\section*{| 0 | 1 | 0 | 0 |
| :--- | :--- | :--- | :--- |}

## Modeling Maxwell's demon

D Mandal, UC Berkeley

## A curious observation

One liter of ordinary air has enough thermal energy to toss a 7 kilogram bowling ball 3 meters off the ground!

A solution to the energy crisis?

## Maxwell's demon <br> (born in 1867)



Fast
Slow

Before operation

## Maxwell's demon

(born in 1867)


Before operation


During operation

## Violation of the second law!

No process is possible whose sole result is the extraction of energy from a single heat bath and its conversion into work.

## Accepted resolution

Landauer's principle: A minimum of $\mathrm{kT} \ln (2)$ amount of heat needs to be dissipated to erase one bit of information

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Thermodynamics of information processing: - Writing information increases entropy of memory

- Erasing information decreases entropy of memory


## Goal

- An autonomous physical system, without intelligence or explicit thermodynamic force, that behaves like a demon


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- An autonomous physical system, without intelligence or explicit thermodynamic force, that behaves like a demon
- Implications for the second law of thermodynamics


## Model*: Overview

Three essential components, all immersed in a heat bath:

- Demon
- Bits
- Mass
*Mandal and Jarzynski, PNAS 109, 11641 (2012)


## Demon



No complete rotation

## Bit



State 0


State 1

No intrinsic transitions

## Demon + Bit



State C


State A


State 1

## Demon + Stream of bits

- Stream of uncorrelated bits: $\mathrm{p}_{0 / 1}=$ proportion of $0 / 1^{\prime} \mathrm{s}$
- The demon interacts with the nearest bit
- Interaction interval: $\tau=d / v$



## Claim

The demon rotates clockwise if all the incoming bits are in state 0
(Rectification of thermal fluctuations,
using information)

## Justification



State C
State 0
State A
State 1

- If all incoming bits are in state 0
- No full counter clockwise rotation
- Sustained clockwise rotation on average
- Thermal fluctuations are rectified!


## Demonstration of rectification



## Demonstration of rectification



New interacting bit

## Demonstration of rectification



## Demonstration of rectification



The bit flipped

## Demonstration of rectification



One complete clockwise rotation!

## Demon + Bit + Mass



State C
State 0
State A
State 1

## Complete setup



- Mixture of 0's and 1's
- $p_{0 / 1}\left(p^{\prime}{ }_{0 / 1}\right)$ : Proportion of incoming (outgoing) bits in state 0/1


## Information entropy

- Information / bit
- $H_{\text {in }}=-p_{0} \ln p_{0}-p_{1} \ln p_{1}$
- $\mathrm{H}_{\text {out }}=-\mathrm{p}_{0}^{\prime} \ln \mathrm{p}_{0}^{\prime}-\mathrm{p}_{1}^{\prime} \ln \mathrm{p}_{1}^{\prime}$
- $0 \leq H \leq \ln 2$


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- $\mathrm{H}=0$ : all bits either 0 or 1 ("blank")
- $H=\ln 2:$ equal \# of 0 's and 1's (``full")


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- $\mathrm{H}=0$ : all bits either 0 or 1 ("blank")
- $H=\ln 2$ : equal \# of 0 's and 1's ("full")
- $\Delta S_{B}=k_{B}\left(H_{\text {out }}-H_{i n}\right)$ : change in information $\left(\times k_{B}\right)$


## Relevant variables

- (key) Parameters
- $\delta=p_{0}-p_{1}$ : excess 0 's of incoming bits
- $\varepsilon=\tanh [\mathrm{m} g \Delta \mathrm{~h} / 2 \mathrm{k} \mathrm{T}]:$ rescaled mass
- $\tau=d / v$ : interaction time / bit


## Relevant variables

- (key) Parameters
- $\delta=p_{0}-p_{1}$ : excess 0 's of incoming bits
- $\varepsilon=\tanh [\mathrm{mg} \Delta \mathrm{h} / 2 \mathrm{kT}]$ : rescaled mass
- $\tau=d / v$ : interaction time / bit
- Quantities of interest
- $\Phi=p_{1}^{\prime}-p_{1}$ : Avg. clockwise rotation / bit
- W = Ф m g $\Delta \mathrm{h}$ : Avg. work / bit
- $\Delta \mathrm{S}_{\mathrm{B}}=\mathrm{H}_{\text {out }}{ }^{-} \mathrm{H}_{\text {in }}$ : Change in information $\left(\times \mathrm{k}_{\mathrm{B}}\right) /$ bit


## Analytical results

- $\Phi$ : Avg. clockwise current per $\tau$

$$
\Phi(\delta, \varepsilon ; \tau)=\frac{\delta-\varepsilon}{2} \eta
$$

$$
\begin{aligned}
& \eta=\left[1-\frac{1}{3} K(\tau)+\frac{\varepsilon \delta}{6} J(\tau, \varepsilon \delta)\right] \geq 0 \\
& K()=e^{2} \frac{(1+8+4 \sqrt{3})(2+7+4 \sqrt{3}) e^{2}}{3(2+) e^{2}} \\
& J(,)=\frac{(1 e) 2 e^{2}(+\sqrt{3} \quad 1)^{2}}{3(1 \quad e)(1 \quad)(2+) e^{2} 3(2+) e^{2}} \\
& \quad=\sinh (\sqrt{3}) \\
& \quad=\cosh (\sqrt{3})
\end{aligned}
$$

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- $\mathrm{W}:$ : Avg. work per $\tau=\Phi k T \ln \left(\frac{1+\varepsilon}{1-\varepsilon}\right)$
- $\Delta \mathrm{S}_{\mathrm{B}}$ : Change in entropy per bit $=H(2 \Phi-\delta)-H(\delta)$


## Competition between two forces: $\delta$ and $\varepsilon$

$$
\Phi(\delta, \varepsilon ; \tau)=\frac{\delta-\varepsilon}{2} \eta, \quad \eta \geq 0
$$



- $\delta$ (excess incoming 0's) favors CW rotation
- $\varepsilon$ (gravitational force) favors CCW rotation


## Non-equilibrium phase diagram



## Non-equilibrium phase diagram Engine ( $W>0$ )


$\delta: \mathrm{CW}$
$\varepsilon$ : CCW


## Non-equilibrium phase diagram Eraser ( $\Delta \mathrm{S}_{\mathrm{B}}<0$ )


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- Engine: $0<\mathrm{W}<\mathrm{kT} \Delta \mathrm{S}_{\mathrm{B}}$
- Eraser:
$0>k T \Delta S_{B}>W$
- "Dud": $k T \Delta S_{B}>0>W$


## Not a real solution to the energy crisis!

About 200 million terabytes of data to heat a gram of water by just a single degree Celsius an overwhelming demand for data storage!

## Thank you!

## Extra slides

## Mechanical demon



## Joint dynamics

Rate Equation: $\quad \frac{d p_{i}}{d t}=\sum_{j \neq i}\left(p_{j} R_{j \rightarrow i} \quad p_{i} R_{i \rightarrow j}\right), \quad i, j=A 0, \ldots, C 1$


## Key steps in the derivation of $\Phi$

1. periodic steady state of the demon, $\mathbf{q}_{\mathrm{ps}}$
2. Statistics of the outgoing bits in the periodic case, $\left(\mathrm{p}_{0, \mathrm{ps}}^{\prime} \mathrm{p}_{1, \mathrm{ps}}^{\prime}\right)^{\top}$
3. $\Phi=\mathrm{p}_{1, \mathrm{ps}}^{\prime}-\mathrm{p}_{1}{ }^{*}$

$$
{ }^{*} p_{0}=(1+\delta) / 2, p_{1}=(1-\delta) / 2
$$

## Step 1: Periodic steady state of the demon $\mathbf{p}_{\mathrm{D}, \mathrm{ps}}$

- $t=0$ : Joint state of the demon and the $1^{\text {st }}$ bit is

$$
\mathbf{p}_{\mathrm{DB}}(0)=\mathbf{M} \mathbf{p}_{\mathrm{D}}(0)
$$

where $\mathbf{M}=(p 0 \mathbf{I}, p 1 \mathbf{I})^{\top}$ and $\mathbf{I}$ is $3 \times 3$ identity matrix

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- $0<t<\tau$ : $\mathbf{p}_{D B}$ follows rate equation $d p_{D B} / \mathrm{dt}=\mathbf{R} \mathbf{p}_{\mathrm{DB}}$ solution: $\mathbf{p}_{\mathrm{DB}}(\tau)=\operatorname{Exp}(\mathbf{R} \tau) \mathbf{p}_{\mathrm{DB}}(0)$


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- $\mathrm{T}=\mathrm{n} \mathrm{\tau}$ : State of the demon is $\boldsymbol{p}_{\mathrm{D}}(\mathrm{n} \tau)=\mathrm{T}^{\mathrm{n}} \boldsymbol{p}_{\mathrm{D}}(0)$


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- $T=n \tau$ : State of the demon is $\boldsymbol{p}_{\mathrm{D}}(\mathrm{n} \tau)=\mathrm{T}^{\mathrm{n}} \mathbf{p}_{\mathrm{D}}(0)$
- For $n \gg 1, p_{\mathrm{D}}(\mathrm{n} \tau) \approx \mathrm{p}_{\mathrm{D}, \mathrm{ps}}$ where $\mathrm{T}_{\mathrm{p}, \mathrm{ps}}=\mathrm{p}_{\mathrm{D}, \mathrm{ps}}$


## Steps 2,3: Statistics of the outgoing bits and $\Phi$

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\left(\mathrm{p}_{0, \mathrm{ps}}^{\prime}, \mathrm{p}_{1, \mathrm{ps}}^{\prime}\right)^{\top}=\mathbf{P}_{\mathrm{B}} \operatorname{Exp}(\mathbf{R} \tau) \mathbf{M} \mathbf{p}_{\mathrm{D}, \mathrm{ps}}
$$

where

$$
\mathbf{P}_{\mathrm{B}}=\left(\begin{array}{cccccc}
1 & 1 & 1 & 0 & 0 & 0 \\
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