

Lower Bounds

let P be a Problem, i.e. the set of all instances of a Problem.

Two goals:

1. find an algorithm that solves P , also find an upper bound $O(f(n))$ on its runtime. we wish to reduce $f(n)$ as much as possible.

2. Prove that any algorithm solving P runs in time $\Omega(g(n))$. We wish to increase $g(n)$ as much as possible.

Happy when $f(n) \sim g(n)$, or at least $f(n) = \Theta(g(n))$.

Two kinds of L.B.s

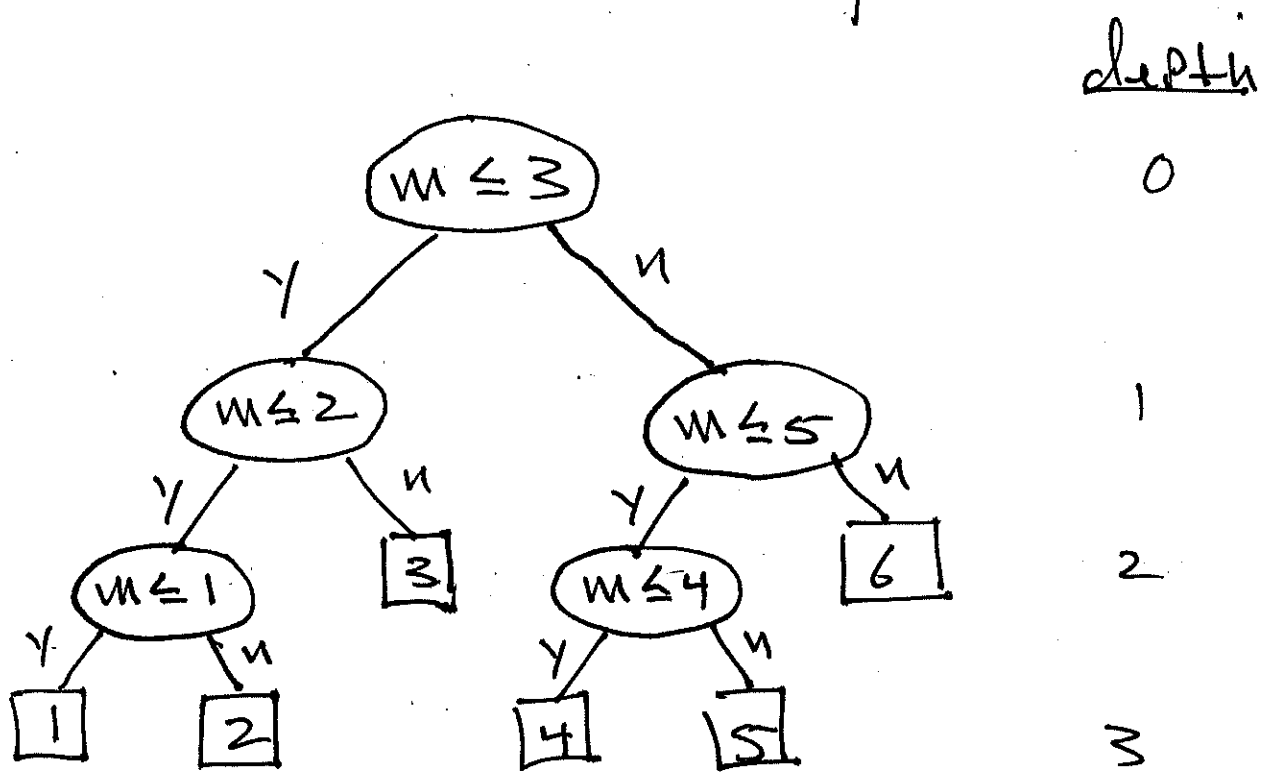
- Decision tree L.B.s (information theoretic.)
- Adversary arguments.

Ex.

Game:

- (1) I think of $m \in \{1, 2, 3, 4, 5, 6\}$
- (2) you try to guess it, by asking only yes/no questions

To play (2) use 'binary search'



Decision tree ↗

conclude: at most 3 questions
are necessary. Also the
average # of questions is

$$\frac{2+2+3+3+3+3}{6} = \boxed{2.66}$$

Definitions

rooted tree: tree with distinguished
vertex called root.

node = vertex.

depth of a node: distance from
root.

Parent of a node x : unique node
on path from root to x , with depth 1 less.

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a child of x : a node having
 x as parent.

a leaf: a node having ^{no}
children. an internal node: ^{non-}leaf

k -ary tree: all nodes have
at most k children.

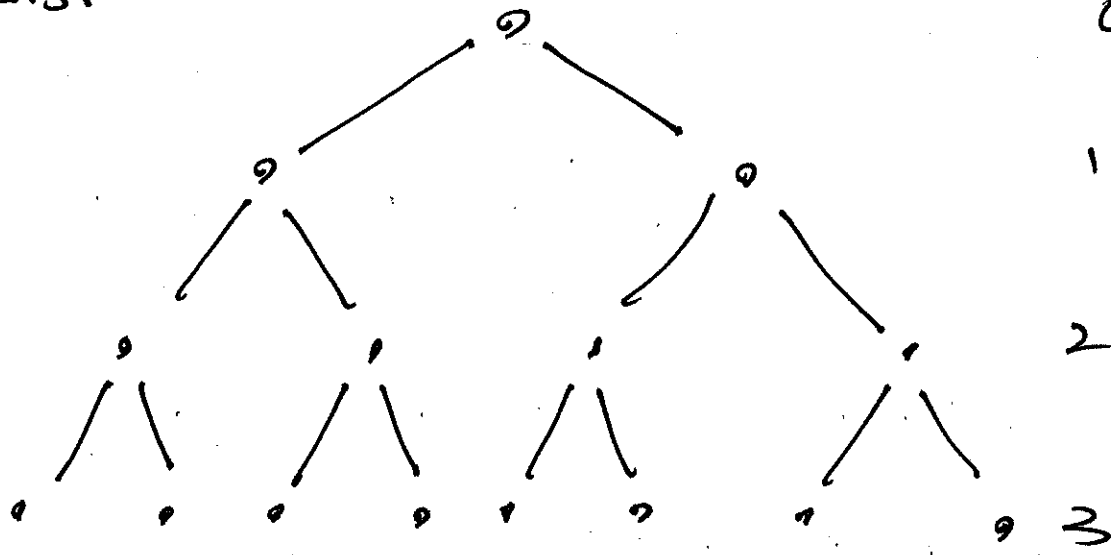
Complete Binary tree (CBT)

- all leaves at same depth

• every internal node has exactly
 ≥ 2 children

likewise for complete k -ary trees.

EBT



depth #nodes 16

0	1
1	2
2	4
3	8

$$(\text{\# nodes at depth } d) = 2^d$$

Height of a rooted tree: depth of deepest leaf.

If a EBT has height h ,
and n leaves,

then $n = 2^h$, so

$$h = \lfloor \lg(n) \rfloor$$

Also CBT's have minimum possible height among all BT's having same # of leaves.

Theorem

Let T be a binary tree with n leaves and height h . Then

$$h \geq \lceil \lg(n) \rceil$$

Proof.

let $L(T)$, $H(T)$ denote # leaves
height of T (resp.).

use induction on $h = H(T)$.

\Rightarrow if $h=0$, then T has
just 1 node, the root, which
is a leaf. $\therefore n = L(T) = 1$ and

$$h \geq \lceil \lg(n) \rceil$$

because

$$0 \geq 0$$

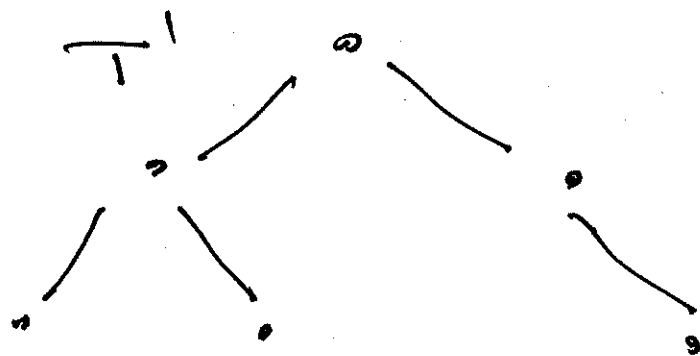
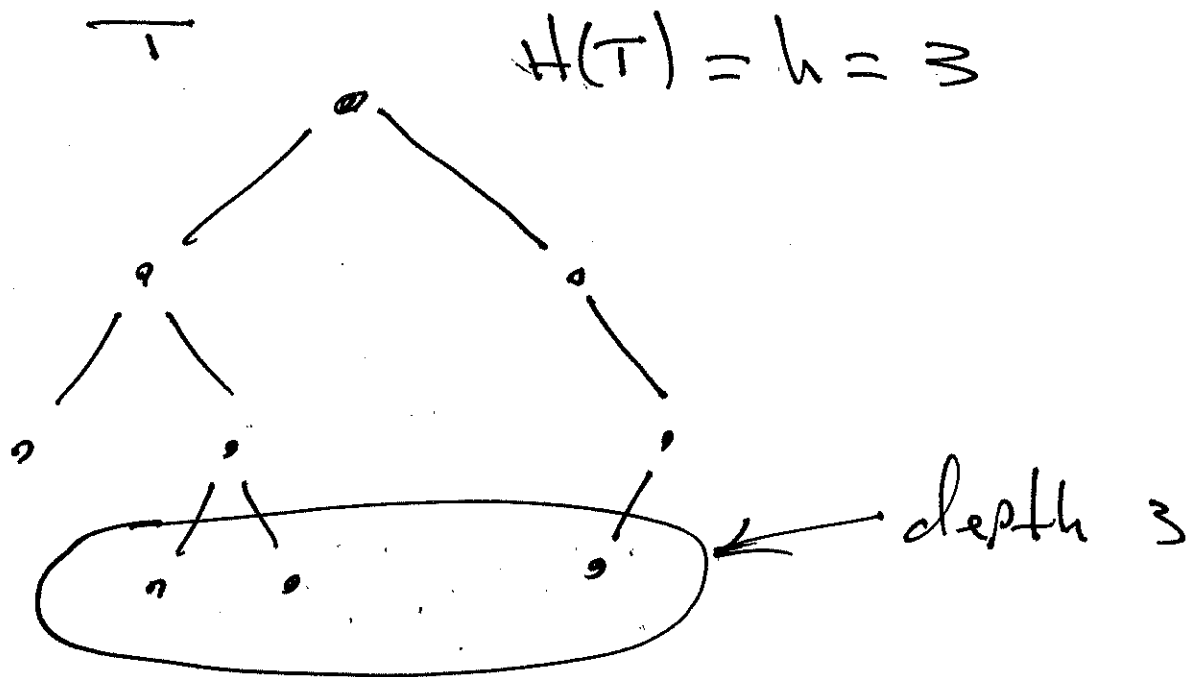
which is true.

II. Let $h > 0$. Assume for any B.T. T' with $H(T') = h-1$ that $H(T') \geq \lceil \lg(L(T')) \rceil$, we must show that if T is a B.T. with $H(T) = h$ and $L(T) = n$, then

$$h \geq \lceil \lg(n) \rceil.$$

Let T be a B.T. with height h and n leaves.

Let T' be the tree obtained by deleting all leaves in T at depth h .



$$H(T') = 2$$

Then $H(T') = h-1$. By ind. hyp.

$$H(T') \geq \lceil \lg(L(T')) \rceil$$

Also since T is a binary tree each node has at most 2 children, hence

$$L(T) \leq 2L(T')$$

$$\therefore L(T') \geq \frac{L(T)}{2}$$

Thus

$$h-1 = H(T')$$

$$\geq \lceil \lg(L(T')) \rceil$$

by ind. hyp.

$$\geq \left\lceil \lg \left(\frac{L(T)}{2} \right) \right\rceil$$

$$= \left\lceil \lg(L(T)) - 1 \right\rceil$$

$$= \left\lceil \lg(L(T)) \right\rceil - 1$$

$$= \left\lceil \lg(n) \right\rceil - 1$$

$$\therefore h \geq \left\lceil \lg(n) \right\rceil$$

~~□~~

Exercise:

let T be a k -ary tree with n leaves & height h .

Prove $h \geq \left\lceil \log_k(n) \right\rceil$.

Given Problem \mathcal{P} , consider all algorithms that solve \mathcal{P} by asking a seq. of k -ary questions (Probes), i.e. questions having at most k answers.

Let n denote size of an instance of \mathcal{P} , and let $f(n)$ denote the number of probes that \mathcal{A} that size.

Any algorithm for \mathcal{P} can be represented by a k -ary decision tree.

The internal nodes are
 k -ary probes of input data,
 leaves are verdicts.

every descending path from
 root to leaf is a poss.

execution seq. of questions.

Note: cannot have fewer leaves
 than verdicts, i.e.

$$\# \text{leaves} \geq f(n)$$

So in this tree T :

$$f(n) \leq L(T).$$

By the exercise

$$h \geq \lceil \log_k(L(T)) \rceil = \lceil \log_k(f(n)) \rceil.$$

we've proved:

Theorem

If \mathcal{P} has $f(n)$ pos. verdicts on input of size n , then no algorithm for \mathcal{P} that performs only k -ary probes, can perform fewer than $\lceil \log_k(f(n)) \rceil$ such probes in worst case,

i.e. $\lceil \log_k f(n) \rceil$ is a lower bound on run time of such an algorithm.

$$\lceil \log_k f(n) \rceil = \Theta(\log f(n))$$

Important Note: all this

does not imply that such an algorithm exists. It only says no algorithm doing fewer than $\lceil \log_k f(n) \rceil$ k -ary probes does exist.

Ex. guess $m \in \{1, 2, 3, 4, 5, 6\}$
using yes/no questions.

$$k = 2$$

$$n = 6$$

$$f(n) = 6$$

$$\therefore \# \text{ questions} \geq \lceil \log_2(6) \rceil = 3$$

Ex guess $m \in \{1, 2, \dots, 10^6\}$
using y/n questions

$$\# \text{ questions} \geq \lceil \log_2(10^6) \rceil = 20$$

Ex. guess $m \in \{1, \dots, 10^6\}$
 using 3-way questions.

$$\# \text{questions} \geq \lceil \log_3(10^6) \rceil = 13$$

Theorem

Any comparison based algorithm must do, in worst case, at least $\lceil \lg(n!) \rceil$ comparisons on input arrays of length n .

$$\# \text{comp} \geq \lceil \lg(n!) \rceil$$

$$\begin{aligned} \text{asympt. lower bound} &= \Theta(\lg(n!)) \\ &= \Theta(n \lg n), \end{aligned}$$