

CSCI 136
Data Structures &
Advanced Programming

Faster Sorting Methods

Goals

Introduce *Divide & Conquer* algorithm design

Explore two efficient D&C sorting methods

- MergeSort
- QuickSort

Divide & Conquer

Binary search is efficient because

- Divides the data in half (in constant time)
- Eliminates¹ one of the halves (in constant time)

So, the number of value comparisons T_n needed to search an array of size n satisfies

$$T_n = T_{\frac{n}{2}} + 1 \text{ and } T_1 = 1$$

By induction, we can show that T_n is $O(\log_2 n)$

- Try this at home! [Hint: Prove it's $O(1 + \log_2 n)$]
 - You'll need to use *strong* induction

Faster Sorting: Merge Sort

- A *divide and conquer* algorithm
- Typically used on arrays
- Merge sort works as follows:
 - If the array is of length 0 or 1, then it is already sorted.
 - Divide the unsorted array into two arrays of about half the size of original.
 - Sort smaller arrays recursively by re-applying merge sort.
 - Merge the two smaller arrays back into one sorted array.
- Time Complexity?
 - Spoiler Alert! We'll see that it's $O(n \log n)$
- Space Complexity?
 - $O(n)$

Merge Sort

8	14	29	9	17	32	14	16	12	21	29	39
---	----	----	---	----	----	----	----	----	----	----	----

8	14	29	17	29	39
---	----	----	----	----	----

16	9	12	12	26	21
----	---	----	----	----	----

8	14	29
---	----	----

1	17	39
---	----	----

16	12	12
----	----	----

3	21	21
---	----	----

8	14	29
---	----	----

1	17	39
---	----	----

16	16	12
----	----	----

3	21	11
---	----	----

8	14
---	----

1	17
---	----

16	9
----	---

3	21
---	----

Merge Sort : Pseudo-code

- How would we design it?
- First pass...

// recursively mergesorts A[from .. To] “in place”

void recMergeSortHelper(A[], int from, int to)

if (from \leq to)

mid = (from + to)/2

recMergeSortHelper(A, from, mid)

recMergeSortHelper(A, mid+1, to)

merge(A, from, to)

But *merge* hides a number of important details....

Merge Sort : An Optimization

A naive merge method creates a secondary array

- The two merged halves of the original array are merged into the secondary array
- The secondary array is copied back into the original array

This involves lot of array creation and moving

Instead, merge

- Uses a *single* secondary array
- Merges left half of original array to secondary

Merge Sort : Temporary Array

data:

8	14	29	1	17	39	16	9	12	3	21	11
---	----	----	---	----	----	----	---	----	---	----	----

temp:

8	14	29	1	17	39						
---	----	----	---	----	----	--	--	--	--	--	--

mergeSort left half

data:

8	14	29	1	17	39	16	9	12	3	21	11
---	----	----	---	----	----	----	---	----	---	----	----

temp:

1	8	14	17	29	39						
---	---	----	----	----	----	--	--	--	--	--	--

mergeSort right half

data:

8	14	29	1	17	39	3	9	11	12	16	21
---	----	----	---	----	----	---	---	----	----	----	----

temp:

1	8	14	17	29	39						
---	---	----	----	----	----	--	--	--	--	--	--

merge

data:

1	3	8	9	11	12	14	16	17	21	29	39
---	---	---	---	----	----	----	----	----	----	----	----

Merge Sort Implementation

```
private static <T extends Comparable<T>> void
    mergeSortRecursive(T[] data, T[] temp, int low, int high) {

    int n = high-low+1;
    int middle = low + n/2;
    if (n < 2) return;

    int i;
    // move lower half of data into temporary storage
    for (i = low; i < middle; i++) {
        temp[i] = data[i];
    }
    mergeSortRecursive(temp, data, low, middle-1);
    mergeSortRecursive(data, temp, middle, high);
    merge(data, temp, low, middle, high);
}
```

Merge Method

```
private static <T extends Comparable<T>> void
    merge(T[] dest, T[] using, int low, int middle, int high) {

    int ri = low; // result index
    int ui = low; // using index
    int di = middle; // dest index
    // while two lists are not empty merge smaller value
    while (ui < middle && di <= high) {
        if (dest[di].compareTo(using[ui]) < 0)
            dest[ri++] = dest[di++]; // smaller is in high dest
        else
            dest[ri++] = using[ui++]; // smaller is in using
    }
    // possibly some values left in using array
    while (ui < middle) {
        dest[ri++] = using[ui++];
    }
}
```

Aside: `n++` vs `++n`

The *postfix* increment (`++`) operator adds 1 to the value of the variable to which it is applied

```
int n = 1;
n++;           // n now has value 2
int k = n++;   // k now has value 2 and n has value 3
```

Note that, in addition to incrementing `n`, it also returns the *pre-increment* value of `n`

- That is: `++` is an operator that
 - returns the value of the variable to which it is applied
 - after which it increments the value of that variable

There is also a *prefix* version: `++n`

- It first increments the value of the variable
- after which it returns the (incremented) value

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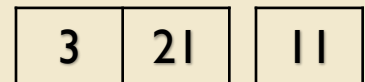
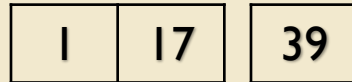
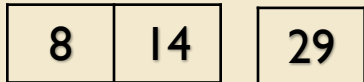
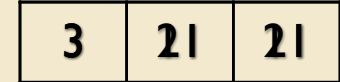
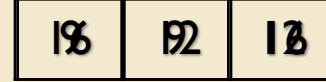
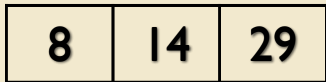
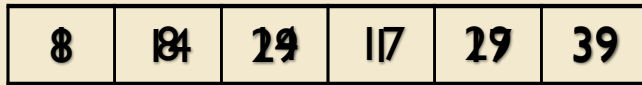
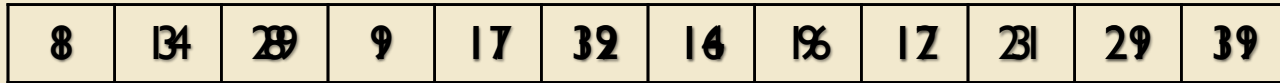
```
k = ++n;           // k now has value 4 and so does n
```

Merge Sort : Java Implementation

- Implementation Notes
 - Note use of generics
 - Note carefully how temp array is used to reduce copying
 - Make sure the data is in the correct array!
- Time Complexity?
 - Takes at most $2k$ comparisons to merge two lists of size k
 - Number of splits/merges for list of size n is $\log n$
 - Claim: At most time $O(n \log n)$...We'll see soon...
- Space Complexity?
 - $O(n)$?
 - Need an extra array, so really $O(2n)$! But $O(2n) = O(n)$

Merge Sort

log(n)
depth



merge takes at most n comparisons per line

Time Complexity Proof

- Prove for $n = 2^k$ (true for other n but harder)
- That is, MergeSort for n performs at most
 - $n * \log(n) = 2^k * k$ comparisons of elements
- Base cases $k \leq 1$: 0 comparisons: $0 < 1 * 2^1$ ✓
- Induction Step: Suppose true for all integers smaller than k . Let $T(k)$ be # of comparisons for 2^k elements. Then
- $T(k) \leq 2^k + 2 * T(k-1)$ $\leq 2^k + 2(k-1)2^{k-1} \leq$ $k * 2^k$ ✓

Merge Sort

- Unlike Bubble, Insertion, and Selection sort, Merge sort is a divide and conquer algorithm
 - Bubble, Insertion, Selection sort complexity: $O(n^2)$
 - Merge sort complexity: $O(n \log n)$
- Are there any limitations with Merge sort?
 - What if we're dealing with singly-linked lists?
- Why would we ever use any other algorithm for sorting?

Merge Sort for SLL

- Finding the middle element of the list takes a linear number of steps, so does merging two sorted lists of total length n
- So, if $T(n)$ is the number of steps necessary to mergeSort an n -element list then

$$T(n) \leq 2T\left(\frac{n}{2}\right) + cn$$

- where cn represents the combined number of steps for splitting the list and merging the two halves

Time Complexity Proof Revisited

- Claim: For $n \geq 1$, $T(n) \leq 2cn \log_2 n + c$
 - Base case $n \leq 1$: Let c be the number of statements in mergeSort. Then at most c statements are executed. And $c \leq 2c \log_2 1 + c$ ✓
- Induction Step: Suppose true for all integers smaller than n , for some $n > 1$. That is,
 - For all $k < n$, $T(k) \leq 2ck \log_2 k + c$
 - Now must show: $T(n) \leq 2cn \log_2 n + c$
- Recall: $T(n) \leq 2T\left(\frac{n}{2}\right) + cn$
 - Two recursive calls to mergeSort plus a merge

Time Complexity Proof Revisited

$$\begin{aligned}T(n) &\leq 2T\left(\frac{n}{2}\right) + cn \\&\leq 2\left(2c\frac{n}{2}\log_2\frac{n}{2} + c\right) + cn \quad (\text{by induction}) \\&\leq 2cn\log_2\frac{n}{2} + 2c + cn \\&\leq 2cn\log_2 n - 2cn + 2c + cn \\&= 2cn\log_2 n - cn + 2c \\&\leq 2cn\log_2 n + c + c(1 - n) \\&\leq 2cn\log_2 n + c \text{ for } n \geq 1\end{aligned}$$

Drawbacks to Merge Sort

- Need extra temporary array
 - If data set is large, this could be a problem
- Waste time copying values back and forth between original array and temporary array
- Can we avoid this?

Quick Sort

- Quick sort is designed to behave much like Merge sort, without requiring extra storage space

Merge Sort	Quick Sort
Divide list in half	Partition* list into 2 parts
Sort halves	Sort parts
Merge halves	Join* sorted parts

Quick Sort

```
public void quickSortRecursive(Comparable data[],
                               int low, int high) {
    // pre: low <= high
    // post: data[low..high] in ascending order
    int pivot;
    if (low >= high) return;

    /* 1 - place pivot */
    pivot = partition(data, low, high);
    /* 2 - sort small */
    quickSortRecursive(data, low, pivot-1);
    /* 3 - sort large */
    quickSortRecursive(data, pivot+1, high);
}
```

Partition

Idea : Rearrange array so that

- First element (pivot) into its final (sorted) position
- All values smaller than pivot are to the left of pivot
- All values larger than pivot are to the right of pivot
- Return index of “pivot”

Partition : Pivot is 8

8	14	29	1	17	39	16	9	12	3	21	11
---	----	----	---	----	----	----	---	----	---	----	----

L

R

8	14	29	1	17	39	16	9	12	3	21	11
---	----	----	---	----	----	----	---	----	---	----	----

L

R

3	14	29	1	17	39	16	9	12	8	21	11
---	----	----	---	----	----	----	---	----	---	----	----

L

R

3	8	29	1	17	39	16	9	12	14	21	11
---	---	----	---	----	----	----	---	----	----	----	----

L

R

3	8	29	1	17	39	16	9	12	14	21	11
---	---	----	---	----	----	----	---	----	----	----	----

L

R

3	1	29	8	17	39	16	9	12	14	21	11
---	---	----	---	----	----	----	---	----	----	----	----

L

R

3	1	8	29	17	39	16	9	12	14	21	11
---	---	---	----	----	----	----	---	----	----	----	----

L=R

Partition

```
int partition(int data[], int left, int right) {
    while (true) {
        // pivot is data[left]: Compare to values on its right
        while (left < right && data[left] < data[right]) right--;

        if (left < right) swap(data, left++, right);
        else return left;

        // switch sides!

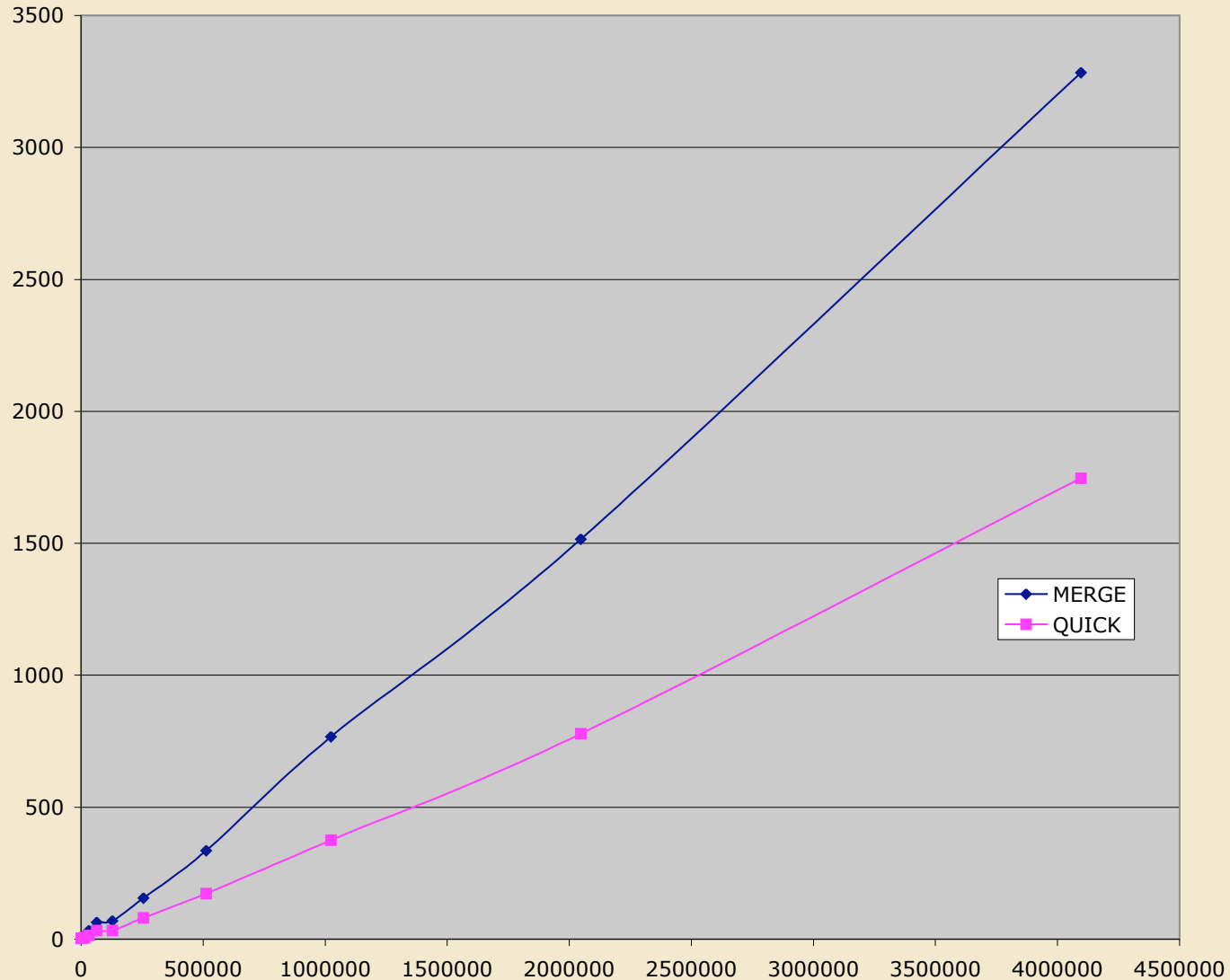
        // pivot is data[right]: Compare it to values on its left
        while (left < right && data[left] < data[right]) left++;

        if (left < right) swap(data, left, right--);
        else return right;
    }
}
```


Complexity

- Time:
 - Partition is $O(n)$
 - If partition breaks list exactly in half, same as merge sort, so $O(n \log n)$
 - If data is already sorted, partition splits list into groups of 1 and $n-1$, so $O(n^2)$
- Space:
 - $O(n)$ (so is MergeSort)
 - In fact, it's $n + c$ compared to $2n + c$ for MergeSort

Merge vs. Quick (Average Time)



Food for Thought...

- How to avoid picking a bad pivot value?
 - Pick median of 3 elements for pivot (heuristic!)
- Combine selection sort with quick sort
 - For small n , selection sort is faster
 - Switch to selection sort when elements is ≤ 7
 - Switch to selection/insertion sort when the list is almost sorted (partitions are very unbalanced)
 - Heuristic!

Sorting Wrapup

	Time	Space
Bubble	Worst: $O(n^2)$ Best: $O(n)$ - if “optimized”	$O(n) : n + c$
Insertion	Worst: $O(n^2)$ Best: $O(n)$	$O(n) : n + c$
Selection	Worst = Best: $O(n^2)$	$O(n) : n + c$
Merge	Worst = Best: $O(n \log n)$	$O(n) : 2n + c$
Quick	Average = Best: $O(n \log n)$ Worst: $O(n^2)$	$O(n) : n + c$