

Does Analog Computation Exist?

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“Operating ICT basic switches below the Landauer limit”

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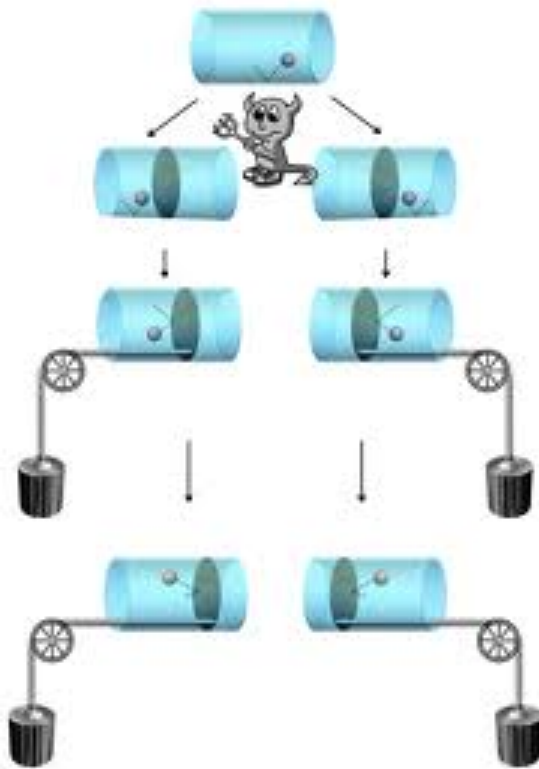
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Landauer's Principle

- Landauer principle: **information is physical**
 - information theory
 - thermodynamics (second law)
- Relevant for the engineering of devices used to process information:
Landauer principle = **fundamental bound** on energy dissipation ⇒
energy consumption of a device is:
Landauer bound + how good we are in engineering devices
~~Landauer bound + how good we are in engineering devices?~~
(at least in principle)

Szilard engine

- One-particle gas in a partitioned box (Szilard 1929)



Initial probability $\frac{1}{2}$ of the atom being on either side of the barrier

The demon performs a measure to determine the position of the particle (no heat production):
information is gained

The piston is moved to one side or the other:
extract work $W = kT \ln 2$ that can be used to lift a weight

Apparent violation of the II law



Resolution of the puzzle:

forgetting is costly !

(Landauer 1961)



- Szilard engine: the Demon has a single memory register (0,1), initially 0; after measure it represents the location of the particle, 0 or 1
- To complete the cycle the memory of the Demon must be erased **(information lost)**
- Landauer principle: erasure of information requires a **minimum heat production**: $\langle Q \rangle \geq \langle Q_{\text{Landauer}} \rangle = kT \ln 2$ per bit \Rightarrow the conversion of $kT \ln 2$ work into heat compensates the work extracted!
- **Information is physical**

- information is physical \Rightarrow system with $i = 1 \dots M$ possible states
initial state: systems can be in any one of the possible states with

probability p_i : $S_S = - \sum_{i \in M} p_i \ln p_i$

final state: system is in a specific state with probability 1, $S_S = 0$

variation of **Shannon entropy**

$\Delta S_S = \sum_{i \in M} p_i \ln p_i \equiv$ **Boltzmann (thermodynamic) entropy** ($k=1$)

since information can only be processed by physical systems
(computers)

- $-\Delta S \geq k \ln 2$ per bit for perfect erasure, what happens if we admit errors?

p = error probability $0 \leq p \leq \frac{1}{2}$

Landauer bound: $-\Delta S/k \geq \ln 2 + p \ln p + (1-p) \ln (1-p)$

$-\Delta S/k = \ln 2 + p \ln p + (1-p) \ln (1-p)$ if the erasure is efficient

for $p=0$ $-\Delta S \geq k \ln 2$; for $p = \frac{1}{2}$ $-\Delta S \geq 0$

Landauer principle for analog computing systems:

we want to show that the continuous generalization

$\Delta S_S = \int_{x \in M} p(x) \ln p(x) \equiv$ Boltzmann (thermodynamic) entropy generated

when the erasure is realized in a physical system



dimensionless probability density $p(x)$ cannot be defined by dimensionful physical degrees of freedom without an appropriate regularisation

- define a density (note: not probability density) that regularizes the entropy (Jaynes)

Landauer's principle and phase transitions

Idea: continuous phase transitions with order parameter $m \equiv$ information erasure by resetting to standard value \Rightarrow entropy change must satisfy Landauer bound

$0 \leq m \leq 1$ plays the role of an **error probability** p

- SSB: degenerate vacua, the system “chooses” a state \equiv reset
- $T = 0 \Rightarrow m = 1$ perfectly ordered phase \equiv reset with no errors
- $0 < T < T_c \Rightarrow 0 < m < 1$ partially ordered phase \equiv reset with errors
- $T = T_c \Rightarrow m = 0$ (disordering procedure efficient) \rightarrow
 \rightarrow **Landauer bound saturated**
- **phase transition at $T = T_c$**

How do we prove this conjecture for classical systems?

(C.A. Trugenberger, MCD PhysRevE.89 (2014) 052138)

- **associative memory:** (Hopfield model) bits are stochastic neurons $s_i = \pm 1$, mean field
- phase transition from a disordered phase to an ordered phase with order parameter increasing from the value 0 at $T = T_c$ to 1 at $T=0$

$$P = \frac{1}{2} (1-m) \quad ; \quad \frac{-\Delta S(J,T)}{kN} = \frac{1}{kN} (S_{T_c} - S_T)$$

$$\frac{-\Delta S}{kN} = \ln 2 + p \ln(p) + (1-p) \ln(1-p),$$

thermodynamic entropy completely scales in terms of this error probability alone

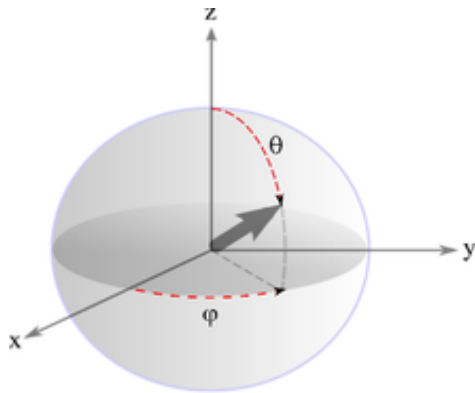
- Z_2 , easy generalization to $Z_{(2n+1)}$ $n=1/2, 1, 3/2, \dots$

Continuous Symmetries

discrete \rightarrow continuous symmetry

digital \rightarrow analog

- $O(3) \rightarrow O(2)$, Heisenberg ferromagnet $S^2 = 1$



infinite many possible orientation

- mean field: classical limit of the discrete case

$$\bullet \quad \frac{S(T, J)}{kN} = \ln \left[\frac{4\pi \sinh \beta m J}{(\beta m J)} \right] - (\beta m J) L(\beta m J)$$

- $L(x) = \coth x - 1/x$ Langevin function,
 $L(x) \rightarrow 1$ $x \rightarrow \infty$; $L(x) \rightarrow 0$ $x=0$
- $T = T_C$ $m \rightarrow 0 \Rightarrow S(T_C) / kN = \ln 4\pi$ = volume of the phase space \equiv area of the 2-sphere
- What happen when $T \rightarrow 0$?

$$\lim_{T \rightarrow 0} \frac{S(T, J)}{kN} = \ln(0) \rightarrow -\infty$$

- why the entropy is negative and diverges?

classical systems e.g. system of N classical harmonic oscillator:

$$\frac{S_{ho}}{kN} = \left[\ln \frac{kT}{\hbar\omega} + 1 \right] \rightarrow -\infty \text{ for } T \rightarrow 0$$

- discrete case (quantum): entropy not divergent, can we use this to regularize the entropy for the continuous symmetry?
- Spin s , $(2s + 1)$ components \equiv representation of $O(3)$;
 $s \rightarrow \infty$ classical spin on the unit sphere

(Millard and Leff, J. Math Phys 12 (1971), 1000;
 Lieb, Commun. Math Phys 31 (1973) 327)

- classical limit: $s \rightarrow s/s_{\max}$ $\Delta(2s_{\max} + 1) \rightarrow 4\pi$ for $s_{\max} \rightarrow \infty$, $\Delta \rightarrow 0$
- Heisenberg principle:

$$\Delta = \frac{1}{2} \hbar^2 s_{\max} ; \hbar s_{\max} \rightarrow s_{\text{clas}} \text{ for } s_{\max} \rightarrow \infty, \hbar \rightarrow 0 \quad S_{\text{clas}} = 1$$

$$\frac{S}{kN} = \ln \frac{4\pi}{(2s_{\max} + 1)} \left[\frac{\sinh(1 + \frac{1}{2s_{\max}}) \beta m J}{\sinh \frac{\beta m J}{2s_{\max}}} \right] - \beta m J B_{s_{\max}}(\beta m J)$$

- $S(T = T_C) / kN = \ln 4\pi$ for $s_{\max} \rightarrow \infty$
- $S(T \rightarrow 0) / kN = \ln [4\pi / (2s_{\max} + 1)] = \ln \frac{1}{2} \hbar^2 s_{\max} = \ln \frac{1}{2} \hbar$
- $\Delta S / kN = (S(T_C) - S(T=0)) / kN = \ln (8\pi / \hbar)$
- **Analog Landauer bound:** entropy production during erasure process = available configuration volume measured in units of the minimum quantum of configuration volume \Rightarrow **regularization**
- even if we start with continuous, analog information, only **a finite countably amount of information can be encoded in a physical system** (Shannon, Bekenstein)

Grazie!