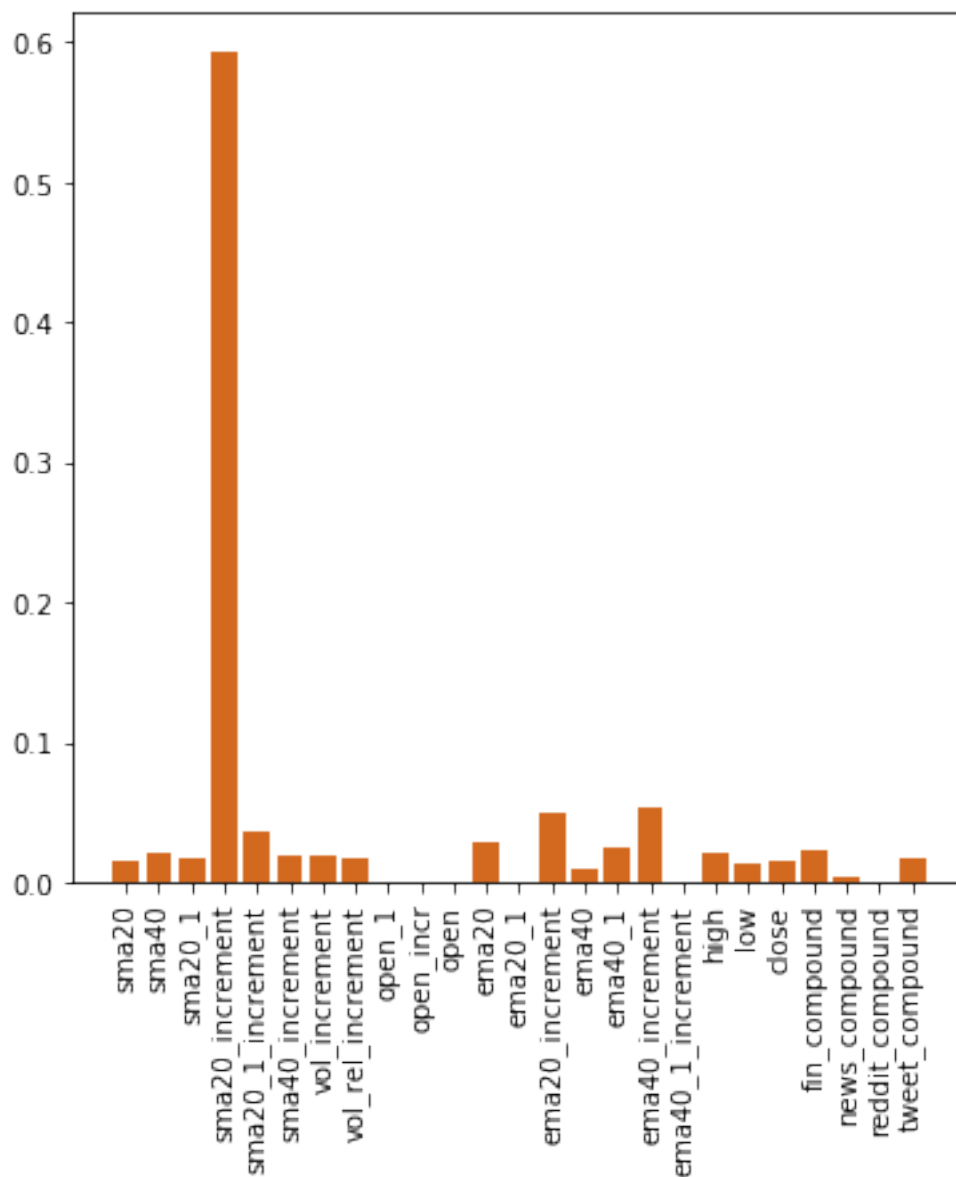
Wells_Fargo 0.8918439716312057

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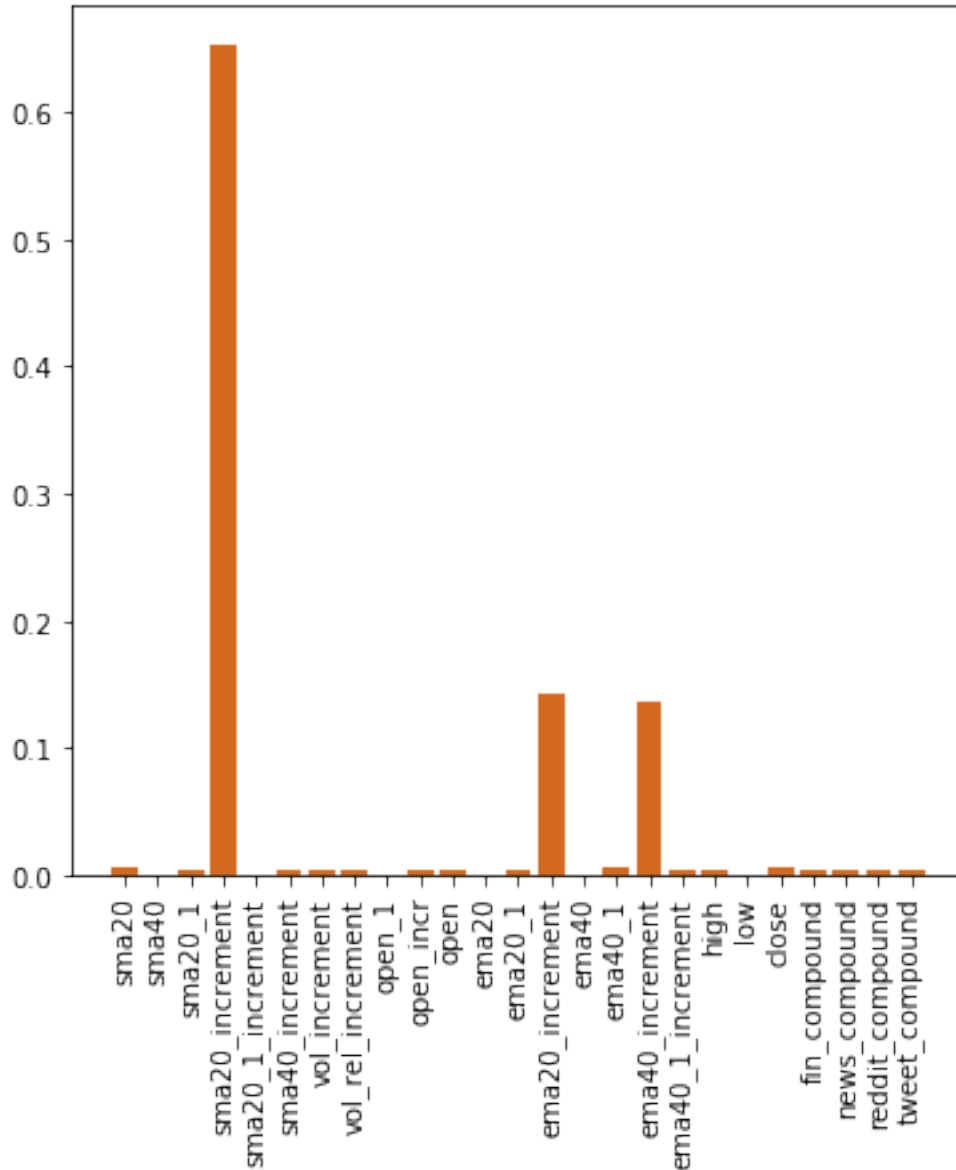
Chevron 0.9148936170212766

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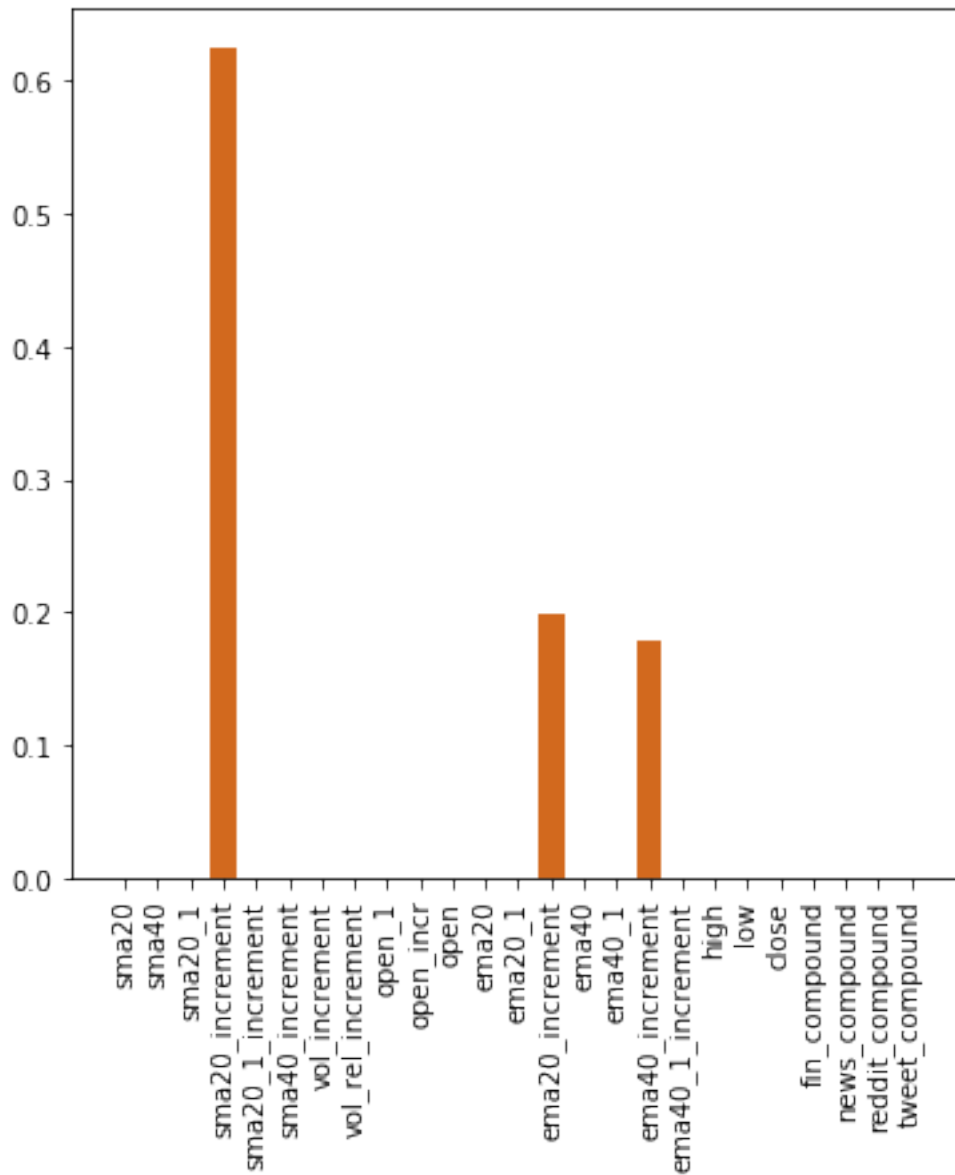


Coca-Cola 0.9131205673758865

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Exxon_Mobil 0.9219858156028369

The average accuracy for stocks is: 0.9101654846335696

In []:

```
In [9]: crypto_symbol_list=['BNB', 'BTC', 'EOS', 'LTC', 'XLM', 'TRX', 'XRP', 'BCH', 'ETH']
        ]
        crypto_name_list = ['Binance_Coin',
                             'Bitcoin',
                             'EOS',
```

```

'Litecoin',
'Stellar',
'TRON',
'XRP',
'Bitcoin_Cash'
# , 'Ethereum'
]

mylist_crypto = list()

for crypto, crypto_name in zip(crypto_symbol_list, crypto_name_list):
    crypto = {"crypto_name": crypto_name, "data": df_crypto[df_crypto['symbol']==crypto_name]}
    crypto["data"] = crypto["data"].set_index("created_utc")
    mylist_crypto.append(crypto)

save_path = "C:\\Users\\rishb\\predicted_crypto\\"

#n_estimators = [150, 200, 250, 450, 500, 550, 1000]
#max_depth = [1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12]

total_acc_crypto = 0
for dict1 in mylist_crypto:
    df = preprocessing_crypto(dict1)
    Predictors = create_predictors_crypto(df)
    target, X_train, X_test, y_train, y_test = create_test_target(Predictors)
    y_test_binary, y_predicted_binary, acc, xgbModel = model(target, X_train, X_test, y_train)
    merged = merge_original(y_test_binary, y_predicted_binary, dict1)
    merged['accuracy'] = acc
    fig = plt.figure(figsize=(6,6))
    plt.xticks(rotation='vertical')
    plt.bar([i for i in range(len(xgbModel.feature_importances_))], xgbModel.feature_importances_)
    plt.show()
    print(dict1['crypto_name'], acc)
    dict1['acc'] = acc
    dict1['feature_importance'] = xgbModel.feature_importances_.tolist()
    dict1['merged'] = merged
    dict1['crypto_name'] = dict1['crypto_name'] + "_with_predicted"
    total_acc_crypto += acc
# dict1["merged"].reset_index().to_json(save_path+dict1['crypto_name']+'.json', orient='index')

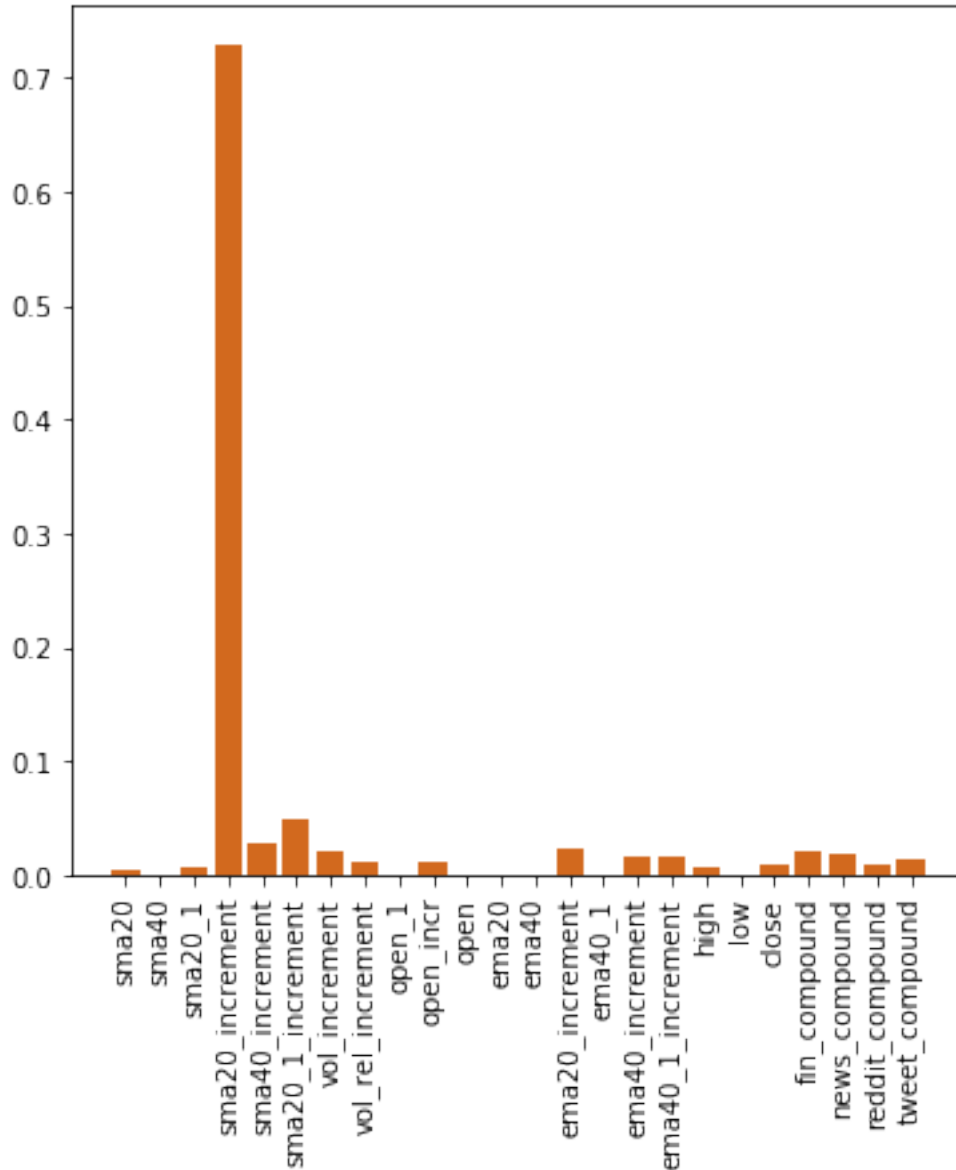
print("Average cryptocurrency accuracy={}".format(total_acc_crypto/8))

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```

Binance_Coin 0.8941427699816962

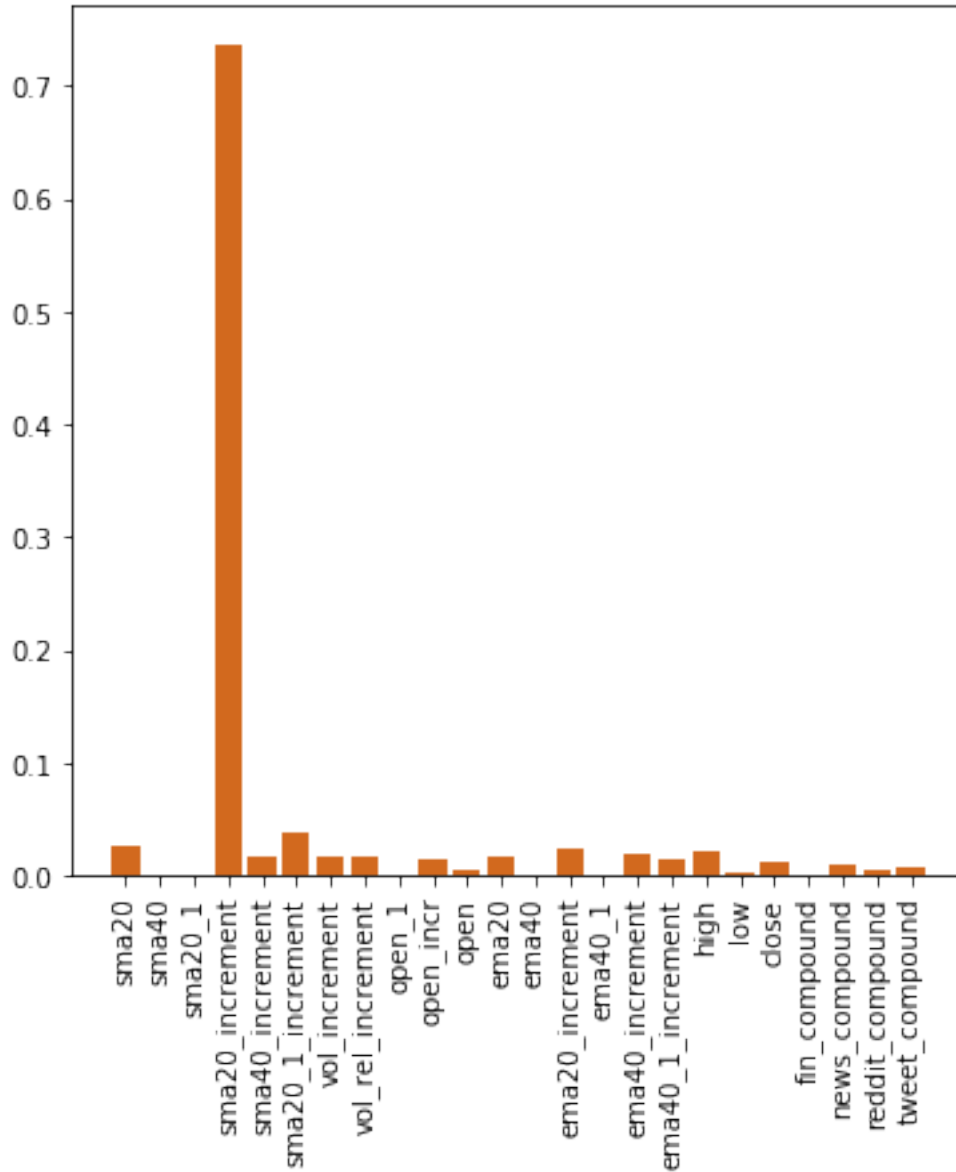
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[illegible]

[illegible]

[illegible]

[illegible]



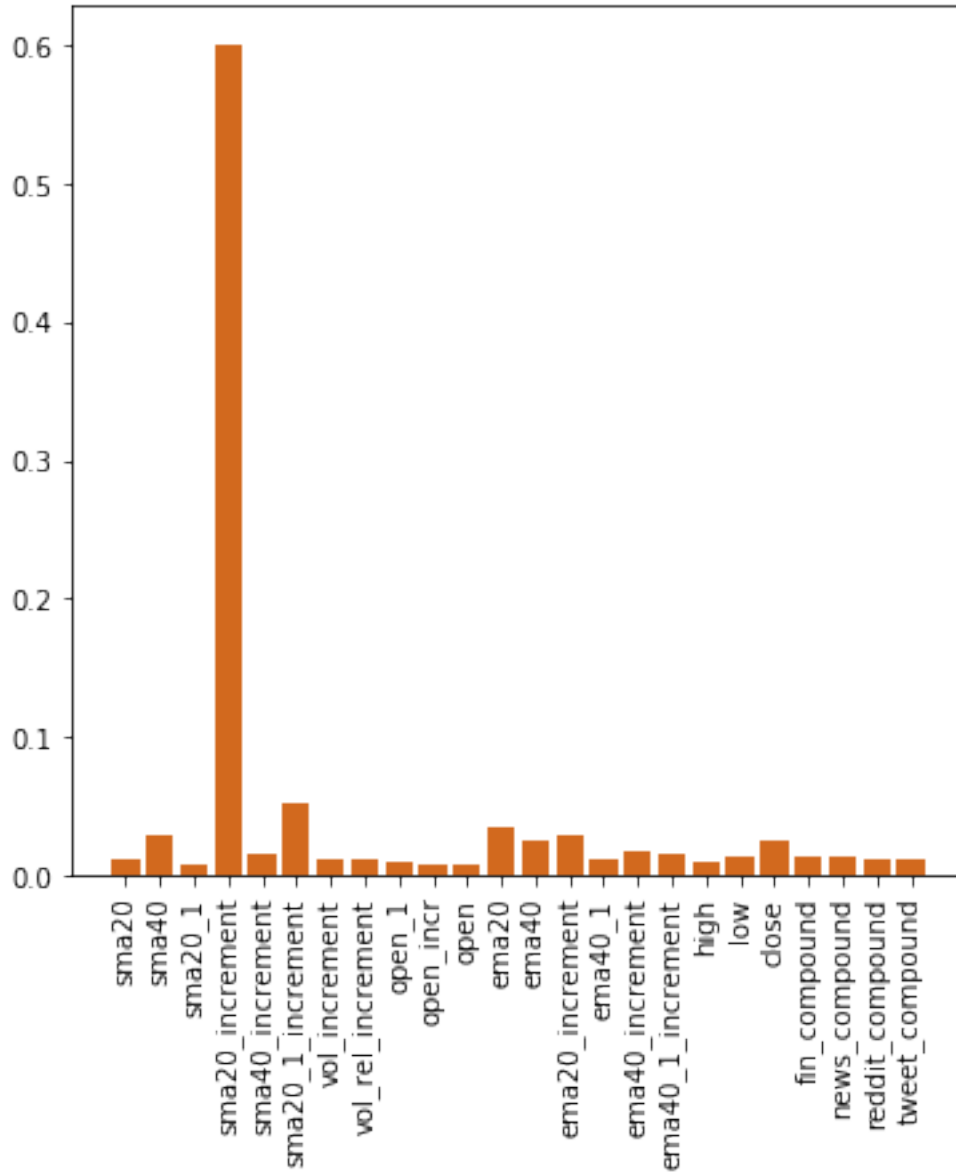
Bitcoin 0.8691275167785235

```
C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is
  if getattr(data, 'base', None) is not None and \
C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is
  if getattr(data, 'base', None) is not None and \
C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is
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C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is
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```

[illegible]

[illegible]

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C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is
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```

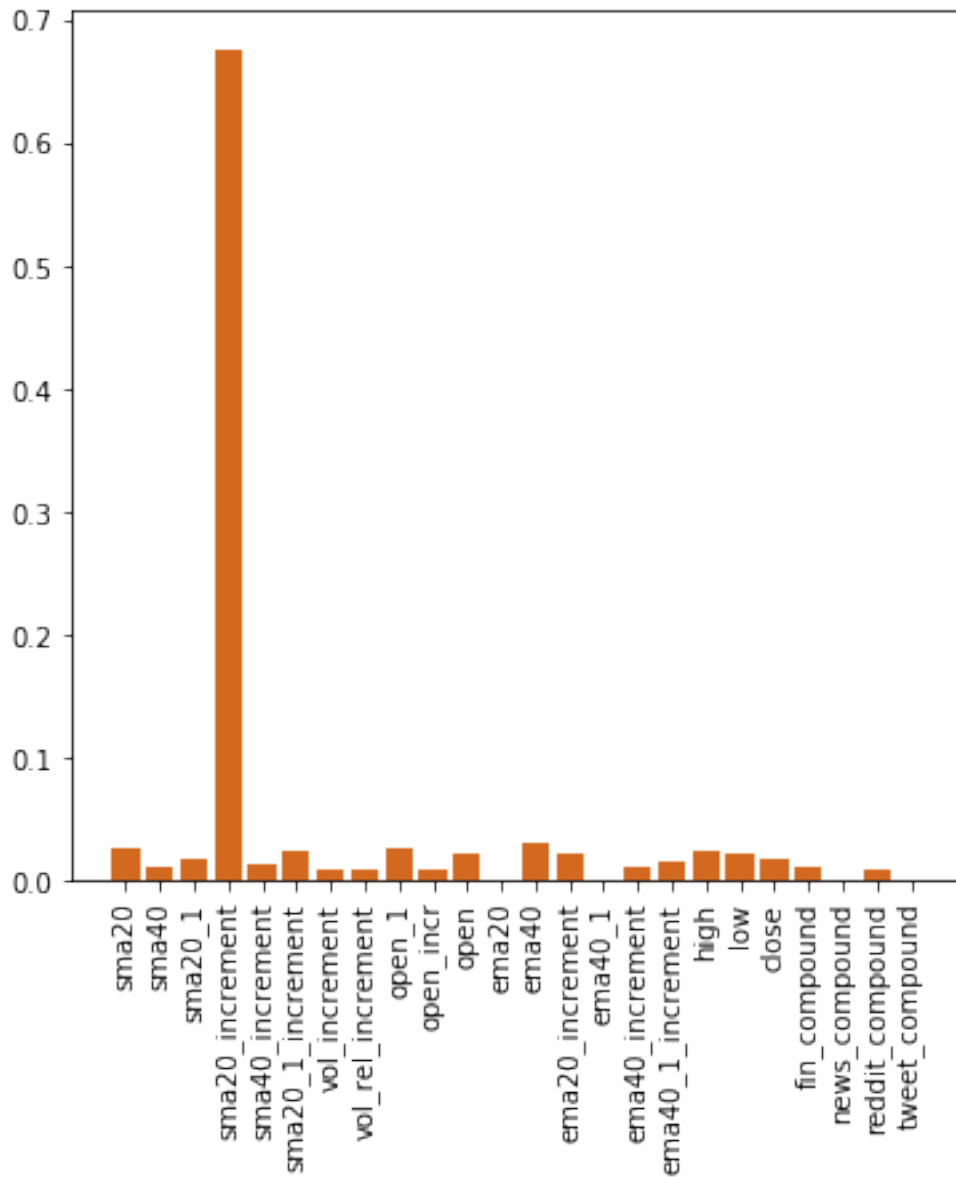
EOS 0.8912529550827423

```
C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is
  if getattr(data, 'base', None) is not None and \
C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is
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[illegible]

[illegible]

[illegible]



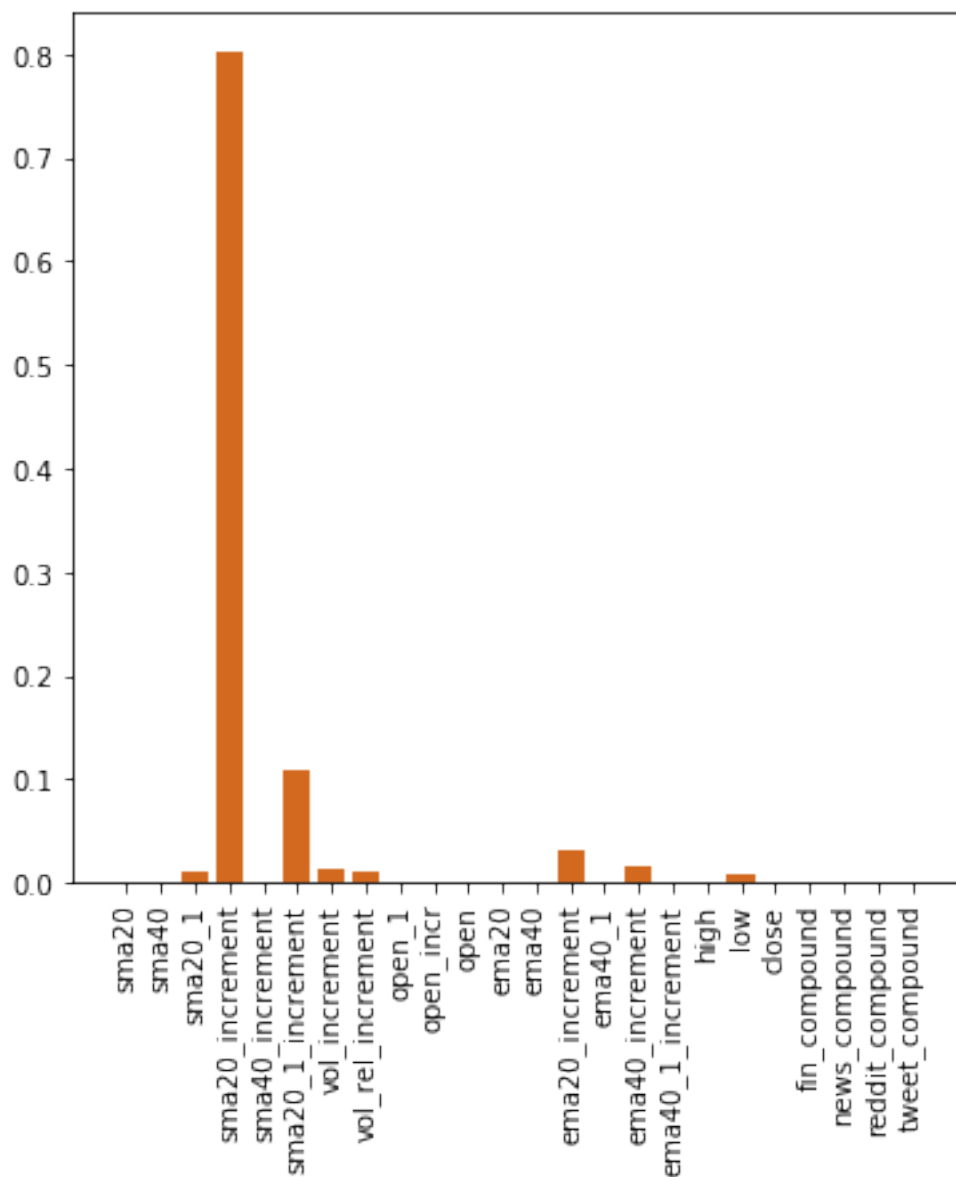
Litecoin 0.8996032956972841

```
C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is
  if getattr(data, 'base', None) is not None and \
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```


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C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is
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```

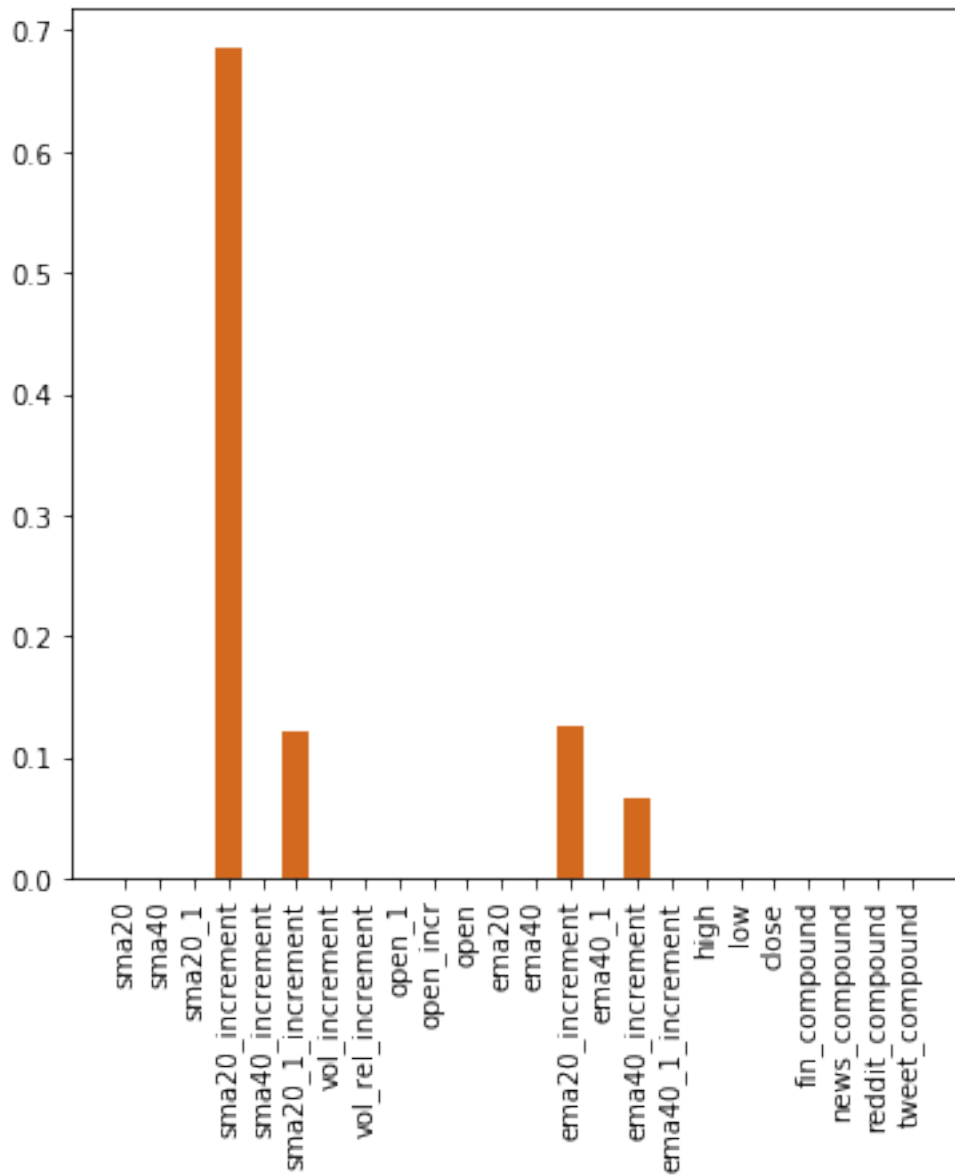


Stellar 0.9026004728132387

```
C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is
  if getattr(data, 'base', None) is not None and \
C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is
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C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is
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C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is
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C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is
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C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is
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C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is
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```



TRON 0.8883632923368022

C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is if getattr(data, 'base', None) is not None and \

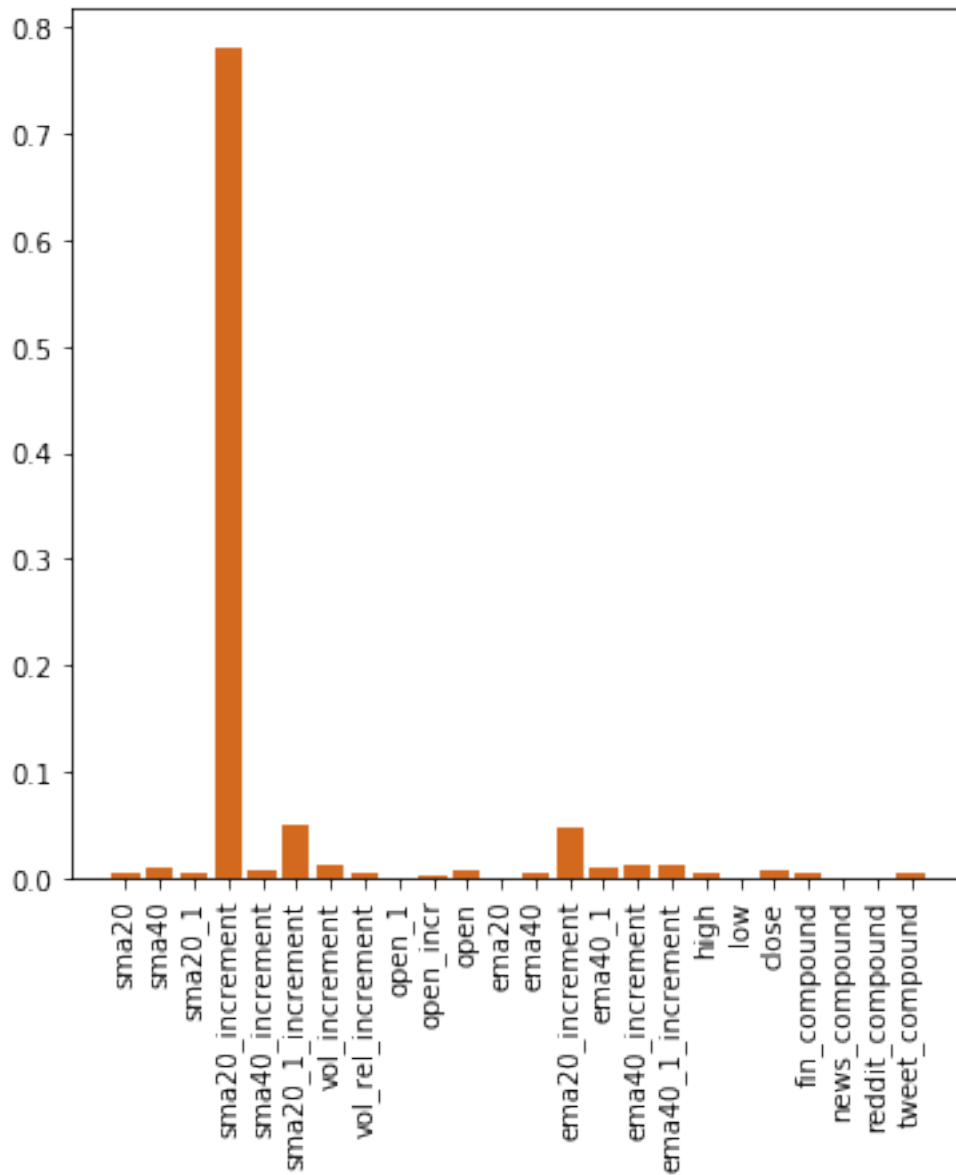
C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is if getattr(data, 'base', None) is not None and \

C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is if getattr(data, 'base', None) is not None and \

C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is if getattr(data, 'base', None) is not None and \

[illegible]

[illegible]



XRP 0.8826106000876041

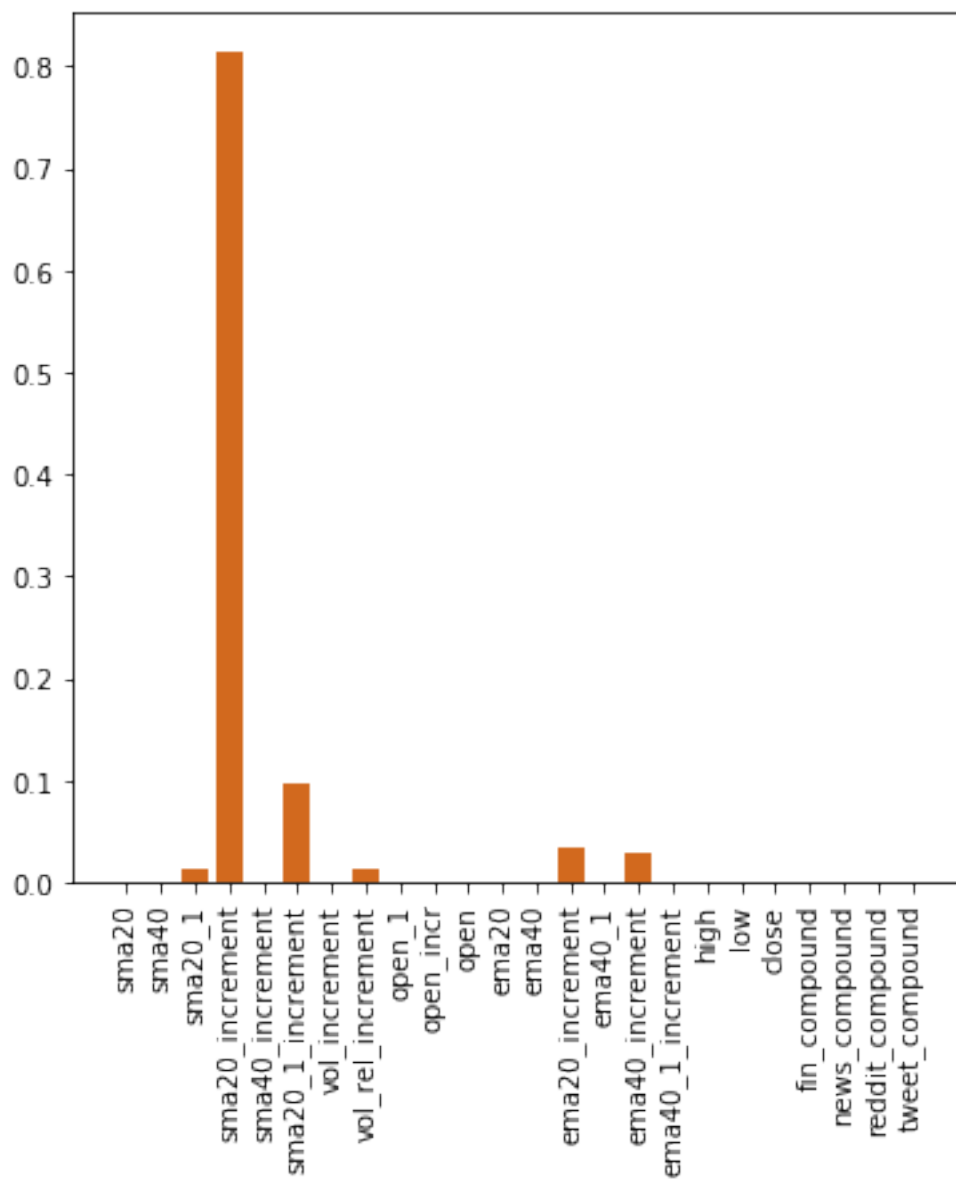
```
C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is
  if getattr(data, 'base', None) is not None and \
C:\Users\rishb\Anaconda64\lib\site-packages\xgboost\core.py:587: FutureWarning: Series.base is
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```

[illegible]

[illegible]

[illegible]

[illegible]



Bitcoin_Cash 0.8552546744036106

Average cryptocurrency accuracy=0.8853694471476877

In [43]: *#Feature Analysis*

```
s = list()
```

```
c = list()
```

```
for d in mylist:
```

```
    s.append(d['feature_importance'])
```

```
for d in mylist_crypto:
```

```

c.append(d['feature_importance'])

feat_imp_stock = [sum(e)/len(e) for e in zip(*l)]
feat_imp_crypto = [sum(e)/len(e) for e in zip(*c)]
features = ['sma20', 'sma40', 'sma20_1', 'sma20_increment', 'sma20_1_increment', 'sma40_increment']
features_crypto = ['sma20', 'sma40', 'sma20_1', 'sma20_increment', 'sma40_increment']
feature_dict_stock = {k:v for k,v in zip(features,feat_imp_stock)}
feature_dict_crypto= {k:v for k,v in zip(features_crypto,feat_imp_crypto)}

print(heapq.nlargest(5, feature_dict_stock.items(), key=lambda i: i[1]))
print(heapq.nsmallest(5, feature_dict_stock.items(), key=lambda i: i[1]))
print(heapq.nlargest(5, feature_dict_crypto.items(), key=lambda i: i[1]))
print(heapq.nsmallest(5, feature_dict_crypto.items(), key=lambda i: i[1]))
fig = plt.figure(figsize=(6,6))
plt.xticks(rotation='vertical')
plt.bar([i for i in range(len(feat_imp_stock))], feat_imp_stock, tick_label=features,
plt.title("Average feature importance for stocks")
plt.show()

fig = plt.figure(figsize=(6,6))
plt.xticks(rotation='vertical')
plt.bar([i for i in range(len(feat_imp_crypto))], feat_imp_crypto, tick_label=features,
plt.title("Average feature importance for cryptocurrencies")
plt.show()

[('open_1', 0.002971383018626107), ('sma20_1', 0.0030296132641120087), ('ema40_1', 0.003488029
[('ema40_1', 0.002608428359963), ('reddit_compound', 0.004455432062968612), ('open_1', 0.00447

```