

Merge-Sort

EECS 233

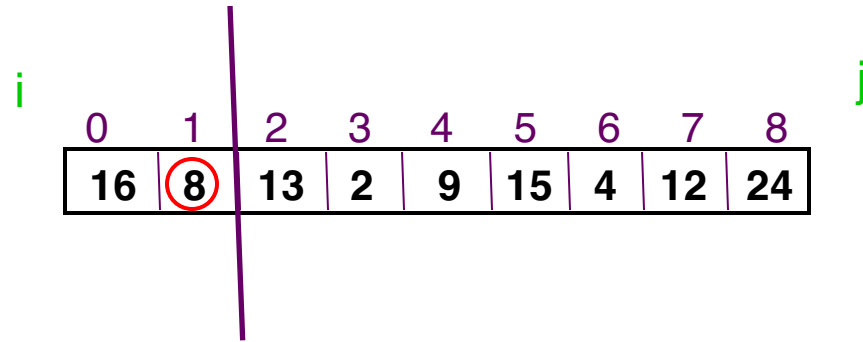
Previous Lecture: Quick-Sort

- Quick-Sort: a recursive, divide-and-conquer algorithm:
 - *divide*: partition the array into two subarrays so that :
 - *each element in the left array \leq each element in the right array*
 - *conquer*: apply quick-sort recursively to the subarrays, stopping when a subarray has a single element
 - *combine*: nothing needs to be done, because of the criterion used in forming the subarrays

- Implementation of Quick-Sort
 - Choosing a good pivot value
 - Partitioning procedure
 - Recursive method

- Analysis of Quick-Sort running time
 - Best-case $O(n \log n)$ and worst-case $O(n^2)$

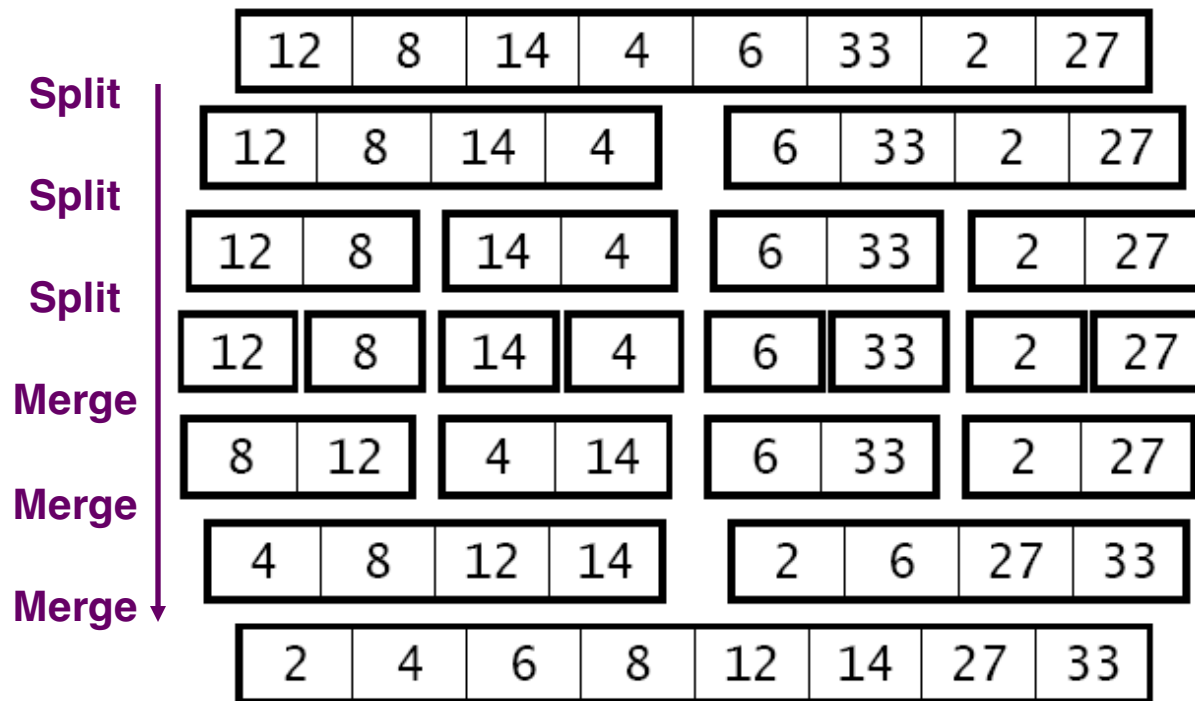
An exercise



	0	1	2	3	4	5	6	7	8	
i	16	8	13	2	9	15	4	12	24	j

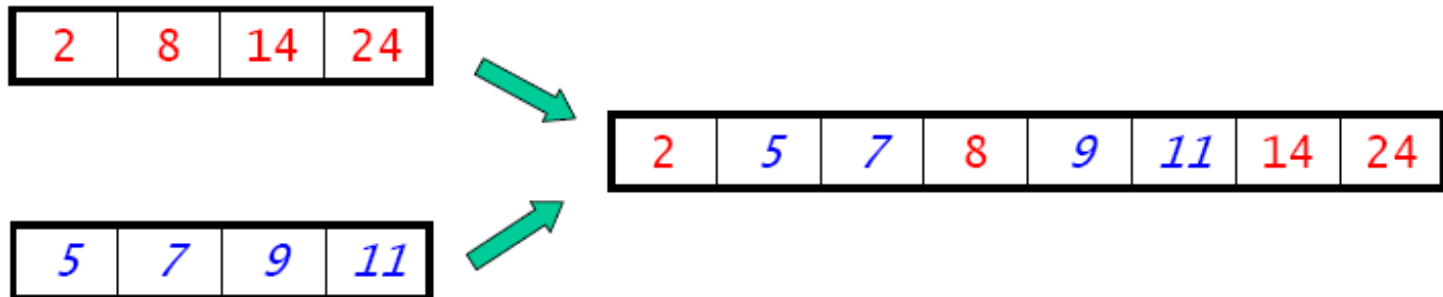
Merge-Sort

- Like quick-sort, merge-sort is a divide-and-conquer algorithm.
 - *divide*: split the array in half, forming two subarrays
 - *conquer*: apply merge-sort recursively to the subarrays, stopping when a subarray has a single element
 - *combine*: merge the sorted subarrays



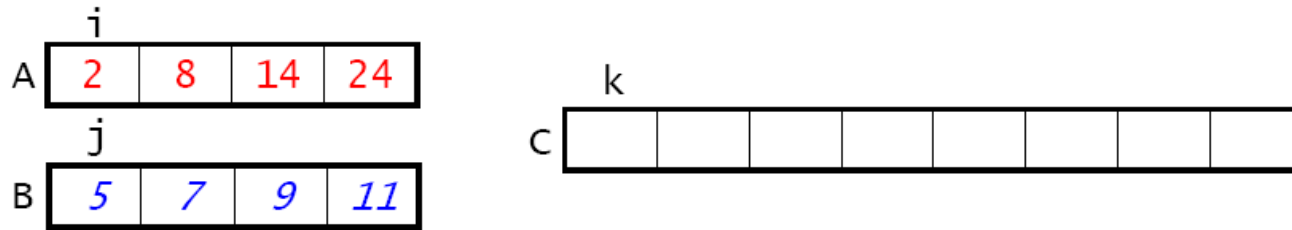
Merge-Sort

- All of the sorting algorithms we've seen thus far have sorted the array in place. They used only a small amount of additional memory, i.e., $O(\log n)$ additional space (for recursion)
- Merge-sort is a sorting algorithm that requires an additional temporary array of the same size as the original one.
 - it needs $O(n)$ additional space, where n is the array size
 - space for *merging* two sorted arrays into a single sorted array.

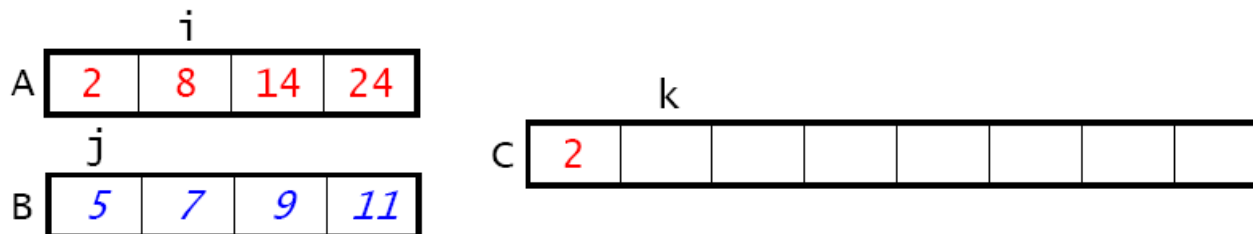


Merging Sorted Subarrays

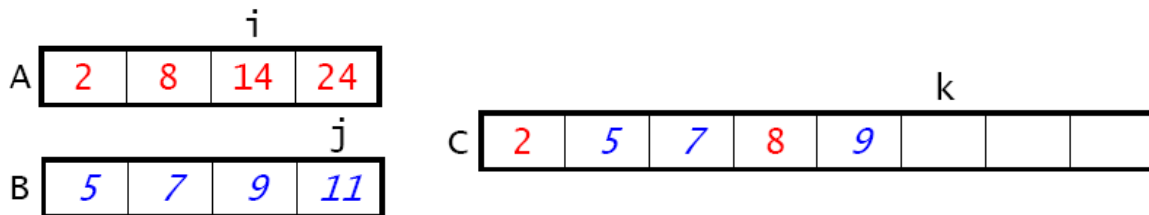
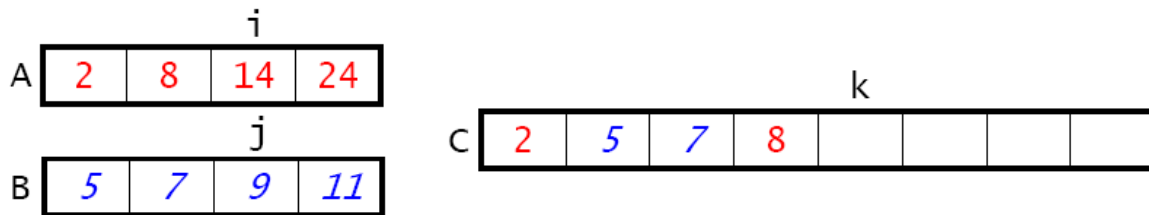
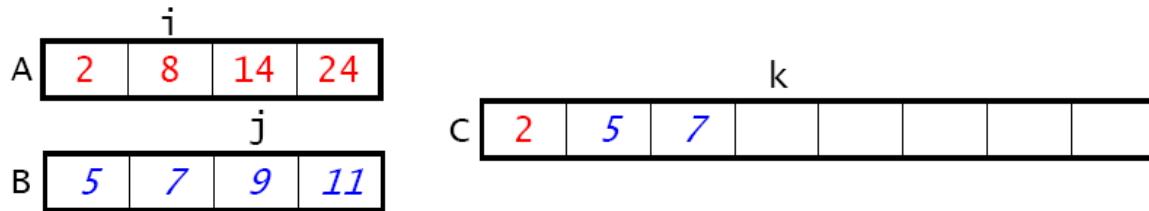
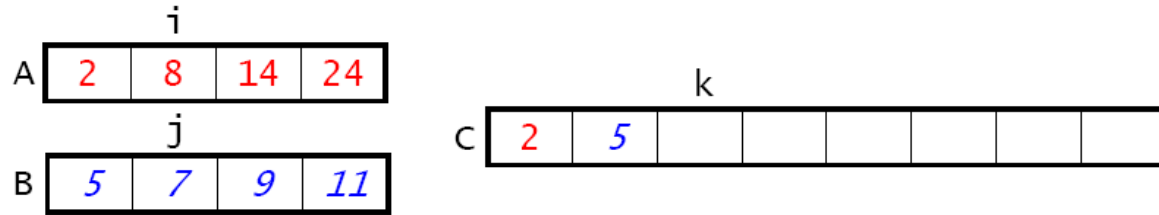
- To merge sorted arrays A and B into an array C, we maintain three indices, which start out on the first elements of the arrays:



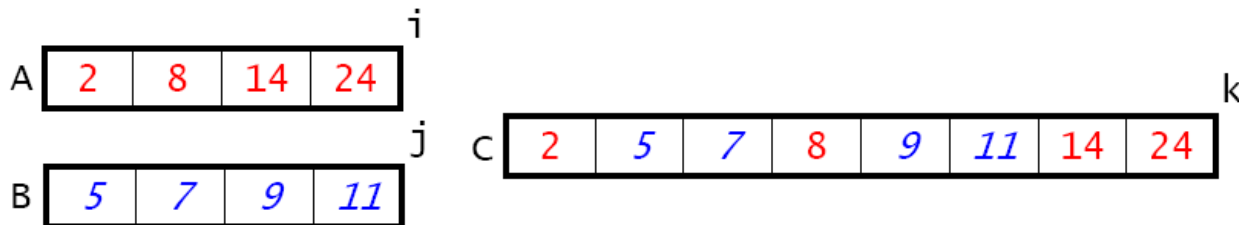
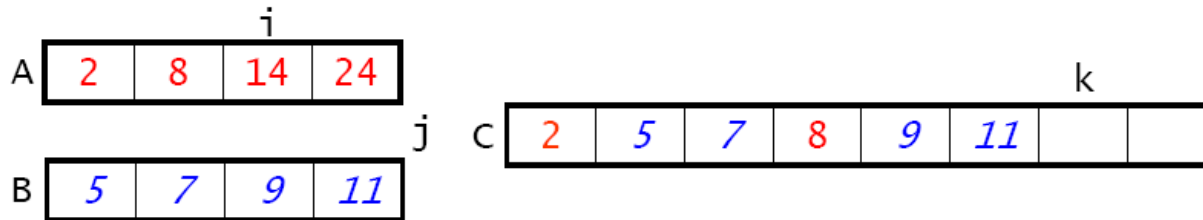
- We repeatedly do the following:
 - compare $A[i]$ and $B[j]$
 - copy the smaller of the two to $C[k]$
 - increment the index of the array whose element was copied
 - increment k



Merging Sorted Subarrays - Steps



Merging Sorted Subarrays - Steps



- Comparisons stop when either index reaches the end of its subarray
- The remaining elements in the other subarray are copied to the combined array C

Recursive Procedure - Skeleton

- Assume we have the merge() method, we will write a recursive method to implement the divide-and-conquer approach.

```
static void mergeSort(int[] arr) {  
    myMergeSort(arr);  
}
```

```
static void myMergeSort(int[] arr) {  
    if (arr.length == 1) return; // Base case  
    // Allocate leftArr and rightArr  
    split(arr, leftArr, rightArr);  
    myMergeSort(leftArr);  
    myMergeSort(rightArr);  
    Merge(leftArr, rightArr, arr);  
}
```

Recursive Calls - Steps

```
static void mergeSort(int[] arr) {  
    myMergeSort(arr);  
}  
  
static void myMergeSort(int[] arr) {  
    if (arr.length == 1) return;  
    // Allocate leftArr and rightArr  
    split(arr, leftArr, rightArr);  
    myMergeSort(leftArr);  
    myMergeSort(rightArr);  
    Merge(leftArr, rightArr, arr);  
}
```

12	8	14	4	6	33	2	27
----	---	----	---	---	----	---	----

Call to split:

12	8	14	4	6	33	2	27
----	---	----	---	---	----	---	----

12	8	14	4
----	---	----	---

Call to myMergeSort(leftArr)

12	8	14	4	6	33	2	27
----	---	----	---	---	----	---	----

12	8	14	4
----	---	----	---

Call to split:

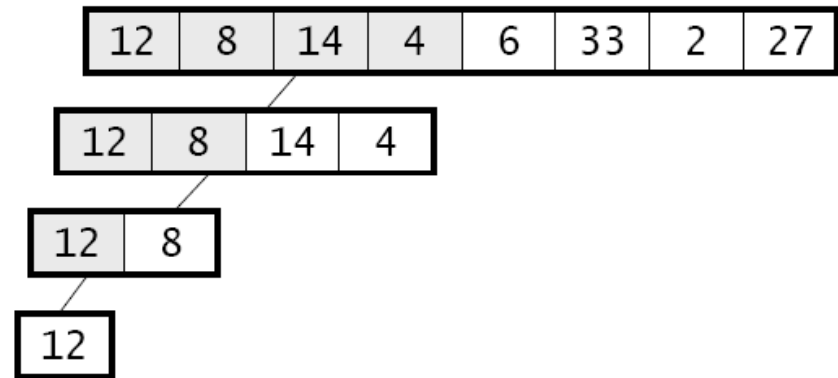
12	8
----	---

Call to myMergeSort(leftArr)

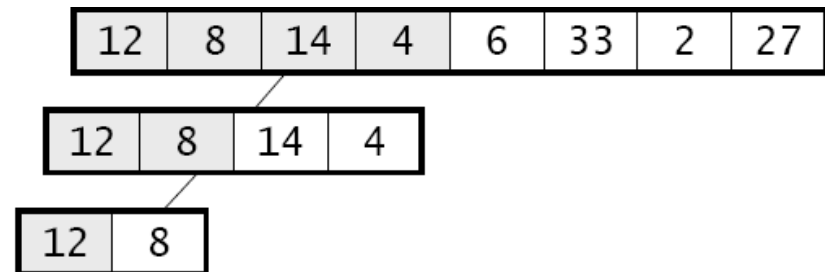
Recursive Calls - Steps

```
static void mergeSort(int[] arr) {  
    myMergeSort(arr);  
}  
static void myMergeSort(int[] arr) {  
    if (arr.length == 1) return;  
    // Allocate leftArr and rightArr  
    split(arr, leftArr, rightArr);  
    myMergeSort(leftArr);  
    myMergeSort(rightArr);  
    Merge(leftArr, rightArr, arr);  
}
```

Further split it into two size-1 subarrays,
and issue recursive calls again



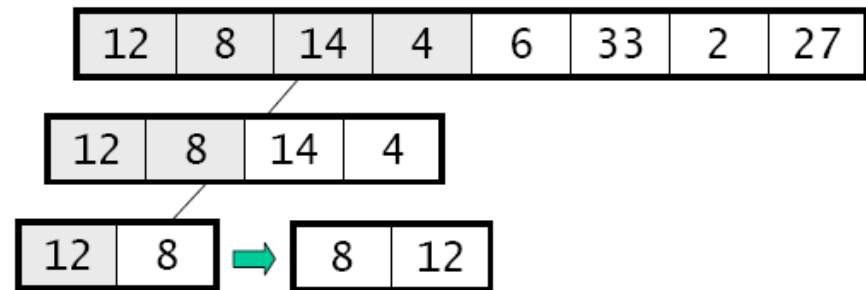
We are down to the base cases, so simply return
(we have two sorted subarrays {12} and {8})



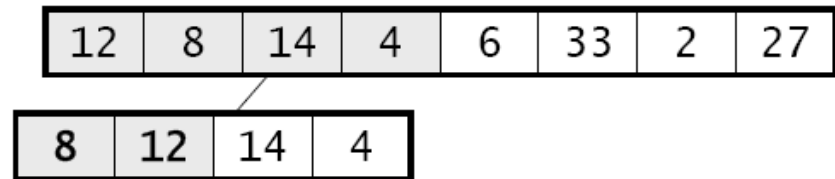
Recursive Calls - Steps

```
static void mergeSort(int[] arr) {  
    myMergeSort(arr);  
}  
  
static void myMergeSort(int[] arr) {  
    if (arr.length == 1) return;  
    // Allocate leftArr and rightArr  
    split(arr, leftArr, rightArr);  
    myMergeSort(leftArr);  
    myMergeSort(rightArr);  
    Merge(leftArr, rightArr, arr);  
}
```

Call merge() to merge two subarrays into original array

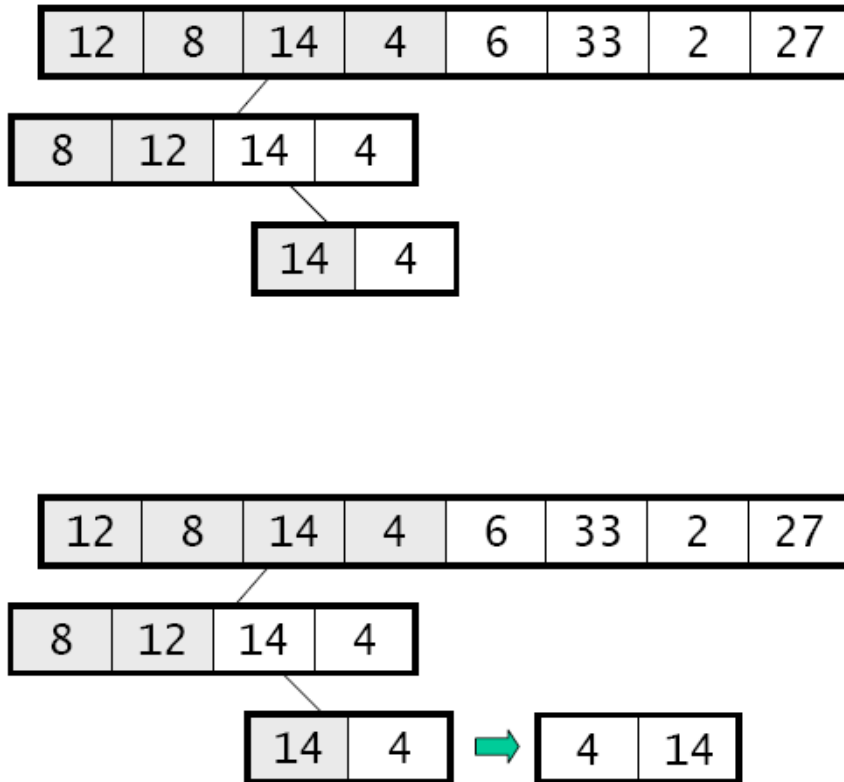


Return to the recursive call for the 4-element subarray, and start another recursive call for the right subarray {14, 4}.



Recursive Calls - Steps

Repeat the similar process for the right 2-element subarray

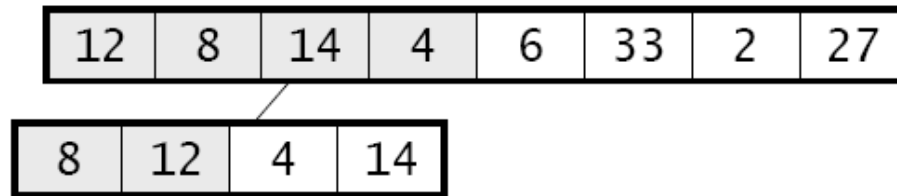


```
static void mergeSort(int[] arr) {  
    myMergeSort(arr);  
}
```

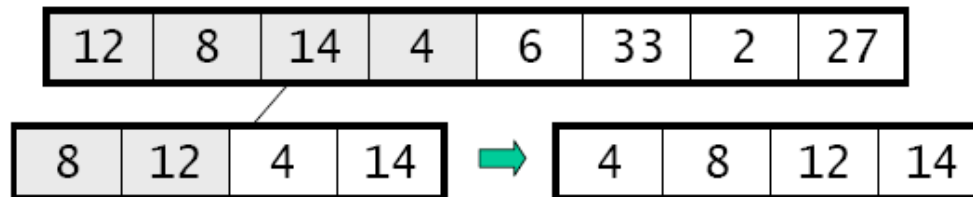
```
static void myMergeSort(int[] arr) {  
    if (arr.length == 1) return;  
    // Allocate leftArr and rightArr  
    split(arr, leftArr, rightArr);  
    myMergeSort(leftArr);  
    myMergeSort(rightArr);  
    Merge(leftArr, rightArr, arr);  
}
```

Recursive Calls - Steps

Return from the recursive call for the 2-element right subarray. We have



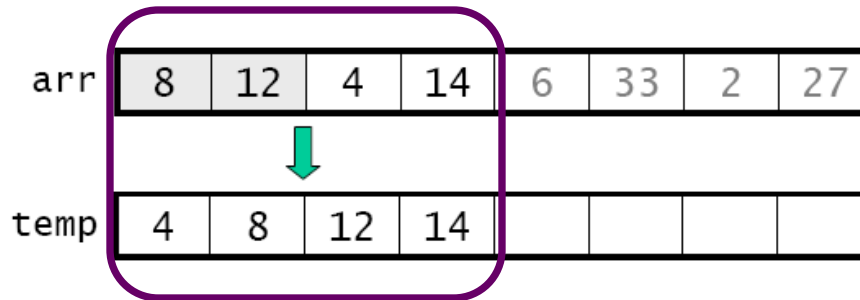
Call merge() to merge the 2-element subarrays, and copy the elements back



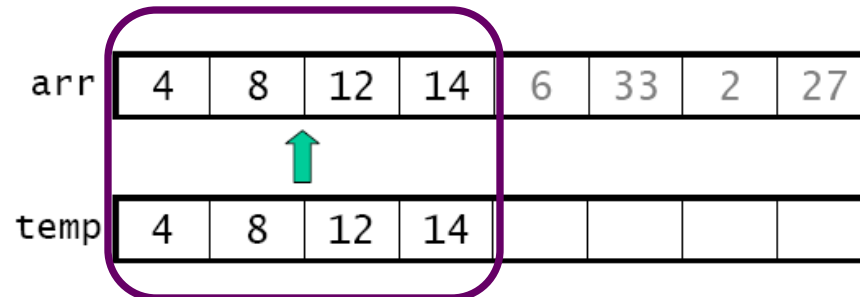
Etc.

Implementation of Merge-Sort

- Our approach so far was to create new arrays for each new set of subarrays, and to merge them back into the array that was split.
 - Creates a lot of arrays in the recursive call chain
- Instead, we'll create a temp. array of the same size as the original.
 - pass it to each call of the recursive merge-sort method
 - use it when merging subarrays of the original array:



- after each merge, copy the result back into the original array:



The Helper Method merge()

```
static void merge(int[] arr, int[] temp, int leftStart, int leftEnd, int rightStart, int rightEnd) {
```

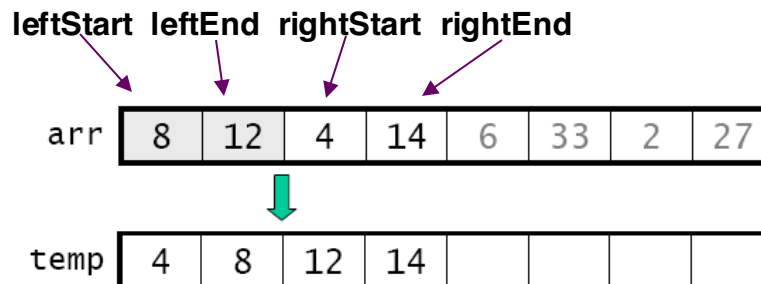
```
    int i = leftStart; // index into left subarray  
    int j = rightStart; // index into right subarray  
    int k = leftStart; // index into temp  
    while ( ? ) {
```

```
    }
```

```
    ?
```

```
    for (i = leftStart; i <= rightEnd; i++) // copy back  
        arr[i] = temp[i];
```

```
}
```




```
static void merge(int[] arr, int[] temp, int leftStart, int leftEnd, int rightStart, int rightEnd) {
```

```
    int i = leftStart; // index into left subarray  
    int j = rightStart; // index into right subarray  
    int k = leftStart; // index into temp  
    while (i <= leftEnd && j <= rightE) {
```

```
        if (array[i] <= array[j])  
        {  
            temp[k] = array[i];  
            i++;  
        }  
        else  
        {  
            temp[k] = array[j];  
            j++;  
        }  
        k++; }  
  
/* Copy remaining elements of left array if any */  
while (i <= leftEnd)  
    {  
        temp[k] = array[i];  
        i++;  
        k++;  
    }  
  
/* Copy remaining elements of right if any */
```

```
for (i = leftStart; i <= rightEnd; i++) // copy back  
    arr[i] = temp[i];
```

```
}
```

mergeSort()

- We use a wrapper method to create the temporary array, and to make the initial call to a separate recursive method:

```
static void mergeSort(int[] arr) {  
    int[] temp = new int[arr.length];  
    myMergeSort(arr, tmp, 0, arr.length - 1);  
}
```

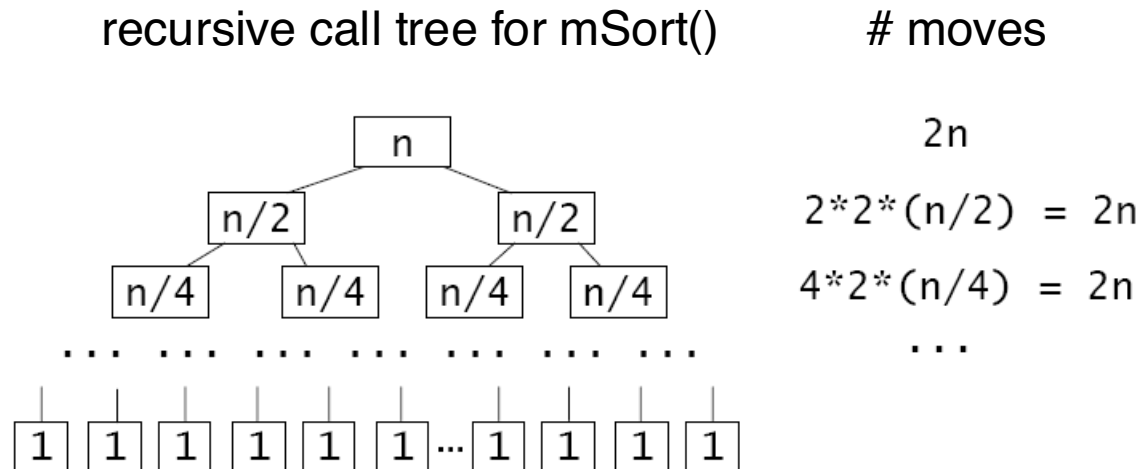
```
static void myMergeSort(int[] arr, int[] temp, int start, int end) {  
    if ( ? ) // base case  
        return;  
    int middle = (start + end)/2; // The splitting step  
  
    ?  
  
}
```

mergeSort()

```
static void mergeSort(int[] arr) {  
    int[] temp = new int[arr.length];  
    myMergeSort(arr, tmp, 0, arr.length - 1);  
}  
  
static void myMergeSort(int[] arr, int[] temp, int start, int end) {  
    if (start >= end ) // base case  
        return;  
    int middle = (start + end)/2; // The splitting step  
  
    // Sort first and second halves  
    myMergeSort (arr, temp, start, middle);  
    myMergeSort (arr , temp, middle+1, end);  
  
    // Merge the sorted halves  
    merge(arr, temp, start, middle, middle+1, end);
```

Running Time Analysis

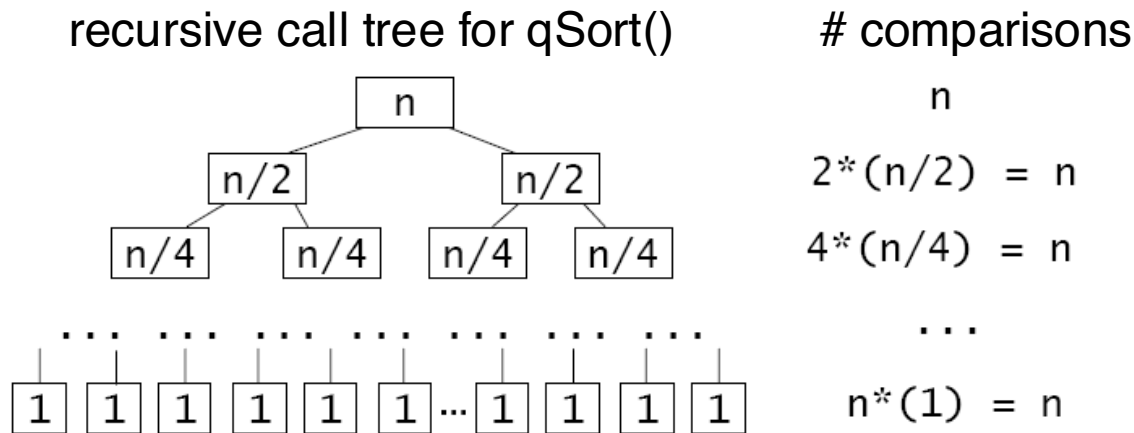
- Merging two halves of an array of size n requires $2n$ moves.
- Merge-sort repeatedly divides the array in half, so we have the following call tree:



- At all but the last level of the call tree, there are $2n$ moves
 - How many levels are there?
- $M(n) = 2n \log_2 n$ (worst-case or best-case)
- $C(n) \leq n \log_2 n$ (between $0.5n * \log(n)$ and $n * \log(n)$)
- $O(n \log n)$ overall

Compared to Quick-sort

- Partitioning an array requires n comparisons, because each element is compared with the pivot.
- **best case**: partitioning always divides the array in half



- at each level of the call tree, we perform n comparisons
- There are $\log_2 n$ levels in the tree. So $C(n) = n \log_2 n$
- $M(n) \leq 1.5 n \log_2 n$ (at most $n/2$ swaps at each level)

Quick-Sort or Merge-Sort?

- Quick-sort used often
 - Low extra space
 - Good performance average

- For Quick-Sort
 - worst-case does not appear often, average-case is closer to best-case ($n \cdot \log(n)$ comparisons and $1.5n \cdot \log(n)$ moves)
 - It is important to choose good pivots, to have $n \cdot \log(n)$ running time

- For merge-sort
 - Average-case is close to worst-case
 - Between $0.5n \cdot \log(n)$ and $n \cdot \log(n)$ comparisons and $2n \cdot \log(n)$ moves

Comparisons

Algorithm	Best-case	Worst-case	Average-case	Extra space
Selection sort	$O(n^2)$	$O(n^2)$	$O(n^2)$	$O(1)$
Bubble sort	$O(n^2)$	$O(n^2)$	$O(n^2)$	$O(1)$
Insertion sort	$O(n)$	$O(n^2)$	$O(n^2)$	$O(1)$
Shell-sort	$O(n \cdot \log n)$	$O(n^{1.5})$	$O(n^{1.5})$, but can be $O(n^{1.25})$	$O(1)$
Quick-sort	$O(n \cdot \log n)$	$O(n^2)$	$O(n \cdot \log n)$	$O(\log n)$ (ave case) $O(n)$ (worst case)
Merge-sort	$O(n \cdot \log n)$	$O(n \cdot \log n)$	$O(n \cdot \log n)$	$O(n)$
Heap-sort	$O(n \cdot \log n)$	$O(n \cdot \log n)$	$O(n \cdot \log n)$	$O(1)$

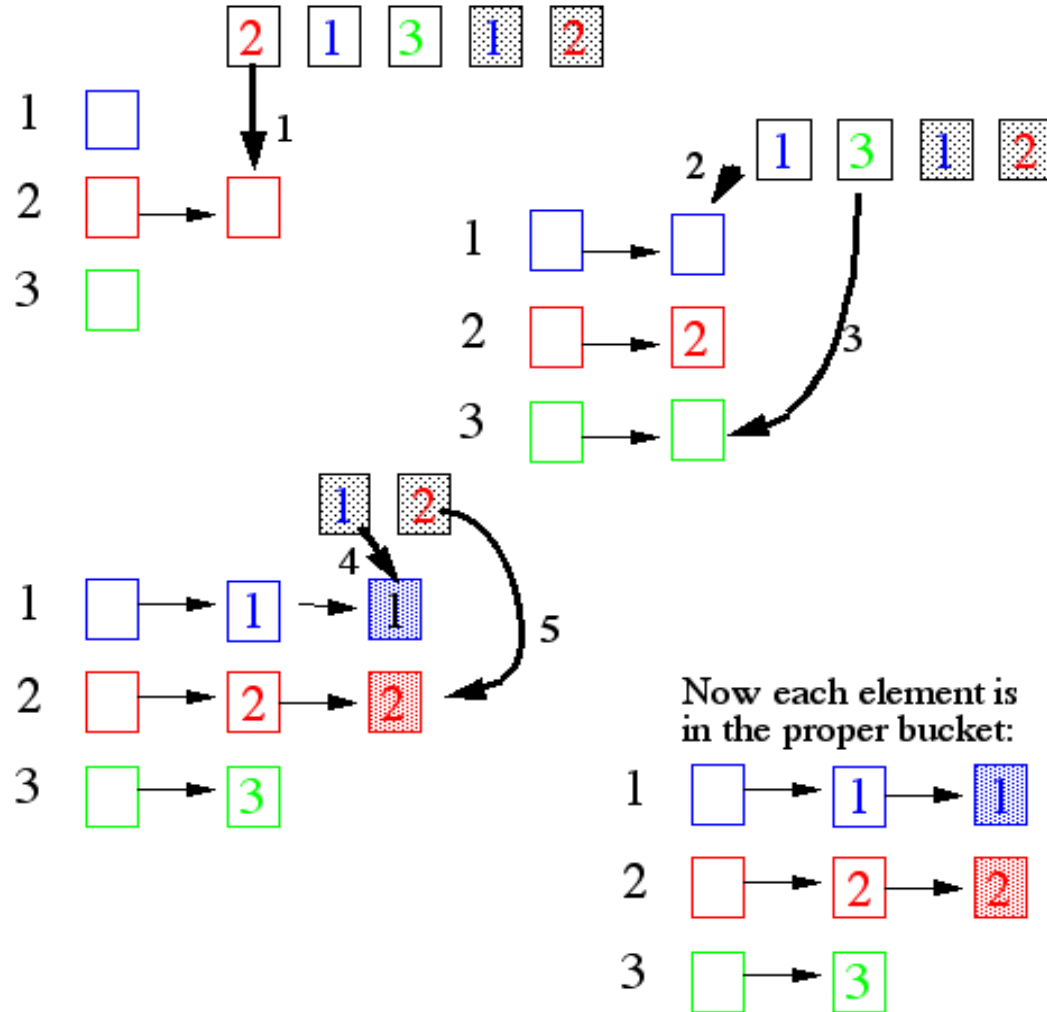
Bucket Sort

□ Bucket sort

- Assumption: integer keys in the range $[0, M)$
- Basic idea:
 1. Create M linked lists (*buckets*), one for each possible key value
 2. Add each input element to appropriate bucket
 3. Concatenate the buckets

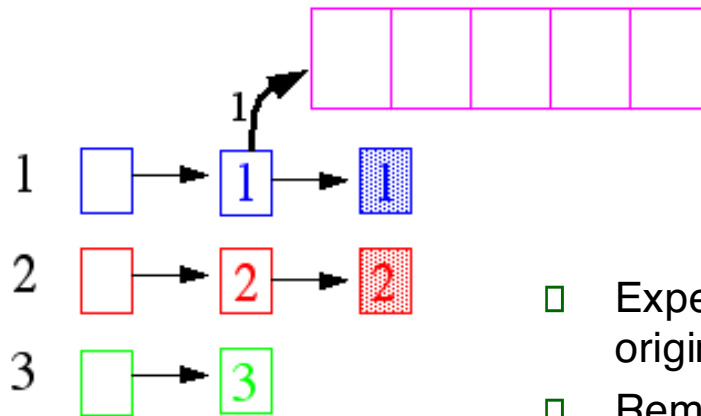
□ Remember hash tables also uses buckets?

Bucket Sort Example

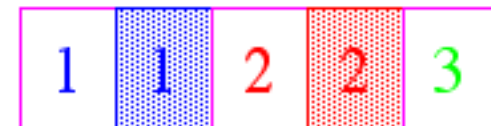


Bucket Sort Example

- Pull the elements from the buckets into the array



- Expected total time is $O(M+N)$, with N = size of original array, M = number of buckets
- Remember hash tables also uses buckets?
 - Bucket sort preserves order (key values) in buckets
 - Hashing mixes up elements with diverse key values



Keys of Non-integer Types?

- What if keys are not integers?
 - Assumption: input is N floating numbers (scaled) in $[0, 1]$
 - Basic idea:
 - Create M linked lists (*buckets*) to divide interval $[0, 1]$ into subintervals of size $1/M$
 - Add each input element to appropriate bucket and sort the bucket with insertion sort
 - Choose $M=O(N)$
 - Uniform input distribution \rightarrow expected bucket size is $O(1)$
 - Therefore the expected total time is $O(N)$: $O(N)$ to put elements into the buckets and $O(N)$ to move them back into the array
- With uniform key distribution, Bucket Sort has $O(N)$ running time
- But sensitive to the key distribution in the range (what if it's not **uniform?**)
- Pays with space for time
- Pays with worst-case time for average-case time