# Two odd things about computation

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## Two odd things

### I. Maxwell's demon (1871)

Energy cost of computation

### II. Russell's paradox (1901)

Time and space cost of computation

### This is not geometry

### This is not computation

C: comm

### I. Maxwell's demon

How much energy must be used in carrying out a computation?

Quasi-static flux of heat Q into a system at temperature T is associated with an increase of entropy S of that system.

### $\Delta Q = T\Delta S$



$$-T_1 \Delta S_1 = \Delta Q = T_2 \Delta S_2$$

 $\Delta S = \Delta S_2 + \Delta S_1 = \left(1 - \frac{T_2}{T_1}\right) \Delta S_2 = \begin{cases} > 0 & T_1 > T_2 \\ < 0 & T_1 < T_2 \end{cases}$ 

**Second law**: it is impossible to derive an engine which, working in a cycle, shall produce no effect other than the transfer of heat from a colder to a hotter body.

i.e. in a closed system always  $\Delta S_{tot} \ge 0$ 



$$-T_1 \Delta S_1 = \Delta Q = T_2 \Delta S_2$$

$$\Delta S = \Delta S_2 + \Delta S_1 = \left(1 - \frac{T_2}{T_1}\right) \Delta S_2 = \begin{cases} > 0 & T_1 > T_2 \\ < 0 & T_1 < T_2 \end{cases}$$

"If someone points out to you that your pet theory of the universe is in disagreement with Maxwell's equations — then so much the worse for Maxwell's equations. If it is found to be contradicted by observation — well these experimentalists do bungle things sometimes. But if your theory is found to be against the second law of thermodynamics I can give you no hope; there is nothing for it but to collapse in deepest humiliation."

-Arthur Stanley Eddington



 $\Delta W = \Delta Q = -kT\ln 2 \qquad \Delta S_{bath} = -k\ln 2$ 

In the cycle 1-2-3-4-1, Maxwell's demon seems to violate the second law of thermodynamics

## What generates the missing entropy?

- It's the measurement! Brillouin '51, Gabor '61.
- No, it's not the measurement! It's the change in internal state of the demon, viewed as changing over the course of a cyclic computational process -Landauer '61, Fredkin & Toffoli '82, Bennett '82.





(diagrams from Bennett '82)









- Landauer's principle: the only fundamental computational operation which generates entropy is *erasure*.
- Bennett's exorcism: the resolution of Maxwell's paradox is that, in order to complete a cycle, the demon's internal state must be restored to its original configuration by *erasing its memory* - thus generating the entropy necessary to put the engine back into compatibility with the second law.

## II. Russell's paradox

How much time and space must be used in carrying out a computation?

### **Comprehension considered harmful**

$$R = \{ x \mid x \notin x \}$$

### $R \in R \vdash R \notin R$

### $R \notin R \vdash R \in R$

The sequent  $A_1, \ldots, A_n \vdash B_1, \ldots, B_m$  says: together the  $A_i$  prove at least one of the  $B_i$ 



 $\Gamma, \Delta$  stand for multisets of formulae

### Example of a proof in the sequent calculus



**Theorem** (Gentzen 1934). There is an algorithm which, given a proof, produces a cut-free proof of the same sequent. This algorithm is called *cut-elimination*.

| logic           | programming       |
|-----------------|-------------------|
| formula         | type              |
| sequent         | input/output spec |
| proof           | program           |
| cut-elimination | execution         |
| contraction     | copying           |
| weakening       | erasure           |

**Curry-Howard correspondence** 

$$\begin{array}{l} & \underset{\Gamma \vdash \Delta, A[t/x]}{\Gamma \vdash \Delta, t \in \{x \mid A\}} \operatorname{comp} \quad \frac{\Gamma, A[t/x] \vdash \Delta}{\Gamma, t \in \{x \mid A\} \vdash \Delta} \operatorname{comp} \end{array}$$

$$A = x \notin x \qquad R = \{x \mid A\} = \{x \mid x \notin x\}$$
$$R \notin R = A[R/x]$$

Applying the new comprehension rule yields

•

$$\begin{array}{c} \Gamma \vdash \Delta, R \notin R \\ \hline \Gamma \vdash \Delta, R \in R \end{array} \text{comp} & \begin{array}{c} \Gamma, R \notin R \vdash \Delta \\ \hline \Gamma, R \in R \vdash \Delta \end{array} \text{comp} \end{array}$$



- The sequent calculus of naive set theory is inconsistent.
- The standard point of view is that the culprit is unrestricted comprehension.

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#### **Curry-Howard correspondence**

**Theorem** (Girard '98): there is a consistent refinement of the sequent calculus with unrestricted comprehension but *restricted contraction* in which the provably total functions  $\mathbb{N} \longrightarrow \mathbb{N}$  are precisely the polynomial time functions.

- This refinement is called *light linear logic*.
- The subject of *implicit computational complexity* views time and space complexity of programs as constraints on the static "geometry" of proofs.
- This has been used to propose versions of System F (the programming language on which Haskell is based) with polytime as a typing constraint (Atassi-Baillot-Terui '07).
- Derived from a close analysis of Russell's paradox.

|           | logic                 | programming           |                   |
|-----------|-----------------------|-----------------------|-------------------|
| fo        | ormula                | type                  |                   |
|           | proof                 | program               |                   |
| cut-e     | elimination           | execution             |                   |
| COI       | ntraction             | copying               | Russell's paradox |
| We        | akening               | erasure               | Maxwell's paradox |
| re<br>cor | stricted<br>ntraction | restricted complexity |                   |

What is the physical meaning of complexity?



: Work per mole W/N = RTIn2.