

CS2700: PROGRAMMING AND DATA STRUCTURES.

WEEK 13

SORTING ALGORITHMS (continued)

## ANALYSIS OF QUICKSORT.

RECALL QUICK SORT :

- (1) select a pivot
- (2) Partition using the pivot
- (3) Recursively sort left and right parts.

Recurrence relation :

$$T(n) = T(i) + T(n-i-1) + Cn$$

$i$  = size of one of the parts.

We have seen best case and worst case analysis.

## AVERAGE CASE ANALYSIS OF QUICKSORT.

$$T(n) = T(i) + T(n-i-1) + cn$$

What are the different values that  $i$  can take?

$$i = 0, 1, 2, \dots$$

each of them is equally likely

## AVERAGE CASE ANALYSIS OF QUICKSORT.

$$T(n) = T(i) + T(n-i-1) + cn$$

$$T(n) = \frac{1}{n} \sum_{i=0}^{n-1} [T(i) + T(n-i-1)] + cn$$

$$= \frac{2}{n} [T(0) + T(1) + T(2) + \dots + T(n-1)] + cn$$

# AVERAGE CASE ANALYSIS OF QUICKSORT.

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$$T(n) = \frac{1}{n} \sum_{i=0}^{n-1} [T(i) + T(n-i-1)] + cn$$

$$= \frac{2}{n} [T(0) + T(1) + T(2) + \dots + T(n-1)] + cn$$

$$n T(n) = 2 [T(0) + T(1) + \dots + T(n-1)] + cn^2 \quad \left. \vphantom{n T(n)} \right\} A$$

$$(n-1) T(n-1) = 2 [T(0) + T(1) + \dots + T(n-2)] + c(n-1)^2 \quad \left. \vphantom{(n-1) T(n-1)} \right\} B$$

## AVERAGE CASE ANALYSIS OF QUICKSORT.

$$\begin{aligned}nT(n) - (n-1)T(n-1) &= 2T(n-1) + 2cn - c \\ &= 2T(n-1) + 2c'n\end{aligned}$$

$$nT(n) = (n+1)T(n-1) + 2c'n$$

$$\frac{T(n)}{(n+1)} = \frac{T(n-1)}{n} + \frac{2c'}{(n+1)}$$

Telescoping

$$\frac{T(n)}{n+1} - \frac{T(n-1)}{n}$$

# AVERAGE CASE ANALYSIS OF QUICKSORT.

$$\frac{T(n)}{(n+1)} - \frac{T(n-1)}{n} = \frac{2c'}{(n+1)}$$

$$\frac{T(n-1)}{n} - \frac{T(n-2)}{n-1} = \frac{2c'}{n}$$

⋮

$$\frac{T(n)}{(n+1)} - \frac{T(0)}{1} = \frac{2c'}{(n+1)} + \frac{2c'}{n} + \dots + \frac{2c'}{2} =$$

$$= 2c' \left[ \frac{1}{n+1} + \frac{1}{n} + \dots + \frac{1}{1} \right] \approx \underbrace{H_{n+1}}_{\substack{\text{Harmonic} \\ \#}} \cdot 2c'$$

## QUICK SORT : SUMMARY.

- A recursive sorting algorithm
- Running time depends on selection of pivot.

• Worst case  $O(n^2)$

Average case  $O(n \log n)$

Has fast implementations in practice.

what is special about  $O(n \log n)$ ?

w.r.t sorting algos.

Can we do better?

how do we know we have reached the  
limit?

What is the limit?

- lower bounds allow to address this

## A general lower bound on sorting

**Claim:** Any sorting algo that uses comparisons only **requires**  $\lceil \log N! \rceil$  comparisons in the worst case

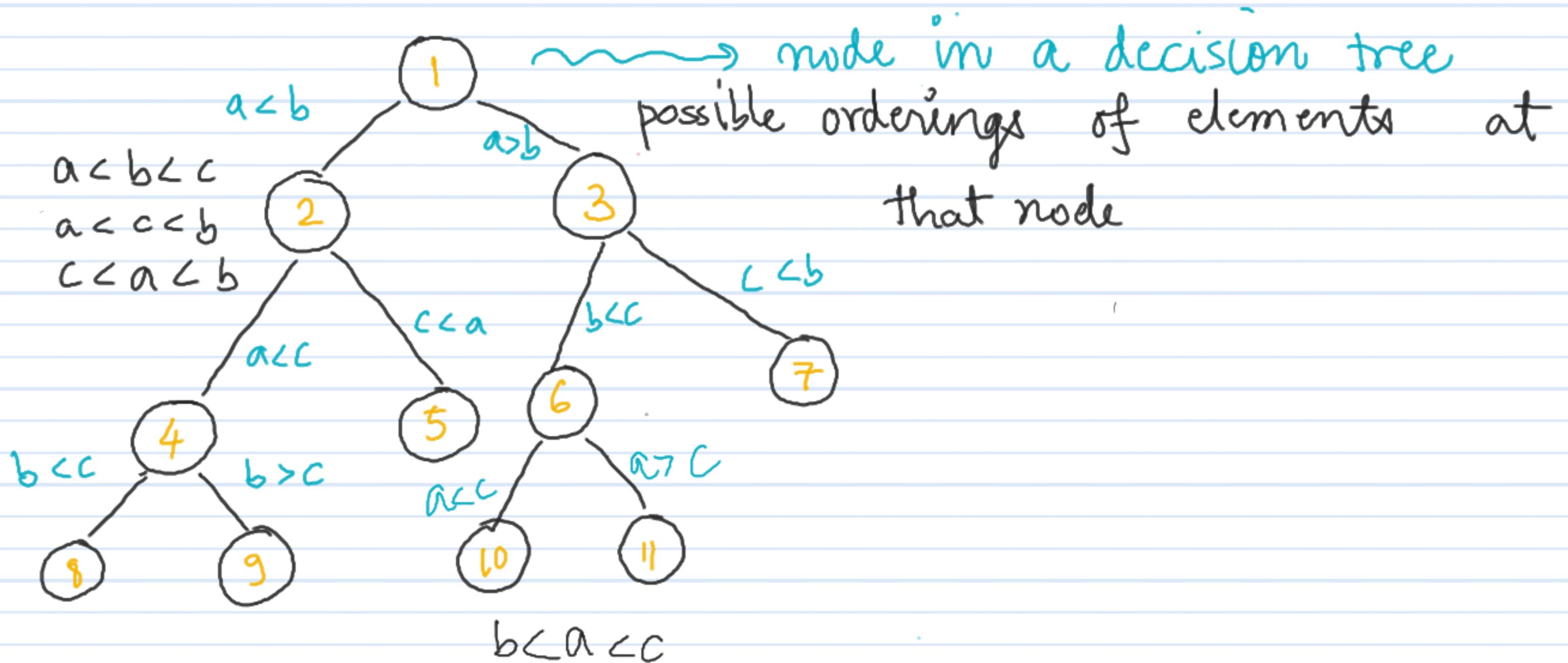
- such algos are called comparison based sorting  
algos

selection sort, mergesort, quicksort, bubble sort

heap sort all fall under this category

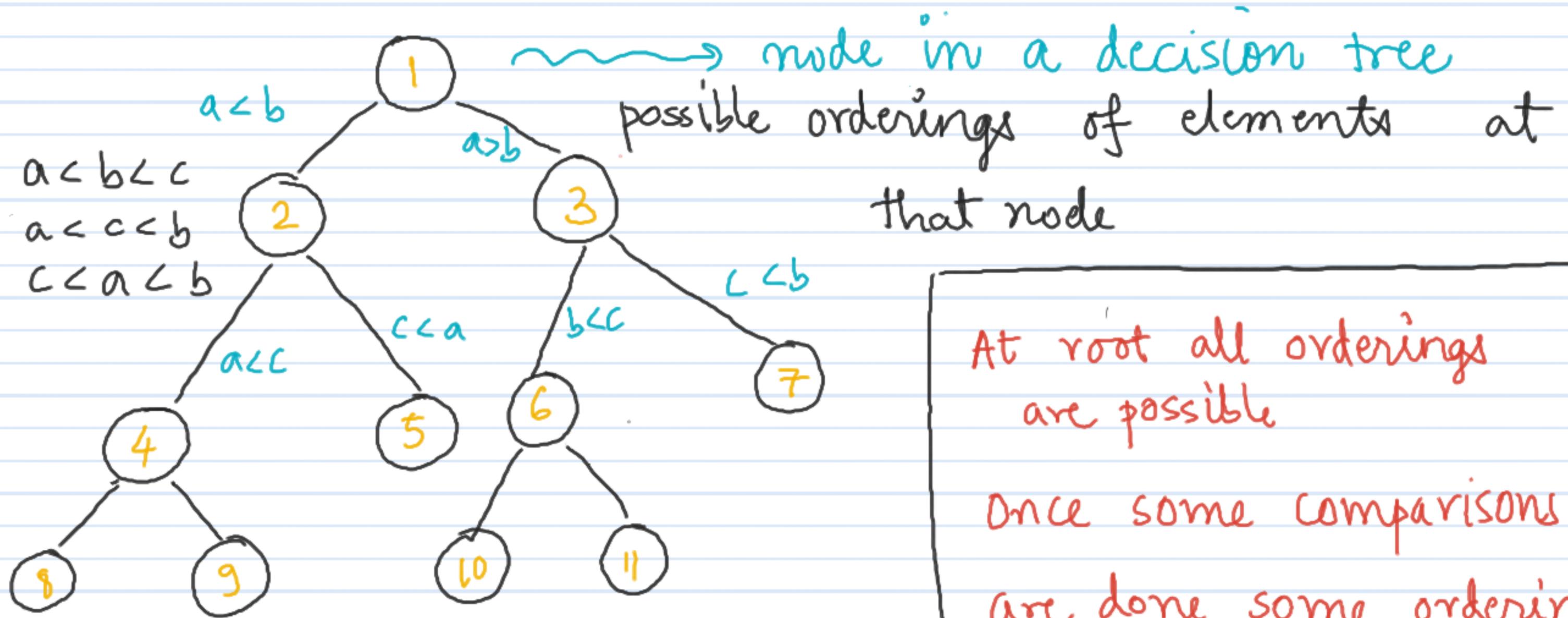
(Binary)

Decision tree : An abstraction for proving lower bounds.



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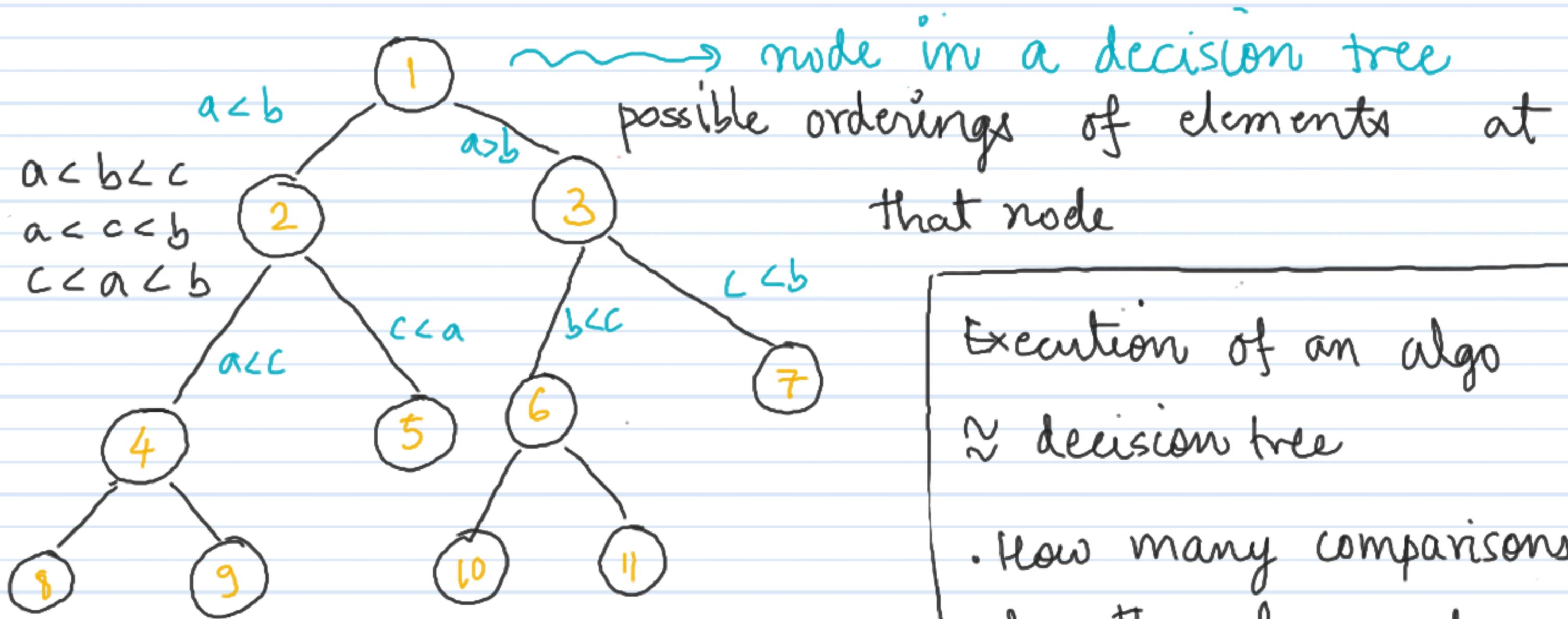


At root all orderings are possible

Once some comparisons are done some orderings are eliminated

(Binary)

Decision tree : An abstraction for proving lower bounds.



Execution of an algo  
 $\approx$  decision tree

• How many comparisons does the algo need?

Proving lower bound using DT.

Claim 1: Let  $T$  be a binary tree of depth  $d$ .

# of leaves in  $T$ 's  $\leq \underline{2^d}$

Claim 2: A binary tree with  $L$  leaves has depth  
at least  $\underline{\lceil \log L \rceil}$

Claim 3: A decision tree to sort  $N$  elements has  $N!$   
leaves.

How does freq based algo (counting sort)

sort in linear time?

Let  $B$  denote the freq array of size  $M$

• The sorting algo uses the following operation

$B[A[i]]++;$

• This operation is more powerful since  
it performs an  $M$ -way comparison in

unit time

- does not contradict the  $\Omega(n \log n)$  lower bound.

## # of Inversions in input

34, 8, 64, 51, 32, 21 } # of inversions = 9

8, 34, 64, 51, 32, 21 } # of inversions = 8

What is an inversion?

- a pair  $(i, j)$  s.t.

$$i < j \text{ and } A[i] > A[j]$$

How many inversions are present in above example?

Sorted Array : # of inversions!

## # of Inversions in input

$\left. \begin{array}{l} 34, 8, 64, 51, 32, 21 \\ 8, 34, 64, 51, 32, 21 \end{array} \right\} \# \text{ of inversions} = 9$   
 $\left. \begin{array}{l} 8, 34, 64, 51, 32, 21 \end{array} \right\} \# \text{ of inversions} = 8$

Inversions :  $(34, 8)$   $(34, 32)$   $(34, 21)$   $(64, 51)$   $(64, 32)$   $(64, 21)$   
 $(51, 32)$   $(51, 21)$   $(32, 21)$

In blue array : all above inversions except  $(34, 8)$  remain as it is,  
(obtained by swapping adjacent elements)

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Inversions :  $(21, 8)$   $(64, 51)$   $(64, 32)$   $(64, 34)$  } obtained by swapping non adjacent elements  
 $(51, 32)$   $(51, 34)$  } blue underlined ones are new inversions.

## Average # of Inversions in input

34, 8, 64, 51, 32, 21

How many permutations?  $P_1, P_2, P_3 \dots P_k$

$$\left. \begin{array}{l} \text{average} \\ \# \text{ of inversions} \\ \text{is} \end{array} \right\} = \frac{1}{k} [ I(P_1) + I(P_2) + \dots + I(P_k) ]$$

How to determine  $I(P_j)$ ?

Average # of Inversions in input

1 2 3 4 5 6  
34, 8, 64, 51, 32, 21

$P_j$

21, 32, 51, 64, 8, 34

$P_j'$

For any 2 elements say (34, 51)

They are inverted in either  $P_j$  or  $P_j'$

Between  $P_j$  and  $P_j'$  # of inversions is \_\_\_\_\_

# Average # of Inversions in input

34, 8, 64, 51, 32, 21

How many permutations?  $P_1, P_2, P_3, \dots, P_k$

average # of inversions is

$$\left. \right\} = \frac{1}{\cancel{k} n!} [ I(P_1) + I(P_2) + \dots + I(P_k) ]$$

*find its pair*

$$= \frac{1}{n!} \left[ \frac{n(n-1)}{2} \times \frac{n!}{2} \right]$$

$$= n(n-1)/4.$$