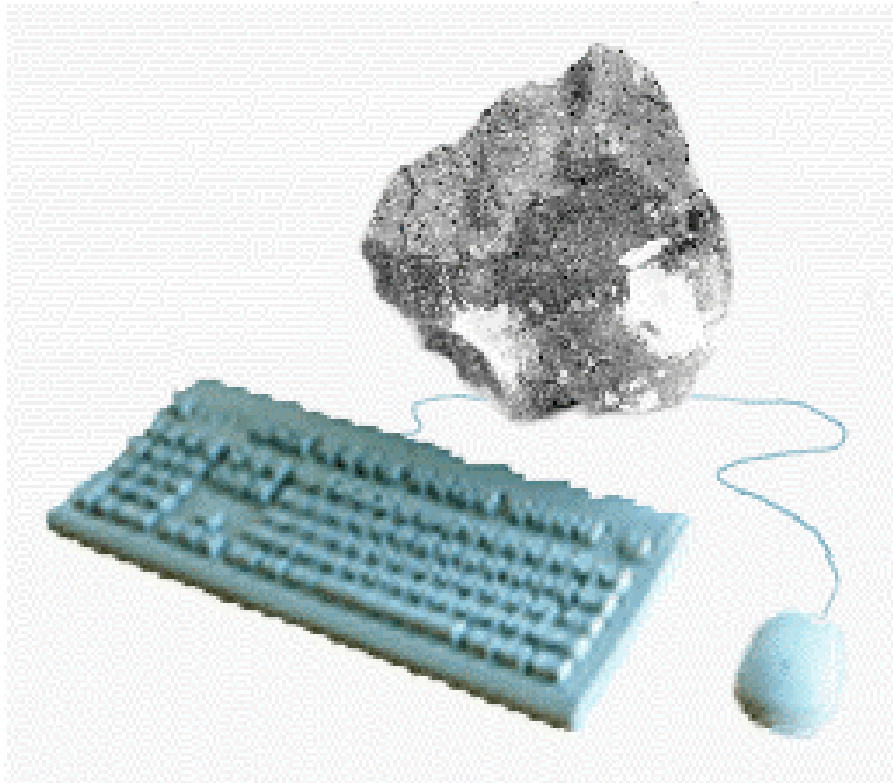




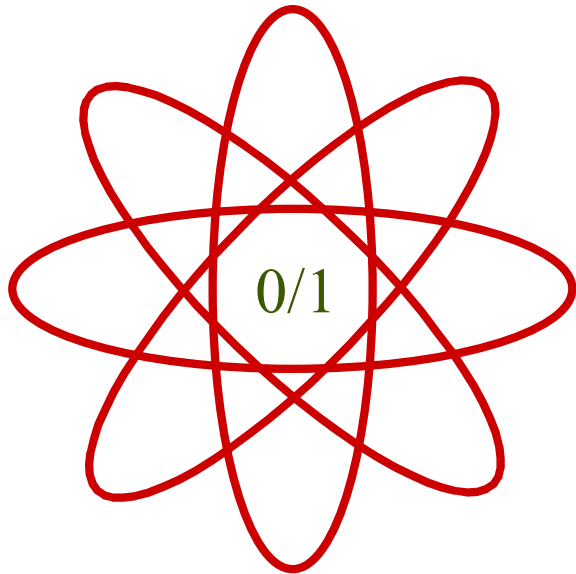
Computing Beyond Silicon Summer School

# Physics becomes the computer



Norm Margolus

# Physics becomes the computer



## *Emulating Physics*

- » *Finite-state, locality, invertibility, and conservation laws*

## *Physical Worlds*

- » *Incorporating comp-universality at small and large scales*

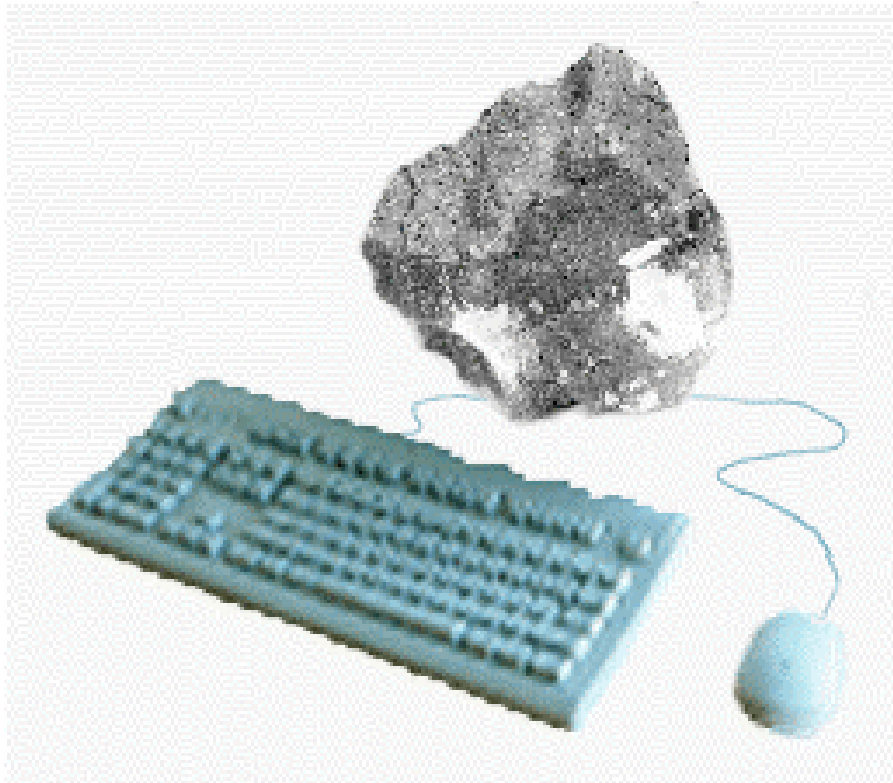
## *Spatial Computers*

- » *Architectures and algorithms for large-scale spatial computations*

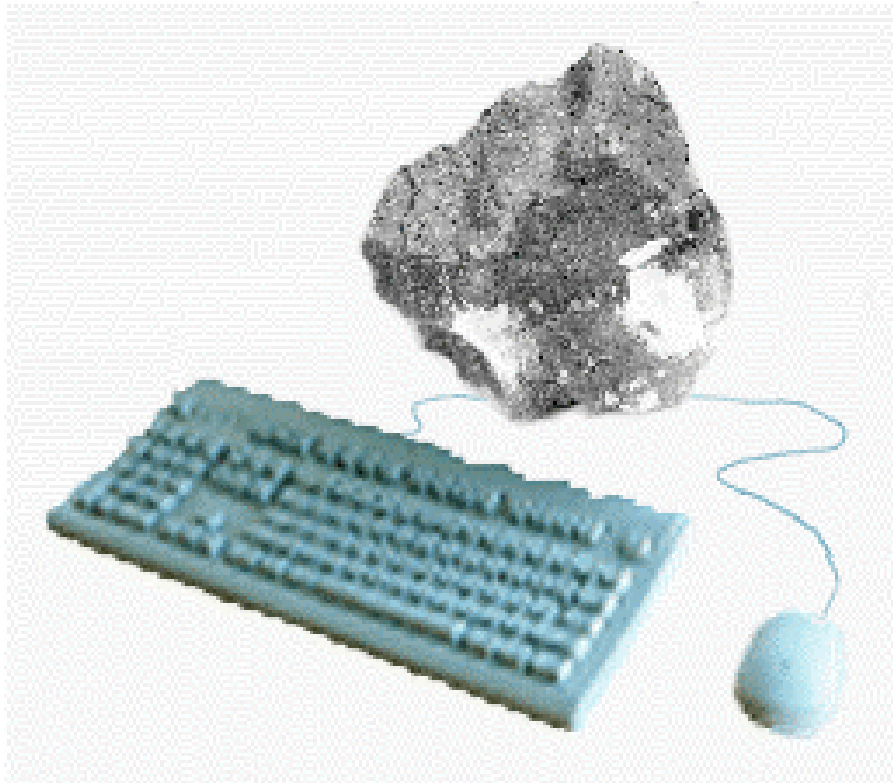
## *Nature as Computer*

- » *Physical concepts enter CS and computer concepts enter Physics*

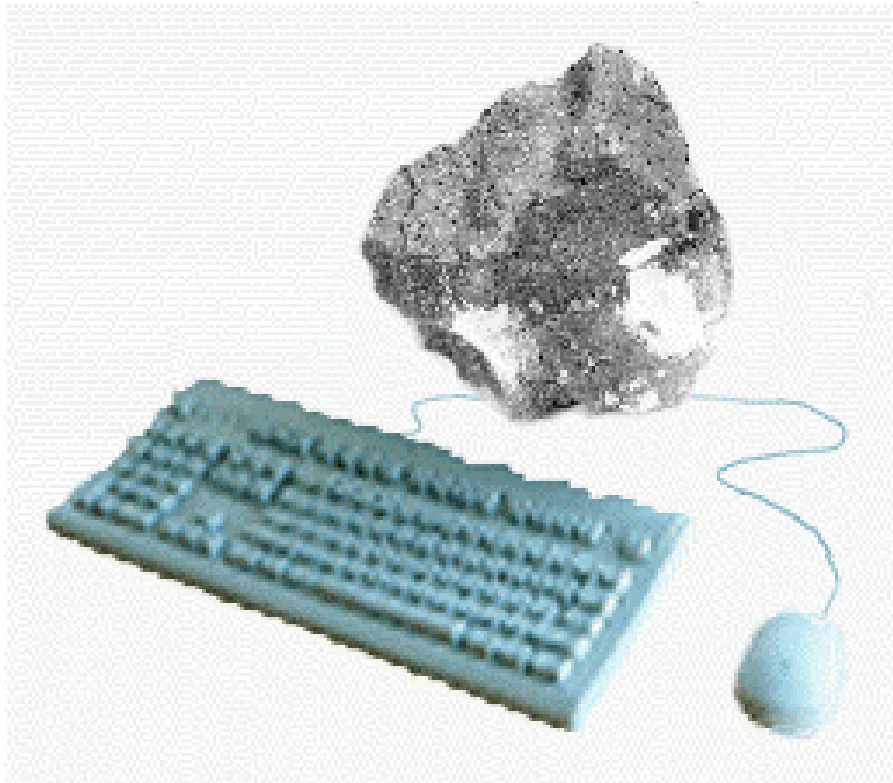
# Looking at nature as a computer



# Looking at computation as physics



# Looking at nature as a computer



# Introduction



As we zoom in on a  
digital image,

# Introduction



As we zoom in on a digital image, we begin to notice that there isn't an infinite amount of resolution:

# Introduction

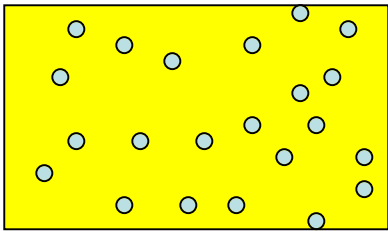


As we zoom in on a digital image, we begin to notice that there isn't an infinite amount of resolution:

*We begin to see the pixels.*

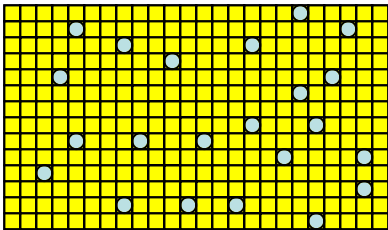
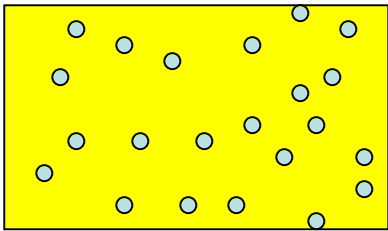


# Introduction



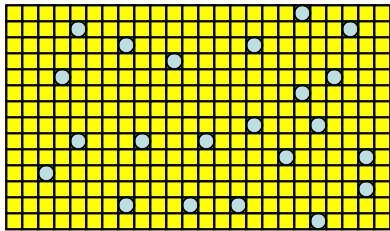
Something similar happens in nature. A box full of particles doesn't have an infinite number of possible configurations:

# Introduction



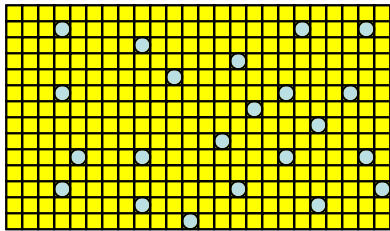
Something similar happens in nature. A box full of particles doesn't have an infinite number of different configurations: *the number of distinct configurations is finite.*

# Introduction



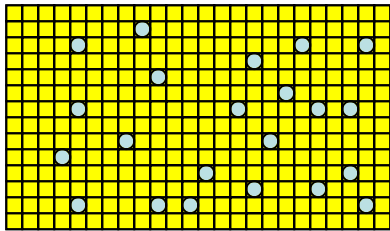
Similarly, the rate at which a finite system can transition from one distinct state to another is also finite.

# Introduction



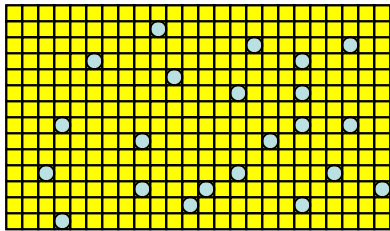
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# Introduction



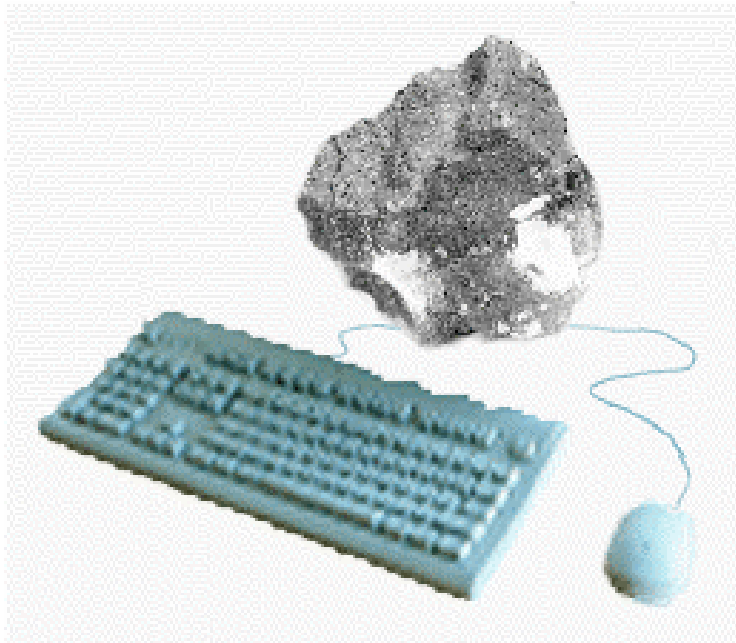
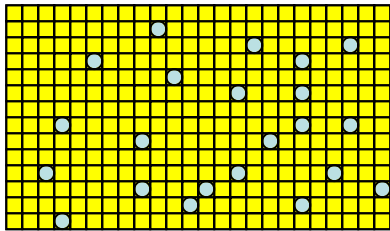
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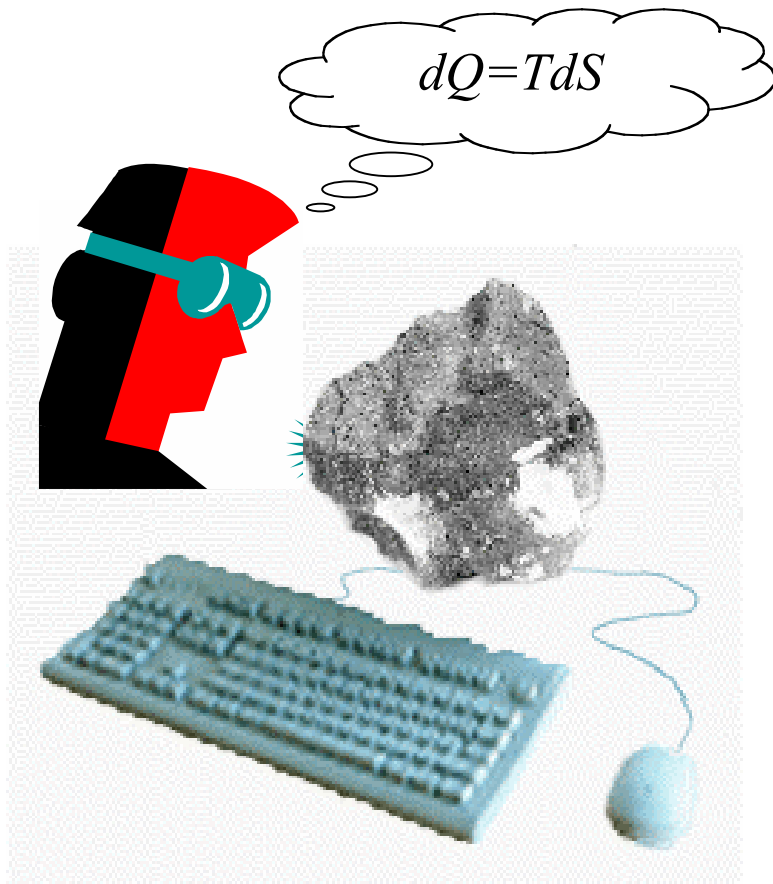
Similarly, the rate at which a finite system can transition from one distinct state to another is also finite.

# Introduction



Similarly, the rate at which a finite system can transition from one distinct state to another is also finite. *Thus a finite physical system is much like a computer.*

# Introduction



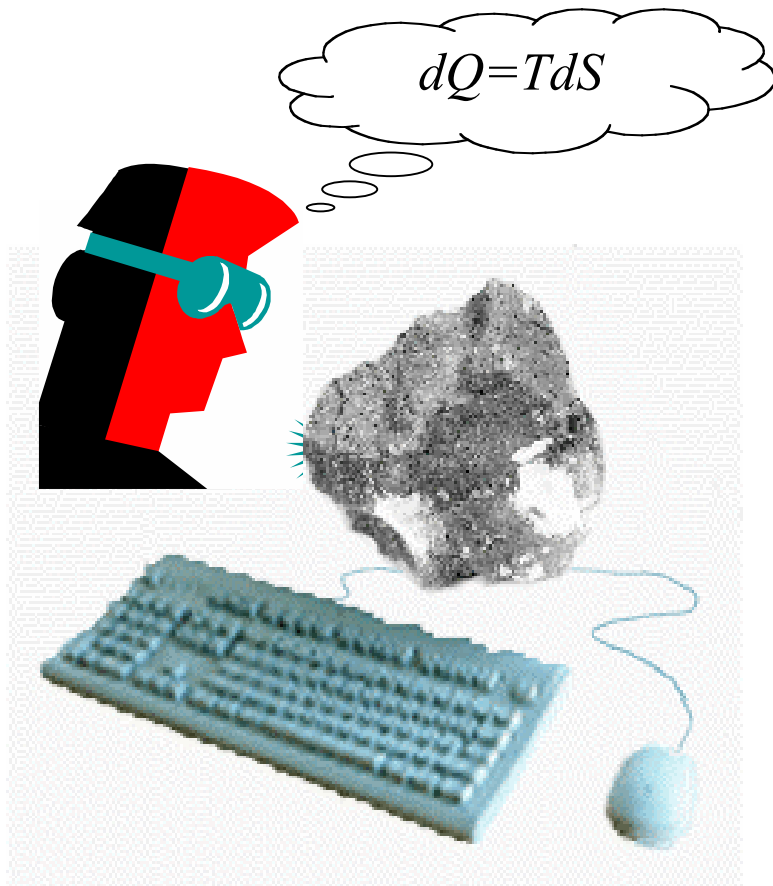
- Physics studies macro properties of finite information systems
- Basic quantities such as Entropy and Energy are informational:

$$\text{Entropy}_{\text{MAX}} = \text{Info}_{\text{MAX}}$$

$$\text{KineticE}_{\text{MAX}} = \text{Ops}_{\text{MAX}}$$



# Introduction



- Physics studies macro properties of finite information systems
- Basic quantities such as Entropy and Energy are informational:

$$Entropy_{MAX} = Info_{MAX}$$

$$KineticE_{MAX} = Ops_{MAX}$$

(1996, with Levitin)

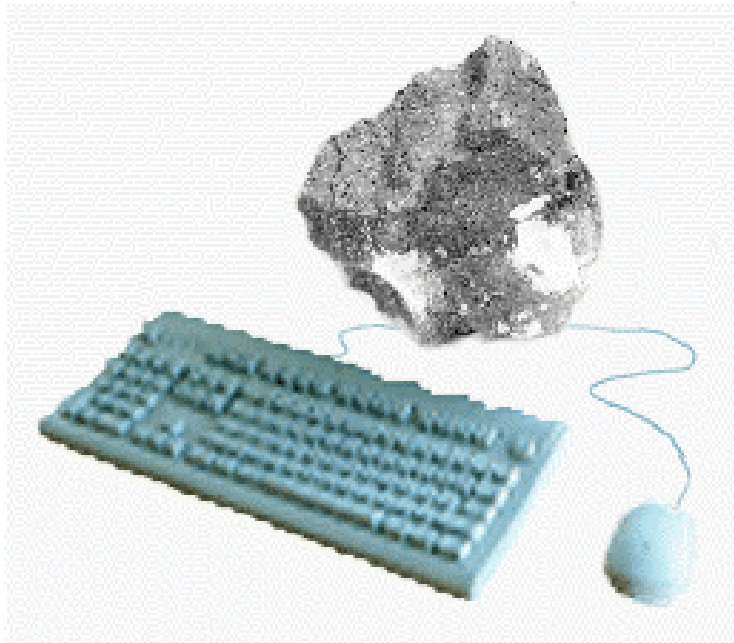
# In this talk...

## *Review:*

- info (Entropy) in physics

## *Discuss:*

- statistical description of computation ( $\rightarrow$  QM)
- energy and action in comp
- what does QM add?
- physics as computation



# What is Info?

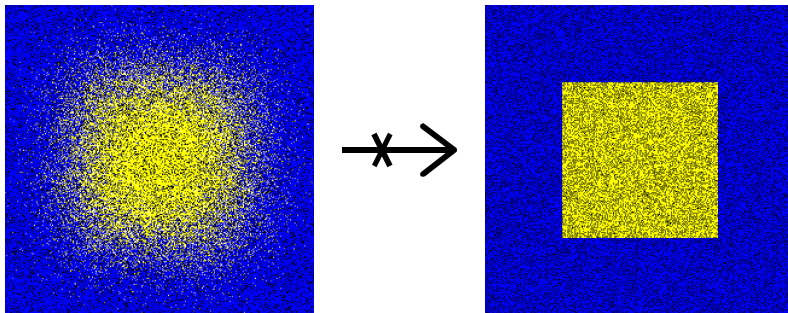
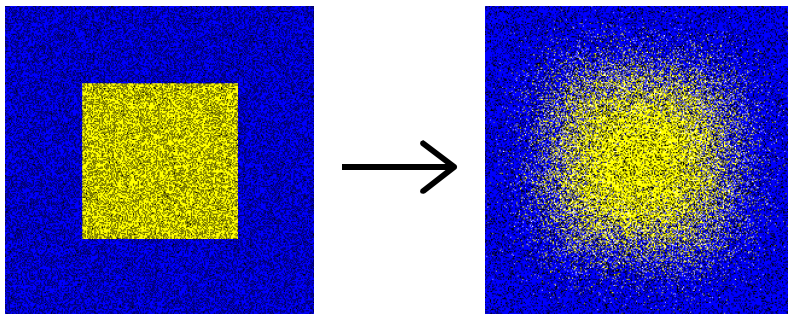
$$\text{Info} = -\sum_i p_i \log p_i$$

%o equally probable states,

$$\begin{aligned}\text{Info} &= -\sum_{i=1}^{\Omega} \frac{1}{\Omega} \log \frac{1}{\Omega} \\ &= \log \Omega\end{aligned}$$

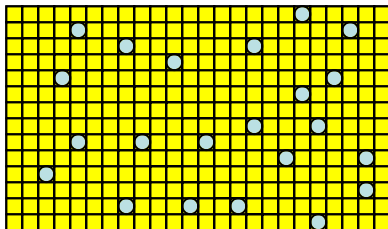
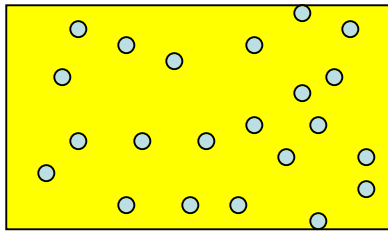
- number of bits system can hold, given its constraints
- system with  $2^n$  possible states can represent  $n$  bits
- focus on classical info:
  - » survives in macro limit
  - » substitute micro dynamics when QM is invisible
  - » ordinary macro quantities have classical info interp

# What is Entropy?



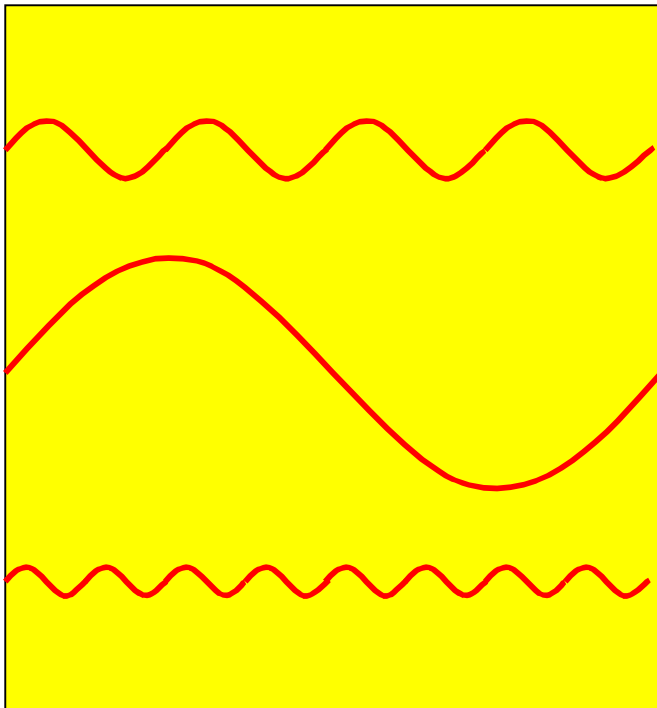
- Formal parameter in thermo (irreversibility)
- Boltzmann and Gibbs understood as counting
- Mixing neat  $\rightarrow$  mess
- Mixing mess  $\rightarrow$  mess
- Entropy is log of #states that fit with constraints

# Classical Entropy



- For particles in a box, can introduce some coarseness
- This allows relative probabilities to be calculated
- (Also do the same thing for momentum)

# Infinite Entropy?

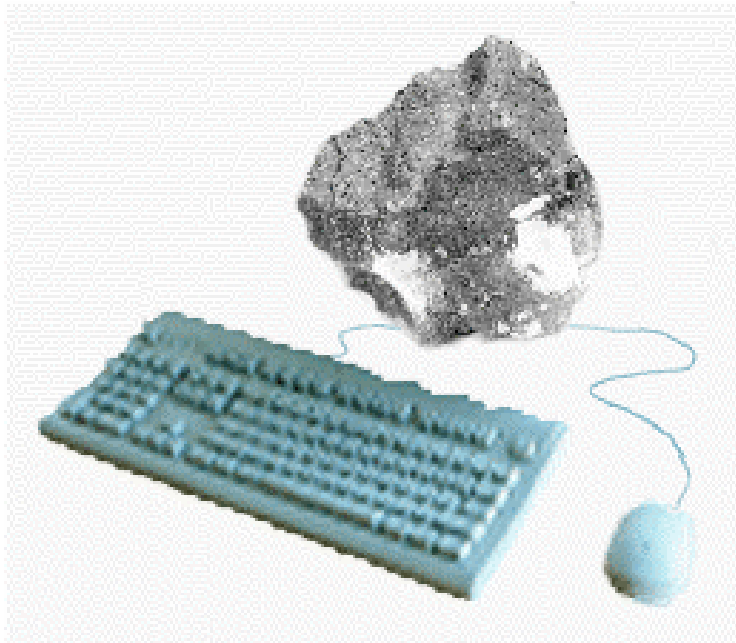


*EM radiation in a cavity  
(periodic boundaries)*

- Thermo of EM radiation in cavity led to QM
- General state is a superposition of waves with integer num peaks
- Any amplitude, can put unit of energy into any wave (*infinite info!*)
- Planck proposed  $E = nh\nu$  (*finite info!*)

# Looking at nature as a computer

- *With QM, every finite system has finite state*
- Dynamics of finite state systems is familiar
- Develop QM from computer viewpoint!
- Begin by discussing computer logic in statistical situations



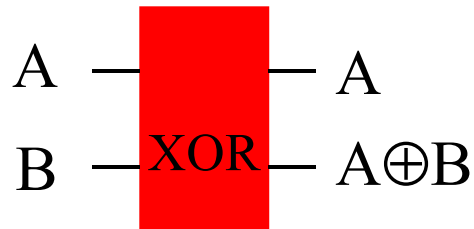
# Looking at computation as physics



- *With QM, every finite system has finite state*
- Dynamics of finite state systems is familiar
- Develop QM from computer viewpoint
- Begin by discussing computer logic in statistical situations



# Statistical Dynamics



$$U_{\text{XOR}}|00\rangle = |00\rangle$$

$$U_{\text{XOR}}|01\rangle = |01\rangle$$

$$U_{\text{XOR}}|10\rangle = |11\rangle$$

$$U_{\text{XOR}}|11\rangle = |10\rangle$$

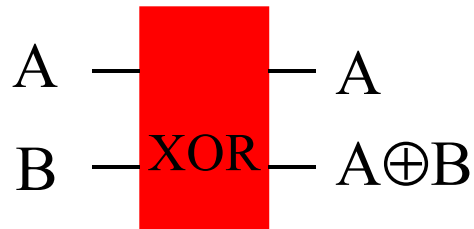
$$a|00\rangle + b|01\rangle + c|10\rangle + d|11\rangle$$

→

$$a|00\rangle + b|01\rangle + c|11\rangle + d|10\rangle$$

- To give a complete dynamics, we say what happens to each state in a fixed time
- Weighted sum of states (*superposition*) describes an *ensemble*
- Probability of initial state applies to corresponding final state

# Statistical Dynamics



$$U_{\text{XOR}}|00\rangle = |00\rangle$$

$$U_{\text{XOR}}|01\rangle = |01\rangle$$

$$U_{\text{XOR}}|10\rangle = |11\rangle$$

$$U_{\text{XOR}}|11\rangle = |10\rangle$$

$$\sqrt{a}|00\rangle + \sqrt{b}|01\rangle + \sqrt{c}|10\rangle + \sqrt{d}|11\rangle$$

→

$$\sqrt{a}|00\rangle + \sqrt{b}|01\rangle + \sqrt{c}|11\rangle + \sqrt{d}|10\rangle$$

- Better to use square roots of probabilities (*amplitudes*)
- Evolution preserves *vector length*
- Lets us analyze system in other bases

# Energy Basis

$$U_\tau : |\mathbf{X}_0\rangle \rightarrow |\mathbf{X}_1\rangle \rightarrow \dots \rightarrow |\mathbf{X}_{N-1}\rangle \rightarrow |\mathbf{X}_0\rangle$$

$$|E_0\rangle = \frac{1}{\sqrt{N}} (|\mathbf{X}_0\rangle + |\mathbf{X}_1\rangle + \dots + |\mathbf{X}_{N-1}\rangle)$$

$$\begin{aligned} U_\tau |E_0\rangle &= \frac{1}{\sqrt{N}} (|\mathbf{X}_1\rangle + |\mathbf{X}_2\rangle + \dots + |\mathbf{X}_0\rangle) \\ &= |E_0\rangle \end{aligned}$$

- Suppose  $U_\tau$  represents one clock period of a reversible computer
- Add together all configs in orbit
- This state has equal prob for any config
- Time evolution leaves this state unchanged!

# Energy Basis

$$A \text{ --- NOT --- } \bar{A}$$

$$U_\tau |0\rangle = |1\rangle, \quad U_\tau |1\rangle = |0\rangle$$

$$|E_0\rangle = \frac{|0\rangle + |1\rangle}{\sqrt{2}}, \quad |E_1\rangle = \frac{|0\rangle - |1\rangle}{\sqrt{2}}$$

$$U_\tau |E_0\rangle = |E_0\rangle, \quad U_\tau |E_1\rangle = -|E_1\rangle$$

- *Example:* suppose computer only has one bit, and  $U_\tau$  just flips it.
- Form new 2-state basis by adding and subtracting configs
- Magnitudes of amplitudes of energy states don't change with time

# Energy Basis

$$U_\tau : |\mathbf{X}_0\rangle \rightarrow |\mathbf{X}_1\rangle \rightarrow \dots \rightarrow |\mathbf{X}_{N-1}\rangle \rightarrow |\mathbf{X}_0\rangle$$

$$|E_n\rangle = \frac{1}{\sqrt{N}} \sum_m e^{2\pi i n m / N} |\mathbf{X}_m\rangle,$$

$$\begin{aligned} U_\tau |E_n\rangle &= \frac{1}{\sqrt{N}} \sum_m e^{2\pi i n m / N} |\mathbf{X}_{m+1}\rangle \\ &= e^{-2\pi i n / N} |E_n\rangle \end{aligned}$$

$$\begin{aligned} \langle E_j | E_k \rangle &= \frac{1}{N} \sum_{m,m'} e^{2\pi i (km - jm') / N} \langle \mathbf{X}_{m'} | \mathbf{X}_m \rangle \\ &= \frac{1}{N} \sum_m e^{2\pi i m (k-j) / N} = \delta_{j,k} \end{aligned}$$

- *In general:* use complex amplitudes to form new orthogonal basis
- $|a\rangle$  is like a column vector of components
- $\langle a|$  is like a row vector of complex conjugates

# Energy Basis

$$U_\tau : |\mathbf{X}_0\rangle \rightarrow |\mathbf{X}_1\rangle \rightarrow \dots \rightarrow |\mathbf{X}_{N-1}\rangle \rightarrow |\mathbf{X}_0\rangle$$

$$|E_n\rangle = \frac{1}{\sqrt{N}} \sum_m e^{2\pi i n m / N} |\mathbf{X}_m\rangle,$$

$$|\mathbf{X}_m\rangle = \frac{1}{\sqrt{N}} \sum_n e^{-2\pi i n m / N} |E_n\rangle.$$

$$\begin{aligned} U_\tau |E_n\rangle &= \frac{1}{\sqrt{N}} \sum_m e^{2\pi i n m / N} |\mathbf{X}_{m+1}\rangle \\ &= e^{-2\pi i n / N} |E_n\rangle \end{aligned}$$

*For a cycle:*

$$2\pi = 2\pi \frac{n}{N} \times \frac{\tau_n}{\tau}$$

- Energy basis is Fourier Transform of config basis
- $|E_n\rangle$  cycles with a frequency of  $\nu_n = \nu(n/N)$ , where  $\nu = 1/\tau$
- We will call  $h\nu_n$  the Energy of the state  $|E_n\rangle$ , i.e.  $E_n = h\nu_n$

# Energy Basis

$$|E_n\rangle = \frac{1}{\sqrt{N}} \sum_m e^{2\pi i n m / N} |X_m\rangle,$$

$$|X_m\rangle = \frac{1}{\sqrt{N}} \sum_n e^{-2\pi i n m / N} |E_n\rangle.$$

e.g.,  $|\Psi_0\rangle = \alpha |E_j\rangle + \beta |E_k\rangle,$

$$|\Psi_\tau\rangle = \alpha e^{-2\pi i j / N} |E_j\rangle + \beta e^{-2\pi i k / N} |E_k\rangle$$

$$E = |\alpha|^2 E_j + |\beta|^2 E_k$$

For  $|X_m\rangle$ , energies are

$$0, \frac{h\nu}{N}, 2\frac{h\nu}{N}, 3\frac{h\nu}{N}, \dots, (N-1)\frac{h\nu}{N}$$

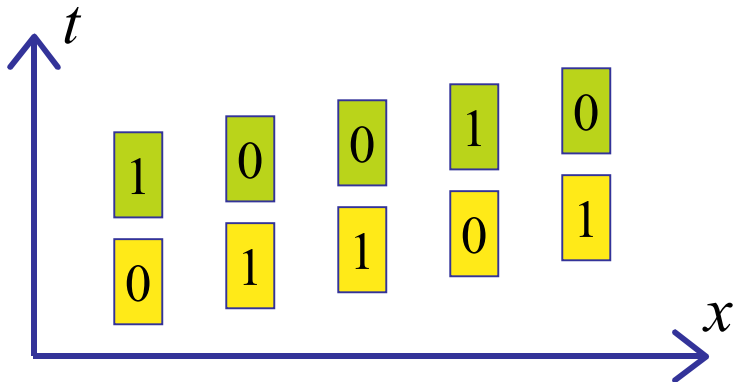
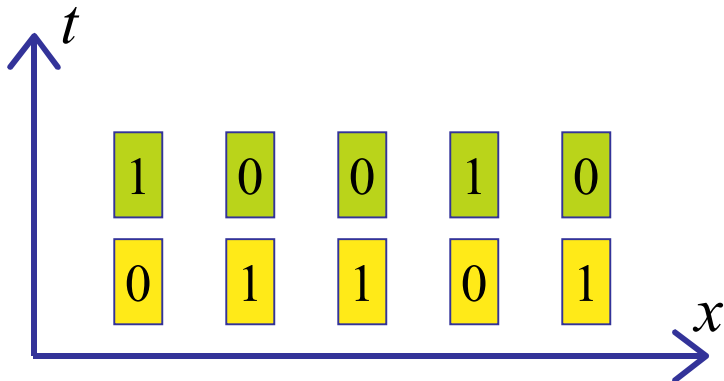
so  $E = \frac{h\nu}{2}$

$$U_\tau : |X_0\rangle \rightarrow |X_1\rangle \rightarrow \dots \rightarrow |X_{N-1}\rangle \rightarrow |X_0\rangle$$

- Interpret coefficients in energy basis as probs
- Energy of any state is independent of time
- $|X_n\rangle$  is composed of equally spaced energies,  $E_n = n h \nu_1$
- $E = h\nu/2$ , or  $\nu = 2E/h$

# What is Energy?

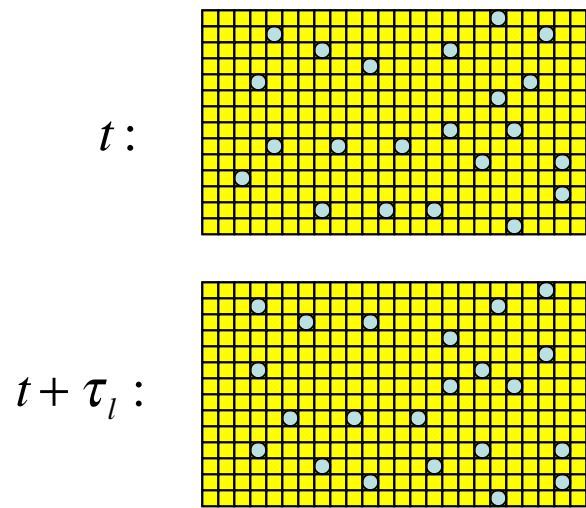
$$U_\tau : |\mathbf{X}_0\rangle \rightarrow |\mathbf{X}_1\rangle \rightarrow \dots \rightarrow |\mathbf{X}_{N-1}\rangle \rightarrow |\mathbf{X}_0\rangle$$



- $v=2E/h$ , so *energy* is rate of change of configurations
- CA lattice can change one spot at a time for reversible rules
- Should count changes as *bit changes* (i.e., energy is extensive!)



# What is Energy?



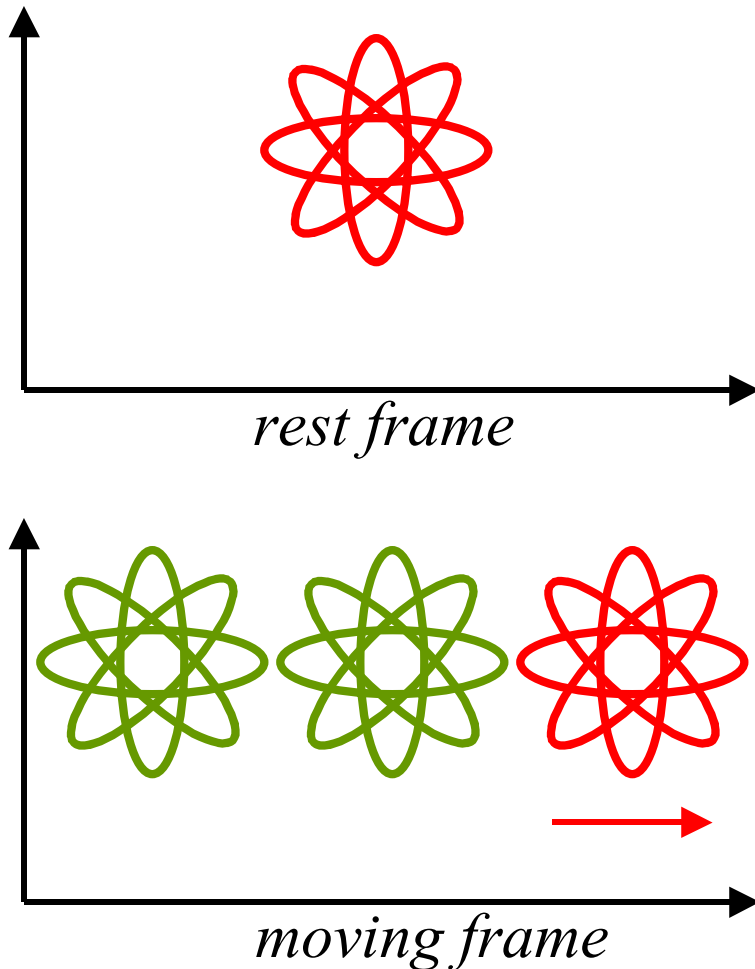
$M = \text{num particles}$

$h\nu_l = \text{particle energy}$

$\nu_\Delta = 2M\nu_l = 2E/h$

- *Conservation Law:*  
number of ones constant
- Constrains number of spots that can change in lattice update period  $\tau_l$
- Focus on energy of the spots that can change
- If each particle is assigned an energy  $h\nu_l$   
max change is still  $2E/h$

# What is Action?



- $v=2E/h$ , so  $\Omega(t)=2Et/h$
- *Action* is amount of evolution (total ops for ideal computation)
- Number of comp events in rest frame is rel scalar
- Comp energy must transform like rel energy:  
 $2E_r t_r/h = 2(Et - px)/h$
- If  $x/t=c$ , then  $E=cp$  so that  $Et=px$  (comp stops)

# What does QM add?

$$A \text{ --- } \boxed{\sqrt{\text{NOT}}} \text{ --- } A$$

$$U_{\sqrt{\text{NOT}}} |0\rangle = \frac{1}{\sqrt{2}} |0\rangle - \frac{1}{\sqrt{2}} |1\rangle$$

$$U_{\sqrt{\text{NOT}}} |1\rangle = \frac{1}{\sqrt{2}} |0\rangle + \frac{1}{\sqrt{2}} |1\rangle$$

$$A \text{ --- } \boxed{\sqrt{\text{NOT}}} \text{ --- } \boxed{\sqrt{\text{NOT}}} \text{ --- } \bar{A}$$

$$U_{\sqrt{\text{NOT}}} U_{\sqrt{\text{NOT}}} |0\rangle =$$

$$U_{\sqrt{\text{NOT}}} \left( \frac{1}{\sqrt{2}} |0\rangle - \frac{1}{\sqrt{2}} |1\rangle \right) = -|1\rangle$$

$$U_{\sqrt{\text{NOT}}} U_{\sqrt{\text{NOT}}} |1\rangle =$$

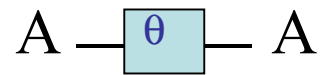
$$U_{\sqrt{\text{NOT}}} \left( \frac{1}{\sqrt{2}} |0\rangle + \frac{1}{\sqrt{2}} |1\rangle \right) = +|0\rangle$$

- Stat Comp is special case: QM allows some new kinds of operations
- *Any invertible evolution which preserves vector length is okay*
- Probabilities can *come and go!*
- Only need to add extra single-bit operations
- $v_{\Delta} = 2(E - E_{\min})/\hbar$

# XOR + $\sqrt[4]{\text{NOT}}$ are universal!

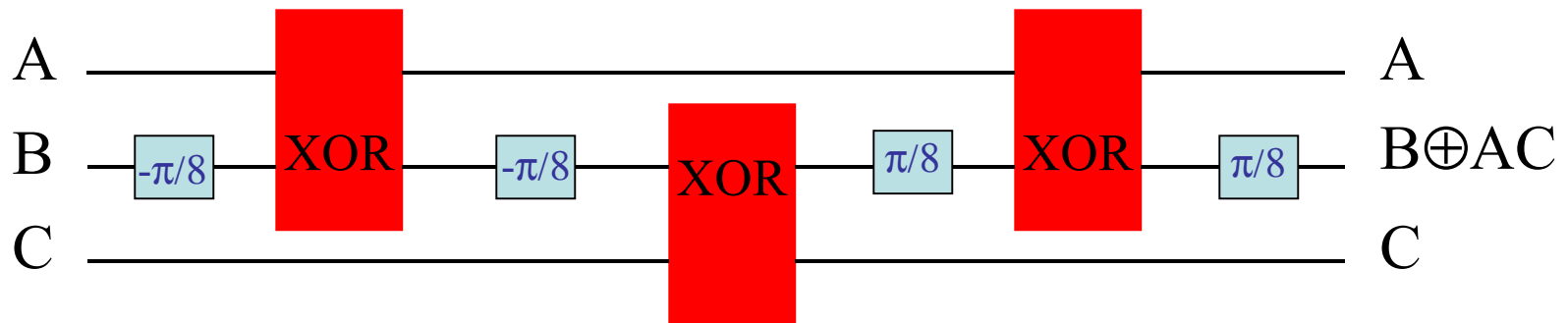
$$U_\theta|0\rangle = \cos\theta|0\rangle - \sin\theta|1\rangle$$

$$U_\theta|1\rangle = \sin\theta|0\rangle + \cos\theta|1\rangle$$



$$\theta = \pi/2: U_\theta = U_{\text{NOT}}$$

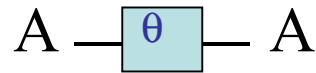
$$\theta = \pi/4: U_\theta = U_{\sqrt{\text{NOT}}}$$



# XOR + $\sqrt[4]{\text{NOT}}$ are universal!

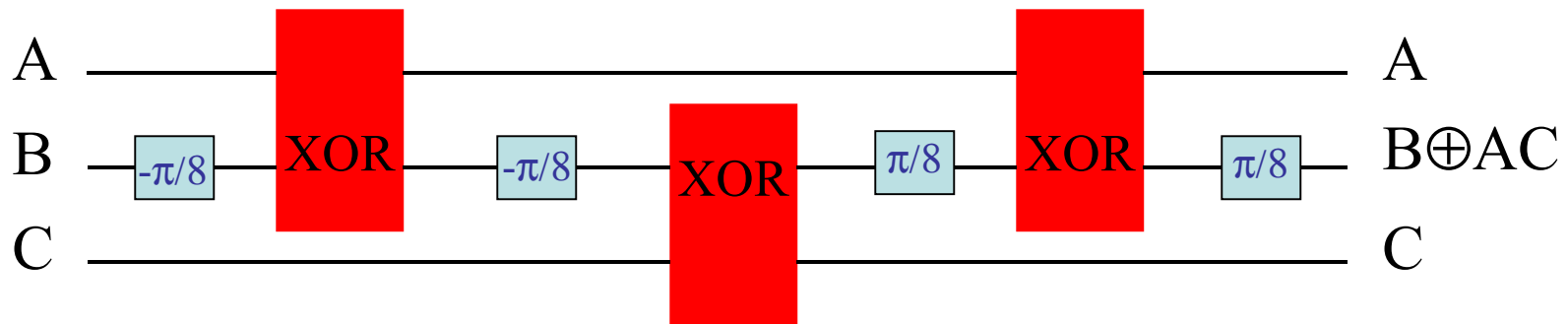
$$U_\theta|0\rangle = \cos\theta|0\rangle - \sin\theta|1\rangle$$

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$$\theta = \pi/2: U_\theta = U_{\text{NOT}}$$

$$\theta = \pi/4: U_\theta = U_{\sqrt{\text{NOT}}}$$



No  
prob-  
abilities

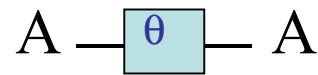
Superposition of different  
configurations

No  
prob-  
abilities

# XOR + $\sqrt[4]{\text{NOT}}$ are universal!

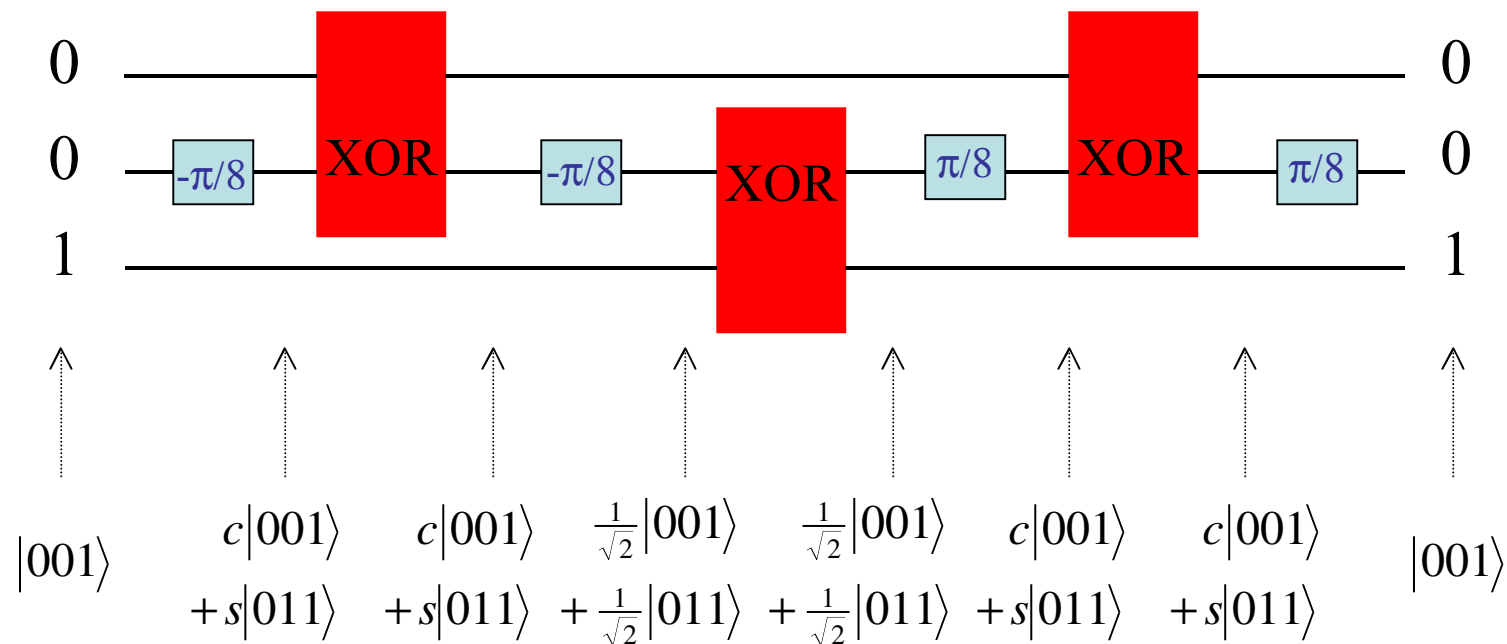
$$U_\theta|0\rangle = \cos\theta|0\rangle - \sin\theta|1\rangle$$

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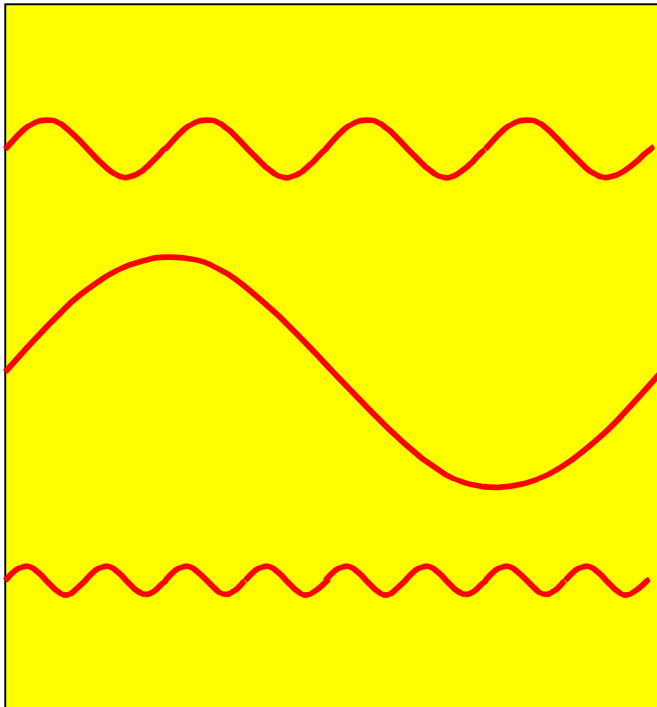


$$c = \cos(\pi/8)$$

$$s = \sin(\pi/8)$$



# What does QM add?



- No *new kinds* of computations; at most *reduces effort required*
- Distinction is basis dependent
- Fundamental Q: If speedup is exponential, then distinction is real!

# What does this mean?

**Classical:**  $\sqrt{a}|0\rangle + \sqrt{b}|1\rangle \xrightarrow{\text{NOT}} \sqrt{b}|0\rangle - \sqrt{a}|1\rangle$

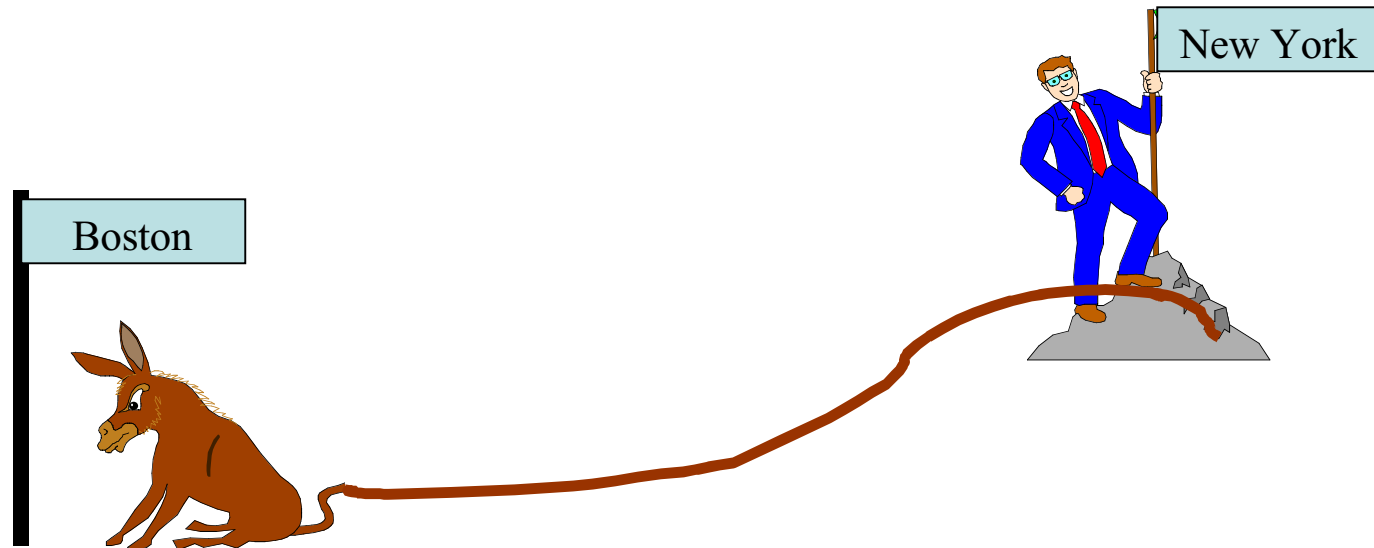
**Quantum:**  $\sqrt{a}|0\rangle + \sqrt{b}|1\rangle \xrightarrow{\sqrt{\text{NOT}}} \frac{\sqrt{a} + \sqrt{b}}{\sqrt{2}}|0\rangle + \frac{\sqrt{a} - \sqrt{b}}{\sqrt{2}}|1\rangle$



# What does this mean?

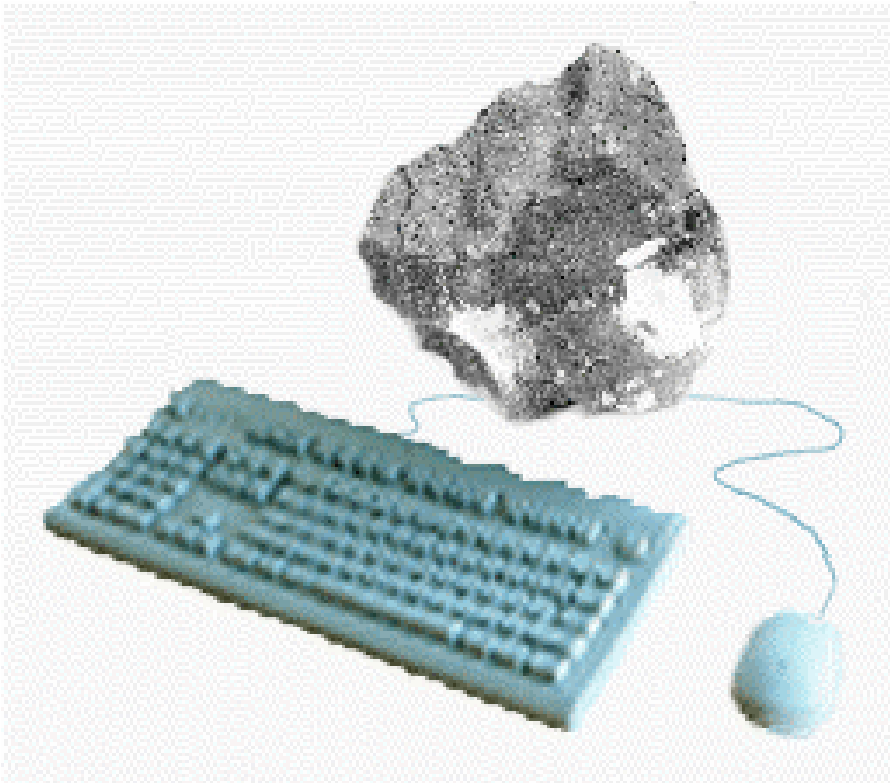
**Classical:**  $\sqrt{a}|0\rangle + \sqrt{b}|1\rangle \xrightarrow{\text{NOT}} \sqrt{b}|0\rangle - \sqrt{a}|1\rangle$

**Quantum:**  $\sqrt{a}|0\rangle + \sqrt{b}|1\rangle \xrightarrow{\sqrt{\text{NOT}}} \frac{\sqrt{a} + \sqrt{b}}{\sqrt{2}}|0\rangle + \frac{\sqrt{a} - \sqrt{b}}{\sqrt{2}}|1\rangle$



# Conclusions

- On a large scale, often can't tell if micro finite-state is QM or CM
- *Entropy, Energy* and *Action* all have comp meaning: others must
- Significant for comp and for physics



for more information, see <http://www.ai.mit.edu/people/nhm/looking-at-nature.pdf>