



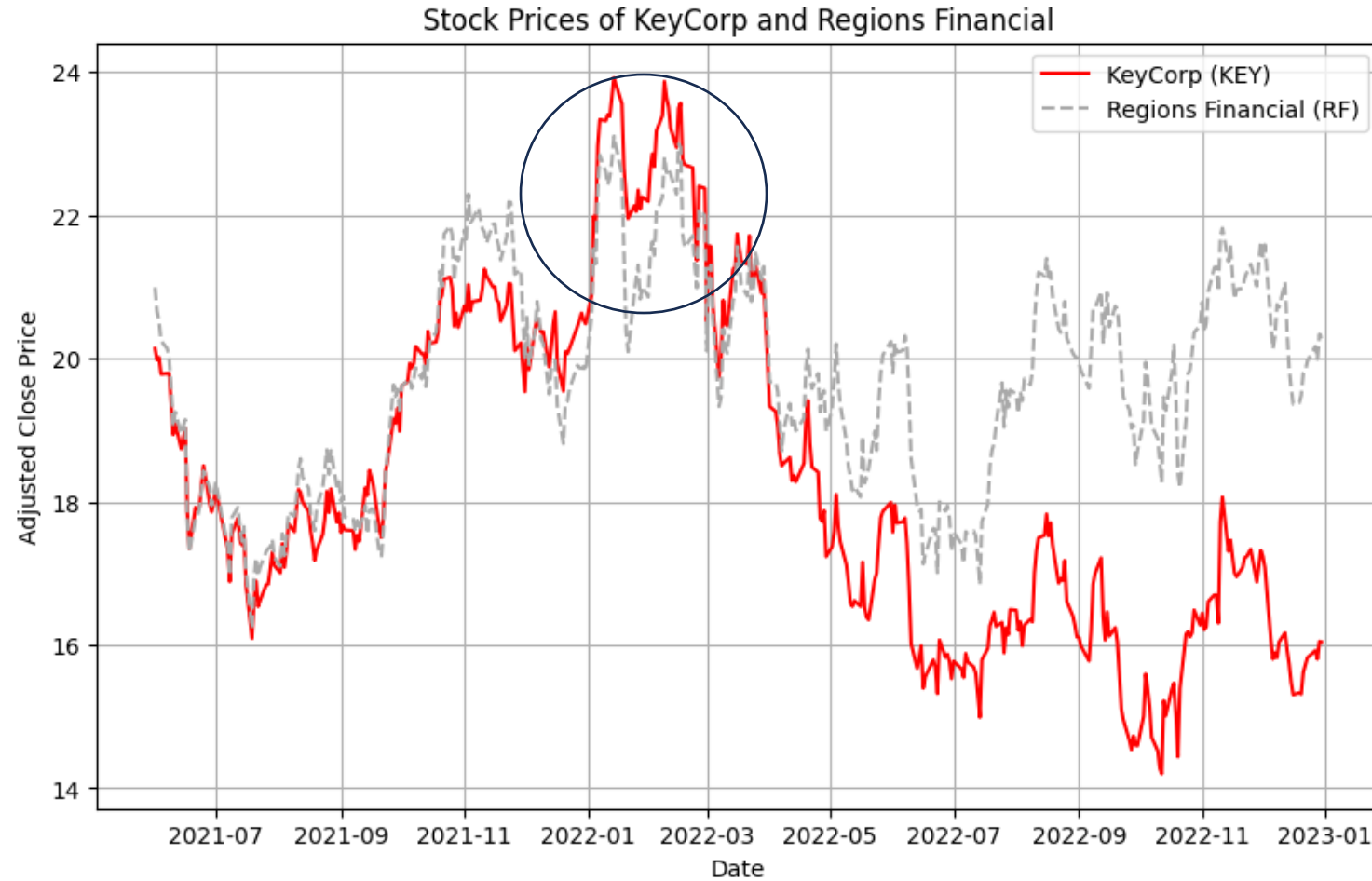
Pairs Trading Strategy

QTs: Shoubhit Ravi, Aditya Nambiar

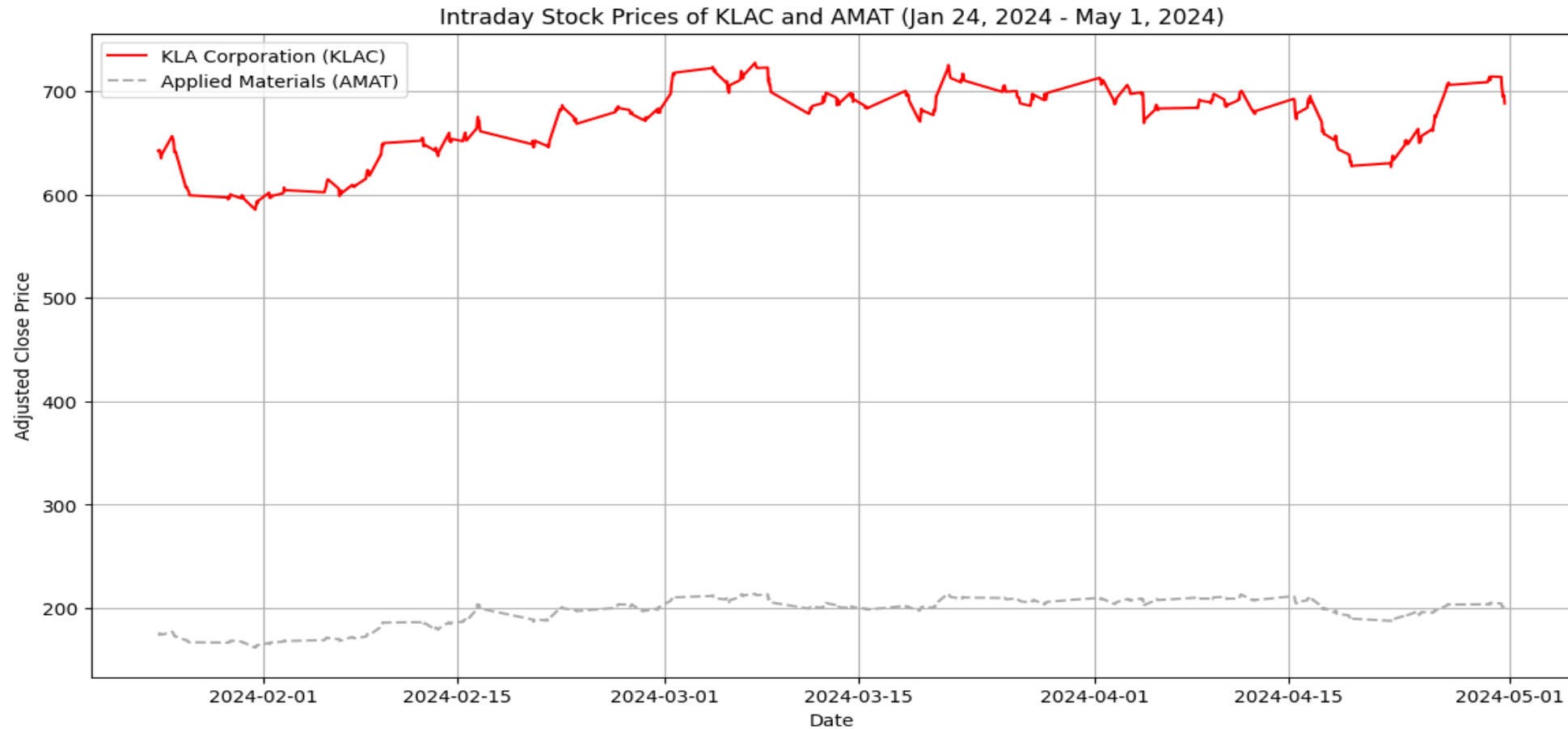
QRs: Ishan Kinikar, Kaosi Nwosu

Pairs Trading at a High Level

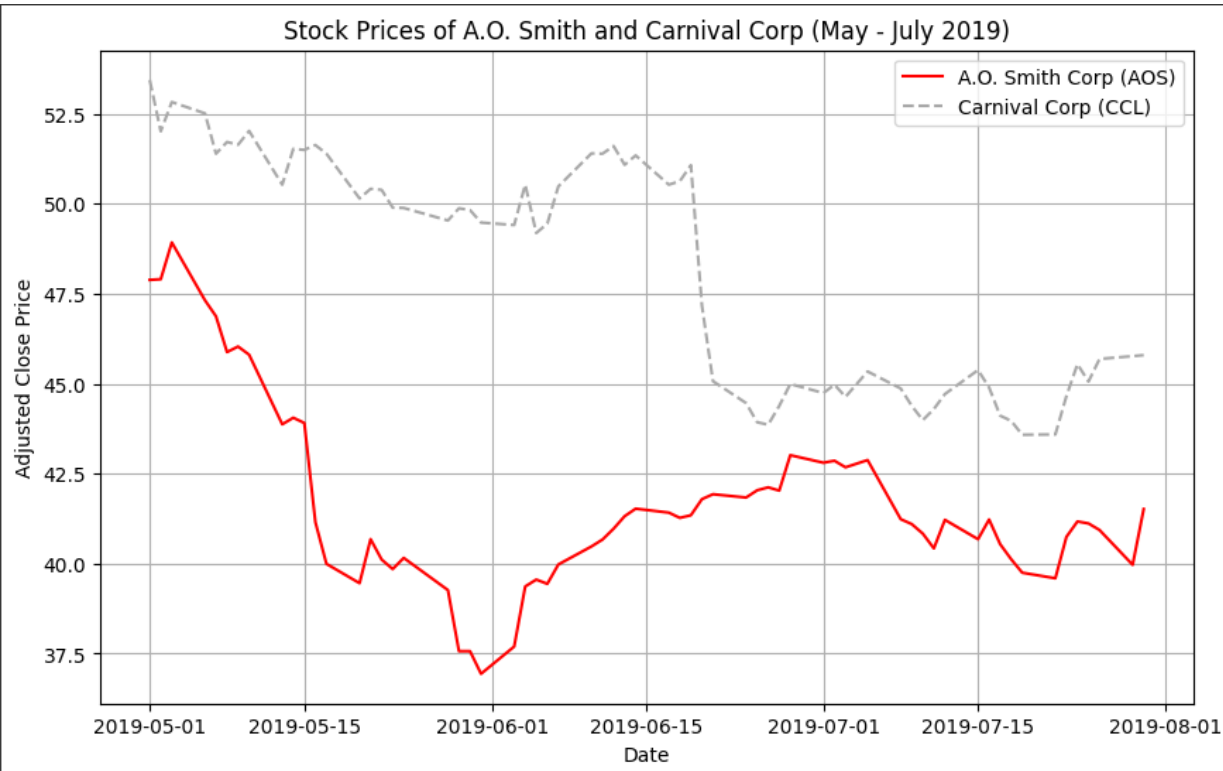
1. Find two assets with prices that move together
2. When their spread is larger than usual:
 - Long: Undervalued
 - Short: Overvalued
3. Exit positions when spread reverts to mean and profit from the change



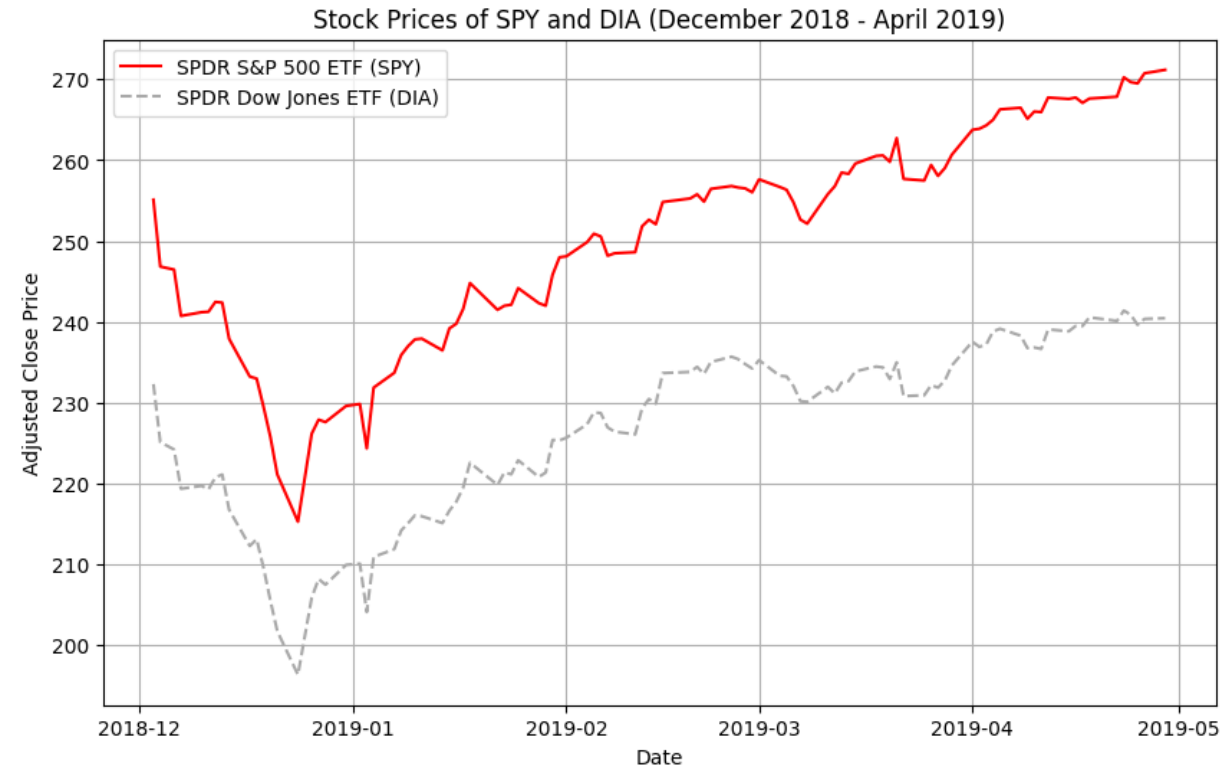
Pairs Trading at a High Level



Pairs Trading is a Market Neutral Strategy



Pairs Trading on a Downward Trend



Pairs Trading on an Upward Trend

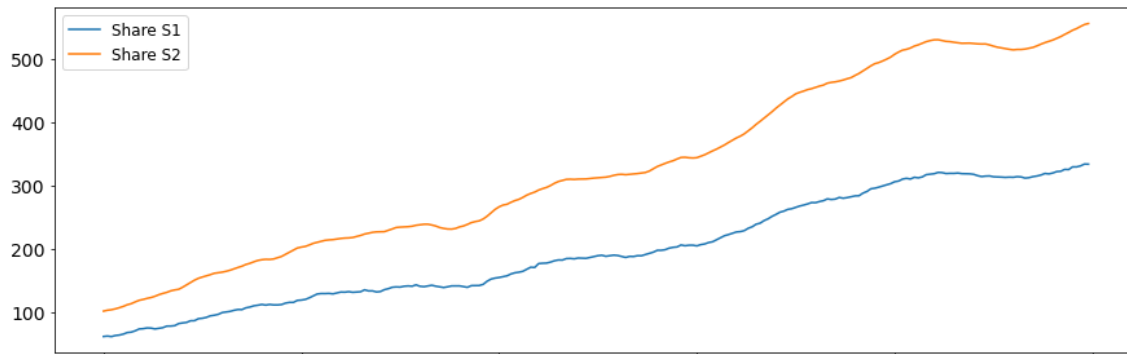
Correlation VS Cointegration

CORRELATION

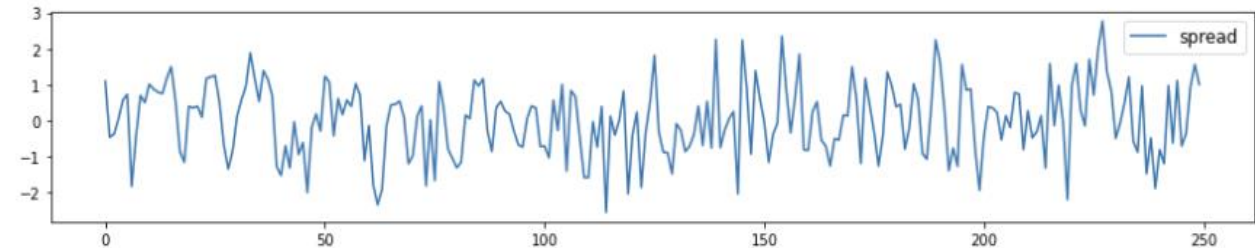
Describes a **short-term** relationship between the **returns**

COINTEGRATION

Describes a **long-term** mean reverting relationship between the **prices**



Returns of two correlated assets



Spread (difference in prices) of these assets

Quantitative and Qualitative Pairs Relationships

Effective pairs trading strategies integrate both quantitative and qualitative analyses.

Quantitative Relationships

- Utilize two important statistical properties to identify relevant numerical patterns between two assets: Correlation and Cointegration
- Stock prices must historically move in the same direction and have a spread that historically remains constant
- Qualitative factors are necessary in providing context to the numbers

Qualitative Relationships

- Non-numerical factors that influence asset behavior: Industry trends, company fundamentals, market sentiment, etc.
- Two highly correlated companies are not guaranteed to maintain that relationship over the long-term due to unexpected events and catalysts
- Effectively utilizing most recent company news is necessary

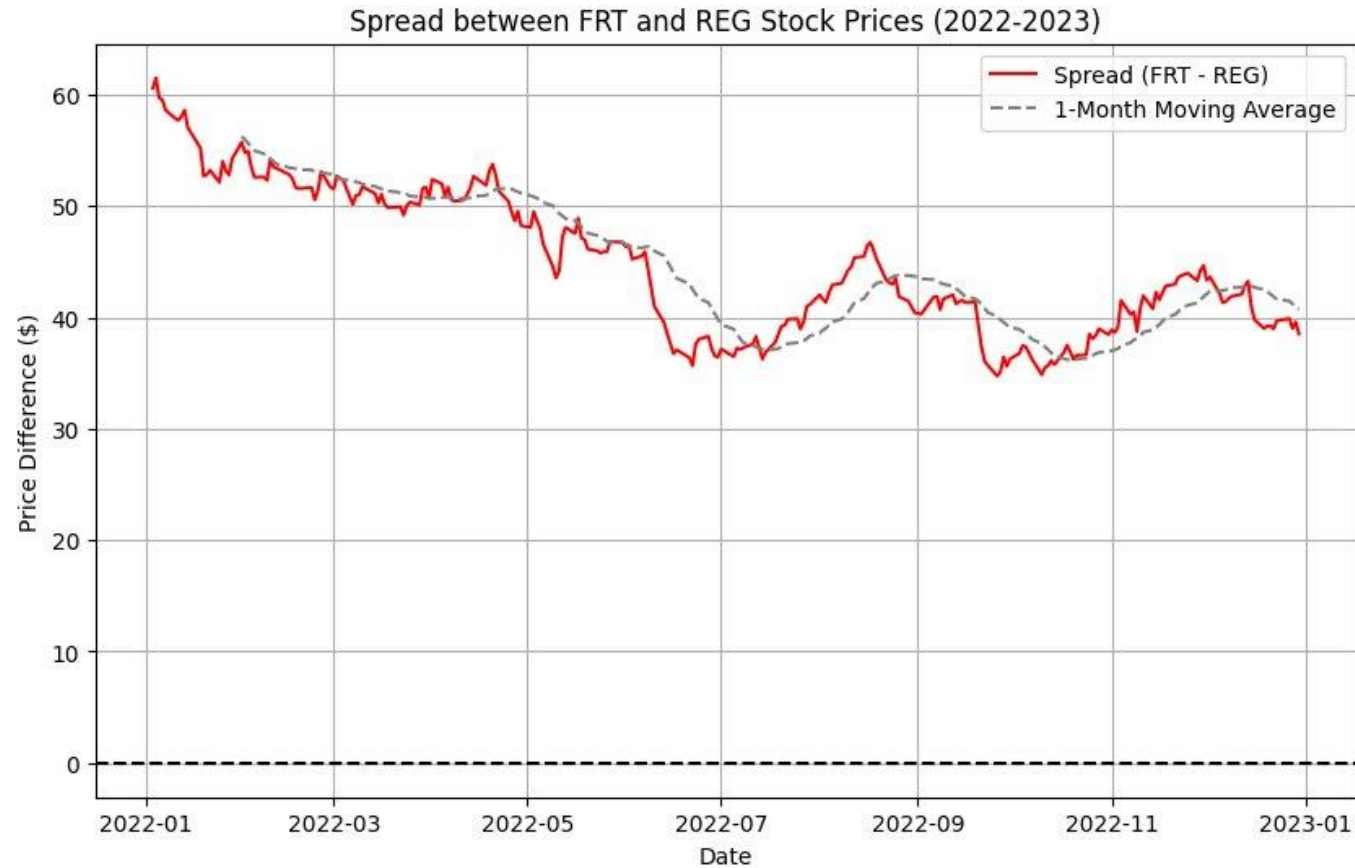
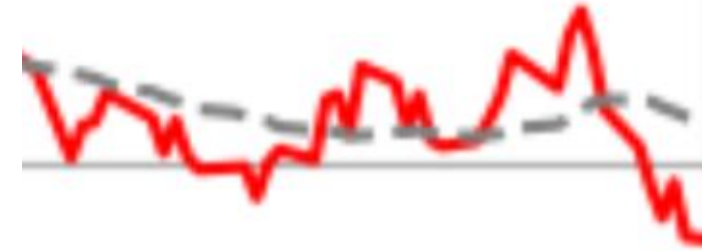
Mean Reversion and Predicting Deviations

Mean Reversion:

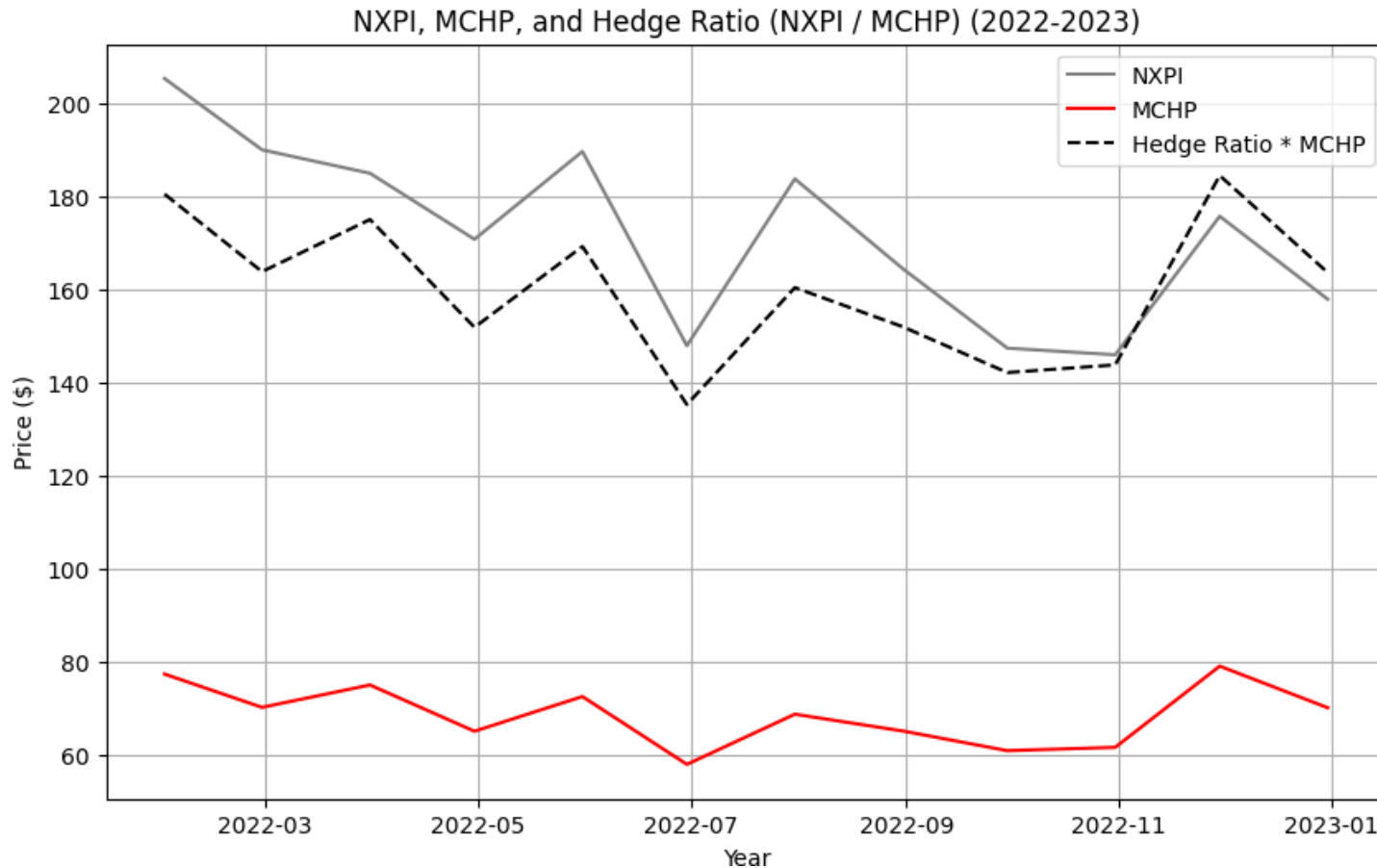
- Asset prices tend to move back toward their historical average over time
- The spread between two correlated assets will eventually revert to its long-term average

Spread Deviations:

- Deviations from the historical spread between paired assets provide trading opportunities
- Predictive models utilize historical data and statistical analysis techniques to anticipate potential deviations



Understanding Dynamic Hedge Ratios



Hedge Ratio: How much of one stock to long/short relative to the other?

Dynamic hedge ratios adjust continuously based on changing market dynamics.

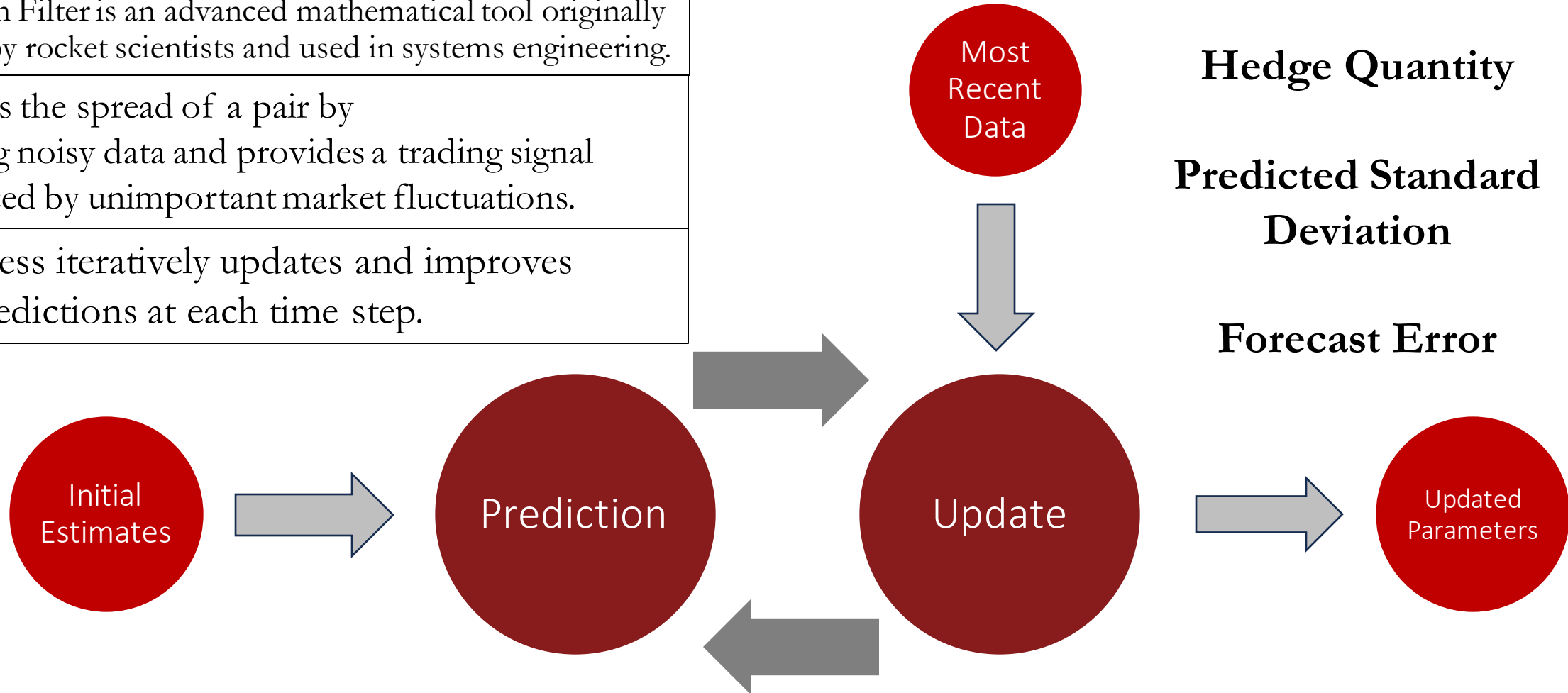
Optimize the portfolio's risk-return profile by dynamically rebalancing positions and finding the optimal ratio of long and short positions that would currently maximize profitability.

The Kalman Filter

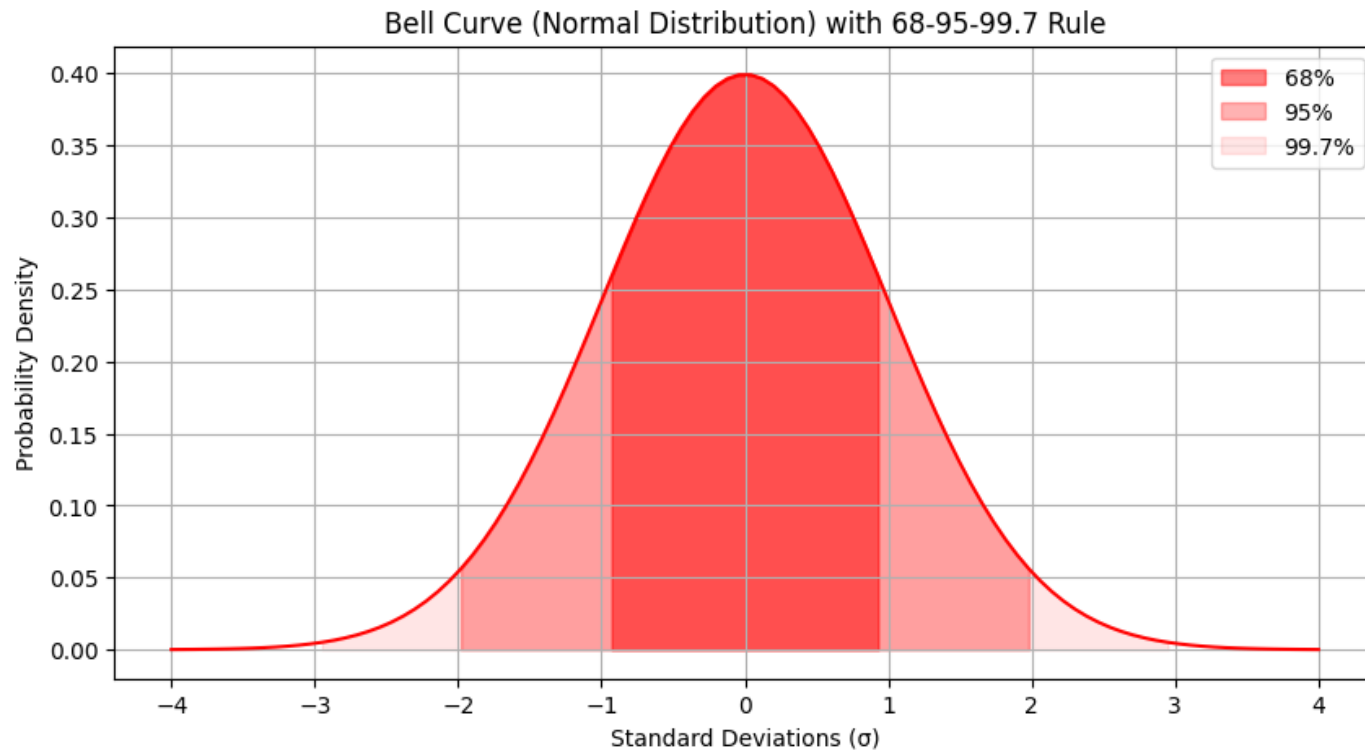
The Kalman Filter is an advanced mathematical tool originally developed by rocket scientists and used in systems engineering.

It measures the spread of a pair by minimizing noisy data and provides a trading signal uninfluenced by unimportant market fluctuations.

This process iteratively updates and improves spread predictions at each time step.



Pairs Selection Process: Our Prerequisites



Criteria Required for Kalman Filter

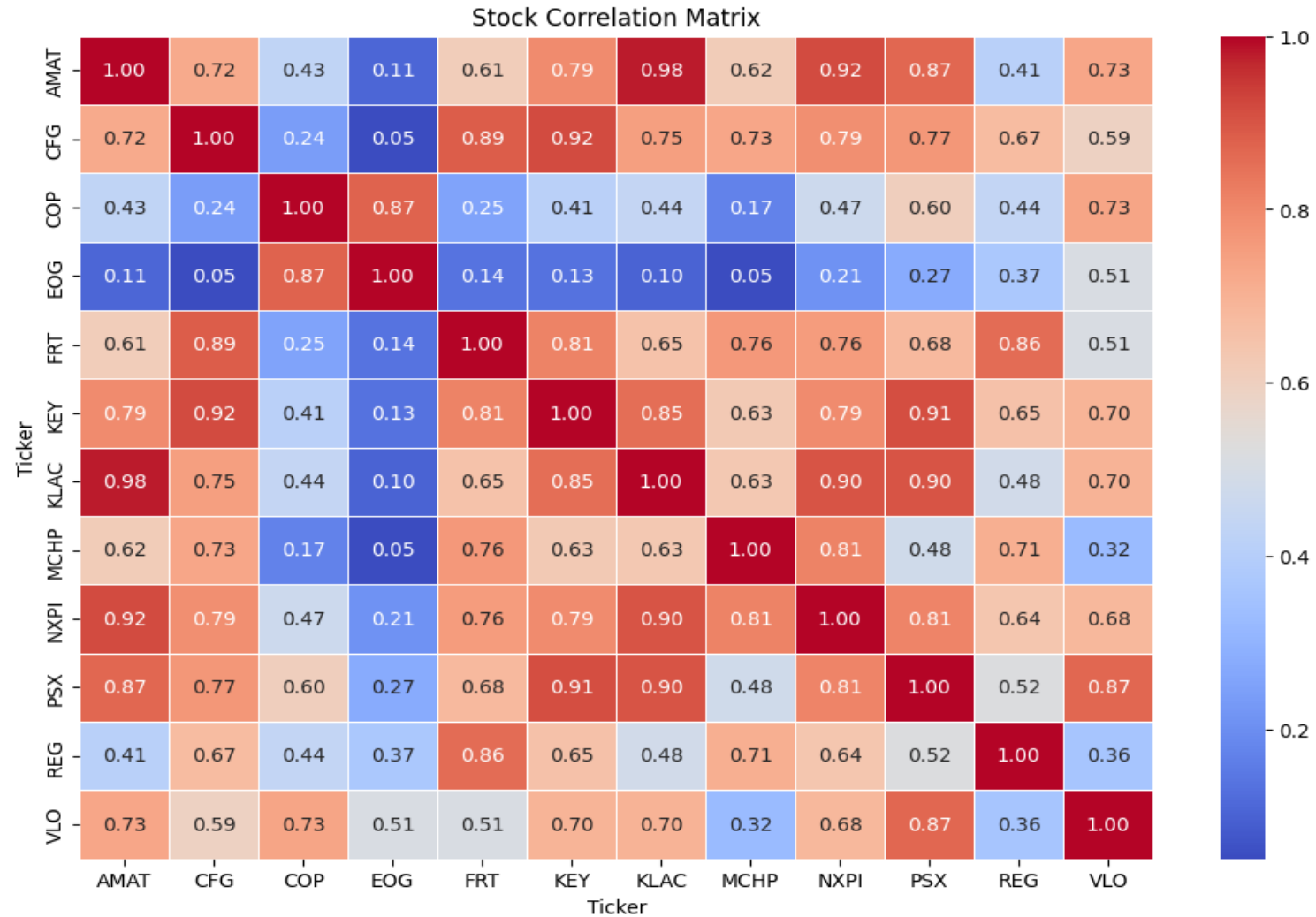
A stock's **daily returns** must follow a normal distribution.

What does this mean?

Test for Skewness: Between -0.5 and 0.5 (normal: 0)

Test for Kurtosis: Between 1.7 and 4.3 (normal: 3)

Pairs Selection Process: The Correlation Matrix



Pairs Selection Process: Cointegration Tests

Purpose: Find cointegrated asset pairs

Key Concept: Stable long-term relationship despite short-term price deviations.

Method: Statistical hypothesis testing for cointegration → confidence level

- Engle-Granger Test
- Augmented Dickey Fuller Test

Trading Application: Identifies pairs for strategies that capitalize on prices converging over time.

Pairs Selection Process: Ranking by Aggregate Volatility

1. NXPI - MCHP: 0.022131
2. KLAC - AMAT: 0.019921
3. KEY - CFG: 0.019349
4. VLO - PSX: 0.015638
5. FRT - REG: 0.012392

Volatility Ratings in Pairs Trading:

Low: $\text{val} < 0.015$

Moderate: $0.015 < \text{val} < 0.020$

High: $\text{val} > 0.020$

Values reflects how much the prices of two correlated assets fluctuate.

Higher agg. volatility \longrightarrow greater risk and potential profit;
Lower agg. volatility \longrightarrow stability but lesser gains.

Introducing Our Pairs

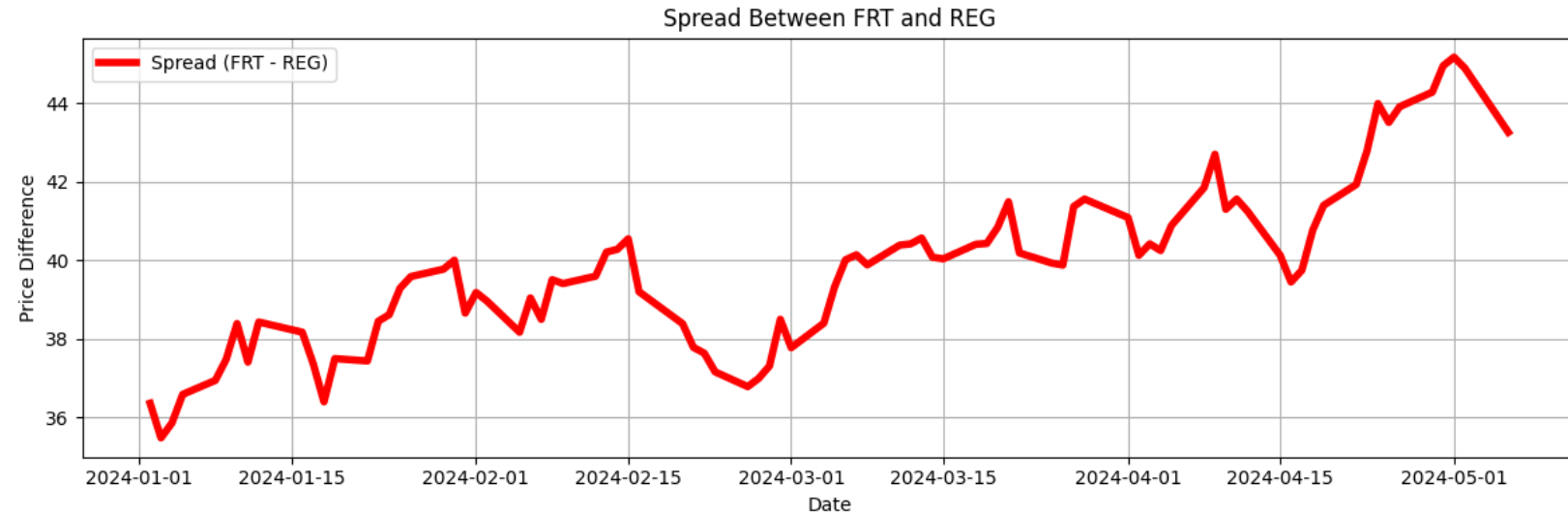
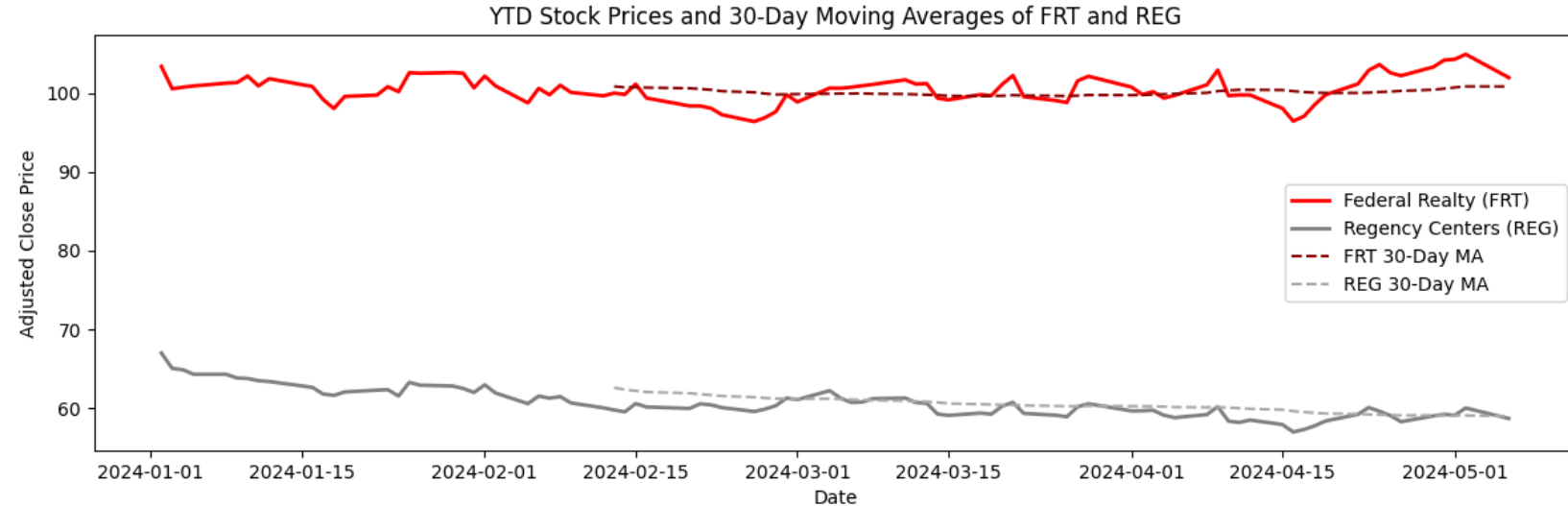
Tickers: FRT – REG

**Federal Realty
Investment Trust (FRT)**

- Industry: Real Estate

**Regency Centers
Corporation (REG)**

- Industry: Real Estate



Introducing Our Pairs

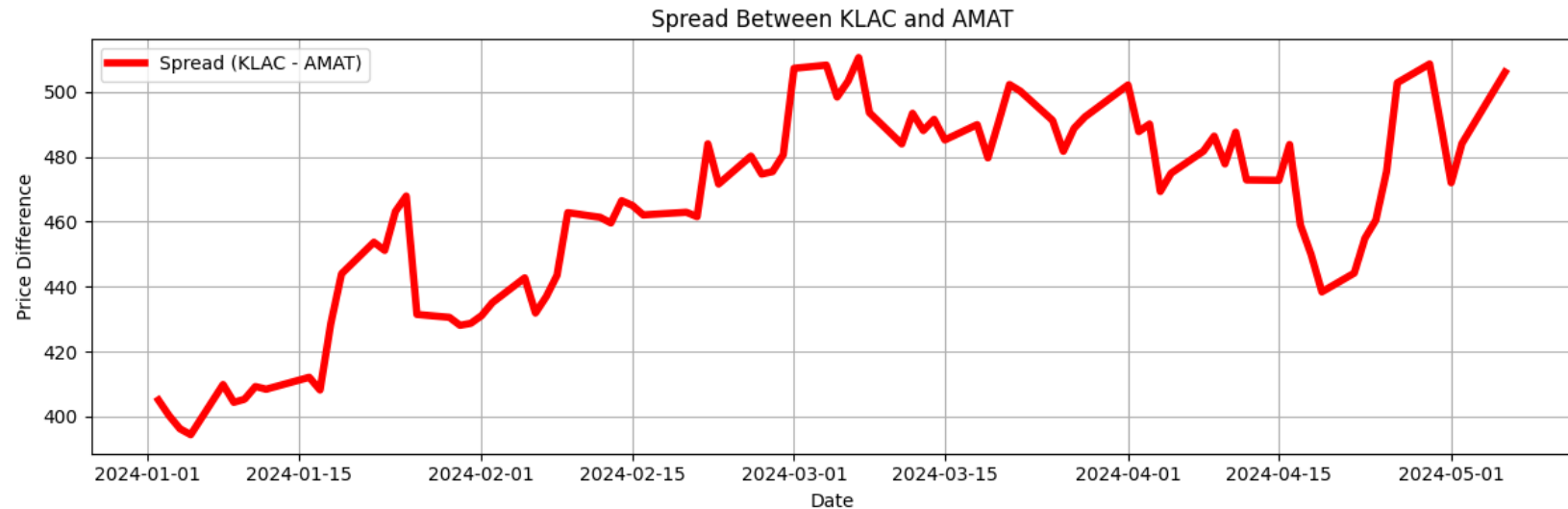
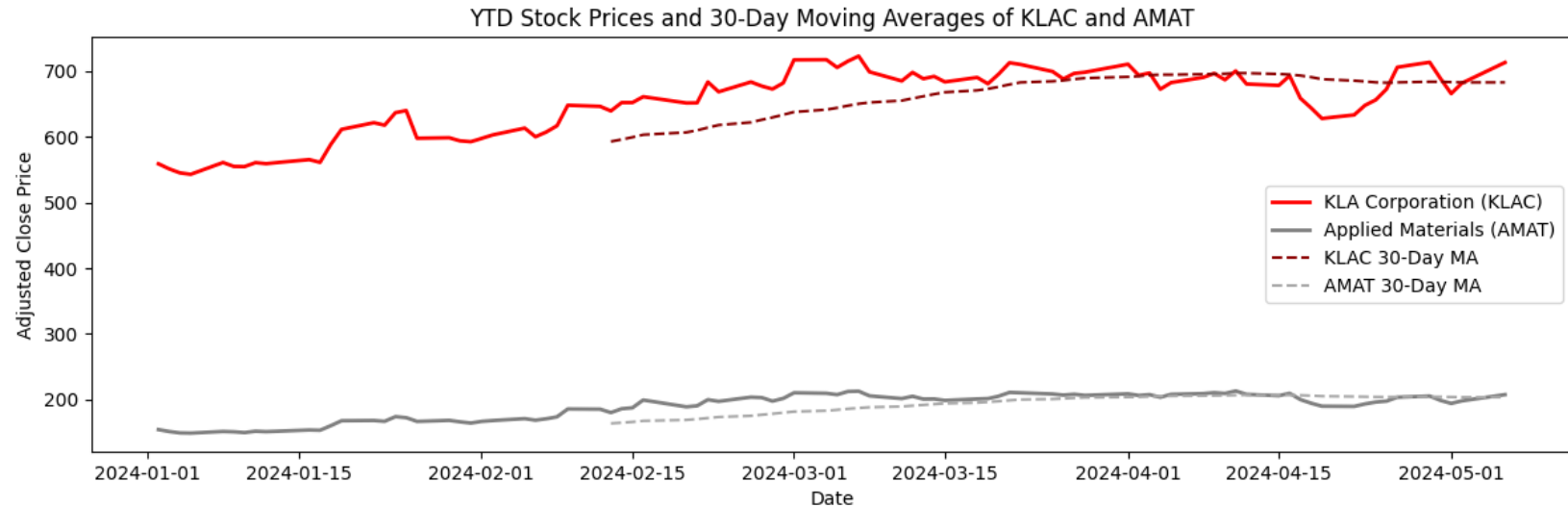
Tickers: KLAC – AMAT

KLA Corporation (KLAC)

- **Industry:** Semiconductor Equipment & Materials

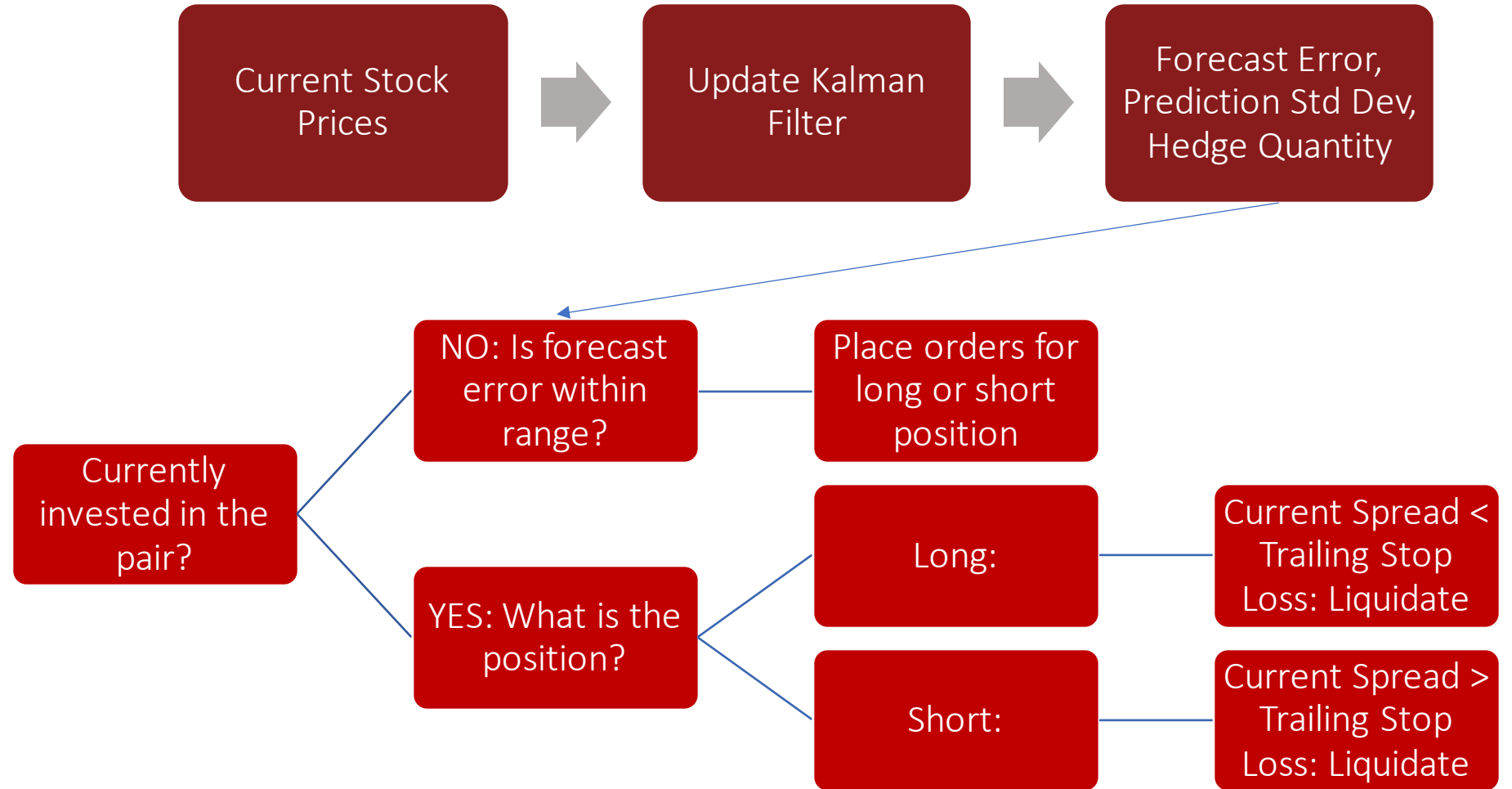
Applied Materials, Inc. (AMAT)

- **Industry:** Semiconductor Equipment & Materials



Algorithm Flowchart

**For each pair:
Execute the
function every
3-5 minutes of
each trading
day**



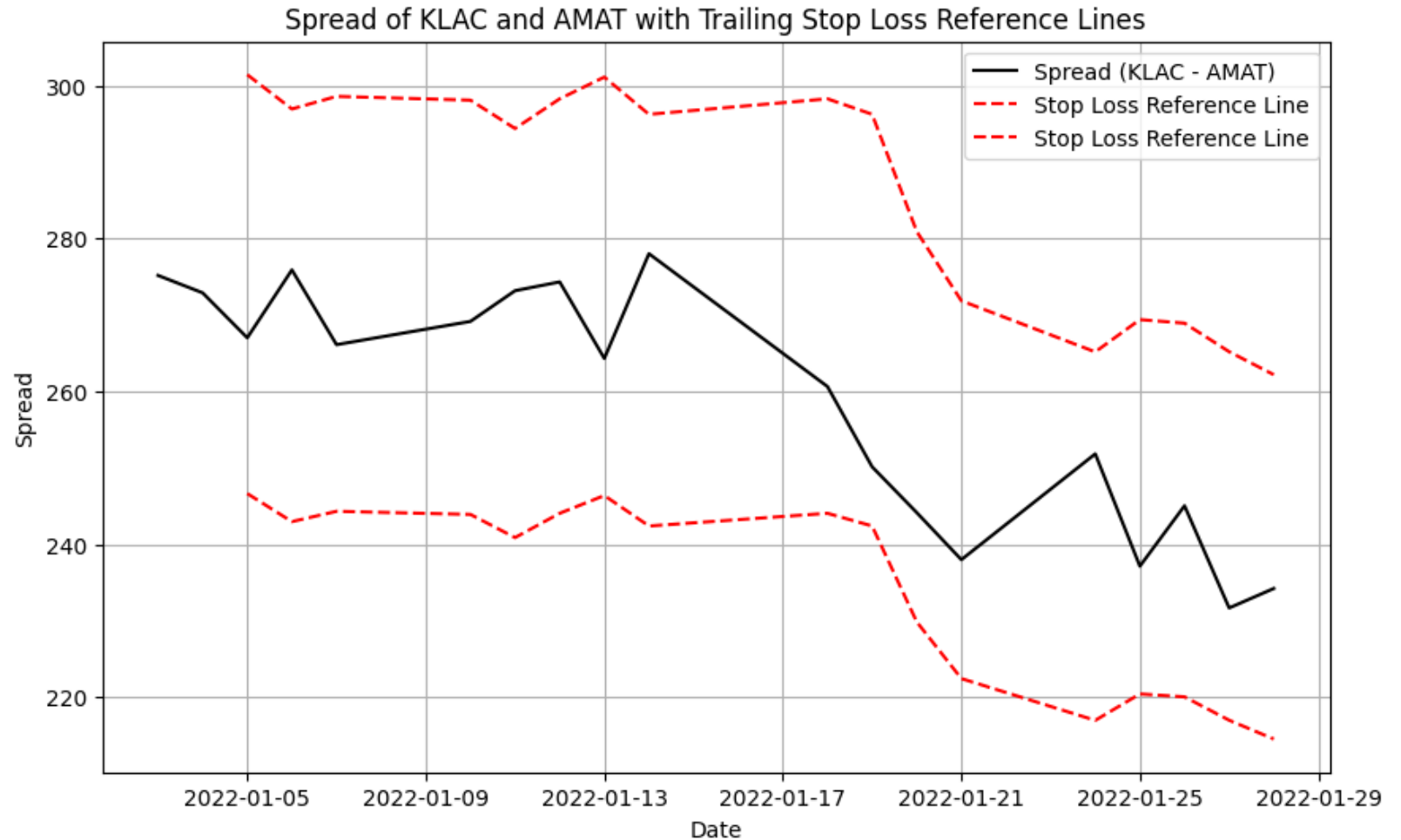
Risk Management: Trailing Stop Loss

Dynamic Protection:

Automatically adjusts liquidation orders as prices move, protecting against potential losses.

Preserves Profits: It

secures gains by selling if prices fall, ensuring capital preservation.



Back-Testing Results (2023 + YTD)



~70% trading in KLAC-AMAT,
30% trading in FRT-REG

Returns: 109.66%

Sharpe Ratio: 1.77

Compounding Annual Return: 77.6%

Alpha: 0.292

Max Drawdown: 15.3%

No trailing stop loss measure

Live Trading Results



KLAC-AMAT Only

91% in trading at first, goes down to 58% by the end, rest is liquid reserves

Rolling 10% stop loss

3.11% returns over 2 weeks

Max Drawdown: 2.3%

Compounding Annual Returns: 82.123%

Alpha: 0.242

Sharpe Ratio: 2.585

SPY Returns over same period: 0.086%

Summary



- Utilized a 4-step statistical analysis process to selectively filter and rank the best possible pairs to trade with out of the S&P 500
- Leveraged the Kalman Filter to dynamically compute and update the hedge ratio between each pair
- Cointegration can break down unexpectedly – qualitative analysis is critical
- KLAC-AMAT is a pair that shows promising returns



Thank You

Questions?