

the right majors, minors & concentrations
education?

for students' academic and career success

ing for many students - *Many students change their
during college!*

e prediction of student success in MMC could
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Computational Complexity (Lower Bound) for The Searching Problem

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✓ Computational Complexity for The Searching Problem

- Lower Bounds for the Searching Problem Only by Comparison of Keys?

Computational Complexity for The Searching Problem

- Can we do better than $O(n)$ search on an **unsorted** array?
- Can we do better than $O(\log n)$ search on a **sorted** array?
- Can we say that it is impossible to search faster than $\Omega(n)$ on an **unsorted** array in the worst case?
- Can we say that it is impossible to search faster than $\Omega(\log n)$ on a **sorted** array in the worst case?
 - If we could, then this would be what it's called a **lower bound**.

Searching Only by Comparisons of Keys

- The problem of **searching for a key**:
 - Given an array S containing n keys and a key x , find an index i such that $x = S[i]$ if x equals one of the keys.
 - If x does not equal one of the keys, report failure.
- All algorithms that **search only by comparison of keys**.

Lower Bounds for Searching Only by Comparisons of Keys

1. The lower bound for searching on an **unsorted array** is $\Omega(n)$.
2. The lower bound for searching on a **sorted array** is $\Omega(\log n)$.

1. Lower Bounds for Searching on an Unsorted Array Only by Comparisons of Keys

- Searching on an **unsorted** array?
 - $\Omega(n)$ comparisons at **worst-case** time
 - $\Omega(n)$ comparisons at **average-case** time

Lower Bounds for Searching on an Unsorted Array Only by Comparisons of Keys

- We prove a lower bound, **without going through all possible** searching algorithms?
- The **lower bound** for the problem of searching for K in **an unsorted array of n elements** is **n comparisons**.
 - **Proof by Contradiction**

2. Lower Bounds for Searching on a Sorted Array Only by Comparisons of Keys

- Searching on a **sorted** array?
 - $\Omega(\log n)$ comparisons at **worst-case** time
 - $\Omega(\log n)$ comparisons at **average-case** time

Lower Bounds for Searching on a Sorted Array Only by Comparisons of Keys

- How to prove a lower bound, **without going through all possible** searching algorithms?
- Idea?
 - The **Decision Tree** model
 - Similar to **the sorting lower bound.**

Decision Trees for Searching Algorithms on a Sorted Array

- We associate a **Decision Tree** with every deterministic algorithm that searches for a key x in an array of n keys.
 - Each leaf in a decision tree for searching n keys for a key x represent a point at which the algorithm stops and reports an index i such that $x = s_i$ or reports failure.
 - Every internal node represents a comparison.

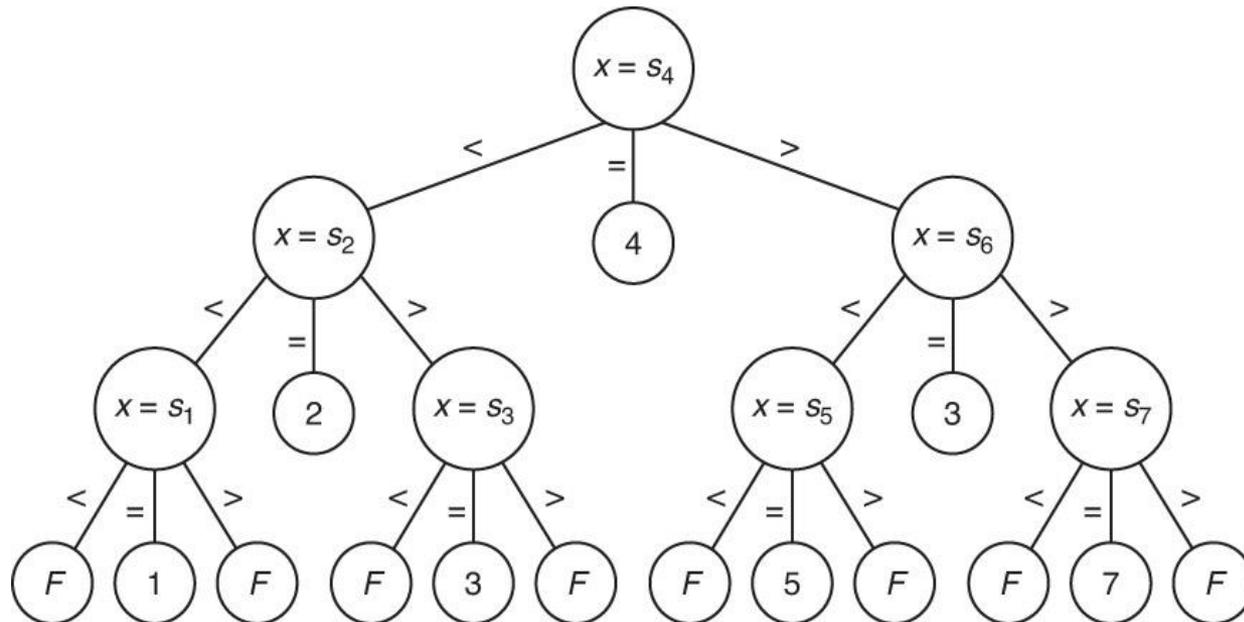
Search - Binary Search?

- **Algorithm 1.5 Binary Search – Iterative**
 - Divide-and-Conquer
 - Top-down
 - $O(\log N)$

- The decision tree of Binary Search with 7 keys?

Decision Tree for Binary Search with 7 Keys

Figure 8.1 Binary Search



The decision tree of Binary Search with 7 keys

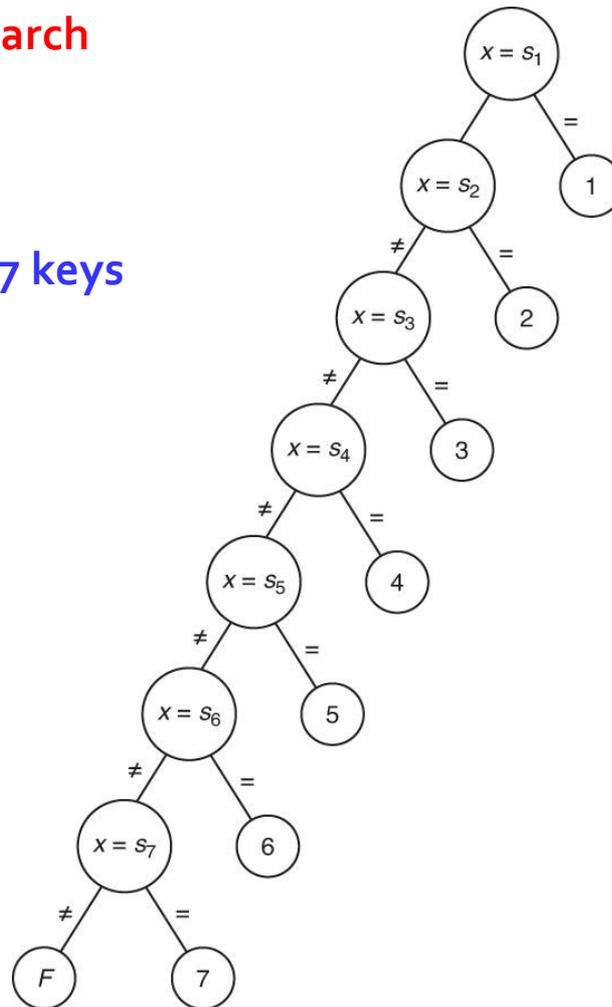
Search - Sequential Search?

- **Algorithm 1.1 Sequential Search**
 - Linear time $O(N)$
- The decision tree of Sequential Search with 7 keys?

Decision Tree for Sequential Search with 7 Keys

Figure 8.2 **Linear Search**

The decision tree of Sequential Search with 7 keys



Decision Trees for Searching Algorithms

- Every search algorithm that searches for a key x in a sorted array S of n *distinct* keys has a corresponding valid, pruned **decision tree**.

Lower Bounds for Worst-Case Behavior

- Each leaf is a position of x can be in S .
- Every leaf in a pruned, valid decision tree must be reachable.

Decision Trees for Searching Algorithms

- There must be **at least $n+1$ leaves** in the decision tree.
 - Because we have **$n+1$ distinct positions** of x can be in (any position in S , plus not in S at all).

Decision Trees for Searching Algorithms

- The **worst-case number of comparisons** of keys done by a **decision tree** is equal to its **height**.

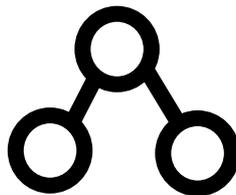
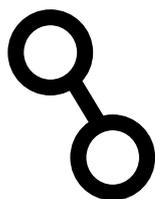
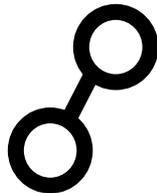
Decision Trees for Sorting Algorithms

- **h vs # of leaves**  **# of leaves $\leq 2^h$**

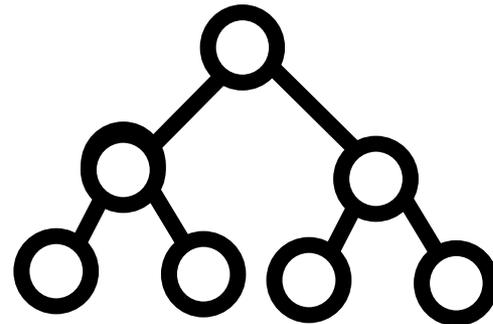
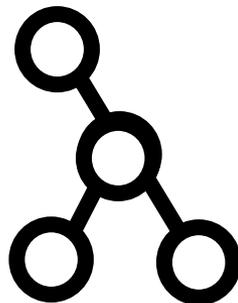
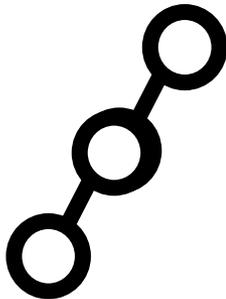
h=0



h=1



h=2



Decision Trees for Sorting Algorithms

- **Lemma 7.3:**
 - If **m** is the number of **leaves** in a binary tree and **h** is the **height**, then **$h \geq \log m$** .
 - height = h
 - **A binary tree with height h has at most 2^h leaves.**
 - **# of leaves $\leq 2^h$**
 - $2^h \geq$ # of leaves
 - **$h \geq \log$ (#of leaves)**

Lower Bounds for Worst-Case Behavior

- At least $\log n$ comparisons needed.
- Theorem 8.1
 - $\Omega(\log n)$ worst-case time

Lower Bounds for Average-Case Behavior

- **Theorem 8.2**
 - **$\Omega(\log n)$ average-case time**

Lower Bounds for Searching on a Sorted Array Only by Comparisons of Keys

- **Binary Search** is very efficient for solving this problem **when the array is sorted**.
 - **$O(\log n)$** worst-case time complexity
- As long as we limit ourselves to algorithms that **search only by comparisons of keys**, there is no improvement possible!

► QUIZ?

- What is the lower bound for searching on a sorted array at worst-case only by comparisons of Keys?

✓ Algorithms for The Searching Problem

- Algorithms that search only by comparison of keys.

Static Searching vs Dynamic Searching

- **Static Searching** is a process in which the records are all added to the file at one time, and there is **no need to add or delete** records later.
- Many applications require **Dynamic Searching**, which means that **records are added and deleted frequently**.

Dynamic Searching – Arrays?

- An **array** structure is **inappropriate** for dynamic searching.
 - Because, when we add a record in sequence to a sorted array, we must move all the records following the added record.

Dynamic Searching – Binary Search

- Binary Search requires that the keys be structured in an array, because there must be an efficient way to find the middle item.
- Binary Search cannot be used for dynamic searching!
- Worst-case:
 - $O(\log n)$ Search
 - $O(n)$ Insert & Delete

Dynamic Searching – Linked Lists?

- Although we can readily add and delete records using a **linked list**, there is **no efficient way to search a linked list**.
- **Worst-case:**
 - **$O(n)$ Search**
 - **$O(1)$ – $O(n)$ Insert & Delete**

Dynamic Searching – Trees!

- **Dynamic searching** can be implemented efficiently using a **tree structure!**

Binary Search Trees

- **Binary search trees** are appropriate for dynamic searching.
 - **All data items are kept in sorted order!**

Binary Search Trees

- When keys are dynamically added and deleted, there is no guarantee that the resulting tree will be balanced.
 - Often obtains a **skewed tree**, which is simply a **linked list**.
 - If the keys are added at random, the resulting tree will be **closer to a balanced tree** than it will be closer to a linked list.

Binary Search Trees

- Worst-case:
 - $O(n)$ Search
 - $O(n)$ Insert & Delete
- **Average-case:**
 - $O(\log n)$ Search
 - $O(\log n)$ Insert & Delete

Height-Balanced Search Trees

- In a very dynamic environment, it would be better if the tree **never became unbalanced** in the first place.
- A **height balanced search tree** with some **balancing condition**.
 - All data items are kept in sorted order!
 - Height is balanced!

Height-Balanced Search Trees

- AVL trees
- 2-3 trees
- 2-3-4 trees
- B-trees
- Red-Black trees
- ...

Height-Balanced Search Trees

- The search, addition, and deletion times are guaranteed to be $\Theta(\log n)$.
- **Worst-case:**
 - $O(\log n)$ Search
 - $O(\log n)$ Insert & Delete

✓ Computational Complexity for The Searching Problem Summary

- Searching on a **sorted** array?
 - $\Omega(\log n)$ comparisons at **worst-case** time
 - $\Omega(\log n)$ comparisons at **average-case** time
- Searching on an **unsorted** array?
 - $\Omega(n)$ comparisons at **worst-case** time
 - $\Omega(n)$ comparisons at **average-case** time

Homework Assignment

► Homework Assignment?

- What is the lower bound for searching on a sorted array only by comparison of keys? Explain.

✓ Textbook Readings

- Chapter 8:
 - 8.1 (8.1.1 only)
 - 8.3

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END

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