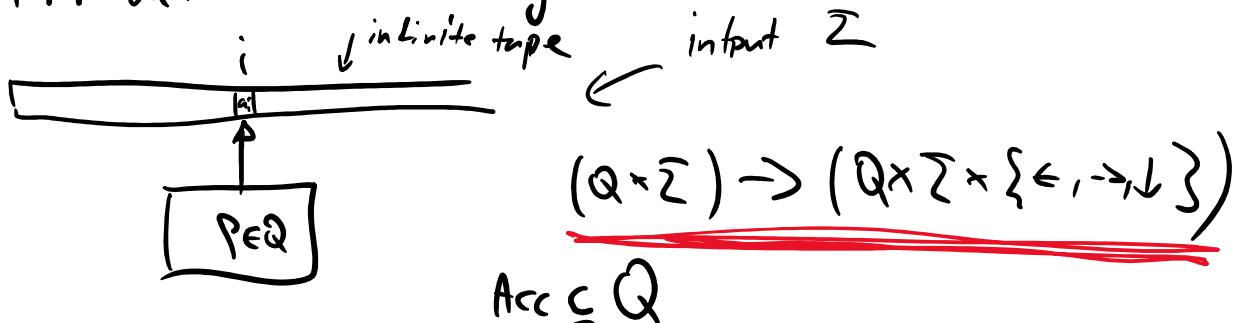


CLASSIFICATION OF RANDOMIZED ALGORITHMS

TURING MACHINE COMPLEXITY CLASSES

L_D Concerns decision problems

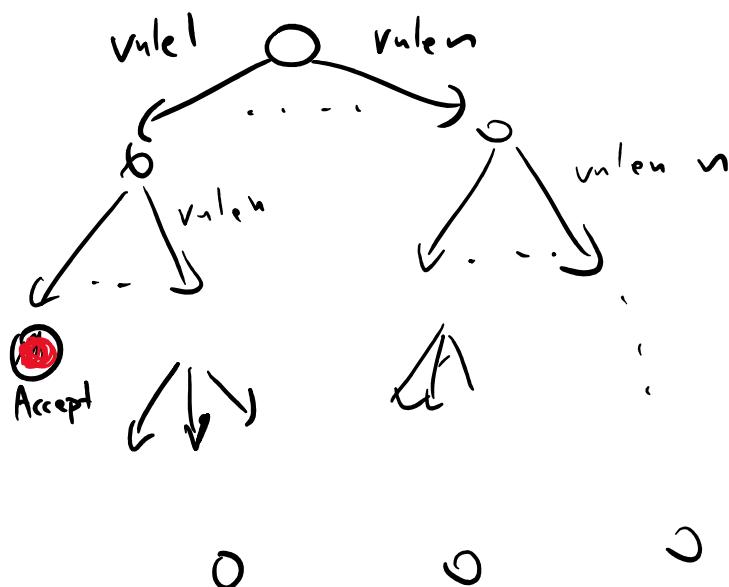
DTM - deterministic turing machine



$x \in L \rightarrow \text{TM finds Accepting state in polynomial time (P)}$

NTM - non-deterministic TM.

$(Q \times \Sigma) \times (Q \times \Sigma \times \{L, R, D\})$
 Informally multiple rules for the same input



$x \in L \rightarrow \exists$ accepting terminating state

PTM - probabilistic Turing Machine

it is NTM where choices of rules are assigned probabilities

Random polynomial

$$RP: x \in L : \Pr[\text{TM}(x) \text{ accepts}] \geq \frac{1}{2}$$

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

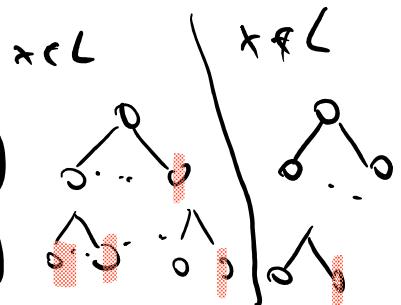


$$\text{co-RP: } x \in L : \Pr[\text{TM}(x) \text{ accepts}] = 1$$

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

$$\text{BPP: } x \in L : \Pr[\text{TM}(x) \text{ accepts}] \geq \frac{3}{4} \quad (\frac{1}{2} + \epsilon)$$

$$x \notin L : \Pr[\text{TM}(x) \text{ accepts}] \leq \frac{1}{4} \quad (\frac{1}{2} - \epsilon)$$



$$\text{PP: } x \in L : \Pr[\text{TM}(x) \text{ accepts}] \geq \frac{1}{2} \quad (\frac{1}{2} + \frac{1}{2^n})$$

$$x \notin L : \Pr[\text{TM}(x) \text{ accepts}] \leq \frac{1}{2} \quad (\frac{1}{2} - \frac{1}{2^n})$$

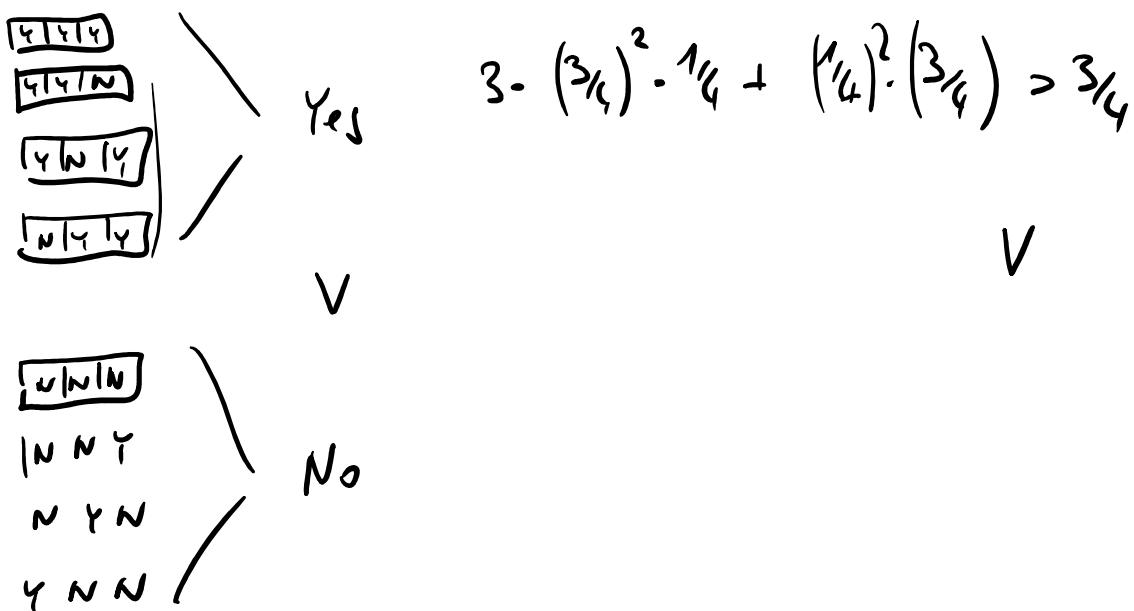
size of the input

Run PTM on the same input x $2N+1$ times

and output the answer that appears at least $N+1$ times
(Majority voting).

$$\boxed{x \in L} \begin{cases} \text{Yes} & \frac{3}{4} \\ \text{No} & \frac{1}{4} \end{cases}$$

$x \in L$



For chosen confidence level (probability of correct answer)
how many repetitions are needed?

BPP - polynomially many in n
PP - can be exponential in n } formally with Chernoff bounds next week

$$\text{BPP} = \text{co-RP} \cap \text{RP}$$

Classification without TM \rightarrow works for functions as well

Las Vegas algorithm:

Two flavours:

- 1.) Always polynomial time, answer is correct
or "I don't know" with bounded probability

2.) Answer is always correct and runs in expected polynomial time

Why are those equivalent?

$2 \Rightarrow 1$

if runs too long stop and say "I don't know".

"Expected polynomial" \Rightarrow Vast majority of calculations are "short"
 \downarrow
 taken over various choices

$1 \Rightarrow 2$ Probability amplification

Let $0 < \varepsilon < \delta < 1$

$$\Pr(LV(x) \text{ gives answer}) = \varepsilon$$

$$\Pr(LV(x) = ??) = 1 - \varepsilon$$

How many repetitions are needed for

$$\Pr(\{LV(x)\}^k \text{ gives answer}) \geq \delta ?$$

$\{LV(x)\}^k \rightarrow$ run LV k times and give an answer if found

$\{LV(x)\}^k = ??$ only if all k runs did not find an answer

$$\Pr[\{LV(x)\}^k = ??] = (1 - \varepsilon)^k$$

$$\Pr[\{LV(x)\}^k = \text{answer}] = 1 - (1 - \varepsilon)^k$$

$$1 - (1-\varepsilon)^\ell \geq \delta$$

$$(1-\delta) \geq (1-\varepsilon)^\ell \quad / \log$$

$$\log(1-\delta) \geq \log(1-\varepsilon)^\ell$$

$$\log(1-\delta) \geq \ell \underbrace{\log(1-\varepsilon)}$$

$$\frac{\log(1-\delta)}{\log(1-\varepsilon)} \leq \ell \rightarrow \text{negative}$$

$$n_4 \leq \frac{1}{2} \quad / \log$$

$$-2 \leq -1$$

for $\varepsilon = f(n)$ ℓ depends on n and amplification might not be efficient!

\downarrow
size of the input

If LV algorithm is calculating a decision problem
then problem is in $\text{ZPP} = \text{co-RP} \cap \text{RP}$

RP - Yes answer is always correct in poly-time
 co-RP - No answer is always correct in poly-time

RP implies
 $\overline{\text{TM}}_1(x) \rightarrow \begin{cases} x \in L & \Pr(\text{YES}) \geq \frac{1}{2} \\ x \notin L & \Pr(\text{NO}) = 1 \end{cases} \quad \Pr(\text{YES}) = \frac{1}{2}$

co-RP implies

$$\overline{\text{TM}}_2(x) \rightarrow \begin{cases} x \in L & \Pr(\text{YES}) = 1 \\ x \notin L & \Pr(\text{NO}) = 0 \end{cases}$$

$$\Pr(\text{NO}) \geq \frac{1}{2} \quad \Pr(\text{YES}) \leq \frac{1}{2}$$

Run $\text{TM}_1(x)$ and if YES, say YES

if NO run $(\text{TM}_2(x)$ and if NO) say NO

if No run($T_{M_2}(z)$) and if $\overbrace{\text{NO}}$ say NO

1-MC algorithms \rightarrow these are defined for decision problems only

all problems in RP have 1-MC algorithm

2-MC algorithms correct calculation of function w.p. $\geq \frac{3}{4}$
incorrect calculation of function w.p. $< \frac{1}{4}$

if function calculates a decision problem

all problems in BPP have 2-MC algorithm

UMC algorithms \rightarrow defined for functions

correct calculation of function w.p. $> \frac{1}{2}$
incorrect calculation of function w.p. $< \frac{1}{2}$

if function is calculating a decision problem

all problems in PP have UMC algorithms