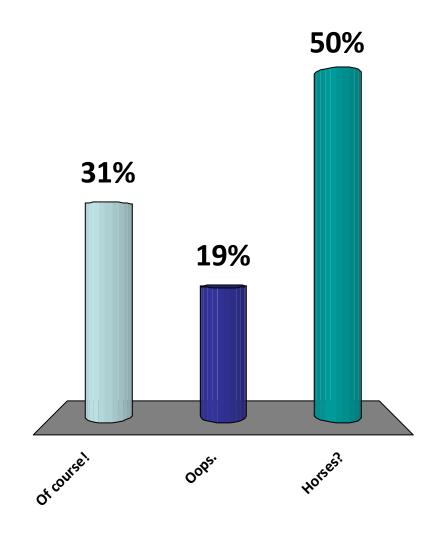
# CS2020 Data Structures and Algorithms

Welcome!

#### I remembered to bring my clicker to class?

- ✓ 1. Of course!
  - 2. Oops.
  - 3. Horses?



### Administrativia

#### Problem Set 2

Due last night

Exercise: Sorting

#### Problem 1: Sorting Detective

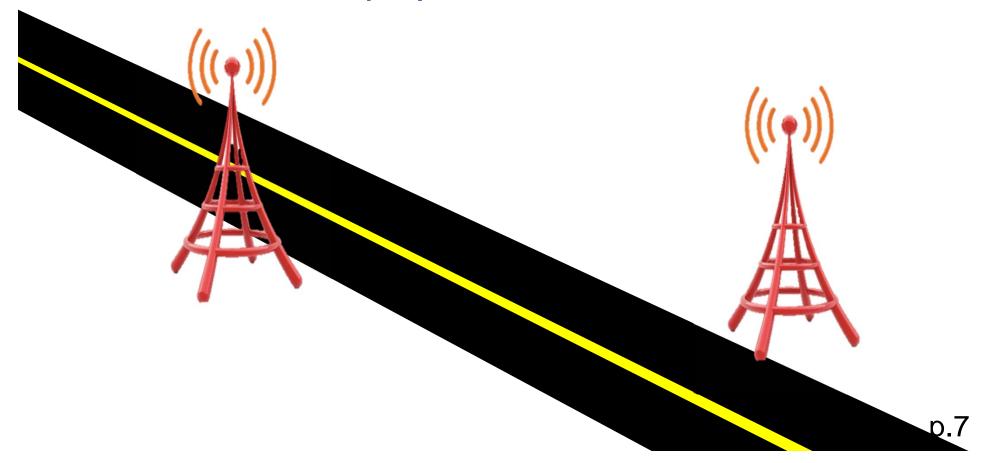
- Six suspicious sorting algorithms
  - Investigate the mysterious sorting code.
  - Identify each sorting algorithm.
  - Find the criminal: Dr. Evil!
- Focus on the properties:
  - Asymptotic performance
  - Stability
  - Performance on special inputs
- Absolute speed is not a good reason...

(Material covered for this problem on Friday)



#### Problem 2: Cellular Coverage

 Build a data structure to help choose the best locations to deploy cellular towers.



#### Problem 2: Cellular Coverage

- Build a data structure to help choose the best locations to deploy cellular towers.
  - Given a set of towers, what is the coverage?
- Try small examples:
  - What about two towers that don't overlap?
  - What about two towers that do overlap?
- Hint (in the question):
  - Why should Tower implement Comparable?

#### Java

- Basic syntax
- Classes
- Interfaces
- Objects
- Access control (public/private/protected)
- Generics
- Etc.

#### Object-oriented programming

- Encapsulation
- Modularity
- Importance of interfaces
- Inheritance

#### Algorithms

- Theory:
  - Big-O notation
  - Sequential model of computation
  - Intro to algorithm analysis

#### - Binary search:

- Basic approach
- 1d Peak Finding
- 2d Peak finding
- Herbert

1. Common optimization technique: find a locally optimal solution.

- Common optimization technique: find a locally optimal solution.
- 2. Binary search example: how can you apply techniques *similar* to binary search to other problems.

- Common optimization technique: find a locally optimal solution.
- 2. Binary search example: how can you apply techniques similar to binary search to other problems.
- 3. Neat progression of algorithms: shows the steps you might go through to solve a difficult problem (e.g., d-dimensional peak finding).

# Two Week Survey

[How are things going so far?]

# Topics to cover

Generating effective test cases and debugging

Loop invariants

More searching

Proper documentation / Javadocs

Inner classes

### Topics to cover

Generating effective test cases and debugging **Problem** Set 3 Loop invariants. Today (and onwards) More searching Proper documentation / Javadocs ~ Slowly over the semester. Inner classes In 2 weeks.

# **Technical Questions**



#### When should I use binary search?

- Look for monotonicity:
  - As I increase something, there is something else that always increases.
  - As I decrease something, there is something else that always decreases.
- Look for maximization/minimization/search problems.
- Look for problems where you can bound the thing you are searching for.

# Java Questions

"Coming to Java from Python, I feel quite out of place. ... I find myself constantly referring to javadocs or google for ways to do trivial things [that are easy in Python]."

"Working with arrays and strings because [what I expect to work always] fails in Java"

"Why is Java so painful to work with compared to Python?"

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### Problem Set Questions (from survey)

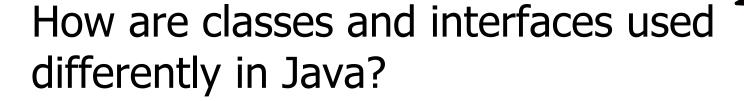
#### How long should I spend on them?

- Huge variance: 2-8 hours
- Talk to tutors for advice on how to go faster.

#### Will you go over problem set solutions?

- Go over problem sets in Discussion Groups. (Ask your tutor questions.)
- Discuss solutions on Nota Bene (after the due date).
- It's ok if you are still confused by some problems!

### **Technical Questions**





- Contain implementation
- Contains state
- Mixed public and private
- Objects instantiate classes.
- Classes implement interfaces.
- An object can inherit from only one parent class.

#### **Interfaces**

- **NO** implementation
- No state
- All public
- Cannot be instantiated.
- Defines how to interact with an object.
- An object may implement many interfaces.

**Important** 

**Question!** 

### **Technical Questions**

#### What exactly is a package or a project?

- A collection of classes / interfaces / etc. that are stored together in a common place.
- Put all your CS2020 classes in one package.
- In Eclipse, a project is an organizational construct that holds related code.
- An Eclipse project can have code from different packages.

And on to Week 3!

# **Today: Sorting**

- Writing a sorting algorithm in Java
- Sorting algorithms
  - o BubbleSort
  - o SelectionSort
  - o InsertionSort
  - o MergeSort
- Properties
  - o Running time
  - Space usage
  - Stability

### Sorting

#### Problem definition:

```
Input: array A[1..n] of words / numbers
```

*Output*: array B[1..n] that is a permutation of A such that:

$$B[1] \le B[2] \le \dots \le B[n]$$

#### Example:

$$A = [9, 3, 6, 6, 6, 4] \rightarrow [3, 4, 6, 6, 6, 9]$$

# Sorting

```
public interface ISort{
    public void sort(int[] dataArray);
}
```

# **Sorting Widgets**

```
public interface ISortWidgets{
   public void sort(Widget[] dataArray);
}
```

```
public void sort(Widget[] dataArray) {
    Widget x = dataArray[0];
    Widget y = dataArray[1];
    if (x < y) {</pre>
```

# Generic Types

```
public interface ISort<TypeA>{
    public void sort(TypeA[] dataArray);
}
```

# What goes wrong?

```
public void sort(TypeA[] dataArray) {
  TypeA x = dataArray[0];
  TypeA y = dataArray[1];
  if (x < y) {
```

# What goes wrong?

```
public void sort(TypeA[] dataArray) {
 TypeA x = dataArray[0];
  TypeA y = dataArray[1];
                          Illegal comparison!
                          What if: TypeA == Student?
                              class Student {
                                 double m CAP;
                                 String m name;
                                 Matric m id;
```

### Comparable Interface

```
class Student implements Comparable < Student > {
    ...
    ...
}
```

```
interface Comparable < TypeA > {
    int compareTo(TypeA other);
}
```

# Comparable Interface

#### x.compareTo(y) :

```
-1: if (x<y)
```

0: if (x == y)

1: if (x>y)

Must define a total ordering Must be transitive.

```
interface Comparable < TypeA > {
    int compareTo(TypeA other);
}
```

# Sorting Students, again

```
class Student implements Comparable < Students > {
    ...
    ...
}
```

```
public void sort(Student[] dataArray) {
    Student x = dataArray[0];
    Student y = dataArray[1];
    if (x.compareTo(y) < 0) { // if (x<y)</pre>
```

# Implementing Comparable

```
class Student implements Comparable < Student > {
// compare students by CAP
int compareTo(Student other){
  if (this.getCAP() < other.getCAP())</pre>
      return -1;
  else if (this.getCAP() > other.getCAP())
      return 1;
  else // equal CAP
      return 0;
```

### Almost works...

```
public interface ISort{
    public void sort(Comparable[] dataArray);
}
```

# Comparable to what?

```
public interface ISort{
    public void sort(Comparable < ZZZ > [] dataArray);
}
```

```
public interface ISort<TypeA extends Comparable<TypeA>>
{
   public void sort(TypeA[] dataArray);
}
```

```
public interface ISort<TypeA extends Comparable<TypeA>>
  public void sort(TypeA[] dataArtay);
                extends, not implements!!
```

weird... no good reason... a mystery...

```
public interface ISort<TypeA extends Comparable<TypeA>>
{
   public void sort(TypeA[] dataArray);
}
```

```
public interface ISort{

public <TypeA extends Comparable <TypeA>>

void sort(TypeA[] dataArray);
}
```

## Sorting

```
public <TypeA extends Comparable<TypeA>>
void sort(TypeA[] dataArray) {
   for (int i=0; i<dataArray.length; i++){</pre>
        for (int j=0; j<dataArray.length-1; j++){</pre>
                   TypeA first = dataArray[j];
                   TypeA second = dataArray[j+1];
                   if (first.compareTo(second) > 0)
                           swap(dataArray, j, j+1);
```

```
Student[] dataArray = new Student[100];
sort(dataArray);
```

```
class Student implements Comparable<Student> {
   int compareTo(Student other) {
        ...
   }
}
```

```
Emotion[] dataArray = new Emotion[100];
sort(dataArray);
Error!
```

```
class Emotion {
  int compareTo(Emotion other) {
     ...
  }
}
```

#### Which of the following correctly implements:

#### boolean stringsEqual(String A, String B)

```
A. return (A == B);
                                        17% 17% 17% 17% 17% 17%
✓B. return (A.compareTo(B) == 0);
  C. for (int i=0; i<A.length; i++)
        (A.charAt(i) != B.charAt(i)
                     return false;
     return true;
  D. Options 1 and 2.
  E. Options 2 and 3.
```

Options 1 and 3.

# Comparable Interface

#### Most Java classes support Comparable

- Integer, Float, etc.
- BigInteger
- String
- Date
- Time

**–** ...

# **Generic Array**

#### **Problem:**

```
class Widget<TypeA> {
   void buildArray(int size){
           TypeA[] array = new TypeA[size];
                         Cannot instantiate generic arrays!
                         (How big should it be? Without knowing
                        sizeof(TypeA), Java cannot decide.)
```

## Generic Array

#### **Solution: use ArrayList**

```
class Widget<TypeA> {
    void buildArray(int size){
        ArrayList<TypeA> array = new ArrayList<TypeA>(size);
        ...
    }
}
```

# **Comparing Students**

```
class Student implements Comparable < Student > {
...
...
}
```

```
interface Comparable<TypeA> {
    int compareTo(TypeA other);
}
```

```
public interface ISort{

public <TypeA extends Comparable <TypeA>>
    void sort(TypeA[] dataArray);
}
```

# **Today: Sorting**

- Writing a sorting algorithm in Java
- Sorting algorithms
  - o BubbleSort
  - o SelectionSort
  - o InsertionSort
  - o MergeSort
- Properties
  - o Running time
  - Space usage
  - Stability

# Aside: BogoSort

```
BogoSort(A[1..n])

Repeat:
```

- a) Choose a random permutation of the array A.
- b) If A is sorted, return A.

What is the expected running time of BogoSort?

# Aside: BogoSort

QuantumBogoSort(A[1..n])

- a) Choose a random permutation of the array A.
- b) If A is sorted, return A.
- c) If A is not sorted, destroy the universe.

What is the expected running time of Quantum BogoSort?

(Remember QuantumBogoSort when you learn about non-deterministic Turing Machines.)

# **Today: Sorting**

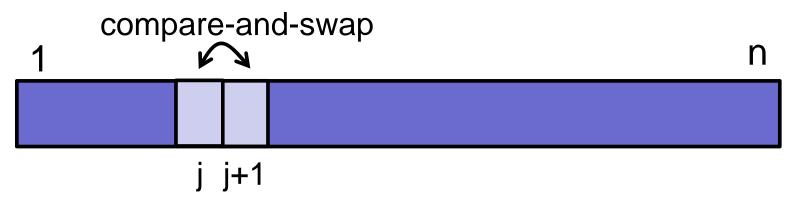
- Writing a sorting algorithm in Java
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  - o Running time
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  - Stability

```
BubbleSort(A, n)

repeat n times:

for j \leftarrow 1 to n-1

if A[j] > A[j+1] then swap(A[j], A[j+1])
```



Example: 8 2 4 9 3 6

Example: 8 2 4 9 3 6
2 8 4 9 3 6

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2 8 4 9 3 6
2 4 8 9 3 6

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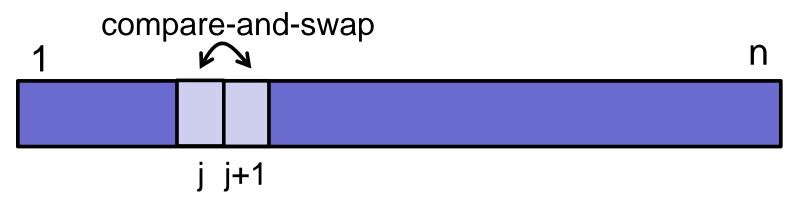
Example: 8 2 4 9 3 6
2 8 4 9 3 6
2 4 8 9 3 6
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```
BubbleSort(A, n)

repeat n times:

for j \leftarrow 1 to n-1

if A[j] > A[j+1] then swap(A[j], A[j+1])
```

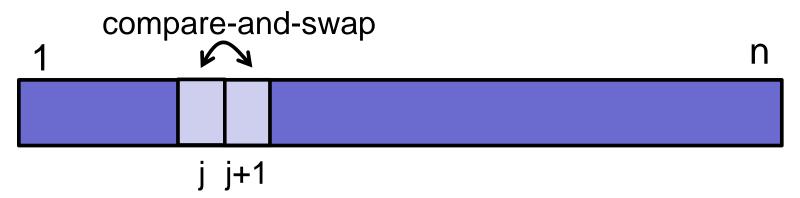


```
BubbleSort(A, n)

repeat (until no swaps):

for j \leftarrow 1 to n-1

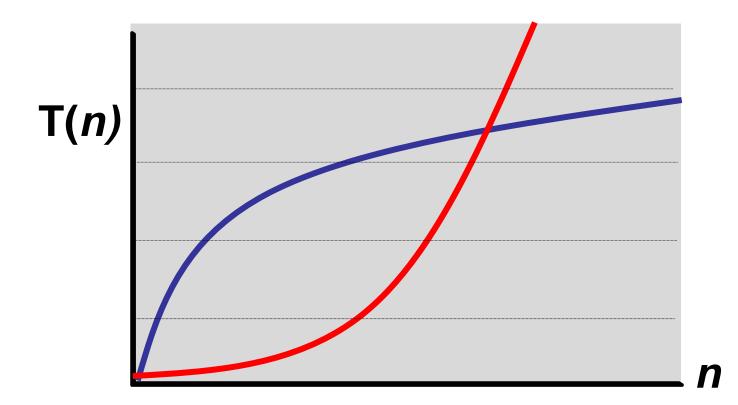
if A[j] > A[j+1] then swap(A[j], A[j+1])
```



## **Big-O Notation**

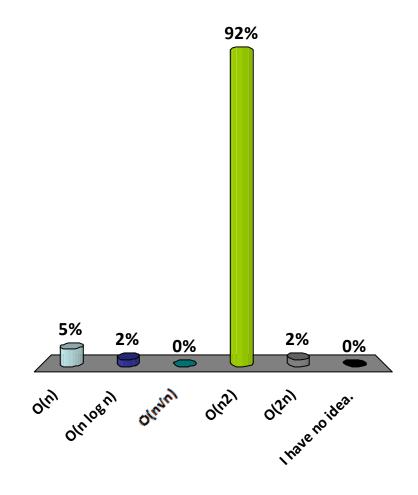
#### How does an algorithm scale?

- For large inputs, what is the running time?
- T(n) = running time on inputs of size <math>n



#### What is the running time of BubbleSort?

- A. O(n)
- B. O(n log n)
- C.  $O(n\sqrt{n})$
- $\checkmark$ D. O(n<sup>2</sup>)
  - E.  $O(2^{n})$
  - F. I have no idea.



#### Running time:

– Depends on the input!

## BubbleSort

#### Running time:

– Depends on the input!

#### Best-case:

Already sorted: O(n)

#### BubbleSort

#### Best-case:

Already sorted: O(n)

#### Average-case:

Assume inputs are chosen at random...

#### Worst-case:

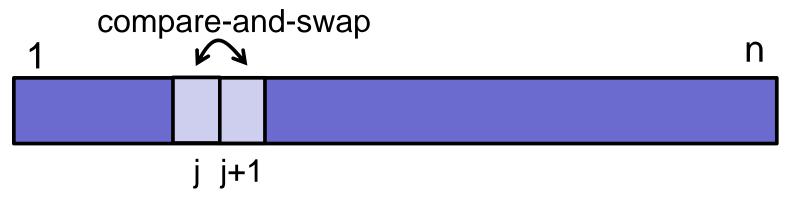
Bound how long it takes.

```
BubbleSort(A, n)

repeat (until no swaps):

for j \leftarrow 1 to n-1

if A[j] > A[j+1] then swap(A[j], A[j+1])
```



```
BubbleSort(A, n)
  repeat (until no swaps):
    for j \leftarrow 1 to n-1
           if A[j] > A[j+1] then swap(A[j], A[j+1])
Iteration 1:
                                max item
                 10
```

```
BubbleSort(A, n)
  repeat (until no swaps):
    for j \leftarrow 1 to n-1
           if A[j] > A[j+1] then swap(A[j], A[j+1])
Iteration 1:
                 10
```

```
BubbleSort(A, n)
  repeat (until no swaps):
    for j \leftarrow 1 to n-1
           if A[j] > A[j+1] then swap(A[j], A[j+1])
Iteration 2:
                                                     10
                                                    10
                               9
```

#### Loop invariant:

At the end of iteration j: ??



#### Loop invariant:

At the end of iteration j, the biggest j items are correctly sorted in the final j positions of the array.



#### Loop invariant:

At the end of iteration j, the biggest j items are correctly sorted in the final j positions of the array.

Worst case: n iterations  $\rightarrow$  O(n<sup>2</sup>) time



## BubbleSort

Best-case: O(n)

Already sorted

Average-case: O(n<sup>2</sup>)

Assume inputs are chosen at random...

Worst-case: O(n<sup>2</sup>)

Bound on how long it takes.

# **Today: Sorting**

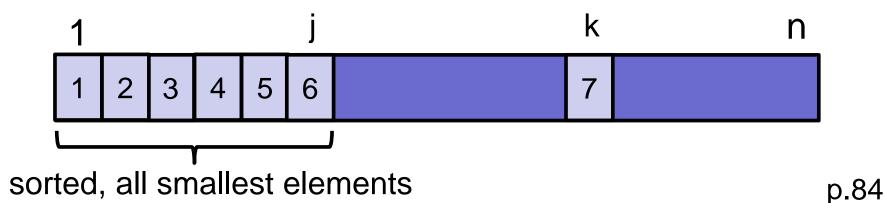
- Writing a sorting algorithm in Java
- Sorting algorithms
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  - o SelectionSort
  - o InsertionSort
  - MergeSort
- Properties
  - o Running time
  - Space usage
  - Stability

```
SelectionSort(A, n)

for j \leftarrow 1 to n-1:

find minimum element A[j] in A[j..n]

swap(A[j], A[k])
```



Example: 8 2 4 9 3 6

Example: 8 2 4 9 3 6
2 8 4 9 3 6

Example: 8 2 4 9 3 6
2 8 4 9 **3** 6
2 3 4 9 8 6

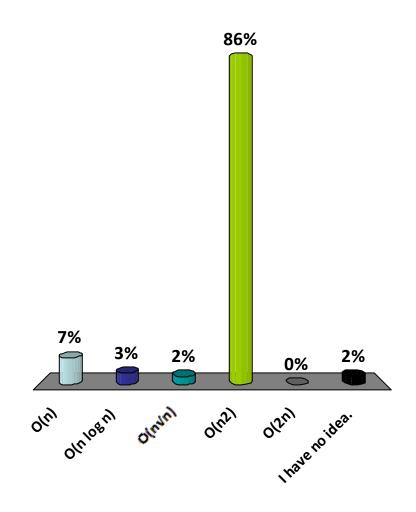
Example: 8 2 4 9 3 6
2 8 4 9 3 6
2 3 4 9 8 6
2 3 4 9 8 6

Example: 8 2 4 9 3 6
2 8 4 9 3 6
2 3 4 9 8 6
2 3 4 9 8 6

Example:	8	2	4	9	3	6
	2	8	4	9	3	6
	2	3	4	9	8	6
	2	3	4	9	8	6
	2	3	4	6	8	9
	2	3	4	6	8	9

# What is the (worst-case) running time of SelectionSort?

- A. O(n)
- B. O(n log n)
- C.  $O(n\sqrt{n})$
- $\checkmark$ D. O(n<sup>2</sup>)
  - E.  $O(2^{n})$
  - F. I have no idea.

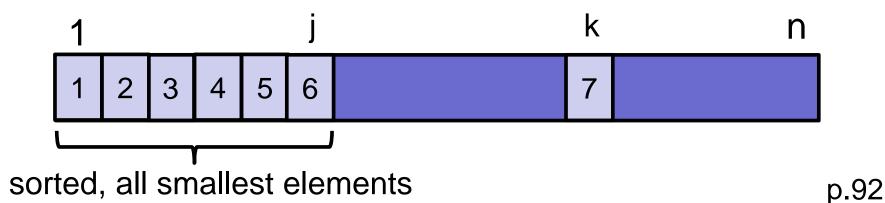


```
SelectionSort(A, n)

for j \leftarrow 1 to n-1:

find minimum element A[j] in A[j..n]

swap(A[j], A[k])
```



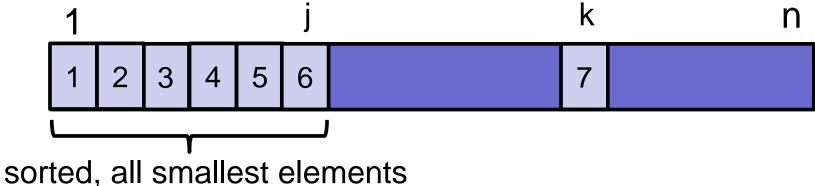
```
SelectionSort(A, n)

for j \leftarrow 1 to n-1:

find minimum element A[j] in A[j..n]

swap(A[j], A[k])
```

Running time: 
$$n + (n-1) + (n-2) + (n-3) + ...$$



p.93

## **Basic facts**

$$n + (n-1) + (n-2) + (n-3) + ... + 1 = (n)(n+1)/2$$
  
=  $\Theta(n^2)$ 

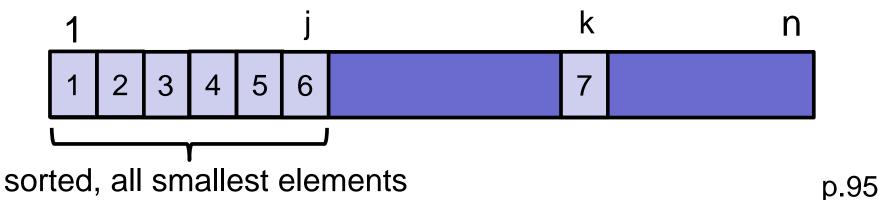
```
SelectionSort(A, n)

for j \leftarrow 1 to n-1:

find minimum element A[j] in A[j..n]

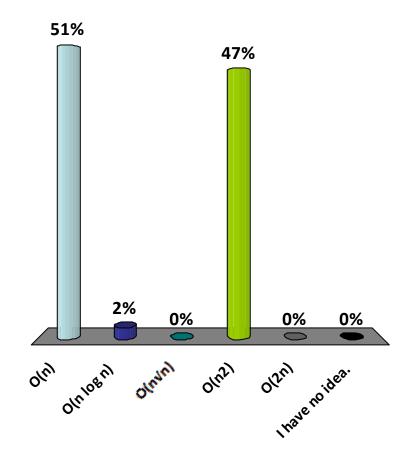
swap(A[j], A[k])
```

Running time: O(n²)



# What is the BEST CASE running time of SelectionSort?

- A. O(n)
- B. O(n log n)
- C.  $O(n\sqrt{n})$
- $\checkmark$ D. O(n<sup>2</sup>)
  - E.  $O(2^{n})$
  - F. I have no idea.



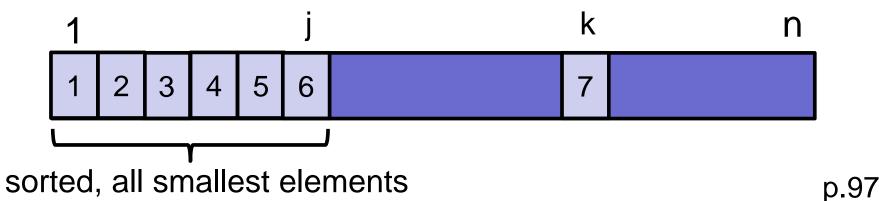
```
SelectionSort(A, n)

for j \leftarrow 1 to n-1:

find minimum element A[j] in A[j..n]

swap(A[j], A[k])
```

Running time:  $O(n^2)$  and  $\Omega(n^2)$ 



# SelectionSort Analysis

Loop invariant:

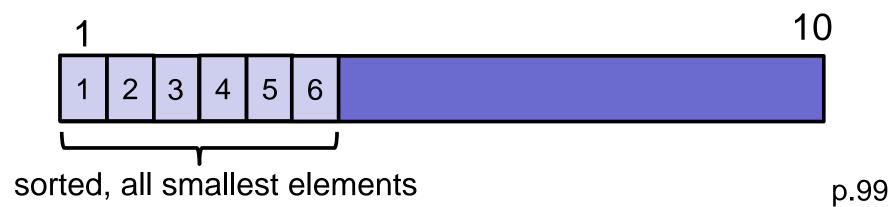
At the end of iteration j: ??

1

# SelectionSort Analysis

#### Loop invariant:

At the end of iteration j: the smallest j items are correctly sorted in the first j positions of the array.



# **Today: Sorting**

- Writing a sorting algorithm in Java
- Sorting algorithms
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  - o InsertionSort
  - MergeSort
- Properties
  - o Running time
  - Space usage
  - Stability

InsertionSort(A, n)

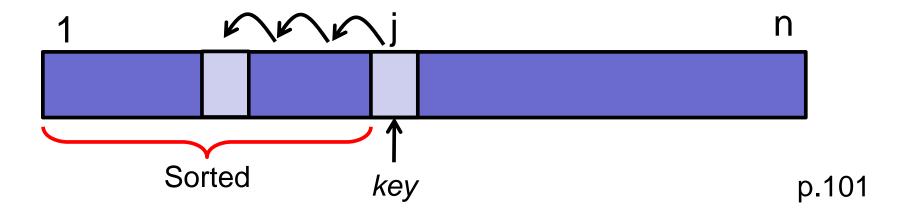
for 
$$j \leftarrow 2$$
 to n

**Invariant**: A[1..j-1] is sorted

 $key \leftarrow A[j]$ 

Insert key into the sorted array A[1..j-1]

#### Illustration:

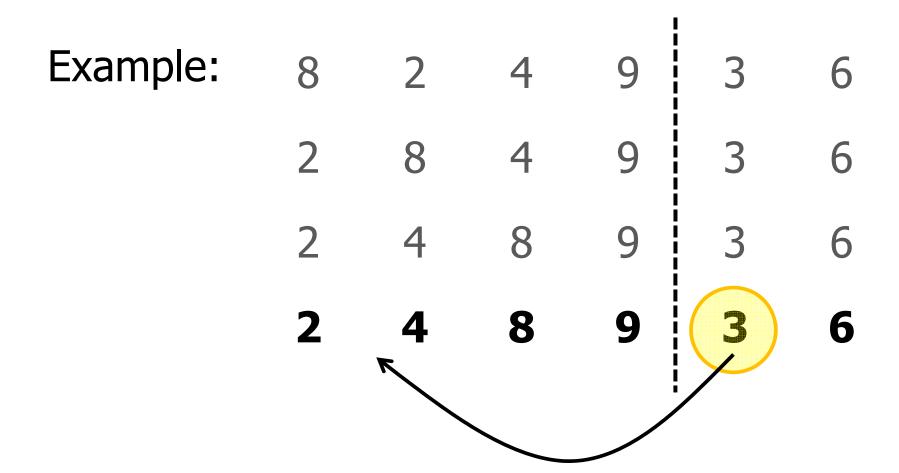


```
InsertionSort(A, n)
                                  Invariant: A[1..j-1] is sorted
      for j \leftarrow 2 to n
              key \leftarrow A[j]
              i \leftarrow j-1
              while (i > 0) and (A[i] > key)
                     A[i+1] \leftarrow A[i]
                     i \leftarrow i-1
              A[i+1] \leftarrow key
```

Example: 8 2 4 9 3 6

Example: 8 2 4 9 3 6
2 8 9 3 6

Example: 8 2 4 9 3 6
2 8 4 9 3 6
2 4 8 9 3 6

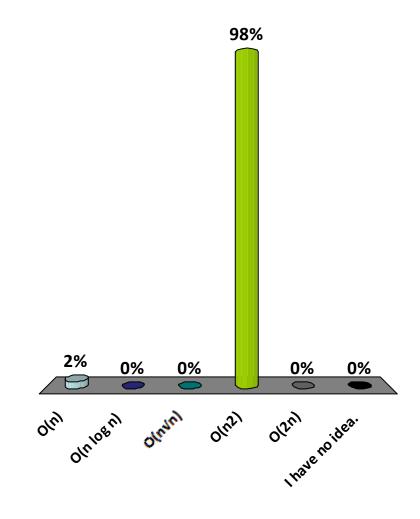


	2	3	4	8	9	6
	2	4	8	9	3	6
	2	4	8	9	3	6
	2	8	4	9	3	6
Example:	8	2	4	9	3	6

	2	3	4	6	8	9
	2	3	4	8	9	6
	2	4	8	9	3	6
	2	4	8	9	3	6
	2	8	4	9	3	6
Example:	8	2	4	9	3	6

# What is the (worst-case) running time of InsertionSort?

- A. O(n)
- B. O(n log n)
- C.  $O(n\sqrt{n})$
- $\checkmark$ D. O(n<sup>2</sup>)
  - E.  $O(2^{n})$
  - F. I have no idea.

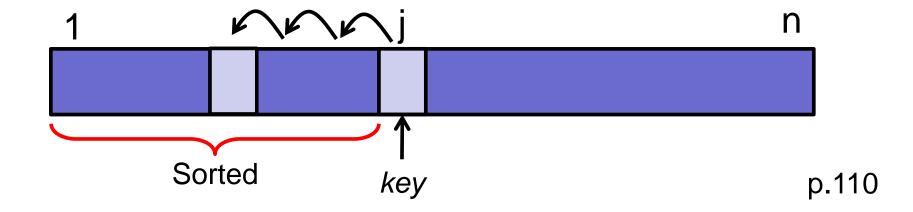


Insertion-Sort(A, n)

for 
$$j \leftarrow 2$$
 to n

$$key \leftarrow A[j]$$

Insert key into the sorted array A[1..j-1]



### **Insertion Sort Analysis**

```
Insertion-Sort(A, n)
       for j \leftarrow 2 to n
                key \leftarrow A[j]
                i \leftarrow j-1
                while (i > 0) and (A[i] > key)
A[i+1] \leftarrow A[i]
                                                                        Repeat at most
                           A[i+1] \leftarrow A[i]
                           i \leftarrow i-1
                A[i+1] \leftarrow key
```

### **Basic facts**

$$1 + 2 + 3 + ... + (n-2) + (n-1) + n$$
 =  $(n)(n+1)/2$  =  $\Theta(n^2)$ 

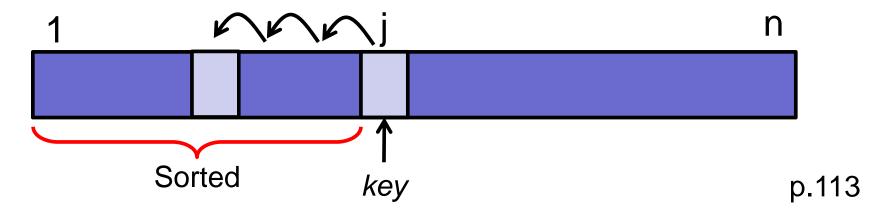
Insertion-Sort(A, n)

for 
$$j \leftarrow 2$$
 to  $n$ 

$$key \leftarrow A[j]$$

Insert key into the sorted array A[1..j-1]

Running time: O(n<sup>2</sup>)



Best-case:

#### Average-case:

Random permutation

Worst-case:

#### Best-case:

- Already sorted: [1, 2, 3, 4, 5, 6, 7, 8, 9, 10]

#### Average-case:

– Random permutation?

#### Worst-case:

- Inverse sorted: [10, 9, 8, 7, 6, 5, 4, 3, 2, 1]

Best-case: O(n) 
Very fast!

- Already sorted: [1, 2, 3, 4, 5, 6, 7, 8, 9, 10]

#### Average-case:

– Random permutation?

Worst-case: O(n<sup>2</sup>)

- Inverse sorted: [10, 9, 8, 7, 6, 5, 4, 3, 2, 1]

### Performance Profiling, V2

#### (Dracula vs. Lewis & Clark)

Step	Function	Running Time
Create vectors:	Read each file	1.09s
	Parse each file	3.68s
	Sort words in each file	332.13s
	Count word frequencies	0.30s
Dot product:		6.06s
Norm:		3.80s
Angle:		6.06s
Total:		<b>11minutes</b> ≈ <b>680.49s</b> p.118

# **Today: Sorting**

- Writing a sorting algorithm in Java
- Sorting algorithms
  - o BubbleSort
  - o SelectionSort
  - o InsertionSort
  - MergeSort
- Properties
  - o Running time
  - Space usage
  - Stability

#### Time complexity

• Worst case: O(n<sup>2</sup>)

Sorted list: BubbleSort

SelectionSort

**InsertionSort** 

Almost sorted list?

How expensive is it to sort:

[1, 2, 3, 4, 5, **7**, **6**, 8, 9, 10]

#### How expensive is it to sort:

[1, 2, 3, 4, 5, **7**, **6**, 8, 9, 10]

BubbleSort and InsertionSort are fast.

SelectionSort is slow.

#### **NB** Challenge of the Day:

Find a permutation of [1..n] where:

- BubbleSort is slow.
- InsertionSort is fast.

Or explain why no such sequence exists.

#### Space complexity

- Worst case: O(n)
- In-place sorting algorithm:
  - Only O(1) extra space needed.
  - All manipulation happens within the array.

So far:

All sorting algorithms we have seen are in-place.

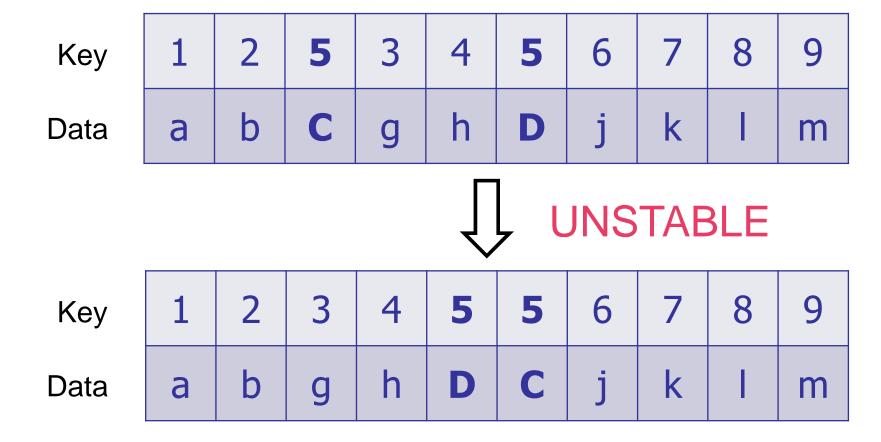
#### Stability

What happens with repeated elements?

Key	1	2	5	3	4	5	6	7	8	9
Data	а	b	С	g	h	D	j	k	I	m

#### Stability

What happens with repeated elements?



p.128

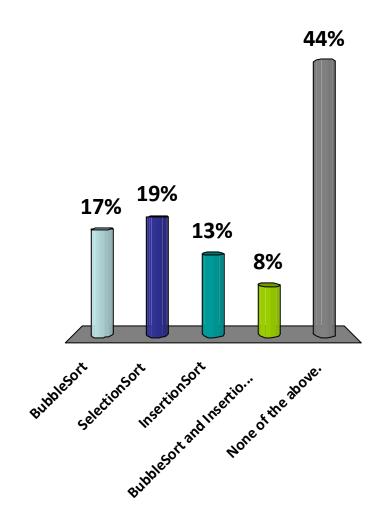
Stability: preserves order of equal elements

What happens with repeated elements?

Key	1	2	5	3	4	5	6	7	8	9
Data	а	b	С	g	h	D	j	k	1	m
	J STABLE									
Key	1	2	3	4	5	5	6	7	8	9
Data	a	b	g	h	С	D	j	k	T	m

#### Which are NOT stable?

- A. BubbleSort
- B. SelectionSort
- C. InsertionSort
- D. BubbleSort and InsertionSort
- E. None of the above.



```
Insertion-Sort(A, n)
      for j \leftarrow 2 to n
              key \leftarrow A[j]
             i ← j-1
             while(i > 0) and(A[i] > key)
                     A[i+1] \leftarrow A[i]
                     i \leftarrow i-1
                     A[i+1] \leftarrow key
```

### SelectionSort

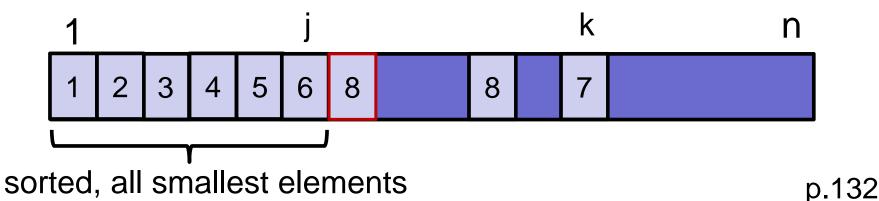
```
SelectionSort(A, n)

for j \leftarrow 1 to n-1:

find minimum element A[j] in A[j..n]

swap(A[j], A[k])
```

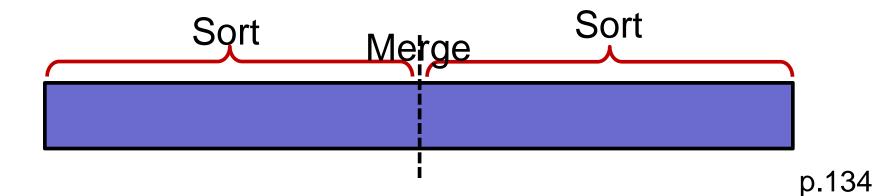
Stable: No: swap changes order



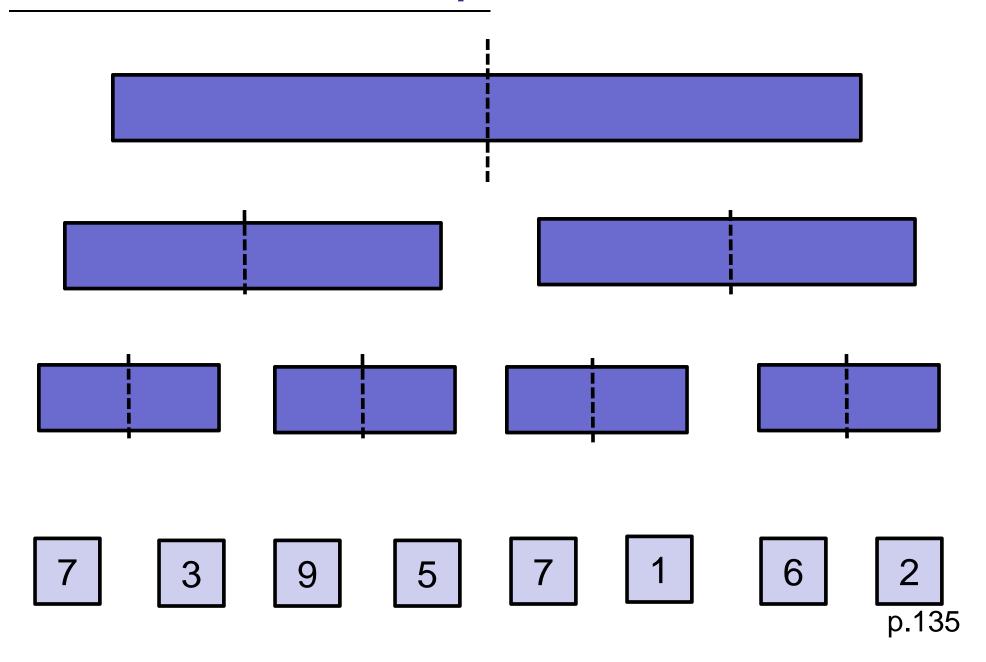
# **Today: Sorting**

- Writing a sorting algorithm in Java
- Sorting algorithms
  - o BubbleSort
  - o SelectionSort
  - o InsertionSort
  - MergeSort
- Properties
  - o Running time
  - Space usage
  - Stability

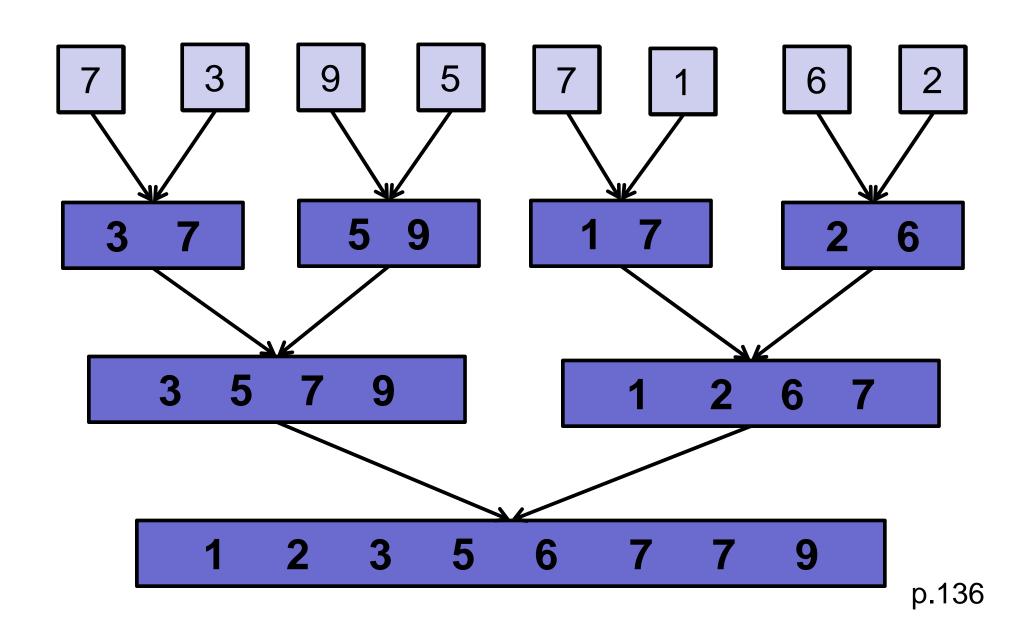
# MergeSort

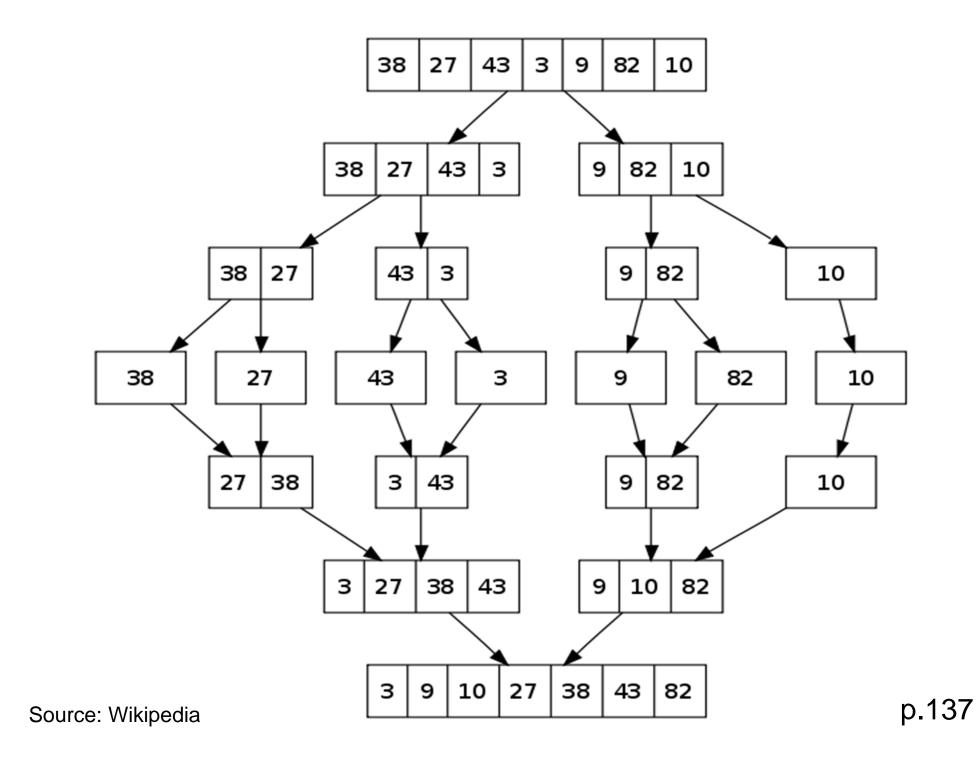


# Divide-and-Conquer



# Merging

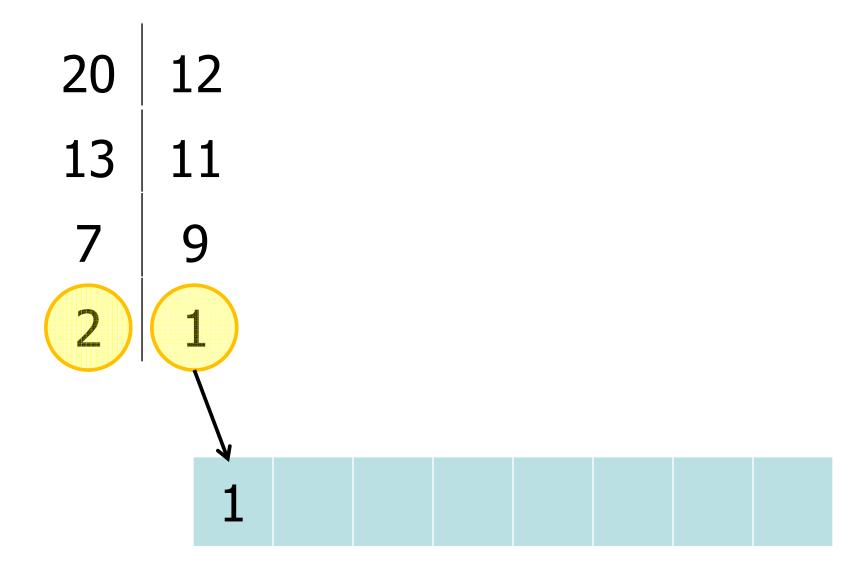


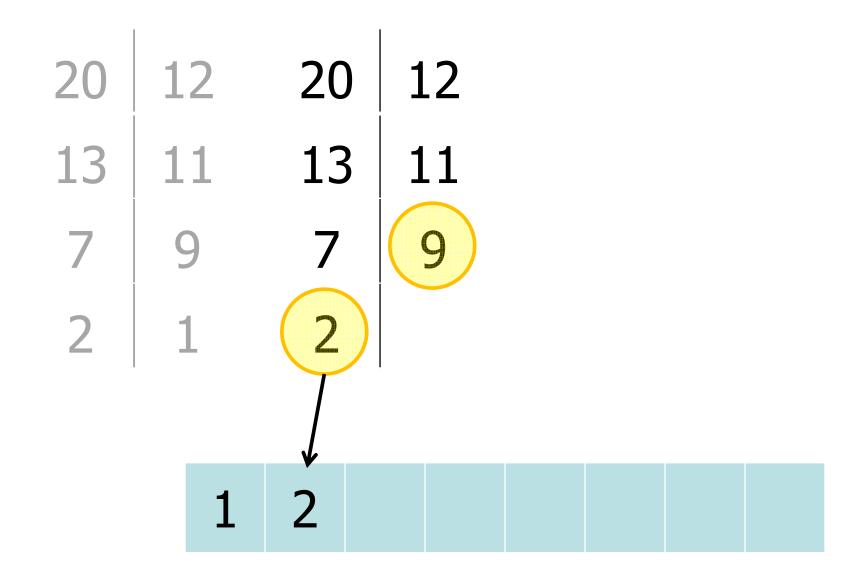


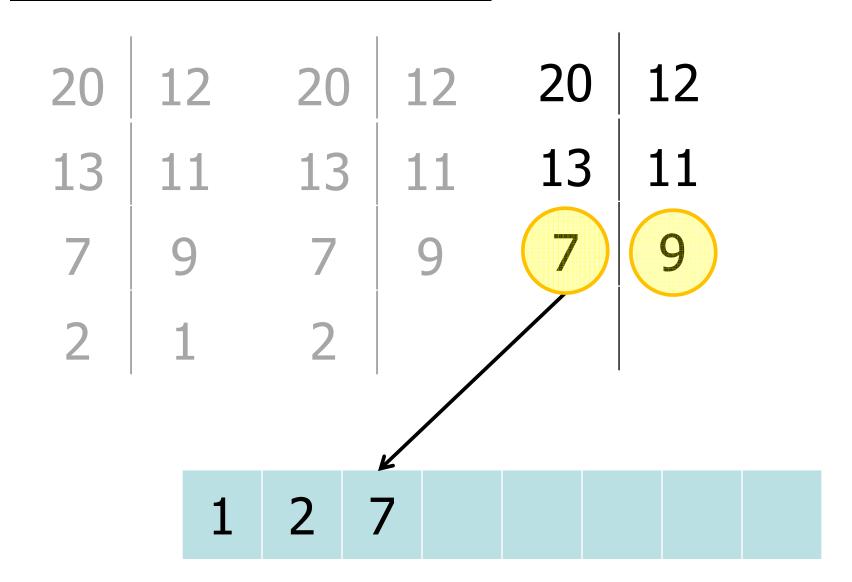
#### Key subroutine: Merge

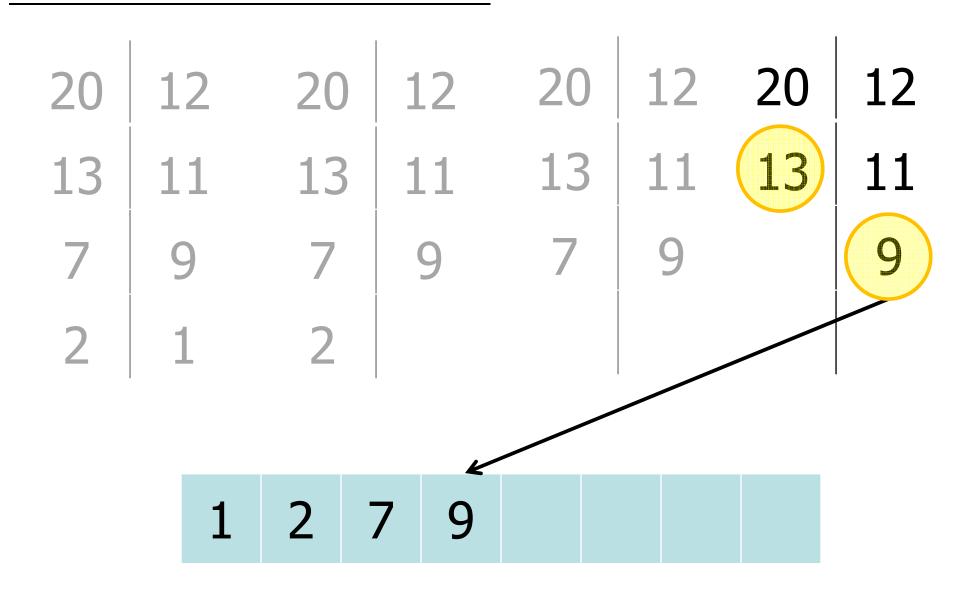
- How?
- How fast??

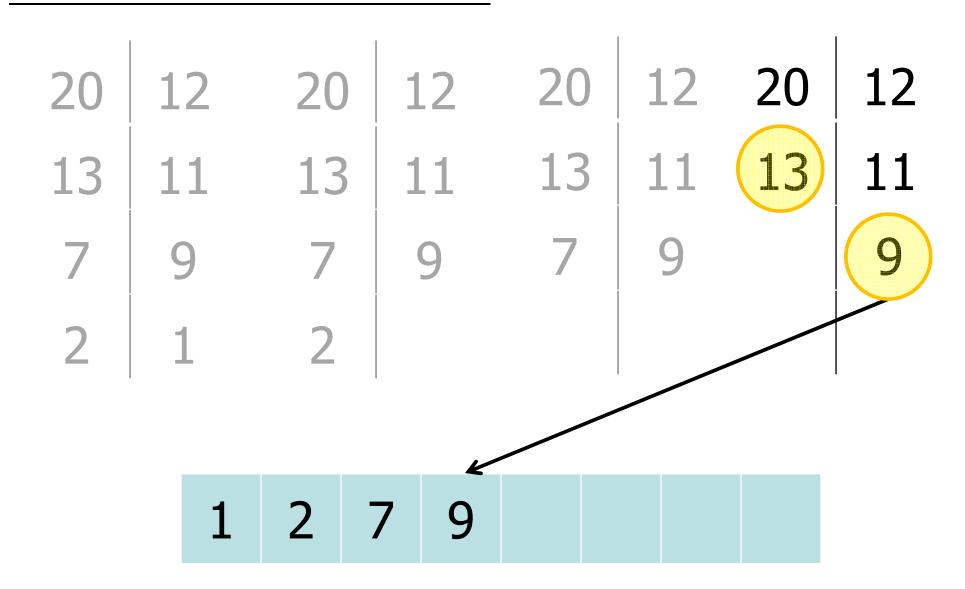
20 | 1213 | 117 | 92 | 1











20	12	20	12	20	12	20	12
13	11	13	11	13	11	13	11
7	9	7	9	7	9		
2	1	2					

1	2	7	9	11	12	13	20

# Merge: Running Time

#### Given two lists:

- A of size n/2
- B of size n/2

Total running time:??

# Merge: Running Time

#### Given two lists:

- A of size n/2
- B of size n/2

#### Total running time: O(n) = cn

In each iteration, move one element to final list

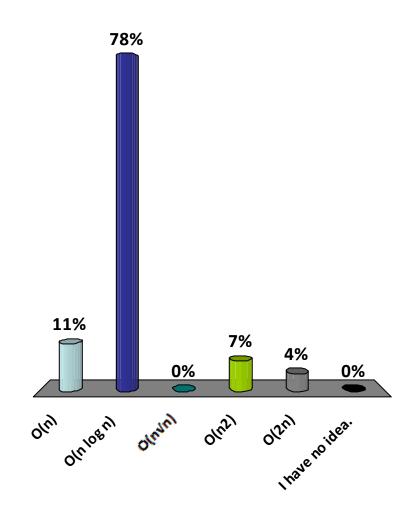
Let T(n) be the worst-case running time for an array of n elements.

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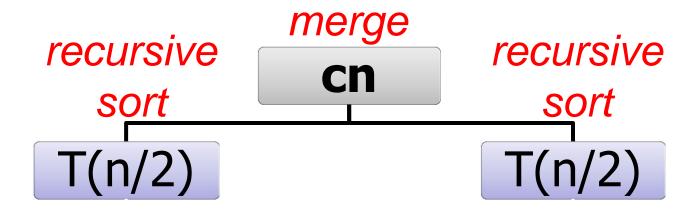
$$T(n) = \theta(1)$$
 if (n=1)  
=  $2T(n/2) + cn$  if (n>1)

# What is the (worst-case) running time of MergeSort?

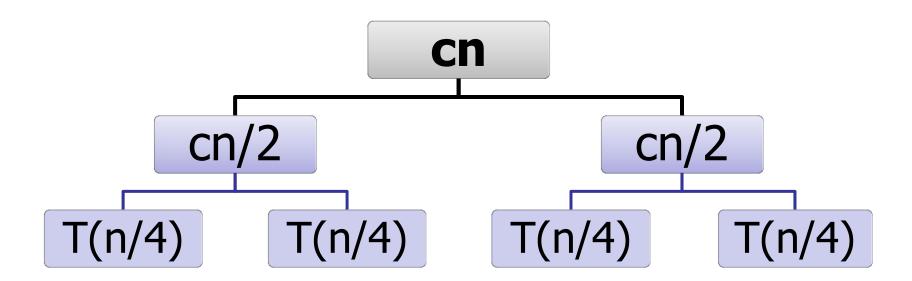
- A. O(n)
- ✓ B. O(n log n)
  - C.  $O(n\sqrt{n})$
  - D.  $O(n^2)$
  - E.  $O(2^{n})$
  - F. I have no idea.



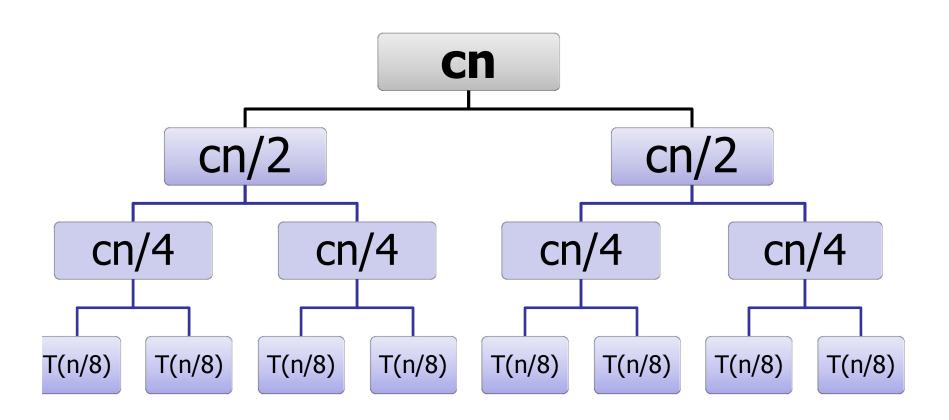
$$T(n) = 2T(n/2) + cn$$



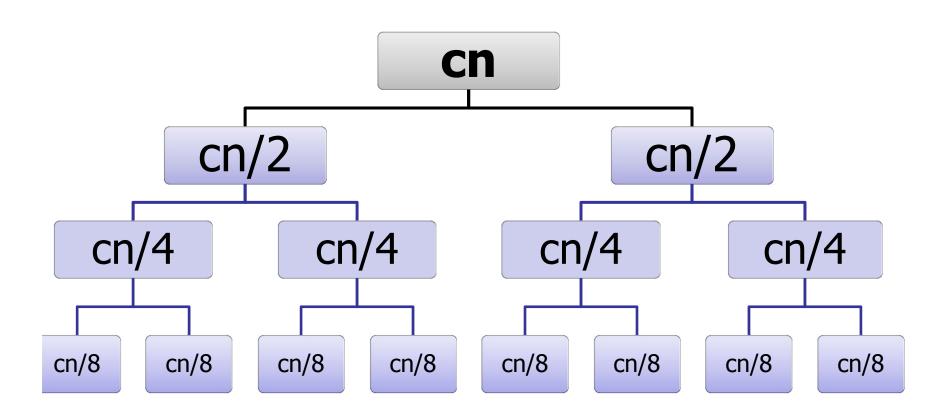
$$T(n) = 2T(n/2) + cn$$



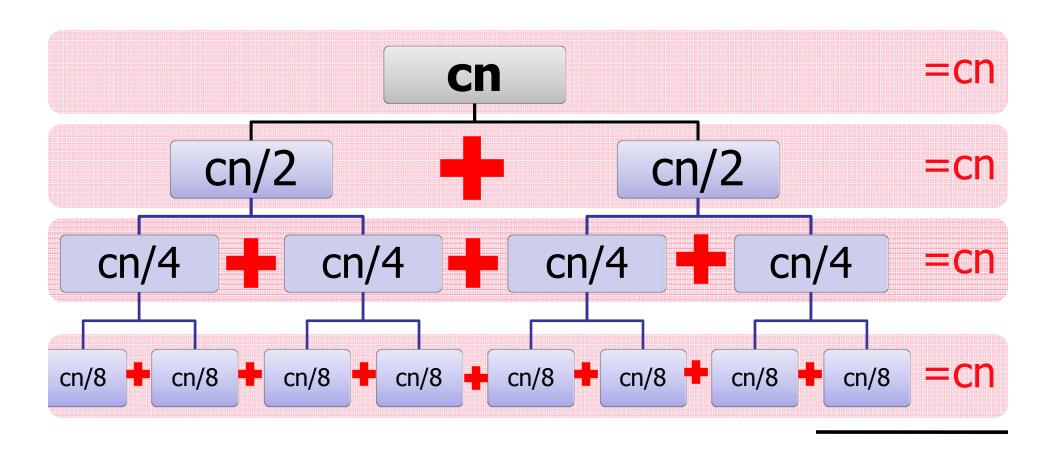
$$T(n) = 2T(n/2) + cn$$



$$T(n) = 2T(n/2) + cn$$



$$T(n) = 2T(n/2) + cn$$



$$T(n) = 2T(n/2) + cn$$

Level	Number
0	1
1	2
2	4
3	8
4	16
h	??

Number =  $2^{\text{Level}}$ 

$$T(n) = 2T(n/2) + cn$$

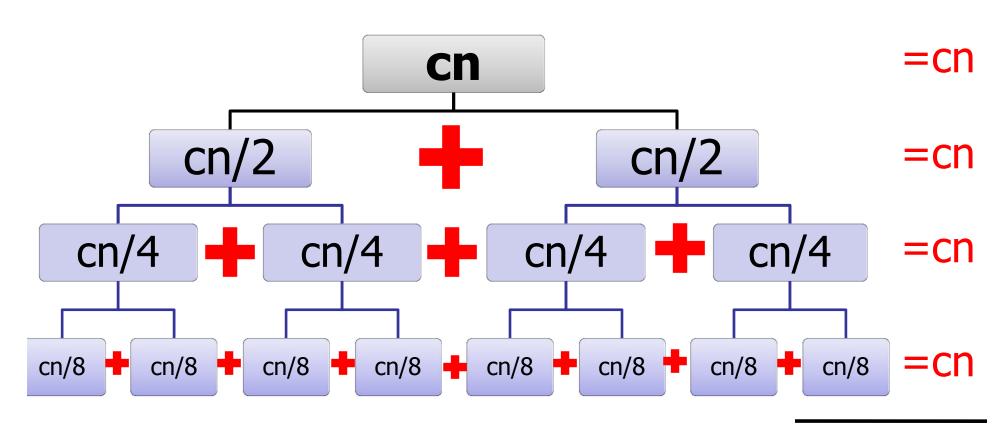
Level	Number
0	1
1	2
2	4
3	8
4	16
h	n

Number = 
$$2^{Level}$$

$$n = 2^h$$

$$\log n = h$$

$$T(n) = 2T(n/2) + cn$$



cn log n

```
T(n) = O(n \log n)
MergeSort(A, n)
     if (n=1) then return;
     else:
           X \leftarrow MergeSort(...);
           Y \leftarrow MergeSort(...);
     return Merge (X,Y, n/2);
```

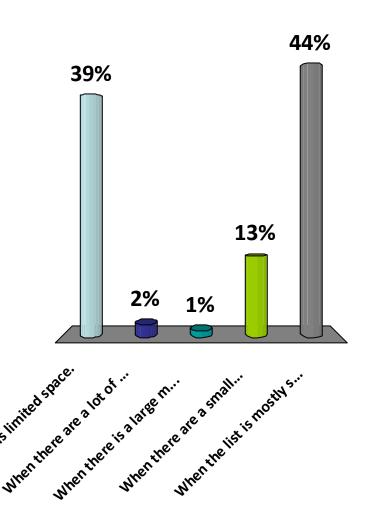
# Performance Profiling

#### (Dracula vs. Lewis & Clark)

Version	Change	Running Time
Version 1		4,311.00s
Version 2	Better file handling	676.50s
Version 3	Faster sorting	6.59s
Version 4	No sorting!	2.35s

# When is it better to use InsertionSort instead of MergeSort?

- A. When there is limited space.
- B. When there are a lot of items to sort.
- C. When there is a large memory cache.
- D. When there are a small number of items.
- E. When the list is mostly sorted.



#### When the list is mostly sorted:

- InsertionSort is fast!
- MergeSort is O(n log n)

How "close to sorted" should a list be for InsertionSort to be faster?

#### Small number of items to sort:

- MergeSort is slow!
- Caching performance, branch prediction, etc.
- User InsertionSort for n < 1024, say.</li>

#### Base case of recursion:

Use slower sort.

#### Space usage:

- Need extra space to do merge.
- Merge copies data to new array.
- How much extra space??

#### **NB** Challenge of the Day 2:

How much space does MergeSort need to sort n items?

#### Stability:

- MergeSort is stable if "merge" is stable.
- Merge is stable if carefully implemented.

# **Sorting Analysis**

#### **Summary:**

BubbleSort: O(n<sup>2</sup>)

SelectionSort: O(n<sup>2</sup>)

InsertionSort: O(n<sup>2</sup>)

MergeSort: O(n log n)

Properties: time, space, stability

#### For next time...

#### Friday lecture:

More sorting

#### **Problem Set 3:**

Released today. Due next week.