



In a bubble sort,

the "heaviest" item sinks to the bottom of the list while the "lightest" floats up to the top

June 1,2016

# Principles of good programming

#### Correctness

- Your program does what it is supposed to.
- Handles all cases (e.g. invalid user input).

#### Maintainability

- <u>Readability</u>, clarity of the code.
- <u>Reusability</u> for yourself and others (proper use of functions/methods and objects)



programs that are easy to handle and debug.

# Efficiency

In terms of running time and memory space used.

### Why care about efficiency?

multiplying two integers sorting a list factoring integers computing Nash Equilibria of games protein structure prediction simulating quantum systems building Al proving theorems

#### <u>The Plan</u>

> How to properly measure running time

- > Searching a given list
  - Linear search
  - Binary search
- > Big-Oh notation
- > Sorting a given list
  - Selection sort
  - Bubble sort

Given a list of integers, and an integer, determine if the integer is in the list.

How many steps in the algorithm?

Given a list of integers, and an integer, determine if the integer is in the list.

How many steps in the algorithm?

Given a list of integers, and an integer, determine if the integer is in the list.

How many steps in the algorithm?

Given a list of integers, and an integer, determine if the integer is in the list.

How many steps in the algorithm?

running time of an algorithm depends on:

- size of input (e.g., size of the list)
- the values in the input

running time of an algorithm depends on:

- size of input (e.g., size of the list)
- the values in the input

running time of an algorithm depends on:

- size of input (e.g., size of the list)
- the values in the input

size of the list:

Want to know running time with respect to any list size.

N =list size

Measure running time as a function of N.

running time of an algorithm depends on:

- size of the list (size of input)
- the values in the input

#### the values in the input:

Measure running time with respect to worst input.

worst input = input that leads to most number of steps

#### How to properly measure running time

> Input length/size denoted by  $N \,$  (and sometimes by  $n \,$ )

- for lists: N = number of elements
- for strings: N = number of characters
- for ints: N = number of digits
- > Running time is a function of N.
- > Look at worst-case scenario/input of length N.
- > Count algorithmic steps.
- > Ignore constant factors. (e.g.  $N^2 \approx 3N^2$ ) (use Big-Oh notation)

#### <u>The Plan</u>

> How to properly measure running time

- > Searching a given list
  - Linear search
  - Binary search
- > Big-Oh notation
- > Sorting a given list
  - Selection sort
  - Bubble sort

Given a list of integers, and an integer, determine if the integer is in the list.



How many steps does this take? N steps

Can't do better (in the worst case)

This algorithm is called Linear Search.

Given a sorted list of integers, and an integer, determine if the integer is in the list.



running time: N steps

Can we do better?

How would you search for a name in a phonebook?













#### **Binary Search**



At each step we halve the list.

ΛT

$$N \to \frac{N}{2} \to \frac{N}{4} \to \frac{N}{8} \to \dots \to 1$$
  
After k steps:  $\frac{N}{2^k}$  elements left. When is this I?

ΛT

ΛT

# N vs log N

How much better is log N compared to N?

N	log N
2	
8	3
I 28	7
1024	10
1,048,576	20
1,073,741,824	30
1,152,921,504,606,846,976	60

~ I quintillion

# n vs log n



size of problem

#### Linear search vs Binary search

#### Linear Search

- Takes  $\sim N$  steps.
- Works for both sorted and unsorted lists.

- Takes  $\sim \log_2 N$  steps.
- Works for only sorted lists.

#### Linear search code

def linearSearch(L, target):
 for index in range(len(L)):
 if(L[index] == target):
 return True
 return False

How many steps in the worst case?

### Binary search code

```
def binarySearch(L, target):
start = 0
end = len(L) - 1
while(start <= end):</pre>
   middle = (start + end)//2
   if(L[middle] == target):
      return True
   elif(L[middle] > target):
      end = middle-1
   else:
      start = middle+1
return False
```

How many steps in the worst case?

#### <u>The Plan</u>

> How to properly measure running time

- > Searching a given list
  - Linear search
  - Binary search
- > Big-Oh notation
- > Sorting a given list
  - Selection sort
  - Bubble sort

#### The CS way to compare functions:

 $O(\cdot)$ 

<



means  $f(n) \leq g(n)$  , ignoring constant factors and small values of n

#### The CS way to compare functions:

 $O(\cdot)$ 

<

# $10n + 25 = O(n) \equiv 10n + 25 \text{ is } O(n)$

means  $10n + 25 \le n$ , ignoring constant factors and small values of n

#### A notation to ignore constant factors and small n.

 $2\log_2 n$  is  $O(\log n)$ 2n is O(n) $3\log_2 n$  is  $O(\log n)$ 3n is O(n)1000n is O(n) $1000 \log_2 n$  is  $O(\log n)$ 0.0000001n is O(n) $0.000001 \log_2 n$  is  $O(\log n)$  $n \text{ is } O(n^2)$  $\log_{9} n$  is  $O(\log n)$  $0.000001n^2$  is not O(n) $n \log_7 n + 100$  is not O(n)

Running time of linear search is O(N)Running time of binary search is  $O(\log N)$ 

Why ignore constant factors and small n?

- We want to capture the essence of an algorithm/problem.
- Technology independent. Language independent.
- Difference in Big Oh

a really fundamental difference.

Ignoring constant factors means ignoring lower order additive terms.

$$n^2 + 100n + 500$$
 is  $O(n^2)$ 

$$601n^2 = n^2 + 100n^2 + 500n^2 > n^2 + 100n + 500$$

#### Also:

$$\frac{n^2 + 100n + 500}{n^2} = 1 + \frac{100n}{n^2} + \frac{500}{n^2} \longrightarrow 1$$

Lower order terms don't matter!





### Important Big Oh Classes

Again, not much interested in the difference between n and n/2.

#### We are <u>very</u> interested in the differences between

 $\log n <<< \sqrt{n} << n << n^2 << n^3 <<< 2^n$
# Important Big Oh Classes

Common function families:

O(1)Constant:  $O(\log n)$ Logarithmic:  $O(\sqrt{n}) = O(n^{0.5})$ Square-root: O(n)Linear:  $O(n \log n)$ Loglinear:  $O(n^2)$ Quadratic:  $O(k^n)$ **Exponential**:

## Important Big Oh Classes



# Exponential running time

If your algorithm has exponential running time e.g.  $\sim 2^n$ 



No hope of being practical.

## n vs 2<sup>n</sup>

<b>2</b> <sup>n</sup>	n
2	
8	3
128	7
1024	10
I,048,576	20
1,073,741,824	30
1,152,921,504,606,846,976	60

#### Exponential running time example

Given a list of integers, determine if there is a subset of the integers that sum to 0.

# Exponential running time example

Given a list of integers, determine if there is a subset of the integers that sum to 0.

#### Exhaustive Search

Try every possible subset and see if it sums to 0. Number of subsets is  $2^N$ 

So running time is at least  $2^N$ 



#### <u>The Plan</u>

> How to properly measure running time

- > Searching a given list
  - Linear search
  - Binary search
- > Big-Oh notation
- > Sorting a given list
  - Selection sort
  - Bubble sort

- I. Algorithm
- 2. Running time
- 3. Code

Sort a given list of integers (from small to large).

#### **Selection Sort**

Find the minimum element.

Put it on the left.

Repeat process on the remaining n-1 elements.

Sort a given list of integers (from small to large).

**Selection Sort** 

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).



#### **Selection Sort**

Swap current min with first element of the array

Sort a given list of integers (from small to large).



#### **Selection Sort**

Swap current min with first element of the array

Sort a given list of integers (from small to large).

**Selection Sort** 

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Swap current min with first element of unsorted part

Sort a given list of integers (from small to large).

#### **Selection Sort**

Swap current min with first element of unsorted part

Sort a given list of integers (from small to large).

**Selection Sort** 

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**
Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).



#### **Selection Sort**

Sort a given list of integers (from small to large).



#### **Selection Sort**

Sort a given list of integers (from small to large).

**Selection Sort** 

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).



#### **Selection Sort**

Sort a given list of integers (from small to large).



#### **Selection Sort**

Sort a given list of integers (from small to large).

**Selection Sort** 

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

**Selection Sort** 

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Sort a given list of integers (from small to large).

#### **Selection Sort**

Done!

# Selection Sort: Running Time

Sort a given list of integers (from small to large).

#### **Selection Sort**

How many steps does this take (in the worst case)?  $\sim N + (N-1) + (N-2) + \dots + 1 = \frac{N^2}{2} + \frac{N}{2}$ (As N increases, small terms lose significance.) Running time is  $O(N^2)$ .

#### Selection Sort: Code



Find the *min position* from *start* to *len(a) - 1* Swap elements in *min position* and *start* Increment *start* 

Repeat

#### Selection Sort: Code



for start = 0 to len(a)-1:

Find the min position from start to len(a) - ISwap elements in min position and start

#### Selection Sort: Code



Sort a given list of integers (from small to large).



#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).

#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).

#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).

#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).

#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.
Sort a given list of integers (from small to large).

#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).

#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).



#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).



#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).



#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).



#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).



#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).



#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).

#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).



#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).



#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).



#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).



#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).



#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).



#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).



#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).

#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).

#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).



#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).



#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).



#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).



#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).

#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).

#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).

#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).

#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).



#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).

#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).

#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).

#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).

#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).

#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Sort a given list of integers (from small to large).

#### Bubble Sort

Compare each pair of adjacent items (left to right).

Swap them if they are in the wrong order.

Repeat until no more swaps are needed.

Large elements "bubble up"

# Bubble Sort: Running Time

Sort a given list of integers (from small to large).

#### Bubble Sort

How many steps does this take (in the worst case)?  $O(N^2)$ 

### Bubble Sort: Code

#### Bubble sort snapshot



repeat until no more swaps:

for i = 0 to end:
if a[i] > a[i+1], swap a[i] and a[i+1]
decrement end

### **Bubble Sort: Code**


**Comparison: Selection Sort vs Bubble Sort** 

Worst case both take  $O(N^2)$  steps.

How about best case?

Selection sort:  $O(N^2)$ Bubble sort: O(N)

If your list is close to being sorted, bubble sort can be better.

Is there a better way?

## Exercise

## Write the code yourself:

linear search binary search selection sort bubble sort