### **Comparison-based algorithms**

Finished looking at comparison-based sorts.
Crucial observation: All the sorts work for any set of elements – numbers, records, objects,.....
Only require a comparator for two elements.

#include <stdlib.h>

void qsort(void \*base, size\_t nmemb, size\_t size, int(\*compar)(const void \*, const void \*));

DESCRIPTION: The qsort() function sorts an array with *nmemb* elements of *size* size. The base argument points to the start of the array.

The contents of the array are sorted in ascending order according to a comparison function pointed to by *compar*, which is called with two arguments that point to the objects being compared.

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## **Comparison-based algorithms**

- The algorithm only uses the results of comparisons, not values of elements (\*).
- Very general does not assume much about what type of data is being sorted.
- However, other kinds of algorithms are possible!
- In this model, it is reasonable to count #comparisons.
- Note that the #comparisons is a **lower bound** on the running time of an algorithm.

(\*) If values are used, lower bounds proved in this model are not lower bounds on the running time.

Lower bound for a simpler problem Let's start with a simple problem.

Minimum of n numbers

Minimum (A)

- 1. min = A[1]
- 2. for i = 2 to length[A]
- 3. do if min >= A[i]
- 4. then min = A[i]

5. return min

# **Can we do this with fewer comparisons?**

We have seen very different algorithms for this problem. How can we show that we cannot do better by being smarter?

### **Lower bounds for the minimum**

Claim: Any comparison-based algorithm for finding the minimum of n keys must use at least <u>n-1 comparisons</u>.

Proof: If x,y are compared and x > y, call x the <u>winner</u>.

- Any key that is not the minimum must have won at least one comparison. WHY?
- Each comparison produces exactly one winner and at most one NEW winner.

 $\Rightarrow$ at least n-1 comparisons have to be made.

# **Points to note**

Crucial observations: We proved a claim about ANY algorithm that only uses comparisons to find the minimum. Specifically, we made no assumptions about

- 1. Nature of algorithm.
- 2. Order or number of comparisons.
- 3. Optimality of algorithm
- Whether the algorithm is reasonable e.g. it could be a very wasteful algorithm, repeating the same comparisons.

# **On lower bound techniques**

Unfortunate facts:

- Lower bounds are usually hard to prove.
- Virtually no known general techniques must try ad hoc methods for each problem.

## Lower bounds for comparison-based sorting

- Trivial:  $\Omega(n)$  every element must take part in a comparison.
- Best possible result  $\Omega(n \log n)$  comparisons, since we already know several O(n log n) sorting algorithms.
- Proof is non-trivial: how do we reason about all possible comparison-based sorting algorithms?

# **The Decision Tree Model**

- Assumptions:
  - All numbers are distinct (so no use for  $a_i = a_i$ )
  - All comparisons have form  $a_i \le a_j$  (since  $a_i \le a_j$ ,  $a_i \ge a_j$ ,  $a_i < a_j$ ,  $a_i > a_j$  are equivalent).
- Decision tree model
  - Full binary tree
  - Ignore control, movement, and all other operations, just use comparisons.
  - suppose three elements  $< a_1$ ,  $a_2$ ,  $a_3$ > with instance <6,8,5>.

### **The Decision Tree Model - contd**

Consider Insertion sort again

```
for j=2 to length(A)
do key=A[j]
i=j-1
while i>0 and A[i]>key
do A[i+1]=A[i]
i--
A[i+1]:=key
```

#### **Example: insertion sort (n=3)**



#### **The Decision Tree Model**



Internal node i:j indicates comparison between  $a_i$  and  $a_j$ . Leaf node  $<\pi(1), \pi(2), \pi(3)>$  indicates ordering  $a_{\pi(1)} \le a_{\pi(2)} \le a_{\pi(3)}$ . Path of bold lines indicates sorting path for <6,8,5>. There are total 3!=6 possible permutations (paths).

# Summary

- Only consider comparisons
- □ Each internal node = 1 comparison
- □ Start at root, make the first comparison
  - if the outcome is  $\leq$  take the LEFT branch
  - if the outcome is > take the RIGHT branch
- □ Repeat at each internal node
- Each LEAF represents ONE correct ordering

#### **Intuitive idea**

#### S is a set of permutations



# Lower bound for the worst case

- Claim: The decision tree must have at least n! leaves. WHY?
- worst case number of comparisons= the height of the decision tree.
- Claim: Any comparison sort in the worst case needs  $\Omega(n \log n)$  comparisons.
- Suppose height of a decision tree is h, number of paths (i,e,, permutations) is n!.
- Since a binary tree of height h has at most 2<sup>h</sup> leaves,

 $n! \le 2^h$ , so  $h \ge \lg (n!) \ge \Omega(n \lg n)$ 

# Lower bounds: check your understanding

Can you prove that any algorithm that searches for an element in a sorted array of size n must have running time  $\Omega(\lg n)$ ?