

# Intro to Algorithm Analysis

- Algorithm analysis
  - worst case
  - big-O
  - $O(n)$ ,  $O(1)$ ,  $O(n^2)$
- Big-O of **merge** method
  - Merge algorithm example
  - finding big-O of Java library methods
- Big-O of **Sequence** class

# Announcements

- Lab this week: bring your laptop with IntelliJ installed (see lab for details)
- PA2 due in 6 days

# Algorithm analysis idea

- Compare efficiency one algorithm / data structure to another *before* implementation.
- For a given problem size  $n$ , how long does it take?
  - **worst-case performance.**
  - best-case performance.
  - average-case performance.

# Algorithm analysis idea (cont.)

- Ex: “search an array”:
  - does the value, *target*, appear in a given array of size *n*, and if so, at what position?
- Want to know how long it takes as a function of *n*.
- In the example below *n* = 6.

*target* = 12

	0	1	2	3	4	5
<i>values</i>	14	7	5	12	3	9

# Big-O notation

*asymptotic* worst-case performance:

- behavior as  $n$  grows,
- on worst possible input of size  $n$ .
- Use *big-O* notation.
- units are program steps.
  - e.g.,  $2 * 2$  takes the same amount of time as  $20000 * 20000$
- big-O is also called the *time complexity*
- can also look at space complexity of algorithms (how much extra space to solve the problem)

# $O(n)$

- Example 1: It takes  $n$  steps to print all the elements in an array with  $n$  elements.
  - We say this algorithm is “*order n*”,
  - or  $O(n)$ , or
  - it takes “*linear time*”.
- $O(n)$  means number of steps is some linear function of  $n$ :

$$c_1 * n + c_2$$

# Counting steps

Example 2: compute the average of  $n$  numbers:

```
int sum = 0;
int n = in.nextInt();

for (int i = 1; i <= n; i++) {

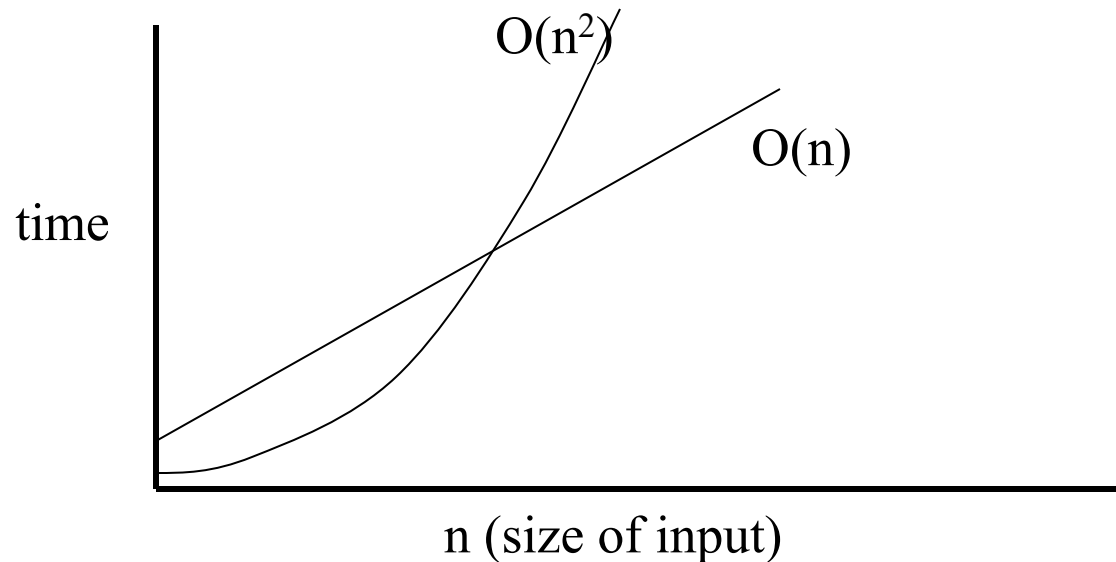
    int value = in.nextInt();
    sum += value;

}

System.out.println("The average is: "
                   + sum / ((double) n);
```

# Why ignore constants?

- constants fade away as  $n$  grows large.
- compare algorithm to another that may differ in order of magnitude, e.g.,  $O(n^2)$  or  $O(2^n)$
- distinct from “tuning” a specific implementation





$$O(1)$$

Algorithm that takes the same amount of time no matter how big  $n$  is.

- called *constant time*
- or *order 1*
- or  $O(1)$

# $O(1)$ examples

- Examples \*:
  - assignment statements
  - arithmetic expressions
  - boolean expressions
  - println
  - simple-statement sequences
  - loops with constant bounds

\* Warning: time taken inside method calls counts towards total. Exs above depends on *contents* of expressions and loops. E.g.,

```
System.out.println(Arrays.toString(myArr)) ;  
takes ???
```

# Important example

- Input: an array of size  $n$ .
- Problem: find the  $k$ th element in the array.

# Sequential search

- Ex 3: Big-O to search in an unordered array of size  $n$ .
  - does the value, *target*, appear in a given array of size  $n$ , and if so, at what position?
  - time depends on values in array and what target is
  - we're interested in the *worst* case.

*target* = 12

	0	1	2	3	4	5
<i>values</i>	14	7	5	12	3	9

# Sequential search on *sorted* array

- Ex 3 (variation): Big-O to search in an ordered array of size  $n$  using **linear search**
- Worst case?
- best case, average case?

*target* = 8

	0	1	2	3	4	5
<i>values</i>	3	5	7	9	12	14

$$O(n^2)$$

- Ex 4: print out a multiplication table for the integers 1 to  $n$
- *Quadratic time* ( $O(n^2)$ ) is any quadratic function of  $n$ :  
 $an^2 + bn + c$

## Ex: merge two ordered lists

- problem: create one large ordered ArrayList out of two ordered ArrayLists (no duplicates).
- Example:
  - list1: 3 7 9 12 15
  - list2: 2 5 6 8 9 20
  - merged list: 2 3 5 6 7 8 9 12 15 20

# slow **merge** method

- Idea: for **merge(list1, list2)**:
  - copy arraylist in **list1** to **result** arraylist (copy constructor)
  - for each element of arraylist in **list2**:
    - find its location in **result**
    - insert the element at that location in result  
(use **ArrayList** method **add(index, elmt)**)
  - return **result**

list1: 3 7 9 12 15

list2: 2 5 6 8 9 20

- big-O? (size of **list1** is  $m$ , size of **list2** is  $n$ )
- How to find big-O of Java methods?



# Better-performing **merge** method

- take advantage of the fact that both arrays are already sorted
- traverse both arrays in one loop:
  - take the smaller element of the two arrays and add it to the result array, and update index of the one moved.
- every loop iteration get closer to the end of one of the arrays
- always adding new values at the *end* of result
- *merge algorithm*

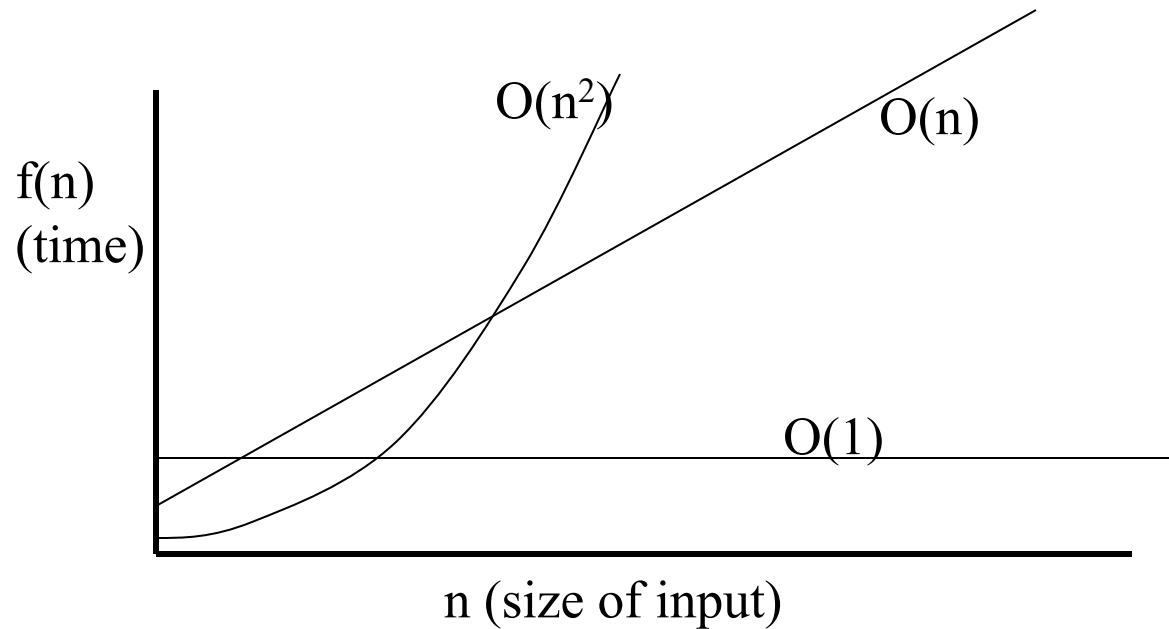
# Merge example

List1: 9 11 16 20

List2: 2 5 16 17 18

# Comparing different time bounds

- Sometimes there exist fast and slow algorithms to solve the same problem.
- Here's an idea of what some of these time bounds look like when plotted.



# big-O practice

- **Sequence** class:
  - to represent a sequence (list) of numbers
- Internal representation:
  - values are stored in an array (beginning and end of array corresponds to beginning and end of the sequence)
- Operations next page . . .

# Sequence class operations

Operation

big-O (for array rep)

**Sequence s = new Sequence();**

---

**s.getValAt(loc) → val**

---

**s.contains(val) → t/f**

---

**s.removeValAt(loc) → success**

---

**s.insertAtEnd(val)**

---

**s.insertInFront(val)**

---

**s.numVals() → length**