

# CSC 226

Algorithms and Data Structures: II

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ECS 516

# How fast can we sort? A lower bound for comparison based sorting

- We prove: using a comparison based sorting algorithm, we cannot do better than  $O(n \log(n))$  worst case time complexity
- Therefore,  $\Omega(n \log(n))$  denotes the **lower bound** for comparison based sorting

**Theorem:** No comparison based sorting algorithm for  $n$  distinct elements has a worst case running time that is better than  $O(n \log n)$

Proof:

- Consider a sequence  $S$  containing  $n$  distinct elements, say  $x_0, x_1, x_2, \dots, x_{n-1}$
- To decide the order of elements, a comparison-based algorithm compares elements pairwise—a sufficient number of times
- In particular, to decide which element of  $x_i$  and  $x_j$  is smaller, it answers “is  $x_i < x_j$ ?”
- Depending on the outcome—i.e., yes or no—the algorithm performs either no further comparisons or it continues with more comparisons

# Proof (continued)

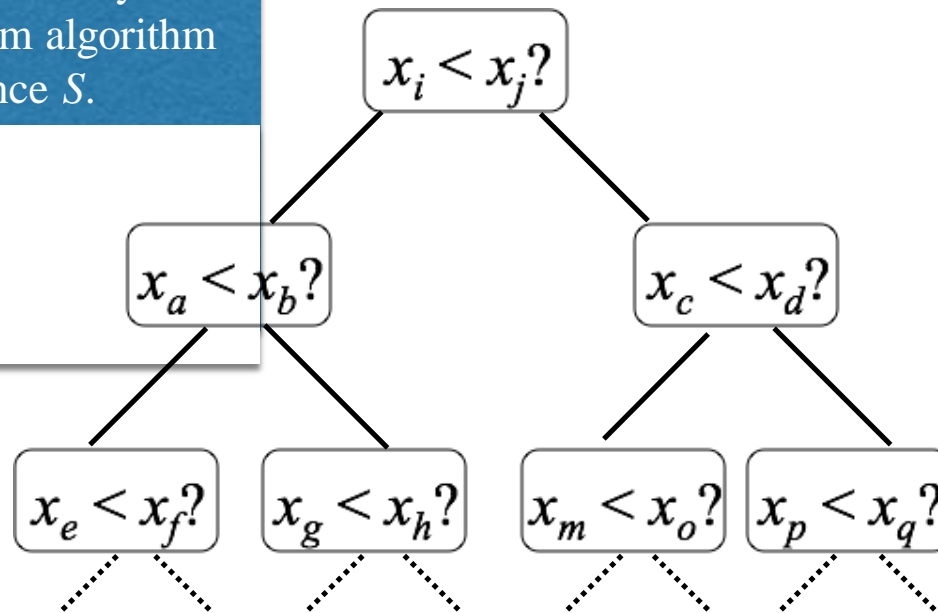
- We want to know: how good is the best of all comparison-based sorting algorithms? (Let's call it the *optimal* algorithm)
- This optimal sorting algorithm requires a certain number of comparisons (at least) to sort *any* sequence (not just the easiest input)
- We ask: How many comparisons are required for an optimal sorting algorithm to sort  $n$  elements?

# Proof (continued)

- How many comparisons are required for an optimal sorting algorithm to sort  $n$  elements?
- We consider our sequence  $S: x_0, x_1, x_2, \dots, x_{n-1}$
- The optimal algorithm will pick two elements for a first comparison, and, based on the outcome choose a second, etc.
- This can be depicted in a decision tree

# Decision tree of an optimal sorting algorithm that is sorting a general sequence of elements

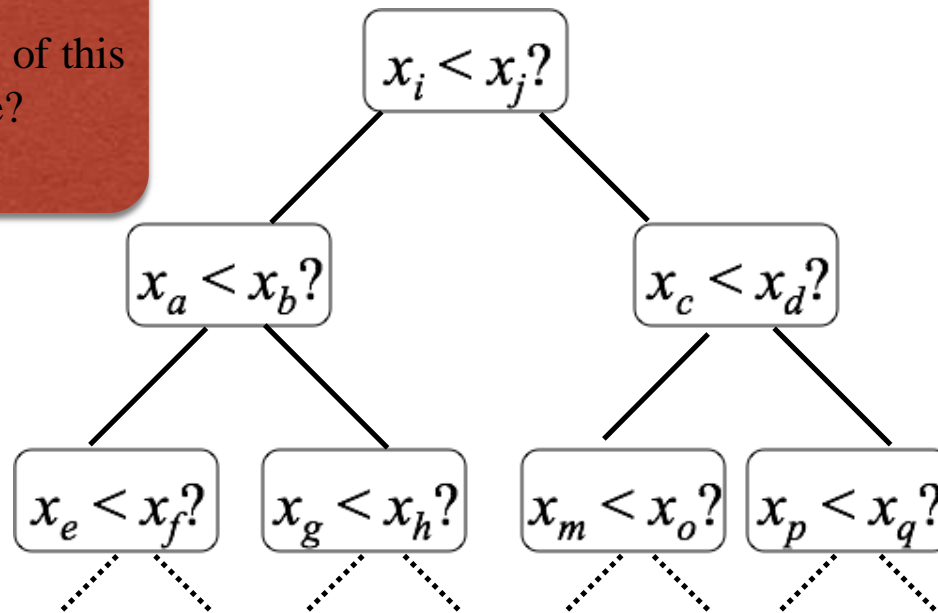
- The decision tree contains every possible path the optimum algorithm might take to sort sequence  $S$ .
- How many leaves does the tree have at least?



Since we don't know what  $S$  looks like, any permutation of  $S$  could be the sorted one. Thus, every permutation of  $S$  has to be represented by a path from the root to a leaf in the decision tree. Therefore:

# Decision tree of an optimal sorting algorithm sorting a general sequence of elements

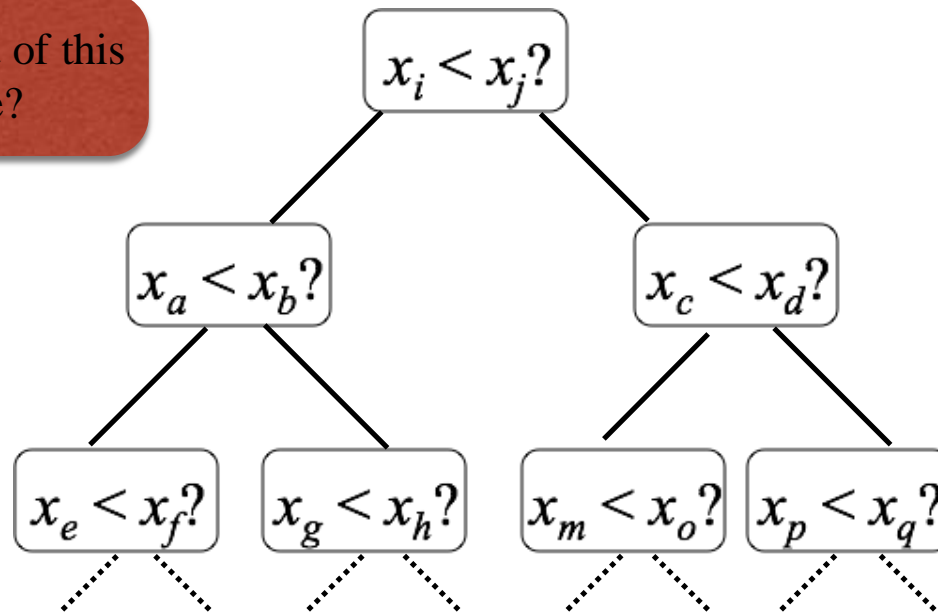
What is the height of this  
decision tree?



# leaves  $\geq n!$

# Decision tree of an optimal sorting algorithm sorting a general sequence of elements

What is the height of this  
decision tree?



- # leaves  $\geq n!$
- tree is binary
- height is  $\geq \log(n!)$ ; can't be less, since the shortest binary tree that has  $n!$  leaves has a height of  $\log(n!)$  [definition of log]



# Proof (continued)

- Since the height of the tree is at least  $\log(n!)$ , we know that
  - at least  $\log(n!)$  worst case comparisons are required by an optimal comparison based sorting algorithm
  - at least  $\log(n!)$  worst case comparisons are required by any comparison based algorithm

# Proof (continued)

- What is  $\Omega(\log(n!))$ ?
- $$\begin{aligned}\log(n!) &\geq \log(n \cdot (n-1) \cdot (n-2) \cdot \dots \cdot 3 \cdot 2 \cdot 1) \\ &\geq \log(n \cdot (n-1) \cdot (n-2) \cdot \dots \cdot (n/2) \cdot \dots \cdot 3 \cdot 2 \cdot 1) \\ &\geq \log((n/2) \cdot \dots \cdot (n/2)) \\ &\geq \log((n/2)^{(n/2)}) = (n/2) \log(n/2)\end{aligned}$$
- and therefore  $\log(n!) \in \Omega(n \log(n))$
- We conclude: there is no comparison-based sorting algorithm that has a worst-case time complexity that is better than  $O(n \log(n))$