

**The stylised
facts of financial
markets**

FACE THE FACTS



Learning outcomes

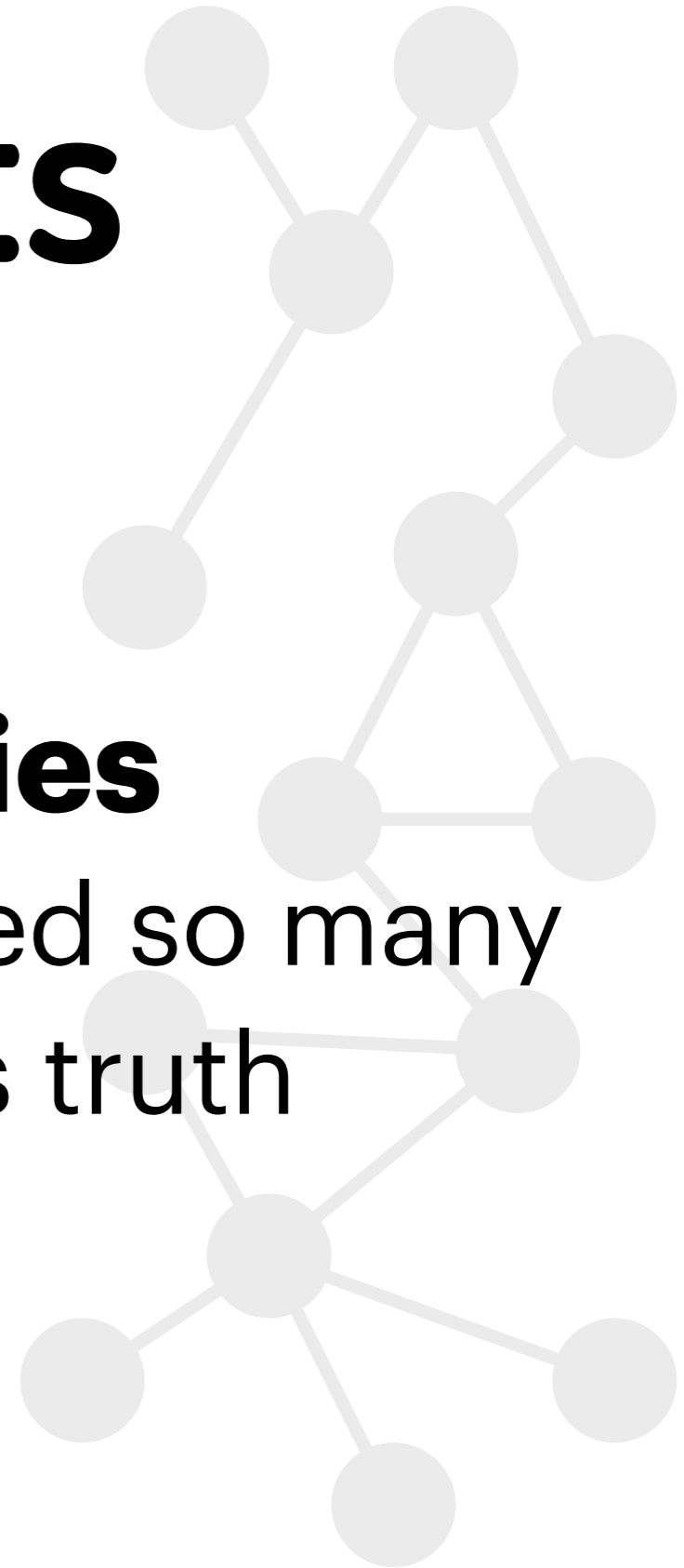
Understand financial markets from their patterns
Apply stylised facts to ABM validation



Stylised facts

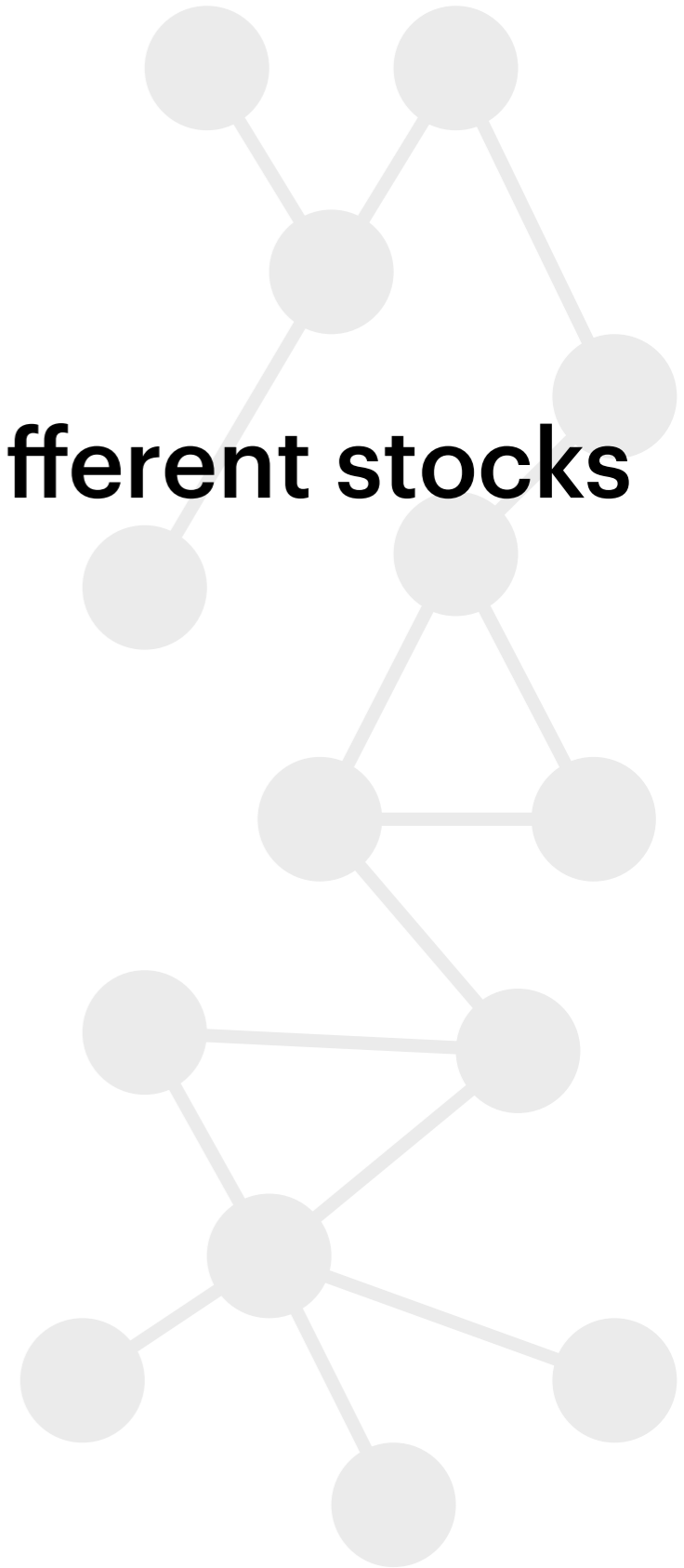
Empirical Regularities

patterns that have been observed so many times they are accepted as truth



returns

Price cannot be compared across different stocks
Price time series display trends



returns

Solution: relative (%) changes



returns

Solution: relative (%) changes



Well yes, but actually no

returns

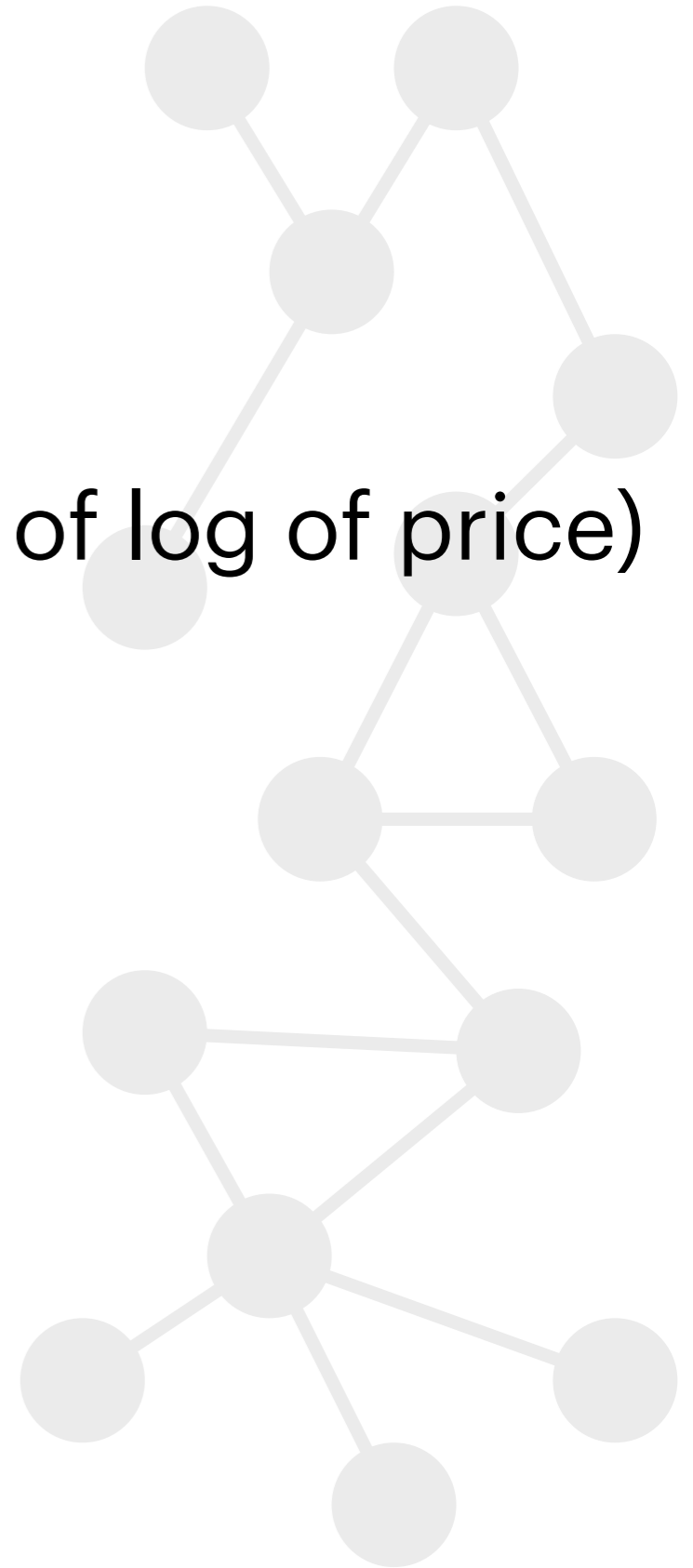
Solution: relative (%) changes

Relative changes also have some “problems”



returns

Instead, we use log-returns (difference of log of price)



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$S(t)$

Price at time t

returns

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Price at time t

$X(t) = \ln(S(t))$

Log price

returns

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$S(t)$ **Price at time t**

$X(t) = \ln(S(t))$ **Log price**

Δt **Time unit (minutes, hour, day, etc.)**

returns

Instead, we use log-returns (difference of log of price)

$S(t)$ **Price at time t**

$X(t) = \ln(S(t))$ **Log price**

Δt **Time unit (minutes, hour, day, etc.)**

$r(t, \Delta t) = X(t + \Delta t) - X(t)$ **Log return**

returns

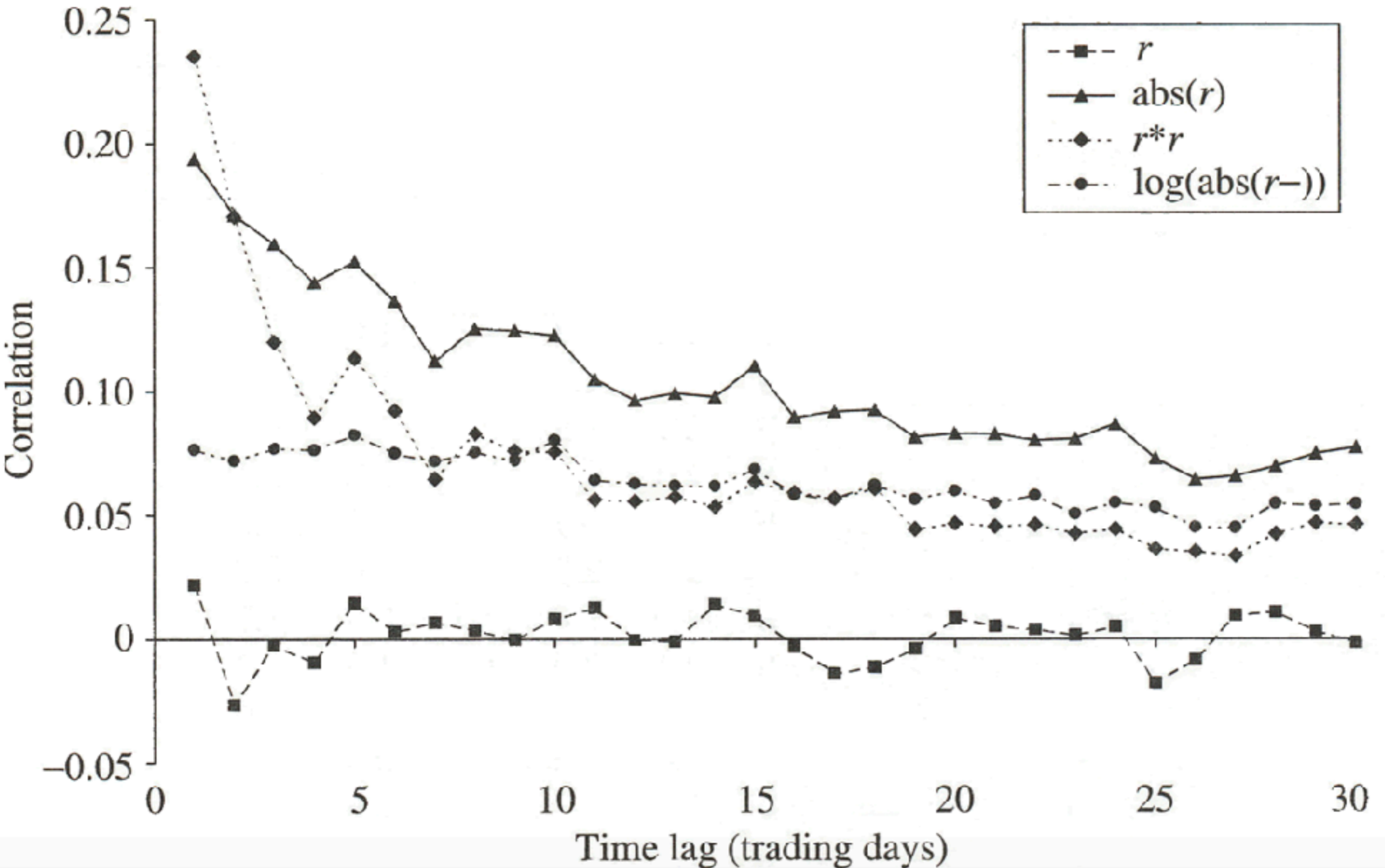
$$r(t, \Delta t) = X(t + \Delta t) - X(t)$$

Stationary

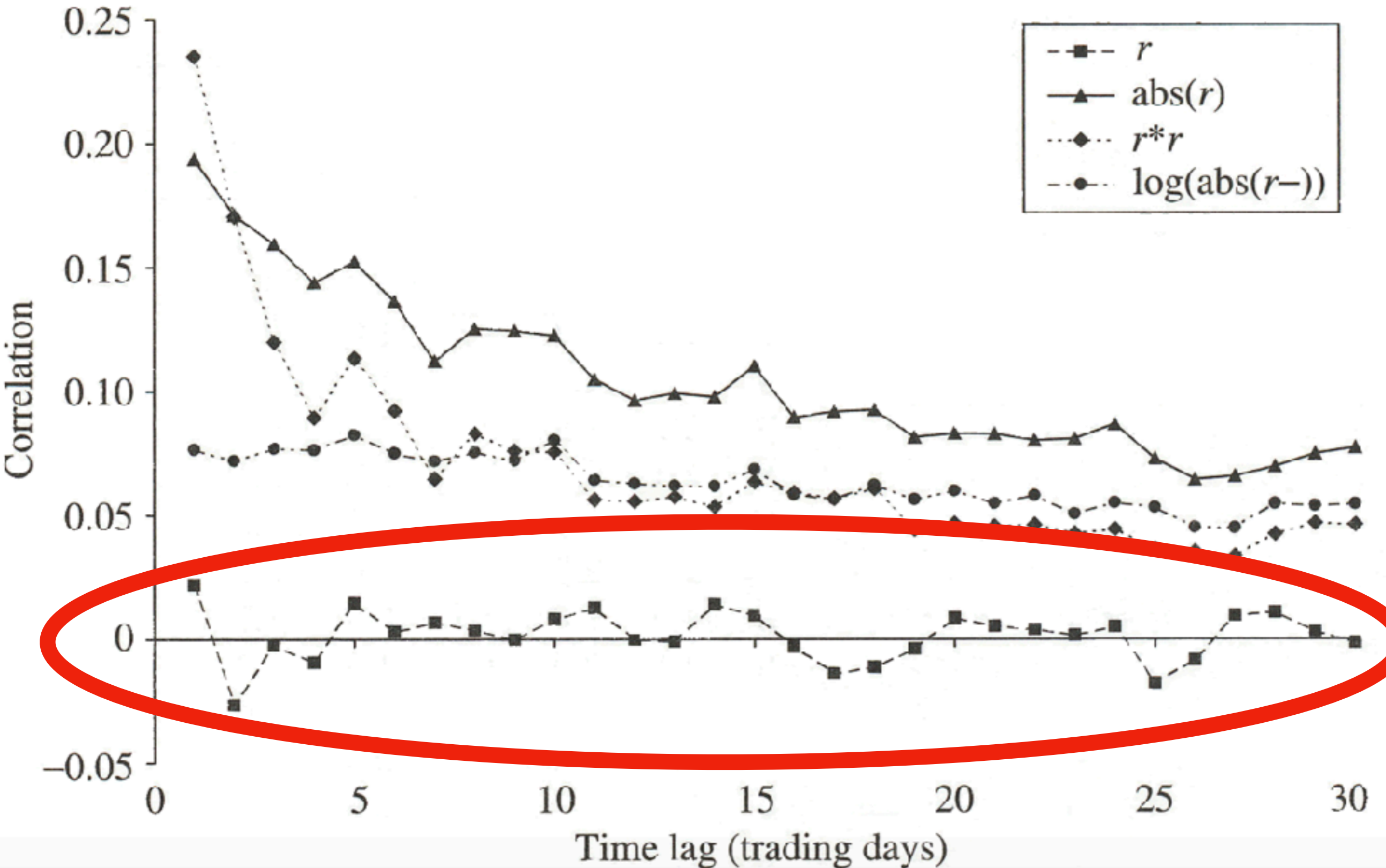
Time invariant

**Approximate relative returns well when
returns are small**

Autocorrelation



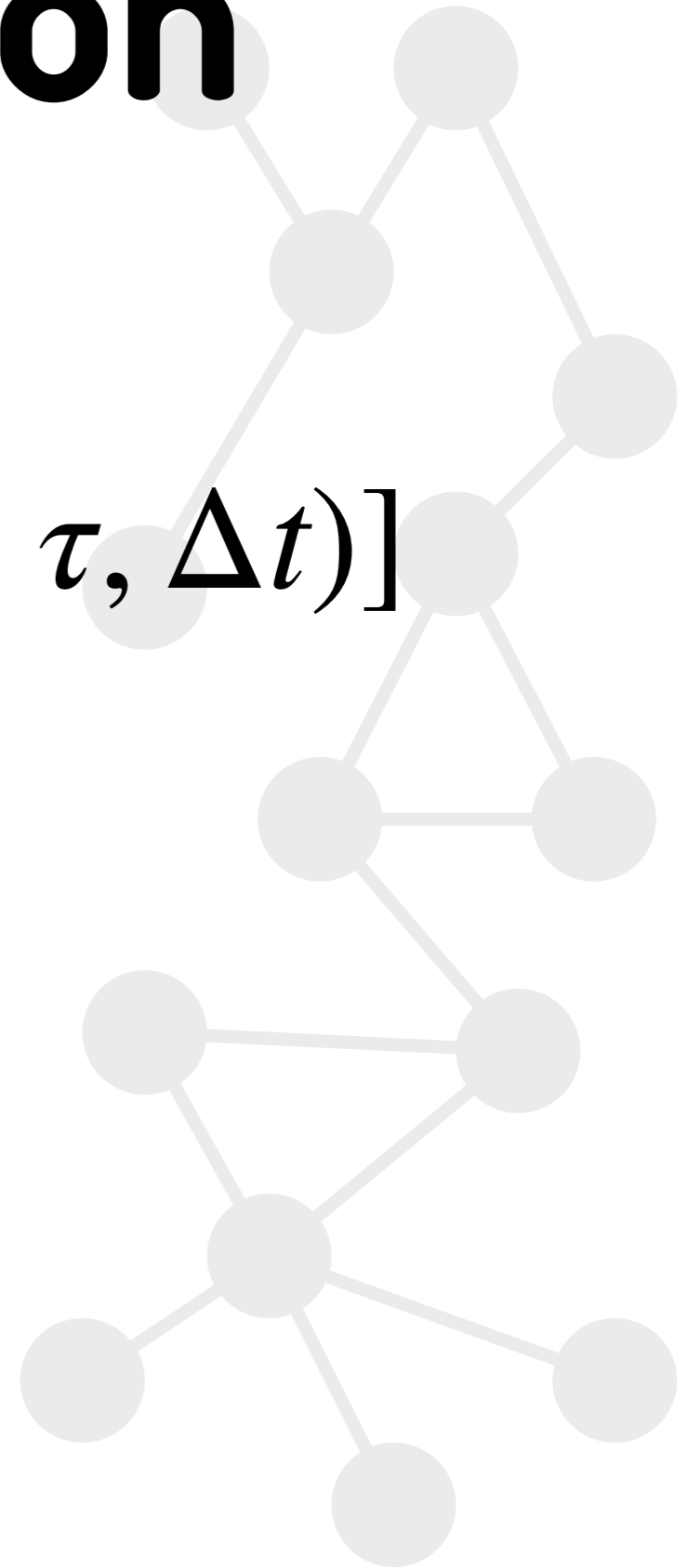
Autocorrelation



Autocorrelation

$$C(\tau) = \text{corr}[r(t, \Delta t), r(t + \tau, \Delta t)]$$

$$C(\tau) = 0, \forall \tau$$

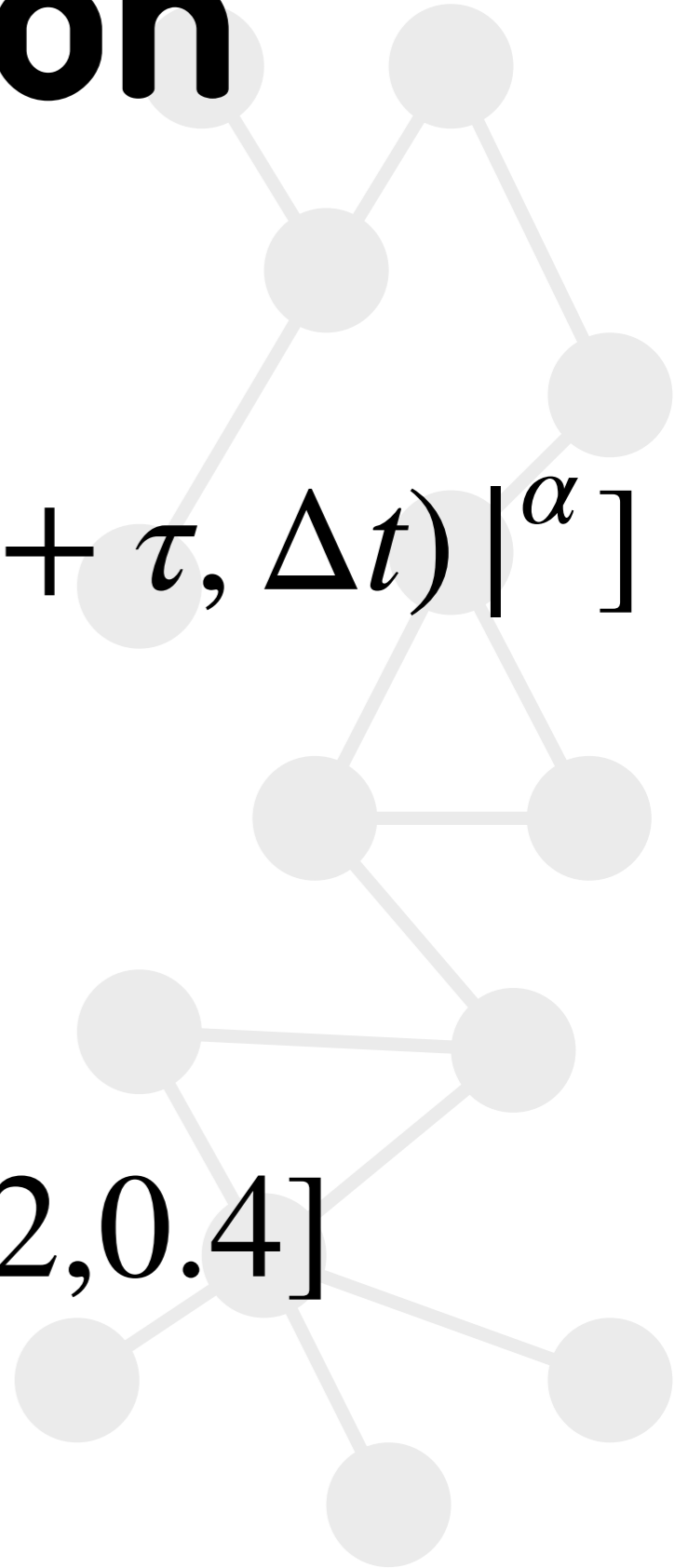


Autocorrelation

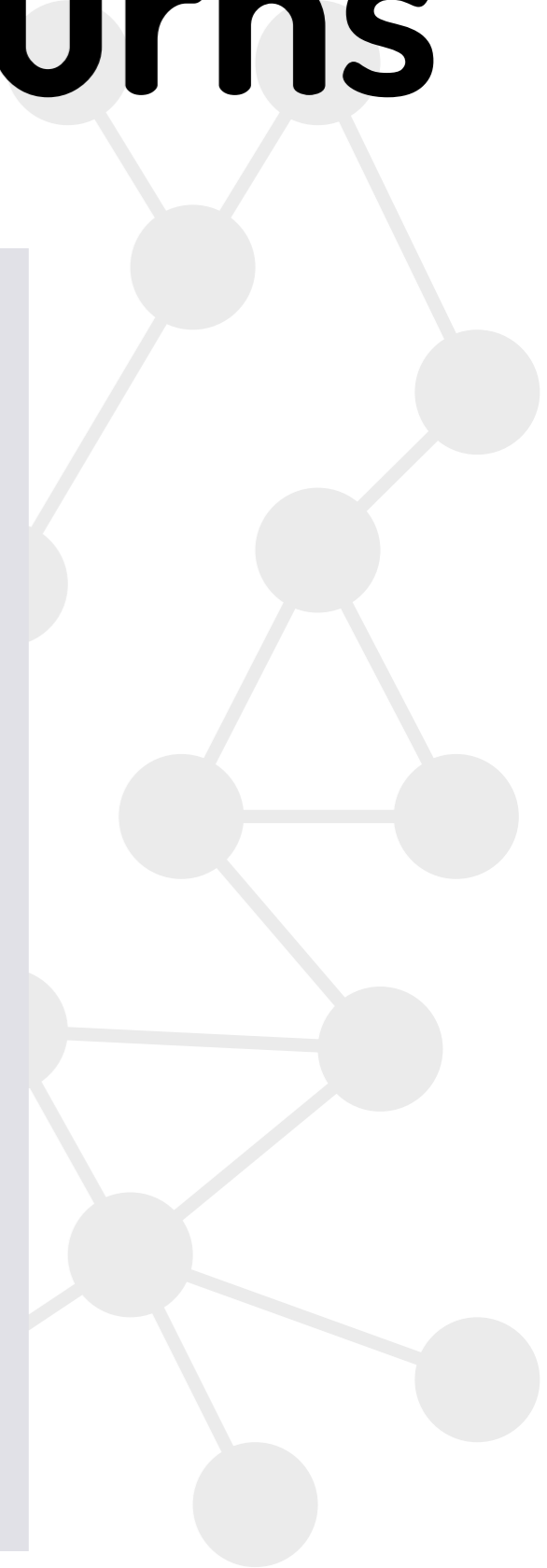
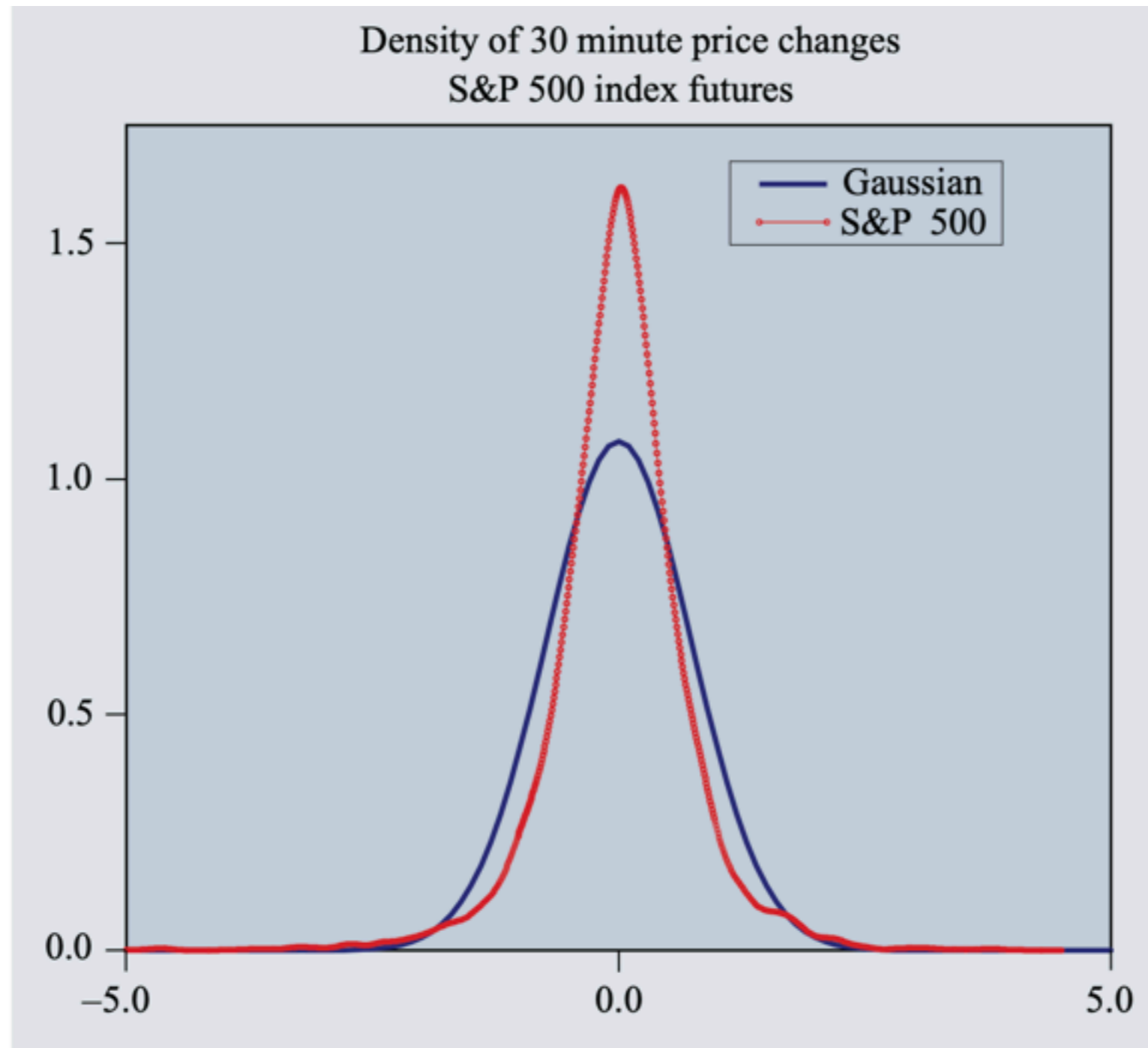
$$C(\tau)_\alpha = \text{corr}[|r(t, \Delta t)|^\alpha, |r(t + \tau, \Delta t)|^\alpha]$$

$$C(\tau)_\alpha = A\tau^{-\beta}$$

$$\alpha \in \{1, 2\} \implies \beta \in [0.2, 0.4]$$



Distribution of returns



Distribution of returns

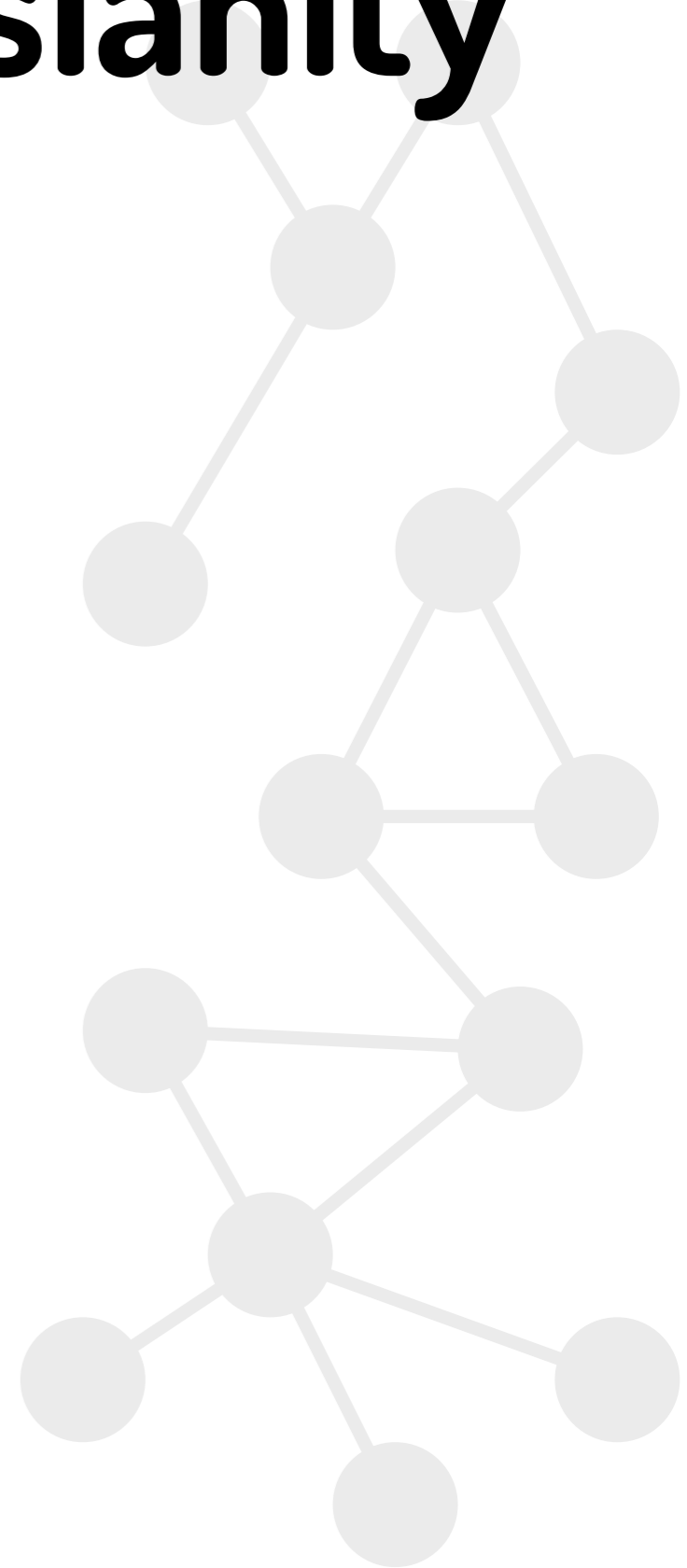
$$\kappa[X] = \mathbb{E} \left[\left(\frac{X - \mu}{\sigma} \right)^4 \right]$$

$\kappa[X] = 0$ **Normal distribution**

$\kappa[X] > 0$ **Long tails**

Aggregational gaussianity

$$\lim_{\Delta t \rightarrow \infty} \kappa = 0$$



Summary statistics - kurtosis

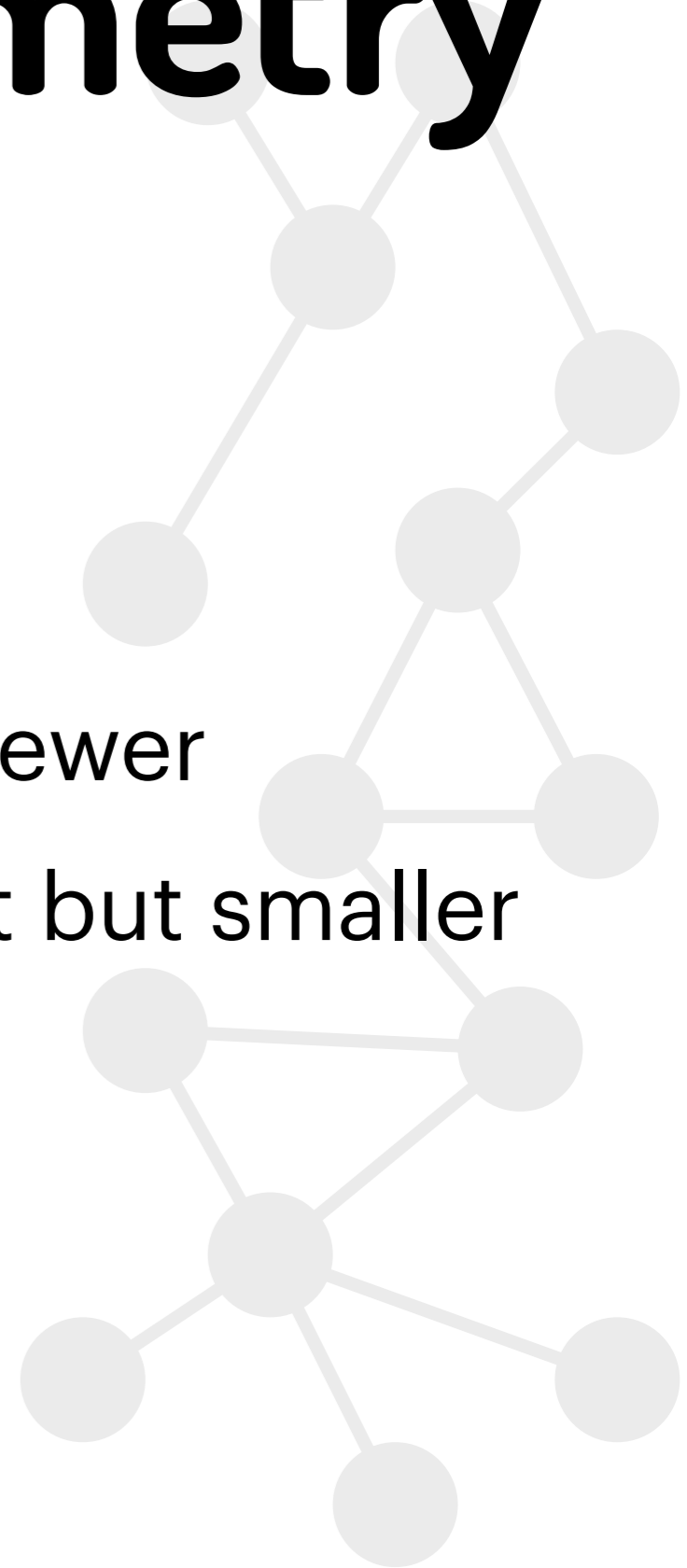
Data	μ/σ	Skewness	Kurtosis
S&P 500 futures	0.003	-0.4	15.95
Dollar/ DM futures	0.002	-0.11	74
Dollar/ Swiss Franc futures	0.002	-0.1	60
IID 95% confidence interval	—	0.018	0.036

Gain/loss Asymmetry

Downwards movements are larger but fewer

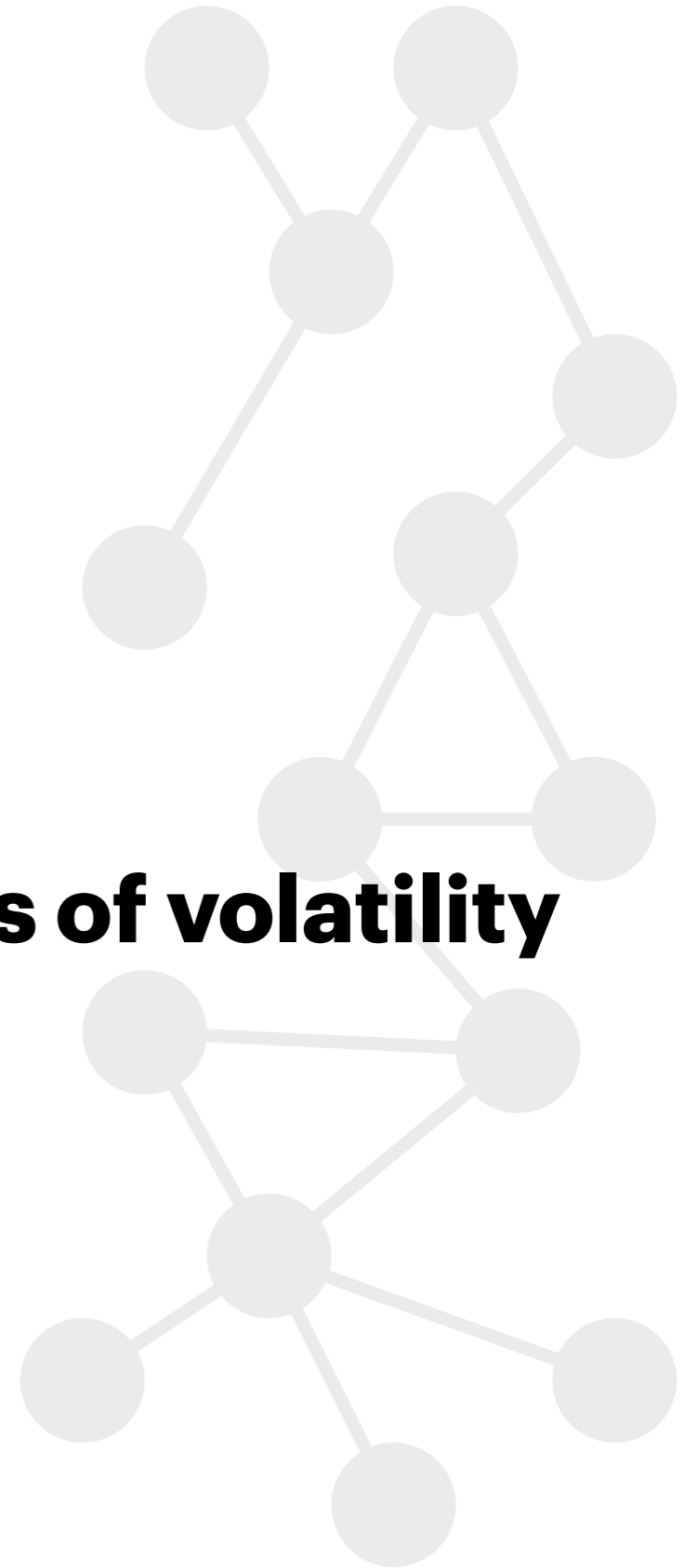
Upwards movements are more frequent but smaller

This does not apply to forex



Volume

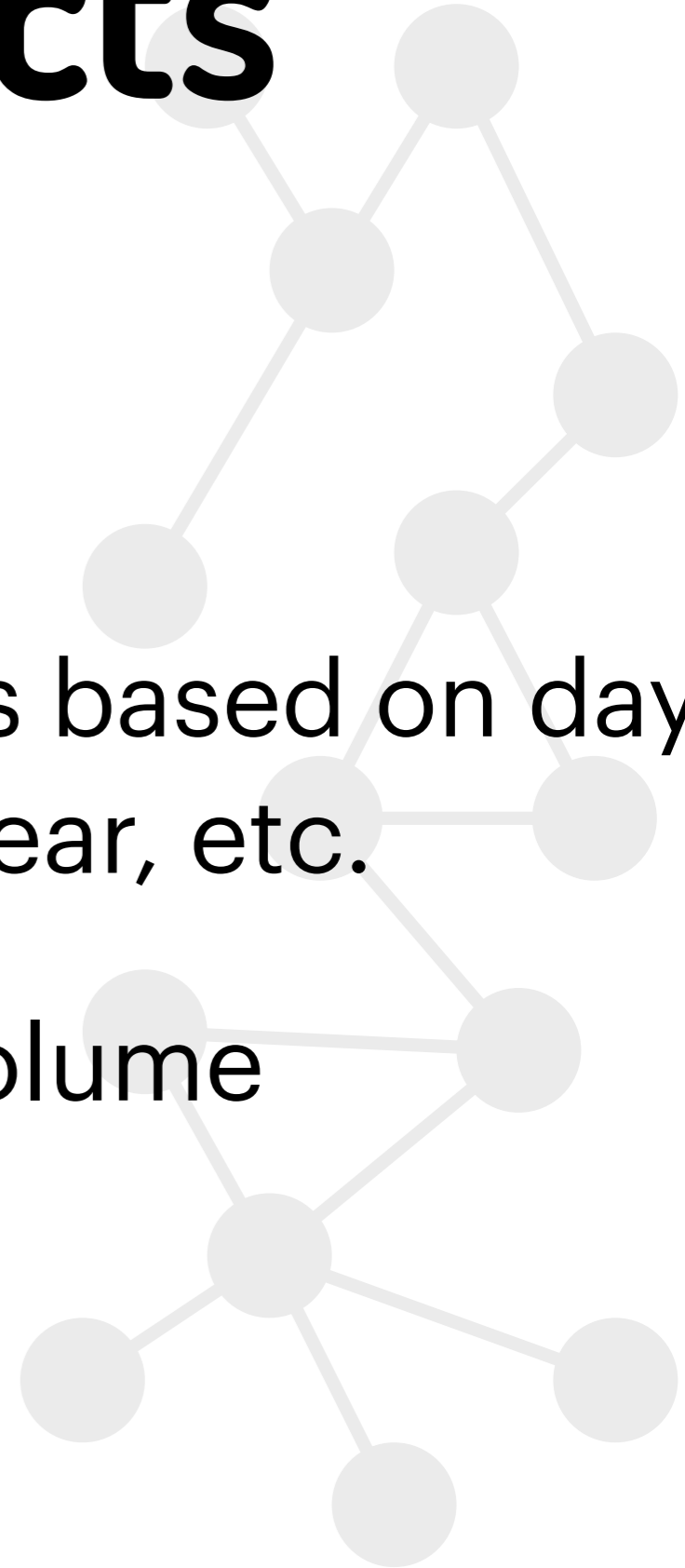
Volume is correlated with all measures of volatility



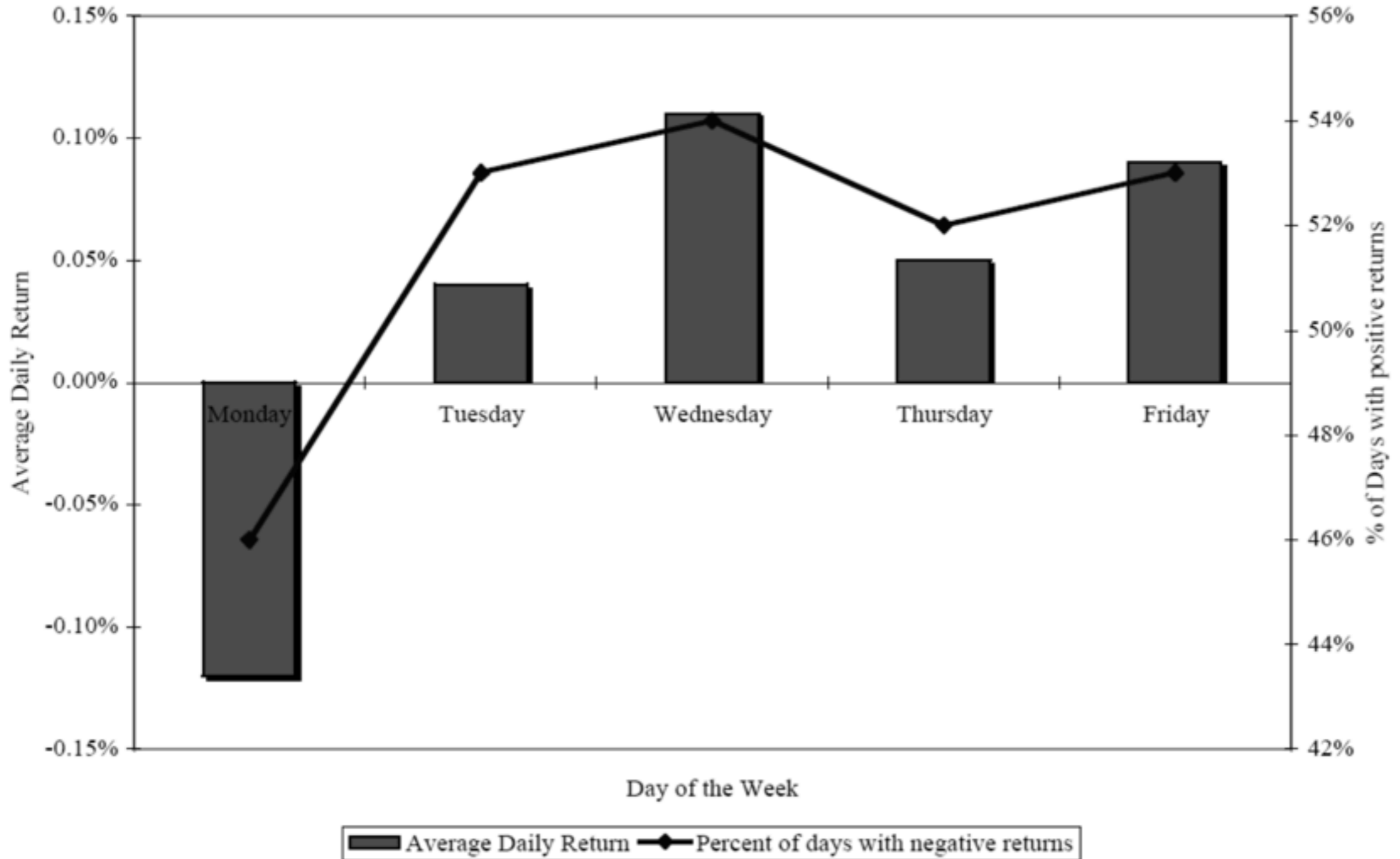
Calendar effects

Price and volume display regularities based on day of week, week of month, month of year, etc.

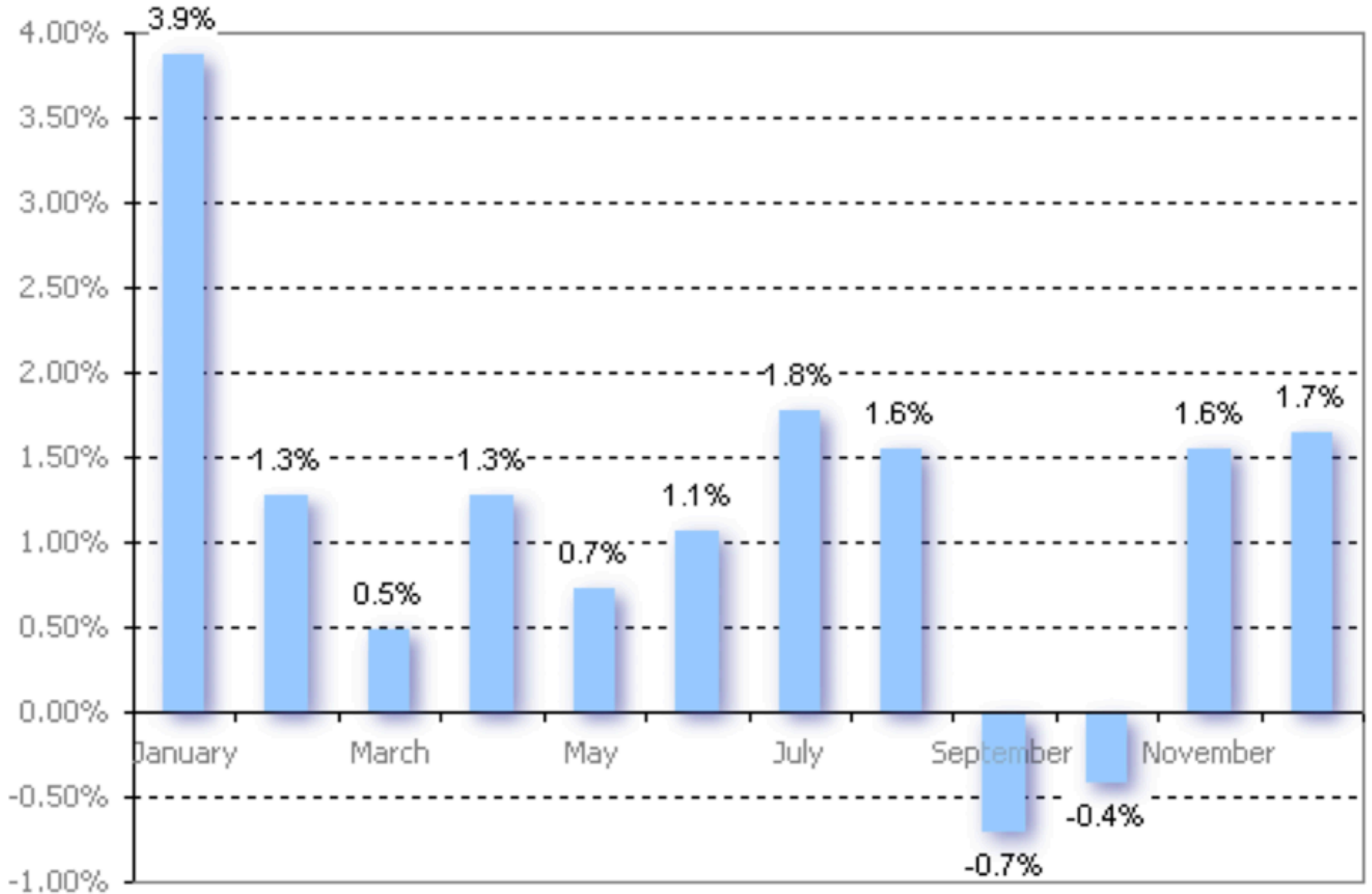
These are sometimes called price/volume seasonalities



Weekend effect



January effect



Holiday effect



In the 80s and 90s, positive returns the day before a holiday accounted for 50% of all the yearly price increase.

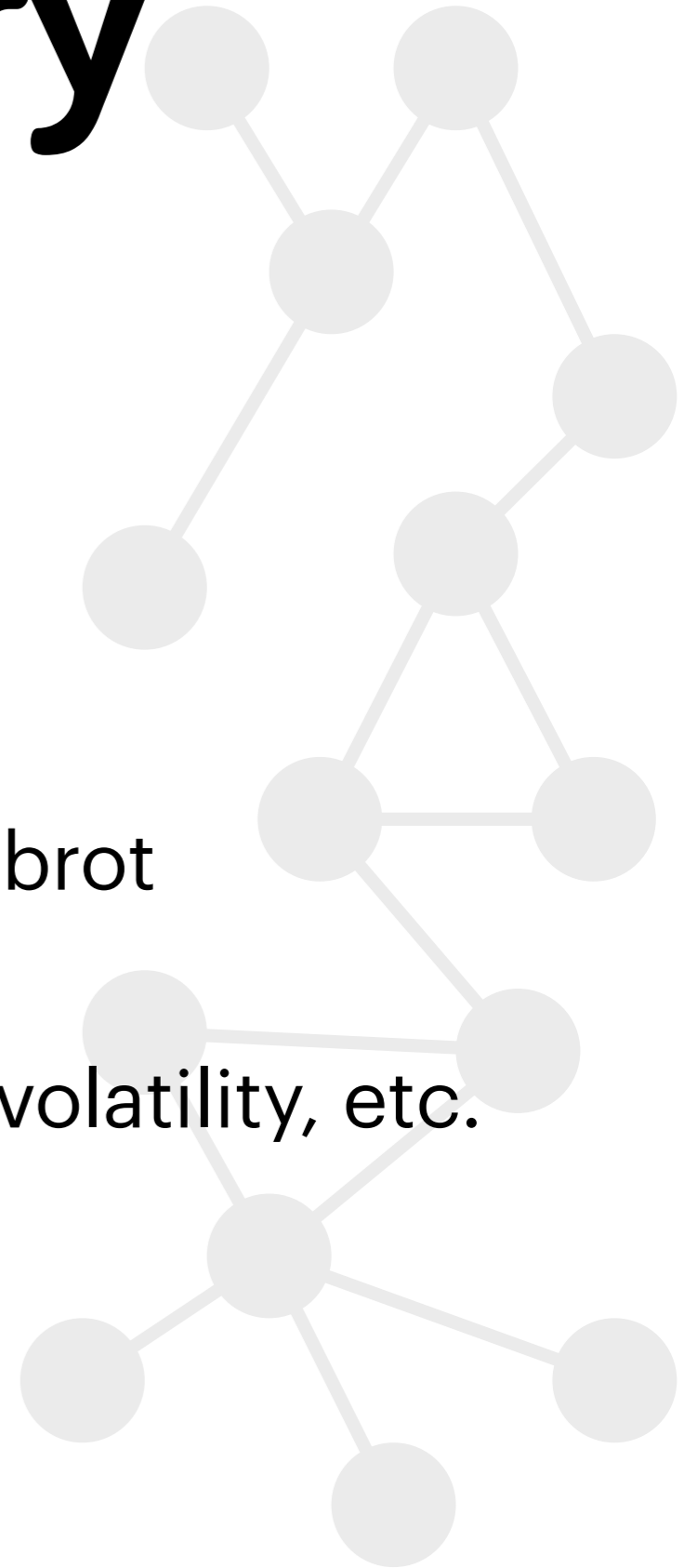
This effect is now smaller but still present (in the three days before any major holiday)

Long memory

Early 1900s by Hurst

Application to finance in the late 60s by Mandelbrot

Many, many papers after that on price, volume, volatility, etc.



Long memory

Correlation

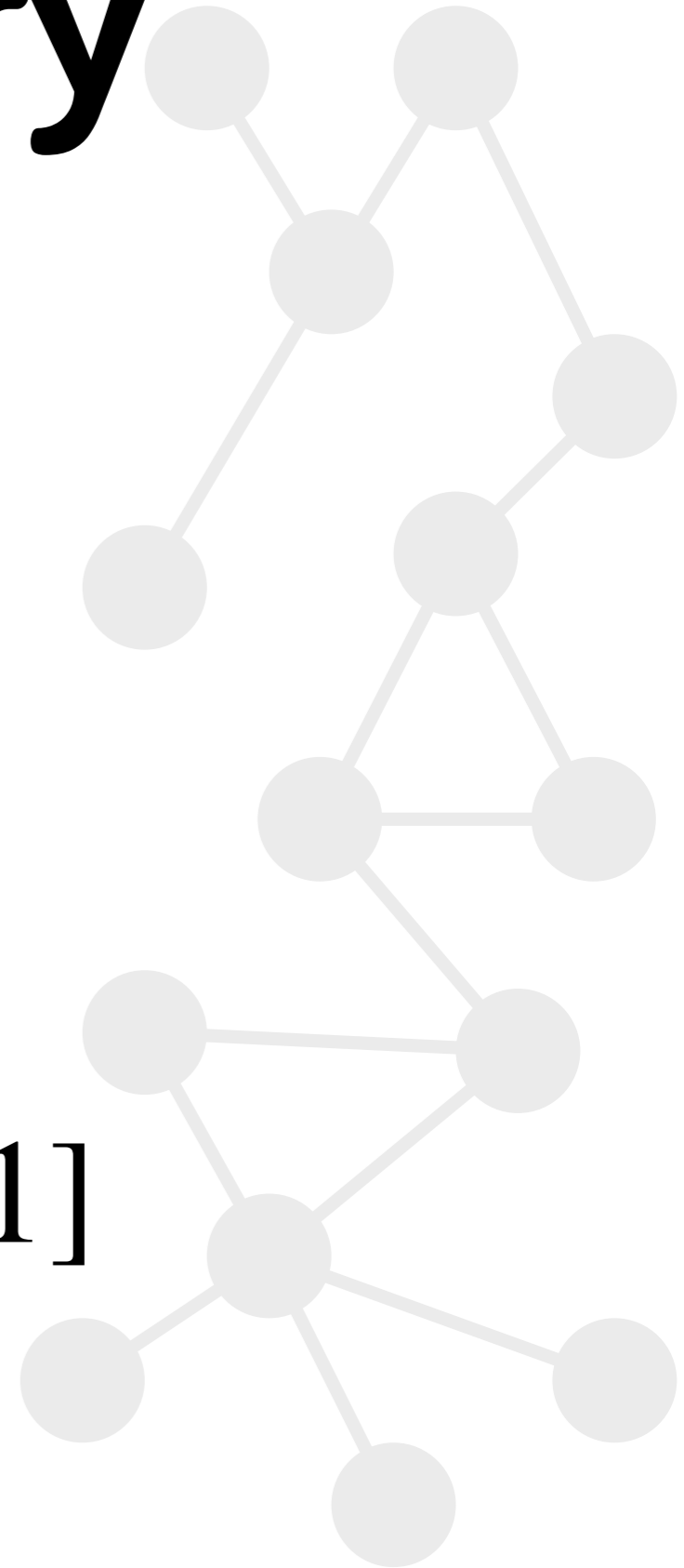


$C(\tau)$

$$\lim_{\tau \rightarrow \infty} \frac{C(\tau)}{c_{\tau} \tau^{-\alpha}} = 1$$

Positive constant

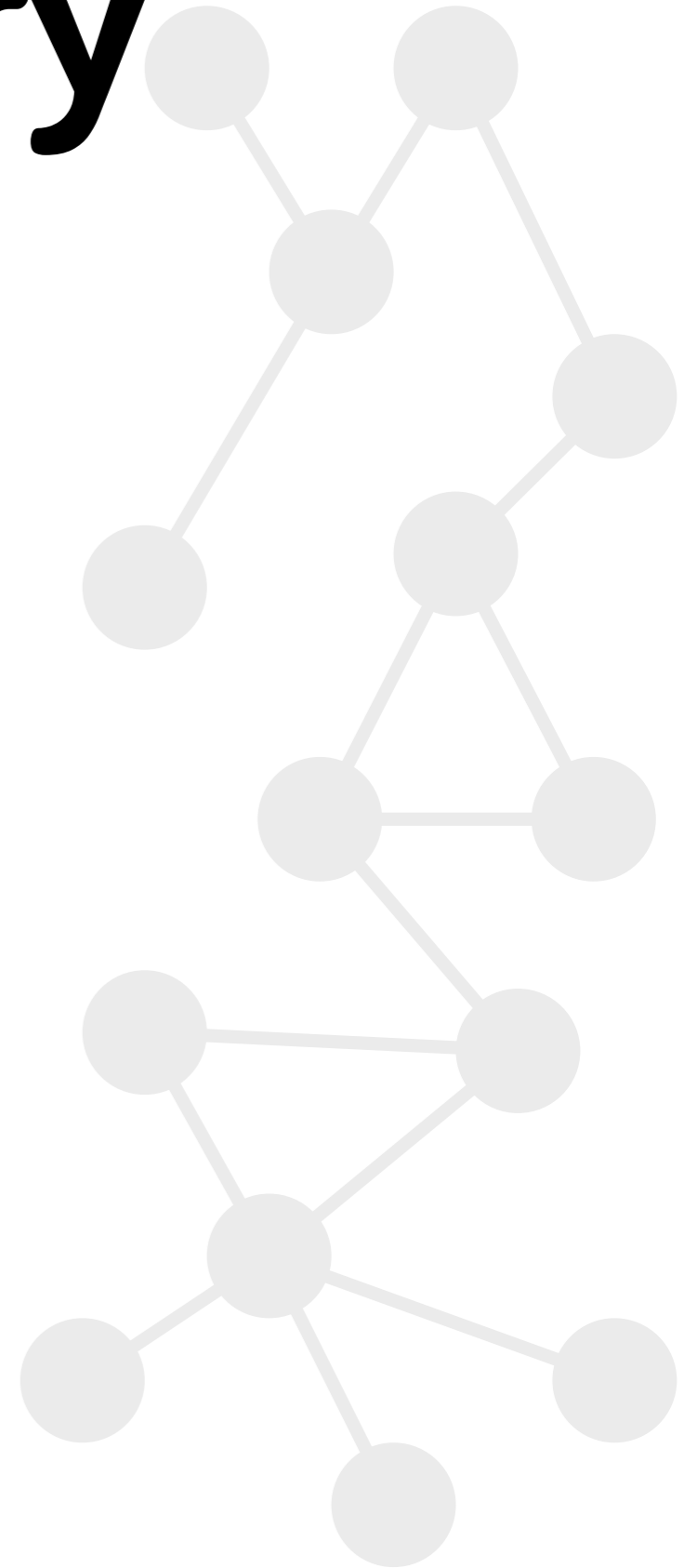
$\alpha \in [0, 1]$



Long memory

$$H = 1 - \frac{\alpha}{2}$$

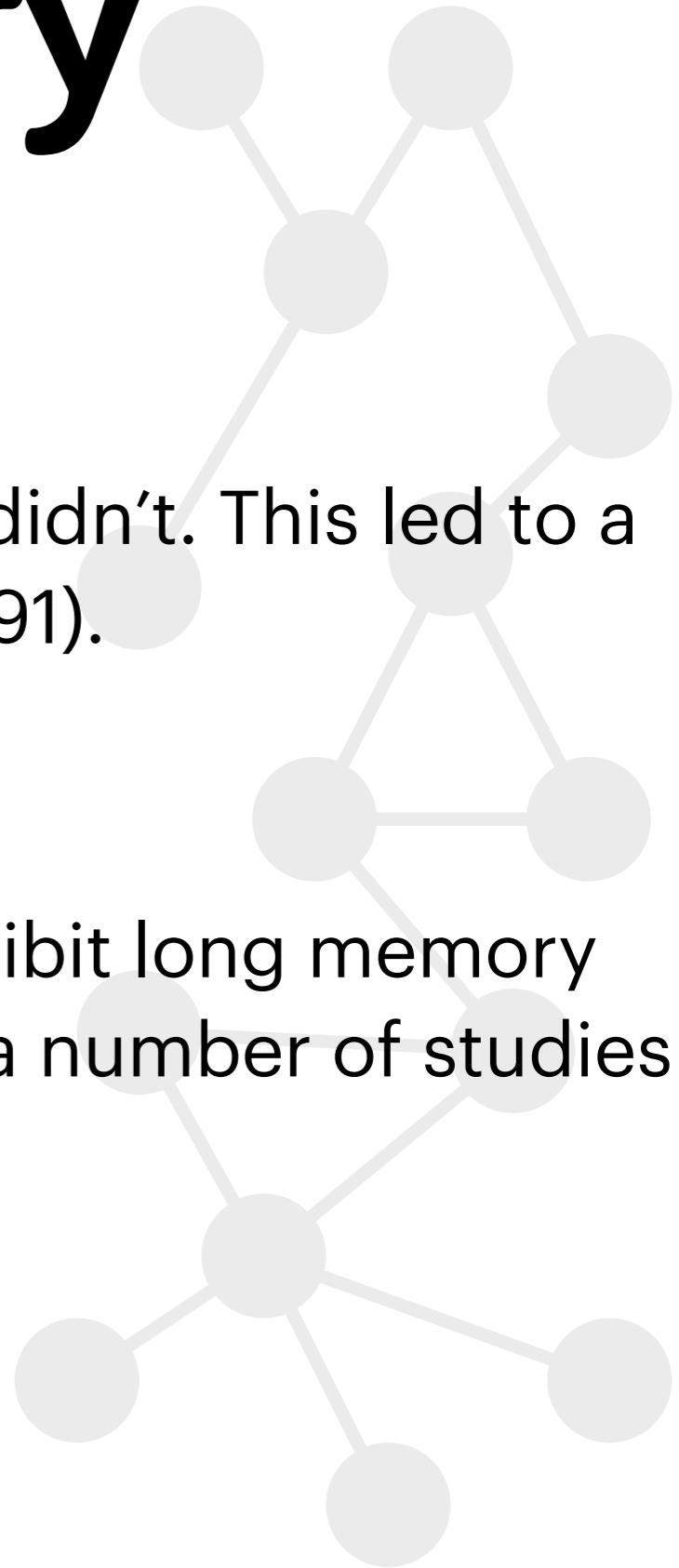
$$\frac{1}{2} < H < 1$$



Long memory

Prices were found to have long memory, until they didn't. This led to a more robust reformulation of this statistic by Lo (1991).

Volume, volatility, bid/ask spread were found to exhibit long memory across several different markets and timescales by a number of studies (albeit with some differences)



Summary

Stylised facts are empirical regularities observed in financial time series

They provide powerful summary information that condenses knowledge of markets in a few equations/notions

They can (and should!) be used in abms for validation and estimation

