



Carlos Moreno cmoreno@uwaterloo.ca EIT-4103



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These slides, the course material, and course web site are based on work by Douglas W. Harder



Standard reminder to set phones to silent/vibrate mode, please!



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- Discussed some of the important sorting algorithms.
- In particular, merge sort and heap sort
 - With merge sort, we split in two halves, sort each one, then merge the sorted halves
 - Divide-and-conquer !

• During today's class:

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- Look into quick sort, the most widely used sorting algorithms (at least in general-purpose libraries and software out there)
 - Discuss the basic idea behind the algorithm
 - Look into its run time, with emphasis on average-case vs.
 Worst-case (interesting plot twist in this area!)
 - Discuss some of the strategies to avoid the worst-case
- Work through some examples.

Quick sort

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- To introduce the basic idea, let's first recall what the main problem was with merge sort...
 - The merge operation can not be done in-place
 - This not only has the immediate implication that we require the extra space, but it also has an implication on the performance — the data is being moved a lot, and so this has a performance penalty!
 - Even more critical if the data is expensive to copy (e.g., strings, data that is really on disk or some extra-slow hardware devices)

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Quick sort

- The obvious question is: can we do a merge sort without requiring extra storage?
 - Let's try merging the following two sorted sequences:

Sequence A: 11, 23, 40, 57, 68, 93 Sequence B: 5, 16, 35, 46, 79, 96

Output sequence:

Quick sort

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```

Output sequence:

Quick sort

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 - Let's try merging the following two sorted sequences:

```
Sequence A: 11, 23, 40, 57, 68, 93
Sequence B: 5, 16, 35, 46, 79, 96
```

Output sequence: 5

Quick sort

- The obvious question is: can we do a merge sort without requiring extra storage?
 - Let's try merging the following two sorted sequences:

```
Sequence A: 11, 23, 40, 57, 68, 93
Sequence B: 5, 16, 35, 46, 79, 96
```

Output sequence: 5, 11

Quick sort

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 - Let's try merging the following two sorted sequences:

Sequence A: 11, 23, 40, 57, 68, 93
Sequence B: 5, 16, 35, 46, 79, 96

Output sequence: 5, 11, 16

Quick sort

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 - Let's try merging the following two sorted sequences:

Sequence A: 11, 23, 40, 57, 68, 93 Sequence B: 5, 16, 35, 46, 79, 96

Output sequence: 5, 11, 16, 23

Quick sort

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 - Let's try merging the following two sorted sequences:

Sequence A: 11, 23, 40, 57, 68, 93 Sequence B: 5, 16, 35, 46, 79, 96

Output sequence: 5, 11, 16, 23, 35

Quick sort

- The obvious question is: can we do a merge sort without requiring extra storage?
 - Let's try merging the following two sorted sequences:

Sequence A: 11, 23, 40, 57, 68, 93 Sequence B: 5, 16, 35, 46, 79, 96

Output sequence: 5, 11, 16, 23, 35 · · · etc.

Quick sort

- The obvious question is: can we do a merge sort without requiring extra storage?
 - Let's try merging the following two sorted sequences:

Sequence A: 11, 23, 40, 57, 68, 93 Sequence B: 5, 16, 35, 46, 79, 96

We might be tempted to think of the items at the left of the arrows as available space ... But ...

Quick sort

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 - Let's try merging the following two sorted sequences:

Sequence A: 11, 23, 40, 57, 68, 93 Sequence B: 5, 16, 35, 46, 79, 96

Do you see why that's not going to work? (we'll discuss this detail during class)

Quick sort

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 - And yes, one might think "well, duh! of course we do that what else are we going to do?"

- The problem seems to be due to the fact that we first sort each half, then combine the results.
 - And yes, one might think "well, duh! of course we do that what else are we going to do?"
 - And that's actually an excellent question! Is there something else we could do?
 - Perhaps going the other way around could we do some processing first such that the elements end up in a way that when we recursively sort each half we're done?

• Let's reformulate that question:

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 Suppose that I give you sequence A and sequence B, one after the other one, as shown below:

$$\underbrace{a_{1,}a_{2,}\cdots,a_{n-1},a_{n}}_{Sequence A} \underbrace{b_{1,}b_{2,}\cdots,b_{n-1},b_{n}}_{Sequence B}$$

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 Suppose that I give you sequence A and sequence B, one after the other one, as shown below:

$$\underbrace{a_{1,}a_{2,}\cdots,a_{n-1},a_n}_{Sequence A} \underbrace{b_{1,}b_{2,}\cdots,b_{n-1},b_n}_{Sequence B}$$

 And suppose I told you that if we sort sequence A and sort sequence B, then the complete sequence will be sorted — what does that tell you about the values in both sequences?

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 That's the central aspect behind quicksort's functionality — and no, I won't write the answer in this slide set; we'll complete this discussion in class.

- That's the central aspect behind quicksort's functionality — and no, I won't write the answer in this slide set; we'll complete this discussion in class.
- However, I will discuss another aspect that plays a rather important role, and maybe that will give you some ideas about what the answer to the previous issue would be?

- Let's look at the notion of the *median* of a set of values.
 - The *median* is a statistical measure of a set of values, somewhat similar to the *mean*, or average, but quite interesting:
 - Given a set of values $\{x_1, x_2, \cdots, x_{n-1}, x_n\}$ the median is one of the values in the sequence, x_m , such that there are as many elements $x_i < x_m$ as there are elements $x_k > x_m$

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 - Given a set of values $\{x_1, x_2, \cdots, x_{n-1}, x_n\}$ the median is one of the values in the sequence, x_m , such that there are as many elements $x_i < x_m$ as there are elements $x_k > x_m$
 - Visually, this corresponds to the following: place the elements in order; then, pick the middle element.

- The problem is, algorithms to find the median are not very efficient — in many cases, one simply sorts and then picks the middle element.
 - So, if we're needing the median as part of a sorting procedure, we're kind of stuck, like a dog chasing its tail !!

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- What about an approximation of the median??
 - Something that, on average, is close to the median.
 - As it turns out, this is quite useful for quicksort !!
 - We'll investigate at least a couple of techniques and their advantages and disadvantages.