

# Viewing Complexity through The Quantum Lens

*Can Quantum Logic reshape our notions of what is  
complex?*



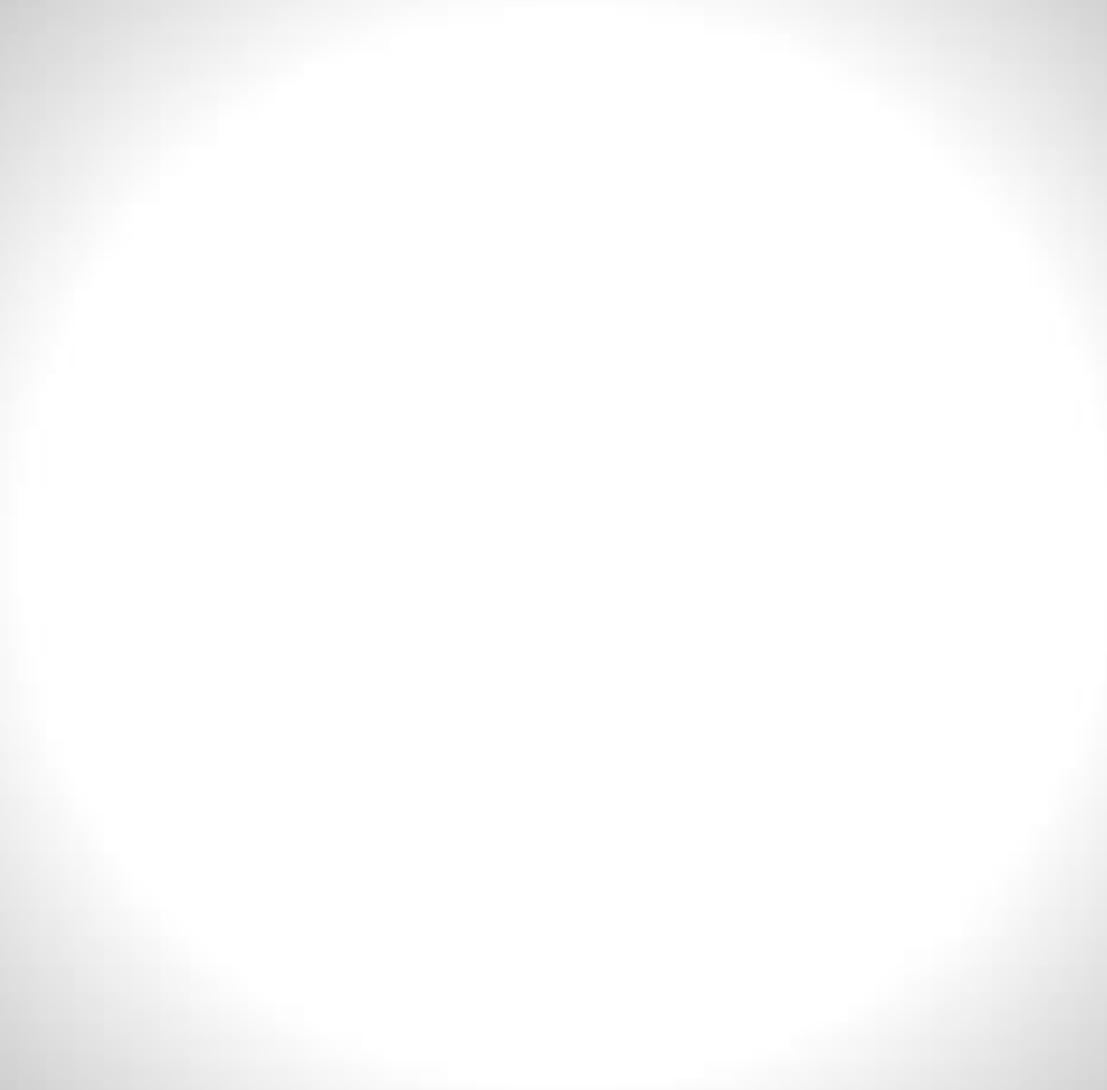
*Vlatko Vedral*

*Nottingham 2015*

“Why does “complexity” or “interestingness” of physical systems seem to increase with time and then hit a maximum and decrease, in contrast to the entropy, which of course increases monotonically?”

*-Sean Carol, 2011 FQXi Conference*



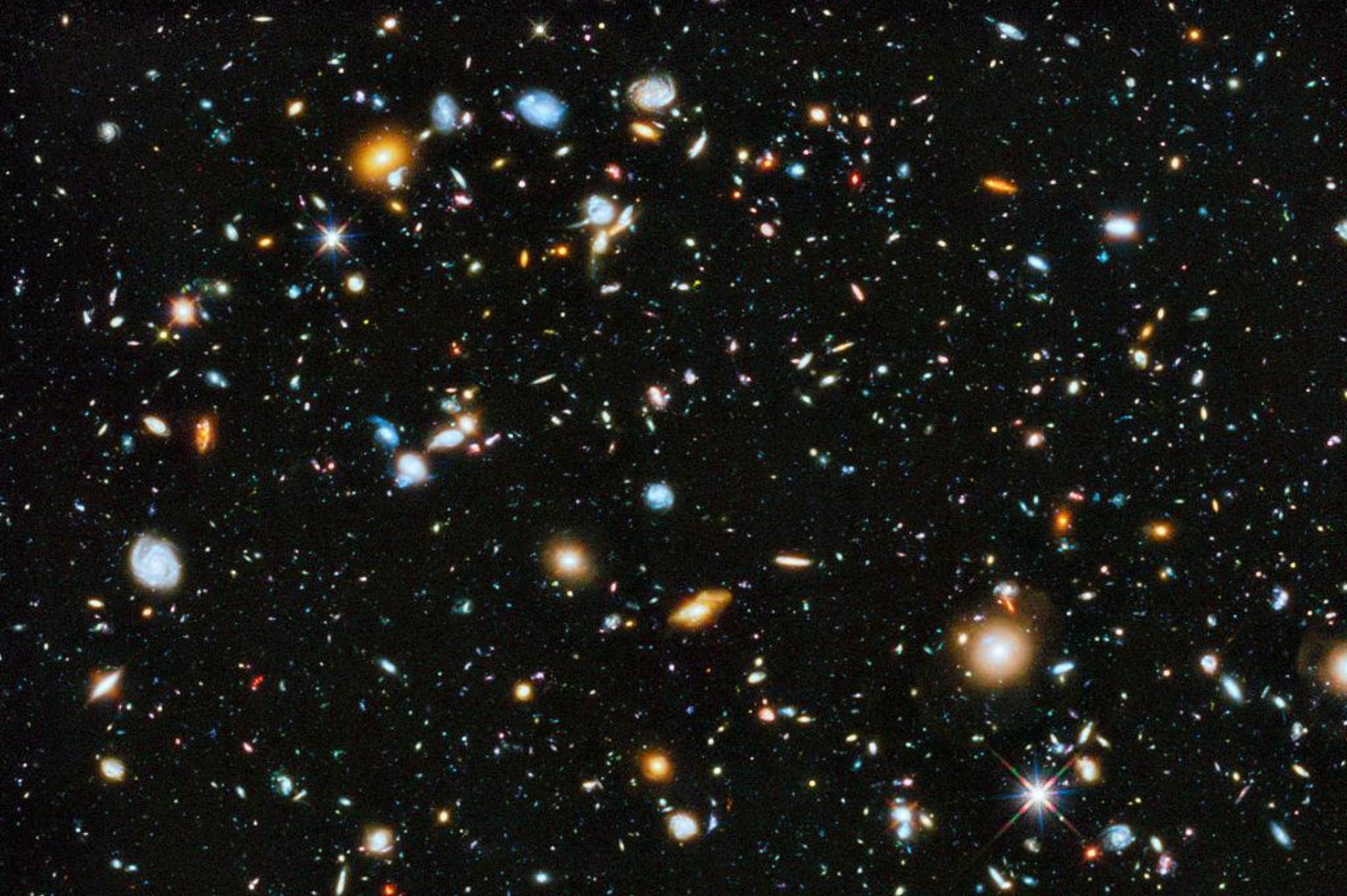


$T = 1s$

*Smooth Plasma – Simple*

$T \sim 10^{100}$  Years

*The Nothingness of Heat Death - Simple*



*T ~ Now*

*'Very Interesting' Patterns, Structure, Complexity*

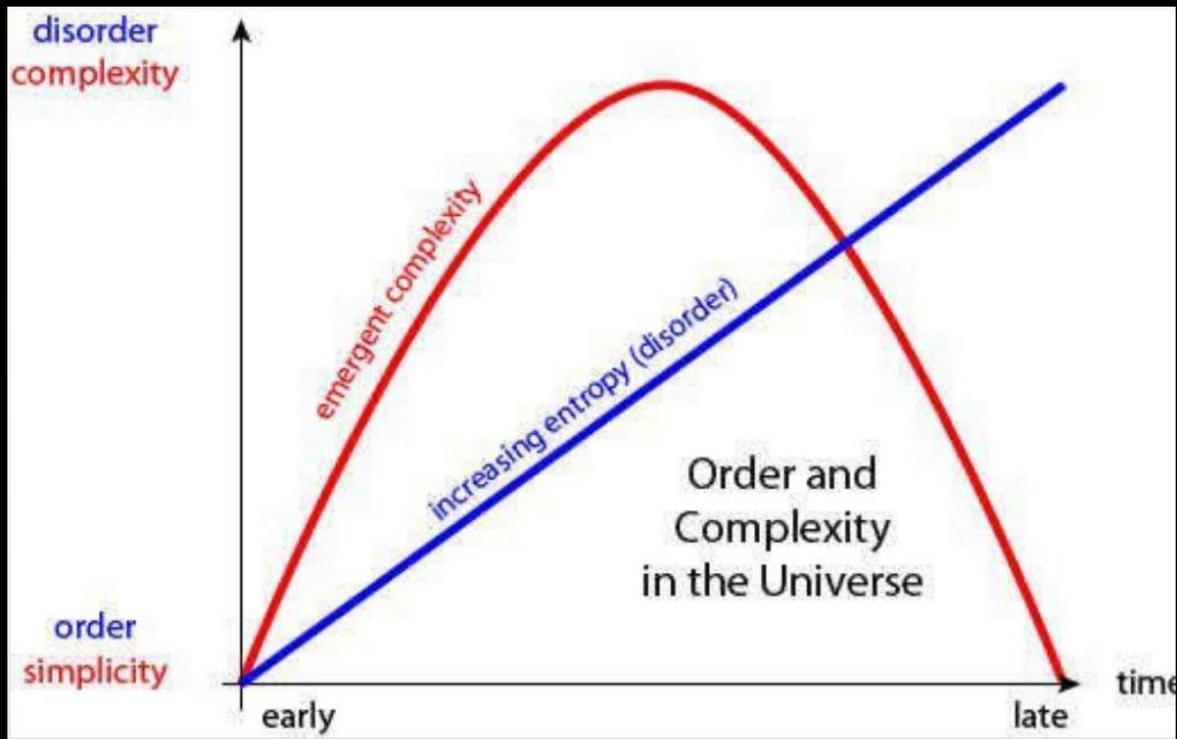


**LOW ENTROPY**  
**LOW COMPLEXITY**

**HIGH ENTROPY**  
**LOW COMPLEXITY**

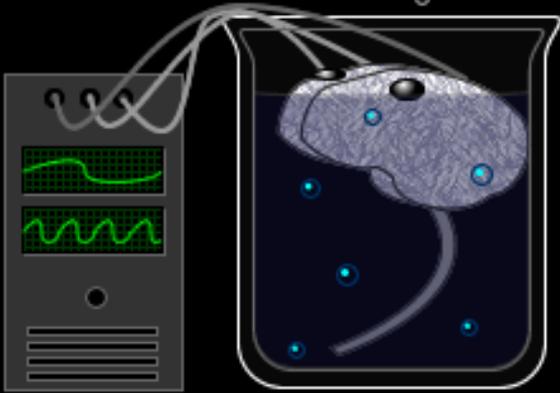
**HIGH COMPLEXITY!**

**TIME**



*Is there a Universal Law for the Evolution of Complexity?*

...0110000111011101...



*PAST OBSERVATIONS*



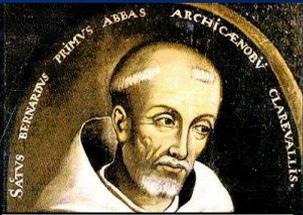
*MODEL*



*FUTURE BEHAVIOUR*

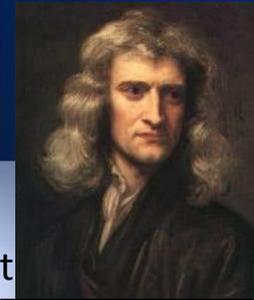


# Occam's Razor



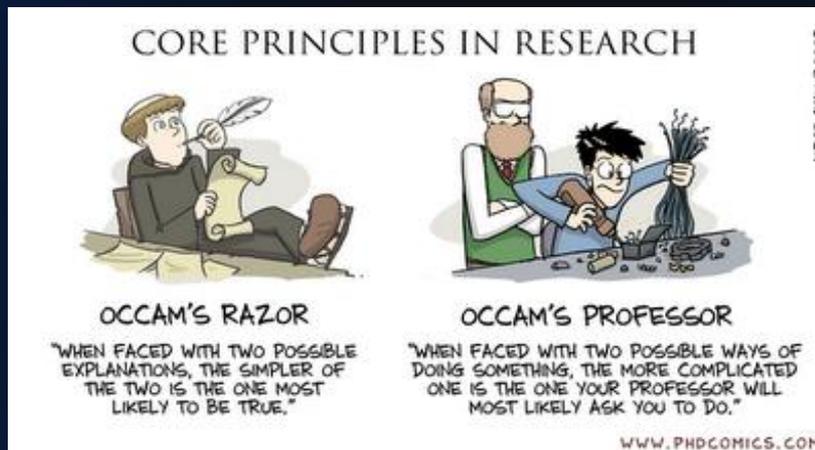
William of Ockam

"Plurality is not to be posited without necessity."

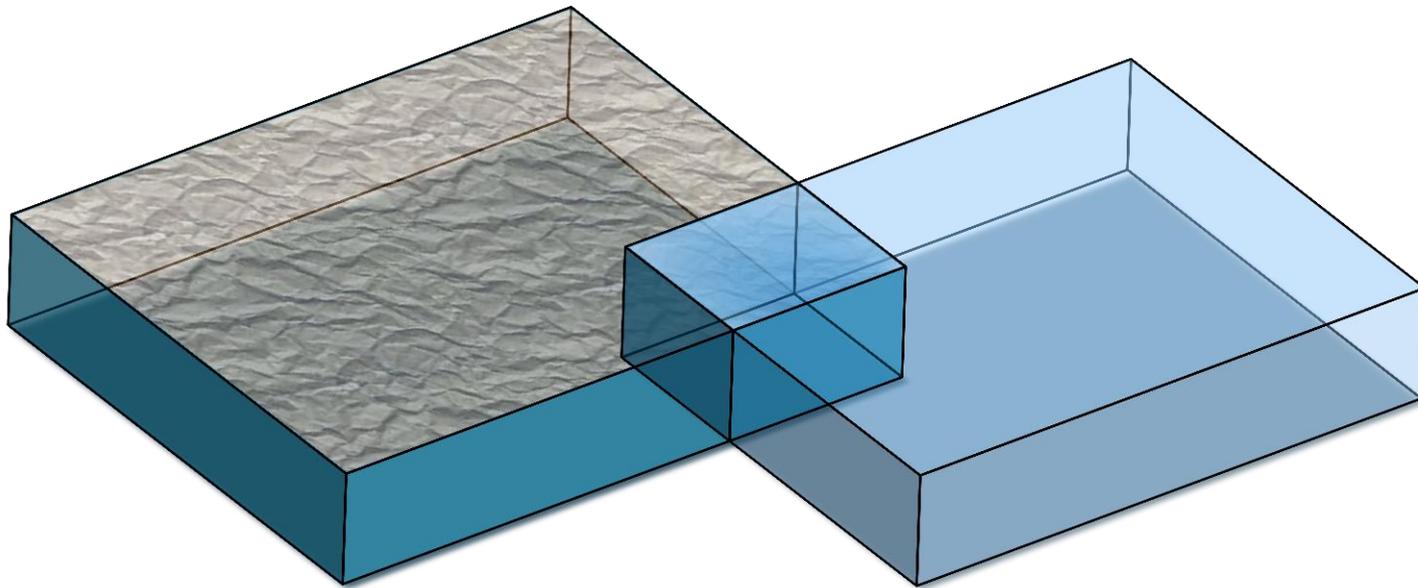


Isaac Newton

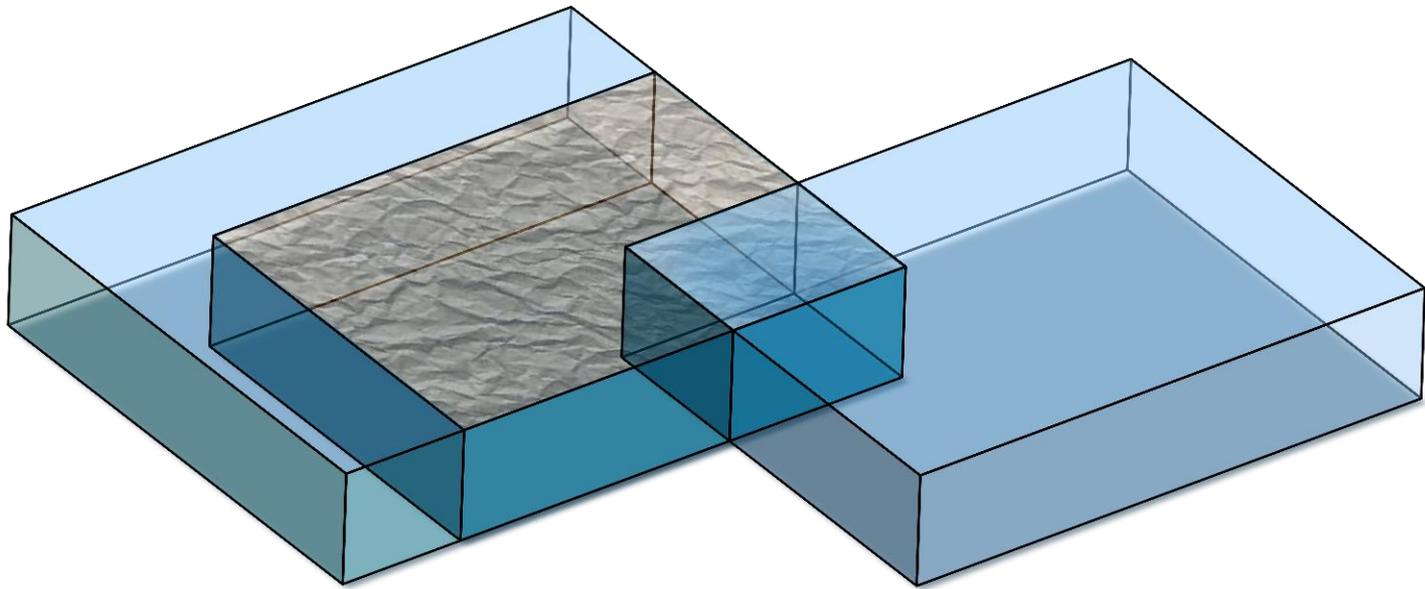
"We are to admit no more causes of natural things than such as are both true and sufficient to explain their appearances."



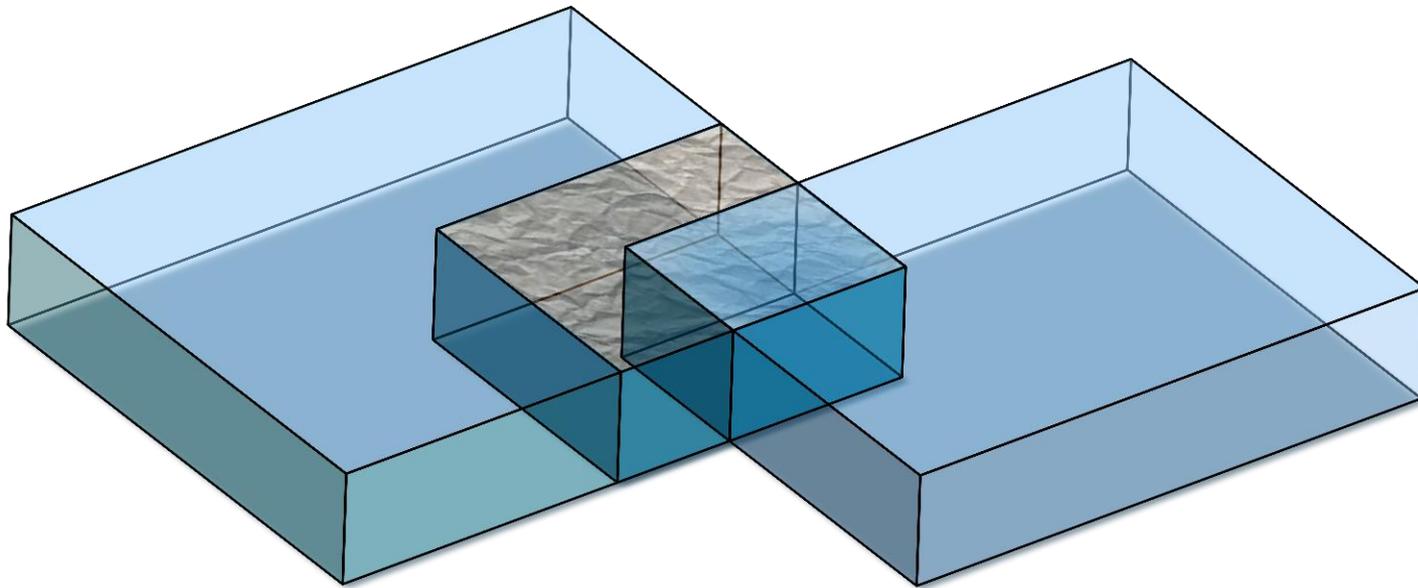
Without any understanding, every possible past is a potential cause of future events.



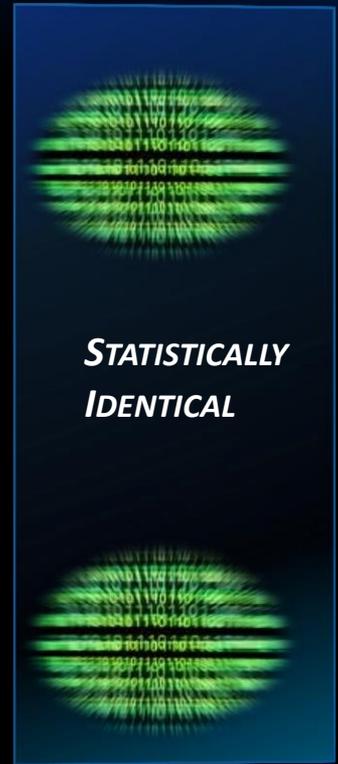
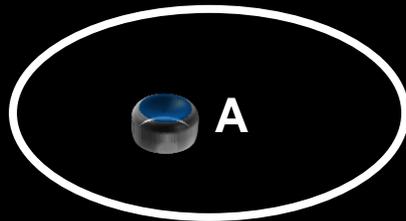
$$P(\vec{X}, \vec{X})$$



The better we can isolate the causes of natural things, the greater our understanding.

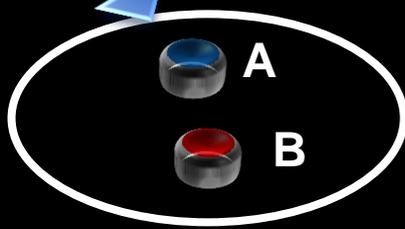


*MODEL 1*



*STATISTICALLY IDENTICAL*

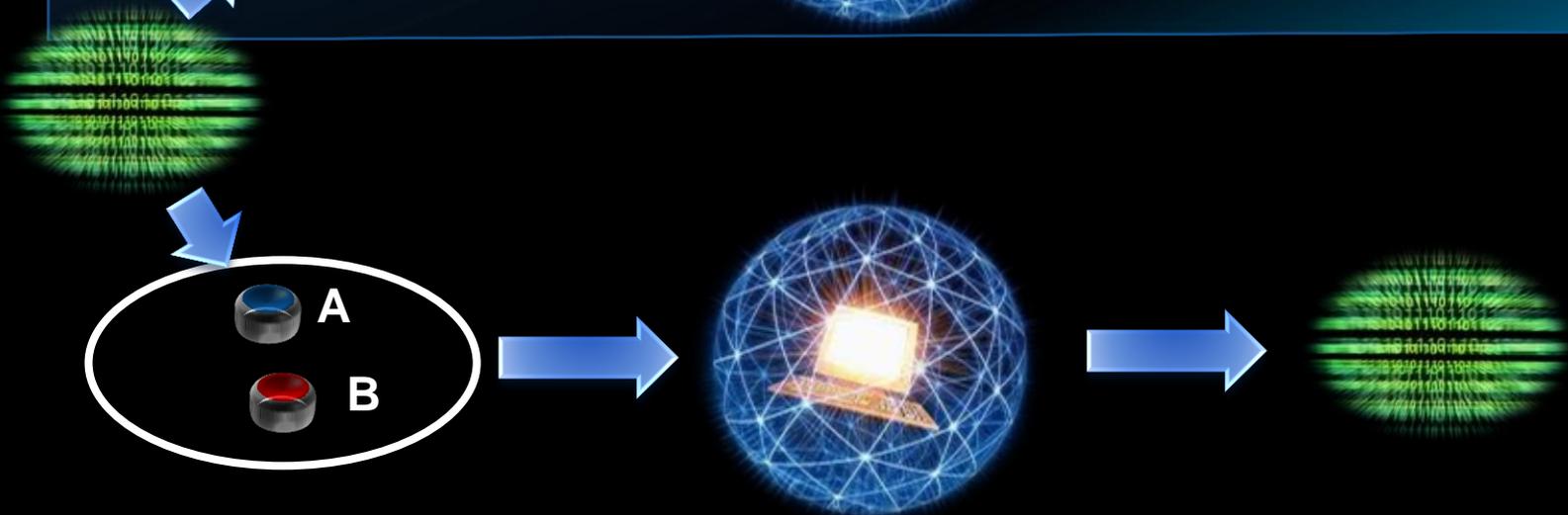
*MODEL 2*

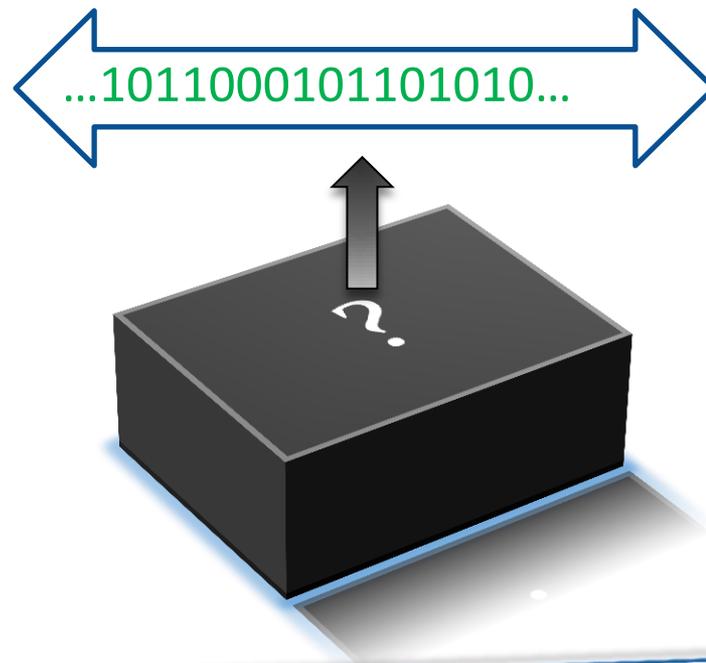


*MODEL 1*



*MODEL 2*



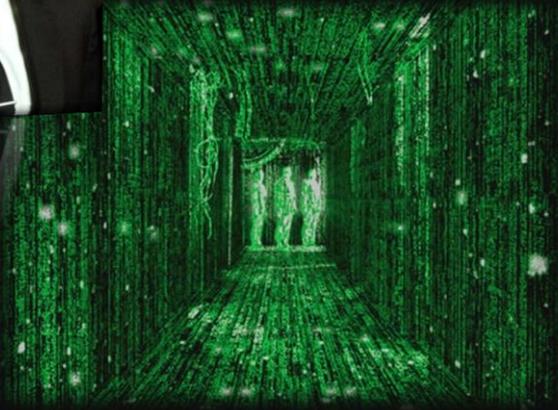


The complexity of a system can be quantified by the minimum amount of causes (as measured by information entropy) one must invoke to understand.

# Enter the Matrix



Suppose you're a programmer for the matrix

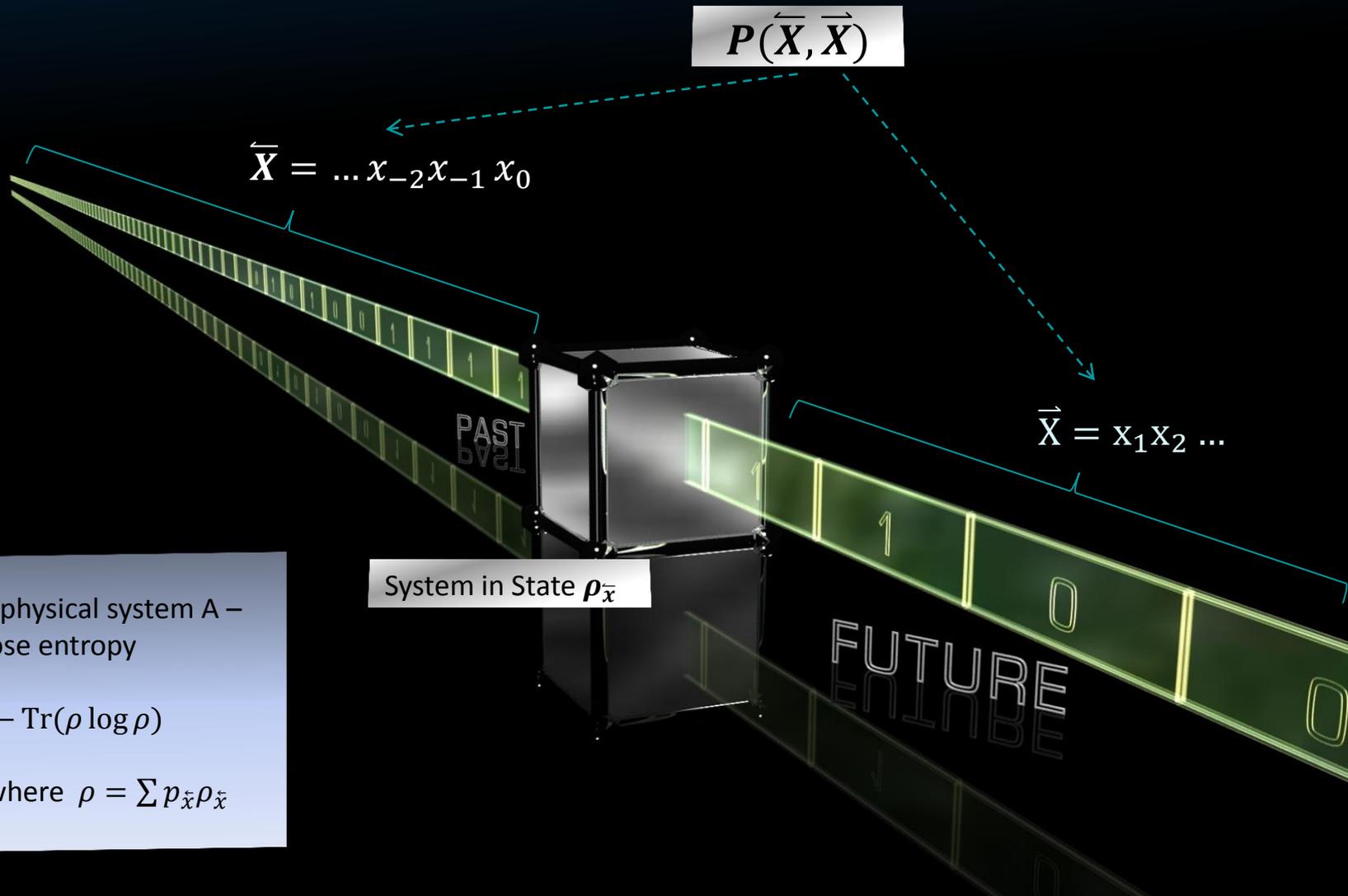


You are tasked to program an object to simulate a particular desired behaviour.



The more complex object, the more 'causes' you must track – the more hard drive space you will need.

# Stochastic Processes



## Task:

Find a simplest physical system  $A$  – the system whose entropy

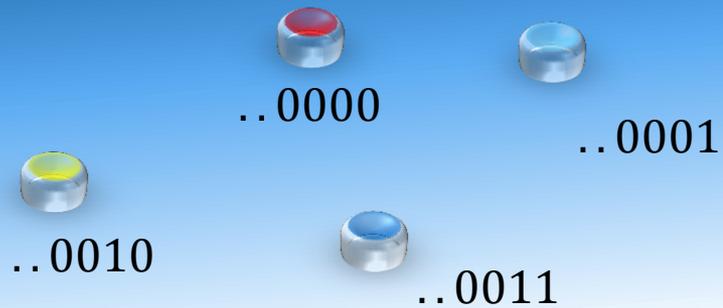
$$S(A) = -\text{Tr}(\rho \log \rho)$$

Is minimised, where  $\rho = \sum p_{\vec{x}} \rho_{\vec{x}}$

# Stochastic Processes

Construct a system that stores each possible past in a separate configuration.

$$\rho_{\vec{x}} = \vec{x}$$



Set of All Pasts

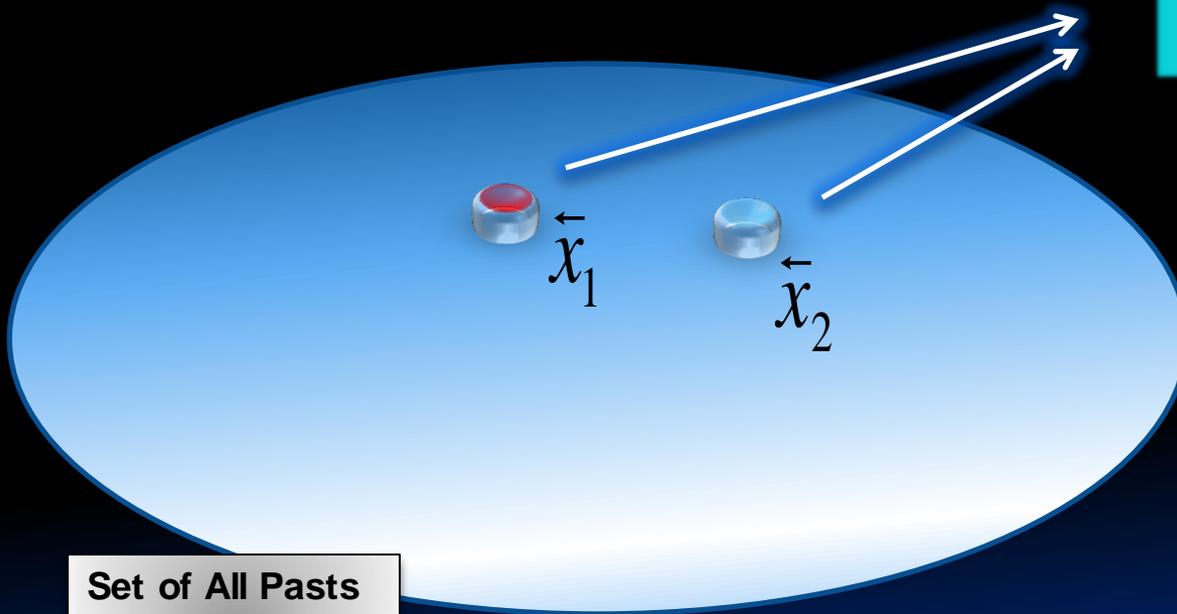


# Stochastic Processes

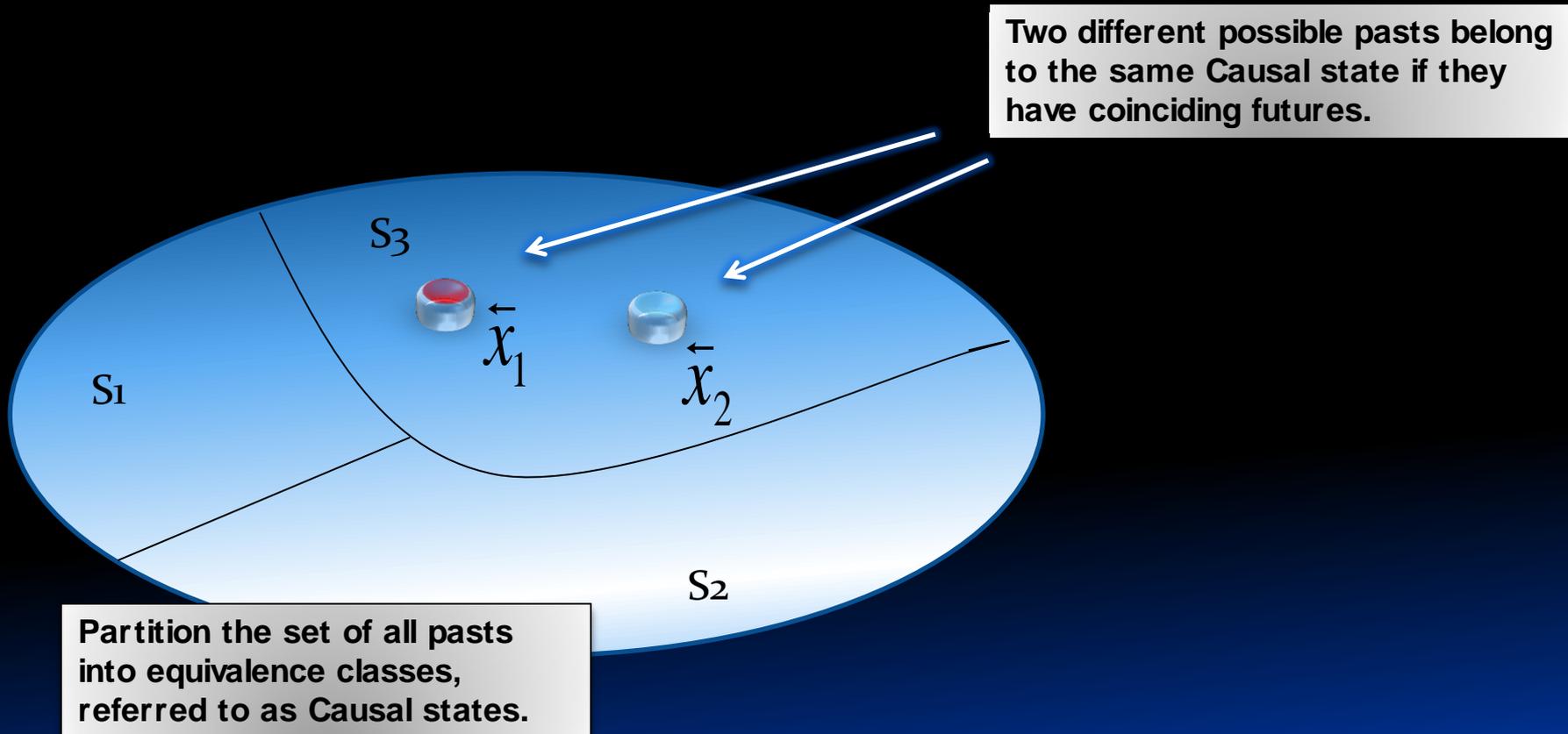
Suppose two pasts have statistically identical futures

$$P(\vec{X} | \vec{X} = \vec{x}_1) = P(\vec{X} | \vec{X} = \vec{x}_2)$$

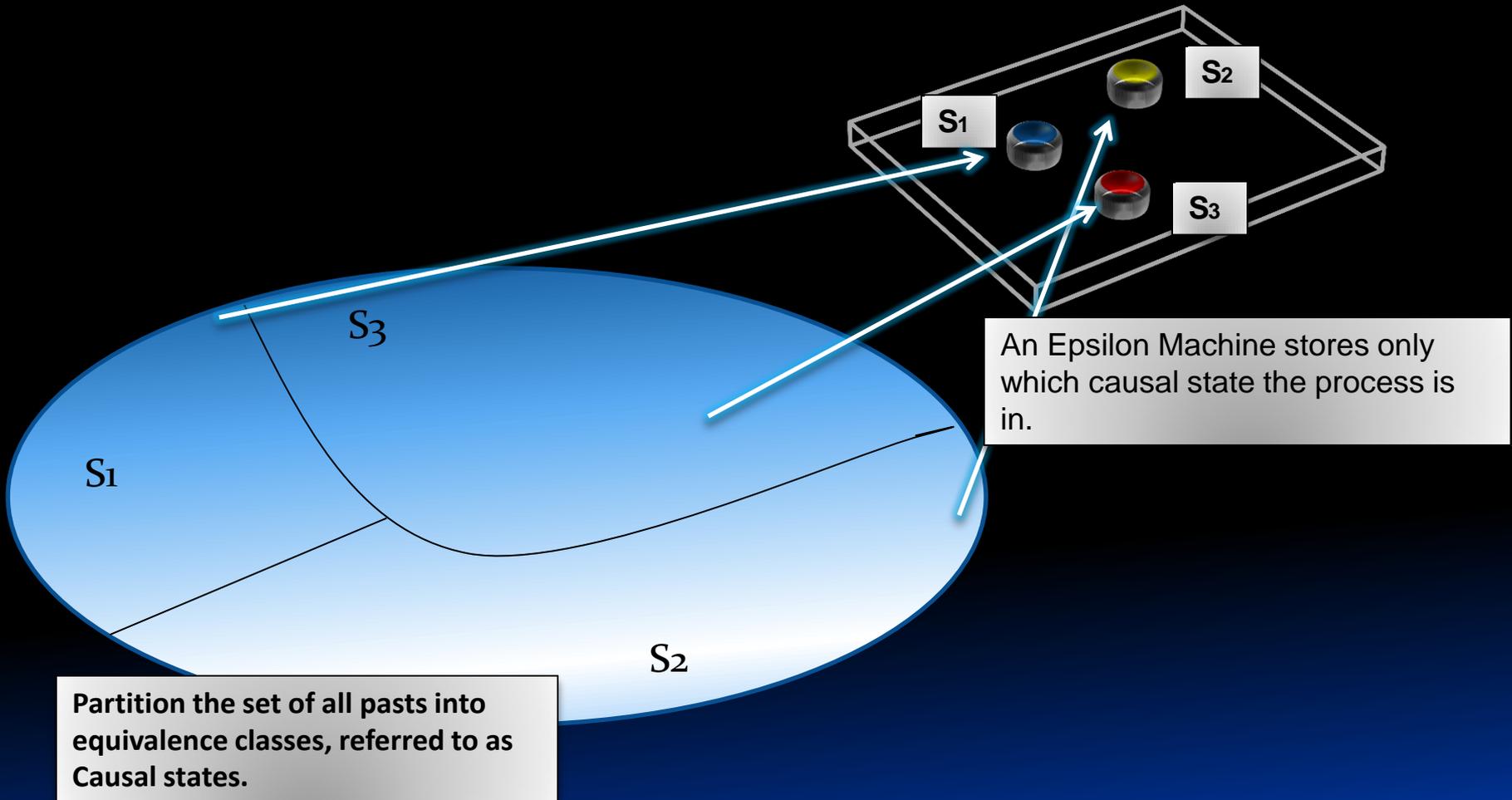
The information needed to distinguish the two is irrelevant to the future of the process and can thus be discarded.



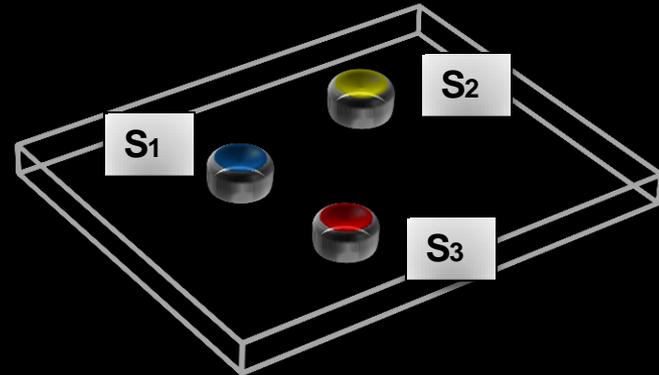
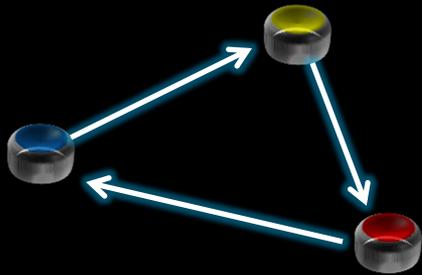
# Focus on Stochastic Processes



# Focus on Stochastic Processes



# The Simplest Model... Epsilon Machines



An Epsilon Machine stores only which causal state the process is in.

The Stochastic Process can then be completely defined by transition probabilities on the causal states.

$$T_{j,k}^r$$

Probability a Stochastic process in Causal state  $S_j$  will emit output 'r' and transition to  $S_k$

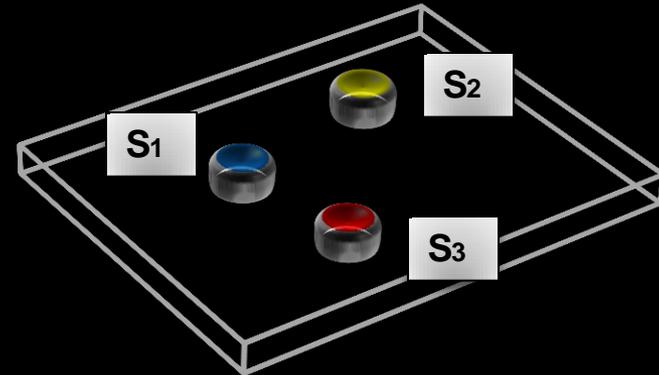
# Statistical Complexity

Probability the process is in Causal State  $S_i$

Internal Entropy:



$$C_\mu = -\sum p_i \log p_i$$



To simulate a sequence of random coin flips....

We have a process with exactly 1 Causal State

No Information about the Past is required!

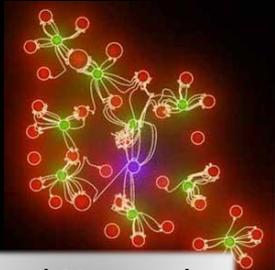


No classical system can simulate a given stochastic process using less information than a Epsilon Machine

Crutchfield, J, and Young, K. Physical Review Letters 63.2 (1989):

$C_\mu$  is an intrinsic property of a stochastic process that measures the minimal amount of memory required to simulate the given process.

# Statistical Complexity



*IEEE Trans. Neural Networks, 10, 2, 284-302*

Neural Networks

Applied to wide range of systems.



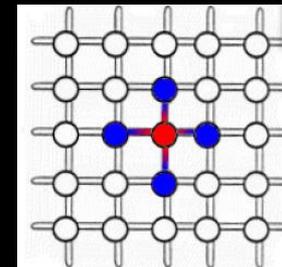
Dripping Faucets

*Physica A: 257, 1-4, 385-389*

Pseudo-random  
Number generators.



*Physica A: 356, 1, 133-138*



Ising Models

*PRA 238, 4-5, 244-252*



Crutchfield

1989

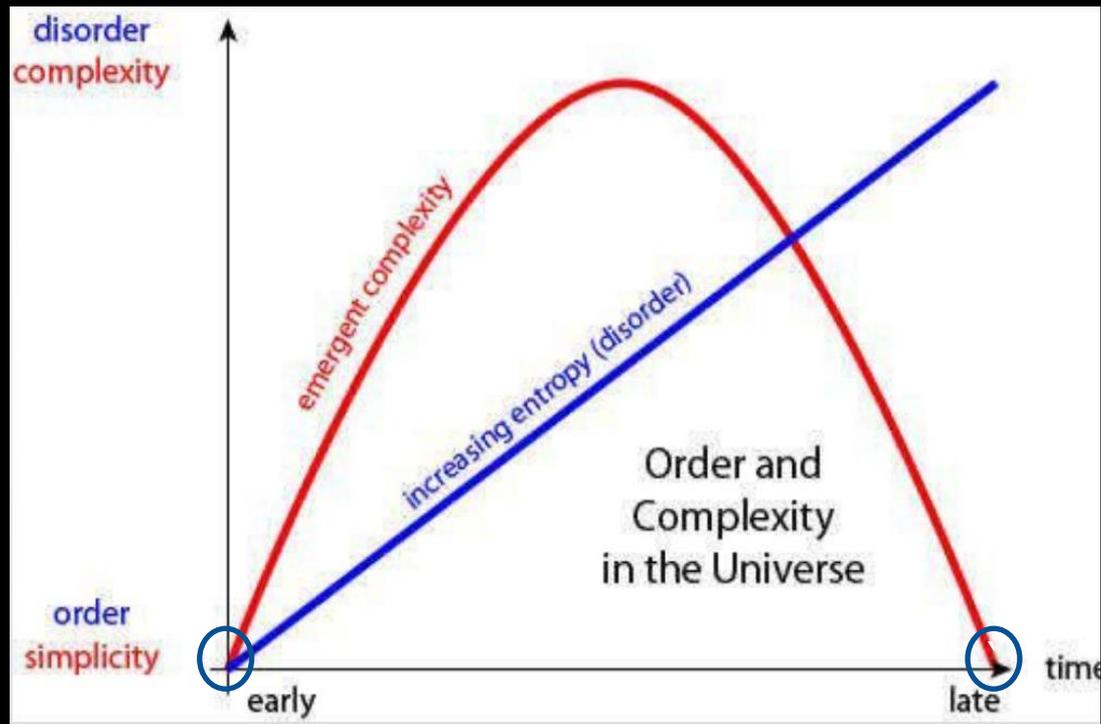
No classical system can simulate a given stochastic process using less information than a Epsilon Machine

*Phys. Rev. Lett. 63, 105-108 (1989)*



$C_\mu$  is a **intrinsic** property of a stochastic process that measures the minimal amount of memory required to simulate the given process.

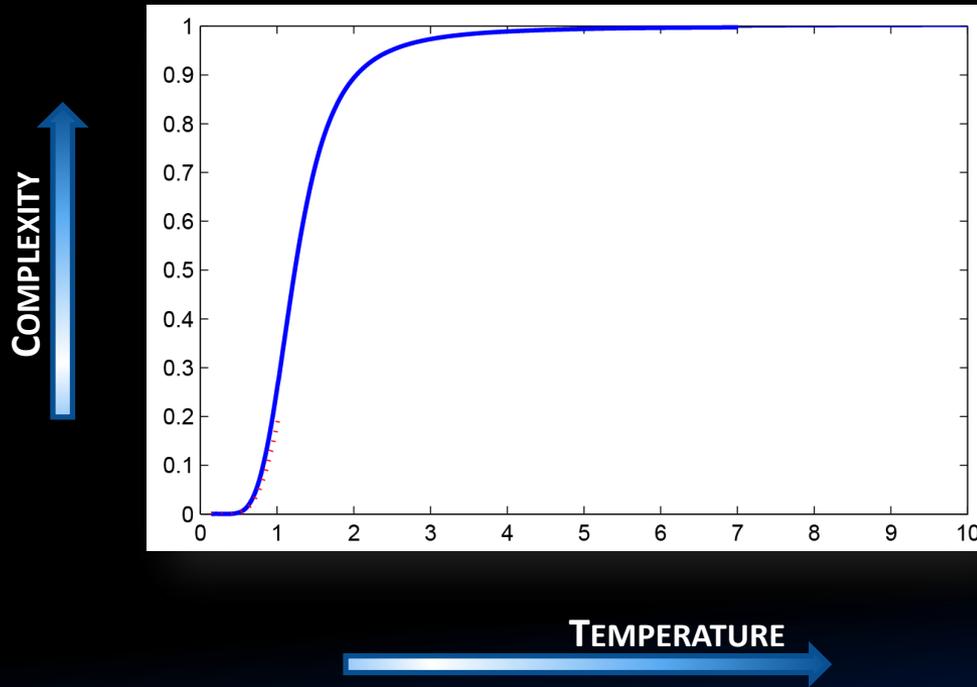
# Statistical Complexity



## SPIN CHAIN AT TEMPERATURE T

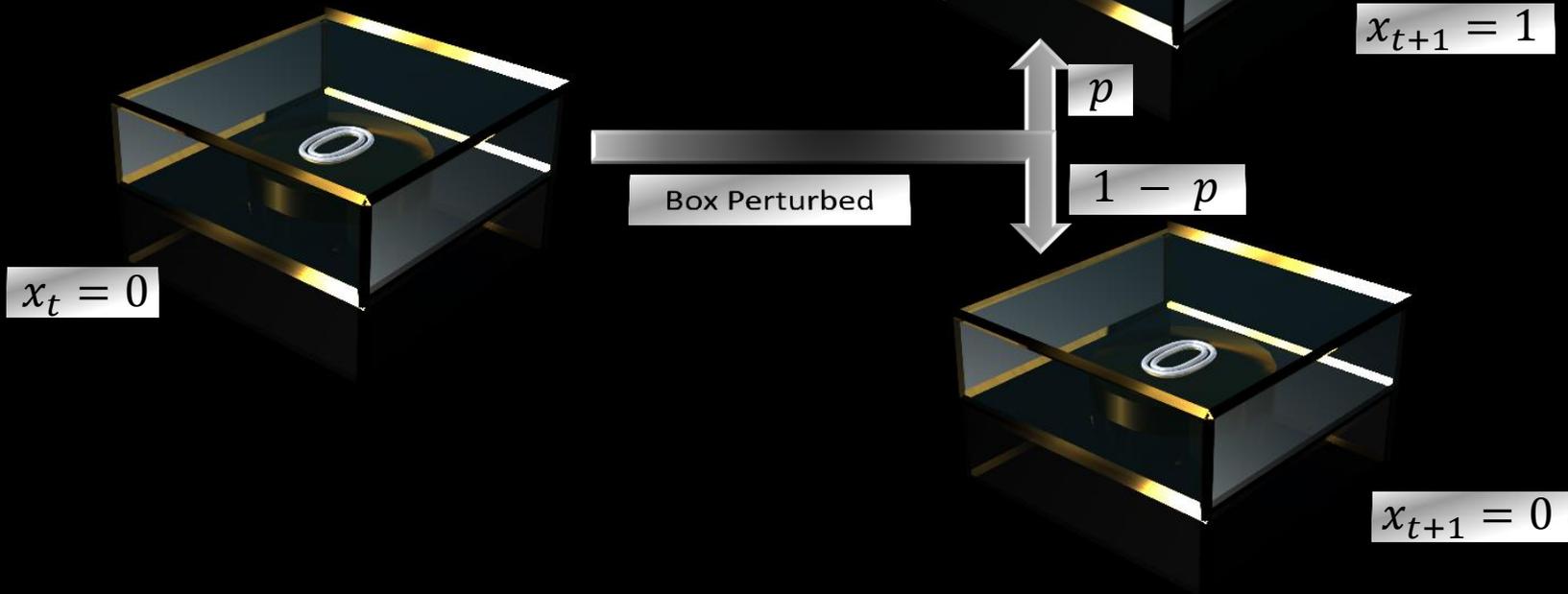


$$H = -J \sum s_j s_{j+1} - B \sum s_j$$

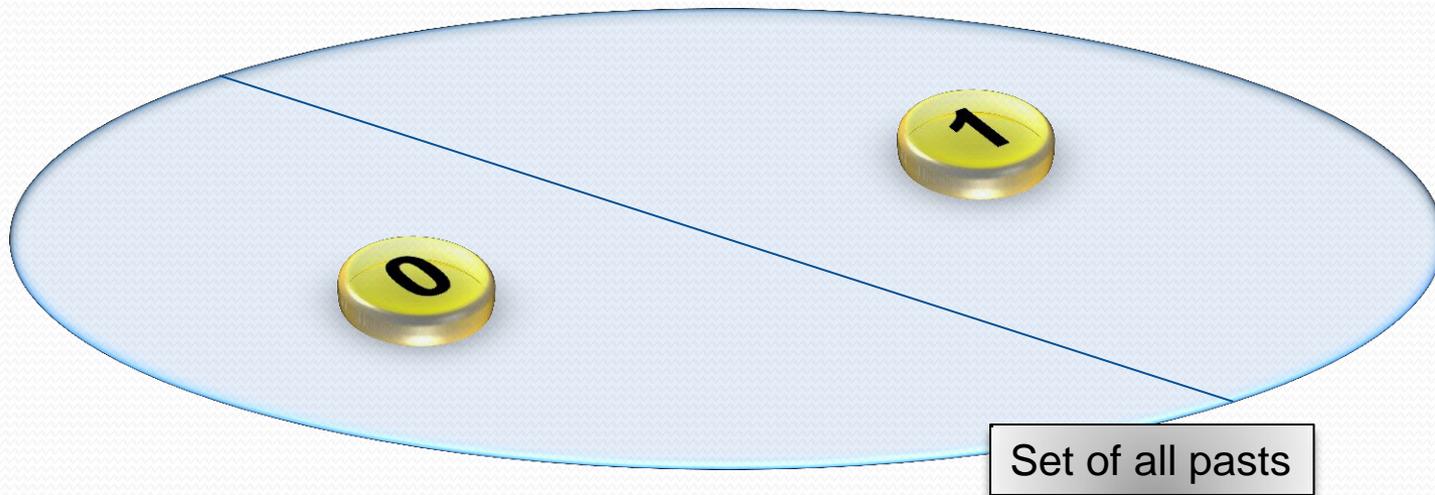


# Example: The Perturbed Coin

Box with coin, perturbed at each time-step such that coin flips with probability  $p$ .



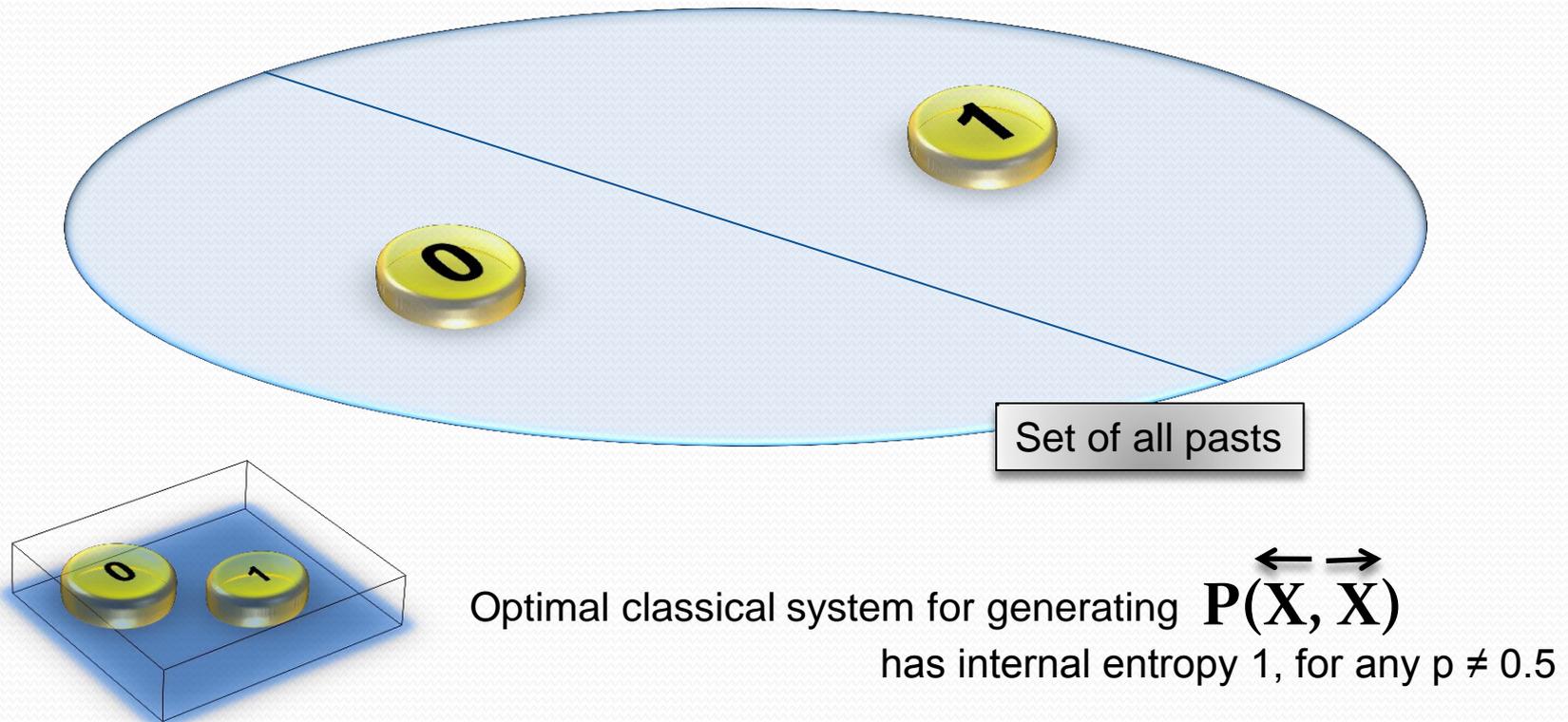
# Example: The Perturbed Coin



$$P(\vec{X} | \text{0}) \neq P(\vec{X} | \text{1})$$

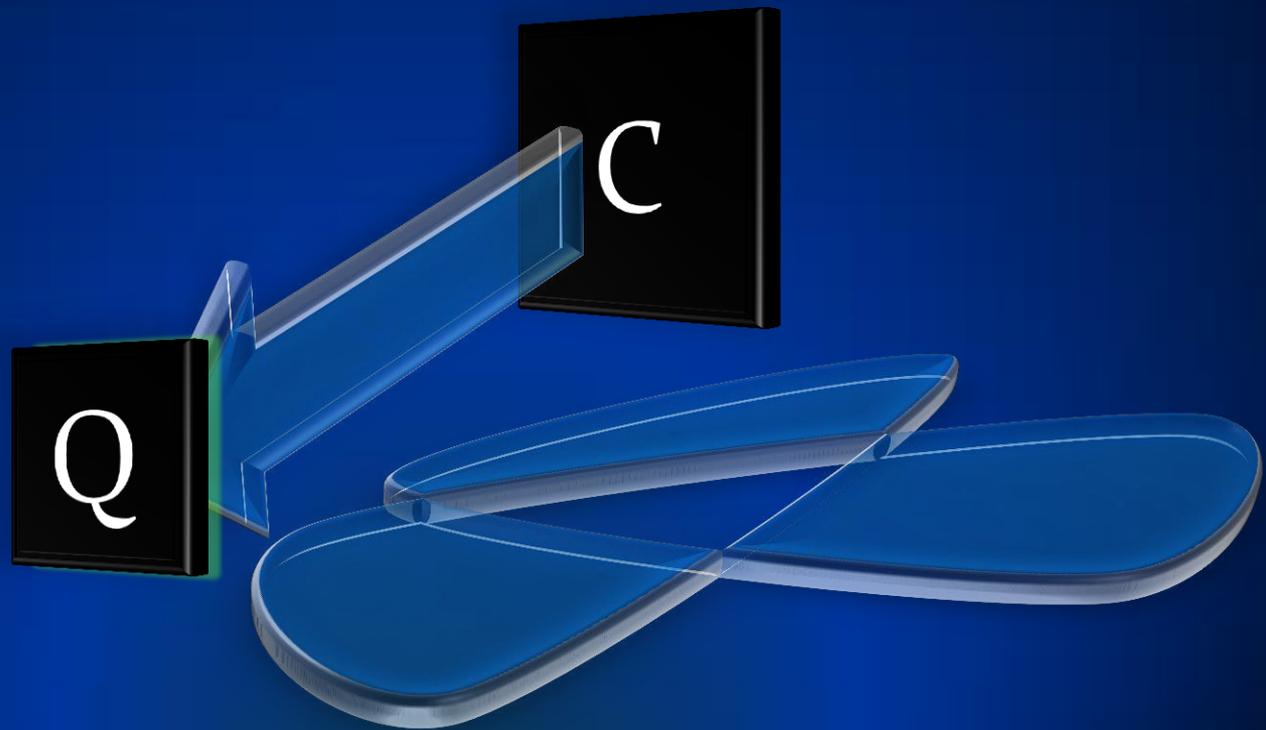
We cannot discard information about the state of the coin.

# Example: The Perturbed Coin



But as  $p \rightarrow 0.5$ , the process tends towards a completely random sequence!

# Can Quantum Logic Provide A Better Description?

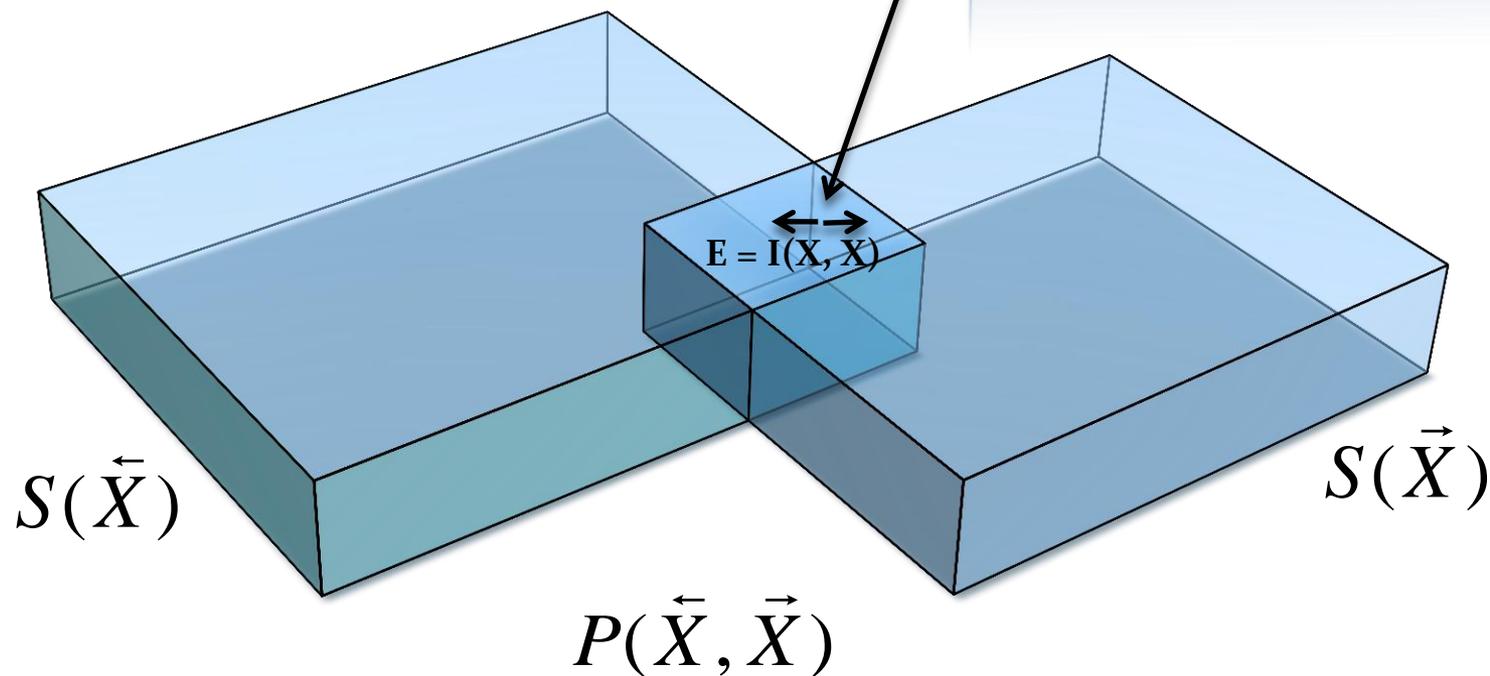


# Can Epsilon Machines be improved?

Knowledge of the past contains

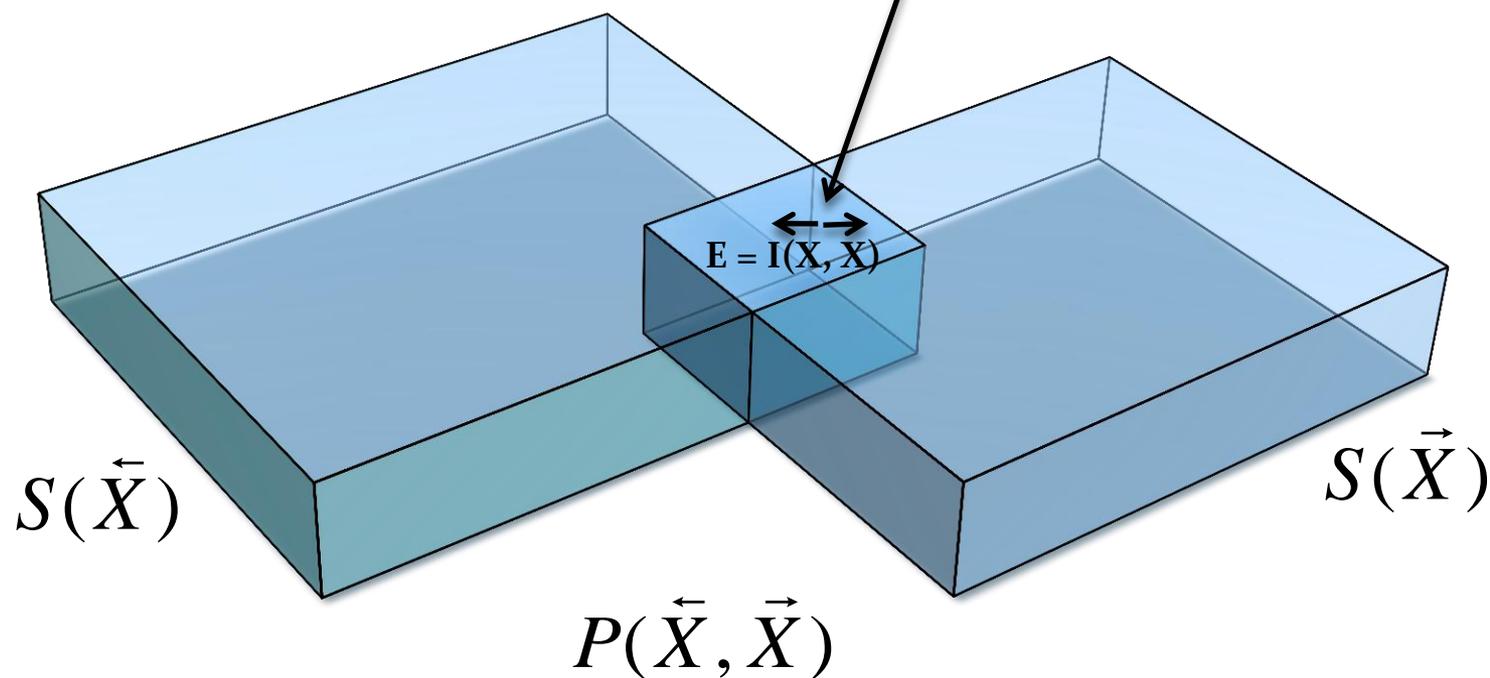
$$S(\vec{X}) - S(\vec{X} | \vec{X}) = I(\vec{X} | \vec{X})$$

bits about the future.



# Can Epsilon Machines be improved?

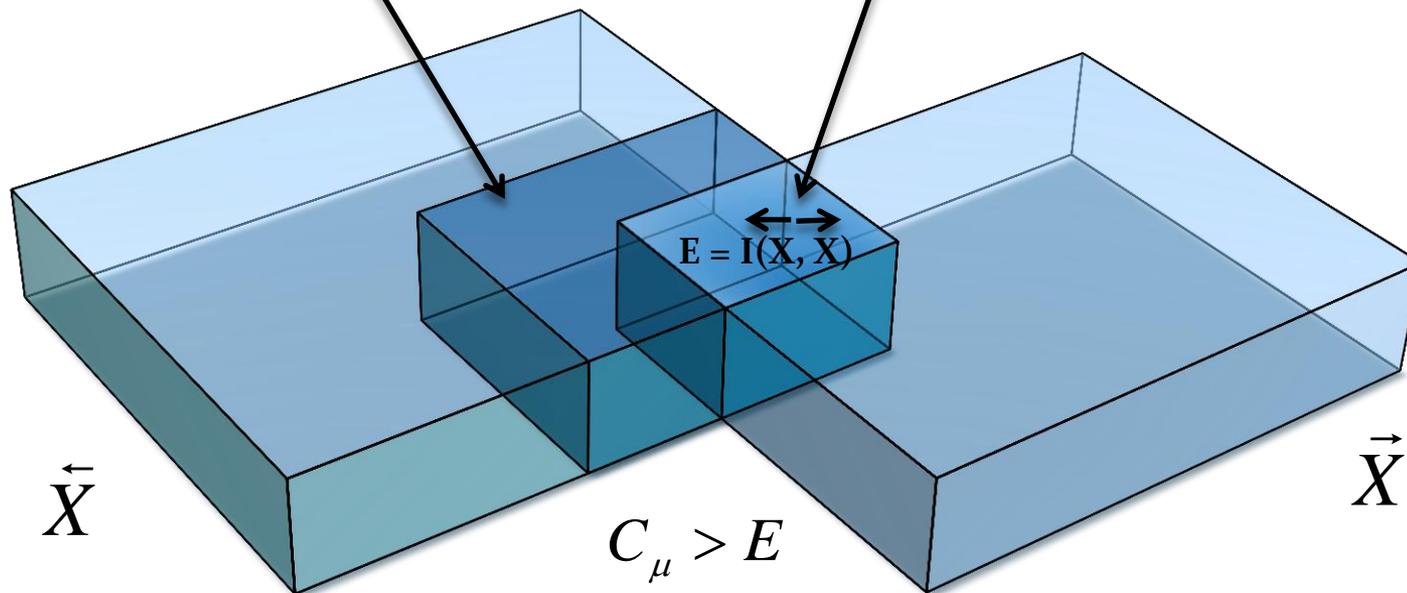
Lower bound on how many bits we must track to fully model a process



# Can Epsilon Machines be improved?

An epsilon machines must store  $C_\mu$  bits to know to retain all information About the future..

Lower bound on how many bits we must track to fully model a process

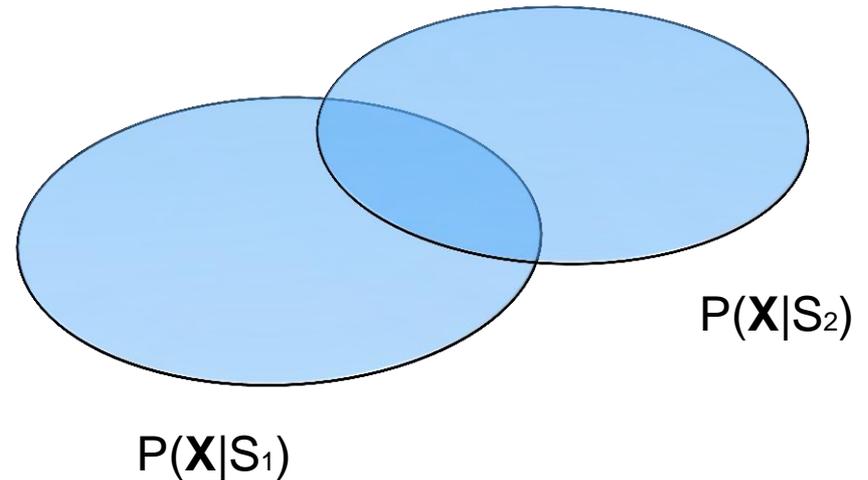
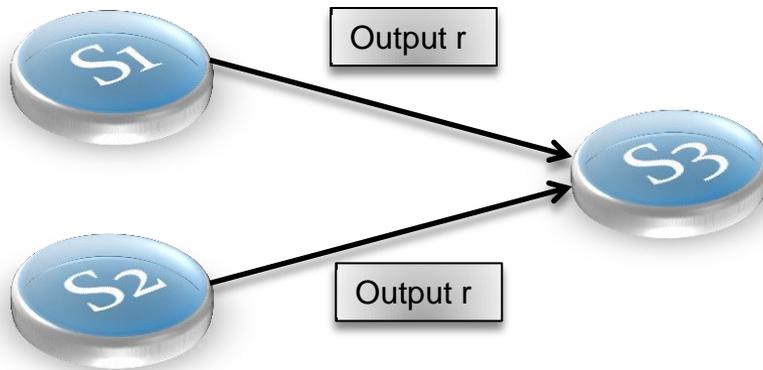


JP Crutchfield, CJ Ellison, "Time's Barbed Arrow." PRL 2009 - APS

**The Optimal Classical Model of a Process still Invokes extraneous causes!**

# The Source of Extraneous Cause

Suppose two differing causal states have finite probability to transition to an coinciding causal state after coinciding output.



The future of the two causal states are not entirely distinct.

A classical epsilon must store a property A that distinguishes  $S_1$  and  $S_2$ . But observation of the entire future does not guarantee the ability to retrieve A.



Some of the storage used to keep track of A is wasted.

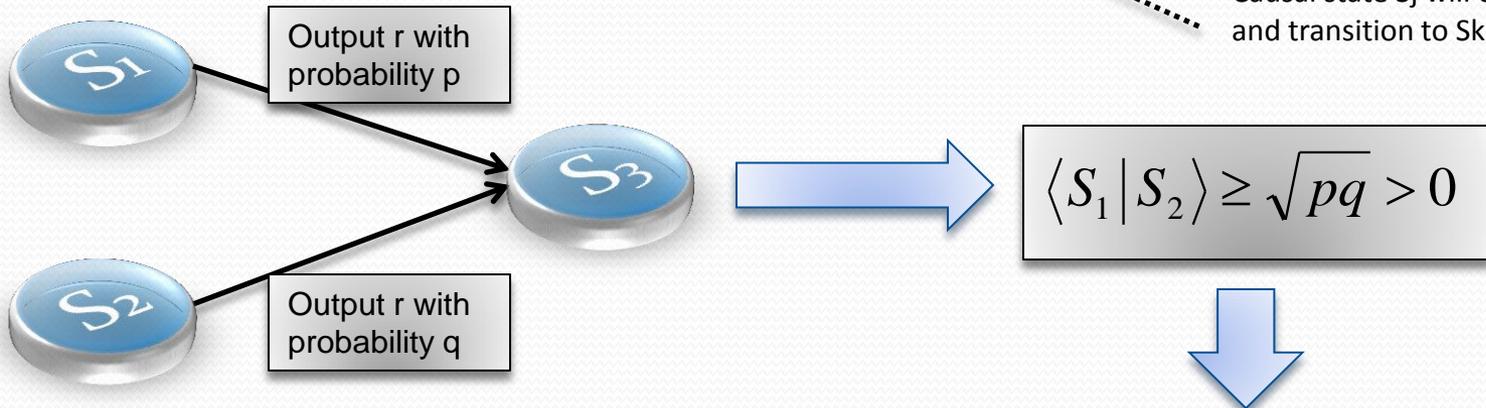
# Quantizing Occam's Razor

A quantum epsilon machines does not distinguish the causal states completely.

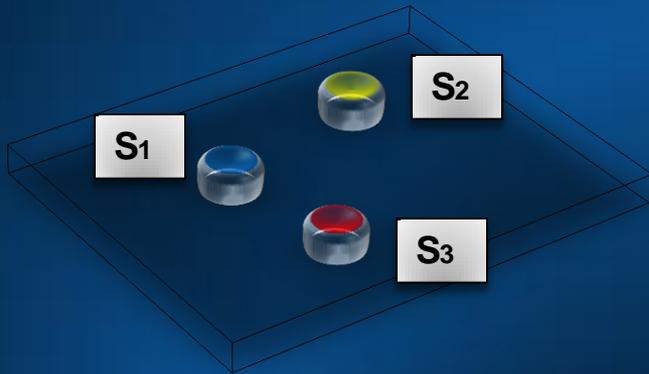
Map each causal state  $S_j$  to a corresponding quantum state

$$|S_j\rangle = \sum_r \sum_k \sqrt{T^r_{j,k}} |r\rangle |k\rangle$$

Probability a Stochastic process in Causal state  $S_j$  will emit output 'r' and transition to  $S_k$



Storage of quantum causal states require less memory than their classical counterpart



Classical models must allocate enough storage to distinguish every causal state



Quantum systems can go beyond this by compressing the information further... distinguishing the causal states only to the degree that they affect the future.



## THEOREM

Provided the best Classical simulator for a stochastic process erases some information, there exists a simpler quantum model

*M. Gu, K. Wiesner, E. Rieper, V. Vedral,  
Nature Communications, 3, 762*



...01110101111



Which Past did I come from?



Classical understanding still requires us to perfectly distinguish *Between 0 and 1!*

# Simplifying with Quantum

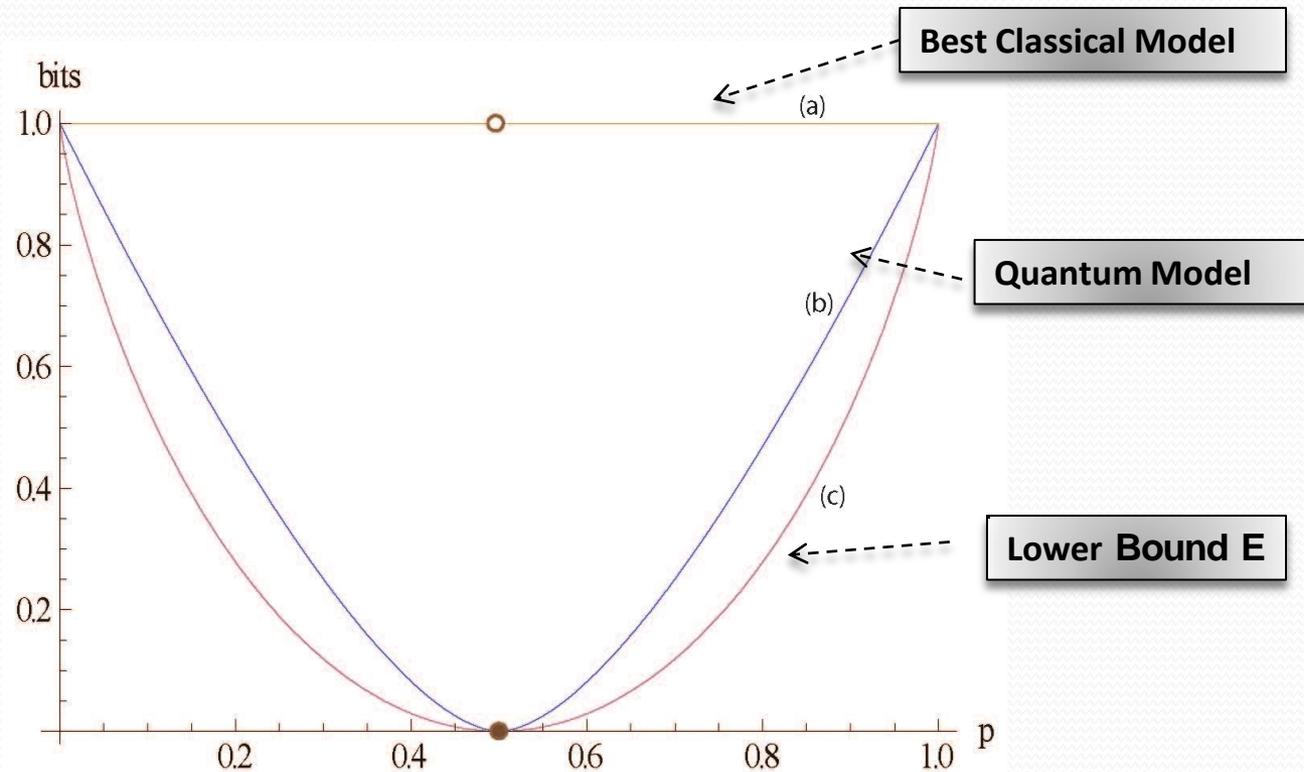
The Quantum Refinement

Encode  as

$$|S_0\rangle = \sqrt{1-p}|0\rangle + \sqrt{p}|1\rangle$$

Encode  as

$$|S_1\rangle = \sqrt{p}|0\rangle + \sqrt{1-p}|1\rangle.$$

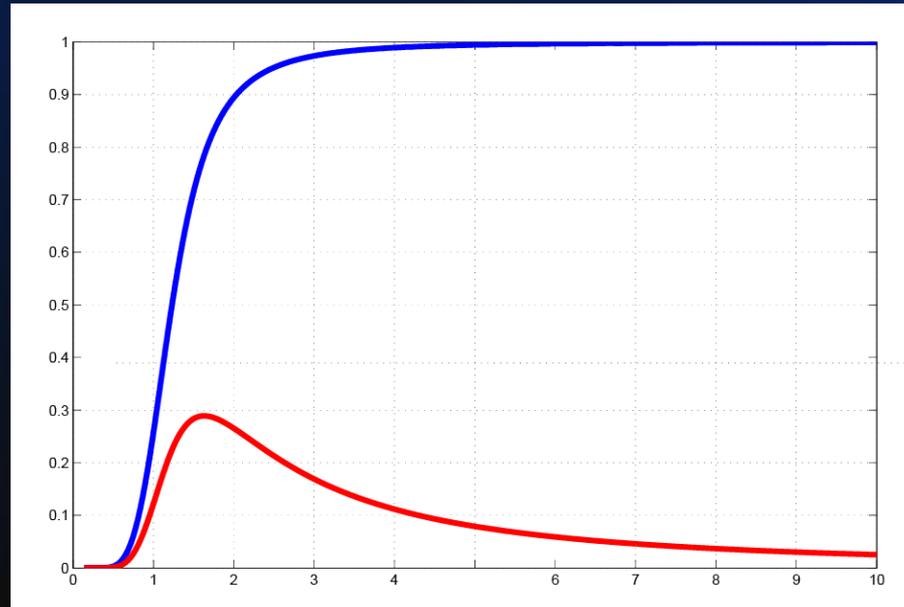


# SPIN CHAIN AT TEMPERATURE T



$$H = -J \sum s_j s_{j+1} - B \sum s_j$$

COMPLEXITY ↑



TEMPERATURE →

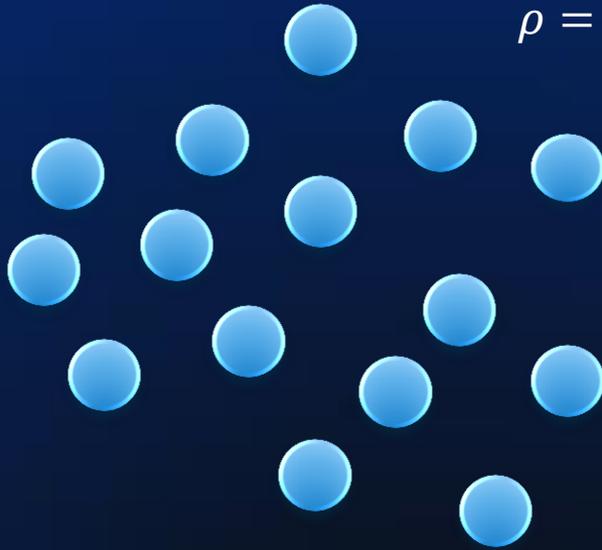


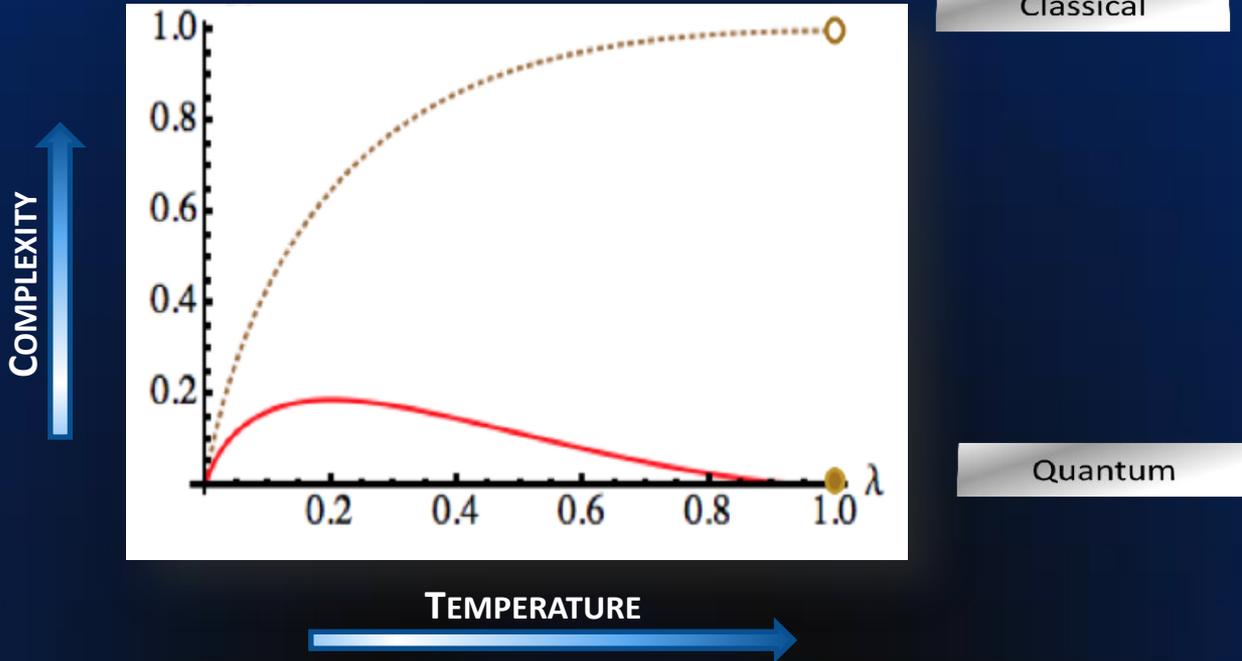
Sun Wei Yeap



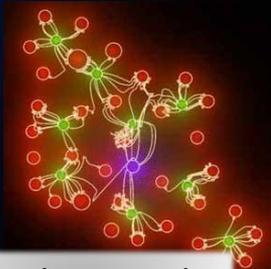
Jayne Thompson

$$\rho = \lambda|0\rangle\langle 0| + (1 - \lambda)|1\rangle\langle 1|$$





# Outlook



Neural Networks

*IEEE Trans. Neural Networks, 10, 2, 284-302*



Dripping Faucets

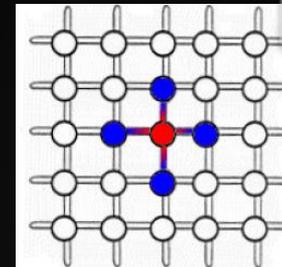
*Physica A: 257, 1-4, 385-389*

What Happens when we allow  
Quantum logic?

Pseudo-random  
Number generators.



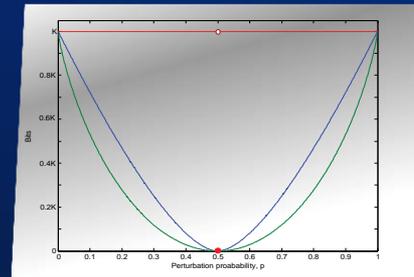
*Physica A: 356, 1, 133-138*



Ising Models

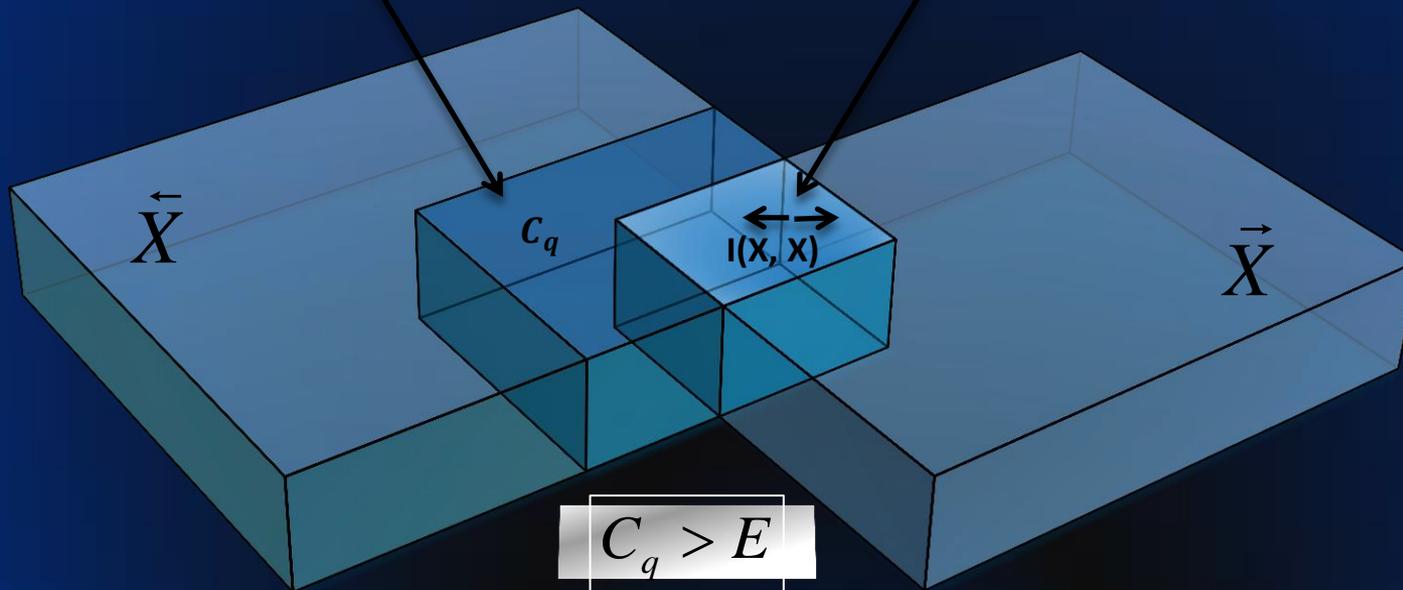
*PRA 238, 4-5, 244-252*

# Mysteries....



Even quantum simulators seem to store unnecessary information

The amount of useful information the past contains about the future.

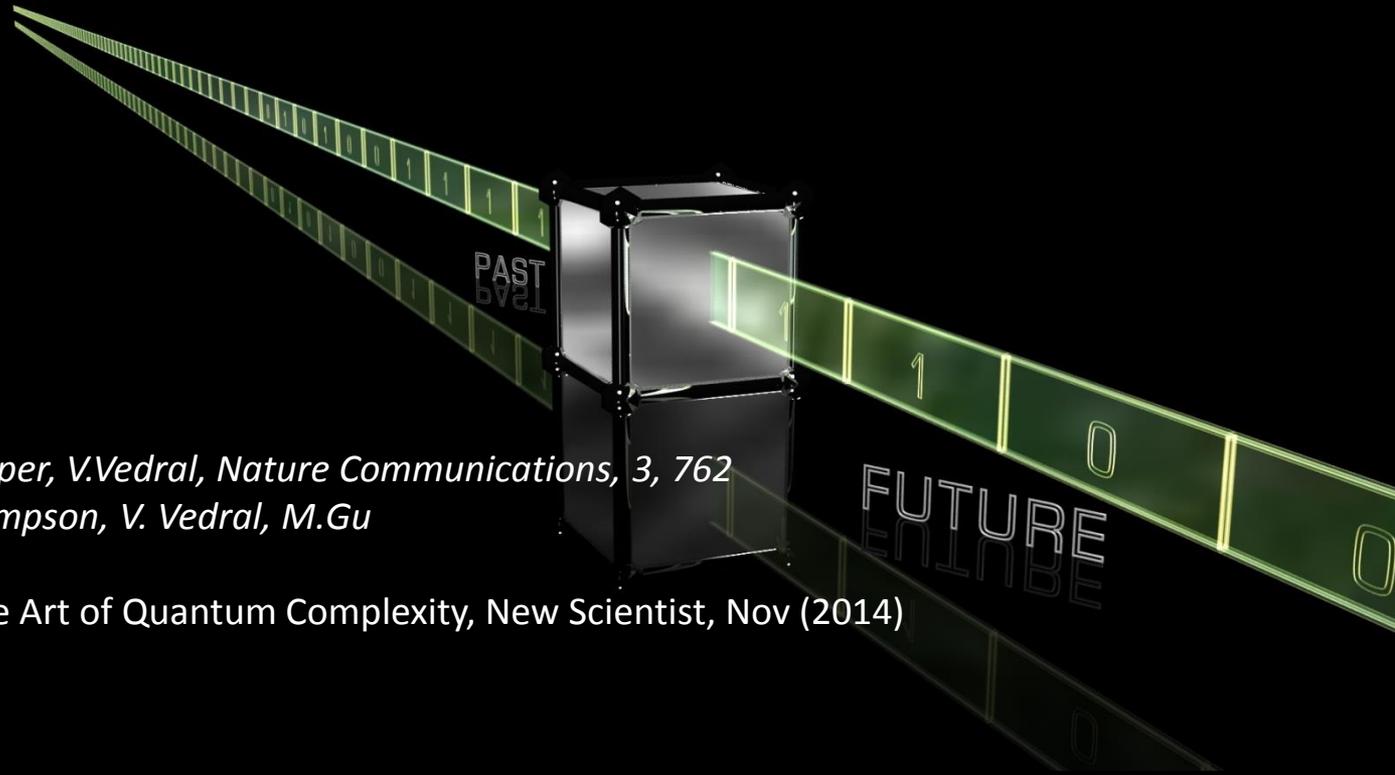


Is this an unavoidable source of irreversibility when constructing quantum simulations?



Can we formulate even more powerful theories of information that surpass quantum mechanics?

# References



## Publications

- *M.Gu, K.Wiesner, E.Rieper, V.Vedral, Nature Communications, 3, 762*
- *R. Tan, D. Terno, J. Thompson, V. Vedral, M.Gu EPJ Plus, 129:191*
- *Gu, Vedral, Zen and the Art of Quantum Complexity, New Scientist, Nov (2014)*

## Public Article on FQXI:

*“If God were to simulate reality, would he prefer it quantum?”*  
<http://fqxi.org/community/forum/topic/1248>