

Expected number of steps is $O(n \cdot \log n)$
 where n is the size of the set to be sorted.

$\forall i, j \in S$ define a random variable S_{ij} .

$S_{ij} = 1$ if i and j are compared in a given run.

(last step $(q_{\text{sort}} S_1, y, q_{\text{sort}} S_2)$ $\forall i \in S_1, i < y$
 $\forall i \in S_2, i > y$
 $i < y < j \Rightarrow i$ and j do not get compared)

$S_{ij} = 0$ if i and j do not get compared

$$X = \sum_{i < j} S_{ij}$$

\rightarrow the total number of comparisons in a run

$\forall i, j \quad Pr(S_{ij}=1) = \frac{1}{j+1}$

$$E(X) = E\left(\sum_{i < j} S_{ij}\right) = \sum_{i < j} E(S_{ij}) = \sum_{i < j} Pr(S_{ij}=1) = \sum_{i < j} \frac{1}{j+1}$$

$$E(S_{ij}) = 0 \cdot Pr(S_{ij}=0) + 1 \cdot Pr(S_{ij}=1) = Pr(S_{ij}=1)$$

Step 1 What is the probability to compare i and j ?

$$\Pr(i \text{ and } j \text{ getting compared in Step 1}) = \frac{2}{n} = \frac{2}{|S_1|}$$

Step 2 $|S_1|, y_1, |S_2|$

Probability of i and j getting compared in step 2?

$$\Pr(i \text{ and } j \text{ get compared} \mid i < y < j) = 0$$

$$\Pr(i \text{ and } j \text{ get compared} \mid y < i < j) = \frac{2}{|S_2|}$$

$$\Pr(i \text{ and } j \text{ get compared} \mid i < j < y) = \frac{2}{|S_1|}$$

Step 2 \rightarrow let's bound the probability of comparing

i, j conditioned on the event of both i, j being in the same subset $|S_k| \geq j - i + 1$

$$\Pr(i \text{ and } j \text{ get compared} \mid \text{they are in set } S_k) = \frac{2}{|S_k|} < \frac{2}{j - i + 1}$$

$S_{ij} = 1$ if i and j get compared in some round

$$\Pr(S_{ij} = 1) = \Pr(i \text{ and } j \text{ get compared in round } k \mid \text{they are in the same set}) \cdot \Pr(i \text{ and } j \text{ are in the same set in } k\text{-th round})$$

law of total probability

$$+ \Pr(i \text{ and } j \text{ get compared in round } k \mid i \text{ and } j \text{ are not in the same set})$$

$$\cdot \Pr(i \text{ and } j \text{ are not in the same set})$$

$$= \Pr(i \text{ and } j \text{ get compared in round } k \mid \text{they are in the same set}) \cdot \Pr(i \text{ and } j \text{ are in the same set in } k\text{-th round})$$

$$< \Pr(i \text{ and } j \text{ not compared in round } k \mid \text{they are in the same set})$$

$$\leq \Pr(i \text{ and } j \text{ get compared in round } t \mid \text{they are in the same set})$$

$$\leq \frac{2}{j-i+1}$$

$$E(x) = \sum_{i < j} \frac{2}{j-i+1} = \dots = n \cdot \underbrace{\sum_{i=1}^n \frac{1}{i}}_{\Theta(\log n)} = \Theta(n \log n)$$

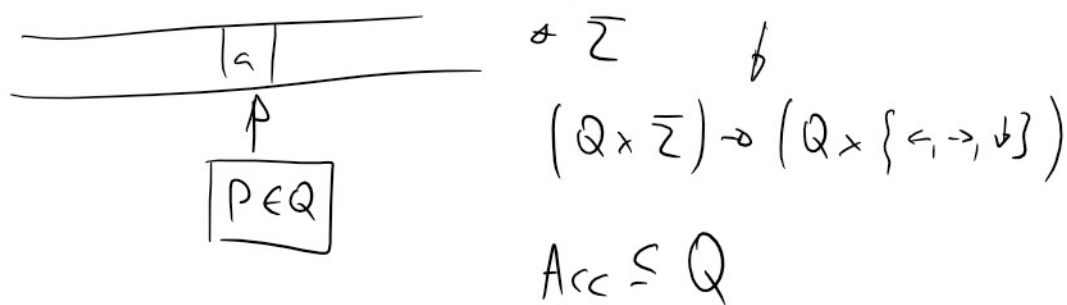
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Classification of randomized algorithms

- Complexity classes
- Algorithm types

Complexity classes

DTM - deterministic TM
 \checkmark infinite tape



Decision problems

x - input Does x belong to a language L

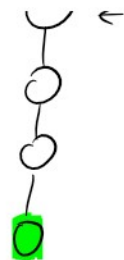
$$L \subseteq \Sigma^*$$

(Σ^* a set of all strings over alphabet Σ)

$L \subseteq L$ (L = set of all strings over alphabet Σ)

TM ends in accepting state whenever $x \in L$

TM doesn't end in accepting state $x \notin L$

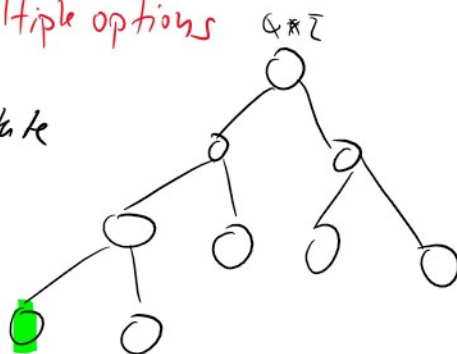


NTM - non-deterministic

$(Q \times \Sigma) \times (Q \times \{\leftarrow, \rightarrow, \emptyset\})$

\mathcal{P} multiple options

$x \in L \Rightarrow \exists$ accepting termination state

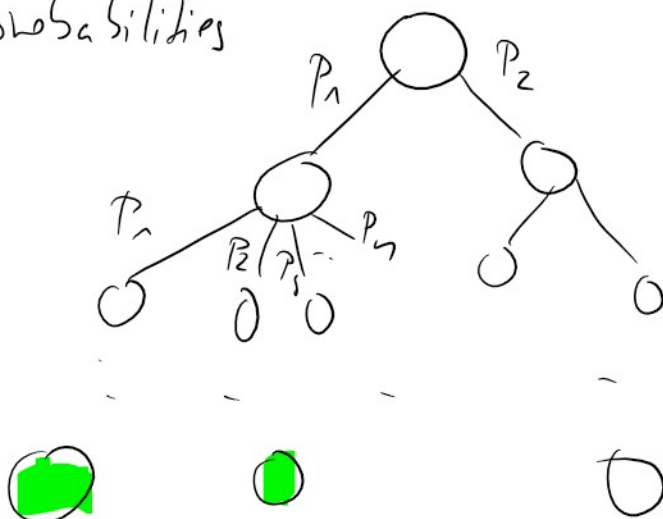


Probabilistic TM

\Rightarrow multiple rules for same (state, input)

but these are assigned probabilities

P_x to accept input x
is the total probability
to end in an accepting
state



\Rightarrow random polynomial



random polynomial



RP contains problems for which there exists
a TM (algorithm)

s.t. $x \in L : \Pr(TM(x) \text{ accepts}) \geq \frac{1}{2} \geq \epsilon > 0$

$x \notin L : \Pr(TM(x) \text{ accepts}) = 0$

Problems in RP have 1-sided MC-algorithms
with NO-bias.

co-RP contains problems for which there exists
a TM (algorithm)

s.t. $x \in L : \Pr(TM(x) \text{ accepts}) = 1$
 $x \notin L : \Pr(TM(x) \text{ accepts}) \leq \frac{1}{2} \leq \epsilon < 1$

Problems in co-RP have 1-sided MC-algorithms
with YES-bias

Probability amplification (in RP)

Let ... 1 ... that ... 1-MC with ...

We want to show that a ^{1-sided} 1-MC with NO-bias and probability of error δ can be used to construct 1-sided MC algorithm with $\epsilon \ll \delta$ error

$x \notin L$ if you run the algorithm k -times you will get k answers 'No'

$x \in L$ — 1 — k -times one answer 'YES' is enough to convince you you have yes instance.

$$\Pr \{x \in L, A^k(x) = \text{YES}\} \geq 1 - \delta^k$$

i.e. error of k -fold run is $\epsilon = \delta^k$

How many repetitions are needed to achieve target error ϵ .

$$\text{solve } \epsilon \geq \delta^k$$

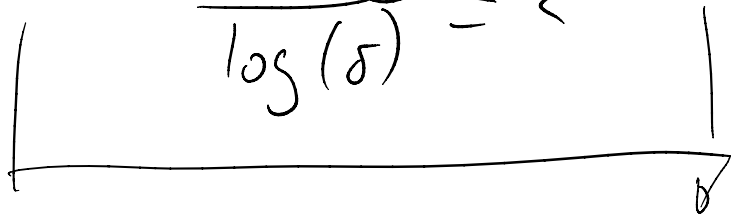
"approx" error $< \epsilon$

Solve $\epsilon \geq \delta^2$

$$\log \epsilon \geq \log \delta^2$$

$$\log \epsilon \geq 2 \log \delta$$

$$\frac{\log(\epsilon)}{\log(\delta)} \leq 2$$



$$\frac{\log(\epsilon)}{\log(\delta(n))} \leq 2(n)$$

\uparrow

$\frac{1}{\log(\delta(n))}$ is a polynomial in n

$\log(\delta(n))$ is an inverse polynomial

bounded probabilistic polynomial

BPP \rightarrow

$$\left. \begin{array}{l} x \in L : \Pr(\text{TM}(x) \text{ accepts}) \geq 3/4 \\ x \notin L : \Pr(\text{TM}(x) \text{ accepts}) < 1/4 \end{array} \right\} \text{arbitrary } \epsilon > 1/2$$

$\rightarrow d < 1/2$

$$\left\{ x \in L : P(\text{TM}(x) \text{ accepts}) < \frac{1}{4} \right\} \rightarrow \alpha < \frac{1}{2}$$

2-sided MC algorithm

Again polynomially many repetitions are enough to get arbitrarily small error \rightarrow Majority voting

\hookrightarrow repetitions



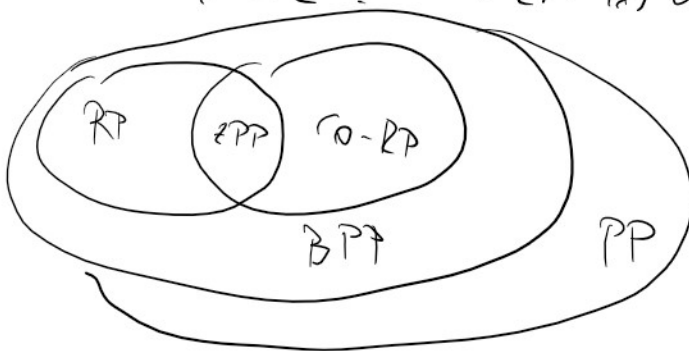
Answer = majority of answers

We need Chernoff bounds

for an easy proof \Rightarrow NEXT tutorial

$$\text{PP- } x \in L : \Pr\{\text{TM}(x) \text{ accepts}\} > \frac{1}{2} \quad \left(\frac{1}{2} + \frac{1}{2^n} \right)$$

$$x \notin L : \Pr\{\text{TM}(x) \text{ accepts}\} \leq \frac{1}{2}$$



ZPP = co-RP \cap RP \rightarrow associated to Las Vegas algorithms

0.) Problems in ZPP have both $A-MC$ with NO-Bias (AY)
and $A-MC$ with YES-Bias

1.) They have LV algorithm of type 1: (AN)



Always gives a correct answer
w.p. 1 and has expected
polynomial (in input size) running time

2.) They have LV algorithm of type 2:

Always polynomial running time
and it gives answer "I don't know"
w.p. $\leq \frac{1}{2}$

1.) \Rightarrow 2.) Run type 1 algorithm
and if the number of
steps exceeds $2E(n)$ then
terminate and output "I don't know"

2.) \Rightarrow 1.) Probability amplification

Run $LV_2 \rightarrow$ if it says "I don't know"

run it again (with different random choices)

0.) \Rightarrow 1.)

Run $A_Y(x)$ and if it says 'YES'
it is correct answer otherwise
run $A_N(x)$ if it says 'NO' it
is a correct answer otherwise

2.) \Rightarrow 0.)

1.) Run $L_{V_2}(x)$ if correct answer
is found give it as an output

2.) In case of "I don't know"

$A_Y(x) \rightarrow$ answer NO

$A_N(x) \rightarrow$ answer YES