



## **Global Markets Division**

# Searching $\alpha$

**Tracking Google Trends** 

**Return: 93,84%** 

**Investment Horizon:** June 2023 – November 2024

Bauer, Debs, Lőkös, Świętochowska, Mukhamejan, Hohendanner

Vienna, June 25th



### **Team Overview**









### **Global Markets**



Laurent Bauer

Team Lead

- Storyline
- Equities
- Portfolio



MSc. Finance & Accounting (WU) - 2<sup>nd</sup> Semester



Zouher Debs

Senior **Associate** 

■ S&P 500



Flóra Lőkös

Analyst

- Literature Research
- Equities



Maja Świętochowska

**Fellow Analyst** 

 Quantitative Analysis



**Zhangir** Mukhamejan

**Fellow Analyst** 

- Literature Research
- Equities



**Dominik** Hohendanner

Fellow Analyst

- S&P500
- Equities

Morgan Stanley



BSc. BBE (WU) - 4th Semester



BSc. BBE (WU) -2<sup>nd</sup> Semester





MSc. Quantitative Finance (WU) - 2nd Semester



BSc. BBE (WU) -2nd Semester

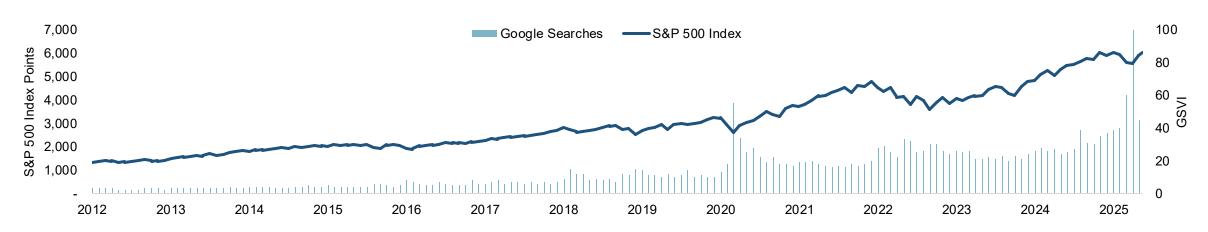


BSc. WiSo (WU) - 5th Sem.

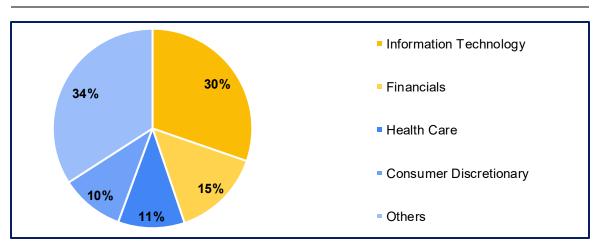


### Overview

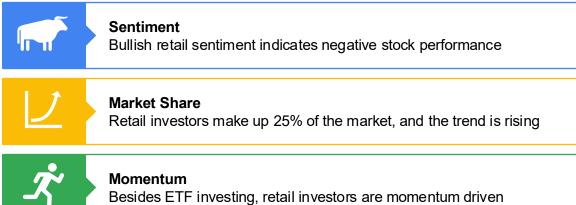
### **Index and Search Query**



### **Sectors**



### **Retail Investors**

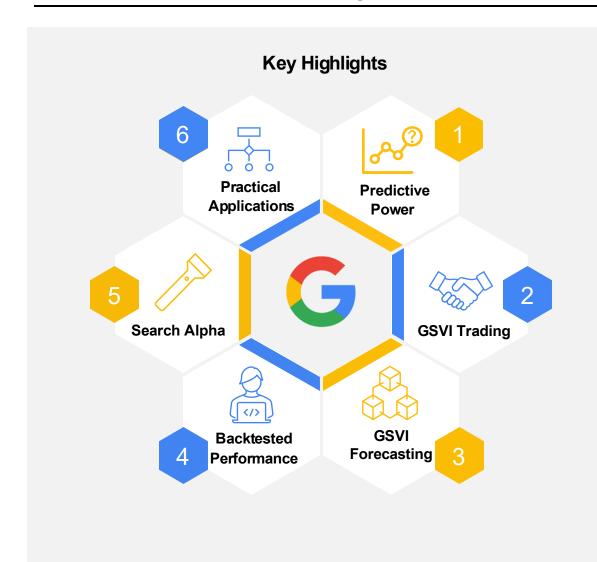


### **GSVI Research Results**





### How Effective Is GSVI in Predicting Market Behaviour?



### **Predictive Power**

Studies show that GSVI reliably predicts returns, volatility, and trading volumes when using stock tickers as keywords and weekly data

**GSVI Trading** Search volume spikes in GSVI often lead to short-term price increases, followed by negative returns as investor attention fades

### **GSVI** Forecasting

The optimal strategy combines "buy after the spike" and "short after the peak" trades, enhanced by technical indicators such as RSI and volume

**Backtested Performance** GSVI-based strategies yield positive returns, correlate with gold, move inversely with bonds, and often price in seasonal patterns like Amazon's Christmas spikes.

### Search Alpha

GSVI signals capture shifts in investor attention and market psychology, offering exploitable timing advantages for short-term trading strategies

**Practical Applications** 6 GSVI helps traders anticipate short-term returns, volatility, and reversals with actionable signals across markets

### **Quantitative Analysis I**

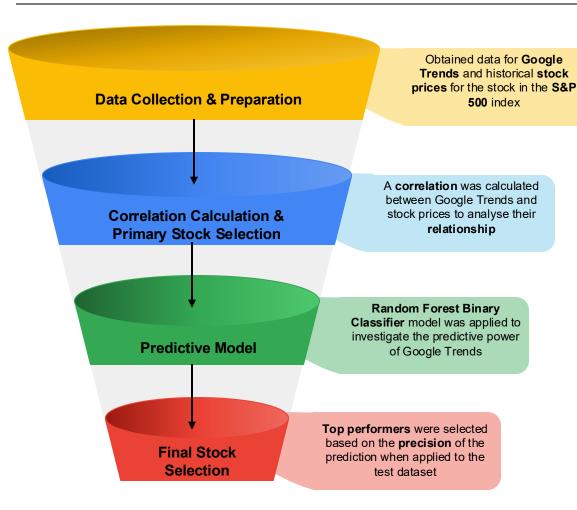




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### Correlation Analysis

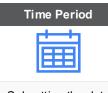
### **Model Setup**



### **Data Preparation & Correlation Calculation**



Monthly stock and Google Trends data used; Google Trends data is taken worldwide.



Subsetting the data period from January 2012 to December 2024.



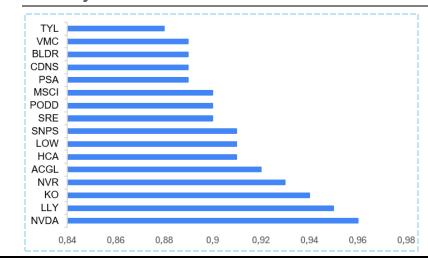
For each stock, Pearson correlation was calculated for the selected time period.



Companies with a correlation above 0.85 were chosen.

The **Google Trends Score** is measured as search interest relative to the highest point of search frequencies for the selected region and timeframe. A value of 100 is interpreted as the maximum popularity, and 0 indicates that there was no or little interest.

### **Primary Stock Selection**



15 stocks with r >0.85 were obtained, with significance at the 5% level.

LOW is excluded from further analysis due to its association with other objects.

### **Quantitative Analysis II**

Random Forest Binary Classifier









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### Model Specifications

#### Independent Variable

- Lagged Stock Prices
- Google Trends
- Moving Averages
- Momentum indicators

#### Dependent Variable

A binary target indicating whether the stock will go up next month

- 0 (down)
- 1 (up)

### Number of trees

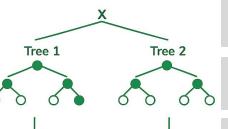
t • 100 decision trees

More trees allow for better model fit.

### Assumptions

- Observations are independent
- Enough predictive signal
- Sufficient data

#### **Random Forest**



**MAJORITY VOTING** 

**FINAL CLASS** 



The model builds **100 trees**, each is trained on a random subset of the data, **sampled using bootstrapping** 



Each tree **splits** the dataset based on the **features**, and at **each node**, only a random subset of features is considered



**Each tree** makes **a prediction**; it outputs either 0 or 1 for a given data point



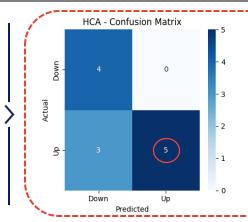
Takes **votes** across all trees, and the most common **outcome** becomes the final prediction

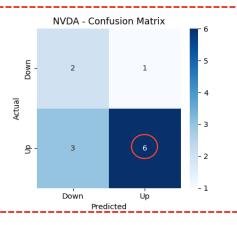
Random Forest Classifier is selected for its ability to handle nonlinear relationships, avoid overfitting, and work with many correlated features.

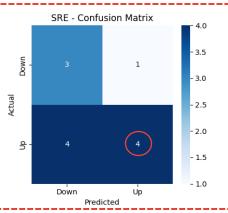
### **Final Stock Selection**

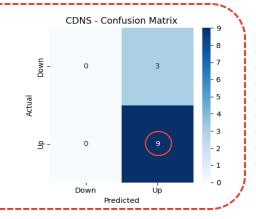
Training data 2012- 2023

Only stocks with a precision above 75% were selected, meaning the model correctly identified an upward movement more than 75% of the time when the stock went up









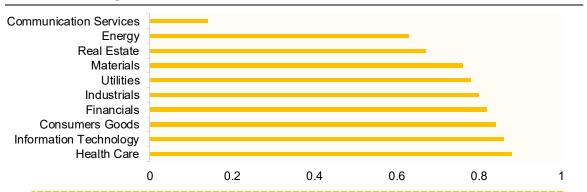
### **Quantitative Analysis III**





### **Further Model Information**

### **Correlation by Industries**



In the initial stock selection, 4 out of 15 companies belonged to the Information Technology sector and 3 to Health Care. In the final stock selection, 2 out of 4 companies are from Information Technology, with the remaining two representing Utilities and Health Care, respectively.

#### Limitations



### Data

Restricted download of data points by one IP address

Only 155 observations

Only based on the ticker



#### Model

Overfitting risk

Market behaviour is non-stationary

Google Searches reflect news coverage or public curiosity, not actual investor behaviour

### Interest by Region

HCA	NVDA	SRE	CDNS
<ol> <li>US</li> <li>Denmark</li> <li>UK</li> <li>Ireland</li> <li>Singapore</li> </ol>	<ol> <li>Israel</li> <li>Hong Kong</li> <li>Taiwan</li> <li>US</li> <li>Singapore</li> </ol>	<ol> <li>Mexico</li> <li>Sri Lanka</li> <li>Cambodia</li> <li>Brazil</li> <li>US</li> </ol>	<ol> <li>Israel</li> <li>Pakistan</li> <li>Taiwan</li> <li>China</li> <li>India</li> </ol>

While most Google Trend searches likely come from individuals interested in finance or investing, some may stem from general public interest in the company or occur incidentally during unrelated stock searches.

#### **Further Research**

Wider data search for Google Trends, include more keywords, like the name of the company, and investigate the effect for each.

2

Include more alternative data sources, social media sentiment from Twitter, Reddit, or Wikipedia page.

3

Include macroeconomic indicators, such as inflation, interest rates, VIX etc.







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### Overview

# **HCA**Healthcare



The Model Showed a Precision of 100% for HCA

HCA Healthcare is operating >180 hospitals and ~2,400 treatment centers. With a network within 20 US states and the UK, HCA Healthcare is a crucial provider in the healthcare sector.

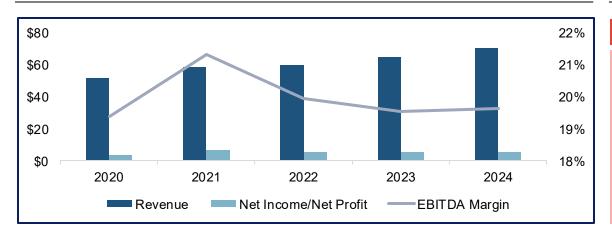


FC = Forecast AC = Actual	FC Up	FC Down
AC Up	5	3
AC Down	0	4

### **Stock Chart and Google Queries**



### Financial Analysis (in B)



### **Drivers / Risks**

#### Spending



CMS expects
hospital
expenditures in
the US to grow
6,1% p.a. until
2031, up to \$2,3T

### Investments



Target market share of 29% in 2030 by optimizing outreach with investments of \$5B

#### Demand



Increasing occurrence of chronic diseases and mental health issues increase demand for healthcare

### Innovation



Implementation of AI increases efficiencies and decreases costs of labor and misdiagnoses











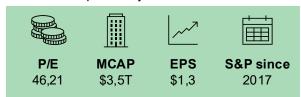
### Overview

# **DVIDIA**



NVDA Shows the Highest Correlation of 96%

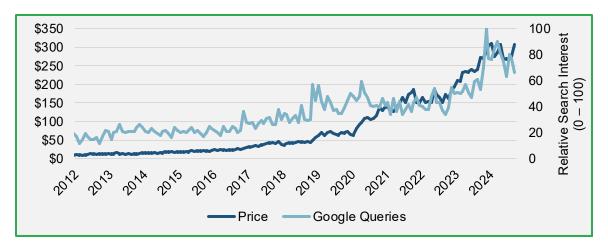
Global leader in AI and accelerated computing, built on its full-stack platform, combining industryleading GPUs, proprietary software (CUDA), and a vast developer ecosystem.



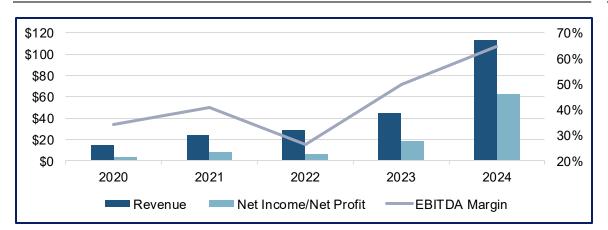
FC = Forecast AC = Actual	FC Up	FC Down
AC Up	6	3
AC Down	1	2

Precision = 85,71%; Accuracy = 66,67%
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### **Stock Chart and Google Queries**



### Financial Analysis (in B)



### **Drivers / Risks**

#### Al Boom



Al factories & generative Al driving GPU & platform demand

### 3D Expansion



Growth in Omniverse, Physical AI, and Sovereign Al markets

#### **Platform Moat**



Durable advantage through CUDA, Al software, and broad platform use

### **External Risks**



Export controls, manufacturing dependency, competition from AMD/Intel











### Precision of the Model for SRE Is at 80% with 4 Correct Forecasts

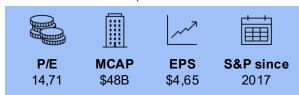
#### Overview





Sector: Utilities

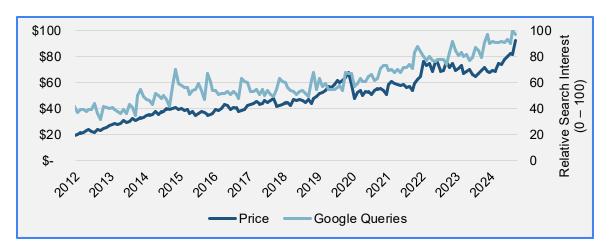
Sempra is a leading North American energy infrastructure company headquartered in California. It operates regulated utilities (SDG&E, SoCalGas, and Oncor).



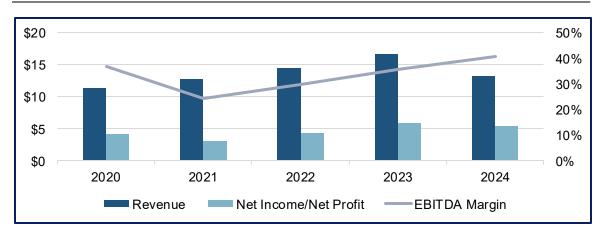
FC = Forecast AC = Actual	FC Up	FC Down
AC Up	4	4
AC Down	1	3

Precision = 8	0%; Accuracy	= 58,33%
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### **Stock Chart and Google Queries**



### Financial Analysis (in B)



### **Drivers / Risks**

### **Utility Expansion**



\$56 billion capex plan (2024–2028) to grow regulated rate base in CA & TX

### LNG Infrastructure



Long-term contracted export terminals driving hard-currency cash flows

### **Energy Transition**



Investments in renewable energy fuels and grid modernization toward net-zero

#### **External Risks**



Regulatory risk, project overruns, market volatility, and rate sensitivity

### **Cadence Design Systems**









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Overview

### cādence°



CDNS shows both lasting returns and revenue growth

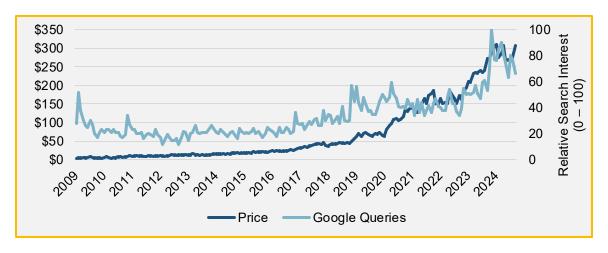
Leading technology company specializing in software and hardware tools for designing and verifying complex electronic systems used across multiple industries.



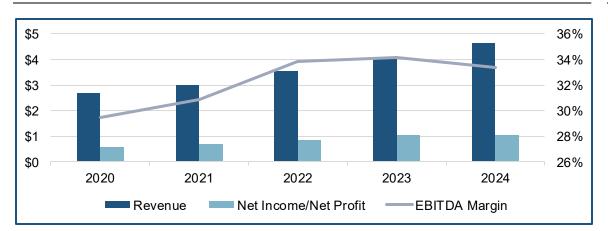
FC = Forecast AC = Actual	FC Up	FC Down
AC Up		0
AC Down	3	0

Precision = 75%; Accuracy = 75%

### **Stock Chart and Google Queries**



### Financial Analysis (in B)



### **Drivers / Risks**

#### **AI-Powered Tools**



Cadence's AI tools are a major differentiator and unlock efficiency in complex chip design

#### **Platform Strength**



Strong competitive position due to integrated software, hardware, and IP

### **China Exposure**



Significant
revenue comes
from China,
subject to U.S.
export controls
and regulatory
shifts

### **Client Dependency**



Revenue depends on a few large semiconductor clients and sectors

### **Portfolio**





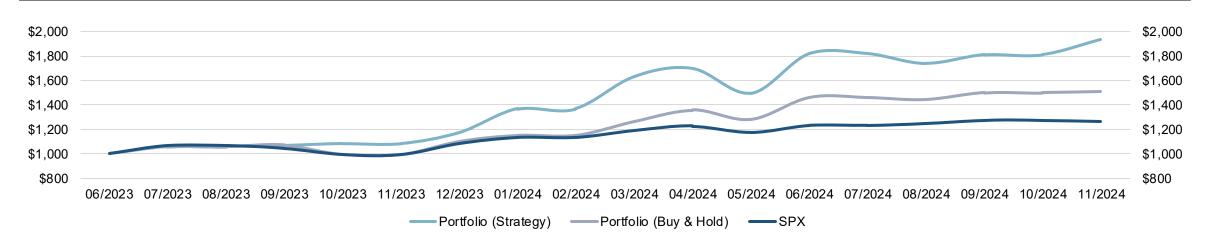




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Our Strategy Outperformed Both the S&P 500 and a Buy & Hold Strategy of the Same Stocks

#### **Performance**



### Trades Summary



### **Trading Days**

Due to date issues, we were only trading 12 months from beginning of June 2023 until End of October 2024, always holding for 1 month



#### **Allocation**

Each months, we would **equally reallocate** all assets amongst all **indicated stocks** 



### **Long Only**

Only long positions were chosen in the quantitative strategy and in months without trading, assets were kept steady

### Performance



The quantitative strategy (93,84%) outperformed the buy and hold strategy of the same stocks (50,99%) and the S&P 500 (26,22%)

### **Monthly Comparison**



8 out of 12 months, the quantitative portfolio outperformed the buy and hold strategy

### **Single Stocks**



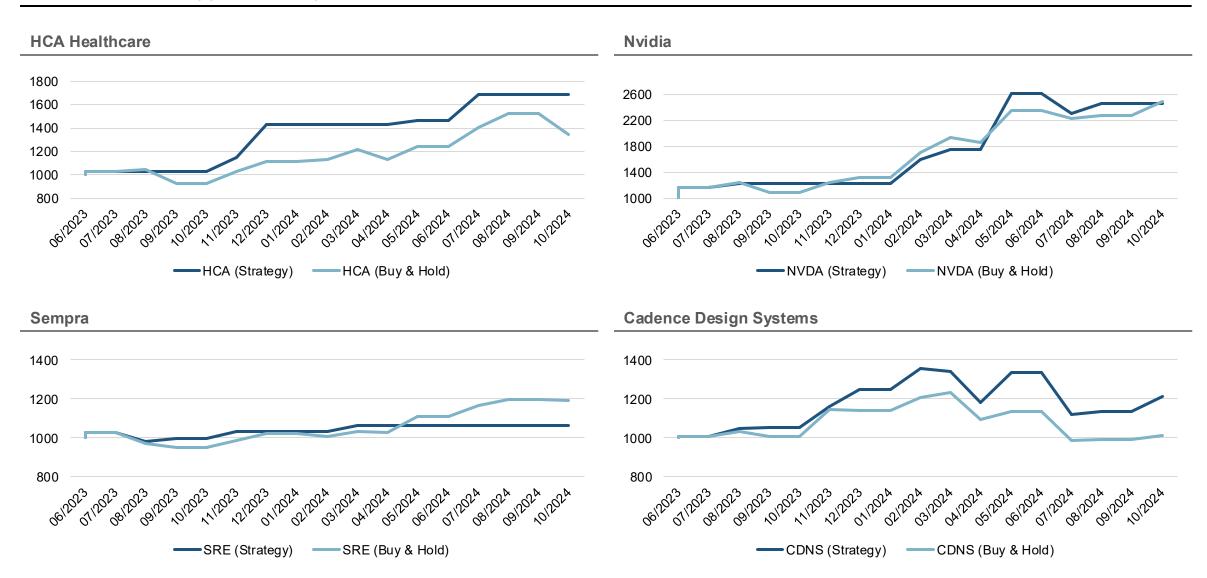
Looking at the single stocks, 2 out of 4 stocks outperformed when using the quantitative approach when held on its own



### Portfolio II



### The Quantitative Approach Outperformed in 2 Out Of 4 Times



# **Appendix**

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Source Name	Link	Date of Retrieval	Used for
Financial Innovation	<u>Link</u>	22.05.2025	Slide 4
lo-fund	Link	10.06.2025	Slide 3
Cui, Wei & Gao, 2025	Link	10.06.2025	Slide 3
JPMorgan Chase & Co	Link	10.06.2025	Slide 3
HCA Healthcare	Link	13.06.2025	Slide 8
Nvidia Corporation	Link	13.06.2025	Slide 9
Sempra	Link	13.06.2025	Slide 10
Cadence Design Systems	Link	13.06.2025	Slide 11

Code available upon request.

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