

# Algorithmic Trading Systems Based on Google Trends

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# About Us

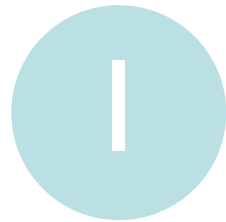


Management & Business Economics  
Research Group



## Investigation:

Research Line: "Economía Emocional" related to Behavioral Finance and Investors' Mood



- Big Data algorithmic trading systems based on IA models using exclusively Investors' Mood

APARA



Edosoft Factory  
○○○○○



## Tecnology:

Elaboration fo financial products and service form previous research



# Conceptual Framework

*1.- Changes in investors' mood provide evidence of anomalies in the behavior of stock markets (Nofsinguer, 2005, Corredor, Ferrer and Santamaría, 2013)*

We observe these changes in:

- Weather (Hirshleifer and Shumway, 2003, Jacobsen and Marquering, 2008)
- Seasonal patterns like vacations “sell in May and go away” or the “Halloween” effect (Bouman and Jacobsen, 2002; Marshall 2010)
- Moon (Yuan, Zheng and Zhu, 2006)
- Sports results (Edmans, García and Norli, 2007; Chang, Chen, Chou and Lin, 2012; Berument, Ceylan and Gozpinar, 2006; Kaplanski and Levy, 2010; Mishra and Smyth, 2010; Gómez and Prado, 2014).

*2.- How to measure mood to predict market trends (Hilton, 2001) Big Data approach:*

- Wu et al. (2013) use big data to predict market volatility,
- Moat et al. (2013) use Wikipedia to determine investor feelings,
- Gómez (2013) elaborated a “Risk Aversion Index” based on the stats of Google Trends.



# Hypothesis and Data

$H_1$ : A big data algorithmic trading system based on artificial intelligence models over investors' mood using Google Trends can generate positive returns.

We will validate this hypothesis if we reach three evidences:

1. Profit/Loss amount is positive including license costs and trading commissions.
2. Success rate is higher than 50%
3. Profit factor is higher than 1

Google Trends: Data available from 2004 in a monthly base.

Prospective analysis starts in January 2017 and ends in February 2018



All the quotes and stats used in this study has been provided by Trading Motion. <https://www.tradingmotion.com/>



The Data Mining tool used has been dVelox developed by Apara. <http://www.apara.es/es/>

# Methodology

Data publication

Training

Prediction

Trading

Google Trends 

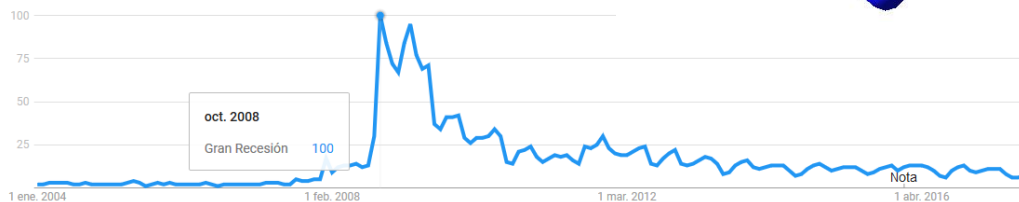


Google search statistics of economic and financial terms that are correlated with the evolution of the market

● Gran Recesión  
Tema

Todo el mundo 2004 - hoy Todas las categorías Búsqueda web

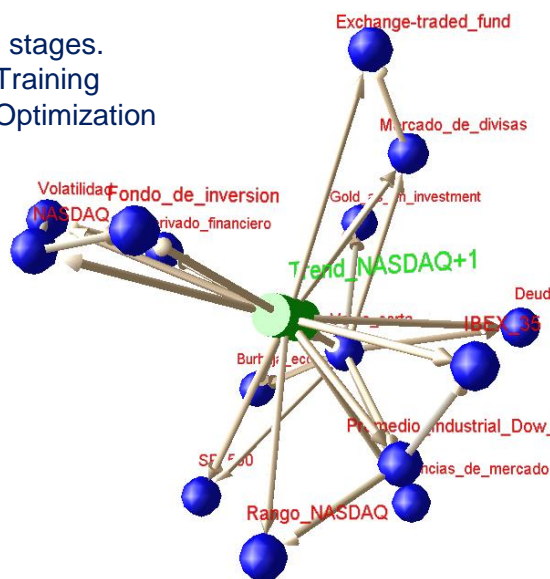
Interés a lo largo del tiempo



With the available data, a model is constructed that explains the evolution of the index

- Two stages.
1. Training
  2. Optimization

Prediction for the next month

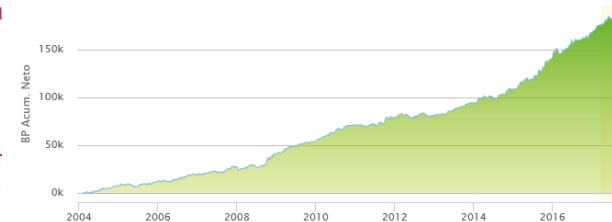


Swing trading systems maintain long or short position depending on the prediction of the previous model

★ Google Monthly Trend NQ

Todo el periodo  
02/02/2004 - 15/09/2017

RESULTADO TOTAL DESDE 02/02/2004	RESULTADO AUDITADO DESDE 01/04/2017	RESULTADO LIVE DESDE -	PEOR DRAWDOWN	CAPITAL SUGERIDO	CAPITAL REQUERIDO
186617 € (+39.1%)	9640 €	0 €	-8345 €	35000 €	5100 €





## Performance of Google Trends Monthly

**Table 1. Performance of Big Data trading algorithmic systems on Investors' Mood**

<b>Index</b>	<b>Profit/Loss</b>	<b>Success rate</b>	<b>Profit Factor</b>	<b>Sharpe Ratio</b>
Ibex 35	-824,00 €	47,80%	0,99	-0,64
Eursotoxx 50	-560,00 €	50,50%	1,00	-0,12
Dow Jones	16.919,00 €	58,20%	1,36	1,52
S&P 500	20.803,00 €	60,70%	1,44	1,86
Nasdaq	34.628,00 €	62.40%	1,54	2,43

Source: Trading Motion (2018)

# Conclusions

In this study, we used an innovative approach to check the capability of the behavioral finance and the Investors' Mood to predict the evolution of the financial markets.

We can check that these “pure investors' sentiment” systems can be profitable for the American indexes while the result is poor for European ones.

1. Google Trends is a good investors' sentiment metric for the American indexes studied, closer than global sentiment if Google Trends has been no limited by location. The poor results for Ibex or Eursotoxx suggests a limitation in Google Trends stats for this models in further investigation.
2. Trading systems can be developed using an alternative approach to common systems based on technical analysis. This study has shown how the trading system for Dow Jones, S&P 500 and Nasdaq, based on the predictions of an artificial intelligence model that uses investors' mood from Google Trends to predict is capable to generate positive returns in a long/short strategy.





# Next step

★	Sistema	Producto	📊	Tipo	Desarrollador	Fecha inicio	Resultado Total	Sesiones Ganadoras	Profit Factor	ROI Anualizado	Peor Drawdown	Capital requerido	Ratio Sharpe
★	Google Trends Monthly NQ	NQ	📊	C	InvestMood	02/2004	218301 €	55.9%	1.41	+30.2%	-11259 €	6800 €	1.6043
★	Google Trends Monthly ES	ES	📊	C	InvestMood	02/2004	186627 €	55.9%	1.30	+23.5%	-13462 €	6800 €	1.1403
★	Google Trends Monthly DJ	YM	📊	C	InvestMood	02/2004	159841 €	55.7%	1.30	+18.5%	-12230 €	7000 €	1.1674
★	Google Trends Monthly GC	GC	📊	C	InvestMood	12/2006	335051 €	54.9%	1.32	+17.5%	-19707 €	20200 €	0.9089
★	Google Trends Monthly IBEX	MN	📊	C	InvestMood	02/2004	45221 €	54.2%	1.34	+20.9%	-3719 €	1600 €	1.2647
★	Google Trends Monthly FDXM	FDXM	📊	C	InvestMood	02/2004	185430 €	56.2%	1.37	+32.1%	-10582 €	5800 €	1.6721
★	Google Trends Monthly QM	QM	📊	C	InvestMood	02/2004	221477 €	54.9%	1.35	+43.8%	-10290 €	3800 €	1.6781
★	Google Trends Monthly FESX	FESX	📊	C	InvestMood	02/2004	21958 €	50.1%	1.06	+3.04%	-16256 €	4300 €	0.1617

<https://www.tradingmotion.com/Strategies/Explore>



# Next step



**DESARROLLADOR**  
InvestMood

**PRODUCTO**  
Futuro E-mini Nasdaq (USD)

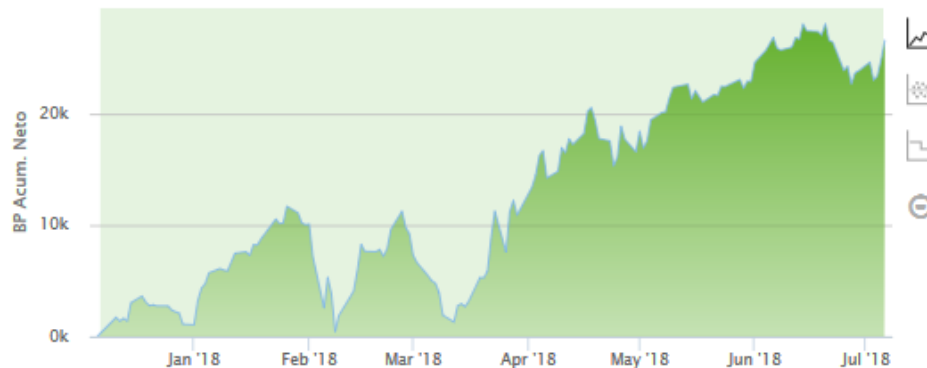
**TIPO DE SISTEMA**  
Continuo

**COSTE**  
50 € / mes (+)

## ★ Google Trends Monthly NQ

Desde Operativa Real  
07/12/2017 - 06/07/2018 ▾

Resultado Total desde 02/02/2004 (+)	Resultado Verificado desde 01/04/2017	Resultado Live desde 07/12/2017	Peor Drawdown	Capital Sugerido (+)	Capital Requerido (+)
218301 € (+30.2%)	41324 €	26591 €	-11259 €	50000 €	6800 €



### Estadísticas 07/12/2017 - 06/07/2018

Sesiones Analizadas (+) 151	Sesiones Ganadoras (+) <span style="display: inline-block; width: 55.7%; height: 10px; background-color: #90EE90; border: 1px solid black;"></span> 55.7%	Peor Drawdown (+) -11259 € (08/02/2018)
Resultado Total (+) 26591 €	Racha Beneficios Actual (+) 26157 €	Drawdown Actual (+) -1489 € (21/06/2018)
ROI Anualizado (+) +92.0%	Mejor Sesión (+) 3616 € (27/03/2018)	Peor Sesión (+) -4598 € (05/02/2018)
Profit Factor (+) 1.45	Promedio Sesión Ganadora (+) 1047.68 €	Promedio Sesión Perdedora (+) -909.34 €
Comisión por contrato \$8.00	% Tiempo con Posición Abierta (+) 100%	Slippage por contrato (+) -0.2446 (4.01 €)
Rating TM (+) <span style="color: orange;">■</span> 3/3	Ratios Sharpe / Sortino (+) 2.2256 / 3.7324	Ratios Sterling / MAR (+) 0.0000 / 4.8471

### Resultados mensuales

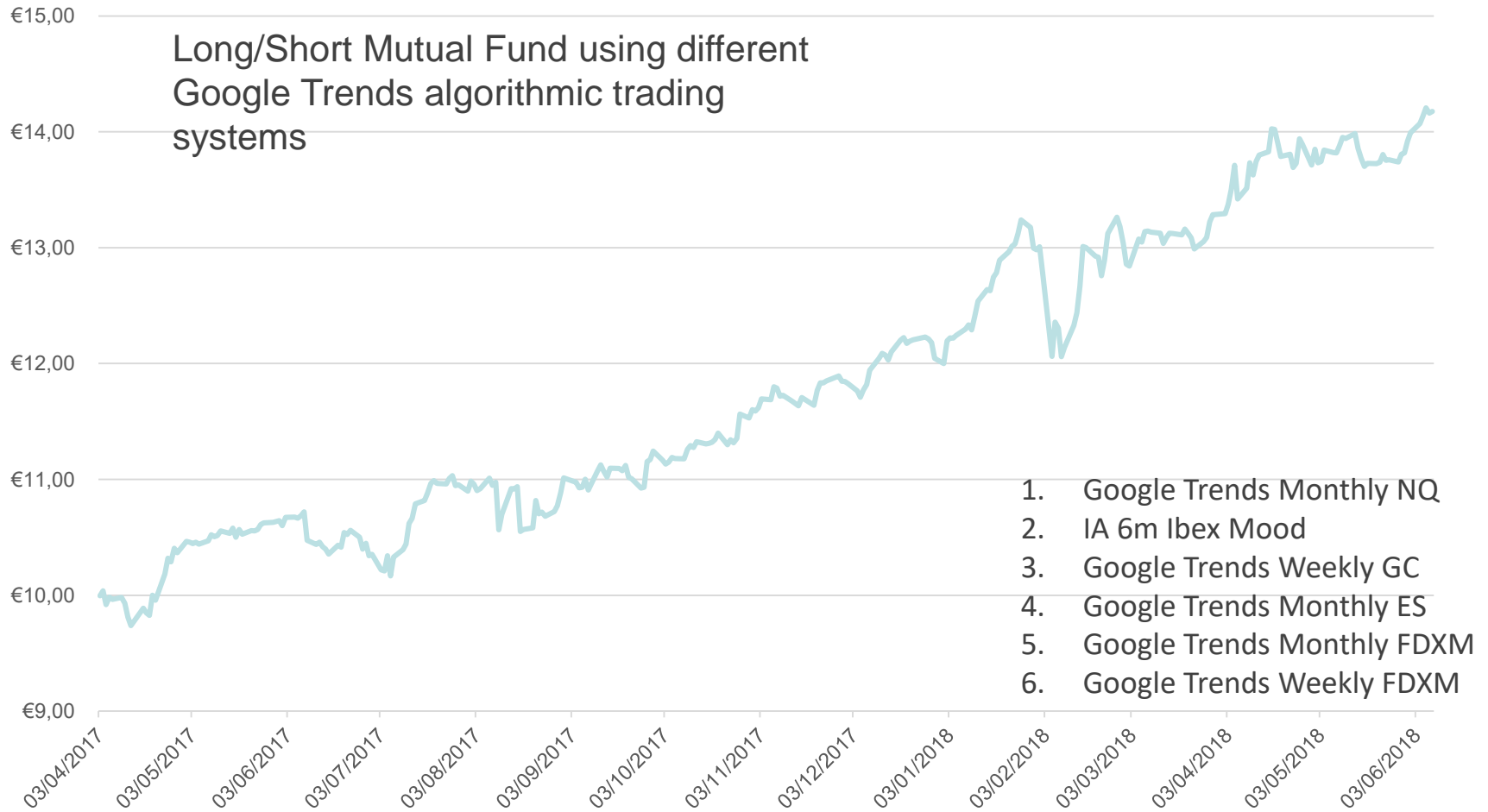
Log Operaciones Log Sesiones

Backtesting  Verificado  Live Trading

Año	Ene	Feb	Mar	Abr	Ma	Jun	Jul	Ago	Sept	Oct	Nov	Dic	Total	Total %
2018	8931 €	-799 €	1665 €	5683 €	6325 €	949 €	2737 €	-	-	-	-	-	25489 €	51.0%
2017	-	-	-	-	-	-	-	-	-	-	-	1101 €	1101 €	2.2%



# VLP Simulation





**Thank You**

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