Sorting

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Objectives

- To study and analyze time complexity of various sorting algorithms
 - To design, implement, and analyze *insertion sort*
 - To design, implement, and analyze *bubble sort*
 - To design, implement, and analyze *merge sort*
 - To design, implement, and analyze *quick sort*
 - To design and implement a binary heap
 - To design, implement, and analyze *heap sort*
 - To design, implement, and analyze *bucket sort* and *radix sort*
 - To design, implement, and analyze *external sort* for files that have a large amount of data

What data to sort?

- The data to be sorted might be integers, doubles, characters, or objects that are comparable.
- For simplicity, this section assumes:
 - data to be sorted are integers
 - data are sorted in ascending order
 - data are stored in an *array*
 - The programs can be easily modified to sort other types of data, to sort in descending order, or to sort data in an **ArrayList** or a **LinkedList**.
- The Java API contains several overloaded sort methods for sorting primitive type values and objects in the java.util.Arrays and java.util.Collections class.

Insertion Sort

int[] myList = {2,9,5,4,8,1,6}; // Unsorted

The *insertion sort* algorithm sorts a list of values by repeatedly inserting an unsorted element into a sorted sublist until the whole list is sorted.

Step 1: Initially, the sorted sublist contains the first element in the list. Insert 9 into the sublist.

Step 2: The sorted sublist is $\{2, 9\}$. Insert 5 into the sublist.

Step 3: The sorted sublist is {2, 5, 9}. Insert 4 into the sublist.

Step 4: The sorted sublist is {2, 4, 5, 9}. Insert 8 into the sublist.

Step 5: The sorted sublist is {2, 4, 5, 8, 9}. Insert 1 into the sublist.

Step 6: The sorted sublist is {1, 2, 4, 5, 8, 9}. Insert 6 into the sublist.

Step 7: The entire list is now sorted.

2 9 5 4 8 1 6

 $\begin{array}{c}
\downarrow \\
2 \longrightarrow 4 \longrightarrow 5 \longrightarrow 8 \longrightarrow 9 \longrightarrow 1
\end{array}$

1 2 4 5 6 8

How to Insert 4 in sorted order?

[0] [1] [2] [3] [4] [5] [6] list 2 5 9 4

Step 1: Save 4 to a temporary variable currentElement

[0] [1] [2] [3] [4] [5] [6]

Step 2: Move list[2] to list[3]

[0] [1] [2] [3] [4] [5] [6]

Step 3: Move list[1] to list[2]

[0] [1] [2] [3] [4] [5] [6]

Step 4: Assign currentElement to list[1]

list

list

list

InsertionSort - From Idea to Solution

```
for (int i = 1; i < list.length; i++) {</pre>
  insert list[i] into a sorted sublist list[0..i-1] so that
         list[0..i] is sorted
}
        Expand
   int currentElement = list[i];
   int k;
   for (k = i - 1; k \ge 0 \&\& list[k] > currentElement; k--) {
     list[k + 1] = list[k];
   // Insert the current element into list[k + 1]
   list[k + 1] = currentElement;
```

InsertionSort - From Idea to Solution

```
public static void insertionSort(int[] list) {
  for (int i = 1; i < list.length; i++) {</pre>
    int currentElement = list[i];
    int k;
    for (k = i - 1; k \ge 0 \&\& list[k] > currentElement; k--)
      list[k + 1] = list[k];
    // Insert the current element into list[k + 1]
    list[k + 1] = currentElement;
int[] list = {1, 9, 4, 6, 5, -4};
InsertionSort.insertionSort(list);
    To insert the first element, we need 1 comparison and at most 1 swap
    To insert the last element, we need n-1 comparisons and at most n-1 swaps
       T(n) = (2+c) + (2 \times 2 + c) + \cdots + (2 \times (n-1) + c)
            = 2(1 + 2 + \cdots + n - 1) + c(n - 1)
            =2\frac{(n-1)n}{2}+cn-c=n^2-n+cn-c
            = O(n^2)
```

```
public class InsertionSort {
  public static void main(String[] args) {
    int size = 100000;
    int[] a = new int[size];
    randomInitiate(a);
    long startTime = System.currentTimeMillis();
    insertionSort(a);
    long endTime = System.currentTimeMillis();
    System.out.println((endTime - startTime) + "ms");
  private static void randomInitiate(int[] a) {
    for (int i = 0; i < a.length; i++)
      a[i] = (int) (Math.random() * a.length);
  public static void insertionSort(int[] list) {
    for (int i = 1; i < list.length; i++) {
      int currentElement = list[i];
      int k;
      for (k = i - 1; k \ge 0 \&\& list[k] > currentElement; k--)
        list[k + 1] = list[k];
      // Insert the current element into list[k + 1]
      list[k + 1] = currentElement;
3641ms
                         (c) Paul Fodor (CS Stony Brook) & Pearson
```

Bubble Sort

- Repeatedly steps through the list to be sorted, compares each <u>pair of</u>
 <u>adjacent items</u> and <u>swaps them if they are in the wrong order</u>
 - After the first pass, the last element becomes the largest in the array
 - After the second pass, the second-to-last element becomes the second largest in the array
 - It is called "bubble" sort because the large values gradually "bubble" to the top (end of the array)
 - It is also called "*sinking sort*" because the smaller values gradually "*sink*" their way to the bottom (beginning of the array)

```
for (int k = 1; k < list.length; k++) {
   // Perform the kth pass
  for (int i = 0; i < list.length - k; i++) {
   if (list[i] > list[i + 1])
      // swap list[i] with list[i + 1];
   ...
```

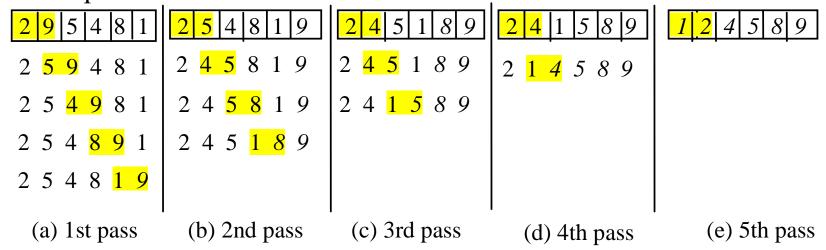
Bubble Sort Optimization

- The pass through the list is <u>repeated until no swaps are needed</u>, which indicates that the list is sorted
 - If no swap takes place in a pass, there is no need to perform the next pass, because all the elements are already sorted!
 - We can use this property to improve the previous algorithm:

```
boolean needNextPass = true;
for (int k = 1; k < list.length && needNextPass; k++) {
    // Array may be sorted and next pass not needed
    needNextPass = false;
    // Perform the kth pass
    for (int i = 0; i < list.length - k; i++) {
        if (list[i] > list[i + 1]) {
            // swap list[i] with list[i + 1];
            needNextPass = true; // Next pass still needed
        }
    }
}
```

Bubble Sort Example

• Example:



- In the **best case**, the bubble sort algorithm needs just the first pass to find that the array is already sorted—no next pass is needed. Since the number of comparisons is n 1 in the first pass, the best-case time for a bubble sort is O(n).
- Worse case: $(n-1) + (n-2) + ... + 2 + 1 = \frac{n}{2} \frac{n}{2}$

time: $O(n^2)$

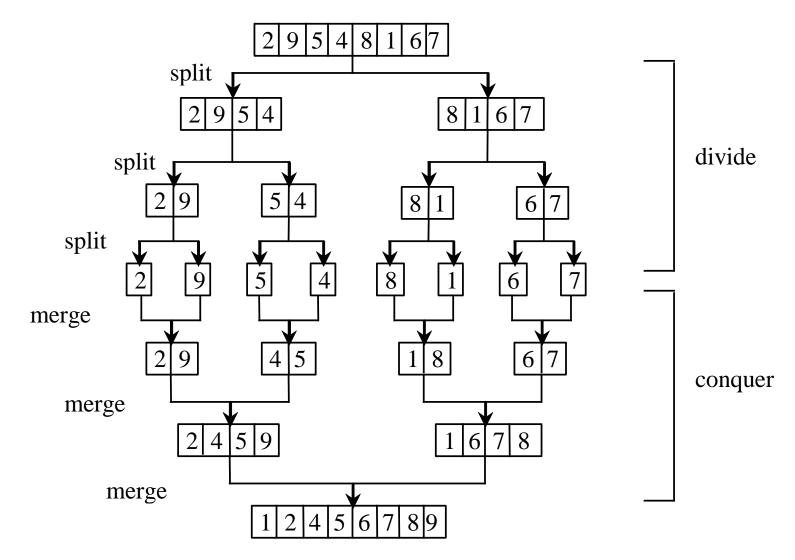
```
public class BubbleSort {
 public static void main(String[] args) {
    int size = 100000;
    int[] a = new int[size];
    randomInitiate(a);
    long startTime = System.currentTimeMillis();
   bubbleSort(a);
    long endTime = System.currentTimeMillis();
    System.out.println((endTime - startTime) + "ms");
 private static void randomInitiate(int[] a) {
    for (int i = 0; i < a.length; i++)
      a[i] = (int) (Math.random() * a.length);
 public static void bubbleSort(int[] list) {
    boolean needNextPass = true;
    for (int k = 1; k < list.length && needNextPass; k++) {</pre>
      // Array may be sorted and next pass not needed
      needNextPass = false;
      // Perform the kth pass
      for (int i = 0; i < list.length - k; i++) {
        if (list[i] > list[i + 1]) {
          int temp = list[i];
          list[i] = list[i + 1];
          list[i + 1] = temp;
          needNextPass = true; // Next pass still needed
```

Merge Sort

- Merge sort is a divide and conquer algorithm that was invented by John von Neumann in 1945
 - Divide the unsorted list into **n** sublists, each containing 1 element (a list of 1 element is considered sorted)
 - Repeatedly merge sorted sublists to produce new sorted sublists until there is only 1 sublist remaining
 - This will be the sorted list.

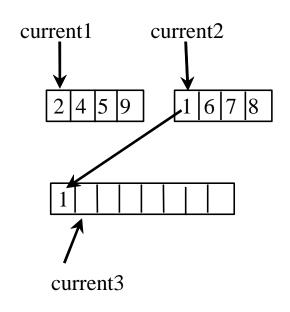


Merge Sort

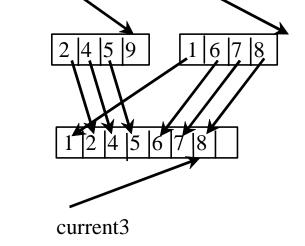


How to Merge Two Sorted Lists

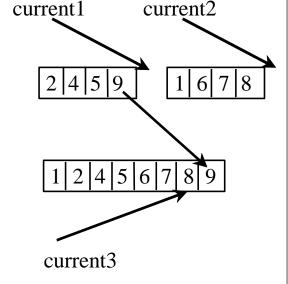
current1



(a) After moving 1 to temp



current2



(c) After moving 9 to temp

Merge Sort Recursive pseudocode

```
mergeSort(list):
    firstHalf = mergeSort(firstHalf);
    secondHalf = mergeSort(secondHalf);
    list = merge(firstHalf, secondHalf);
```

```
public static void mergeSort(int[] list) {
 if (list.length > 1) {
  // Merge sort the first half
  int[] firstHalf = new int[list.length / 2];
  System.arraycopy(list,0,firstHalf,0,list.length / 2);
 mergeSort(firstHalf);
  // Merge sort the second half
  int secondHalfLength = list.length - list.length / 2;
  int[] secondHalf = new int[secondHalfLength];
  System.arraycopy(list,list.length / 2,secondHalf,0,
      secondHalfLength);
 mergeSort(secondHalf);
  // Merge firstHalf with secondHalf into list
 merge(firstHalf, secondHalf, list);
```

```
/** Merge two sorted lists */
public static void merge(int[] list1, int[] list2, int[] temp) {
  int current1 = 0; // Current index in list1
  int current2 = 0; // Current index in list2
  int current3 = 0; // Current index in temp
  while (current1 < list1.length && current2 < list2.length) {
    if (list1[current1] < list2[current2])</pre>
      temp[current3++] = list1[current1++];
    else
      temp[current3++] = list2[current2++];
  while (current1 < list1.length)
    temp[current3++] = list1[current1++];
  while (current2 < list2.length)</pre>
    temp[current3++] = list2[current2++];
```

Example:

```
public static void main(String[] args) {
  int[] list = {14,12,2,3,2,-2,1,3,6,5};
  mergeSort(list);
  for (int i = 0; i < list.length; i++)
     System.out.print(list[i] + ", ");
}
-2, 1, 2, 2, 3, 3, 5, 6, 12, 14</pre>
```

```
public class MergeSort {
  public static void main(String[] args) {
    int size = 100000;
    int[] a = new int[size];
    randomInitiate(a);
    long startTime = System.currentTimeMillis();
    mergeSort(a);
    long endTime = System.currentTimeMillis();
    System.out.println((endTime - startTime) + "ms");
  private static void randomInitiate(int[] a) {
    for (int i = 0; i < a.length; i++)
      a[i] = (int) (Math.random() * a.length);
  public static void mergeSort(int[] list) {
    if (list.length > 1) {
      // Merge sort the first half
      int[] firstHalf = new int[list.length / 2];
      System.arraycopy(list, 0, firstHalf, 0, list.length / 2);
      mergeSort(firstHalf);
      // Merge sort the second half
      int secondHalfLength = list.length - list.length / 2;
      int[] secondHalf = new int[secondHalfLength];
      System.arraycopy(list, list.length / 2, secondHalf, 0, secondHalfLength);
      mergeSort(secondHalf);
      // Merge firstHalf with secondHalf into list
      merge(firstHalf, secondHalf, list);
                            (c) Paul Fodor (CS Stony Brook) & Pearson
```

```
public static void merge(int[] list1, int[] list2, int[] temp) {
    int current1 = 0; // Current index in list1
    int current2 = 0; // Current index in list2
    int current3 = 0; // Current index in temp
    while (current1 < list1.length && current2 < list2.length) {
      if (list1[current1] < list2[current2])</pre>
        temp[current3++] = list1[current1++];
      else
        temp[current3++] = list2[current2++];
    }
    while (current1 < list1.length)</pre>
      temp[current3++] = list1[current1++];
    while (current2 < list2.length)
      temp[current3++] = list2[current2++];
16ms
```

Merge Sort Time

- Let T(n) denote the time required for sorting an array of n elements using merge sort.
- Without loss of generality, assume *n* is a power of 2.
- The merge sort algorithm splits the array into two subarrays, sorts the subarrays using the same algorithm recursively, and then merges the subarrays

$$T(n) = T(\frac{n}{2}) + T(\frac{n}{2}) + mergetime$$

• The first T(n/2) is the time for sorting the first half of the array and the second T(n/2) is the time for sorting the second half

Merge Sort Time

• To merge two sorted subarrays, it takes at most *n-1* comparisons to compare the elements from the two subarrays and *n* moves to move elements to the temporary array

$$T(n) = 2T(\frac{n}{2}) + 2n - 1 = 2(2T(\frac{n}{4}) + 2\frac{n}{2} - 1) + 2n - 1$$

$$= 2^{2}T(\frac{n}{2^{2}}) + 2n - 2 + 2n - 1$$

$$= 2^{k}T(\frac{n}{2^{k}}) + 2n - 2^{k-1} + \dots + 2n - 2 + 2n - 1$$

$$= 2^{\log n}T(\frac{n}{2^{\log n}}) + 2n - 2^{\log n - 1} + \dots + 2n - 2 + 2n - 1$$

$$= n + 2n\log n - 2^{\log n} + 1$$

$$= 2n\log n + 1$$

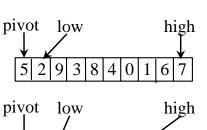
$$= O(n\log n)$$

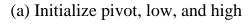
Quick Sort

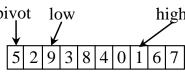
- Quick sort, developed by C. A. R. Hoare in 1962, works as follows:
 - The algorithm selects an element, called the *pivot*, in the array
 - Divide the array into two parts such that all the elements in the first part are less than or equal to the pivot and all the elements in the second part are greater than the pivot
 - Recursively apply the quick sort algorithm to the first part and then the second part

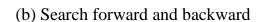


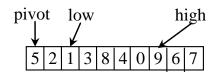
Partition with forward and backward search



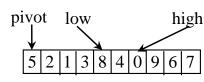




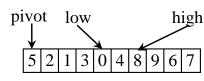


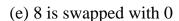


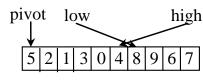


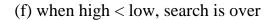


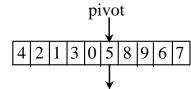








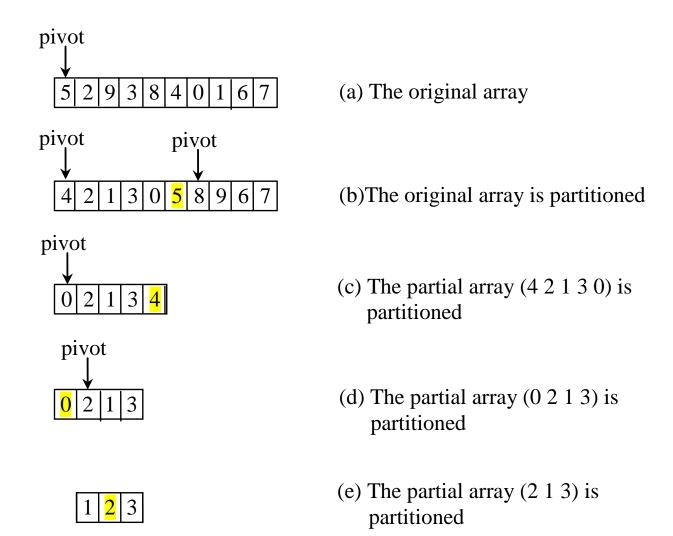




(g) pivot is in the right place

The index of the pivot is returned

Quick Sort



```
public static void quickSort(int[] list) {
  quickSort(list, 0, list.length - 1);
}
public static void quickSort(int[] list, int first, int last) {
  if (last > first) {
    int pivotIndex = partition(list, first, last);
    quickSort(list, first, pivotIndex - 1);
    quickSort(list, pivotIndex + 1, last);
public static int partition(int[] list, int first, int last) {
 int pivot = list[first]; // Choose the first element as pivot
 int low = first + 1; // Index for forward search
 int high = last; // Index for backward search
 while (high > low) {
   // Search forward from left
   while (low <= high && list[low] <= pivot)</pre>
     low++;
   // Search backward from right
   while (low <= high && list[high] > pivot)
     high--;
                      (c) Paul Fodor (CS Stony Brook) & Pearson
```

```
// Swap two elements in the list
  if (high > low) {
    int temp = list[high];
    list[high] = list[low];
    list[low] = temp;
}
// Account for duplicated elements:
while (high > first && list[high] >= pivot)
 high--;
// Swap pivot with list[high]
if (pivot > list[high]) {
  list[first] = list[high];
  list[high] = pivot;
  return high;
} else {
  return first;
```

```
public class QuickSort {
  public static void main(String[] args) {
    int size = 100000;
    int[] a = new int[size];
    randomInitiate(a);
    long startTime = System.currentTimeMillis();
    quickSort(a);
    long endTime = System.currentTimeMillis();
    System.out.println((endTime - startTime) + "ms");
  private static void randomInitiate(int[] a) {
    for (int i = 0; i < a.length; i++)
      a[i] = (int) (Math.random() * a.length);
  public static void quickSort(int[] list) {
    quickSort(list, 0, list.length - 1);
  public static void quickSort(int[] list, int first, int last) {
    if (last > first) {
      int pivotIndex = partition(list, first, last);
      quickSort(list, first, pivotIndex - 1);
      quickSort(list, pivotIndex + 1, last);
  public static int partition(int[] list, int first, int last) {
    int pivot = list[first]; // Choose the first element as pivot
    int low = first + 1; // Index for forward search
    int high = last; // Index for backward search
    while (high > low) {
      // Search forward from left
      while (low <= high && list[low] <= pivot)</pre>
        low++;
                                 (c) Paul Fodor (CS Stony Brook) & Pearson
```

```
// Search backward from right
  while (low <= high && list[high] > pivot)
    high--;
  // Swap two elements in the list
  if (high > low) {
    int temp = list[high];
    list[high] = list[low];
    list[low] = temp;
}
// Account for duplicated elements:
while (high > first && list[high] >= pivot)
  high--;
// Swap pivot with list[high]
if (pivot > list[high]) {
  list[first] = list[high];
  list[high] = pivot;
  return high;
} else {
  return first;
```

16ms

Quick Sort Time

- To partition an array of *n* elements, it takes
 n-1 comparisons and *n* moves in the worst case
- So, the time required for partition is O(n)

Worst-Case Time

- In the worst case, each time the pivot divides the array into one big subarray with the other empty
- The size of the big subarray is one less than the one before divided
- The algorithm requires:

$$(n-1)+(n-2)+...+2+1=O(n^2)$$

Best-Case Time

- In the best case, each time the pivot divides the array into two parts of about the same size
- Let T(n) denote the time required for sorting an array of elements using quick sort. So,

$$T(n) = T(\frac{n}{2}) + T(\frac{n}{2}) + n = O(n \log n)$$

Average-Case Time

- On the average, each time the pivot will not divide the array into two parts of the same size nor one empty part
- Statistically, the sizes of the two parts are very close => the average time is also $O(n \log n)$
- Both merge sort and quick sort employ the divide-and-conquer approach
 - For merge sort, the bulk of the work is to merge two sublists
 - Merge sort is more efficient than quick sort in the worst case,
 but the two are equally efficient in the average case
 - Merge sort requires a temporary array for sorting two subarrays
 - Quick sort does not need additional array space. Thus, quick sort is more space efficient than merge sort.

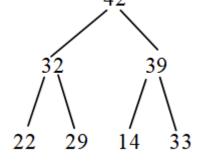
Binary tree

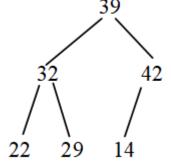
- A *binary tree* is a hierarchical structure: it either is empty or it consists of an element, called the *root*, and two distinct binary trees, called the *left subtree* and *right subtree*
 - The *length* of a path is the number of the edges in the path
 - The *depth* of a node is the length of the path from the root to that node

Complete Binary Tree

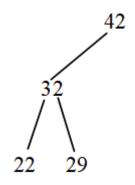
• A binary tree is *complete* if every level of the tree is full except that the last level may not be full and all the leaves on the last level are placed left-most. Examples of complete binary

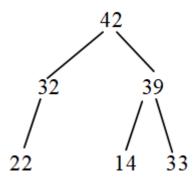
trees:





• Not complete:

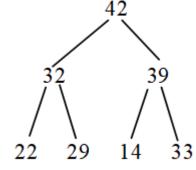




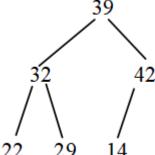
Binary Heap

- A *binary heap* is a binary tree with the following properties:
 - It is a complete binary tree, and
 - Each node is greater than or equal to any of its children

• Example:



• Example: not a heap, because the root (39) is less than its right child (42).

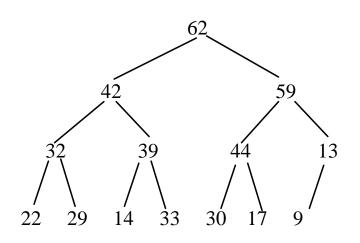


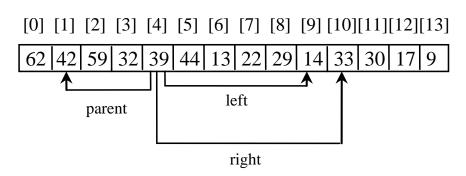
Heap Sort

- *Heap sort* uses a binary heap: it first adds all the elements to a heap and then removes the largest elements successively to obtain a sorted list
 - Heap is a useful data structure for designing efficient sorting algorithms and priority queues.

Storing a Heap

- A heap can be stored in an **ArrayList** or an array if the heap size is known in advance
 - For a node at position i, its left child is at position 2i+1 and its right child is at position 2i+2, and its parent is at index (i-1)/2
 - For example: the root is at position **0**, and its two children are at positions **1** and **2**
 - The node for element 39 is at position 4, so its left child (element 14) is at 9 (2*4+1), its right child (element 33) is at 10 (2*4+2), and its parent (element 42) is at 1 ((4-1)/2).





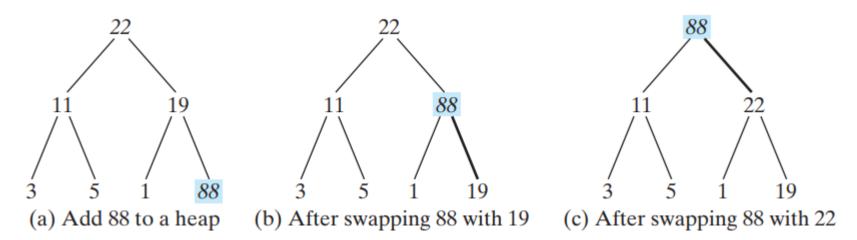
Adding Elements to the Heap

• To add a new node to the heap, first add it to the end of the heap and then rebuild the tree with this algorithm:

```
Let the last node be the current node;
while (the current node is greater than its parent) {
   Swap the current node with its parent;
   Now the current node is one level up;
}
```

Adding Elements to the Heap

- Adding 88 into a heap:
 - Place the new node 88 at the end of the tree
 - Swap 88 with 19
 - Swap 88 with 22



Adding Elements to the Heap

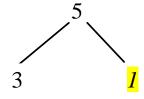
Suppose a heap is initially empty. after adding numbers 3,
5, 1, 19, 11, and 22 in this order

<u>3</u>

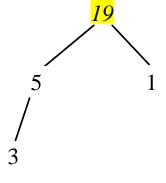
(a) After adding 3



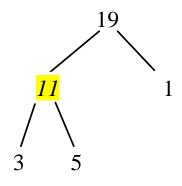
(b) After adding 5



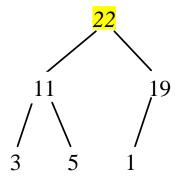
(c) After adding 1



(d) After adding 19



(e) After adding 11

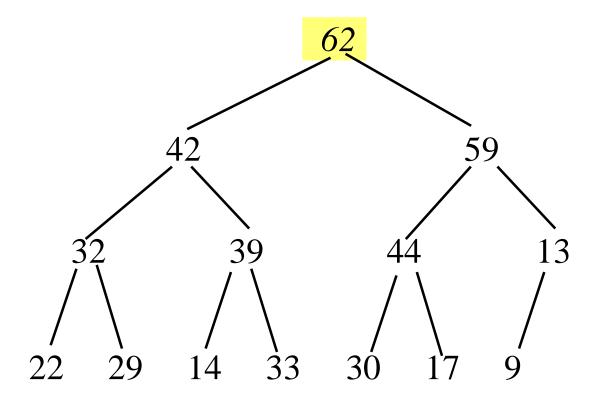


(f) After adding 22

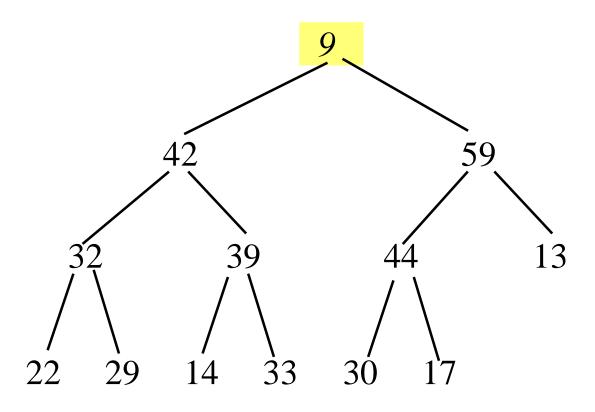
- Often you need to remove the maximum element, which is the root in a heap
 - After the root is removed, the tree must be rebuilt to maintain the heap property using this algorithm:

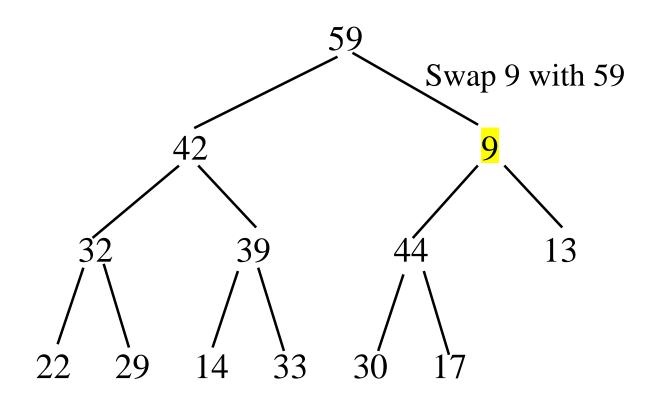
```
Move the last node to replace the root;
Let the root be the current node;
while (the current node has children and the
current node is smaller than one of its children) {
   Swap the current node with the larger of its
     children;
   Now the current node is one level down;
}
```

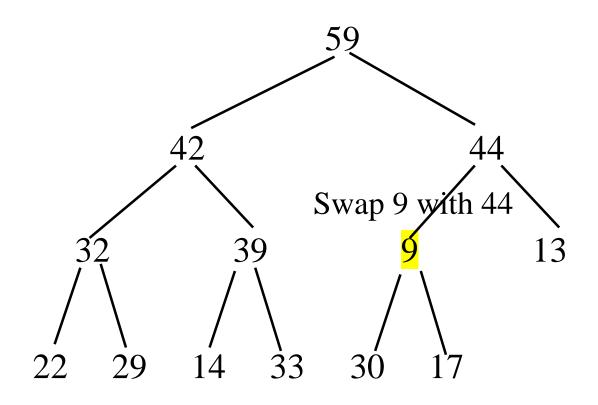
Removing root 62 from the heap

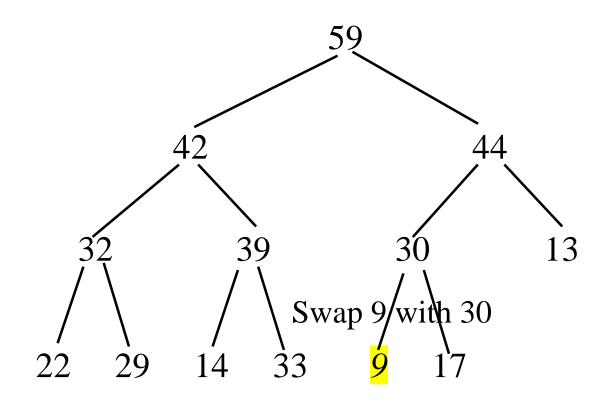


Move 9 to root









The Heap Class

Heap<E extends Comparable<E>>

```
-list: java.util.ArrayList<E>
```

```
+Heap()
+Heap(objects: E[])
+add(newObject: E): void
+remove(): E
+getSize(): int
```

Creates a default empty heap.
Creates a heap with the specified objects.
Adds a new object to the heap.
Removes the root from the heap and returns it.
Returns the size of the heap.

```
public class Heap<E extends Comparable> {
 private java.util.ArrayList<E> list = new java.util.ArrayList<E>();
  /** Create a default heap */
 public Heap() {
  /** Create a heap from an array of objects */
 public Heap(E[] objects) {
    for (int i = 0; i < objects.length; i++)
      add(objects[i]);
  /** Add a new object into the heap */
 public void add(E newObject) {
    list.add(newObject); // Append to the heap
    int currentIndex = list.size() - 1; // The index of the last node
   while (currentIndex > 0) {
      int parentIndex = (currentIndex - 1) / 2;
      // Swap if the current object is greater than its parent
      if (list.get(currentIndex).compareTo(
          list.get(parentIndex)) > 0) {
        E temp = list.get(currentIndex);
        list.set(currentIndex, list.get(parentIndex));
        list.set(parentIndex, temp);
      } else break; // the tree is a heap now
      currentIndex = parentIndex;
```

```
/** Remove the root from the heap */
public E remove() {
  if (list.size() == 0) return null;
  E removedObject = list.get(0);
  list.set(0, list.get(list.size() - 1));
  list.remove(list.size() - 1);
  int currentIndex = 0;
  while (currentIndex < list.size()) {</pre>
    int leftChildIndex = 2 * currentIndex + 1;
    int rightChildIndex = 2 * currentIndex + 2;
    // Find the maximum between two children
    if (leftChildIndex >= list.size()) break; // The tree is a heap
    int maxIndex = leftChildIndex;
    if (rightChildIndex < list.size()) {</pre>
      if (list.get(maxIndex).compareTo(
          list.get(rightChildIndex)) < 0) {</pre>
        maxIndex = rightChildIndex;
```

```
// Swap if the current node is less than the maximum
    if (list.get(currentIndex).compareTo(
        list.get(maxIndex)) < 0) {</pre>
      E temp = list.get(maxIndex);
      list.set(maxIndex, list.get(currentIndex));
      list.set(currentIndex, temp);
      currentIndex = maxIndex;
    else
      break; // The tree is a heap
  return removedObject;
/** Get the number of nodes in the tree */
public int getSize() {
  return list.size();
```

Heap Sort

```
public class HeapSort {
  public static <E extends Comparable> void heapSort(E[] list) {
    // Create a Heap of integers
    Heap \le heap = new Heap \le ();
    // Add elements to the heap
    for (int i = 0; i < list.length; i++)</pre>
      heap.add(list[i]);
    // Remove elements from the heap
    for (int i = list.length - 1; i >= 0; i--)
      list[i] = heap.remove();
  }
  /** A test method */
  public static void main(String[] args) {
    Integer[] list = \{2, 3, 2, 5, 6, 1, -2, 3, 14, 12\};
    heapSort(list);
    for (int i = 0; i < list.length; i++)</pre>
      System.out.print(list[i] + " ");
```

```
public class Sorting {
  public static void main(String[] args) {
    int size = 100000;
    int[] a = new int[size];
    randomInitiate(a);
    Integer[] b = new Integer[a.length];
    for(int i=0; i<b.length; i++)</pre>
      b[i] = a[i];
    long startTime = System.currentTimeMillis();
    HeapSort.heapSort(b);
    long endTime = System.currentTimeMillis();
    System.out.println((endTime - startTime) + "ms");
 private static void randomInitiate(int[] a) {
    for (int i = 0; i < a.length; i++)
      a[i] = (int) (Math.random() * a.length);
```

76ms

Heap Sort Time

• Let h denote the height for a heap of n elements. Since a heap is a complete binary tree, the first level has 1 node, the second level has 2 nodes, the kth level has $2^{(k-1)}$ nodes, the (h-1)th level has $2^{(h-2)}$ nodes, and the hth level has at least one node and at most $2^{(h-1)}$ nodes. Therefore, the number of nodes n is:

$$1+2+...+2^{h-2} < n \le 1+2+...+2^{h-2}+2^{h-1}$$

$$2^{h-1}-1 < n \le 2^h-1$$

$$2^{h-1} < n+1 \le 2^h$$

$$\log 2^{h-1} < \log(n+1) \le \log 2^h$$

$$h-1 < \log(n+1) \le h$$

- Thus, $log(n + 1) \le h < log(n + 1) + 1$
- Hence, the height of the heap is $O(\log n)$

Heap Add and Remove Time

- Since the add method traces a path from a leaf to a root, it takes at most $\mathbf{h} = \mathbf{log} \mathbf{n}$ steps to add a new element to the heap.
 - Thus, the total time for constructing an initial heap is
 O(n log n) for an array of n elements.
- Since the remove method traces a path from a root to a leaf, it takes at most **h** = **log n** steps to rebuild a heap after removing the root from the heap.

Heap Sort Time

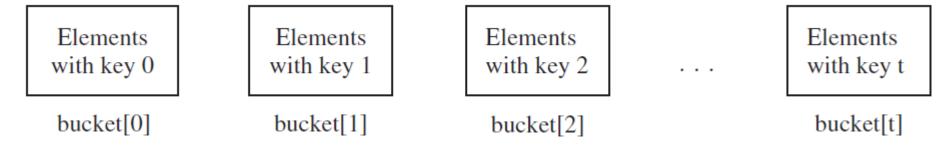
- Heap Sort Time: since the remove method is invoked n times, the total time for producing a sorted array from a heap is O(n log n)
- Merge sort requires a temporary array for merging two subarrays; a heap sort does not need additional array space.
 - Therefore, a heap sort is more space efficient than a merge sort.

Bucket Sort and Radix Sort

- All sort algorithms discussed so far are general sorting algorithms that work for **any types of keys** (e.g., integers, strings, and any comparable objects)
 - These algorithms sort the elements by comparing their keys
 - The lower bound for general sorting algorithms is $O(n \log n)$
 - So, no sorting algorithms based on comparisons can perform better than $O(n \log n)$
- However, if the keys are small integers, you can use bucket sort without having to compare the keys

Bucket Sort

- The **bucket sort** algorithm works as follows:
 - Assume the keys are in the range from 0 to t
 - We need **t+1** buckets labeled **0**, **1**, ..., and **t**
 - If an element's key is i, the element is put into the bucket i
 - Each bucket holds the elements with the same key value



• You can use an **ArrayList** to implement a bucket element

Bucket Sort

```
public static <E> void bucketSort(E[] list) {
  java.util.ArrayList<E>[] bucket = new java.util.ArrayList[t+1]|
  // Distribute the elements from list to buckets
  for (int i = 0; i < list.length; i++) {</pre>
    // Assume element has the getKey() method
    int key = getKey(list[i]); // list[i].getKey()
    if (bucket[key] == null)
      bucket[key] = new java.util.ArrayList<E>();
    bucket[key].add(list[i]);
  // Now move the elements from the buckets back to list
  int k = 0; // k is an index for list
  for (int i = 0; i < bucket.length; i++) {</pre>
    if (bucket[i] != null) {
      for (int j = 0; j < bucket[i].size(); <math>j++)
        list[k++] = (E) (bucket[i].get(j));
```

Bucket Sort

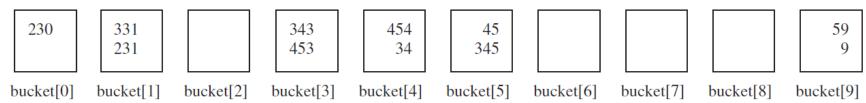
- Takes O(n + t) time to sort the list and uses O(n + t) space, where n is the list size
- If *t* is too large, using the bucket sort is not desirable
 - Instead, you can use a radix sort
- The radix sort is based on the bucket sort, but a radix sort uses only **ten** buckets
- Bucket sort is *stable*, meaning that if two elements in the original list have the same key value, their order is not changed in the sorted list.
 - That is, if element **e1** and element **e2** have the same key and **e1** precedes **e2** in the original list, **e1** still precedes **e2** in the sorted list

Radix Sort

- Assume that the keys are positive integers
- The idea for the radix sort is to divide the keys into subgroups based on their radix positions
- It applies a bucket sort repeatedly for the key values on radix positions, starting from the least-significant position

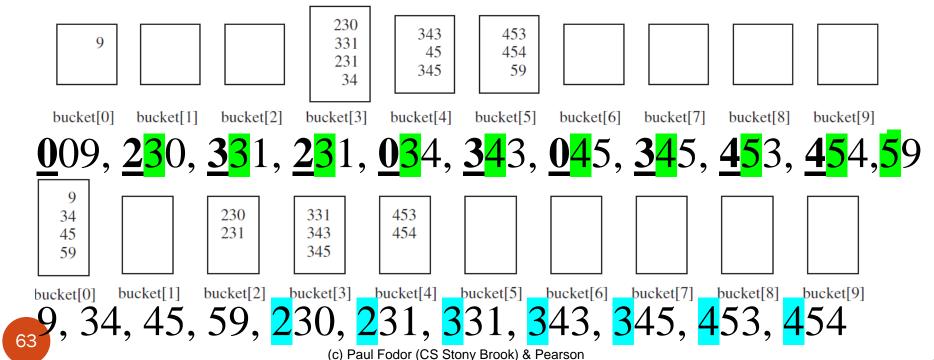
Radix Sort

• Sort 33<u>1</u>, 45<u>4</u>, 23<u>0</u>, 3<u>4</u>, 34<u>3</u>, 4<u>5</u>, 5<u>9</u>, 45<u>3</u>, 34<u>5</u>, 23<u>1, 9</u>



• Remove elements from the buckets:

230, 331, 231, 343, 453, 454, 34, 45, 345, 59, 09



Radix Sort

• Radix sort takes O(d*n) time to sort n elements with integer keys, where d is the maximum number of the radix positions among all keys

```
public class RadixSort {
  public static void main(String[] args) {
    int size = 100000;
    int[] a = new int[size];
    randomInitiate(a);
    long startTime = System.currentTimeMillis();
    // radix sort
    for(int i=0; i<6; i++) {
      radix = i;
      bucketSort(a);
    }
    long endTime = System.currentTimeMillis();
    System.out.println((endTime - startTime) + "ms");
  private static void randomInitiate(int[] a) {
    for (int i = 0; i < a.length; i++)
      a[i] = (int) (Math.random() * a.length);
  static int radix = 1;
  public static int getKey(int n) {
    for(int i=0; i<radix; i++)</pre>
      n = n / 10;
    return n % 10;
  static int t = 10;
```

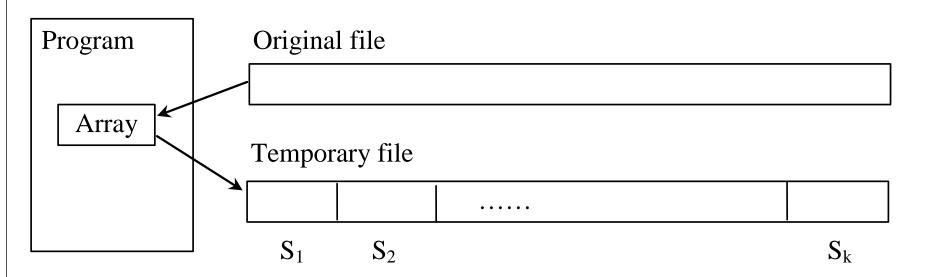
```
public static void bucketSort(int[] list) {
    java.util.ArrayList<Integer>[] bucket =new java.util.ArrayList[t+1];
    // Distribute the elements from list to buckets
    for (int i = 0; i < list.length; i++) {
      // Assume element has the getKey() method
      int key = getKey(list[i]);
      if (bucket[key] == null)
        bucket[key] = new java.util.ArrayList<Integer>();
      bucket[key].add(list[i]);
    // Now move the elements from the buckets back to list
    int k = 0; // k is an index for list
    for (int i = 0; i < bucket.length; i++) {
      if (bucket[i] != null) {
        for (int j = 0; j < bucket[i].size(); <math>j++)
          list[k++] = (int)(bucket[i].get(j));
      }
433ms
```

External Sort

- All the sort algorithms discussed in the preceding sections assume that all data to be sorted is available at one time in internal memory such as an array
- To sort data stored in an external file, you may first bring data to the memory, then sort it internally.
- However, if the file is too large, all data in the file cannot be brought to memory at one time

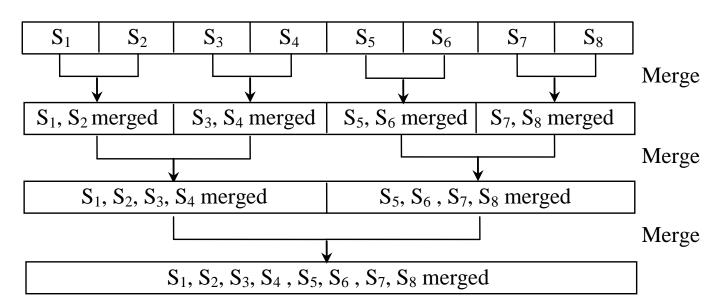
Phase I

• Repeatedly bring data from the file to an array, sort the array using an internal sorting algorithm, and output the data from the array to a temporary file



Phase II

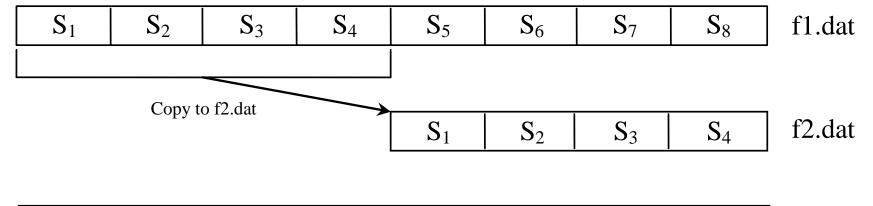
- **Merge** pairs of sorted segments (e.g., S1 with S2, S3 with S4, ..., and so on) into a larger sorted segment and save the new segment into a new temporary file
- Continue the same process until one sorted segment results



Implementing Phase II

- Each merge step merges two sorted segments to form a new segment
- The new segment doubles the number elements so the number of segments is reduced by half after each merge step
- A segment is too large to be brought to an array in memory
 - To implement a merge step, copy half number of segments from file f1.dat to a temporary file f2.dat.
 - Then merge the first remaining segment in f1.dat with the first segment in f2.dat into a temporary file named f3.dat.

Implementing Phase II



 S_1, S_5 merged S_2, S_6 merged S_3, S_7 merged S_4, S_8 merged S_3 .dat

External Sort Complexity

- In the external sort, the dominating cost is that of I/O.
- Assume **n** is the number of elements to be sorted in the file
 - In Phase I, \mathbf{n} number of elements are read from the original file and output to a temporary file, therefore, the I/O for Phase I is $O(\mathbf{n})$.
 - In Phase II, before the first merge step, the number of sorted segments is **n/c**, where **c** is **MAX_ARRAY_SIZE**
 - Each merge step reduces the number of segments by half: after the first merge step, the number of segments is

$$n/c * 1/2 = n/(2 * c)$$

External Sort Complexity

- After the second merge step, the number of segments is $n/2c * 1/2 = n/(2^2c)$
- After the third merge step the number of segments is **n/2**³**c**
- After log(n/c) merge steps, the number of segments is reduced to 1 -> Therefore, the total number of merge steps is log(n/c)
- In each merge step, half the number of segments are read from file f1 and then written into a temporary file f2 the remaining segments in f1 are merged with the segments in f2
 - The number of I/Os in each merge step is O (n)
- Since the total number of merge steps is log(n/c), the total number of I/Os is: O(n) * log(n/c) = O(n log n)

```
import java.io.*;
public class CreateLargeFile {
  public static void main(String[] args) throws Exception {
    DataOutputStream output = new DataOutputStream(
      new BufferedOutputStream(new FileOutputStream("largedata.dat")));
    for (int i = 0; i < 800004; i++)
      output.writeInt((int)(Math.random() * 1000000));
    output.close();
    // Display first 100 numbers
    DataInputStream input =
      new DataInputStream(new FileInputStream("largedata.dat"));
    for (int i = 0; i < 100; i++)
      System.out.print(input.readInt() + " ");
    input.close();
```

```
import java.io.*;
public class SortLargeFile {
 public static final int MAX ARRAY SIZE = 43;
 public static final int BUFFER SIZE = 100000;
 public static void main(String[] args) throws Exception {
    // Sort largedata.dat to sortedfile.dat
    sort("largedata.dat", "sortedfile.dat");
    // Display the first 100 numbers in the sorted file
    displayFile("sortedfile.dat");
  /** Sort data in source file and into target file */
  public static void sort(String sourcefile, String targetfile)
      throws Exception {
    // Implement Phase 1: Create initial segments
    int numberOfSegments =
      initializeSegments(MAX ARRAY SIZE, sourcefile, "f1.dat");
    // Implement Phase 2: Merge segments recursively
    merge (numberOfSegments, MAX ARRAY SIZE,
      "f1.dat", "f2.dat", "f3.dat", targetfile);
```

```
/** Sort original file into sorted segments */
 private static int initializeSegments
      (int segmentSize, String originalFile, String f1)
     throws Exception {
   int[] list = new int[segmentSize];
   DataInputStream input = new DataInputStream(
     new BufferedInputStream(new FileInputStream(originalFile)));
   DataOutputStream output = new DataOutputStream(
     new BufferedOutputStream(new FileOutputStream(f1)));
   int numberOfSegments = 0;
   while (input.available() > 0) {
     numberOfSegments++;
     int i = 0;
     for ( ; input.available() > 0 && i < segmentSize; i++) {</pre>
       list[i] = input.readInt();
     // Sort an array list[0..i-1]
     java.util.Arrays.sort(list, 0, i);
     // Write the array to fl.dat
     for (int j = 0; j < i; j++) {
       output.writeInt(list[j]);
   input.close();
   output.close();
   return numberOfSegments;
76
```

```
private static void merge(int numberOfSegments, int segmentSize,
    String f1, String f2, String f3, String targetfile)
    throws Exception {
  if (numberOfSegments > 1) {
    mergeOneStep(numberOfSegments, segmentSize, f1, f2, f3);
    merge((numberOfSegments + 1) / 2, segmentSize * 2,
      f3, f1, f2, targetfile);
  else { // Rename fl as the final sorted file
    File sortedFile = new File(targetfile);
    if (sortedFile.exists()) sortedFile.delete();
    new File(f1).renameTo(sortedFile);
private static void mergeOneStep(int numberOfSegments,
    int segmentSize, String f1, String f2, String f3)
    throws Exception {
  DataInputStream f1Input = new DataInputStream(
    new BufferedInputStream(new FileInputStream(f1), BUFFER SIZE));
  DataOutputStream f2Output = new DataOutputStream(
    new BufferedOutputStream(new FileOutputStream(f2), BUFFER SIZE));
  // Copy half number of segments from f1.dat to f2.dat
  copyHalfToF2 (numberOfSegments, segmentSize, f1Input, f2Output);
  f2Output.close();
                       (c) Paul Fodor (CS Stony Brook) & Pearson
```

```
// Merge remaining segments in f1 with segments in f2 into f3
 DataInputStream f2Input = new DataInputStream(
    new BufferedInputStream(new FileInputStream(f2), BUFFER SIZE));
 DataOutputStream f3Output = new DataOutputStream(
    new BufferedOutputStream(new FileOutputStream(f3), BUFFER SIZE));
 mergeSegments (numberOfSegments / 2,
    segmentSize, f1Input, f2Input, f3Output);
  f1Input.close();
  f2Input.close();
  f3Output.close();
/** Copy first half number of segments from f1.dat to f2.dat */
private static void copyHalfToF2(int numberOfSegments,
    int segmentSize, DataInputStream f1, DataOutputStream f2)
    throws Exception {
  for (int i = 0; i < (numberOfSegments / 2) * segmentSize; i++) {
    f2.writeInt(f1.readInt());
```

```
/** Merge all segments */
private static void mergeSegments(int numberOfSegments,
    int segmentSize, DataInputStream f1, DataInputStream f2,
    DataOutputStream f3) throws Exception {
  for (int i = 0; i < numberOfSegments; i++) {</pre>
    mergeTwoSegments(segmentSize, f1, f2, f3);
  // If f1 has one extra segment, copy it to f3
  while (f1.available() > 0) {
    f3.writeInt(f1.readInt());
/** Merges two segments */
private static void mergeTwoSegments(int segmentSize,
  DataInputStream f1, DataInputStream f2,
  DataOutputStream f3) throws Exception {
  int intFromF1 = f1.readInt();
  int intFromF2 = f2.readInt();
  int f1Count = 1;
  int f2Count = 1;
```

```
while (true) {
  if (intFromF1 < intFromF2) {</pre>
    f3.writeInt(intFromF1);
    if (f1.available() == 0 || f1Count++ >= segmentSize) {
      f3.writeInt(intFromF2);
      break;
    } else {
      intFromF1 = f1.readInt();
  } else {
    f3.writeInt(intFromF2);
    if (f2.available() == 0 || f2Count++ >= segmentSize) {
      f3.writeInt(intFromF1);
      break;
    } else {
      intFromF2 = f2.readInt();
while (f1.available() > 0 && f1Count++ < segmentSize) {
  f3.writeInt(f1.readInt());
while (f2.available() > 0 && f2Count++ < segmentSize) {
  f3.writeInt(f2.readInt());
```

```
/** Display the first 100 numbers in the specified file */
public static void displayFile(String filename) {
   try {
     DataInputStream input =
        new DataInputStream(new FileInputStream(filename));
     for (int i = 0; i < 100; i++)
        System.out.print(input.readInt() + " ");
     input.close();
   }
   catch (IOException ex) {
     ex.printStackTrace();
   }
}</pre>
```