

Lecture 5

10 FEB 2014

Quickly define BPP as the class of all promise problems that can be decided efficiently by a probabilistic Turing machine (i.e., one that can use ~~some~~ coin tosses / random bits to decide the next action)

promise problem is  $L = A_{yes} \cup A_{no} \subseteq \{0,1\}^*$  such that  $A_{yes} \cap A_{no} = \emptyset$

BPP (bounded error probabilistic polynomial time) consists of all promise problems  $L$  ~~such that~~ <sup>for which</sup> there exists

a prob. T/M  $M$  such that

1) if  $x \in A_{yes}$ , then  $M$  accepts w/ prob.  $\geq 2/3$

2) if  $x \in A_{no}$ , then  $M$  rejects w/ prob.  $\geq 2/3$

Chernoff bound shows that constant is arbitrary ~~can even~~ <sup>can even</sup> be chosen to be as close to 1 as you want, as long as it is only bounded by an inverse polynomial

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Why? Consider that  $X_1, \dots, X_n$  are independent Bernoulli RVs, each w/  $p \geq 1/2$ . then the probability

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of  $n/2$  or more of events has an exact value

$$P_{\text{succ}} = \sum_{i=\lfloor n/2 \rfloor + 1}^n \binom{n}{i} p^i (1-p)^{n-i}$$

From Chernoff bound, we get

$$P_{\text{succ}} \geq 1 - \exp \left\{ -\frac{n}{2p} (p - 1/2)^2 \right\}$$

So in order to meet any desired error  $\epsilon$ , we have

$$\epsilon \leq \exp \left\{ -\frac{n}{2p} (p - 1/2)^2 \right\}$$

$\Rightarrow$  can take  $n$  to be no larger than

$$\frac{1}{(p - 1/2)^2} \log \left( \frac{1}{\epsilon} \right)$$

In fact, from this we can see that even if  $p = 1/2 + \frac{1}{\text{poly}(n)}$ , we only require a polynomial # of repetitions to get the error to be  $\exp \{ -\text{poly}(n) \}$

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Another resource that is important in computation is energy in addition to time & space. The most famous result in this area is Landauer's erasure principle.

For a reversible computation, in principle no energy is required to conduct the computation. However, irreversible computations erase information & there is a fundamental cost associated to doing so. This is what ~~is~~ Landauer's erasure principle quantifies.

We will prove this using techniques from quantum information theory...

approach outlined in 1306.4352

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(QIP 2014)

### Minimal Assumptions

1) process involves a system  $S$  & a reservoir  $R$

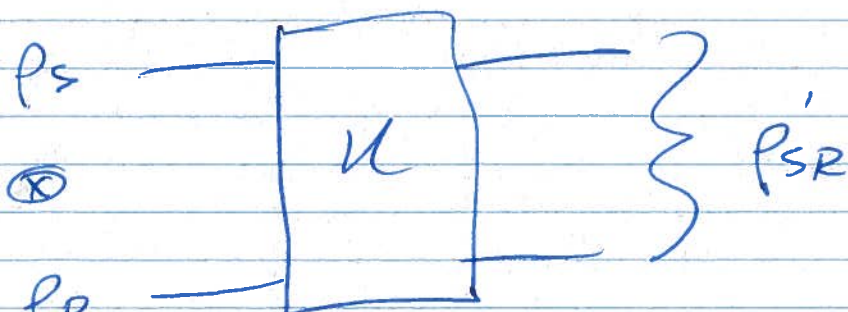
2) reservoir  $R$  is initially in a thermal state  $p_R = \frac{e^{-\beta H}}{\text{Tr} \sum e^{-\beta H}}$

for Hamiltonian  $H$  & inverse temperature  $\beta$

3)  $S$  &  $R$  are initially uncorrelated  
 $p_{SR} = p_S \otimes p_R$

4) process proceeds by unitary evolution.

### Picture



$\beta =$  initial inverse temp.

$$\Delta S = S(p_S) - S(p_S^*)$$

entropy decrease of system

$$\Delta Q = \text{Tr}\{H\rho_R'\} - \text{Tr}\{H\rho_R\}$$

heat dissipated to reservoir

Landauer's bound:

$$\beta \Delta Q \geq \Delta S$$

if information is erased (i.e.,  $\Delta S > 0$ )  
i.e., entropy decrease is positive

then heat is dissipated to the environment.  
 (there is an energy cost to this.)

other part: no heat dissipation needed  
 in principle for reversible computation.

simpler statement: erasure of a bit requires  $kT \log 2$   
joules of work

Definitions:

von Neumann entropy  $S(\rho) = -\text{Tr}\{\rho \log \rho\}$

rel. entropy  $D(\rho||\sigma) = \text{Tr}\{\rho \log \rho\} - \text{Tr}\{\rho \log \sigma\} \geq 0$

mutual info.  $I(A;B) = S(\rho_A) + S(\rho_B) - S(\rho_{AB}) \geq 0$

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We prove that

$$\beta \Delta Q = \Delta S + I(S; R') + D(P_{R'} \| P_R) \geq \Delta S$$

$$\begin{aligned} \Delta S + I(S; R') &= S(p_S) - S(p_{S'}) \\ &\quad + S(p_{S'}) + S(p_{R'}) - S(p_{SR'}) \\ &= S(p_S) - S(p_{S'}) + S(p_{S'}) + S(p_{R'}) \\ &\quad - S(p_{SR'}) \end{aligned}$$

$$= S(p_{R'}) - S(p_R)$$

$$= -\text{Tr} \left\{ P_{R'} \log P_{R'} \right\} + \text{Tr} \left\{ P_R \log \frac{e^{-\beta H}}{\text{Tr} \left\{ e^{-\beta H} \right\}} \right\}$$

$$= \text{Tr} \left\{ P_R (-\beta H - \log \text{Tr} \left\{ e^{-\beta H} \right\}) \right\}$$

$$= -\beta \text{Tr} \left\{ H P_R \right\} - \log \text{Tr} \left\{ e^{-\beta H} \right\}$$

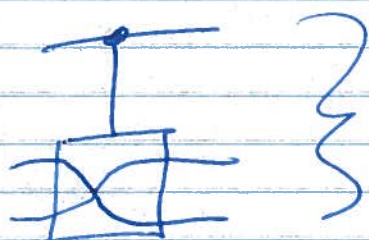
$$= \text{Tr} \left\{ P_{R'} \right\} + \beta \text{Tr} \left\{ H P_{R'} \right\} - \beta \text{Tr} \left\{ H P_R \right\}$$

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$$\begin{aligned} &= \beta \operatorname{Tr} \left\{ H(P_R' - P_R) \right\} - \operatorname{Tr} \left\{ P_R' \log P_R' \right\} \\ &\quad + \operatorname{Tr} \left\{ P_R' \log \frac{e^{-\beta H}}{\operatorname{Tr} \left\{ e^{-\beta H} \right\}} \right\} \\ &= \beta \Delta Q - D(P_R' \| P_R) \end{aligned}$$

□

We will show that reversible computation is possible by using just a single reversible logic gate: the Fredkin gate

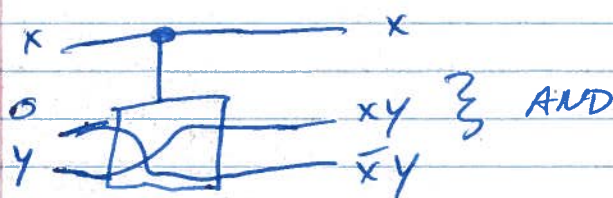


"controlled-SWAP"

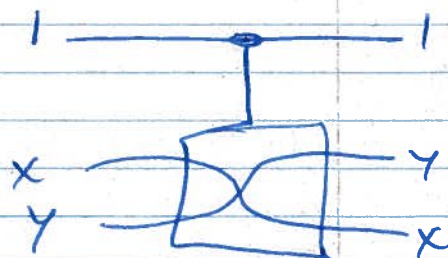
if 1st bit is zero, do nothing otherwise swap the last two,

clearly reversible (in fact "self-inverse")

can simulate AND



can simulate CROSSOVER / SWAP



can simulate NOT



FANOUT also

only needs extra ancilla bits



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since we can compute any function  $f(x)$

$f: \{0,1\}^n \rightarrow \{0,1\}^m$  w/ a Boolean circuit, we can do so w/ Fredkin gates w/ reasonable overhead. Can represent

action of computation as

$$(x, a) \rightarrow (f(x), g(x))$$

↑  
ancilla

↑  
garbage

computation produces unwanted garbage bits. It is desirable to get rid of these, especially when we move on to quantum computation.

add the NOT gate & CNOT gate

$$0 \rightarrow 1$$

$$1 \rightarrow 0$$

$$00 \rightarrow 00$$

$$01 \rightarrow 01$$

$$10 \rightarrow 11$$

$$11 \rightarrow 10$$

to our gate set for convenience,

w/ NOT gates, we can write action of computation as

$$(x, 0) \rightarrow (f(x), g(x))$$

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can also add gates at the beginning of the circuit to copy the input as

$$(x, 0, 0) \rightarrow (x, x, 0) \rightarrow \begin{array}{l} \text{run circuit} \\ \text{on last} \\ \text{two registers} \end{array} \\ (x, f(x), g(x))$$

can now discuss an important idea called uncomputation

initialize <sup>four-register</sup> computer to

$$(x, 0, 0, y)$$

1) run above circuit on 1st 3 registers

$$\rightarrow (x, f(x), g(x), y)$$

2) copy 2nd register to fourth w/ CNOTs

$$\rightarrow (x, f(x), g(x), y \oplus f(x))$$

Since all steps to compute  $f(x)$  are reversible, we can run reverse of circuit in step 1 to get

$$\rightarrow (x, 0, 0, y \oplus f(x))$$

can then omit the final zeros  
to say that the action of the  
circuit is

$$(x, y) \rightarrow (x, y \oplus f(x))$$

resource overhead involved is

~~used~~ for replacing ANDs & NOTs & others  
constant w/ Fredkin.

since nothing  
is erased,  
in principle, this  
computation  
can be done  
w/ zero  
work cost.

linear overhead for CNOTs & NOTs  
another run of circuit for uncomputing,  
So any irreversible circuit has a  
reversible simulation, To have a  
fully reversible implementation, we need  
reversible Turing machines, but  
we won't go there...

classes like P, BPP, & BQP do not change  
... than adding to reversible