

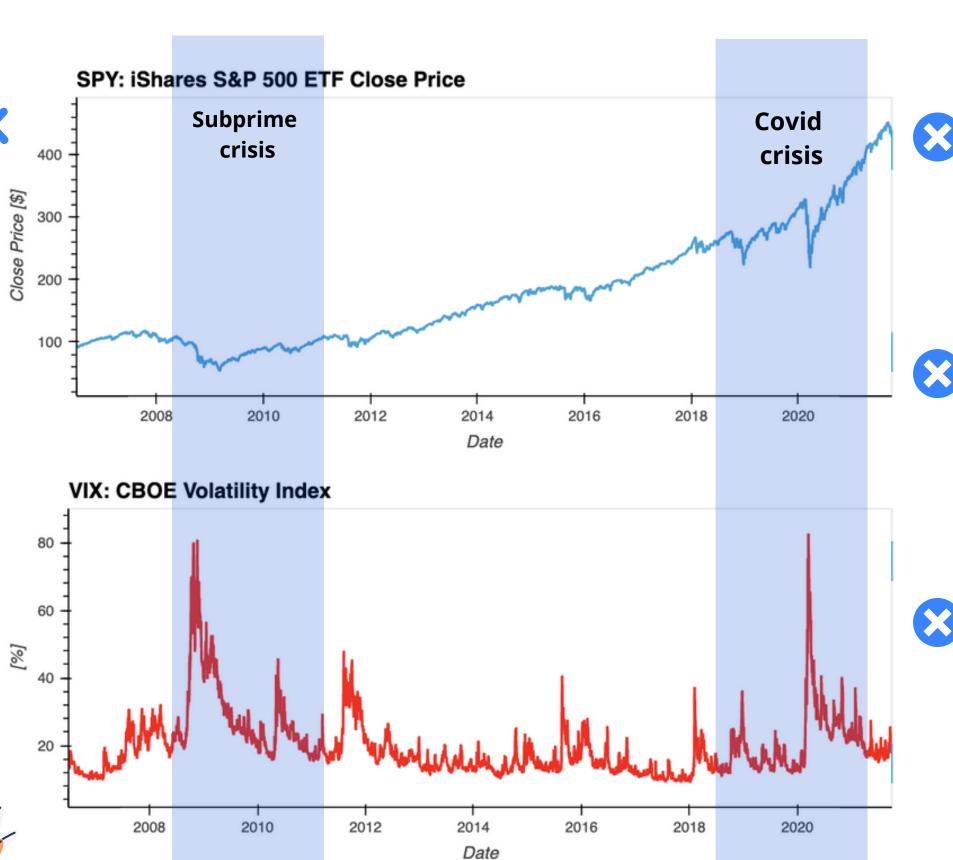
"It is far better to do the right thing wrong than to do the wrong thing right"



VIX: the Fear Index

5%
Average
Daily
Change





What is the VIX?

Forward indicator of the expected volatility of the S&P500.

Why?

It moves fast and have large daily changes.

What you are going to listen?

How we construct a tool to predict the VIX for daily trades using ML

Meet the Team





PAOLA CARVAJAL

Project Lead/ Model Design



AHMED MOHAMED

Data Analysis / Coding



SANGRAM SINGH

Data Collection/ Model Design



DOREEN NGO

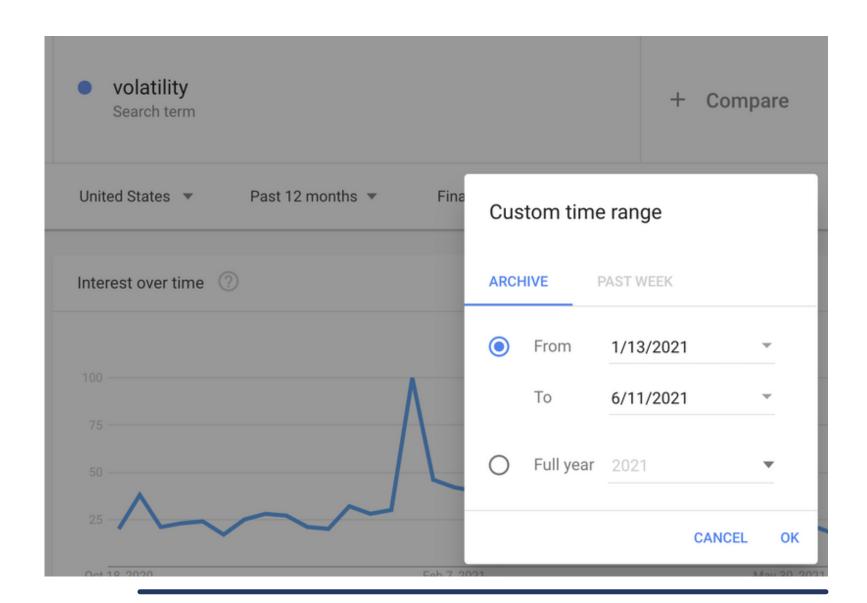
Data Collection / Marketing Strategy

Data Collection:

Google Trends

- data exploration tool that lets scholars, marketers, etc better understand what audiences are interested in and curious about, in real-time
- We used words that would affect the VIX, past and future
- the website uses graphs to display the volume of the words popularity

banking	Oct 10, 2021 at 2:18 PM	97 KB	CSV Document
■ CCI	Oct 9, 2021 at 8:14 PM	92 KB	CSV Document
consumer	Oct 10, 2021 at 2:51 PM	97 KB	CSV Document
covid	Oct 10, 2021 at 8:17 AM	10 KB	CSV Document
covid_mutation	Oct 10, 2021 at 9:21 AM	8 KB	CSV Document
depression	Oct 10, 2021 at 3:20 PM	94 KB	CSV Document
■ GDP	Oct 9, 2021 at 8:15 PM	94 KB	CSV Document
INFLATION	Oct 9, 2021 at 8:13 PM	99 KB	CSV Document
jobless_claims	Oct 11, 2021 at 8:12 PM	92 KB	CSV Document
liquidity	Oct 10, 2021 at 9:57 AM	95 KB	CSV Document
pandemic	Oct 10, 2021 at 9:14 AM	15 KB	CSV Document
unemployment	Oct 10, 2021 at 8:17 AM	96 KB	CSV Document
irus virus	Oct 10, 2021 at 8:57 AM	99 KB	CSV Document
■ VIX	Oct 8, 2021 at 6:41 PM	94 KB	CSV Document





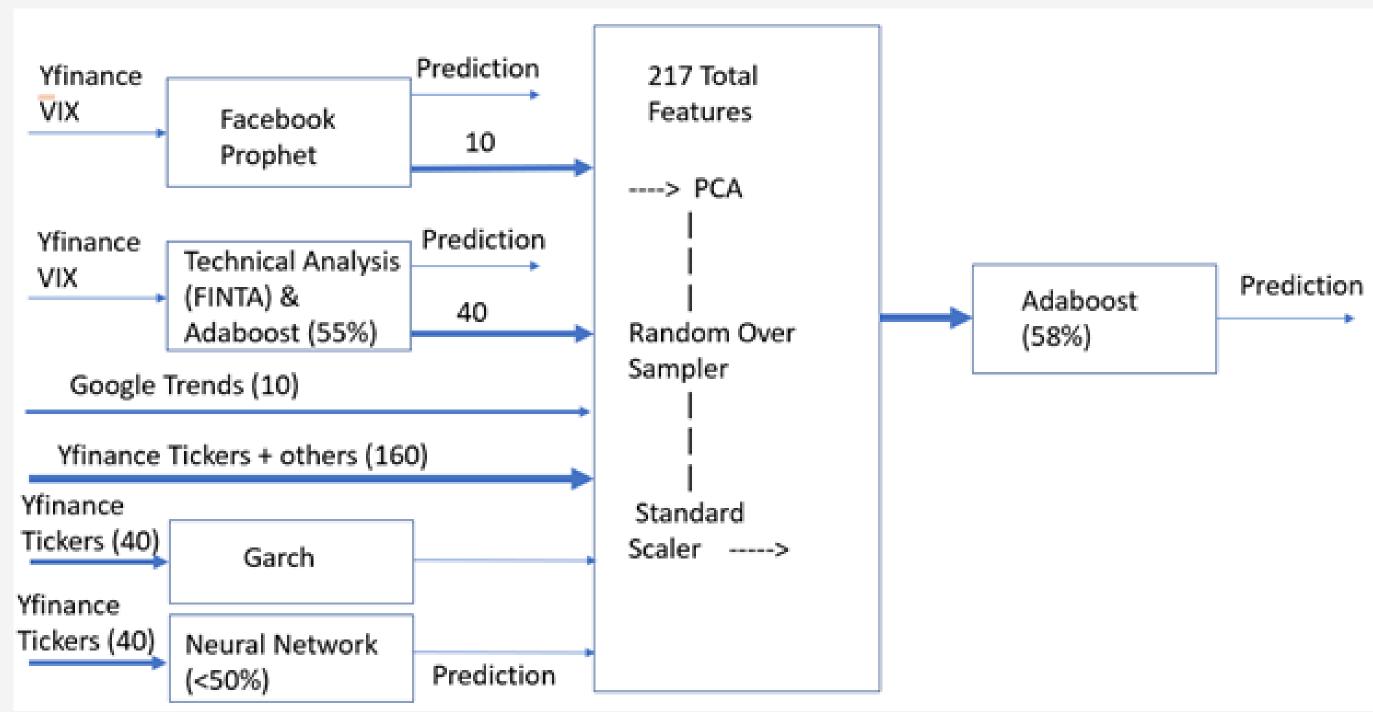
Time Series

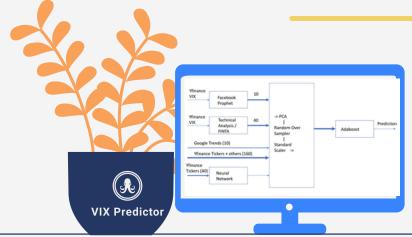


		Asset Class / Exposure								Geographic Location					
Feature Name	Developed								Emerging						
217 total	Currency Exchange Rate	Stock	Index/ETF Equity	Index/ETF Fixed Income	Index/ETF Commodities	Real Estate	Futures				♦	S			
								Euro Zome	U.S.A.	Japan	Brazil	Global			
Brazilian Real USD exchange rate	Brazil/US										Brazil				
Five-Year US Treasury Note Future				Treasury 5Y			Treasury 5Y		Treasury 5Y						
Nasdaq 100 Futures							Nsdq 100		Nasdaq 100						
Nikkei/USD Futures			Nikkei				Nikkei			Japan					
Shares Inv. Grade Corporate Bond ETF				Corp Bonds					Corp Bonds						
SPDR EURO STOXX 50 ETF			STOXX 50												
Shares S&P500 ETF			S&P 500												
Great Britain Pound USD exchange rate	GBP/US							315							
Nasdaq 100 Futures			Nsdq 100				Nsdq 100								
Apple Inc common stock		APPL							APPL						
Micron Technology, Inc.		MU							MU						
Bristol-Myers Squibb Company - Farmaceuticals		вму							вму						
Shares MSCI Eurozone ETF			MSCI EZ												
SPDR Gold Shares					GOLD							GOLD			
Shares Silver Trust					SILVER							SILVER			
Treasury Yield 10 Years				Treasury 10Y			Treasury 10Y		Treasury 10Y						
Prologis, Inc.						PLD			PLD			PLD			
SPDR EURO STOXX 50 ETF			STOXX 50												
CAC 40 - France Index			CAC 40												
Apple Inc common stock		APPL							US						
FTSE 100 - London Stock Exchange			FTSE 100												

- yahoo!finance
- Economic and Financial Series
- Neural Network

Our Machine Learning Model

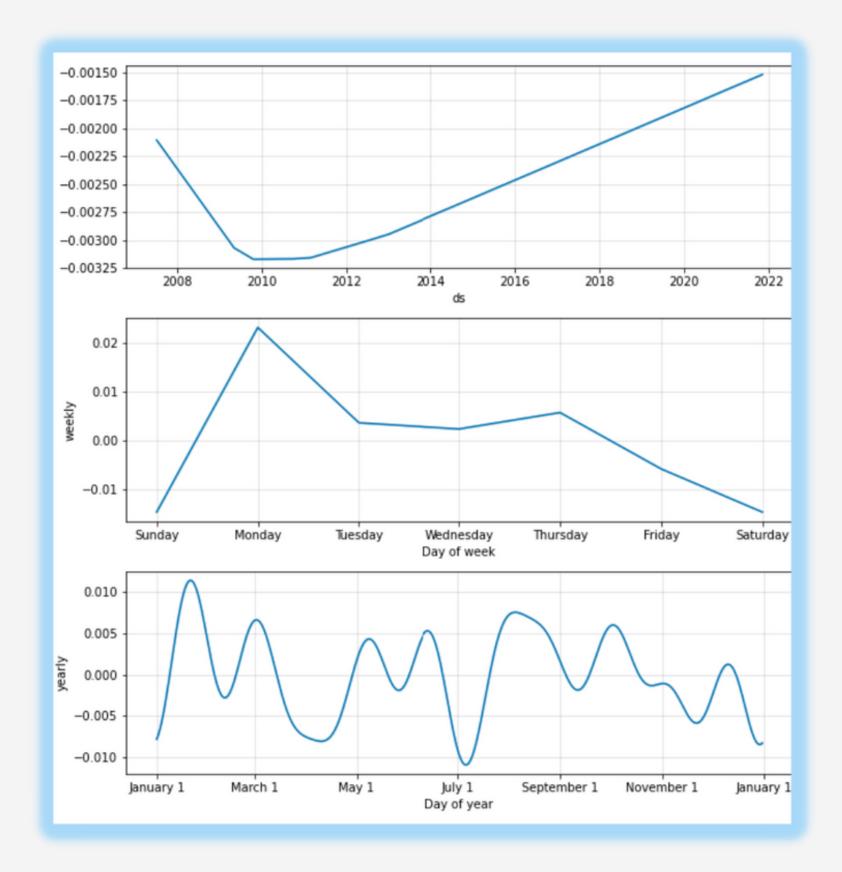




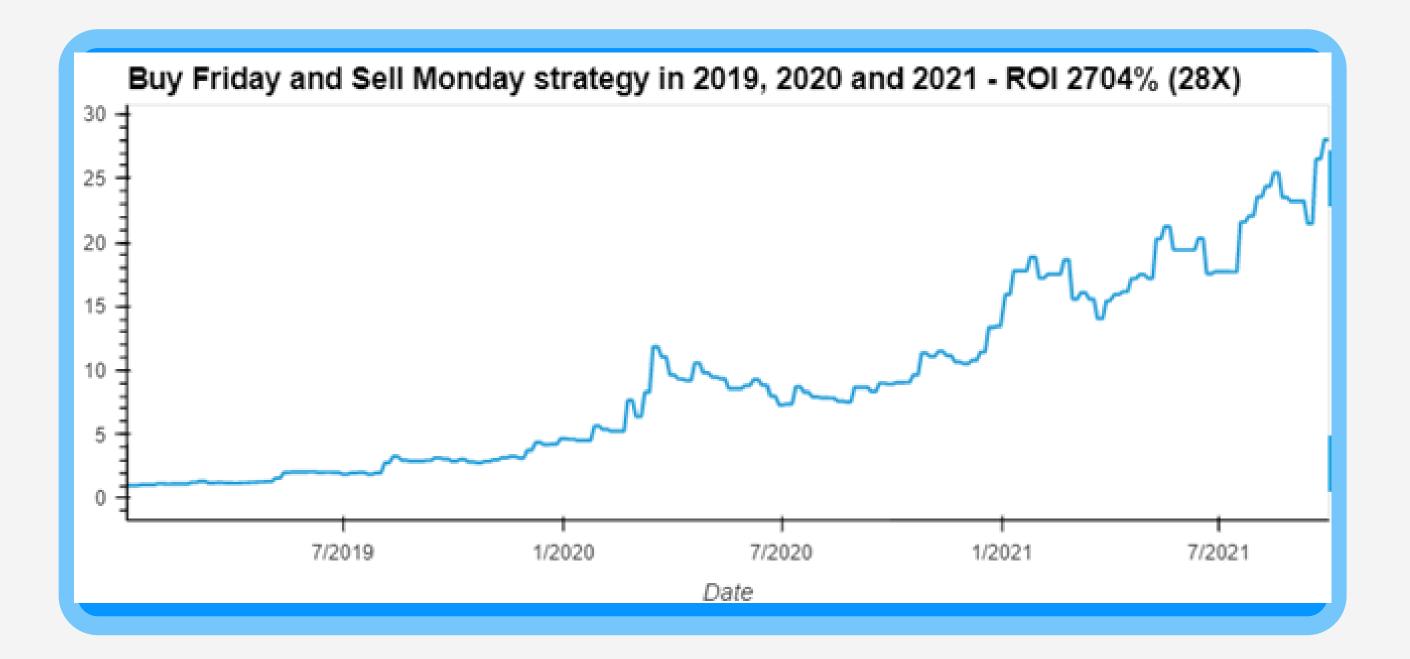
Sangram

Seasonality in VIX returns using Prophet





ROI
on
BUY on
Friday
SELL on
Monday



Sangram

Technical Analysis

SMA₁₀

SMA15

SMA20

SMA50

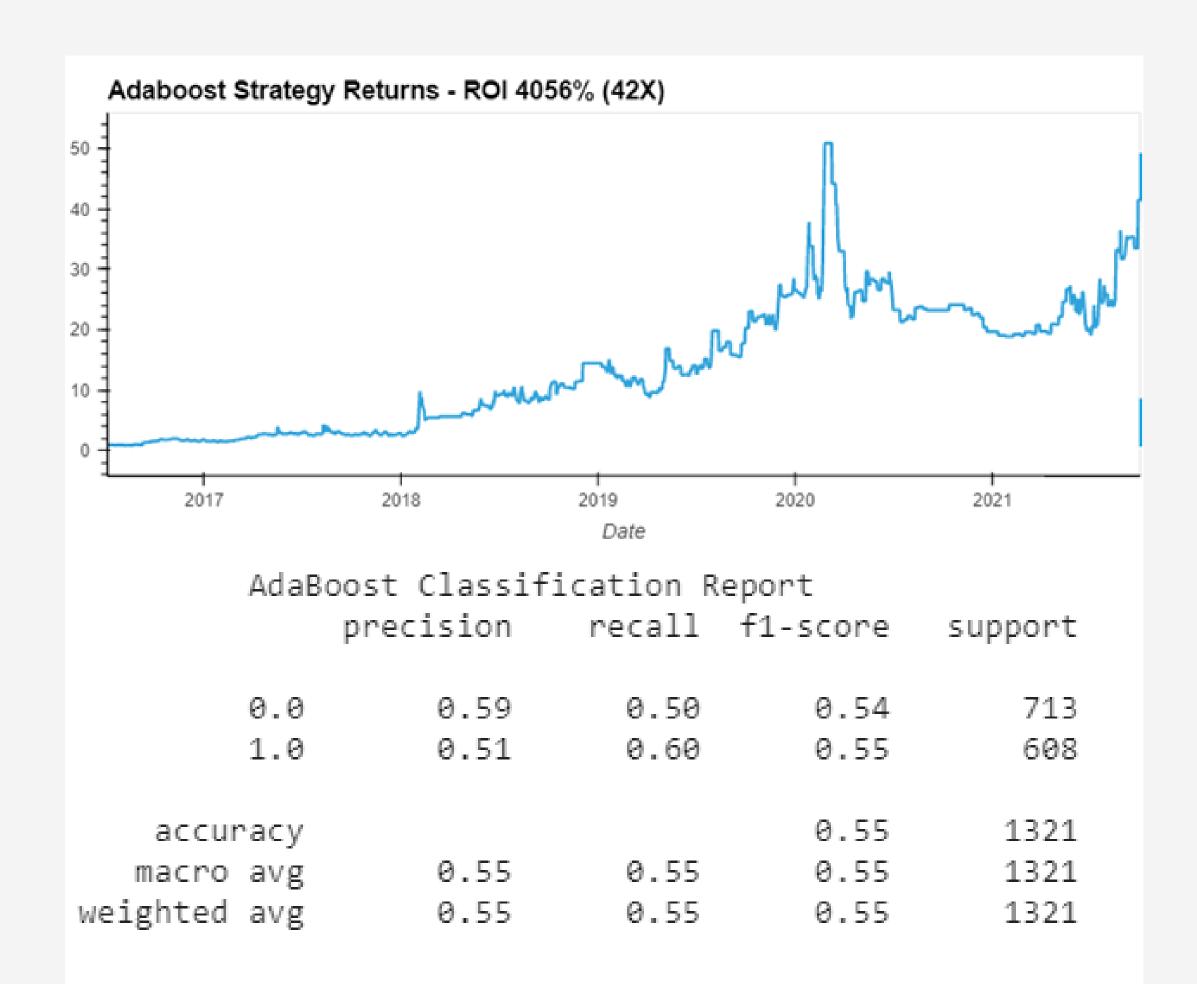
SMA100

SMA150

SMA200

SMA250

BOLLINGER BANDS



adaBoost Demo



```
In [40]: for num_estimators in range (20,200, 2):
             for num components in range (4, 90, 2):
                 adaboost model = AdaBoostClassifier(n estimators=num estimators)
                 pca = PCA(n components=num components)
                 pca.fit(X train scaled)
                 principal train components = pca.transform(X train scaled)
                 principal_test_components = pca.transform(X_test_scaled)
                 # Fit the model
                 adaboost_model = adaboost_model.fit(principal_train_components, y_train)
                 pred_adaboost = adaboost_model.predict(principal_test_components)
                 # Use a classification report to evaluate the model using the predictions and testing data
                 adaboost_report=classification_report(y_test, pred_adaboost)
                 #if num_estimators % 10 == 0 and num_components == 88:
                     print(f"components {num_components} esimators {num_estimators}")
                     print(f"f1 score 0 {f1 score(y test, pred adaboost, pos label=0)} f1 score 1 {f1 score(y test, pred adaboost, pos
         label=1)}")
                      print(f"accuracy {accuracy score(y test, pred adaboost)}")
                    print(adaboost_report)
                 if accuracy score(y test, pred adaboost) >= .50 and f1 score(y test, pred adaboost, pos label=1) >= .50:
                     print(f"components {num components} esimators {num estimators}")
                     print(f"variance explained {sum(pca.explained_variance_ratio_)}")
                     # Print the classification report
                                    AdaBoost Classification Report")
                     print(adaboost_report)
         components 4 esimators 20
        variance explained 0.5296849957698202
                 AdaBoost Classification Report
                                   recall f1-score support
                       precision
                           0.60
                                     0.65
                                               0.62
                                                          748
                                     0.48
                 1.0
                                               0.51
                                                          631
                                               0.57
                                                         1379
            accuracy
                           0.57
                                     0.57
                                               0.57
           macro avg
                                                         1379
         weighted avg
                                                         1379
         components 6 esimators 20
         variance explained 0.5928873314630516
                 AdaBoost Classification Report
                                   recall f1-score
                      precision
                                                      support
                           0.59
                                     0.74
                                               0.66
                                                          748
                 1.0
                           0.56
                                     0.39
                                               0.46
                                                          631
                                               0.58
                                                         1379
            accuracy
                                     0.56
                                                         1379
           macro avg
                           0.57
                                               0.56
         weighted avg
                           0.58
                                     0.58
                                               0.57
                                                         1379
         components 8 esimators 20
        variance explained 0.6294543823723278
```

AdaBoost Classification Report

AdaBoost Vix Predictor Model: Features Importance

X Feature Type	Security Name	Asset Class / Exposure								Geographic Location					
									Developed			Emerging C	Global		
		Currency Exchange Rate	Stock	Index/ETF Equity	Index/ETF Fixed Income	Index/ETF Commodities	Real Estate	Futures			•	③	6		
									Euro Zome	U.S.A.	Japan	Brazil	Global		
	Brazilian Real USD exchange rate	Brazil/US		Т								Brazil			
	Five-Year US Treasury Note Future	areary see			Treasury 5Y			Treasury 5Y		Treasury 5Y					
GARCH	Nasdag 100 Futures							Nsdq 100		Nasdaq 100					
MODELS	Nikkei/USD Futures			Niikkei				Nilóxei			Japan				
WIODELS	Shares Inv. Grade Corporate Bond ETF				Corp Bonds					Corp Bonds					
	SPDR EURO STOXX 50 ETF			STOXX 50					()						
	Shares S&P500 ETF			S&P 500											
	Great Britain Pound USD exchange rate	GBP/US													
	Nasdaq 100 Futures			Nsdq 100				Nsdq 100							
SQUARED	Apple Inc common stock		APPL							APPL					
-	Micron Technology, Inc.		MU							MU					
RETURNS	Bristol-Myers Squibb Company - Farmaceuticals		вму							BMY					
	iShares MSCI Eurozone ETF			MSCI EZ					(.)						
	SPDR Gold Shares					GOLD							GOLD		
	Shares Silver Trust					SILVER							SILVER		
RETURNS	Treasury Yield 10 Years				Treasury 10	4		Treasury 10Y		Treasury 10Y					
	Prologis, Inc.						PLD			PLD			PLD		
	SPDR EURO STOXX 50 ETF			STOXX 50											
	CAC 40 - France Index			CAC 40											
VOLUME	Apple Inc common stock		APPL							US					
	FTSE 100 - London Stock Exchange			FTSE 100											

Our Business Model

These are the packages we offer to customers



Basic Plan

Prophet based strategy
"Buy Friday, Sell Monday"



Premium Plan

Includes the Basic Plan. Added with the Technical Indicator Model with 55% accuracy.



Business Plan

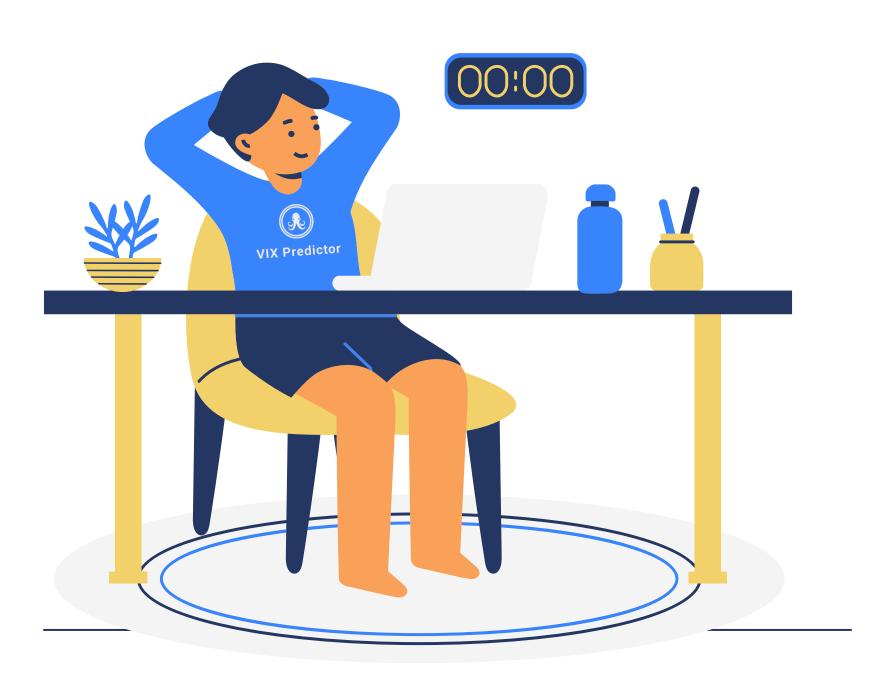
Includes everything from Basic and Premium plans. Added, we offer to Hedgefunds a 58% accurate super model, to manage their funds and to provide a buy signal API

Future Roadmap

Where VIX predictions can lead....

In future we plan to provide MVP (minimal viable product) to early adopters...





Contact Us

- github.com/sangramsinghg/vix_pr edictor
- bootcamp.berkeley.edu/fintech/.com
- candersh@bootcampspot.com

• Resources:

- Resources:

 Osterrieder, J., Kucharczyk, D., Rudolf, S. et al. Neural networks and arbitrage in the VIX. Digit Finance 2,
- 97-115 (2020). https://doi.org/10.1007/s42521-020-00026-y
- Yunfei Bai* and Charlie X. Cai** (2021). Predicting VIX with Adaptive Machine Learning. University of <u>Liverpool Management School https://papers.ssrn.com/sol3/papers.cfm?abstract_id=3866415</u>
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- VIX Volatility Index Suite, Cboe Global Markets, Inc. https://www.cboe.com/tradable_products/vix/vix_futures/
- SKLearn documentation
- Kevin Sheppard: "Introduction to ARCH Models", Revision 318309ac, https://arch.readthedocs.io/en/latest/univariate/introduction.html
- Yahoo Finance
- Technologies:
 - Jupyter Notebook/Lab
 - Google Trends
 - Python
 - SKLearn Machine Learning Package



VIX Predictor

