

Lecture 22: Complexity

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CSCI 101
Spring 2018

Today

- Announcements
 - Next week: Course response forms. Bring computer.
 - Final exam: self-scheduled; 2 sheets of notes allowed
- Computational Complexity
 - Big-O notation to describe # of operations
 - Example: complexity of search algorithms

Time and space

Algorithm choice will determine the resources used at runtime.

Key resources:

- **Time** (CPU time)
- **Space** (memory)

Computational Complexity



A *basic operation* requires one time unit

- adding two values
- assigning to a variable
- comparing two values
- accessing a list element

How many *basic operations* does a given algorithm perform?

Traversing a List

Code to print all values in a list:

```
n = len(t)
i = 0
while i < n:
    print(t[i], end=' ')
    i += 1
```

How many operations does this perform?

→ $c \cdot n$ operations for list of n elements
↑
a constant, eg, 5

Big-O notation

- Use a function to describe number of basic operations in terms of **input size**
- The function includes only the dominant terms, ignoring constants
- Example: list traversal is $O(n)$ for a list of n values

Linear Search

Find a value in a list:

```
n = len(t)
i = 0
while i < n:
    if t[i] == target:
        return i
    i += 1
return -1
```

Number of operations for a list of n elements: $O(n)$

Binary Search

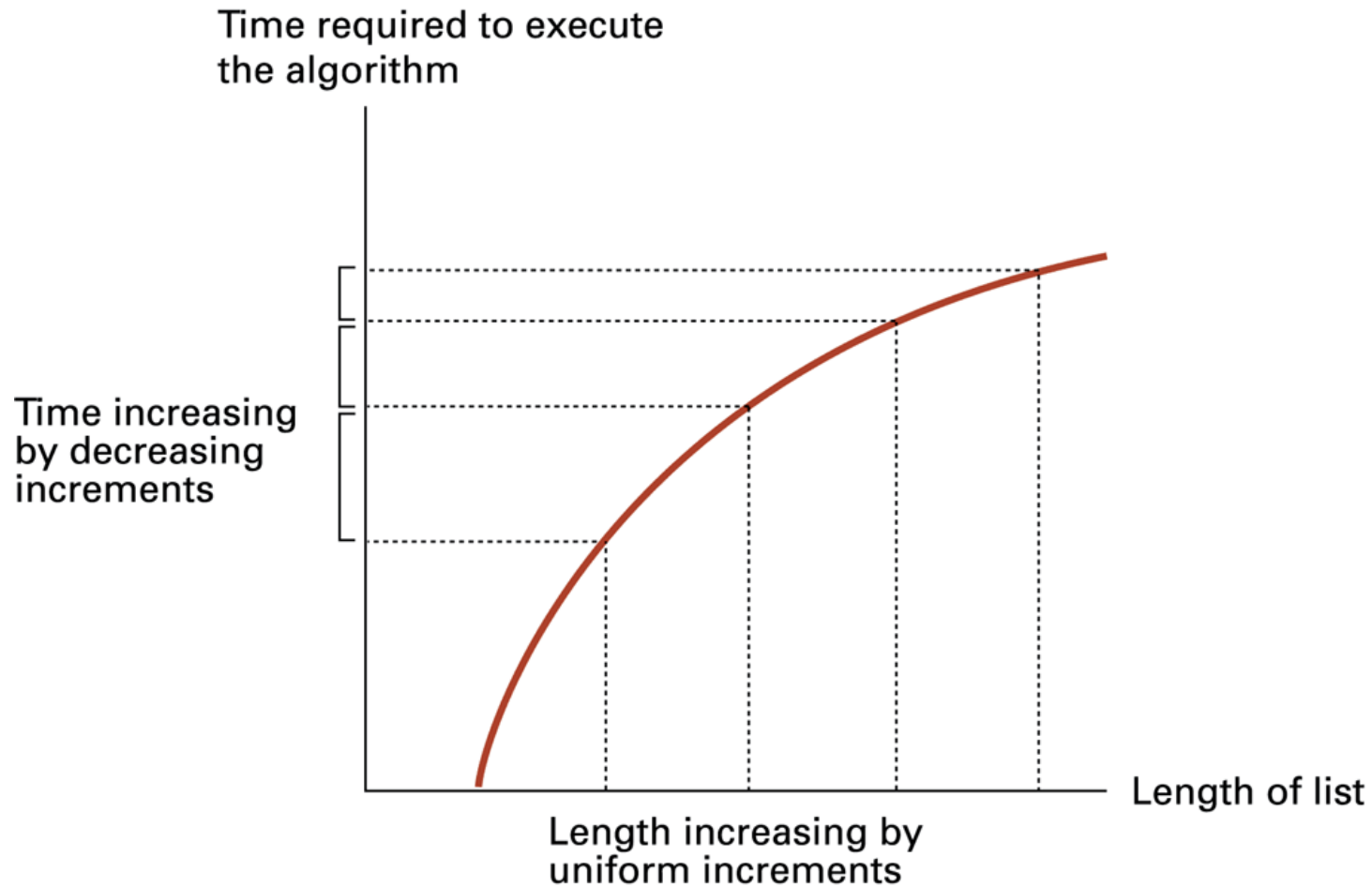
We can search **faster** if the list is **sorted**

→ Compare middle element to the target, then refine search to one half of list

2	5	8	11	15	16	21	24	29	41	45	58	71	85	92	95
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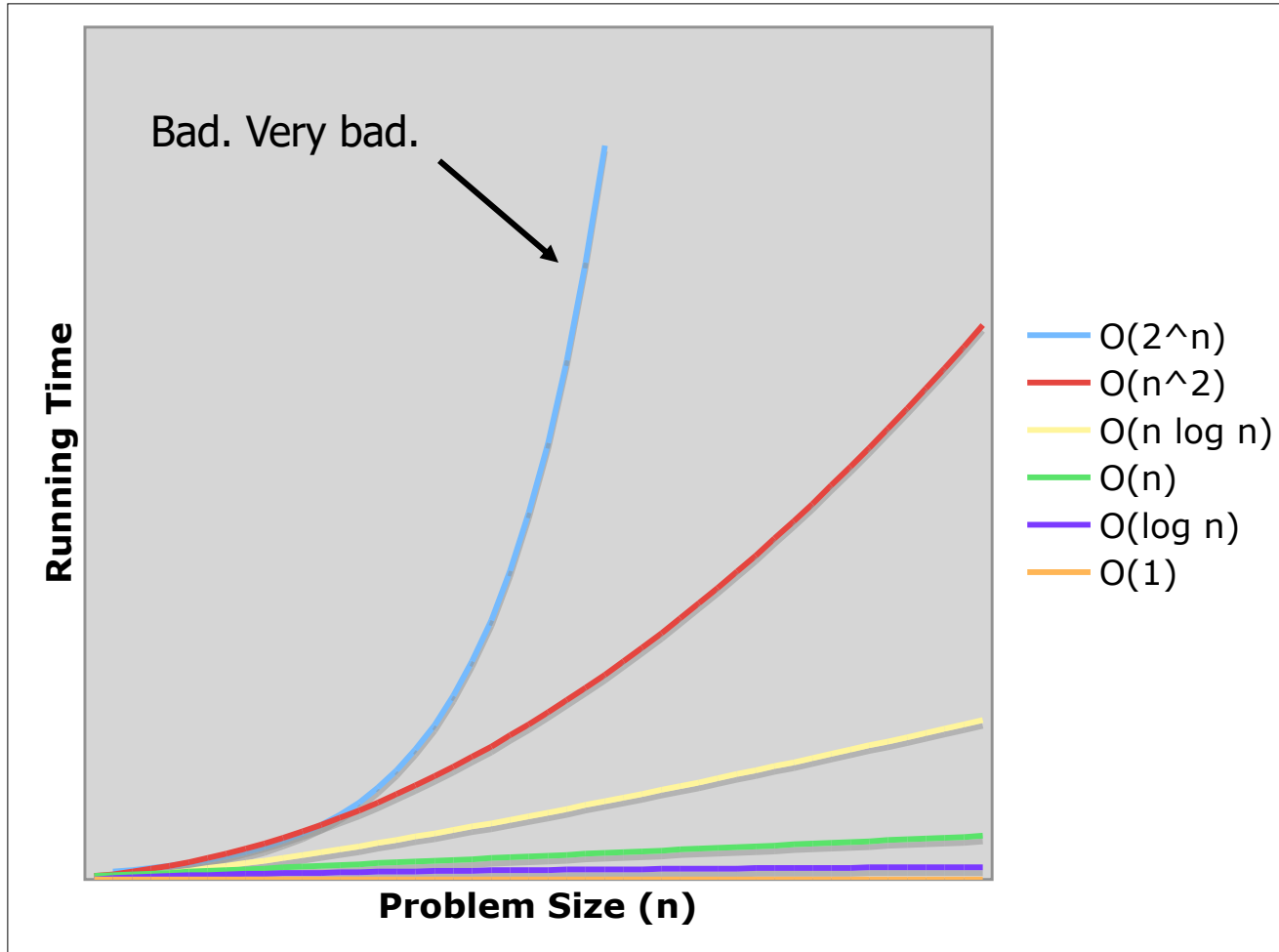
Number of operations for a list of n elements: $O(\log_2 n)$ or $O(\log n)$

Binary Search: $O(\log n)$



Order of Growth

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Algorithmic Analysis



If time needed...	then we say...	Examples
grows proportionally with the input size	the algorithm runs in $O(n)$ or linear time	Linear search Compute sum of list
grows only incrementally as the input size doubles	the algorithm runs in $O(\log n)$ or logarithmic time	Binary search, Fast exponentiation
doubles with a unit increment to the input size	the algorithm runs in $O(2^n)$ or exponential time	Recursive Fibonacci Towers of Hanoi
doesn't change with the input size	the algorithm runs in $O(1)$ or constant time	Finding max of sorted list
grows quadratically with the input size	the algorithm runs in $O(n^2)$ or quadratic time	Insertion, selection, and bubble sorts

Algorithms We Prefer

Polynomial time algorithms are desirable

- $O(1)$ [constant]
- $O(\log n)$ [logarithmic]
- $O(n)$ [linear]
- $O(n \log n)$
- $O(n^2)$ [quadratic]
- $O(n^3)$ [cubic]

Non-polynomial time algorithms are undesirable

- $O(2^n)$ [exponential]
- $O(n!)$ [factorial]