



# Physical Information and Fundamental Energy Limits in Computation

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## Working Definition

Erasure of an amount  $I_{er}$  of information from a physical system unavoidably results in an

- entropy increase of

$$\Delta S \geq k_B \ln(2) I_{er}$$

- energy dissipation of

$$\Delta E \geq k_B T \ln(2) I_{er}$$

where

- $k_B$  is Boltzmann's constant.
- $T$  is the environment temperature.
- $I_{er}$  is amount of information lost *irreversibly*.

—Many variations on the theme of R. Landauer, *IBM J. Res. Dev.* **5**, 183 (1961).



### Interpretation of Key Quantities

- Entropy & energy of what? Defined and quantified how?
- Information about/of what? Defined and quantified how?
- What, *physically*, counts as info erasure? Irreversible info loss?

### Interpretation/Perception of Claim

- Implication of achievability, or inviolable bound?
- Just a consequence of the Second Law, or something else?
- Too model dependent? Too model independent?

### Perception of Status

- Is Landauer's Limit "extremely well established," or do...
- "we still await a cogent justification of Landauer's Principle"

—J. Norton, *Stud. Hist. Philosophy Mod. Phys.* **42**, 184 (2011).

### Methodological Objections

## Motivating Question

How much can be established about the energy cost of irreversible information loss in physical computing contexts...

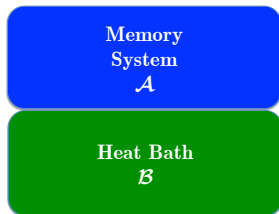
- as clearly, transparently, rigorously, and generally as possible...
- from as little as possible beyond physical law...
- while addressing or sidestepping common objections?

## Answers

Sketch proofs of three quantum-dynamical bounds

- Baseline Bound
- Trial-Averaged Bound
- Physical-Informatic Bound (briefly)

## Setting



Globally closed composite

- one-bit memory  $\mathcal{A}$
- heat bath  $\mathcal{B}$

Bath assumed finite and *initially* at temperature  $T$ .

## Encoding

$$\hat{\rho}^{\mathcal{A}} = \begin{cases} \hat{\rho}_0^{\mathcal{A}} & \text{for "binary 0"} \\ \hat{\rho}_1^{\mathcal{A}} & \text{for "binary 1"} \end{cases}$$

$\hat{\rho}_0^{\mathcal{A}}, \hat{\rho}_1^{\mathcal{A}}$  distinguishable and equiprobable

## Initial State

$$\hat{\rho}^{\mathcal{A}} = \frac{1}{2}\hat{\rho}_0^{\mathcal{A}} + \frac{1}{2}\hat{\rho}_1^{\mathcal{A}}$$
$$\hat{\rho}_{th}^{\mathcal{B}} = \exp[-\hat{H}^{\mathcal{B}}/k_B T]$$

## Final State ("Reset-to-Zero" erasure)

$$\hat{\rho}^{\mathcal{A}\mathcal{B}'} = \hat{U} (\hat{\rho}^{\mathcal{A}} \otimes \hat{\rho}_{th}^{\mathcal{B}}) \hat{U}^\dagger$$
$$\hat{\rho}^{\mathcal{A}'} = \text{Tr}_{\mathcal{B}}[\hat{\rho}^{\mathcal{A}\mathcal{B}'}] = \hat{\rho}_0^{\mathcal{A}}$$
$$\hat{\rho}^{\mathcal{B}'} = \text{Tr}_{\mathcal{A}}[\hat{\rho}^{\mathcal{A}\mathcal{B}'}]$$



### Change in Bath Energy

$$\Delta \langle E^{\mathcal{B}} \rangle = \langle E^{\mathcal{B}'} \rangle - \langle E_{th}^{\mathcal{B}} \rangle = \text{Tr}[\hat{\rho}^{\mathcal{B}'} \hat{H}^{\mathcal{B}}] - \text{Tr}[\hat{\rho}_{th}^{\mathcal{B}} \hat{H}^{\mathcal{B}}]$$

### Lower Bound on $\Delta \langle E^{\mathcal{B}} \rangle$ : Proof Ingredients

- Partovi's Inequality:  $\Delta \langle E^{\mathcal{B}} \rangle \geq k_B T \ln(2) \Delta S^{\mathcal{B}}$ .
  - $S^{\mathcal{B}}$ : von Neumann entropy of bath  $\mathcal{B}$
  - $T$ : *initial* temperature of bath  $\mathcal{B}$
- Subadditivity of von Neumann entropy
- Invariance of von Neumann entropy under unitary evolution

### Result: Bound on $\Delta \langle E^{\mathcal{B}} \rangle$

$$\langle E^{\mathcal{B}} \rangle \geq k_B T \ln(2)$$



### Features

- Bound follows exclusively from dynamical law and entropic inequalities.
- No equilibrium or quasi-static assumptions:  $T$  refers only to initial temperature of finite bath

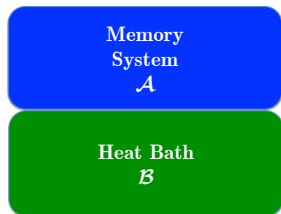
### Limitations

- Very Special Case
  - Symmetric, one-bit memory
  - Uniform encoding probabilities
- What about information? Reversibility?

### Objection

- Unsubstantiated use of "average" initial state
  - Initial state is only ever  $\hat{\rho}_0^A$  **OR**  $\hat{\rho}_1^A$ , but proof is for  $\hat{\rho}^A = \frac{1}{2}\hat{\rho}_0^A + \frac{1}{2}\hat{\rho}_1^A$

## Setting



Globally closed composite

- memory system  $\mathcal{A}$
- heat bath  $\mathcal{B}$

Bath assumed finite and *initially* at temperature  $T$ .

## Encoding

$$\hat{\rho}^{\mathcal{A}} = \hat{\rho}_i^{\mathcal{A}} \text{ for symbol } x_i$$

$\hat{\rho}_i^{\mathcal{A}}$  are mutually distinguishable  
 $x_i$  is encoded with probability  $p_i$

**Initial State** (trial w/  $x_i$  encoded)

$$\hat{\rho}^{\mathcal{A}} = \hat{\rho}_i^{\mathcal{A}}$$
$$\hat{\rho}_{th}^{\mathcal{B}} = \exp[-\hat{H}^{\mathcal{B}}/k_B T]$$

**Final State** (reset  $\hat{\rho}_i^{\mathcal{A}}$  to  $\hat{\rho}_{reset}^{\mathcal{A}}$ )

$$\hat{\rho}_i^{AB'} = \hat{U}_i (\hat{\rho}_i^{\mathcal{A}} \otimes \hat{\rho}_{th}^{\mathcal{B}}) \hat{U}_i^\dagger$$
$$\hat{\rho}_i^{\mathcal{A}'} = \text{Tr}_{\mathcal{B}}[\hat{\rho}_i^{AB'}] = \hat{\rho}_{reset}^{\mathcal{A}}$$
$$\hat{\rho}_i^{\mathcal{B}'} = \text{Tr}_{\mathcal{A}}[\hat{\rho}_i^{AB'}]$$



### Change in Bath Energy

$$\langle \Delta \langle E^{\mathcal{B}} \rangle \rangle = \sum_i p_i \left( \langle E_i^{\mathcal{B}'} \rangle - \langle E_{th}^{\mathcal{B}} \rangle \right) = \sum_i p_i \left( \text{Tr}[\hat{\rho}_i^{\mathcal{B}'} \hat{H}^{\mathcal{B}}] - \text{Tr}[\hat{\rho}_{th}^{\mathcal{B}} \hat{H}^{\mathcal{B}}] \right)$$

**Lower Bound(s) on  $\langle \Delta \langle E^{\mathcal{B}} \rangle \rangle$ :** Proof Ingredients (beyond baseline)

- Linearity of unitary-similarity transformations
- Grouping property of von Neumann entropy

**Results: Bounds on  $\langle \Delta \langle E^{\mathcal{B}} \rangle \rangle$**

$\langle \Delta \langle E^{\mathcal{B}} \rangle \rangle \geq k_B T \ln(2) [-\langle \Delta S_i^{\mathcal{A}} \rangle]$  for conditional reset

$\langle \Delta \langle E^{\mathcal{B}} \rangle \rangle \geq k_B T \ln(2) [I_{er}^{\mathcal{A}} - \langle \Delta S_i^{\mathcal{A}} \rangle]$  for unconditional reset ( $\hat{U}_i = \hat{U} \forall i$ )

- $I_{er}^{\mathcal{A}} = -\sum_i p_i \log_2 p_i = H(X)$ : Shannon information erased from  $\mathcal{A}$
- $\langle \Delta S_i \rangle = \sum_i p_i [S(\hat{\rho}_{reset}^{\mathcal{A}}) - S(\hat{\rho}_i^{\mathcal{A}})]$ : trial-average entropy change of  $\mathcal{A}$

—N.G. Anderson, "Conditional Erasure and the Landauer Limit." In: Lent C., Orlov A., Porod W., Snider G. (eds) *Energy Limits in Computation*. Springer, (2019).

### Features

- Use of average initial state sidestepped—*and vindicated*
- Holds for asymmetric memory; nonuniform encoding statistics; general reset state
- Resolves two distinct contributions
  - “information-bearing entropy”—with Shannon entropy of encoding *emerging* as info measure
  - “non-information-bearing entropy”; trial-averaged entropy change
- Connection between conditioning and reversibility explicit

### Limitations

- Holds only for distinguishable encoding states
- Not scalable to logic, FSAs, complex computing contexts

### Objection

- Physicality and role of information insufficiently clear

We should not *expect* to have  
a rigorous, agreed upon  
**physical quantification of the costs of information processing**  
in computational contexts  
without  
a rigorous, agreed upon  
**physical conception and quantification of information**  
in computational contexts.

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**We need a “strongly physical” conception of information (SPCI)**  
for computational contexts

**Candidate SPCI: Observer-local referential (OLR) information**

### OLR Information

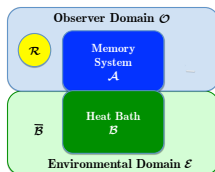
$$I^{\mathcal{R}\mathcal{A}} = S(\hat{\rho}^{\mathcal{R}}; \hat{\rho}^{\mathcal{A}}) \text{ for } \mathcal{R} \in \mathcal{O}$$

$$I^{\mathcal{R}\mathcal{A}} = 0 \quad \text{for } \mathcal{R} \in \mathcal{E}$$

$S(\circ; \circ)$ : correlation entropy (or QMI)

$\hat{\rho}^{\mathcal{R}}$ : state of referent system  $\mathcal{R}$

$\hat{\rho}^{\mathcal{A}}$ : state of info-bearing system  $\mathcal{A}$



—N.G. Anderson, "Information as a Physical Quantity", *Information Sciences* **415**, 397 (2017).

### Results: Bounds on $\Delta\langle E^{\mathcal{B}} \rangle$

$$\Delta\langle E^{\mathcal{B}} \rangle \geq k_B T \ln(2) [-\langle \Delta S_i^{\mathcal{A}} \rangle] \quad \text{conditional reset (general } \hat{U} = \hat{U}^{\mathcal{R}\mathcal{A}\mathcal{B}})$$

$$\Delta\langle E^{\mathcal{B}} \rangle \geq k_B T \ln(2) [I_{er}^{\mathcal{A}} - \langle \Delta S_i^{\mathcal{A}} \rangle] \quad \text{unconditional reset } (\hat{U} = \hat{U}^{\mathcal{R}} \otimes \hat{U}^{\mathcal{A}\mathcal{B}})$$

- $I_{er}^{\mathcal{R}\mathcal{A}} = I^{\mathcal{R}\mathcal{A}} - I^{\mathcal{R}\mathcal{A}'} = \chi$ : Holevo info of encoding ensemble  $\{p_i, \hat{\rho}_i^{\mathcal{A}}\}$

—N.G. Anderson, "Landauer's Limit and the Physicality of Information," *Eur. Phys. J. B* **91**, 156 (2018).



- Bound is identical to that proven by trial-averaging, but is...
  - **generalized** to arbitrary (e.g. noisy) encoding states.
  - **scalable** to logic, FSAs, complex computing contexts
- Based on information measure that...
  - formalizes information as a physical state quantity (of  $\mathcal{RA}$ )
  - distinguishes states of  $\mathcal{A}$  that do and do not bear information
  - harmonizes with conceptions of information in computing contexts
- All relevant copies and records are physically embodied
  - No ghostly “knowers” of information or “conditioners” of operations  
—N.G. Anderson, “Information: The ghost in the computing machine?” forthcoming.
- Bound provable using average initial states *or* trial averaging



## **The Landauer Limit has a complex history—still controversial!**

- Resolution would aid evaluation of reversible computing
- Most objections are to standard thermodynamic approaches

## **Quantum dynamical approaches can help**

- Reveals LL as a transparent consequence of dynamical law
- Enables substantial generalizations
- Addresses or sidesteps key objections
- Clarifies link between conditioning and reversibility
- Solidifies physical meaning(s) and role of "information" in LL
- Enables "scalability" of LL to complex, noisy computing scenarios

**Thank You**