

- Let P be some problem...
- ALGORITHM COMPLEXITY - given a specific algorithm A that solves P , what is the cost of running A ?
- PROBLEM COMPLEXITY - what is the cost of solving P ?
↳ "using the best possible algorithm"

Ex. • P = sorting n integers.

- HEAPSORT, MERGESORT solve P in $O(n \log n)$ key comparisons
- ⊗ Can we do better?... Any comparison-based algorithm that solves P takes $\Omega(n \log n)$ key comparisons
- Then the above algorithms are optimal.

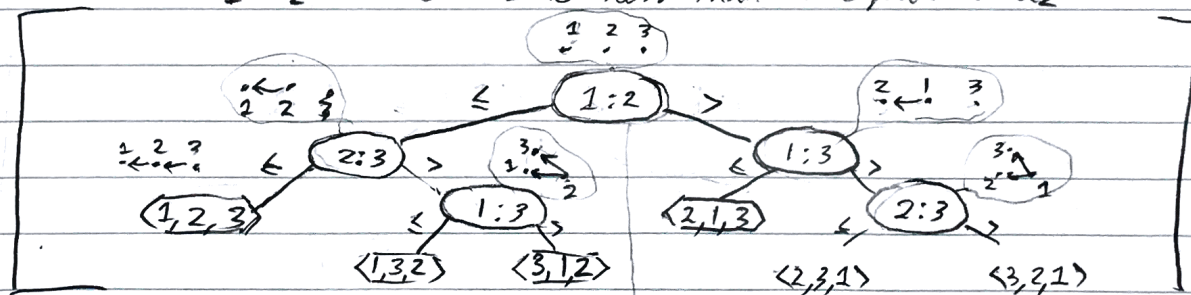
- Today, we will prove that ⊗ is true.

• Use decision-trees to model behaviour of algorithms

Ex. Insertion sort, 3 elements. // Recall: insertion sort algo.

- Notation: $(1:2)$ means compare a_1 with a_2 .

$i \leftarrow_2$ means a_2 is less than or equal to a_i



- Any comparison-based algorithm can be modelled with a decision tree
- Max # comparisons = worst case run time = height of tree
- 6 leafs = $3! = 3!$; n permutations of input $\rightarrow n$ ways to unscramble
 - Any comparison based algo on input of size n requires $n!$ leafs
 - to have $n!$ leafs, tree must have height $\log_2 n!$
 - \therefore worst-case # of comparisons any comp-based algo = $\log_2 n!$

Theorem: Every comparison-based algorithm A to sort n integers takes $\Omega(n \log n)$ key comparisons in the worst case.

Proof:

- Let A be any comparison-based algorithm to sort n integers.
- Let T_A be the decision tree that models A .

① For each input permutation of integers $1, 2, \dots, n$, T_A must have at least one distinct leaf that sorts this permutation
 $\Rightarrow \therefore \boxed{A} \quad |leaves(T_A)| \geq n!$

② Let h be the height of T_A . Since T_A is a binary tree, we have $\boxed{B} \quad |leaves(T_A)| \leq 2^h$

• Together: $n! \leq |leaves(T_A)| \leq 2^h \rightarrow n! \leq 2^h \equiv 2^h \geq n!$

$$\therefore \log_2(2^h) \geq \log_2(n!) \therefore h \geq \log_2(n!)$$

• Note: $\log_2(n!) \in \Theta(n \log n)$; see Eq 3.19 Pg. 58 CLRS

• Then we know the lower bound on the worst case of any comparison-based algo (height of tree) is at least $\in \Theta(n \log n)$.

From this we know heapsort, mergesort are optimal