# "Portfolio optimization and Trading Strategies: a simulation approach"

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Workshop on Agent-based Modelling and Policy-Making

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#### Introduction

Portfolio Selection Theory

**Harry Markowitz (1952)** 

**CAPM** – Sharpe

Maximization of a portfolio performance index → Sharpe ratio

Agent-Based Models in Financial markets

**Complex system** 

# **Sharpe ratio optimization**

Markowitzian caveats

all wealth is allocated

informative set  $\longrightarrow$  available data

no interaction

Multi-period optimization problem

**12** Heterogeneous strategies

$$argmax_{\chi} \quad \underbrace{\frac{E(r_T \cdot x_T)}{sd(r_T \cdot x_T)}}$$

*subject to*:

$$(1 + \mathbf{r}_t \cdot \mathbf{x}_t) \cdot W_{t-1} = W_t \qquad t = 1, \dots, T$$
$$x_t \cdot e = 1 \qquad t = 1, \dots, T$$

## **Fundamentalist**



#### **Fundamental value:**

$$FV_t = FV_{t-1} + D_t$$

#### **Expectation**:

$$p^{exp} = FV_t + \Theta_F$$



$$p_t^{ ext{exp}} > p_t^{mkt} \longrightarrow ext{BUY}$$
  $p_t^{ ext{exp}} < p_t^{mkt} \longrightarrow ext{SELL}$ 

#### Chartist



Murphy (1999)

#### **Momentum trader**

#### **Expectation:**

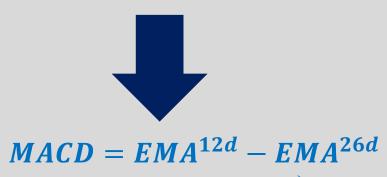


$$p^{exp} = p_t \pm (p_t - RV_t)$$

$$RV_t = \frac{1}{S} \sum_{j=t-S}^{t} p_j$$

# Moving Average Convergence Divergence

Murphy (1999)

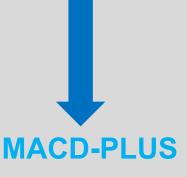








#### **MACD-BASIC**



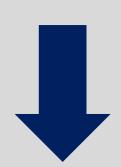
 $MACD > EMA^{9d} \longrightarrow BUY$   $MACD < EMA^{9d} \longrightarrow SELL$ 

#### **MACD-DIVERGENCE**

$$\begin{cases} \alpha_S < 0 \land \alpha_M > 0 \longrightarrow \mathsf{BUY} \\ \alpha_S > 0 \land \alpha_M < 0 \longrightarrow \mathsf{SELL} \end{cases}$$

#### Crossover

Murphy (1999)



$$EMA^{26d} < min(EMA^{20d}; EMA^{12d}) \longrightarrow BUY$$

$$EMA^{26d} > max(EMA^{20d}; EMA^{12d}) \longrightarrow SELL$$

#### RSI

Murphy (1999)



#### **Relative Strength Index (Wilder)**

$$RSI = 100 - \left(\frac{100}{1 + RS}\right)$$

Comparison between the trend of the RSI series referred to the entire original price series and the trend of the RSI series referred to a given interval of observation

# **Stochastica**

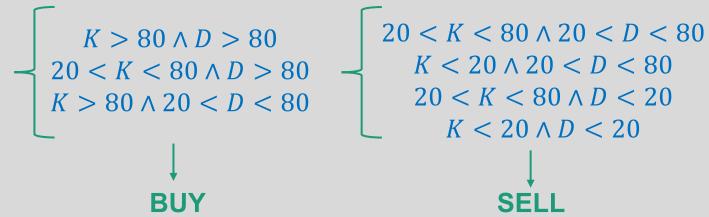
Murphy (1999)



$$K=100\cdot\frac{C-L5}{H5-L5}$$

$$D=100\cdot\frac{H3}{L3}$$





## ROC

Murphy (1999)



Rate of Change

$$ROC = \frac{V}{V_x}$$



$$ROC \ge 1 + c \longrightarrow BUY$$
 $ROC < 1 + c \longrightarrow SELL$ 

# Random



No portfolio optimization strategy

# **Econometric** forecasting



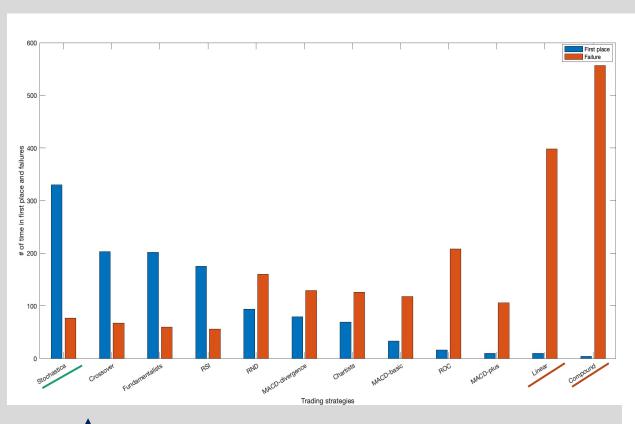
#### **OLS** estimation

• Linear:

$$Y = a + b \cdot t$$

• Compound:

$$Y = c \cdot d^t$$

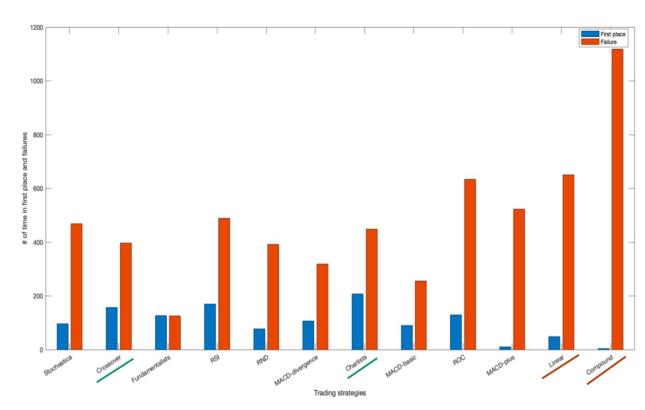




Hourly data

# Results: Ranking

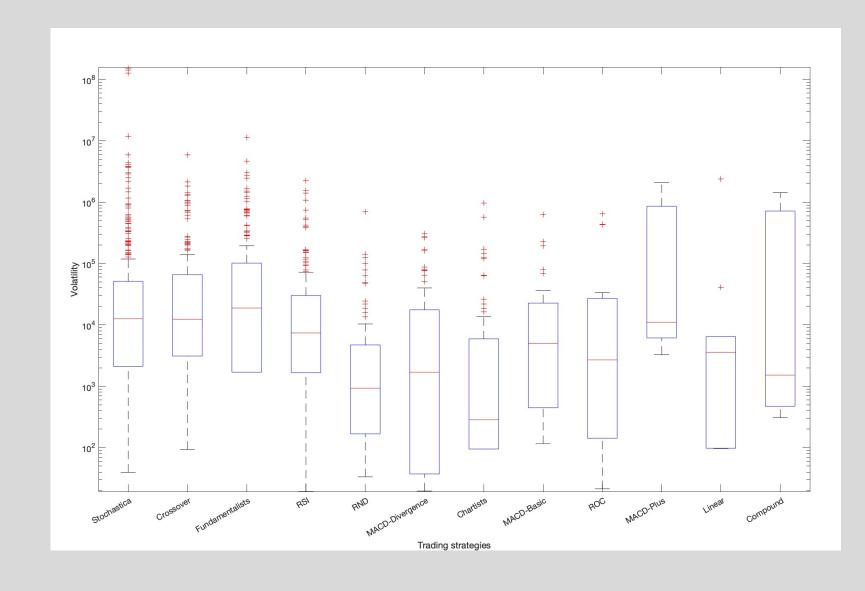
- 50 assets
- 12 heterogeneous traders
- 250 \$ of initial money
- 1225 portfolios



# Results: Volatility

The volatility of the best performing strategy has been computed as the standard deviation of the distribution of portfolio values associated to that strategy for all occurrences in which it has ranked first.

This figure compares the volatility of all winning strategies



## Conclusions

There are no concordant rankings of various strategies at different time lengths resolution.

This provides evidence that optimal strategies are more a desire of investors than actual results

The complexity of the system prevents any forecast and so past trends need not be replicated.

**Even best performing strategies manifest wide variability** 

Variability of results is not simply linked to the goodness of the adopted strategy.

All strategies are uncertain and potentially harmful.