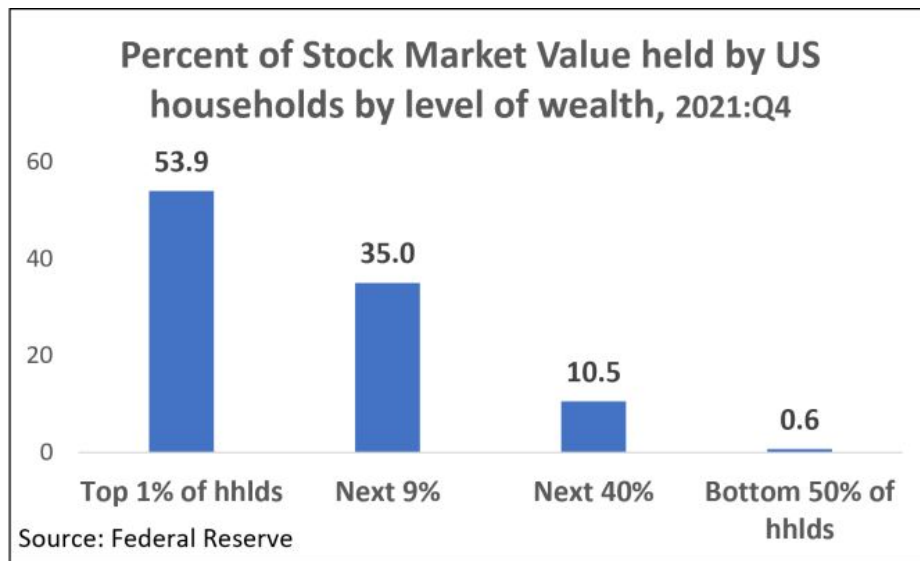

WeTrade

Open-Use Stock Trading Bot

Gus Simanson (Torbert 7), Max Weinstein (Yilmaz 1), Drew Zauel (Yilmaz 1)
Computer Systems Lab
5/21/25

Problem

- Only 34% of households in the bottom half of the US income distribution hold stocks
- Bottom 50% makes up 0.6% of the stock markets value
- Working-class families often lack the resources to hire financial advisors and the time to manage their investments.



Another Problem

- Current investing models only use short term data
- Long term investing is more profitable for individual traders. (Investing.com)

S&P 500 PERFORMANCE FOLLOWING RARE TREND
REVERSALS IN THE S&P 1500 INDEX (2004-2023)

| DATE | ONE YEAR | TWO YEARS | THREE YEARS |
|-----------|-------------|--------------|----------------|
| 1/21/2005 | 8.02% | 22.49% | 13.47% |
| 9/25/2009 | 9.99% | 8.81% | 39.50% |
| 6/8/2012 | 23.97% | 47.05% | 56.85% |
| 8/5/2016 | 13.47% | 30.12% | 30.32% |

| | | | |
|-----|---------|---------|---------|
| AVG | 13.86% | 27.12% | 35.03% |
| MED | 11.73% | 26.30% | 34.91% |
| POS | 100.00% | 100.00% | 100.00% |

PAST PERFORMANCE DOES NOT GUARANTEE FUTURE RESULTS.
GIOVACCO CAPITAL MANAGEMENT FOR ILLUSTRATIVE PURPOSES ONLY

Background

Main Determinants of Stock Price:

- History of Company/Stock
- Current Stock Data
- News/General Sentiment about Company



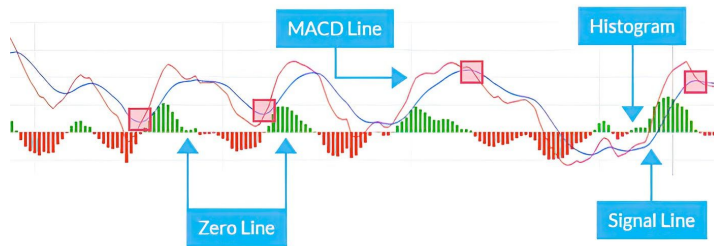
Other Solutions

1. **Pure Technical Analysis:** Use indicators (MAC-D, RSI, moving averages) to determine buy/sell. No external influences.

Example: StockHero

Pro: With a good strategy, and some luck, can perform very well on stocks

Con: Need to know a lot about the technical side of stocks to consistently choose a good strategy. Shorter term, and more luck based. Subscription based, win or lose



Other Solutions

2. NLP-based Sentiment Analysis: Analyze strictly the news sentiment, but cannot account for price action or technical indicators.

Example: EquBot (IBM Watson)



Pro: Processes a large number of articles per day, has backing from multi-billion dollar companies

Con: Only corporations have access to use, and subscription is expensive. Bad or biased data could lead to bad decisions, in addition to delayed reaction due to the quantity of data it goes through

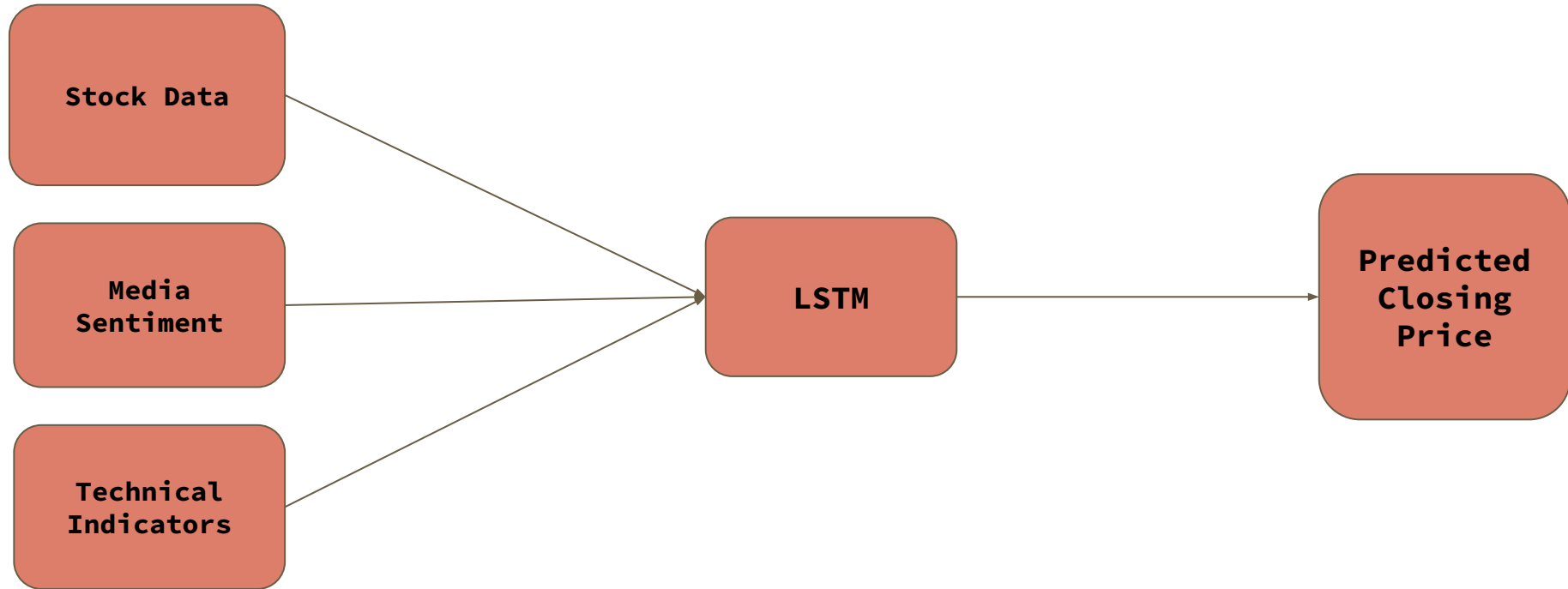
Why Is Ours Better?

- Ours combines the previous models into one
- Has inputs of stock data, technical indicators, and media sentiment data
- Can react to Technical Indicators changing and News sentiment changing
- Not purely day-trading, can hold long term investments
- Website giving personalization to the behavior of the bot's trades

Impact

- More profitable model, especially in the long term
- Website leads to more personal understanding of the Stock Market
- More profitable holdings for average person
- Competes with big firms, drives innovation

Methods: Training the Model



Methods: Stock Data

- Historical Stock data gathered from Alpaca
- Technical Indicators calculated off those values

```
def get_daily(symbol):  
    api_key = "PKB5NC4W8DQB3085WA00" # Set these in your environment  
    api_secret = "7fdN97EYU9T4xDVPZPlHwZ2igs9r0AqDgCg0RL9l"  
  
    # Get daily data for the specified stock and date range  
    start_date = date.today() - timedelta(days=5*365)  
    api = stock.StockHistoricalDataClient(api_key=api_key, secret_key=api_secret)  
  
    request = StockBarsRequest(  
        symbol_or_symbols=symbol,  
        timeframe=TimeFrame.Day,  
        start=start_date,  
        #end=end,  
        limit=None,  
        sort=Sort.DESC,  
    )
```

Methods: Media Sentiment

- News Scraping
- Social Media Scraping
- Sentiment Analysis
- Historical Aggregation

```
08:53:10.056051 - https://www.forbes.com/sites/greatspeculations/2024/09/05/intel-stock-could
08:53:10.056160 - https://www.forbes.com/sites/greatspeculations/2024/09/05/is-verizons-acqui
08:53:10.056210 - https://www.forbes.com/councils/forbesfinancecouncil/2024/09/05/what-compan
08:53:10.056258 - https://www.forbes.com/sites/greatspeculations/2024/09/05/why-is-xpeng-stoc
08:53:10.056301 - https://www.forbes.com/sites/greatspeculations/2024/09/05/big-tech-buy-sign
08:53:10.056344 - https://www.forbes.com/councils/forbesfinancecouncil/2024/09/05/what-base-r
08:53:10.056403 - https://www.forbes.com/sites/greatspeculations/2024/09/05/pick-boeing-stock
08:53:10.056454 - https://www.forbes.com/sites/andrewrosen/2024/09/05/three-tips-for-successi
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08:53:10.056649 - https://www.forbes.com/sites/roystonwild/2024/09/05/associated-british-food
```



Financial Berg  @FinancialBerg · 3m

Jim Cramer was just asked about Super Micro [\\$SMCI](#) on CNBC:

"No, it's too hard. Just go buy Nvidia [\\$NVDA](#) "



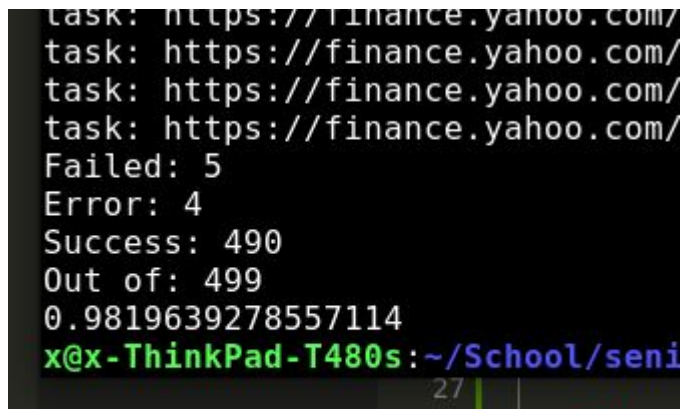
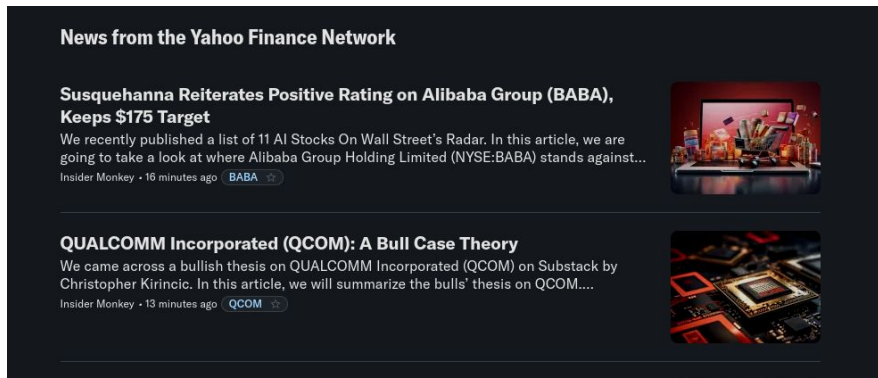
27



```
PLTR - ['PLTR', 'AIP', ''] - https://www.fool.com/in
AXP - ['AXP', 'COVID', 'EPS'] - https://www.fool.com/in
DA - ['DA', ''] - https://www.fool.com/in
VUG - ['VUG', 'ARK', 'COVID'] - https://www.fool.com/in
GE - ['GE', ''] - https://www.fool.com/in
RIVN - ['RIVN', 'TTM', ''] - https://www.fool.com/in
SCHD - ['SCHD', ''] - https://www.fool.com/in
PLTR - ['PLTR', 'AIP', ''] - https://www.fool.com/in
NYSE - ['NYSE', 'BRK', 'OTC'] - https://www.fool.com/in
```

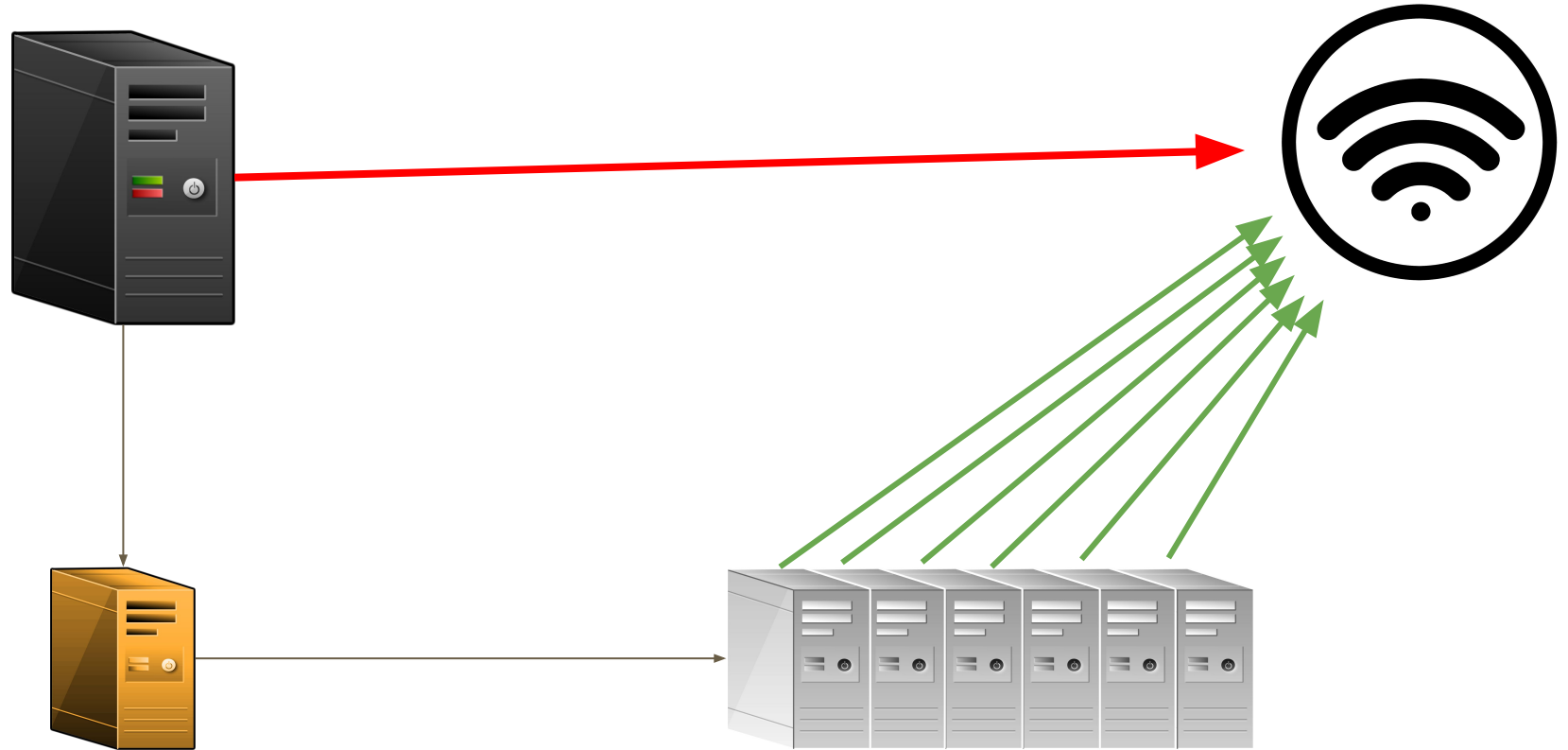
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ARK- 0.06000 - https://www.fool.com/investing/2024/09/
PDD- 0.03694 - https://www.fool.com/investing/2024/09/
DAL- 0.20000 - https://www.fool.com/investing/2024/09/
V00- 0.00000 - https://www.fool.com/investing/2024/09/
MBS- 0.15718 - https://www.fool.com/investing/2024/09/
DJT- 0.27500 - https://www.fool.com/investing/2024/09/
BRK- 0.50000 - https://www.fool.com/investing/2024/09/
BRK- 0.50000 - https://www.fool.com/investing/2024/09/
PYPL- 0.55000 - https://www.fool.com/investing/2024/09/
DLTR- 0.14286 - https://www.fool.com/investing/2024/09/
IJR- -0.25000 - https://www.fool.com/investing/2024/09/
RKL- -0.08330 - https://www.fool.com/investing/2024/09/
```

Yahoo Scraper

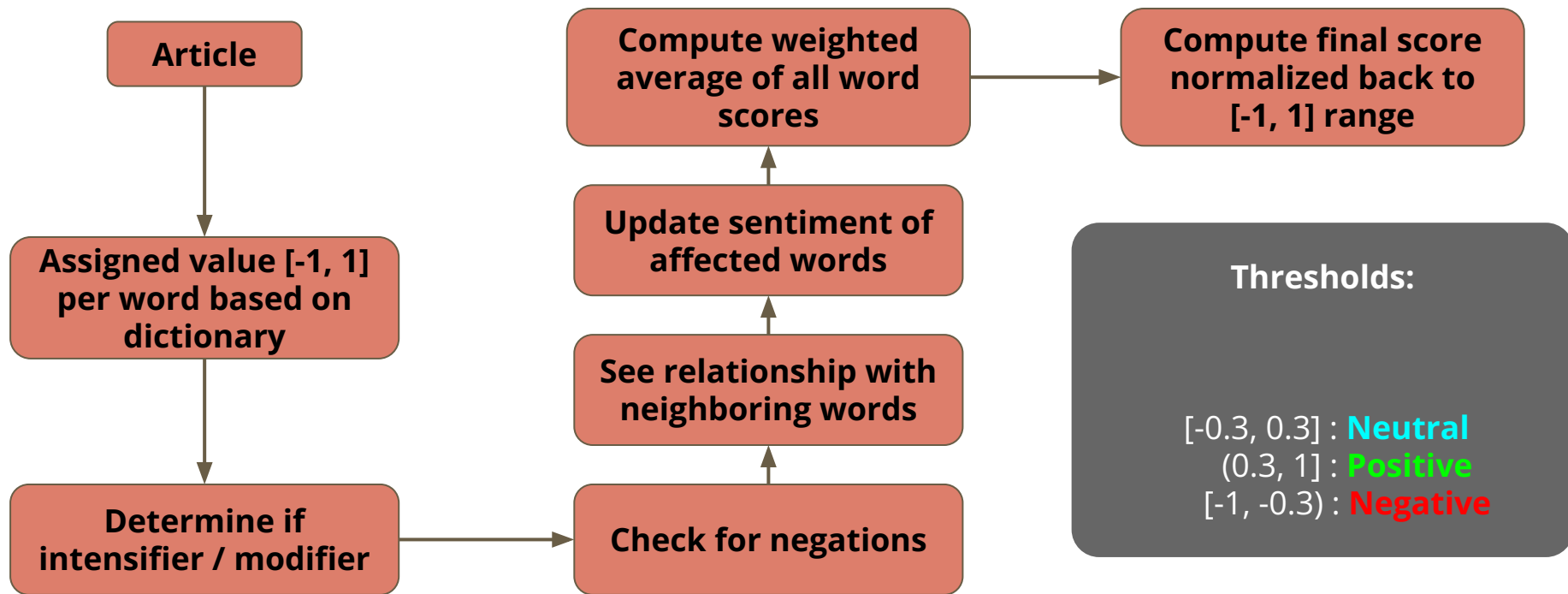


| id | url | title | date | tickers |
|-------|---|--|----------------------------|-------------|
| Fi... | Filter | Filter | Filter | Filter |
| 1 | https://finance.yahoo.com/news/wall-stree... | Wall Street's Ambitions in China Run Into a... | 2024-01-04 00:00:11.000000 | UBSG.SW |
| 2 | https://finance.yahoo.com/news/quiet-... | Quiet Income Kings: 3 Under-the-Radar ... | 2024-01-01 00:07:00.000000 | T,SCCO,AMCR |
| 3 | https://finance.yahoo.com/news/returns-... | Returns On Capital Are Showing Encouragi... | 2024-01-01 00:09:16.000000 | AWZ.SI |
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| 5 | https://finance.yahoo.com/news/nanalysis-... | Nanalysis Scientific Corp. Announces Gran... | 2024-01-04 00:11:00.000000 | NSCIF |
| 6 | https://finance.yahoo.com/news/pine-trail-... | Pine Trail REIT Announces Move to Quarter... | 2024-01-04 00:12:00.000000 | PINE-UN.V |
| 7 | https://finance.yahoo.com/news/estimatin... | Estimating The Intrinsic Value Of ALS ... | 2024-01-01 00:38:37.000000 | ALQ,ALQ.AX |
| 8 | https://finance.yahoo.com/news/why-meta... | Why META Stock May Be the Biggest Tech ... | 2024-01-04 00:15:39.000000 | META,AMZN |
| 9 | https://finance.yahoo.com/news/drug-price... | As Drug Prices Rise, \$35 Cap on Insulin ... | 2024-01-04 00:16:40.000000 | SAN,PFE |
| 10 | https://finance.yahoo.com/news/lg-display-... | LG Display Unveils Automotive Display ... | 2024-01-01 01:00:00.000000 | LPL |
| 11 | https://finance.yahoo.com/news/heres-why... | Here's Why We're Not Too Worried About ... | 2024-01-01 01:00:38.000000 | BRN.AX |

Methods: Mass-scraping

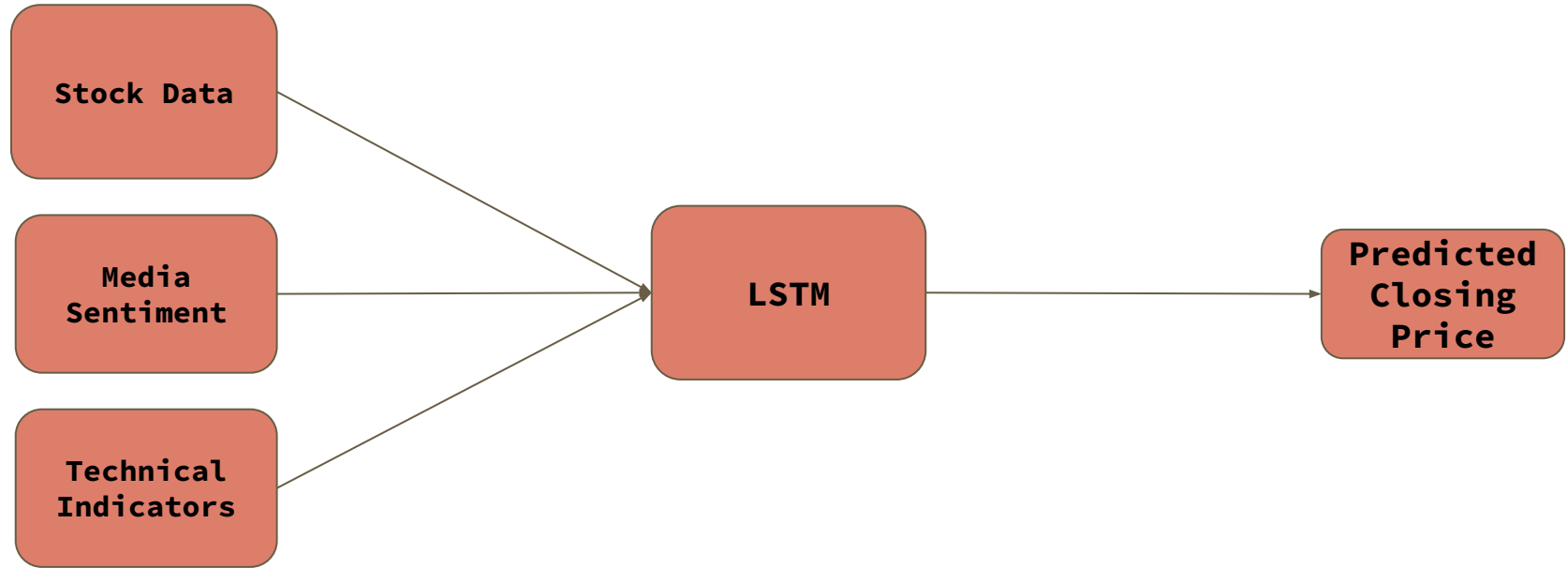


Calculating Sentiment Based on Article



Demo (scrapping & sentiment analysis)

Methods: Technical Indicators



Methods: Technical Indicators

- MACD (Moving Average Convergence Divergence) = Trading Momentum
 - $\text{MACD} = 12\text{-Period EMA} - 26\text{-Period EMA}$ (Exponential Moving Average)
 - Gives entry and exit points for trades (bullish vs bearish)
- RSI (Relative Strength Index)
 - $\text{RSI} = \text{Average Gain} / \text{Average Lose}$ (over 14 days)
 - Speed of price movements



Methods: Technical Indicators

- OBV (On Balance Volume)
 - Measures buying and selling pressure
 - Are there more buyers or sellers?

$$OBV = OBV_{prev} + \begin{cases} \text{volume,} & \text{if close} > \text{close}_{prev} \\ 0, & \text{if close} = \text{close}_{prev} \\ -\text{volume,} & \text{if close} < \text{close}_{prev} \end{cases}$$



- SMA (Simple Moving Average)
 - Average price over a small period

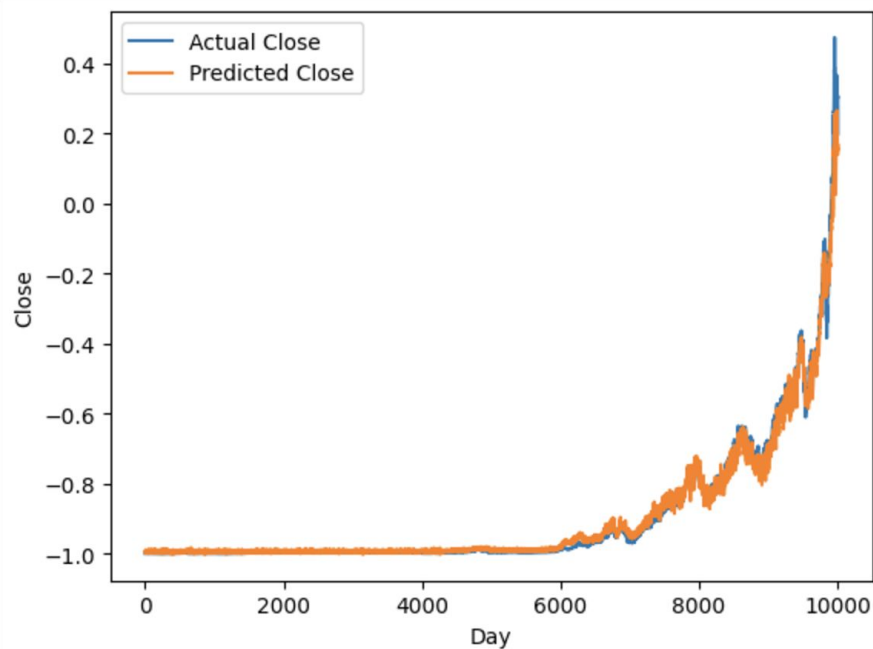


Inputs

| Date ▲¹ | Close/Last | Volume | Open | High | Low | Close | SMA_5 | SMA_10 | SMA_20 | EMA_5 | EMA_10 | EMA_20 | RSI | MACD | MACD_Signal | MACD_Histogram | ATR | OBV | Sentiment |
|---------------------|------------|-----------|---------|---------|---------|--------|---------|---------|---------|---------|---------|---------|--------|---------|-------------|----------------|--------|--------------|-----------|
| Filter | Filter | Filter | Filter | Filter | Filter | Filter | Filter | Filter | Filter | Filter | Filter | Filter | Filter | Filter | Filter | Filter | Filter | Filter | Filter |
| 2025-05-19 00:00:00 | \$208.78 | 46140530 | 207.91 | 209.48 | 204.26 | 208.78 | 211.35 | 205.832 | 206.586 | 209.612 | 208.065 | 206.722 | 51.987 | 0.695 | -0.582 | 1.277 | 5.916 | 1078968140.0 | -0.167 |
| 2025-05-16 00:00:00 | \$211.26 | 54737850 | 212.36 | 212.57 | 209.77 | 211.26 | 211.752 | 204.843 | 205.805 | 210.028 | 207.907 | 206.505 | 54.791 | 0.631 | -0.901 | 1.532 | 5.693 | 1125108670.0 | -0.26 |
| 2025-05-15 00:00:00 | \$211.45 | 45029470 | 210.95 | 212.96 | 209.54 | 211.45 | 209.206 | 204.252 | 205.091 | 209.412 | 207.161 | 206.005 | 55.002 | 0.287 | -1.284 | 1.571 | 5.781 | 1179846520.0 | -0.011 |
| 2025-05-14 00:00:00 | \$212.33 | 49325830 | 212.43 | 213.94 | 210.58 | 212.33 | 206.414 | 204.439 | 204.232 | 208.393 | 206.208 | 205.432 | 55.929 | -0.175 | -1.677 | 1.502 | 5.791 | 1224875990.0 | 0.243 |
| 2025-05-13 00:00:00 | \$212.93 | 51909330 | 210.43 | 213.4 | 209.0 | 212.93 | 203.198 | 204.456 | 203.723 | 206.424 | 204.848 | 204.706 | 56.532 | -0.852 | -2.053 | 1.201 | 5.971 | 1274201820.0 | 0.102 |
| 2025-05-12 00:00:00 | \$210.79 | 63775810 | 210.97 | 211.268 | 206.75 | 210.79 | 200.314 | 204.284 | 203.202 | 203.171 | 203.052 | 203.84 | 54.922 | -1.764 | -2.353 | 0.589 | 6.247 | 1222292490.0 | 0.078 |
| 2025-05-09 00:00:00 | \$198.53 | 36453920 | 199.0 | 200.54 | 197.535 | 198.53 | 197.934 | 204.219 | 202.57 | 199.361 | 201.332 | 203.108 | 43.867 | -2.685 | -2.5 | -0.185 | 5.939 | 1158516680.0 | 0.063 |
| 2025-05-08 00:00:00 | \$197.49 | 50478870 | 197.72 | 200.05 | 194.68 | 197.49 | 199.298 | 205.294 | 202.164 | 199.777 | 201.955 | 203.59 | 42.761 | -2.574 | -2.454 | -0.12 | 6.234 | 1122062760.0 | 0.962 |
| 2025-05-07 00:00:00 | \$196.25 | 68616940 | 199.17 | 199.44 | 193.25 | 196.25 | 202.464 | 206.382 | 202.233 | 200.921 | 202.947 | 204.232 | 41.485 | -2.288 | -2.424 | 0.136 | 6.176 | 1071583890.0 | 0.126 |
| 2025-05-06 00:00:00 | \$198.51 | 51216480 | 198.21 | 200.65 | 197.02 | 198.51 | 205.714 | 207.217 | 201.041 | 203.256 | 204.436 | 205.073 | 43.111 | -1.764 | -2.458 | 0.694 | 6.432 | 1140200830.0 | -0.19 |
| 2025-05-05 00:00:00 | \$198.89 | 69018450 | 203.1 | 204.1 | 198.21 | 198.89 | 208.254 | 207.34 | 200.188 | 205.629 | 205.752 | 205.763 | 43.377 | -1.299 | -2.632 | 1.333 | 6.437 | 1191417310.0 | 0.766 |
| 2025-05-02 00:00:00 | \$205.35 | 101010600 | 206.09 | 206.99 | 202.16 | 205.35 | 210.504 | 206.767 | 199.663 | 208.999 | 207.277 | 206.487 | 48.05 | -0.726 | -2.965 | 2.239 | 6.984 | 1260435760.0 | -0.12 |
| 2025-05-01 00:00:00 | \$213.32 | 57365680 | 209.08 | 214.56 | 208.9 | 213.32 | 211.29 | 205.93 | 199.555 | 210.824 | 207.706 | 206.607 | 54.814 | -0.642 | -3.524 | 2.882 | 7.149 | 1361446360.0 | 0.07 |
| 2025-04-30 00:00:00 | \$212.50 | 52286450 | 209.3 | 213.58 | 206.67 | 212.5 | 210.3 | 204.025 | 200.084 | 209.576 | 206.458 | 205.9 | 54.198 | -1.336 | -4.245 | 2.909 | 7.877 | 1304080680.0 | -0.192 |
| 2025-04-29 00:00:00 | \$211.21 | 36827630 | 208.693 | 212.24 | 208.37 | 211.21 | 208.72 | 202.989 | 200.618 | 208.113 | 205.116 | 205.205 | 53.267 | -2.119 | -4.972 | 2.853 | 9.435 | 1251794230.0 | 0.002 |
| 2025-04-28 00:00:00 | \$210.14 | 38743070 | 210.0 | 211.5 | 207.46 | 210.14 | 206.426 | 202.12 | 201.164 | 206.565 | 203.761 | 204.573 | 52.524 | -2.957 | -5.685 | 2.728 | 10.668 | 1214966600.0 | 0.168 |
| 2025-04-25 00:00:00 | \$209.28 | 38222260 | 206.365 | 209.75 | 206.2 | 209.28 | 203.03 | 200.921 | 201.552 | 204.778 | 202.344 | 203.987 | 51.954 | -3.874 | -6.367 | 2.493 | 11.774 | 1176223530.0 | 0.274 |
| 2025-04-24 00:00:00 | \$208.37 | 47310990 | 204.89 | 208.83 | 202.94 | 208.37 | 200.57 | 199.035 | 202.281 | 202.527 | 200.802 | 203.43 | 51.381 | -4.901 | -6.991 | 2.09 | 12.653 | 1138001270.0 | -0.671 |
| 2025-04-23 00:00:00 | \$204.60 | 52929170 | 206.0 | 208.0 | 202.799 | 204.6 | 197.75 | 198.083 | 202.938 | 199.605 | 199.121 | 202.91 | 49.04 | -6.048 | -7.513 | 1.465 | 13.849 | 1090690280.0 | 0.176 |
| 2025-04-22 00:00:00 | \$199.74 | 52976370 | 196.12 | 201.59 | 195.97 | 199.74 | 197.258 | 194.865 | 203.896 | 197.108 | 197.903 | 202.732 | 45.923 | -7.039 | -7.88 | 0.841 | 13.557 | 1037761110.0 | 0.207 |
| 2025-04-21 00:00:00 | \$193.16 | 46742540 | 193.265 | 193.8 | 189.811 | 193.16 | 197.814 | 193.037 | 204.945 | 195.792 | 197.495 | 203.047 | 41.419 | -7.708 | -8.09 | 0.382 | 13.296 | 984784740.0 | -0.61 |
| 2025-04-17 00:00:00 | \$196.98 | 52164680 | 197.2 | 198.834 | 194.42 | 196.98 | 198.812 | 192.559 | 206.201 | 197.107 | 198.458 | 204.088 | 43.366 | -7.779 | -8.185 | 0.406 | 13.455 | 1031527280.0 | -0.099 |
| 2025-04-16 00:00:00 | \$194.27 | 59732420 | 198.36 | 200.7 | 192.37 | 194.27 | 197.5 | 193.18 | 207.057 | 197.171 | 198.787 | 204.836 | 41.557 | -8.146 | -8.287 | 0.141 | 13.57 | 979362600.0 | -0.045 |
| 2025-04-15 00:00:00 | \$202.14 | 51343870 | 201.855 | 203.51 | 199.8 | 202.14 | 198.416 | 196.142 | 208.105 | 198.622 | 199.79 | 205.948 | 45.476 | -8.219 | -8.322 | 0.103 | 13.188 | 1039095020.0 | 0.013 |
| 2025-04-14 00:00:00 | \$202.52 | 101352900 | 211.44 | 212.94 | 201.162 | 202.52 | 192.472 | 198.247 | 208.633 | 196.863 | 199.268 | 206.349 | 45.669 | -8.995 | -8.347 | -0.648 | 13.248 | 1090438890.0 | 0.043 |
| 2025-04-11 00:00:00 | \$198.15 | 87435920 | 186.1 | 199.54 | 186.06 | 198.15 | 188.26 | 200.208 | 209.207 | 194.034 | 198.545 | 206.752 | 43.088 | -9.893 | -8.186 | -1.707 | 12.479 | 989085990.0 | 0.362 |
| 2025-04-10 00:00:00 | \$190.42 | 121880000 | 189.065 | 194.78 | 183.0 | 190.42 | 186.306 | 202.183 | 209.974 | 191.976 | 198.633 | 207.657 | 38.273 | -10.45 | -7.759 | -2.691 | 11.745 | 901650070.0 | -0.067 |
| 2025-04-09 00:00:00 | \$198.85 | 184395900 | 171.95 | 200.61 | 171.89 | 198.85 | 188.86 | 205.526 | 210.937 | 192.754 | 200.458 | 209.472 | 41.859 | -10.222 | -7.086 | -3.136 | 11.153 | 1023530070.0 | 0.111 |

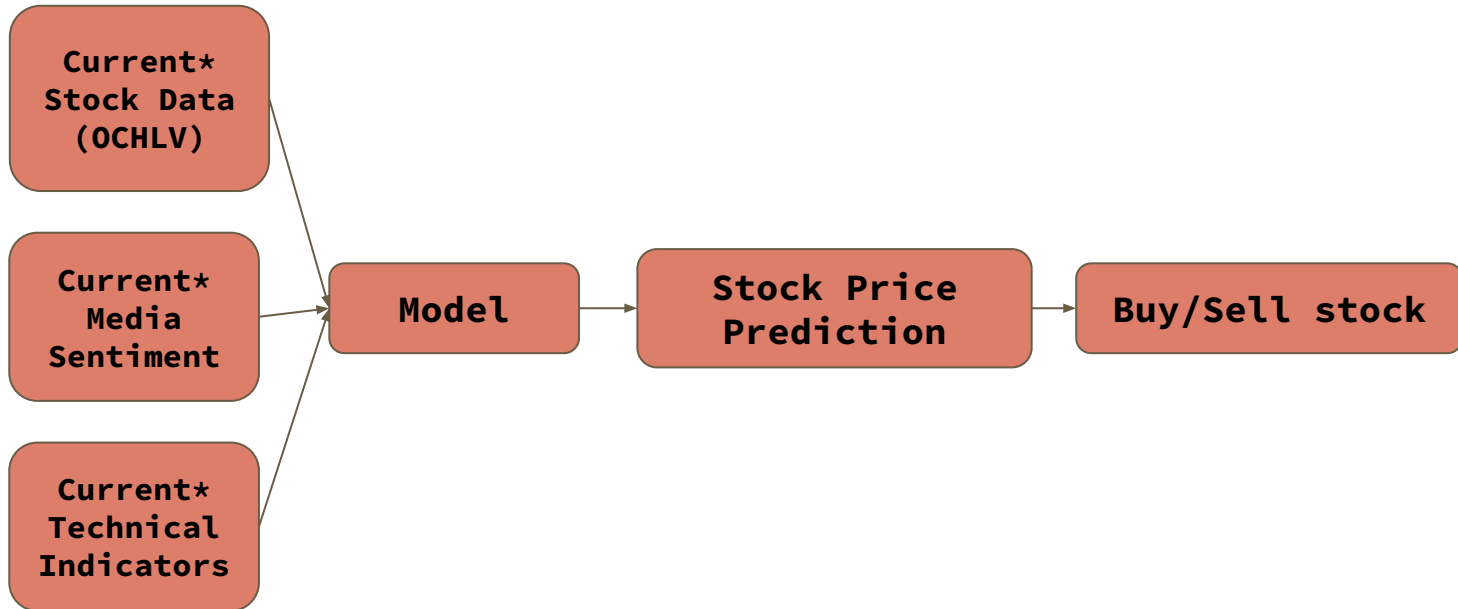
Methods: Training the Model

```
1 import torch.optim as optim
2 from torch.optim.lr_scheduler import ReduceLR0nPlateau
3
4 # Define model with dropout
5 class LSTM(nn.Module):
6     def __init__(self, input_size, hidden_size, num_stacked_layers, dropout_rate=0.2):
7         super().__init__()
8         self.hidden_size = hidden_size
9         self.num_stacked_layers = num_stacked_layers
10
11         self.lstm = nn.LSTM(input_size, hidden_size, num_stacked_layers, batch_first=True, dropout=dropout_rate)
12         self.fc = nn.Linear(hidden_size, 1)
13
14     def forward(self, x):
15         batch_size = x.size(0)
16         h0 = torch.zeros(self.num_stacked_layers, batch_size, self.hidden_size).to(device)
17         c0 = torch.zeros(self.num_stacked_layers, batch_size, self.hidden_size).to(device)
18
19         out, _ = self.lstm(x, (h0, c0))
20         out = self.fc(out[:, -1, :])
21         return out
22
23 # Instantiate model, optimizer, and scheduler
24 model = LSTM(input_size=5, hidden_size=32, num_stacked_layers=2, dropout_rate=0.2)
25 model.to(device)
26 optimizer = optim.Adam(model.parameters(), lr=0.001, weight_decay=1e-4)
27 scheduler = ReduceLR0nPlateau(optimizer, mode='min', factor=0.5, patience=5)
28
```



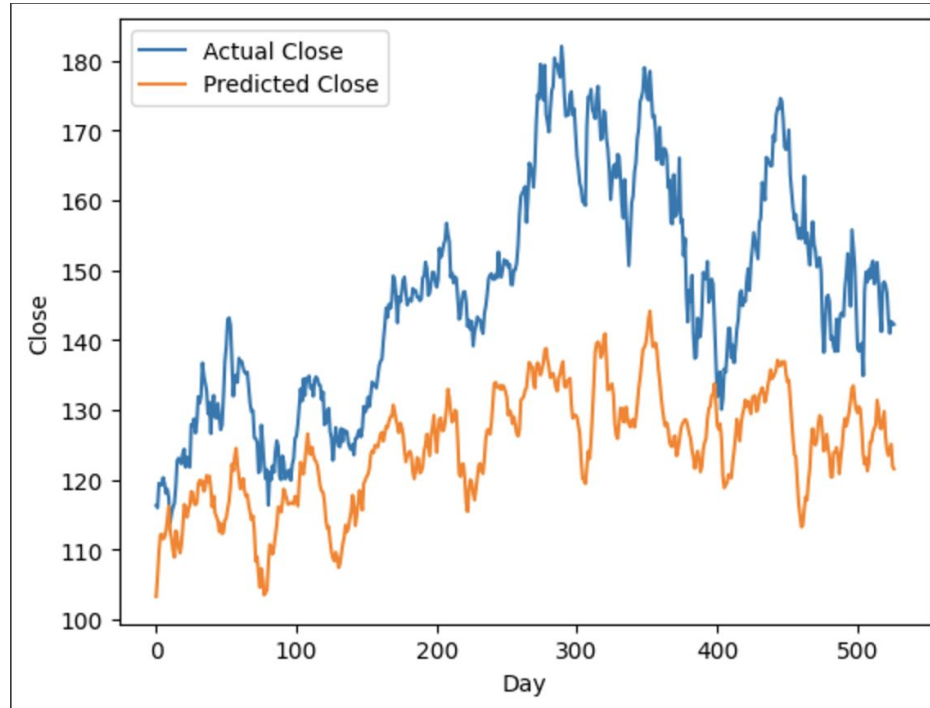
Methods: Predicting Using Trained LSTM

*Data including the last week of the market (Actual prediction on unseen data)

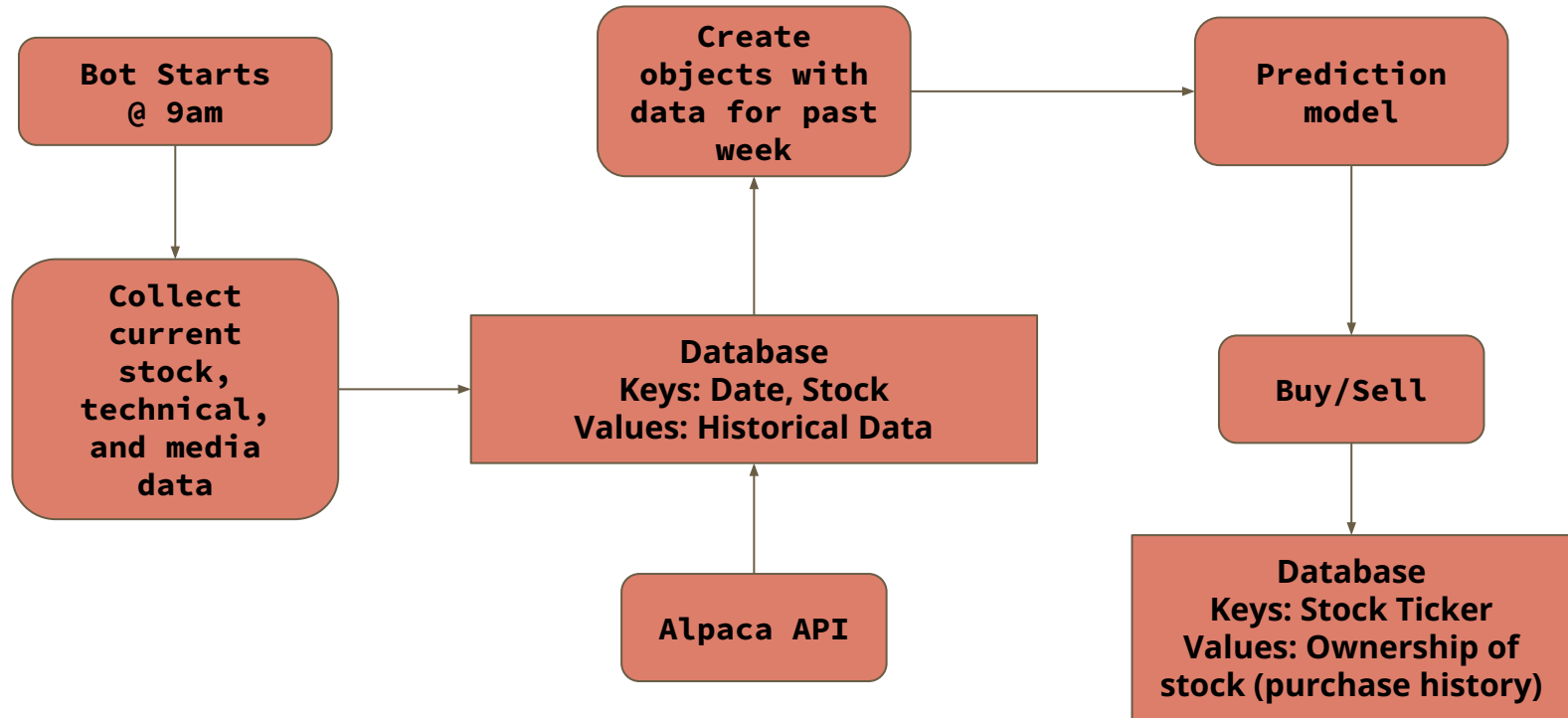


Methods: Trained LSTM's Predictions on Unseen Data

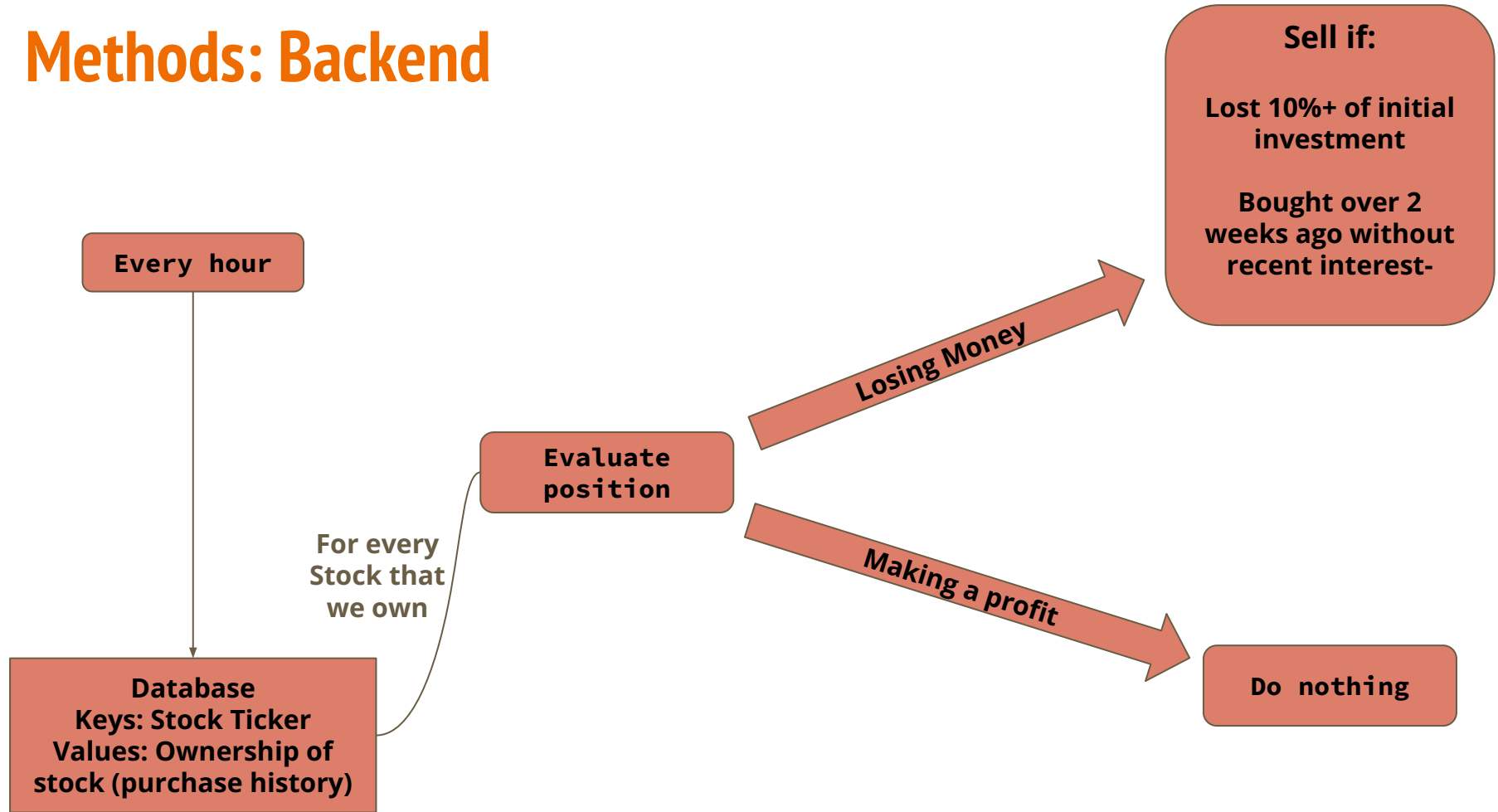
*Data including the last week of the market (Actual prediction on unseen data)

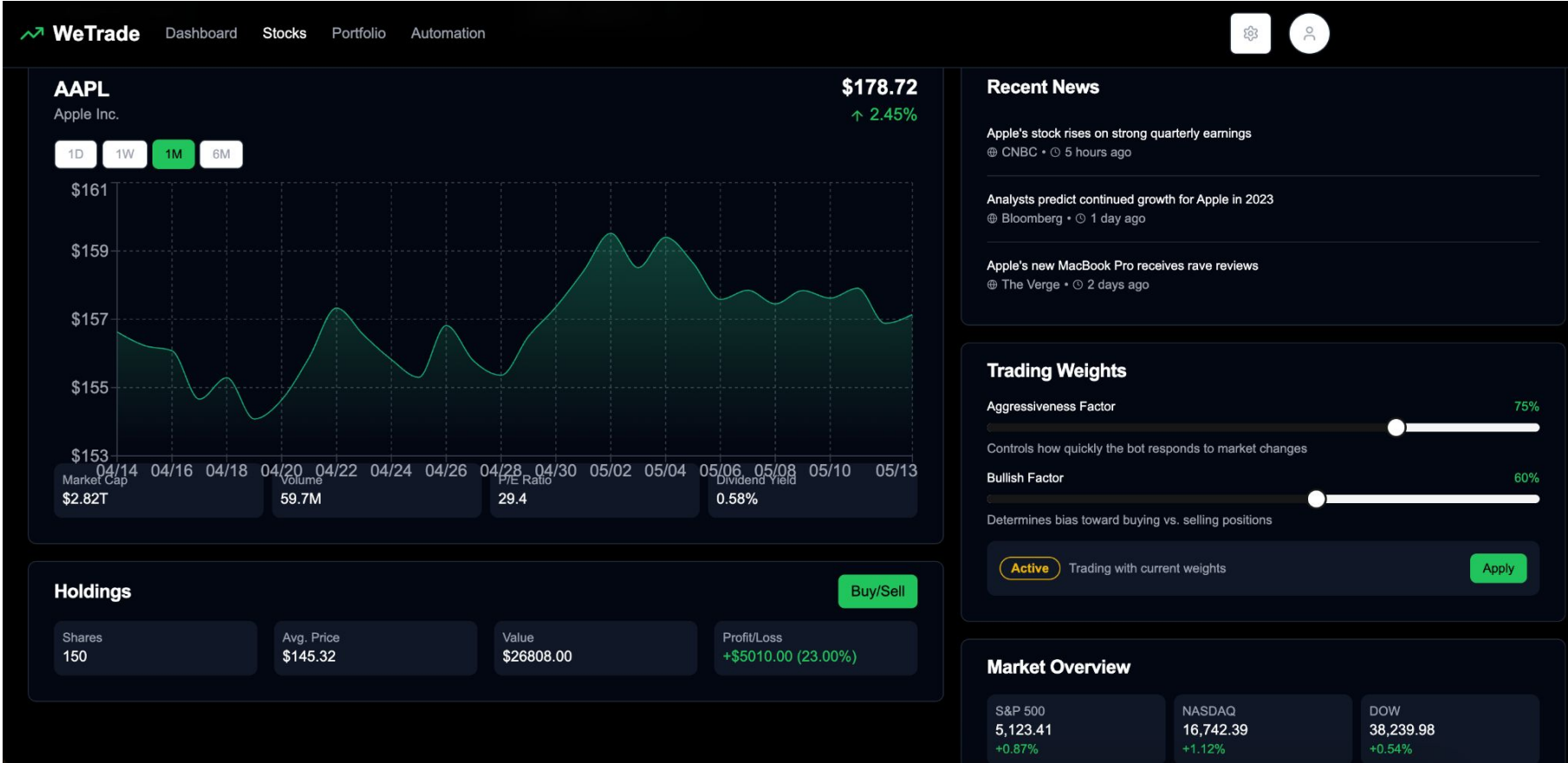


Methods: Backend



Methods: Backend





Results

- In backtesting, the model demonstrated sufficient predictive accuracy for live trading implementation
- In the first week of trading the model has made a 4% profit
- Website is operational and integrated with LSTM model



Limitations

- Compared to major companies we have less up to date stock data. (HFT bots compete for information transmitted in milliseconds)
- We are limited because of the news sources' bias
- We are limited by our time frame

Conclusion and Future Work

- In the future we will further develop long term investing
- Combines historical data, technical indicators, and sentiment analysis into a single, responsive system for smarter, long-term investing.
- Our user-adjustable website encourages financial literacy and tailored investment strategies.

References

- [Investopedia](#)
- [Alpha Vantage API](#)
- [Alpaca API](#)
- [MACD Explained \(Youtube\)](#)
- [Federal Reserve](#)
- [Medium.com](#)
- [Rising Wave](#)

THANKS!

Any questions?