



# Algorithm Efficiency: Measurements of

Computer Science 112

Boston University

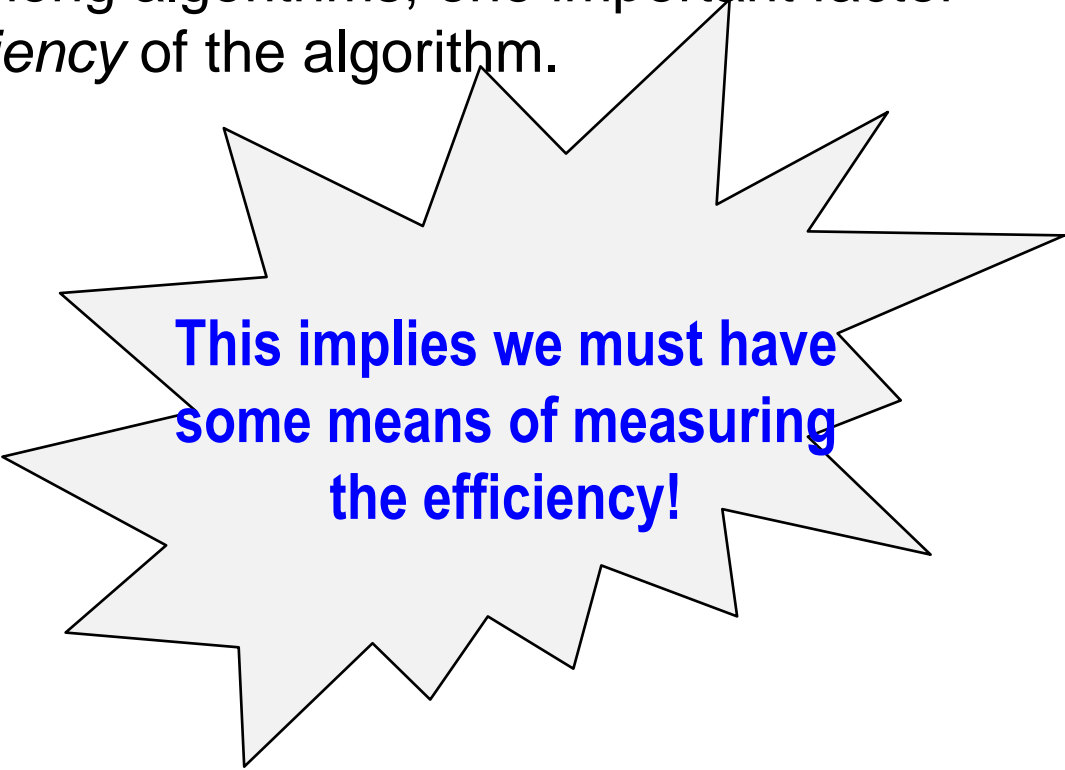
Christine Papadakis

# Algorithm Efficiency

- For any given task, there may be more than one algorithm that works.
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**This implies we must have  
some means of measuring  
the efficiency!**

# Algorithm Efficiency

- For any given task, there may be more than one algorithm that works.
- When choosing among algorithms, one important factor is the relative *efficiency* of the algorithm.

How do we measure efficiency?

Subjective and difficult to quantify!

**Is it how fast we can develop the code?**

**Is it number of lines of code?**

**Is it how fast the algorithm executes?**

**Is it how much memory it eats up?**

# Algorithm Efficiency

- For any given task, there may be more than one algorithm that works.
- When choosing among algorithms, one important factor is the relative *efficiency* of the algorithm.

Both valid considerations!

How do we measure efficiency in Computer Science?

Time Efficiency

how fast we can develop the code  
Is it number of lines of code?

Space Efficiency

Is it how **fast** the algorithm executes?

Is it how much **memory** it eats up?

# Algorithm Efficiency

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how fast we can develop the code?

Is it number of lines of code?

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Is it how much memory it eats up?

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  - time efficiency: *how quickly an algorithm executes?*

But, what exactly is this a measure of? **Elapsed Time?**

# Algorithm Efficiency

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- When choosing among algorithms, one important factor is the relative *efficiency* of the algorithm. Let's focus on:
  - time efficiency: *how quickly an algorithm executes?*

**Elapsed time** (by itself) is not really an accurate measure of efficiency. There are many factors that influence the speed at which an algorithm executes:

- The physical machine the algorithm was executed on.
  - The processes running at the same time.
- The language that the algorithm was encoded in, etc.



# Algorithm Efficiency

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- When choosing among algorithms, one important factor is the relative *efficiency* of the algorithm. Let's focus on:
  - time efficiency: *how quickly an algorithm executes?*

We want to measure **execution** time in terms of the *number of operations* the algorithm performs.

Why?

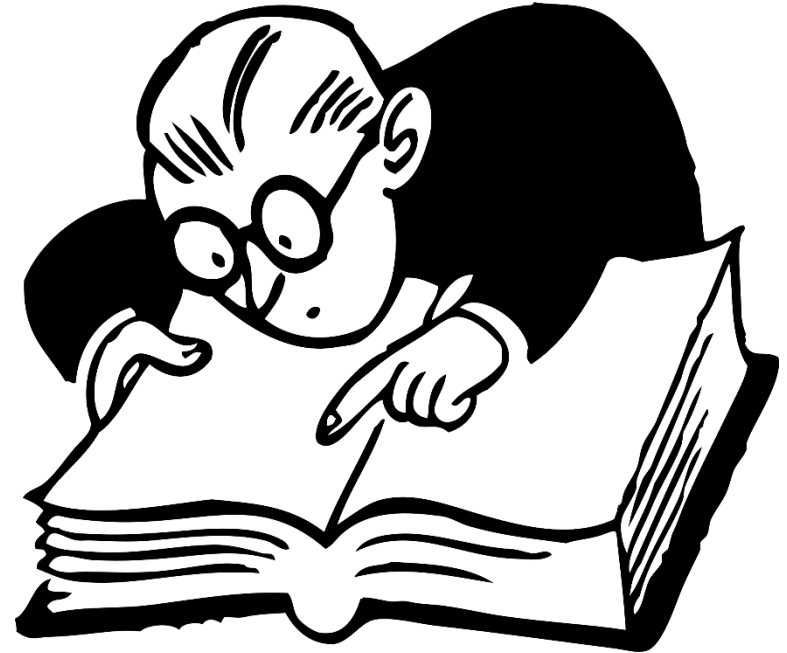
# Algorithm Efficiency

- For any given task, there may be more than one algorithm that works.
- When choosing among algorithms, one important factor is the relative *efficiency* of the algorithm.
  - time efficiency: *how quickly an algorithm executes?*

Because this will tell us how the algorithm **scales**. By this we mean, how the algorithm performs on ***increasingly*** larger data sets.

# Example of Comparing Algorithms

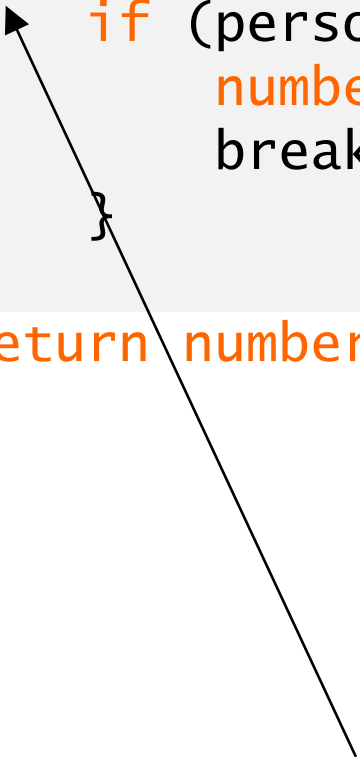
- Consider the problem of finding a phone number in a phonebook.



# Finding a Phone Number:

## *Sequential Search*

```
public String findNumber(String name, Book phonebook){  
    String number = "unknown";  
  
    for (int i = 1; i <= phonebook.num_pages(); i++) {  
        if (person is found on the current page) {  
            number = the person's phone number  
            break;  
        }  
    }  
    return number;  
}
```



Scan each page of the  
phone book,  
one page at a time, until we  
find the person we are looking for ...  
or we run out of pages to search.

# Finding a Phone Number:

## *Sequential Search*

```
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        }  
    }  
    return number  
}
```

- If there were 1,000 pages in the phonebook, how many pages would this look at in the worst case? 1,000
- What if there were 1,000,000 pages? 1,000,000

The running time of this algorithm  
"grows **proportionally**" to  $n$ ,  
where  $n$  = # of pages.

# Finding a Phone Number: *Sequential Search*

```
public String findNumber(String name, Book phonebook){
```

```
    String t
```

```
    for (
```

```
        
```

```
    )
```

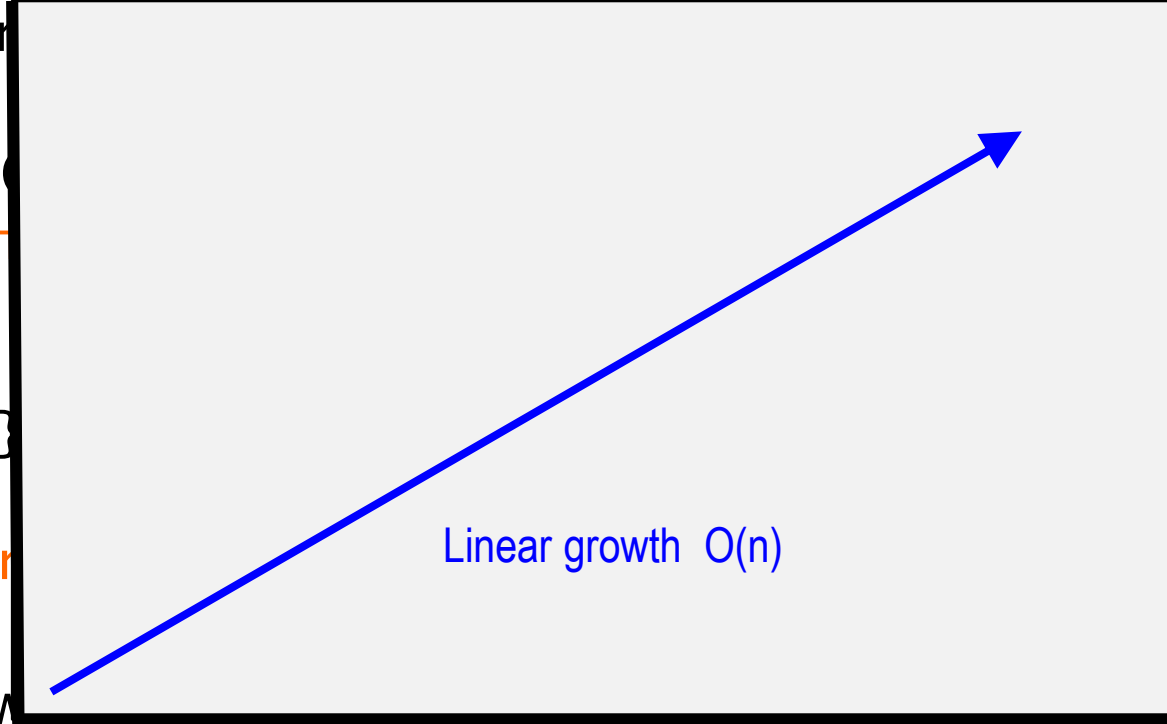
```
    {
```

```
        
```

```
    }
```

```
    return
```

```
}
```



```
); i++ ){
```

```
    if (name.equals(p.getName()) {
```

```
        return p.getPhone();
```

```
    }
```

```
}
```

- If there were 1,000 pages, how many comparisons would this look at in the worst case? 1,000
- What if there were 1,000,000 pages? 1,000,000

The running time of this algorithm  
"grows **proportionally**" to  $n$ ,  
where  $n = \#$  of pages.

# Finding a Phone Number

## Sequential Search

```
public String findNumber(String name, Book phonebook){
```

```
    String t;
```

```
    for
```

```
}
```

```
    return
```

```
}
```

- If there were 1,000 pages
- What if there were 1,000,000 pages?

In other words,  
the efficiency of this algorithm  
is directly aligned with  
the size of the  
data set!

The running time of this algorithm  
"grows **proportionally**" to  $n$ ,  
where  $n = \#$  of pages.

# Finding a Phone Number:

## *Binary Search*

```
public String findNumber(String name, Book phonebook){
    String number = "unknown";

    int min = 1;
    int max = phonebook.num_pages();

    while (min <= max) {
        mid = (min + max) / 2;      # the middle page
        if (person is found on page mid) {
            number = the person's number
            break;
        } else if (person comes earlier in phonebook)
            max = mid - 1;
        else:
            min = mid + 1;
    }

    return number;
}
```

What is this algorithm doing with each iteration of the loop?



# Finding a Phone Number:

## *Binary Search*

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            max = mid - 1;  
        else:  
            min = mid + 1;  
    }  
  
    return number;  
}
```

**It cuts the  
search range in half!**

# Finding a Phone Number:

## *Binary Search*

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```

Why?

- If there were 1,000 pages in the phonebook, how many pages would this look at in the *worst* case? approx. 10
- What if there were 1,000,000 pages? approx. 20

# Finding a Phone Number:

## Binary Search

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public String findNumber(String name, Book phonebook){  
    String number = "unknown";  
  
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    while (min <= max) {  
        mid = (min + max) / 2;        # the middle page  
        if (person is found on page mid) {  
            number = ...  
            break;  
        } else if {  
            max = ...  
        } else {  
            min = ...  
        }  
    }  
    return number;  
}
```

By continuously cutting the problem size in half,  
the running time  
"grows proportionally" to  $\log_2 n$ ,  
where ( $n$  = # of pages).

- If there were 1,000 pages in the phonebook, how many pages would this look at in the *worst* case? approx. 10
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# Finding a Phone Number: *algorithm 2*

```
public String findNumber(String name, Book phonebook){
```

```
    String number = "unknown";
```

```
    int t  
    int max
```

```
    while (m  
        mid
```

```
        if
```

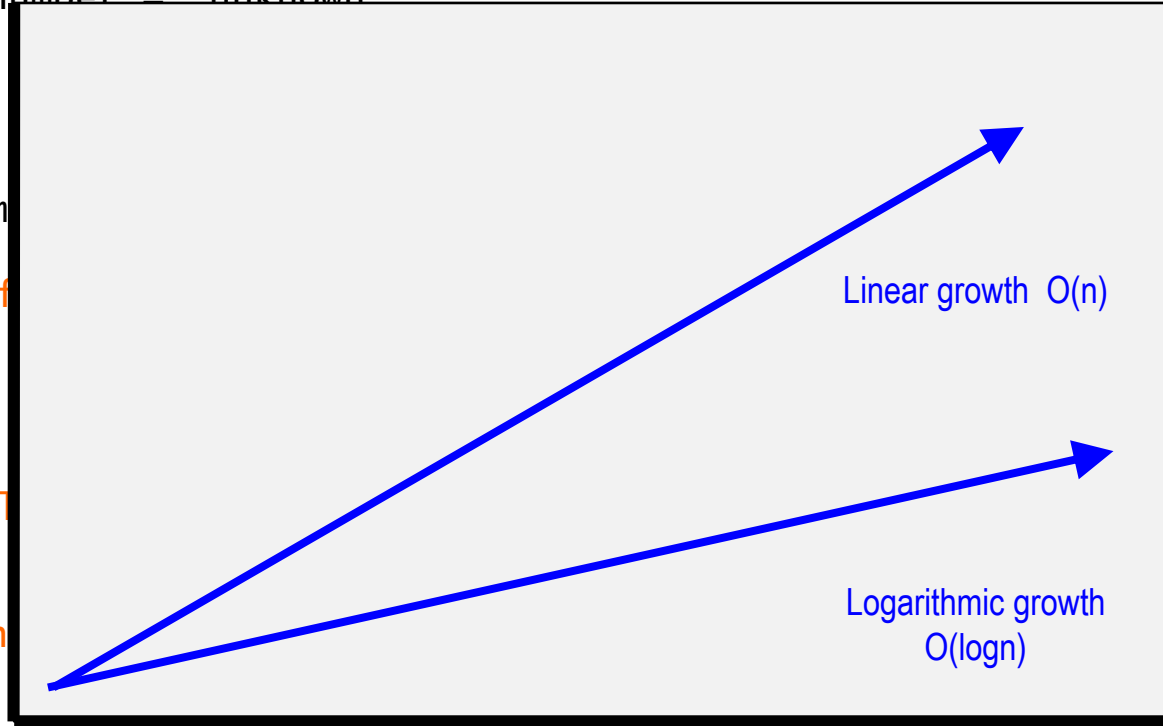
```
    }
```

```
    et
```

```
    }
```

```
    return n
```

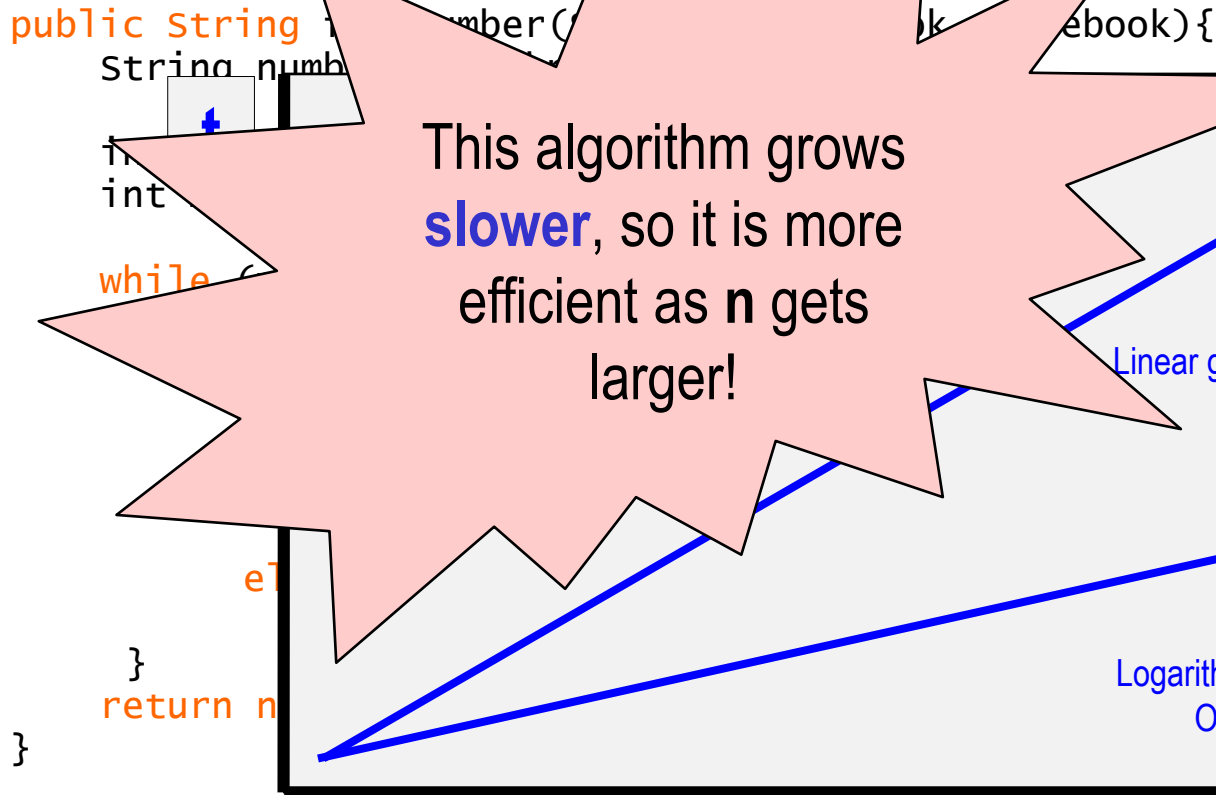
```
}
```



**n**

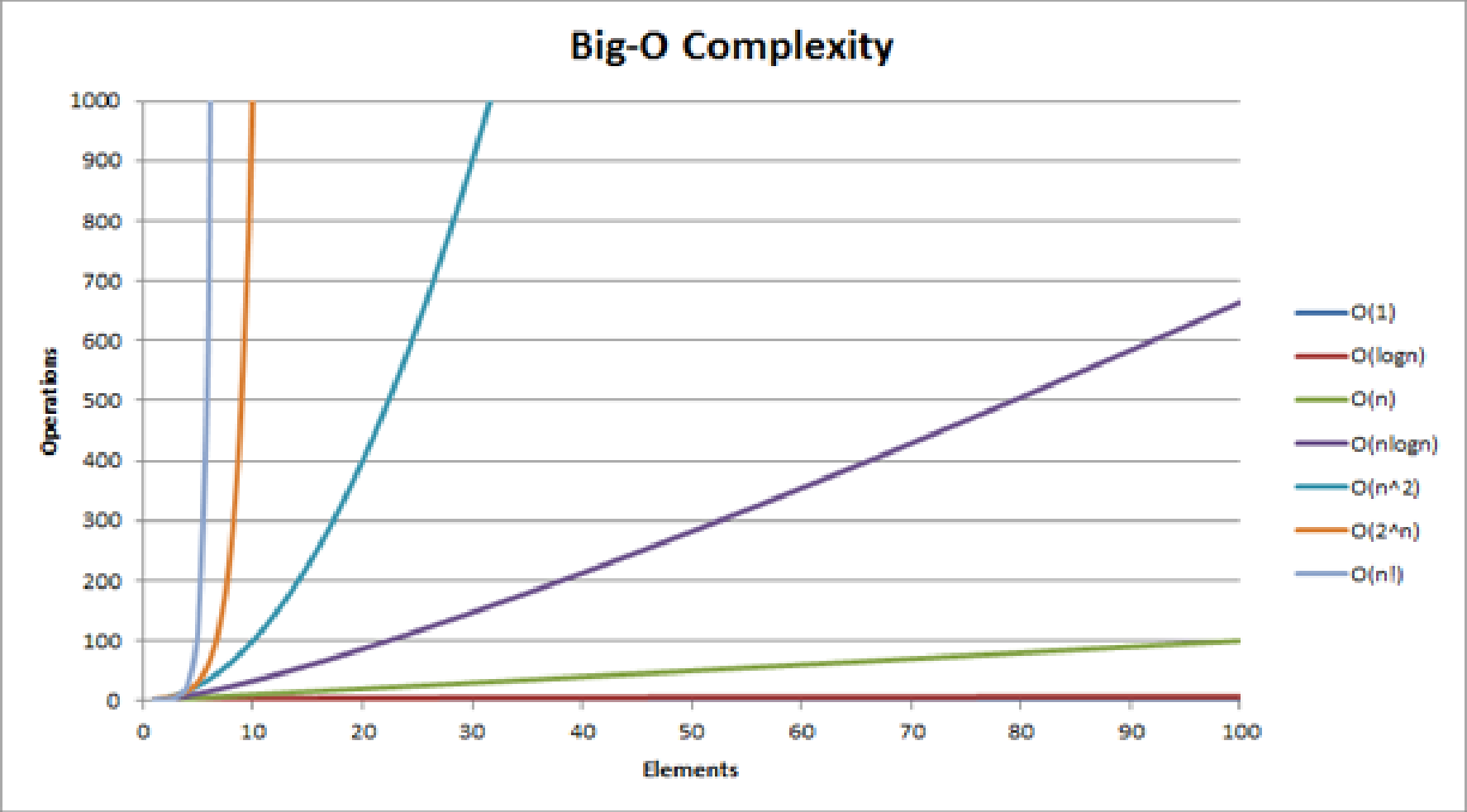
- If there were 1,000 pages in the phonebook, how many pages would this look at in the *worst* case? **approx. 10**
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# Finding a Phone Number:



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## Algorithm Analysis



# Searching a Collection of Data

- The phonebook problem is one example of a common task: searching for an item in a collection of data.
  - another example: searching for a value in an array
- A main branch of study in Computer Science is devoted to developing increasingly more efficient search algorithms.
- We have just looked at two:
  - Algorithm #1: Sequential Search
  - Algorithm #2: Binary Search

For large collections of data, binary search is **significantly** faster than sequential search.



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- A main branch of study in Computer Science is devoted to developing increasingly more efficient search algorithms.
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  - Algorithm #1: Sequential Search
  - Algorithm #2: Binary Search



But there is a catch! For binary search to work, what must be true?



# Searching a Collection of Data

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  - another example: searching for a value in an array
- A main branch of study in Computer Science is devoted to developing increasingly efficient search algorithms.
- We have just looked at two search algorithms:
  - Algorithm #1: Linear Search
  - Algorithm #2: Binary Search

Data must be  
in sorted  
order!



But there is a catch! For binary search to work, what must be true?

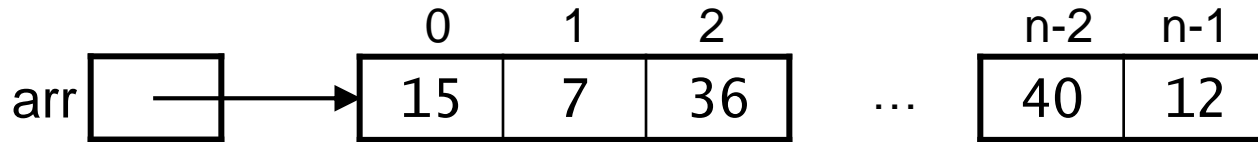
# Sorting and Algorithm Analysis: The Basics



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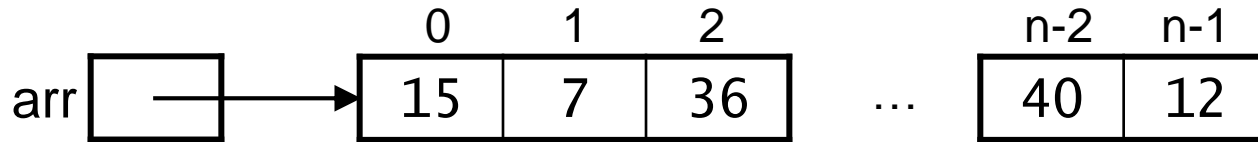
Christine Papadakis-Kanaris

# Sorting an Array of Integers



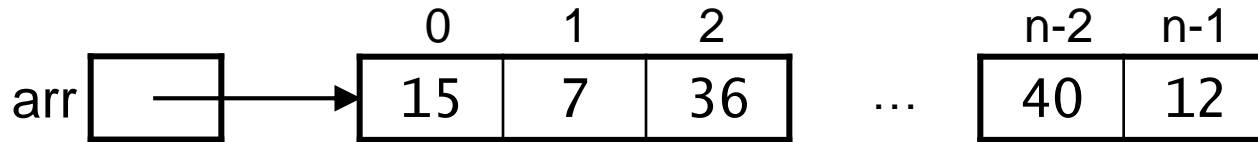
- Ground rules:
  - sort the values in increasing order
  - sort “in place,” using only a small amount of additional storage
- Terminology:
  - position: one of the memory locations in the array
  - element: one of the data items stored in the array
  - element  $i$ : the element at position  $i$

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- **Goal:** minimize the number of *operations* needed to sort the array.

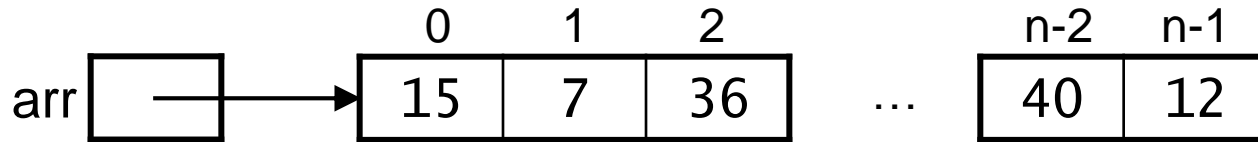
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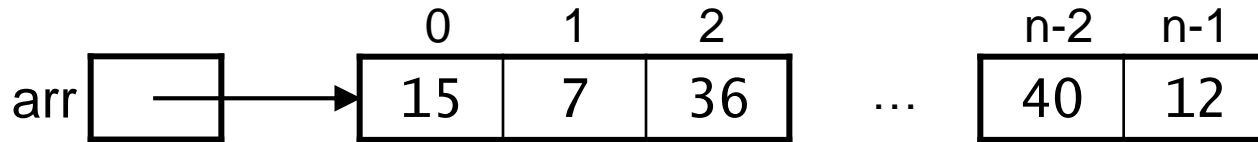
Which are?

number of  
*comparisons* and *moves*  
needed to sort the array.

comparison is applying a relational operation on two elements of the array.  
example: `arr[1] > arr[2]`

move = copying an element from one position to another  
example: `arr[3] = arr[5];`

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# Defining a Class for our Sort Methods

```
public class Sort {  
    public static void bubbleSort(int[] arr) {  
        ...  
    }  
    public static void insertionSort(int[] arr) {  
        ...  
    }  
    ...  
}
```

- Our Sort class is simply a collection of methods like Java's built-in Math class.
- Because we never create Sort objects, all of the methods in the class must be *static*.
  - outside the class, we invoke them using the class name:  
e.g., `Sort.bubbleSort(arr)`