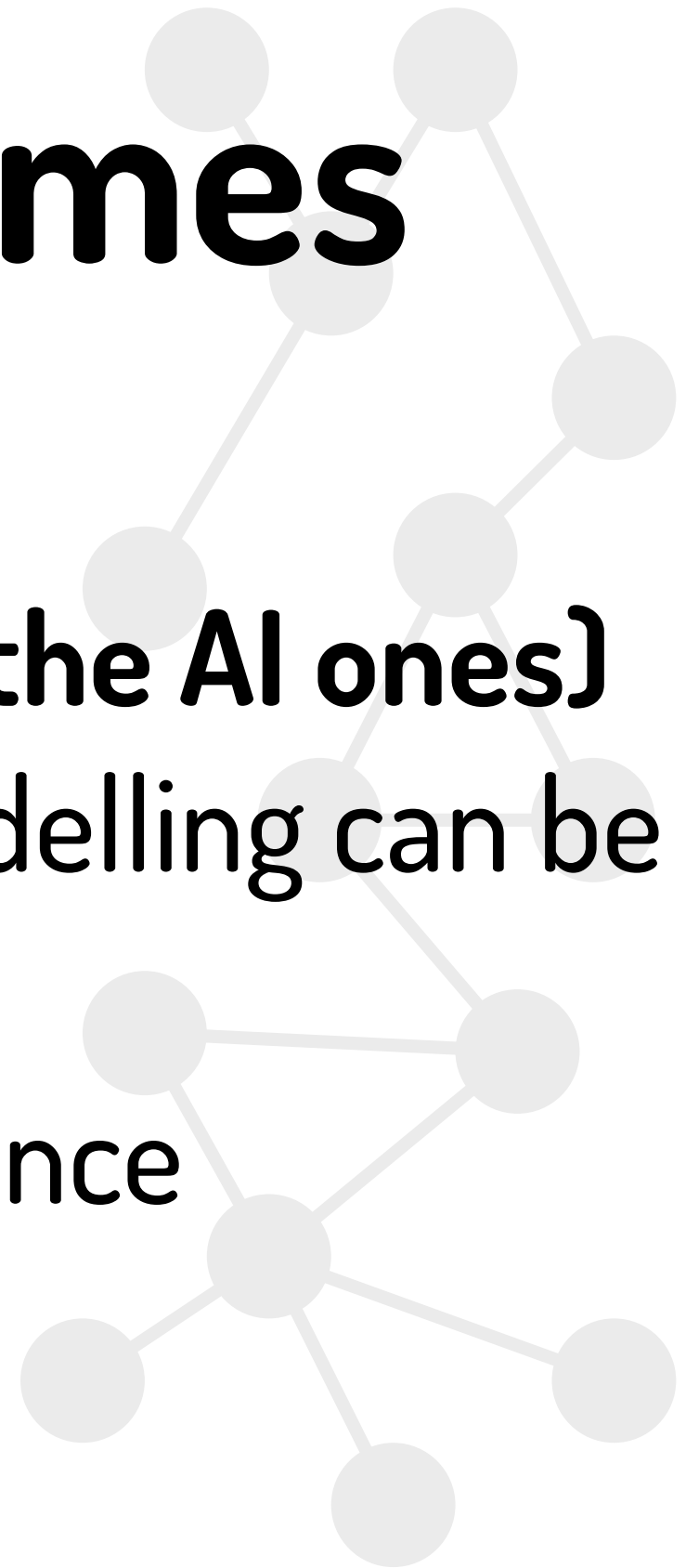


**\*kisses webcam before sleep\***  
**„Good night Mr. FBI man.“**  
**The FBI Agent:**



# Learning outcomes

- Learn **what an agent is** (yes, even the AI ones)
- Understand when agent-based modelling can be **applied**
- Familiarise with **applications** in finance



# A tale of rationality

Everybody is **perfectly rational**



# A tale of rationality

Everybody is **perfectly rational**

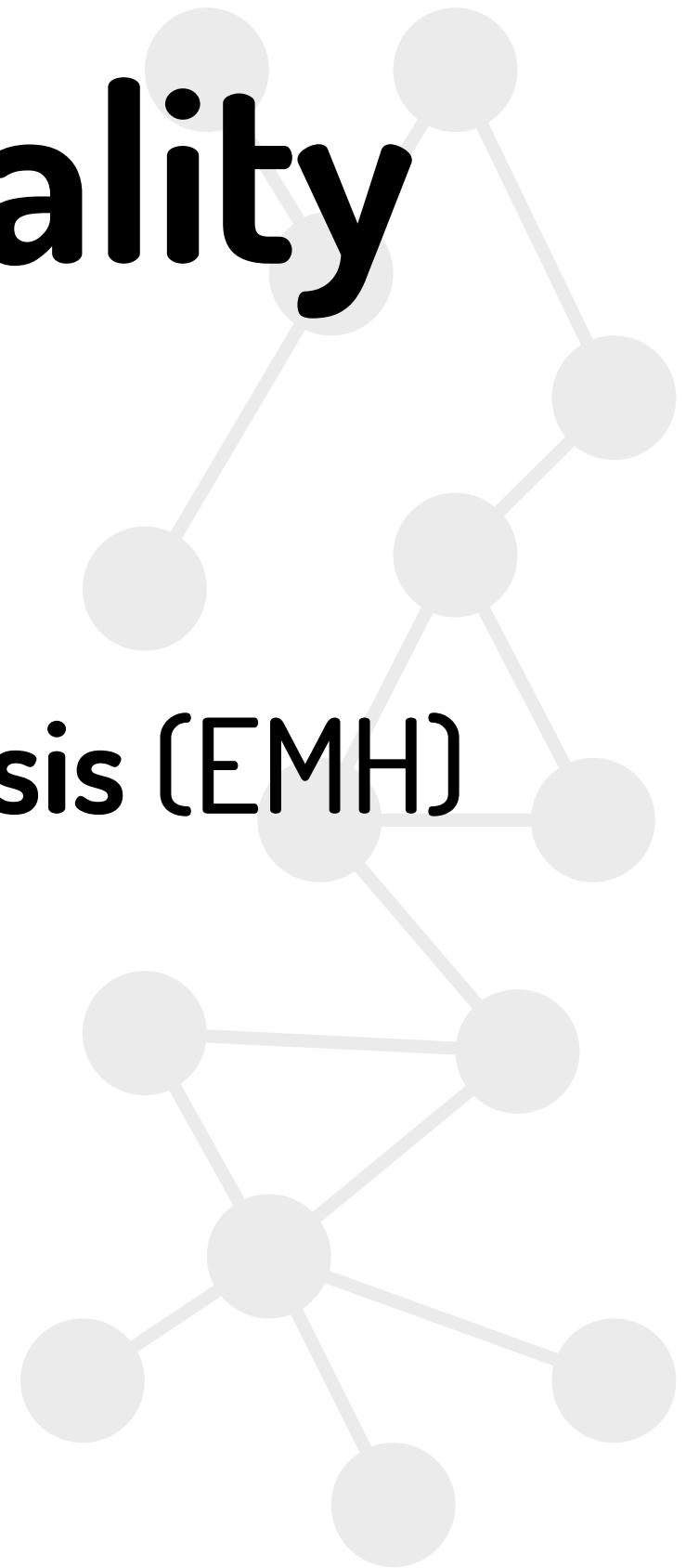
We **always** make the **best** decision

We **always** know how to make the **best** decision



# A tale of rationality

The efficient market hypothesis (EMH)



# EUGENE FAMA



# Efficient market hypothesis

Everybody is **perfectly rational**



# Efficient market hypothesis

Everybody is **perfectly rational**

Price reflects all **available information**



# Efficient market hypothesis

Everybody is **perfectly rational**

Price reflects all **available information**

**Forms:** Weak, semi-strong, strong



# Black-Scholes



# Black-Scholes

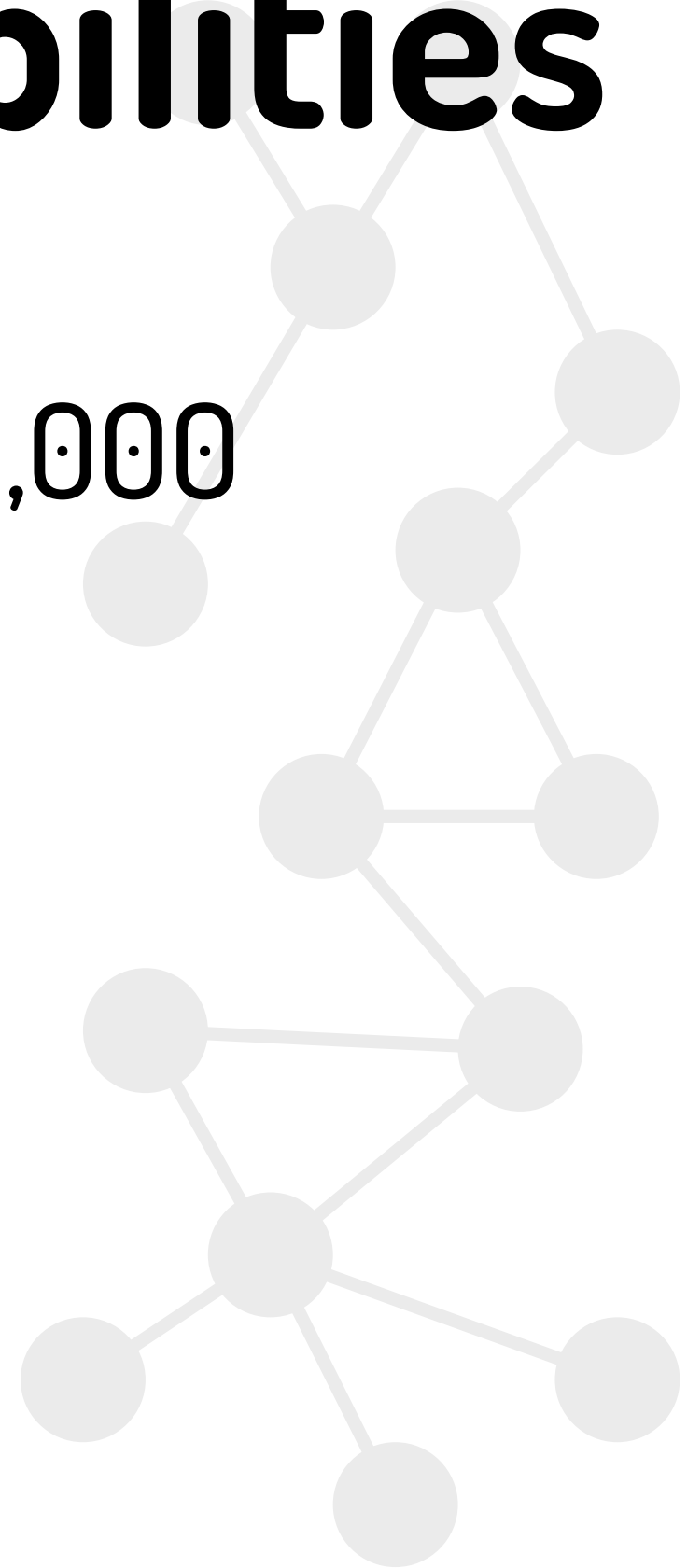
Returns (price changes) are gaussian

Market price is perfectly random

Everything can be described by one equation

# A game of probabilities

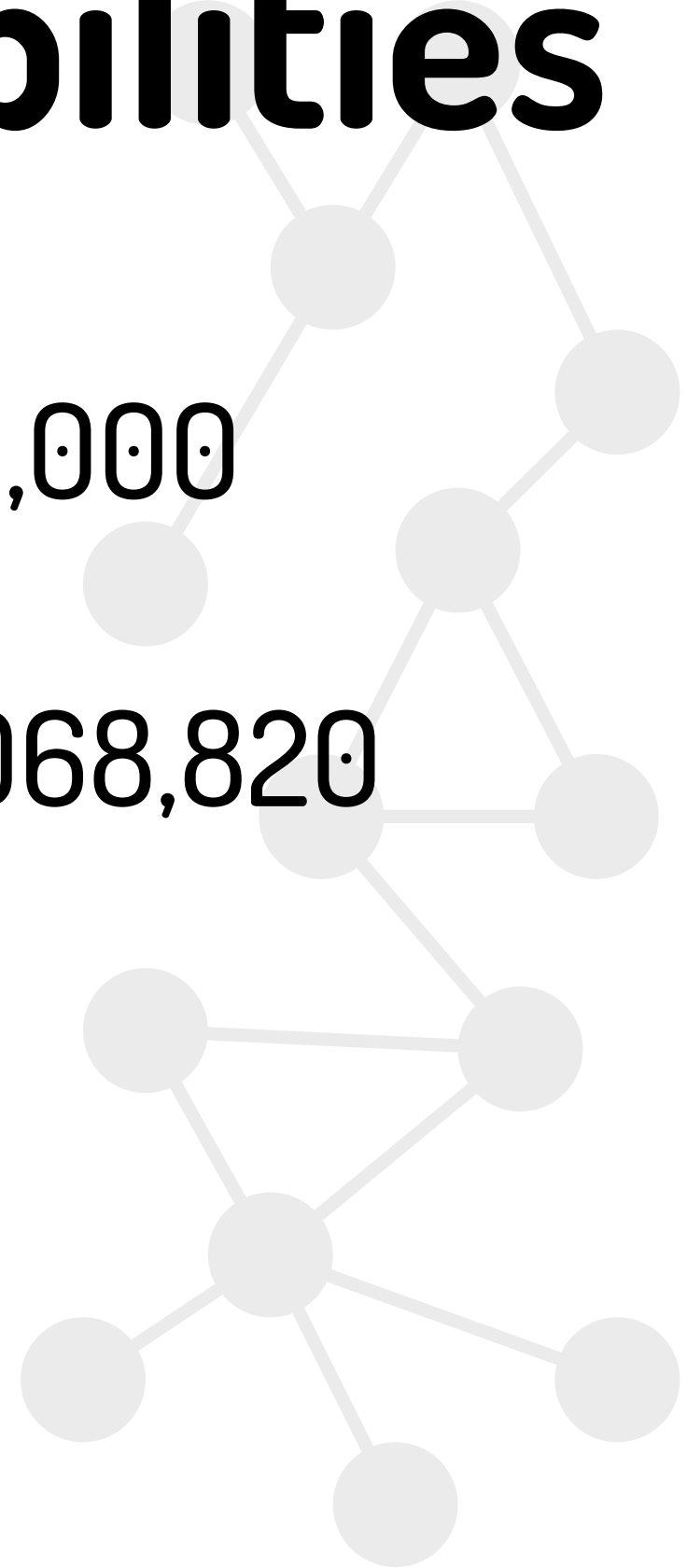
Struck by lightning: 1 in 70,000



# A game of probabilities

Struck by **lightning**: 1 in 70,000

Getting hit by **asteroid**: 1 in 1,068,820

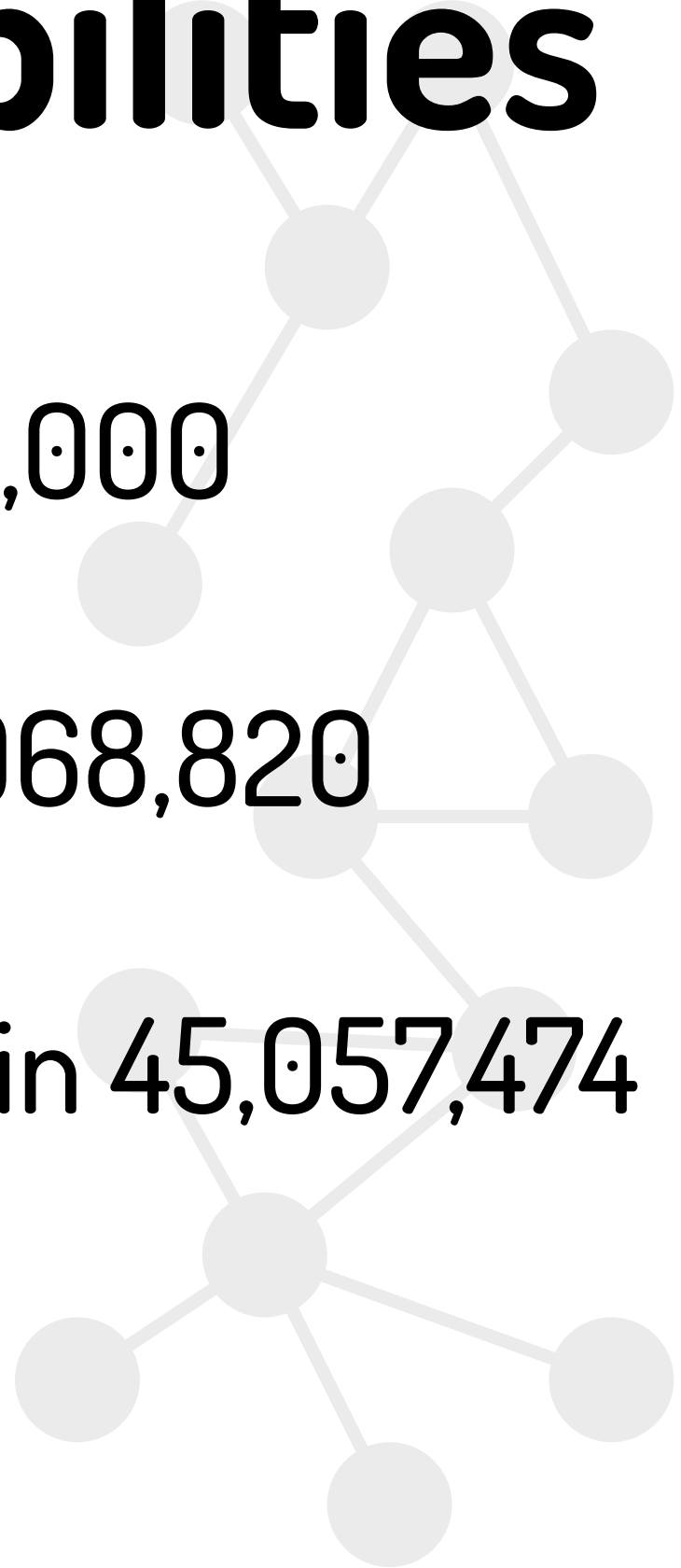


# A game of probabilities

Struck by **lightning**: 1 in 70,000

Getting hit by **asteroid**: 1 in 1,068,820

Winning the **jackpot** (uk lottery): 1 in 45,057,474



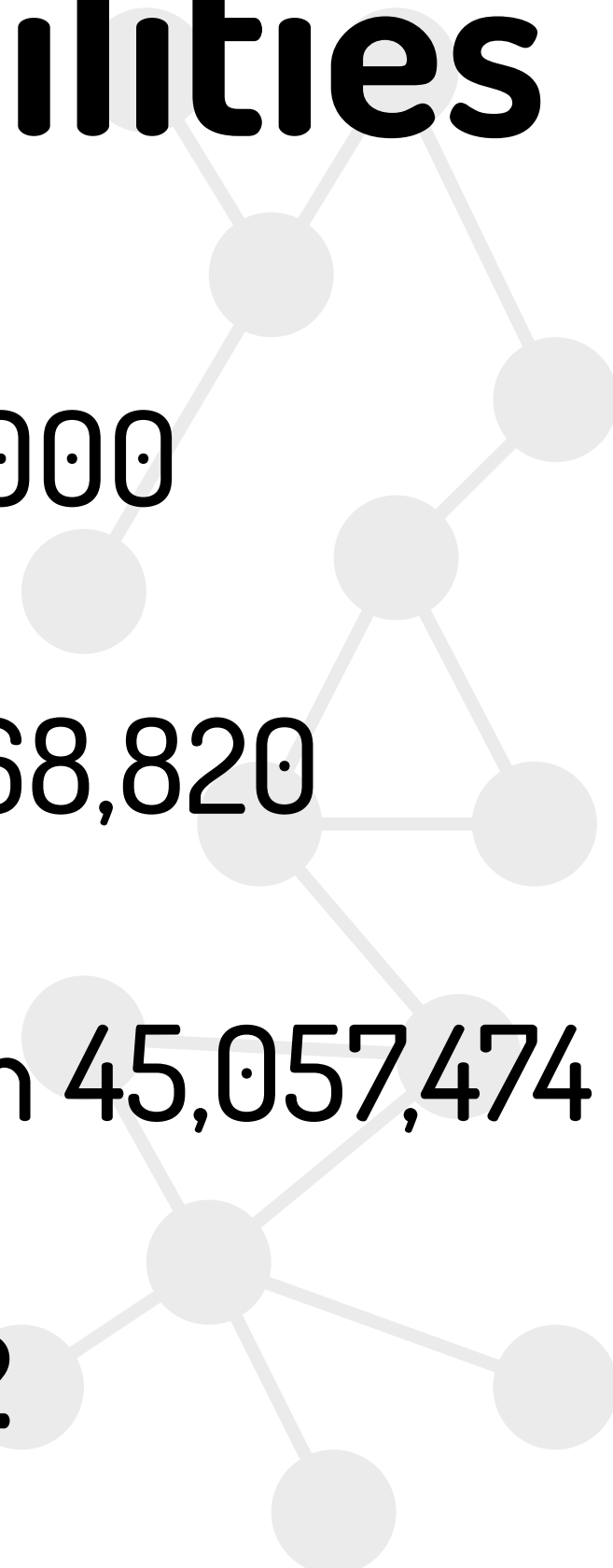
# A game of probabilities

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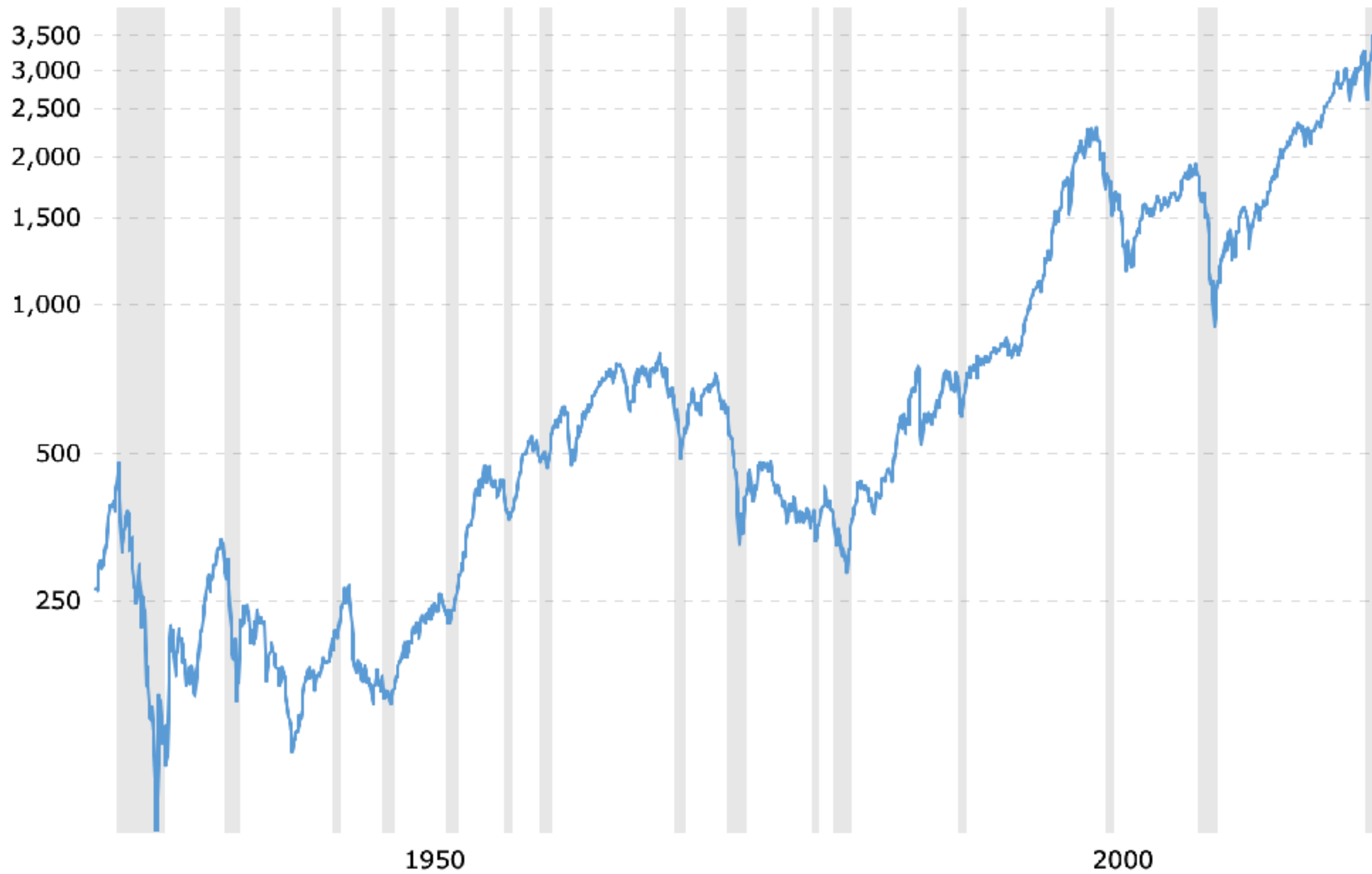
Financial crisis: 1 in  $10^{72}$

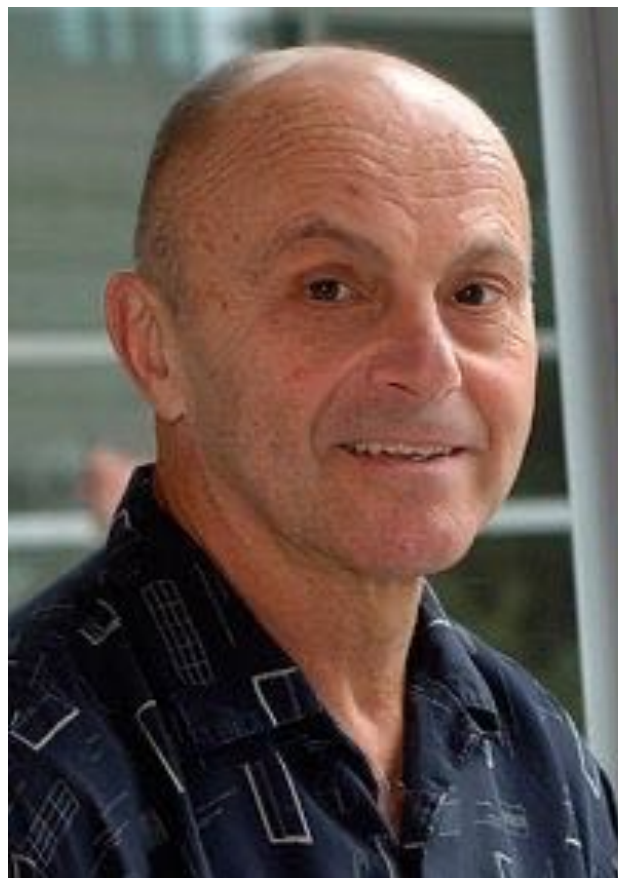


# Should happen once every

15,000,000,000,000,000,000,000,  
000,000,000,000,000,000,000,  
000,000,000,000,000,000,000,  
000,000,000,000,000,000

**Years**





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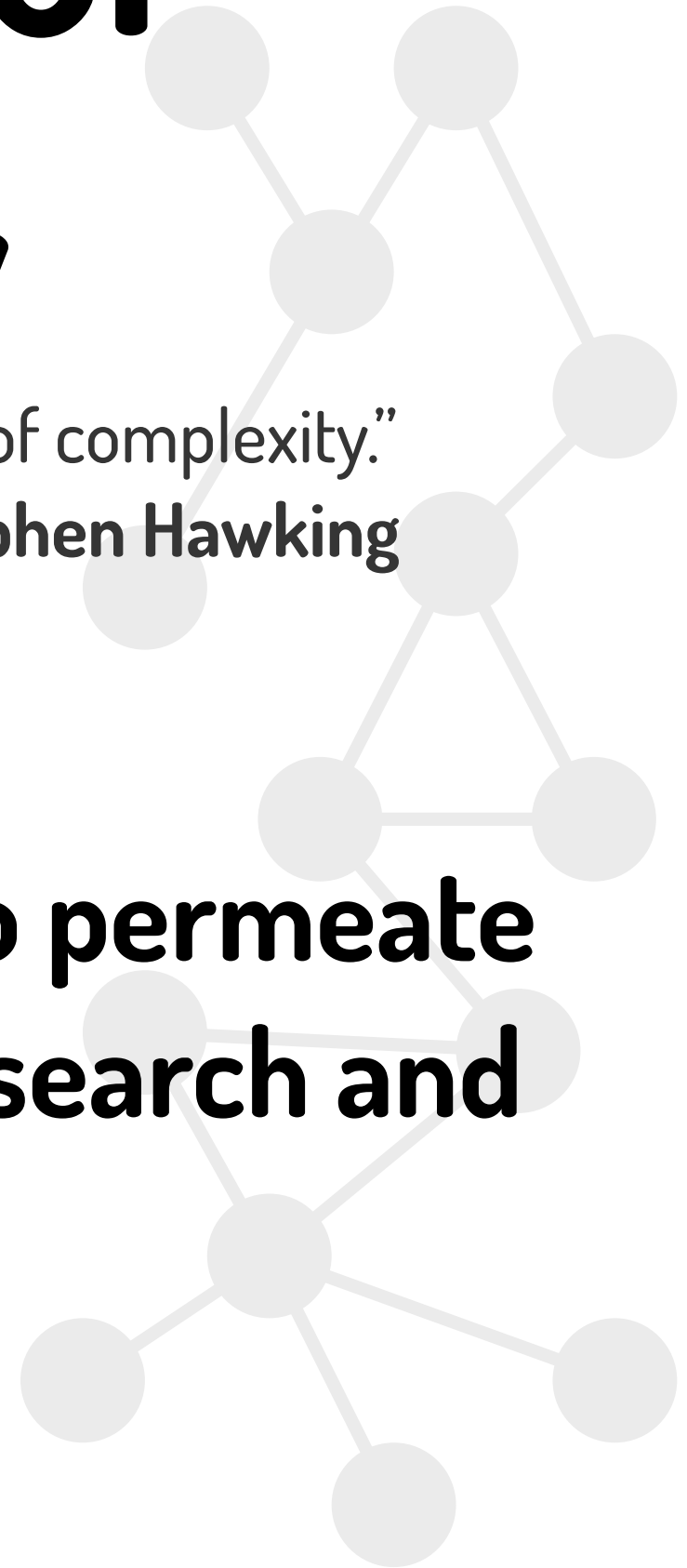


# The century of complexity

“I think the next century will be the century of complexity.”

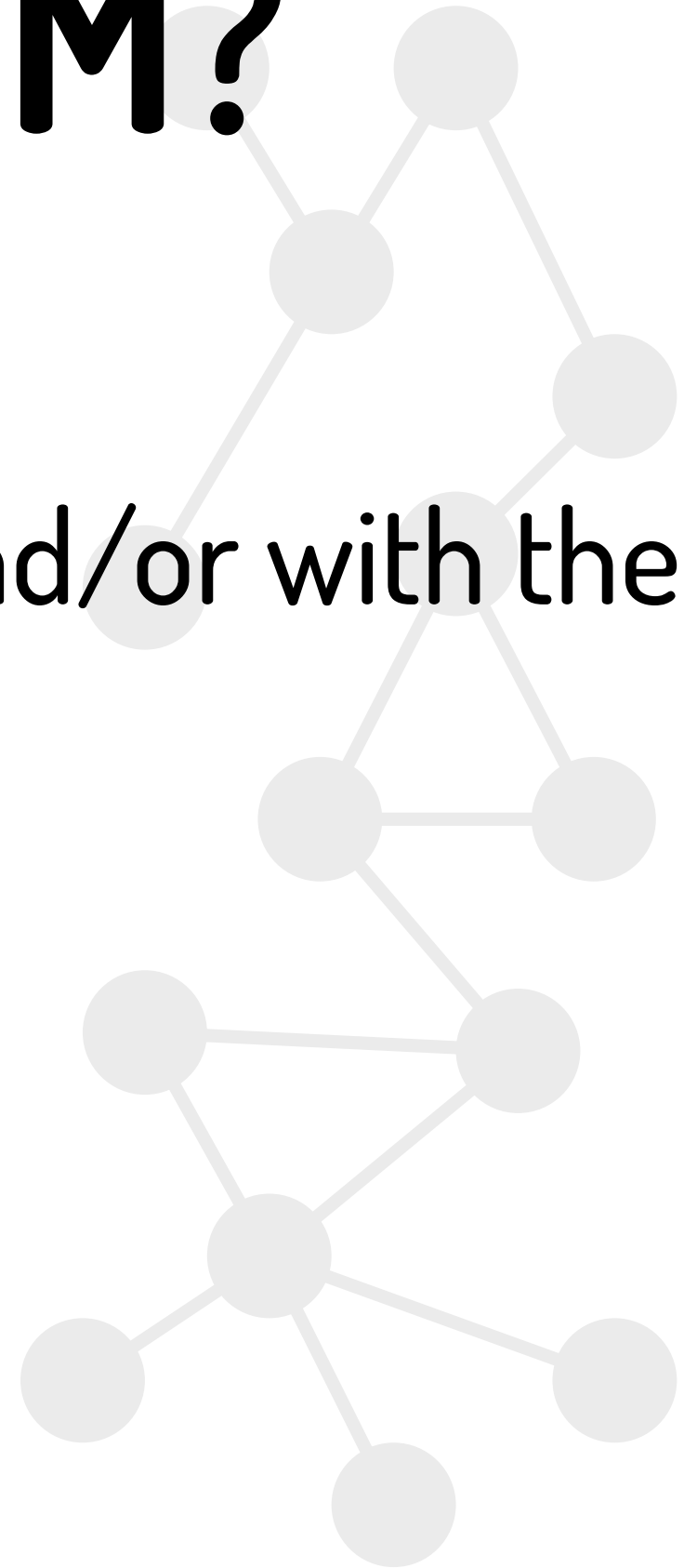
Stephen Hawking

**From 2008 complexity started to permeate  
economics/finance/business research and  
decision making**



# What is an ABM?

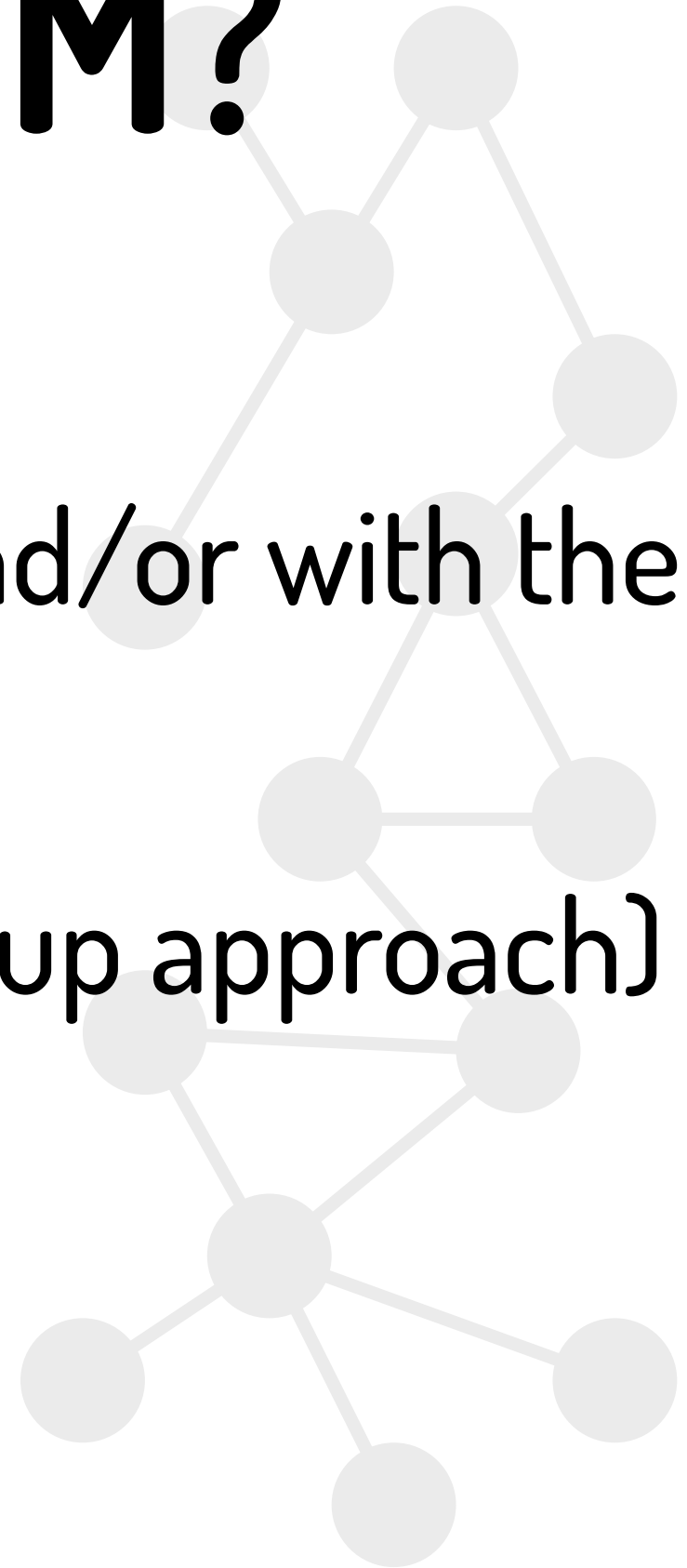
Objects **interact** with each other and/or with the environment



# What is an ABM?

Objects **interact** with each other and/or with the environment

Objects are **autonomous** (bottom-up approach)

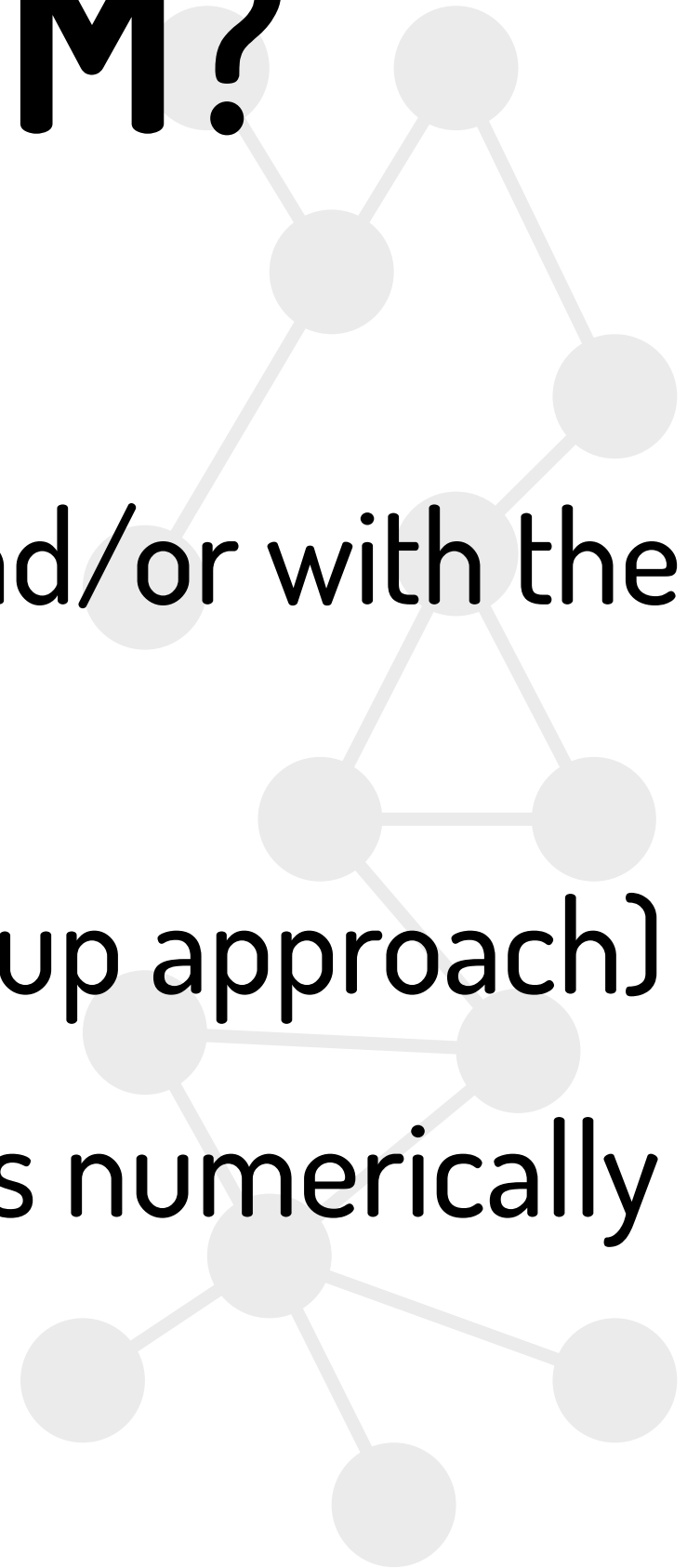


# What is an ABM?

Objects **interact** with each other and/or with the environment

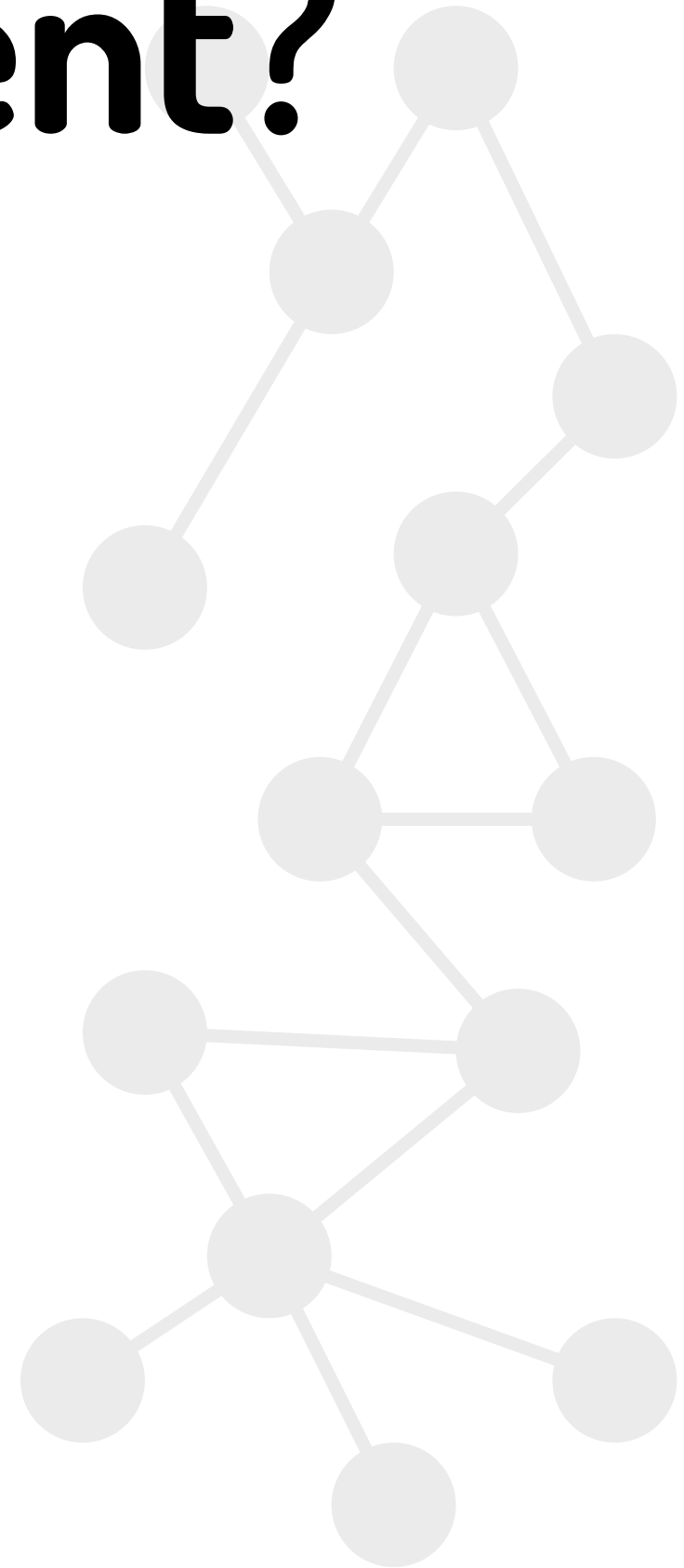
Objects are **autonomous** (bottom-up approach)

The outcome of their interactions is numerically **computed**



# What is an agent?

Individual or group



# What is an agent?

Individual or group

Interact with environment



# What is an agent?

Individual or group

Interact with environment

Act/react

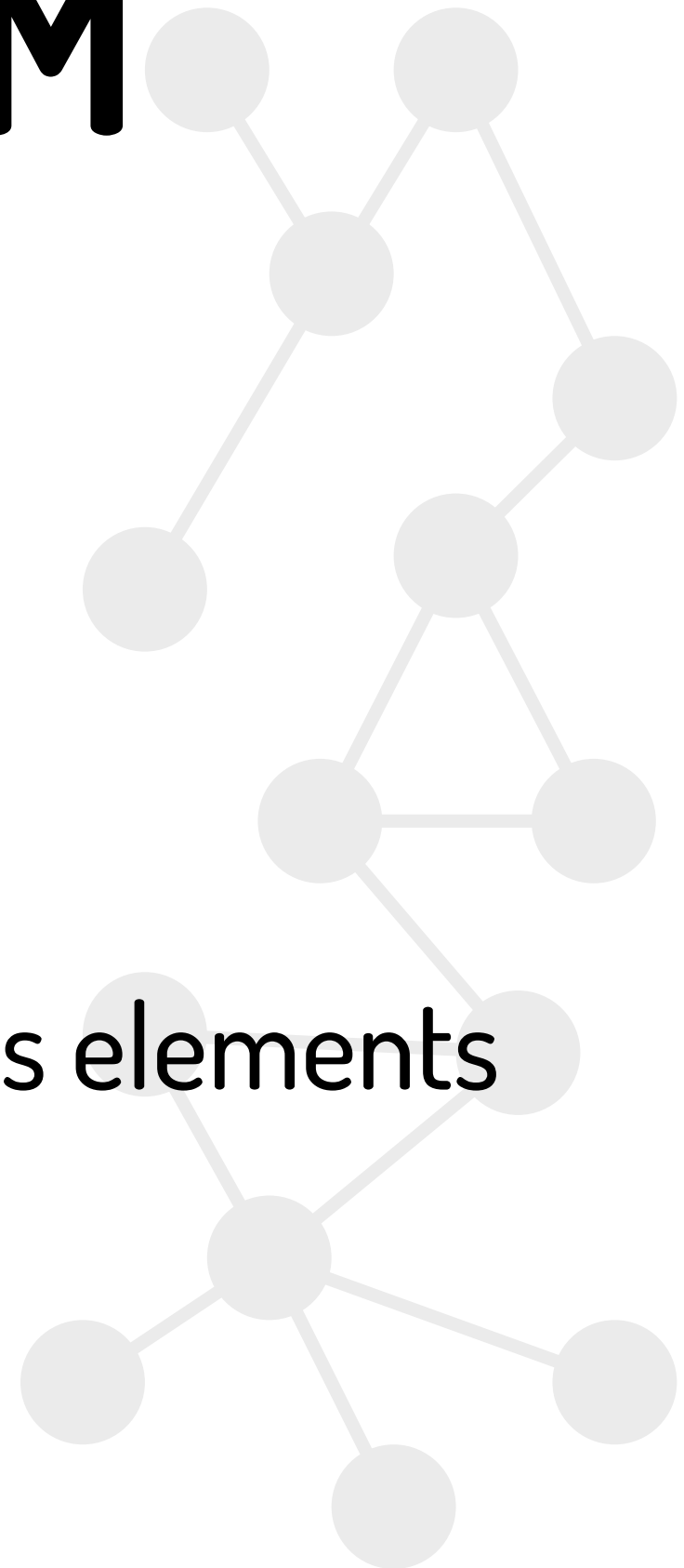


# Scope of ABM

Explanation and replication

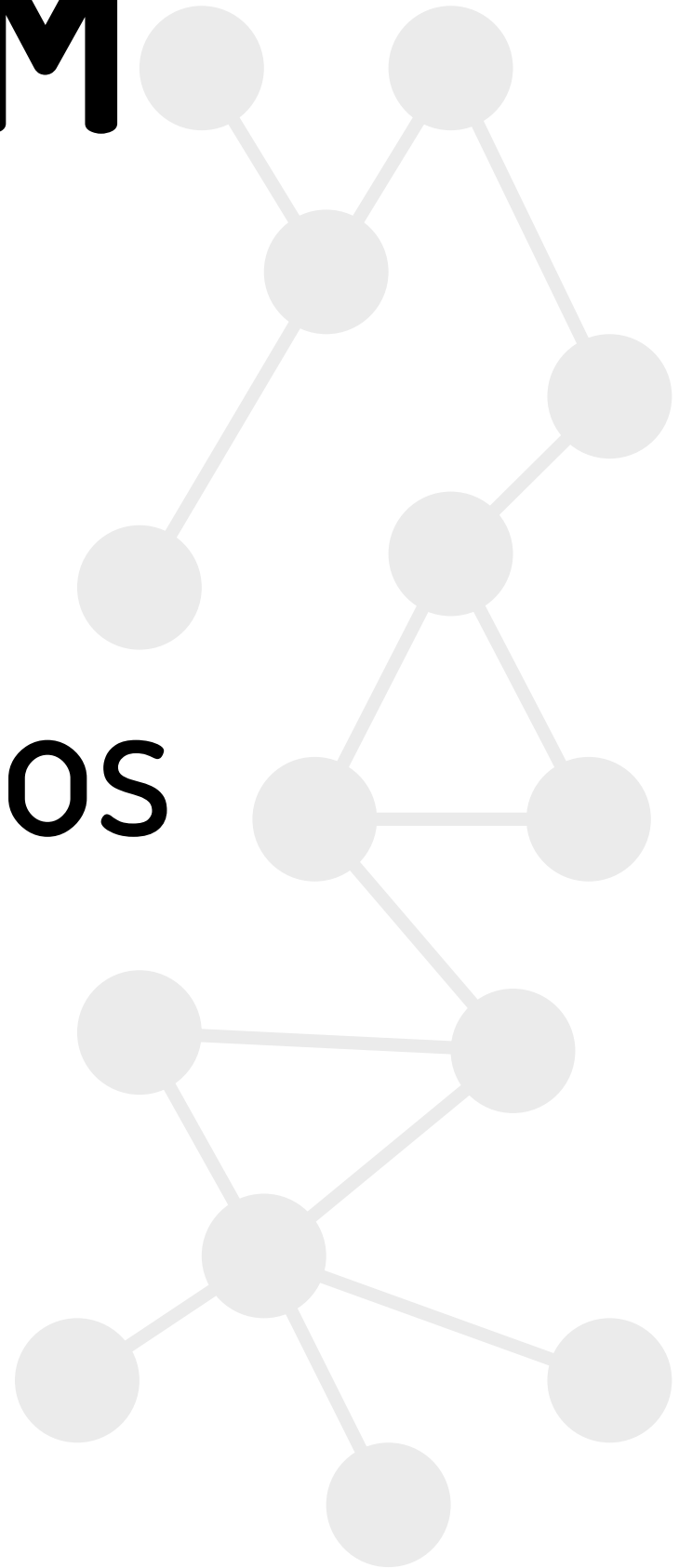
No predictions\*

Describe the system by describing its elements



# Scope of ABM

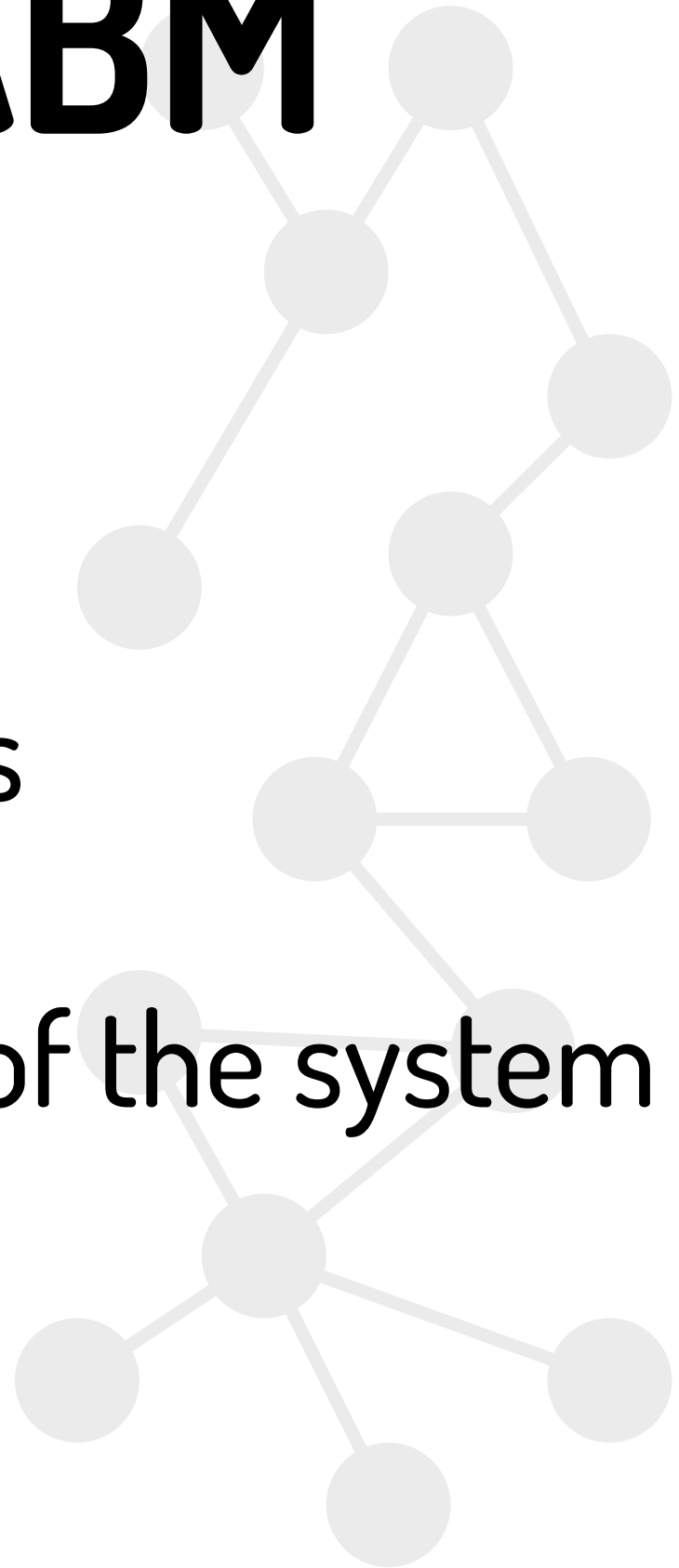
## WHAT IF scenarios



# When to use ABM

Model complex systems

Get quick intuition of the dynamics of the system

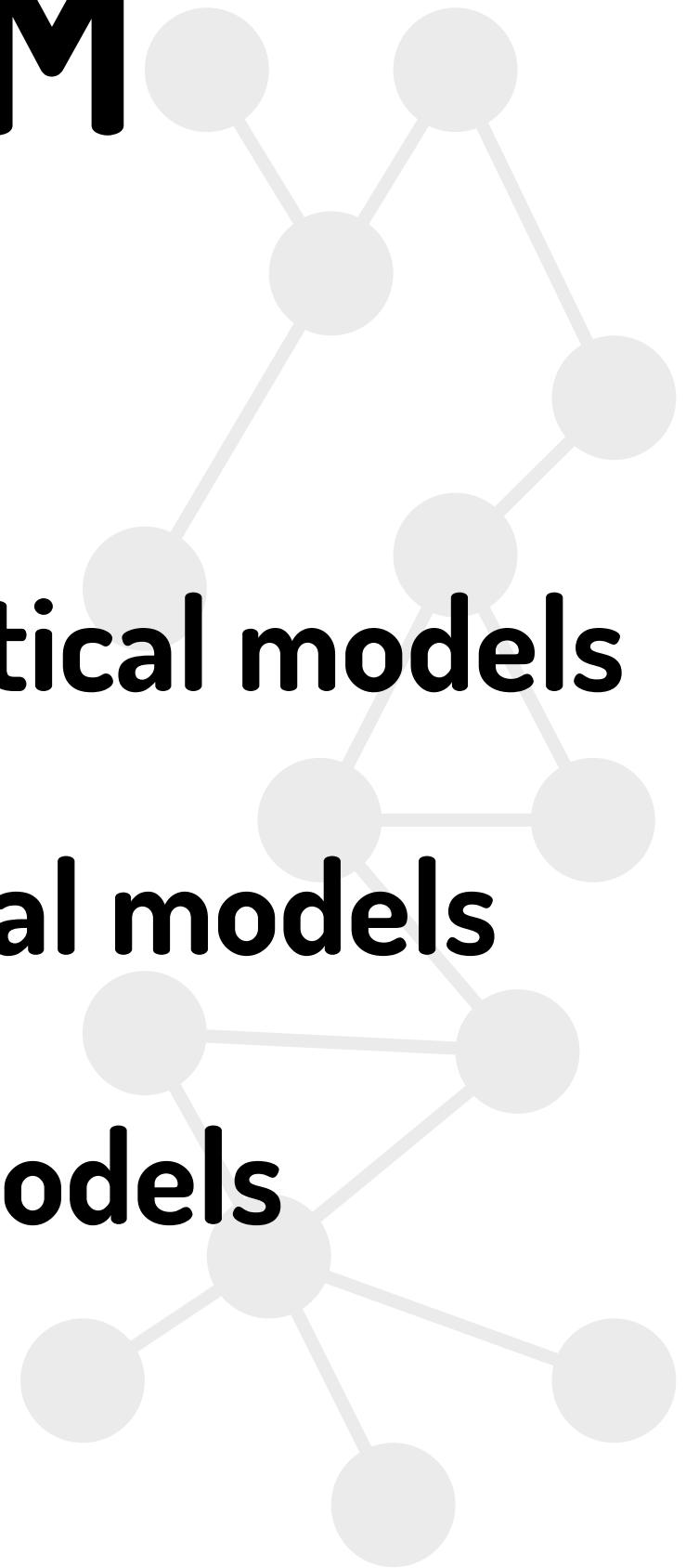


# Why use ABM

**Numerical computation of analytical models**

**Testing robustness of analytical models**

**Stand-alone simulation models**



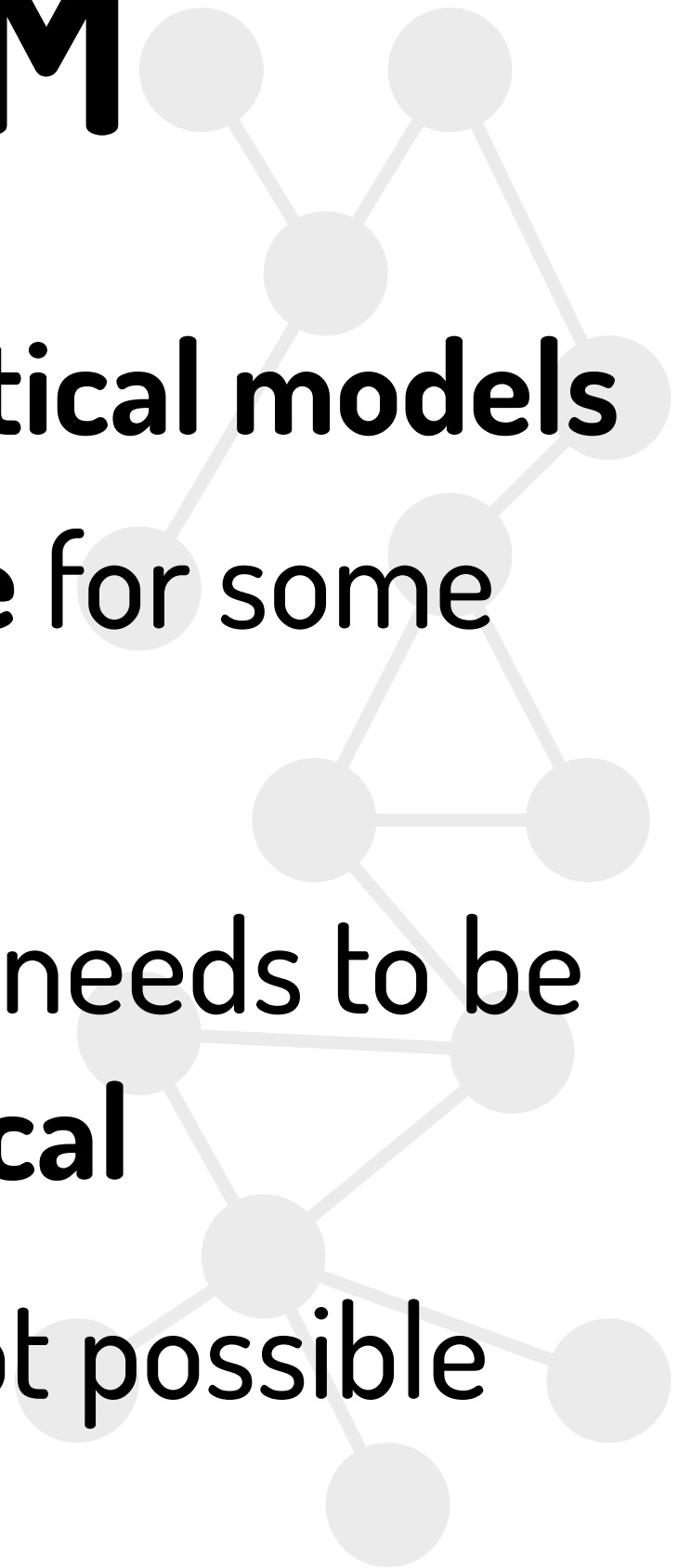
# Why use ABM

**Numerical computation of analytical models**

Model is **not** analytically **soluble** for some variable

**empirical** distribution of variable needs to be compared with **theoretical**

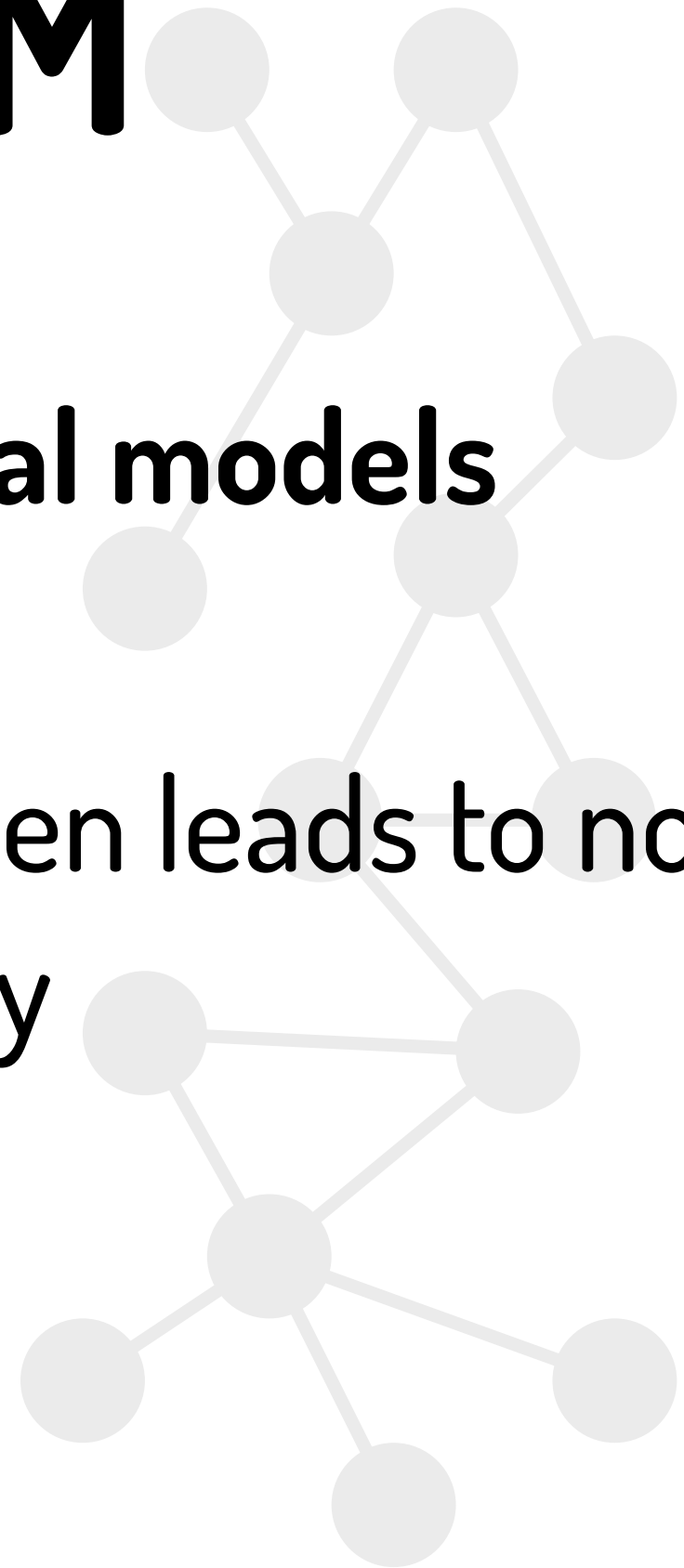
**Out of equilibrium** solutions not possible analytically



# Why use ABM

**Testing robustness of analytical models**

Changing assumptions or values often leads to no solution or intractability



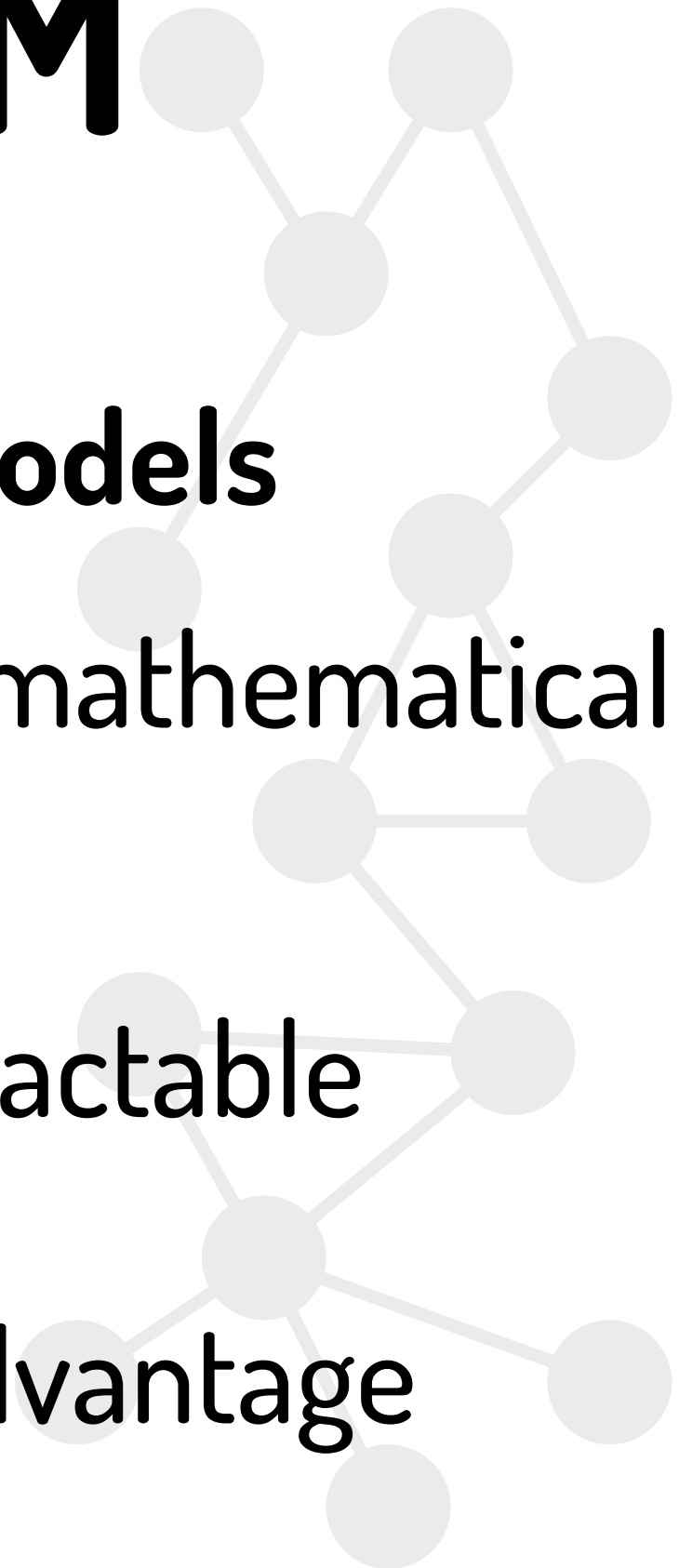
# Why use ABM

**Stand-alone simulation models**

Substitute, not complementary, to mathematical analysis

Problems are analytically intractable

Analytical solution bears no advantage



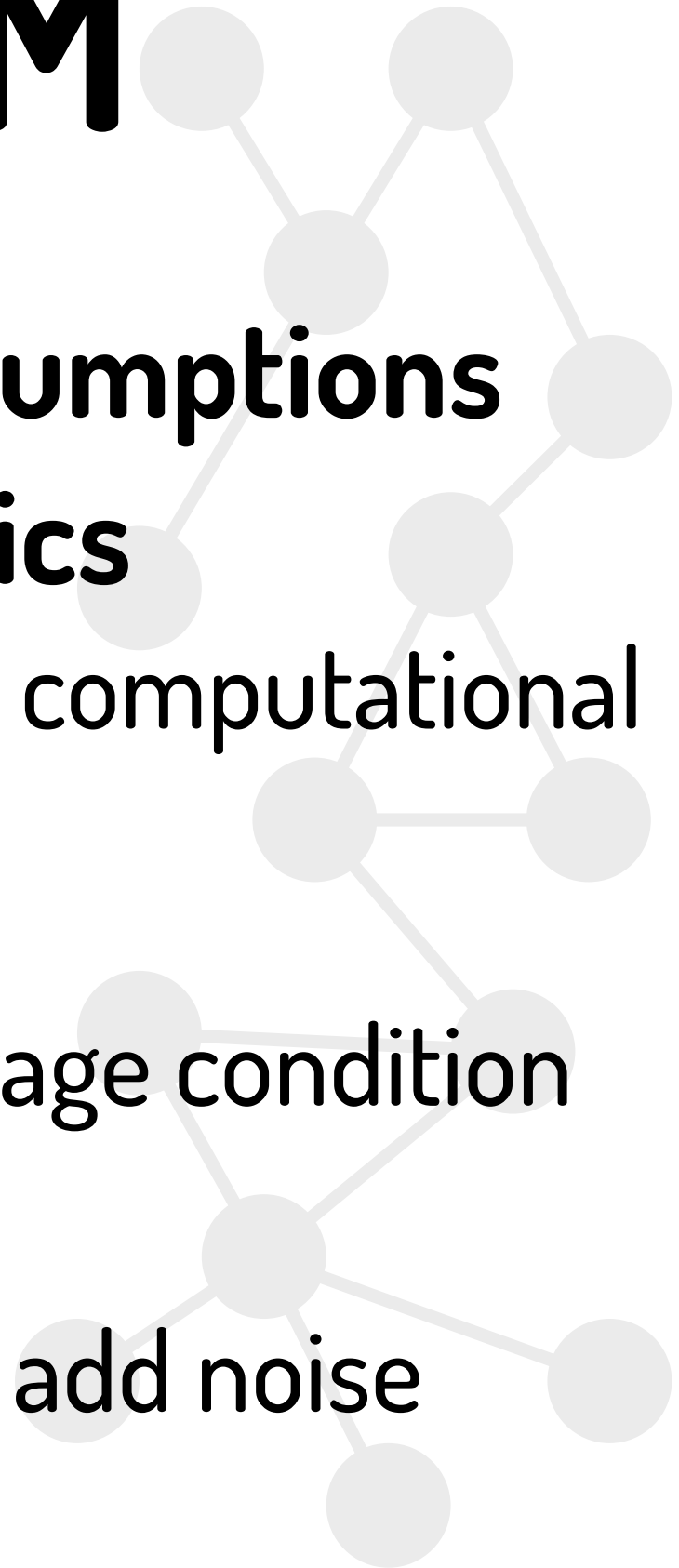
# Why use ABM

**Bonus: Replace the (crazy) assumptions  
of neoclassical economics**

Agents are fully rational with unbounded computational  
skills

Equilibrium defined by re and no-arbitrage condition

Interactions and heterogeneity only add noise



# **Case study: financial markets**



# Basic financial abm

Chartists

Fundamentalists

# Basic financial ABM

Introduced by **Frankel and Froot**

Based on **surveys** with professionals

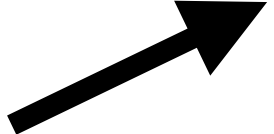
They found traders had **different expectations**, especially with respect to long/short-term trades

# Chartists

Follow the trend

Short-term investors

$$s_{t+1}^e = (1 - g)s_t + gs_{t-1}$$

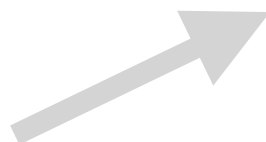
  
**Expected price**

  
**Price at time t**

  
**Price at time t-1**

$$\Delta s_{t+1}^e = -g \Delta s_t$$

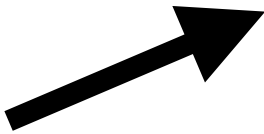
$$s_{t+1}^e = (1 - g)s_t + g s_{t-1}$$



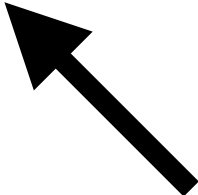
# Fundamentalists

Derive the “fundamental” price  
Long-term investors

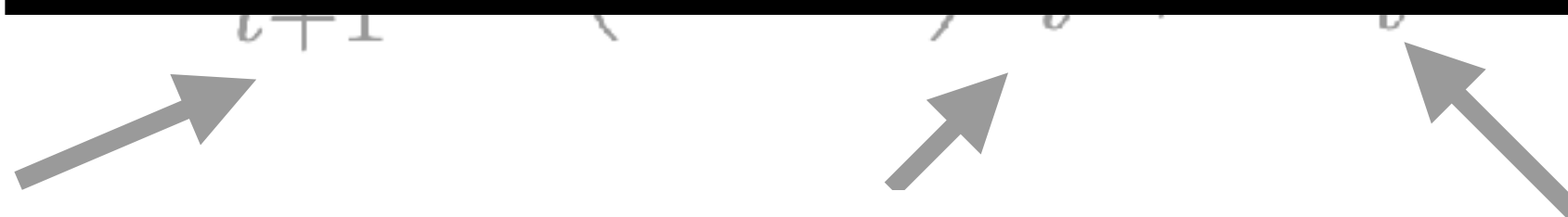
$$s_{t+1}^e = (1 - v)s_t + v\bar{s}_t$$

 **Expected price**

 **Price at time t**

 **Fundamental  
Price at time t**

$$\Delta s_{t+1}^e = v(\bar{s}_t - s_t)$$



# Switching behaviour

**Agents can compare different heuristics and choose**  
**Agents can change their behaviour**



# Basic Financial ABM



# Basic Financial ABM



# Basic Financial ABM



# Basic Financial ABM

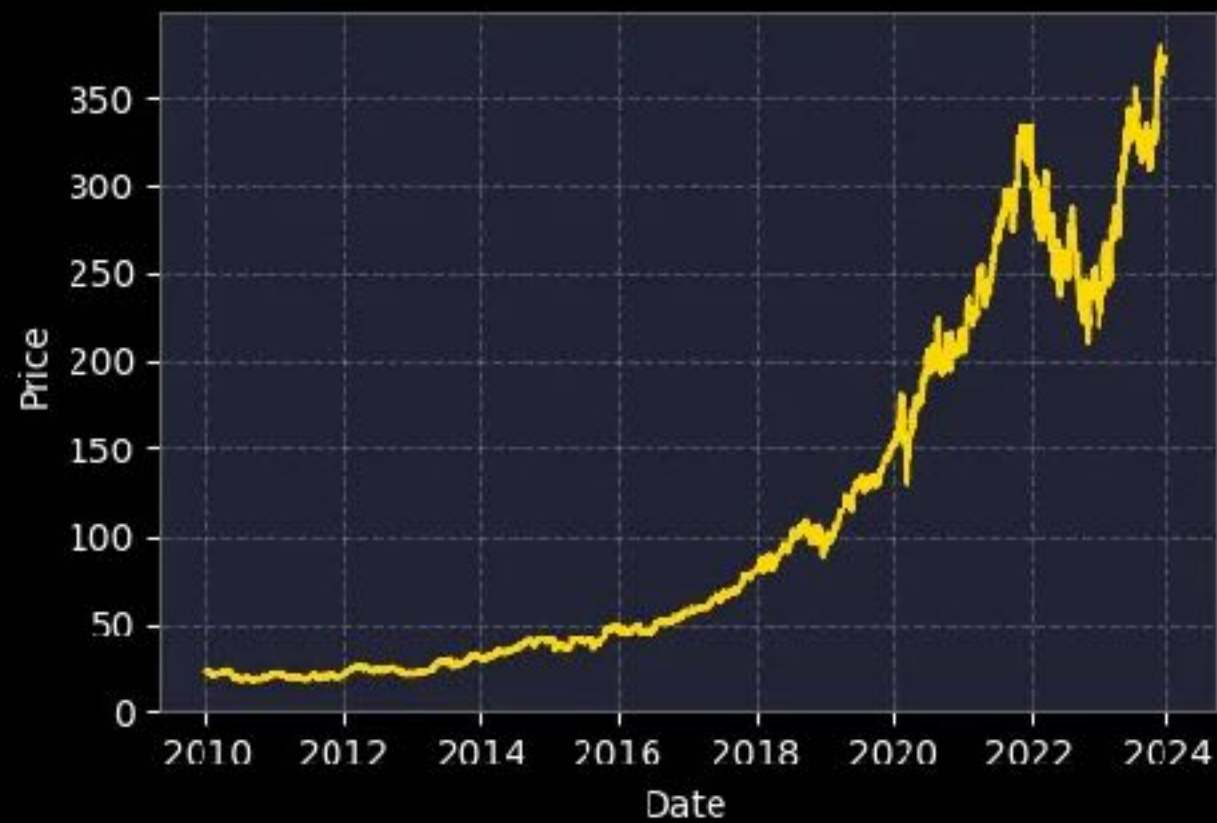


# Basic Financial ABM

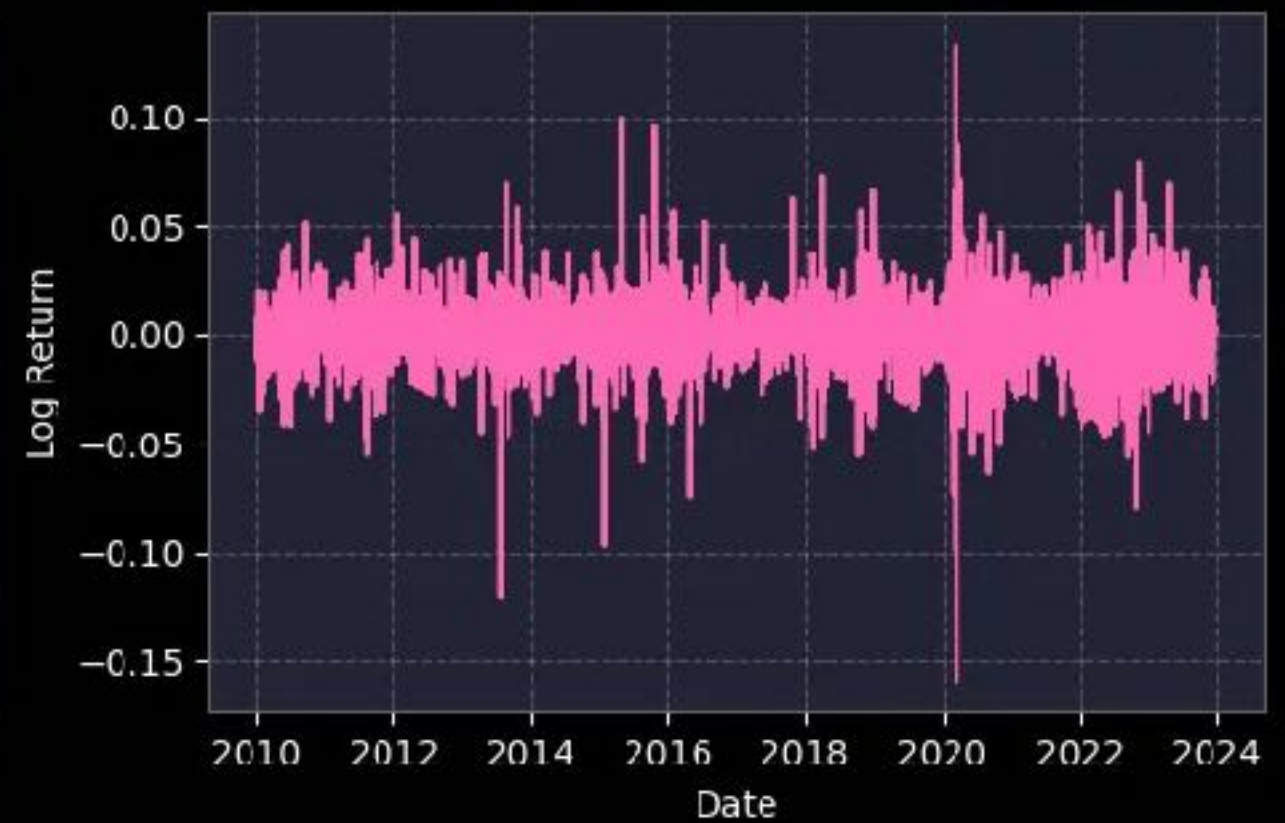


# Analysis for MSFT

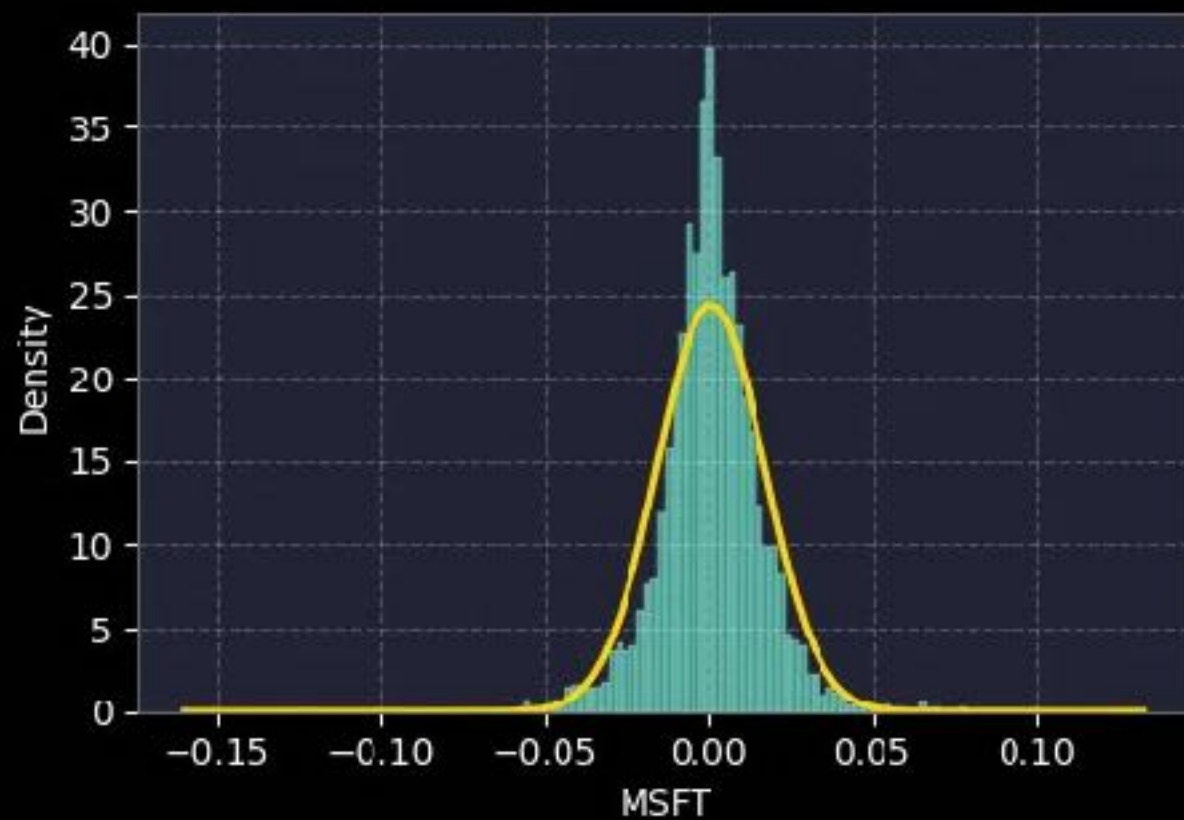
## Price Movement



## Log Returns



## Returns Distribution vs Normal



## Probability Plot

