



# Cooperation networks

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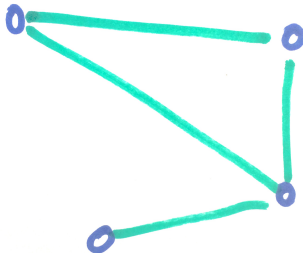


# Nodes



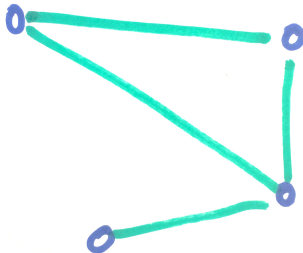


Nodes and edges.





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Why edges, structure, cooperation?



**Node:** something alive.





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H. Morowitz:

the disordering and degradative influences of thermal energy as reflected in the second law of thermodynamics. Living systems self-replicate, that is, they give rise to organisms like themselves, thus accounting for the continuity of life. Living organisms must



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Simplest model: noisy multiplicative growth, e.g. of biomass, group size, wealth *etc.*



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**Edge**: resource-pooling, support, sharing.







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- Richer entity loses when resources are pooled.



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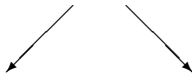
**Key insight**

Growth is not ergodic, *i.e.* expectation value does not reflect what happens over time.

Not in expectation, but over time,  
pooling leads to faster growth.



## Game



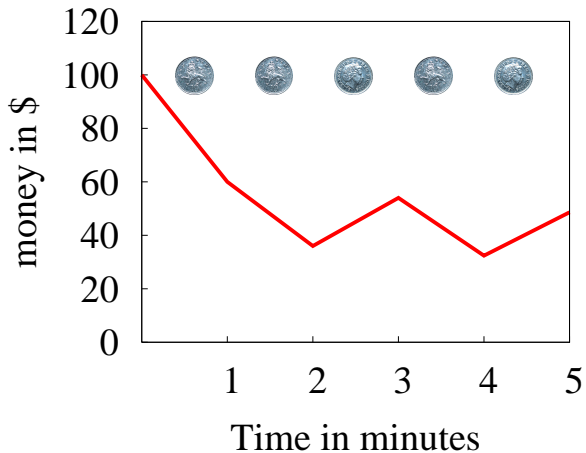
Heads: win 50%.



Tails: lose 40%.

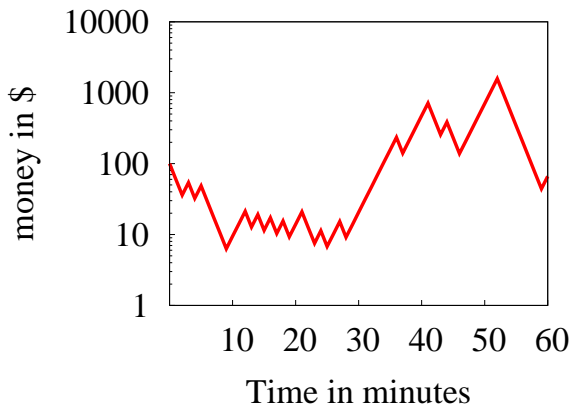


Toss coin once a minute





One sequence







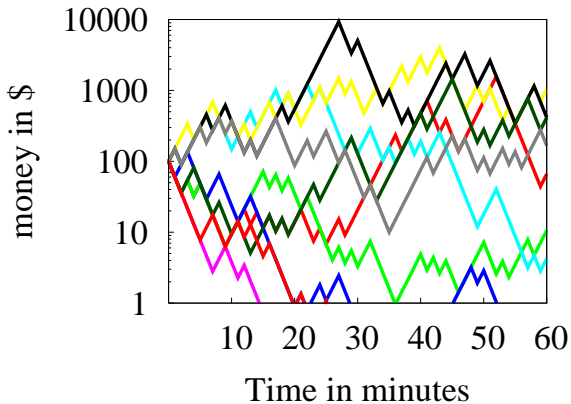
FERMAT and PASCAL 1654:

Imagine all possibilities and average over them.

Call this average the “expectation value.”

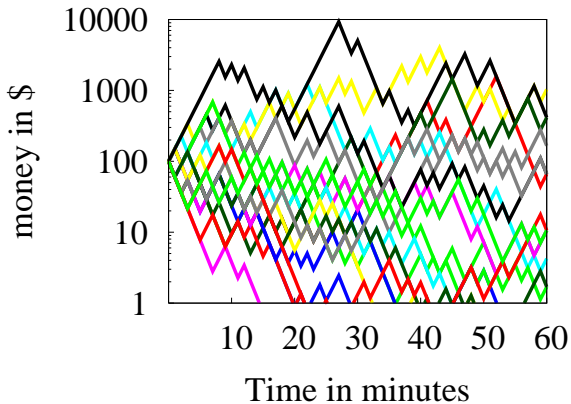


# FERMAT and PASCAL 1654: 10 sequences



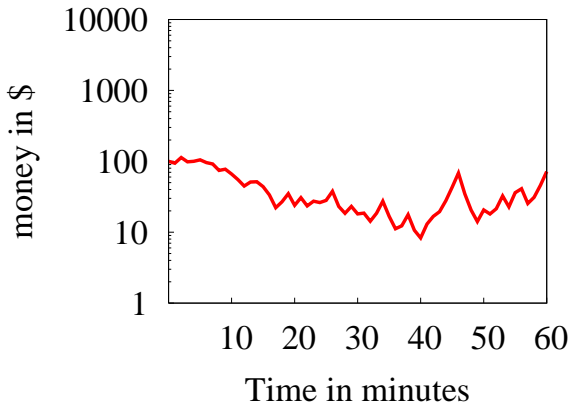


# FERMAT and PASCAL 1654: 20 sequences



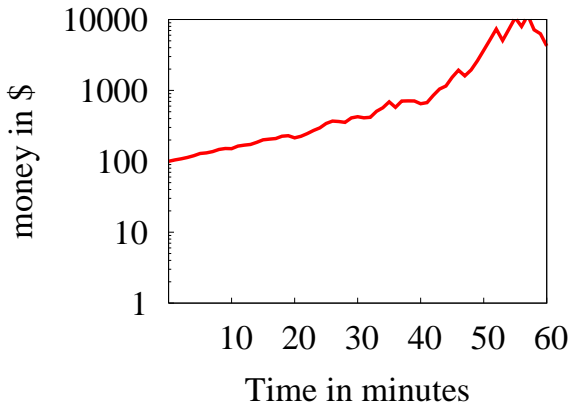


## FERMAT and PASCAL 1654: Average of 20 sequences



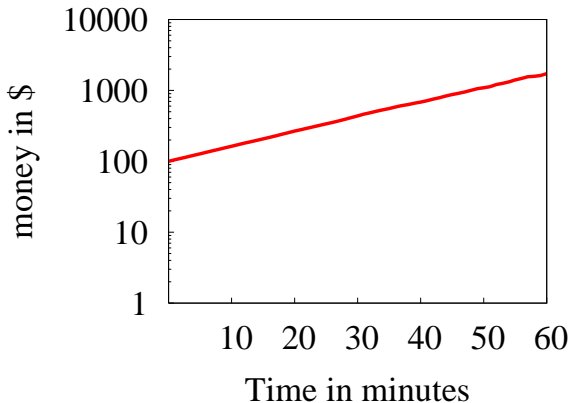


FERMAT and PASCAL 1654:  
Average of 1000 sequences





FERMAT and PASCAL 1654:  
Average of 1,000,000 sequences





## Conclusion

Game worth playing, on average.



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Alternative: What average?

Game worth playing if averaging across parallel universes.



BOLTZMANN 1872:

“Is expectation value also average over time?”



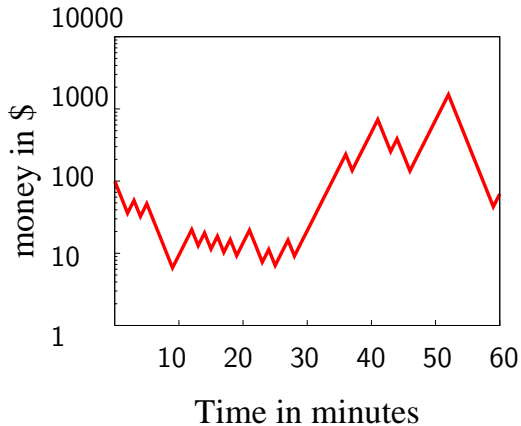
BOLTZMANN 1872:

“Is expectation value also average over time?”

→ Play for a long time, and see what happens.

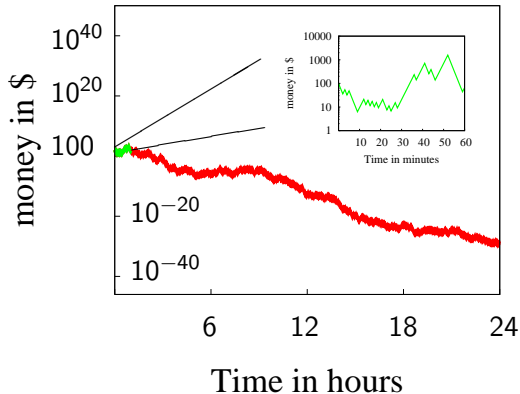


BOLTZMANN 1872:  
Play for one hour...





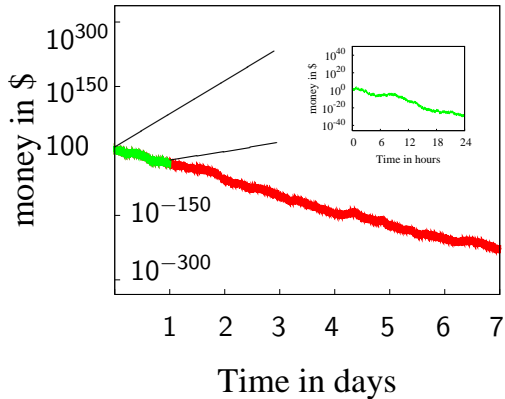
BOLTZMANN 1872:  
..continue one day (note scales)...





BOLTZMANN 1872:

..continue one week (note scales)...

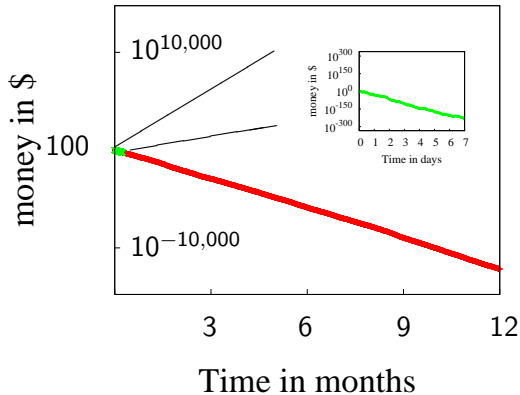






BOLTZMANN 1872:

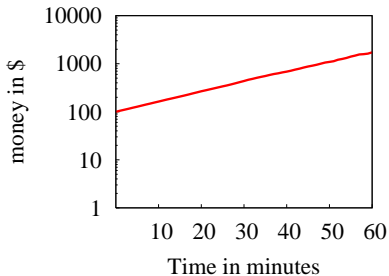
..continue one year (note scales)...





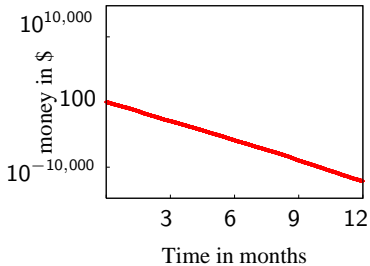
1654

Ensemble perspective



1872

Time perspective





Non-ergodic

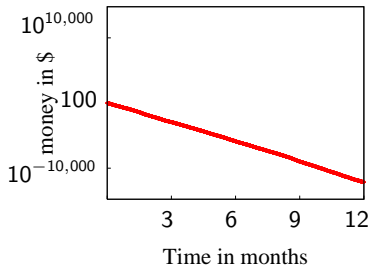
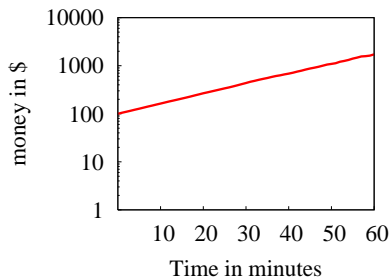
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≠





... people won't play – why?



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Because they would lose *over time*.



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We care about the future (time), not the multiverse (expectation values).



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## Shameless ad

Formal economics built on expectation values.

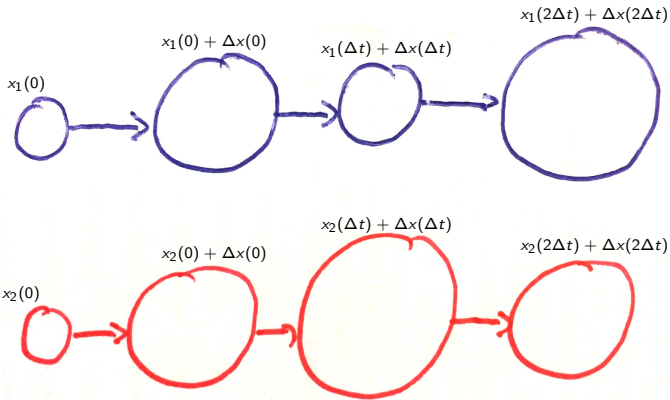
My program

Re-develop all of economics.

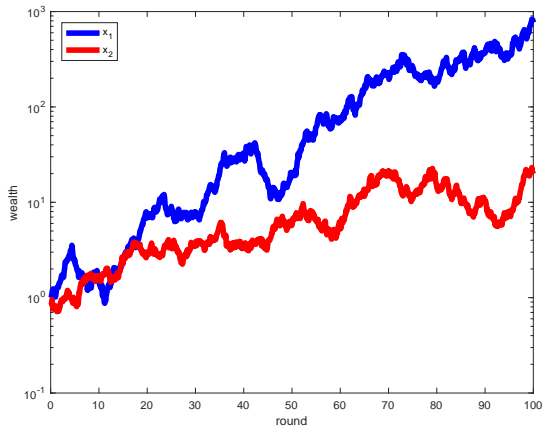


Two living things, following noisy exponential growth

$$dx_i = x(\mu dt + \sigma dW_i)$$







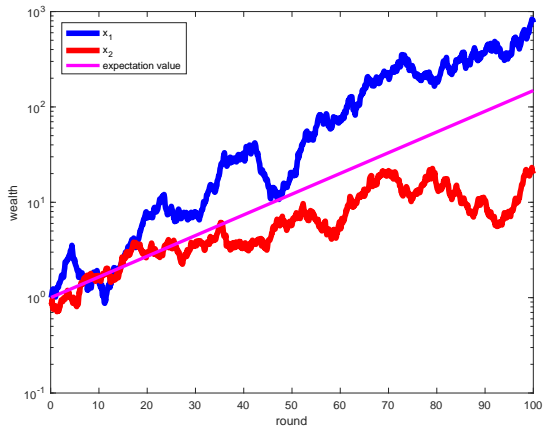


## Expectation value (Fermat 1654)

$$\langle x(t) \rangle = \exp(\mu t)$$

## Expectation-value growth rate

$$g_{\langle} = \frac{1}{t} \ln \left( \frac{\langle x(t) \rangle}{x(0)} \right) = \mu$$

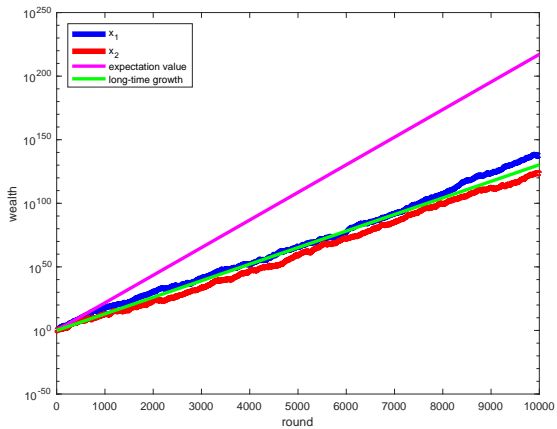




## Time-average growth rate (OP 2011)

$$g_t = \lim_{t \rightarrow \infty} \frac{1}{t} \ln \left( \frac{x(t)}{x(0)} \right) = \mu - \frac{\sigma^2}{2}$$

(building on Whitworth 1870, Itô 1944, Kelly 1956 *etc.*)







## **Fluctuations reduce growth.**

- reducing fluctuations increases growth (risk management).



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- cooperation increases growth.
- cooperators outcompete non-cooperators.

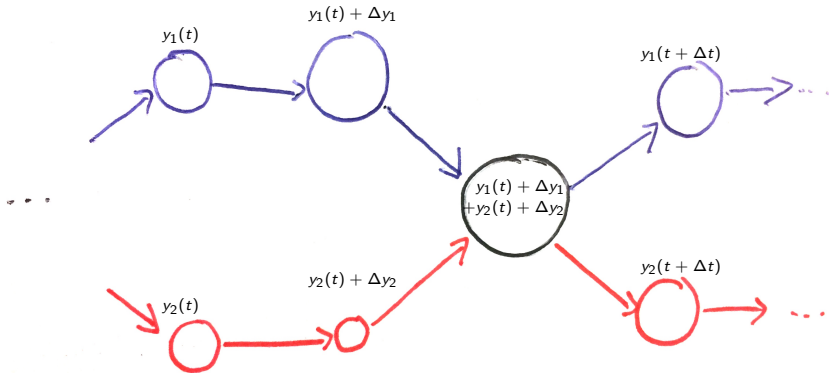


Grow

Cooperate

Grow

Pool Share





### No cooperation:

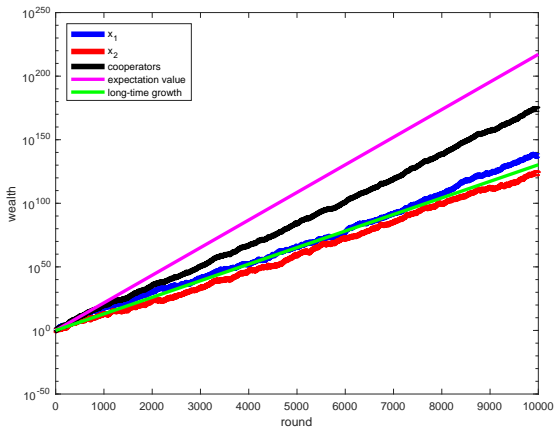
$$dx = x(\mu dt + \sigma dW)$$

$$g_t(x) = \mu - \frac{\sigma^2}{2}$$

### Cooperation reduces $\sigma$ :

$$dy = y(\mu dt + \frac{\sigma}{\sqrt{2}} dW)$$

$$g_t(y) = \mu - \frac{\sigma^2}{4}$$





## Big thoughts

- Emergence: cooperating whole (network) is more than sum of non-cooperating parts (nodes).
- In multiplicative growth, pooling is not just adding – different mathematics.  
Conservation law broken by growth  $\rightarrow$  non-linear.
- Much of biology is risk management.



Explained the link – atom of network design.

### Extension to network design

- Cooperating with inferior entity,  $\mu_1 > \mu_2$ , still beneficial, if

$$\mu_1 - \frac{\sigma_1^2}{2} > \frac{\mu_1 + \mu_2}{2} - \frac{\sigma_1^2 + \sigma_2^2}{8}.$$

- Fully connected graph with partial sharing (weighted edges): taxation

$$dx_i = x_i[(\mu - \tau)dt + \sigma dW] + \langle x \rangle_N \tau dt.$$

- $n$  cooperators grow at  $\mu - \frac{\sigma^2}{2n}$ .



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$$\begin{aligned} dx_i &= x_i[(\mu - \tau)dt + \sigma dW] + \langle x \rangle_N \tau dt. \\ &= x_i[\mu dt + \sigma dW] - (x_i - \langle x \rangle_N) \tau dt. \end{aligned}$$

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## Conditions

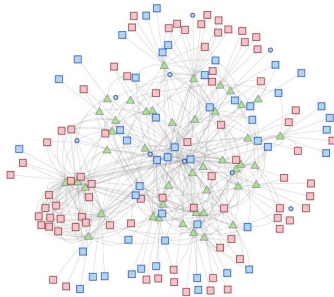
- Important for early-growth networks, prior to new function (Geoff West's economies of scale, specialization *etc.*).
- Correlation between cooperators reduces cooperation benefit.
- Fluctuations increase cooperation benefit.





## Business world

- Used for big financial risk management systems.



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Thank you.

