

# Lecture 2: MergeSort

CS 341: Algorithms

Thu, Jan 10<sup>th</sup> 2019

# Outline For Today

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1. Example 1: Sorting-Merge Sort-Divide & Conquer

# Sorting

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◆ Input: An array of integers in *arbitrary* order

10	2	37	5	9	55	20
----	---	----	---	---	----	----

◆ Output: Same array of integers in *increasing* order

2	5	9	10	20	37	55
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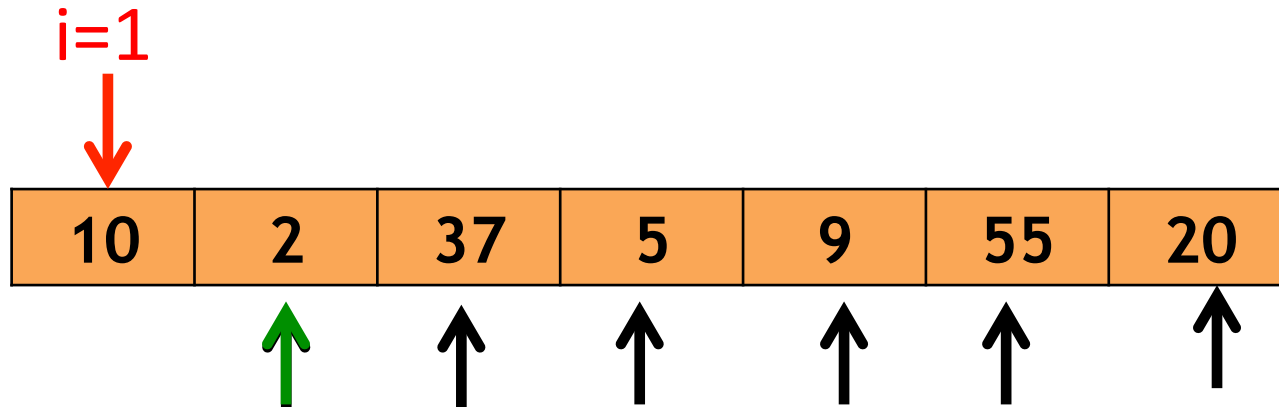
# Algorithm 1: Selection Sort

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```
procedure selectionSort(Array X of size n):  
  for i = 1 to n {  
    let minIndex = i;  
    for j = i+1 to n {  
      if X[j] < X[minIndex]  
        minIndex = j  
    }  
    X[i] <--> X[minIndex] (swap in place)  
  }  
return X
```

# SelectionSort Simulation

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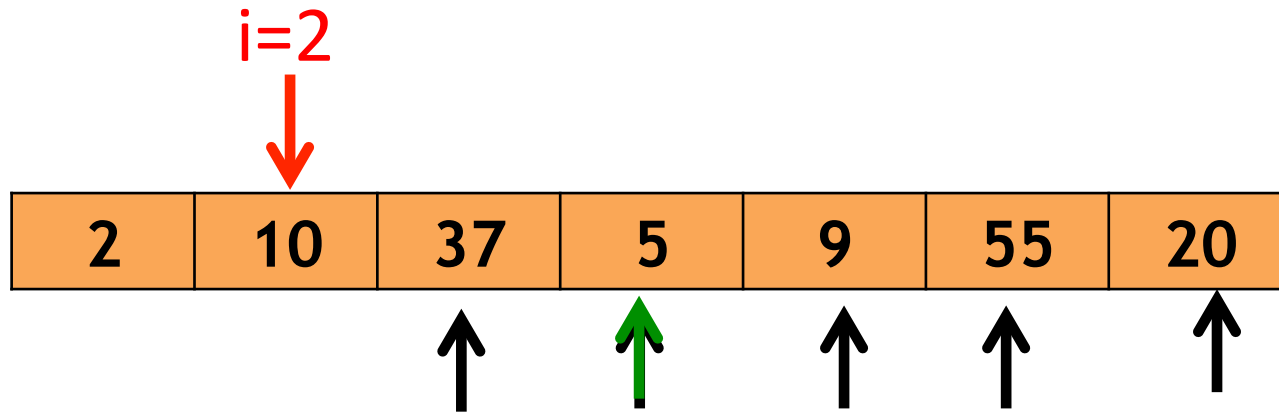


minElement: 2

minIndex: 2

# SelectionSort Simulation

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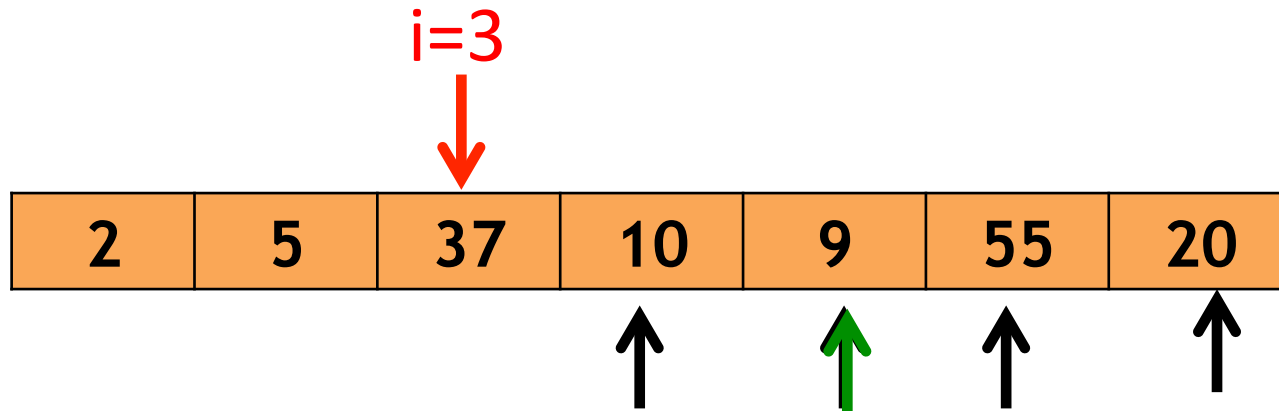


minElement: 5

minIndex: 4

# SelectionSort Simulation

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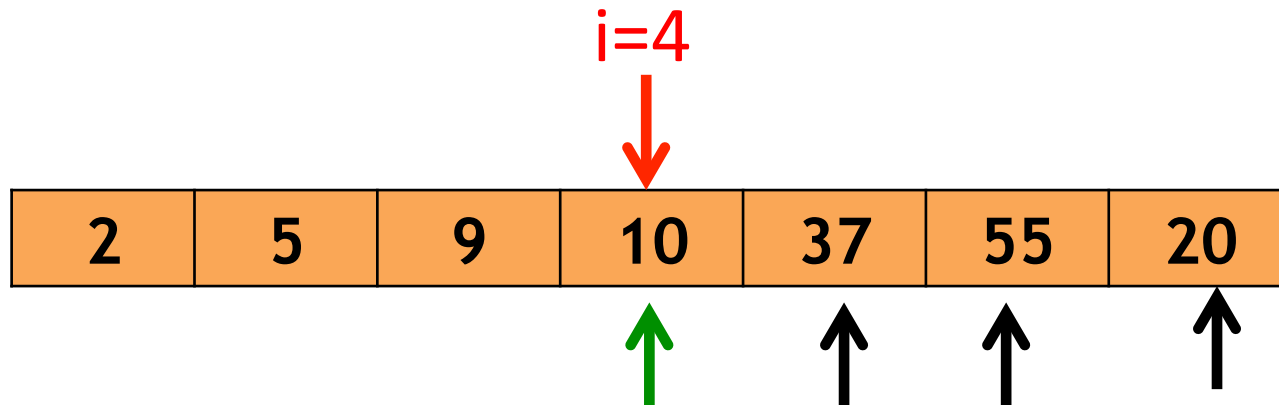


minElement: 9

minIndex: 5

# SelectionSort Simulation

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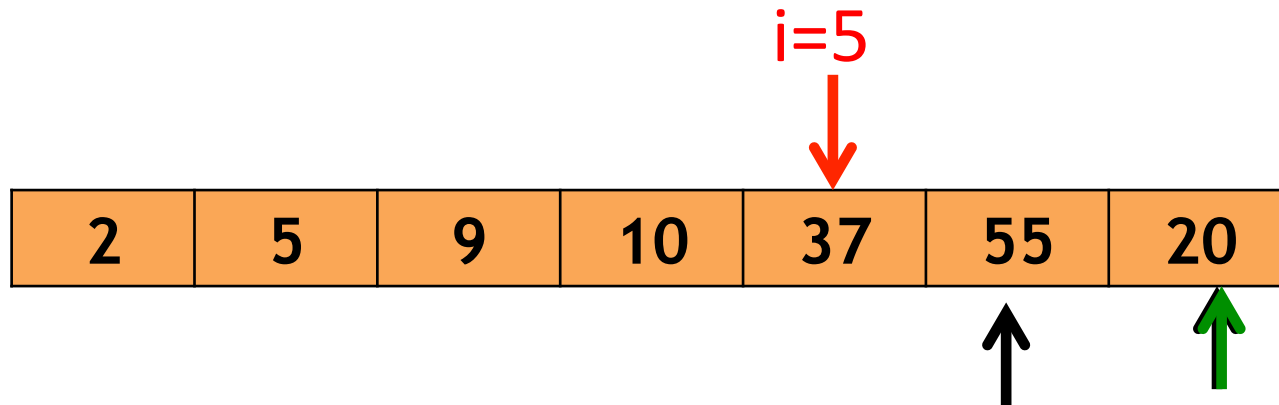
minElement: 10

minIndex: 4



# SelectionSort Simulation

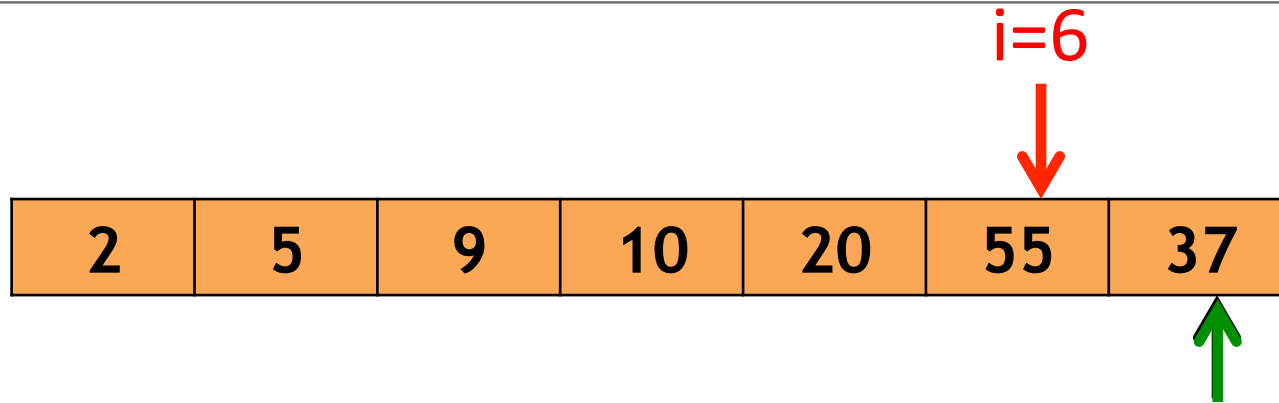
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minElement: 20  
minIndex: 7

# SelectionSort Simulation

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minElement: 37  
minIndex: 7

# SelectionSort Simulation

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2	5	9	10	20	37	55
---	---	---	----	----	----	----

Final Output

# Analysis of Selection Sort

◆ Q: How much time (# operations) does SelectionSort take?

```
procedure selectionSort(Array X of size n):  
  for i = 1 to n {  $\longrightarrow$  1 Op  
    let minIndex = i;  $\longrightarrow$  1 Op  
    for j = i+1 to n {  $\longrightarrow$  1 Op  
      if X[j] < X[minIndex]  $\longrightarrow$  1 Op  
        minIndex = j  $\longrightarrow$  1 Op  
    }  
    X[i]  $\longleftrightarrow$  X[minIndex]  $\longrightarrow$  1 Op  
  }  
return X
```

$\left. \begin{array}{l} \longrightarrow 1 \text{ Op} \\ \longrightarrow 1 \text{ Op} \\ \longrightarrow 1 \text{ Op} \end{array} \right\} 3 \text{ Ops}$

# Analysis of Selection Sort

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◆ Inner Loop Block:  $3(n-1) + 3(n-2) + \dots + 3$

$$3 \sum_{k=1}^{n-1} k = \frac{3(n-1)n}{2} = \frac{3n^2 - 3n}{2}$$

◆ Outer Loop Line:  $n$

◆ Initial Assignment Line:  $n$

◆ Swap Line:  $n$

◆ Total:  $\frac{3n^2 + 3n}{2}$

*\*\*SelectionSort takes  $(3n^2 + 3n)/2$  time on an input of size  $n$ .\*\**

# Criticism of Our Analysis & Sloppiness in CS 341

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- ◆ Criticism 1: Loop increment is not 1 but 2 operations.
- ◆ Criticism 2: Swap is not 1 but 3 operations.
- ◆ Criticism 3: At machine level, swap might be 100 operations.

*In CS 341, we'll be sloppy in our counting of what constitutes how many operations.*

*We'll count as “1 operation” high-level operations such as addition/subtraction/comparison/swap, etc.*

- ◆ Will make more formal with Big-oh notation in a few lectures

# Algorithm 2: MergeSort (Divide & Conquer)

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◆ Assume  $n$  is power of 2. (Doesn't really matter)

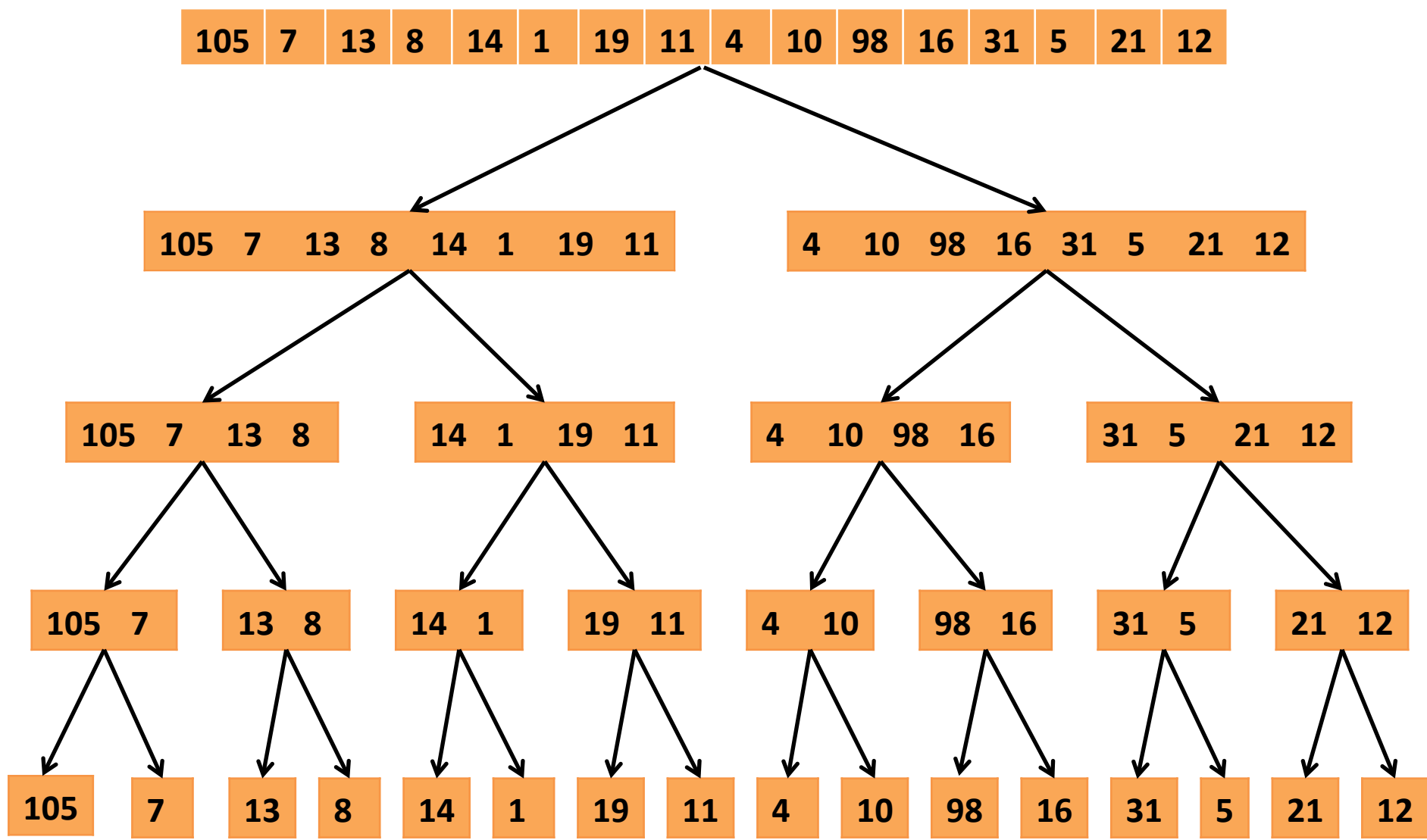
**procedure** mergeSort(Array  $X$  of size  $n$ ):

1. mergeSort(left subarray  $X[1, \dots, n/2]$ )
2. mergeSort(right subarray  $X[n/2+1, \dots, n]$ )
3. combine the left & right sorted halves



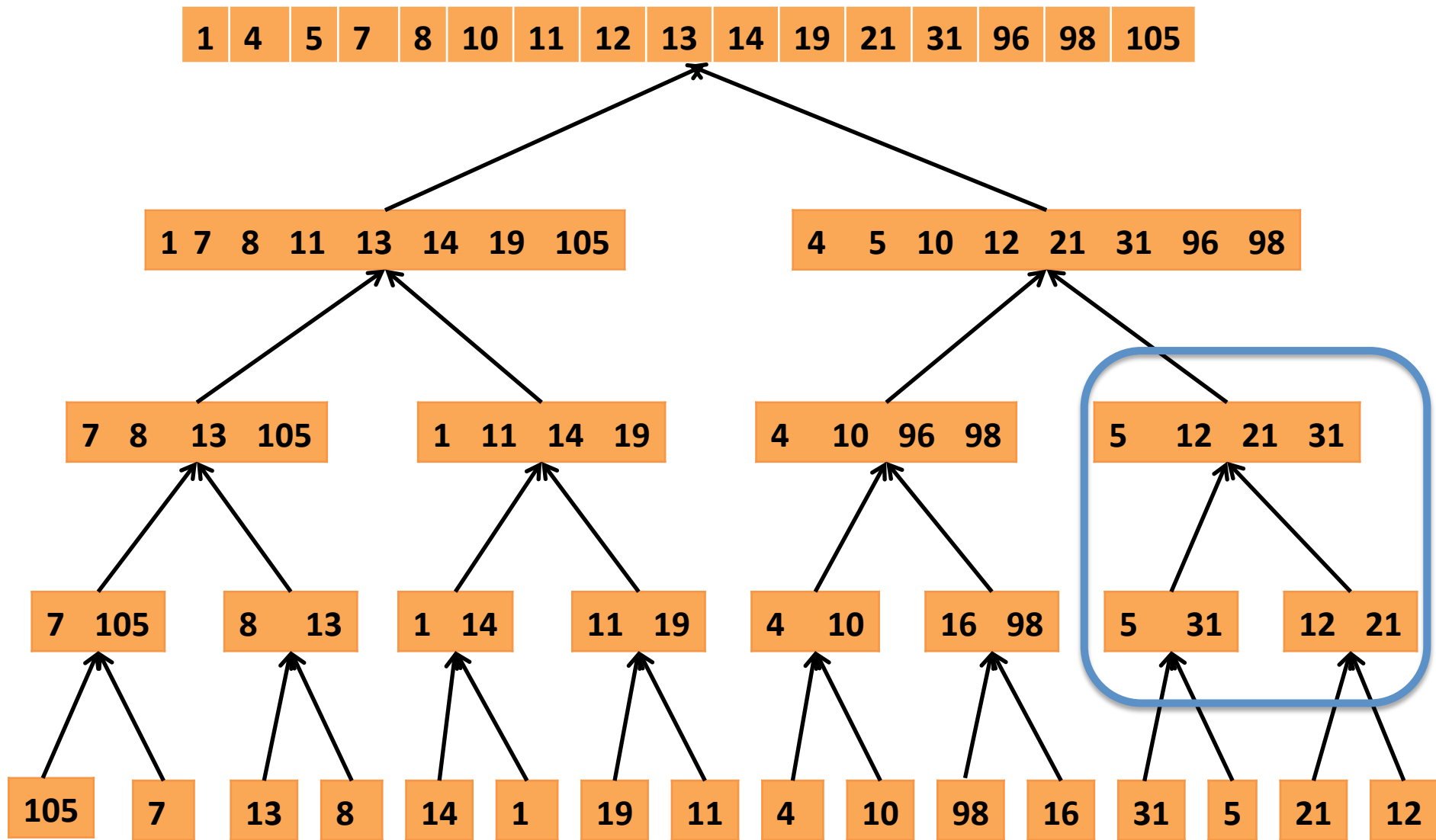
Will simulate how the third step is done.

# MergeSort Downward-Recursive Steps



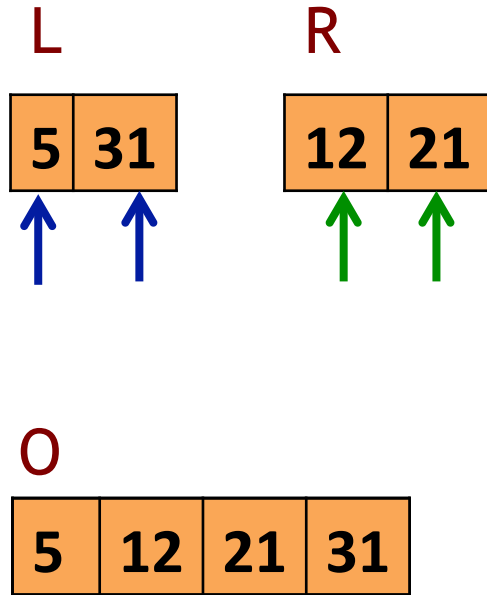


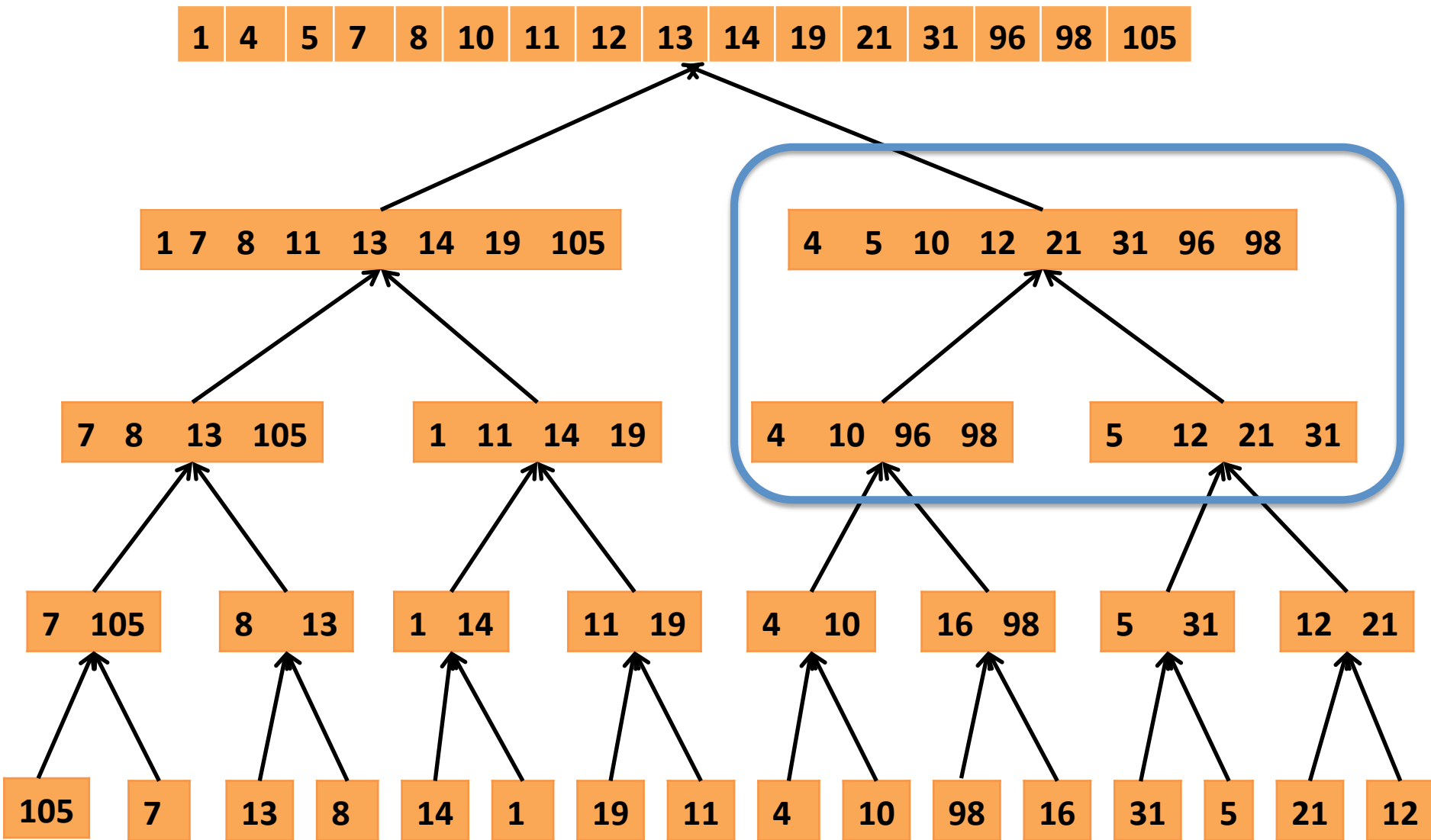
# MergeSort Upward-Recursive Steps



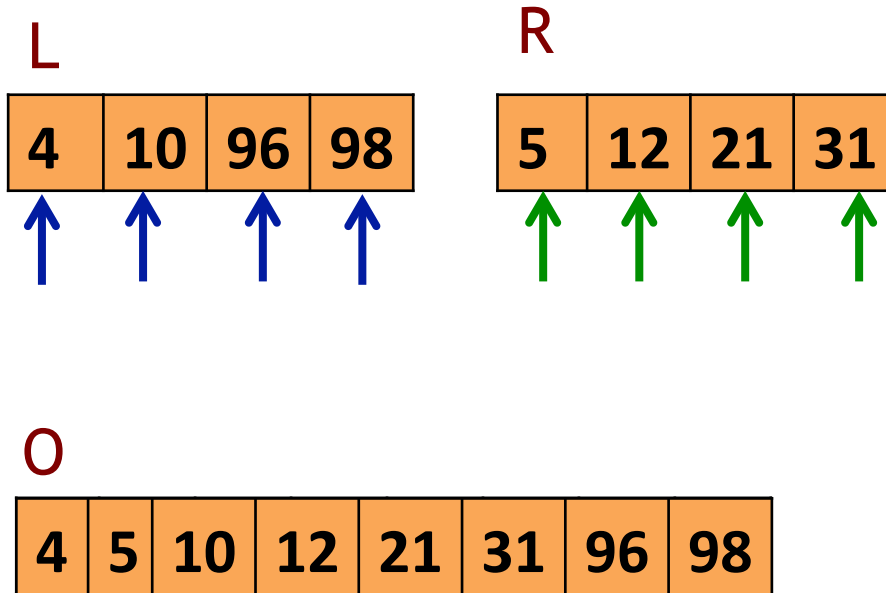
# Merge Subroutine Simulation 1

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# Combine Subroutine Simulation 2



# Pseudocode for Merge Subroutine

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```
procedure merge(sorted lists L,R of size  $m/2$ ):  
    Out = empty array of size m  
    i = 1; j = 1;  
    for k = 1 to m:  
        if L[i] < R[j]:  
            Out[k] = L[i];  
            i++;  
        else:  
            Out[k] = R[j];  
            j++;
```

# Analysis of MergeSort

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◆ Q: How much time (# operations) does MergeSort take?

**procedure** mergeSort(Array X of size n):  
    1. mergeSort(left subarray  $X[1, \dots, n/2]$ )  
    2. mergeSort(right subarray  $X[n/2+1, \dots, n]$ )  
    3. merge the left & right sorted halves



Simpler Question: How many operations does the the merge subroutine (step 3 take) on an input of size  $m$ ?

# Analysis for Merge Subroutine

**procedure** merge(sorted lists L,R of size  $m/2$ ):

Out = empty array of size  $m$   $\longrightarrow$   $m$  ops

$i = 1; j = 1;$   $\longrightarrow$  2 ops

**for**  $k = 1$  to  $m$ :  $\longrightarrow$  1 op

**if**  $L[i] < R[j]$ :  $\longrightarrow$  1 op

$\text{Out}[k] = L[i];$   $\longrightarrow$  1 op

$i++;$   $\longrightarrow$  1 Op

**else:**

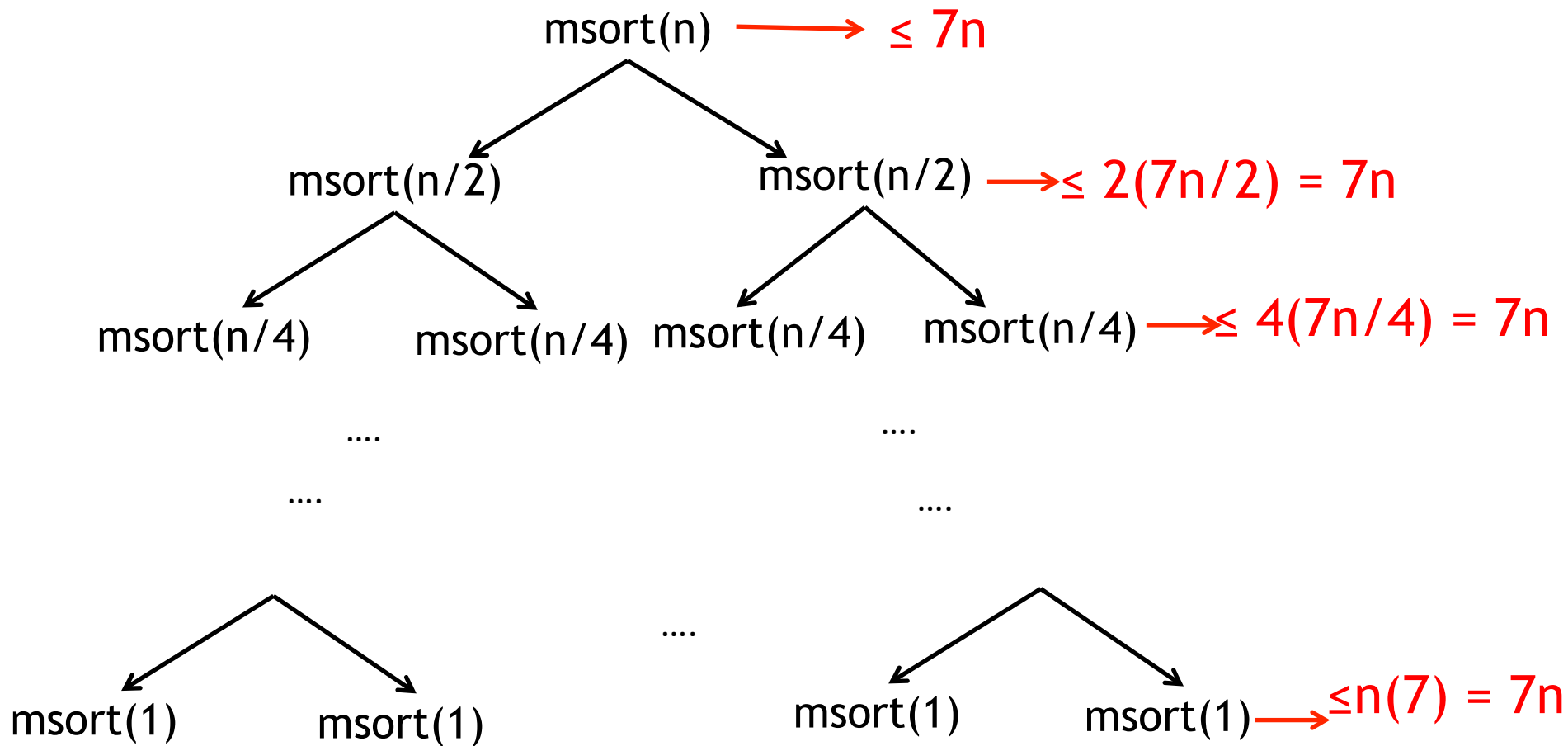
$\text{Out}[k] = R[j];$   $\longrightarrow$  1 op

$j++;$   $\longrightarrow$  1 Op

} 4 ops

Total:  $m + 2 + 4m = 5m + 2 \leq 7m$

# Analysis of MergeSort



Total =  $7n * \# \text{levels}$

Total =  $7n * \log_2(n)$

**\*\*MergeSort takes  $7n \log_2(n) + 7n$  time on an input of**



# CS 341 Diagram

## Fundamental (& Fast) Algorithms to Tractable Problems

- MergeSort
- Strassen's MM
- BFS/DFS
- Dijkstra's SSSP
- Kosaraju's SCC
- Kruskal's MST
- Floyd Warshall APSP
- Topological Sort
- ...

## Common Algorithm Design Paradigms

- Divide-and-Conquer
- Greedy
- Dynamic Programming

## Mathematical Tools to Analyze Algorithms

- Big-oh notation
- Recursion Tree
- Master method
- Substitution method
- Exchange Arguments

## Intractable Problems

- P vs NP
- Poly-time Reductions
- Undecidability

## Other (Last Lecture)

- Randomized/Online/Parallel Algorithms

# CS 341 Assumptions & Justifications (1)

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## 1. Worst-case Runtime Analysis

- Justification 1: Easier to make worst-case analysis
- Justification 2: Holds under any input => Very strong statement

## 2. “Sloppy” in counting

- Justification: Can agree on high-level ops but impossible to agree on low-level ops
  - ✧ Will be different from language to language/architecture to architecture/compiler to compiler

# CS 341 Assumptions & Justifications (2)

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## 3. Interested in very large inputs

- ◆ Mathematically can't say  $3n^2 + 3n/2 > 7n\log_2(n) \Rightarrow$  depends on  $n$
- ◆ But for large  $n$ , can say that  $3n^2 + 3n/2 > 7n\log_2(n)$
- ◆ So we'll say: *MergeSort is better than SelectionSort*