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# CSE 373

Sorting 3: Merge Sort, Quick Sort  
reading: Weiss Ch. 7

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# Merge sort

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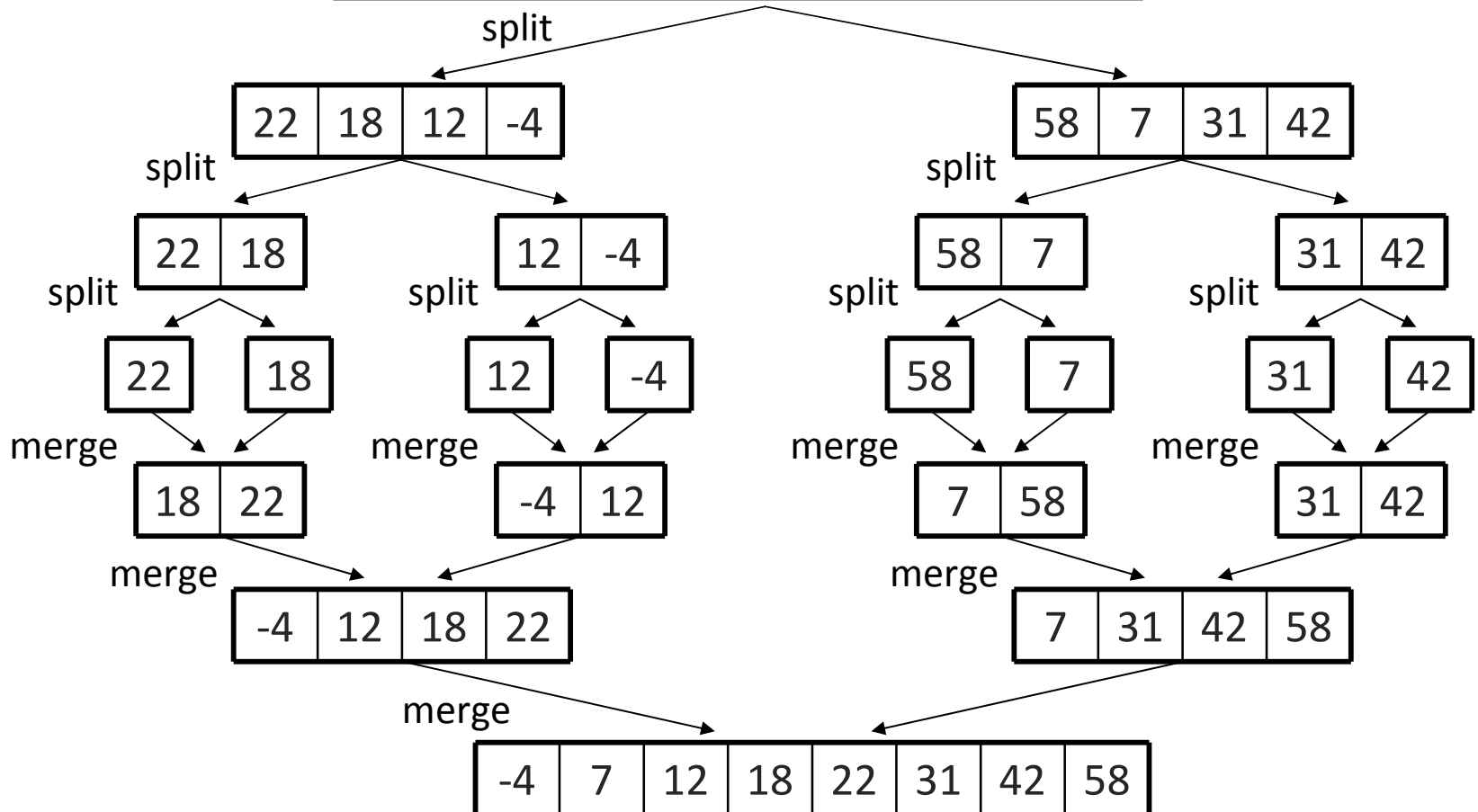
- **merge sort:** Repeatedly divides the data in half, sorts each half, and combines the sorted halves into a sorted whole.

The algorithm:

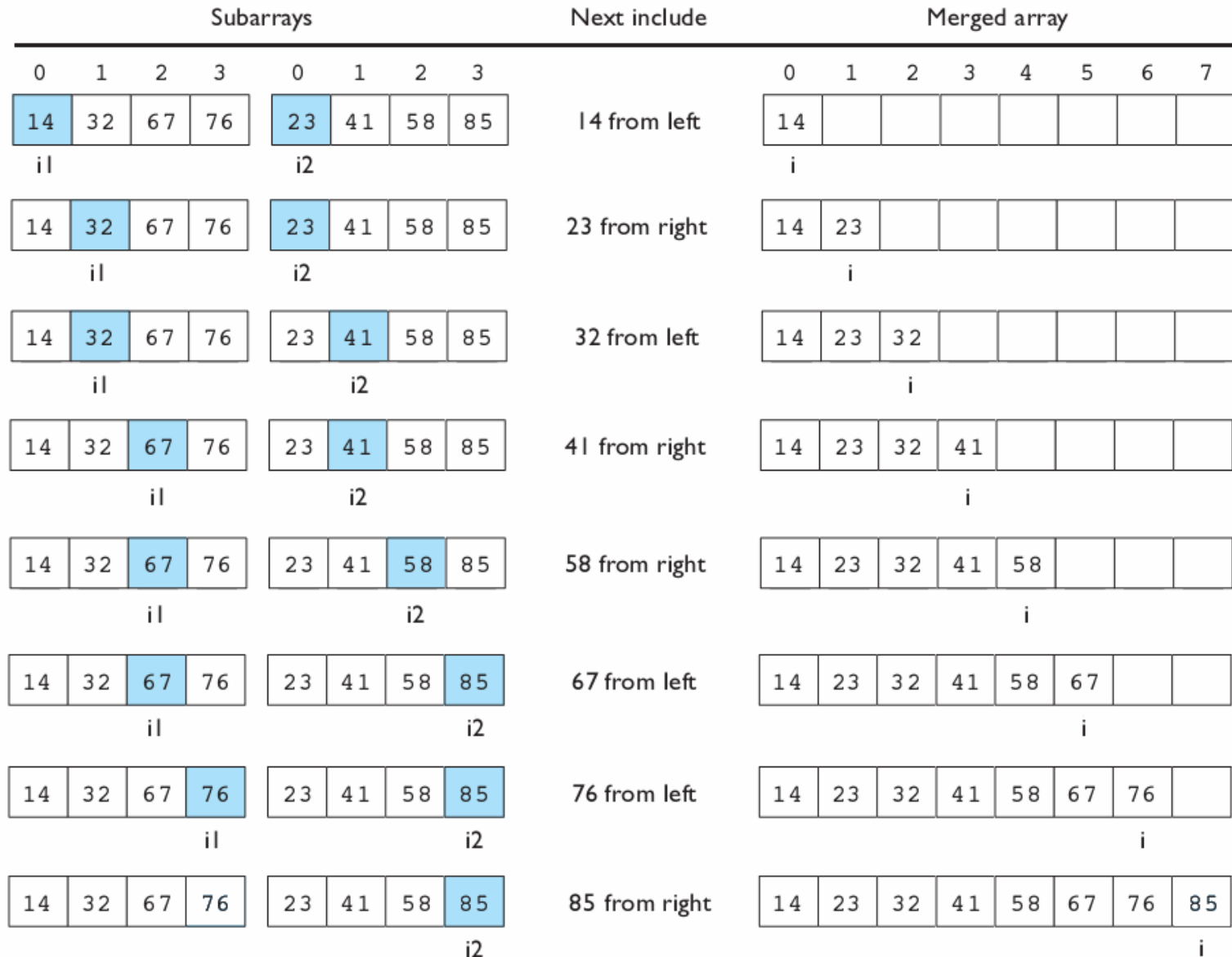
- Divide the list into two roughly equal halves.
- Sort the left half.
- Sort the right half.
- Merge the two sorted halves into one sorted list.
  
- Often implemented recursively.
- An example of a "divide and conquer" algorithm.
  - Invented by John von Neumann in 1945
  
- Runtime:  $O(N \log N)$ . Somewhat faster for asc/descending input.

# Merge sort example

index	0	1	2	3	4	5	6	7
value	22	18	12	-4	58	7	31	42



# Merging sorted halves



# Merge halves code

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```
// Merges the left/right elements into a sorted result.
// Precondition: left/right are sorted
public static void merge(int[] result, int[] left,
                          int[] right) {
    int i1 = 0;    // index into left array
    int i2 = 0;    // index into right array

    for (int i = 0; i < result.length; i++) {
        if (i2 >= right.length ||
            (i1 < left.length && left[i1] <= right[i2])) {
            result[i] = left[i1];    // take from left
            i1++;
        } else {
            result[i] = right[i2];    // take from right
            i2++;
        }
    }
}
```

# Merge sort code

---

```
// Rearranges the elements of a into sorted order using
// the merge sort algorithm.
public static void mergeSort(int[] a) {
    if (a.length >= 2) {
        // split array into two halves
        int[] left  = Arrays.copyOfRange(a, 0, a.length/2);
        int[] right = Arrays.copyOfRange(a, a.length/2,
                                         a.length);

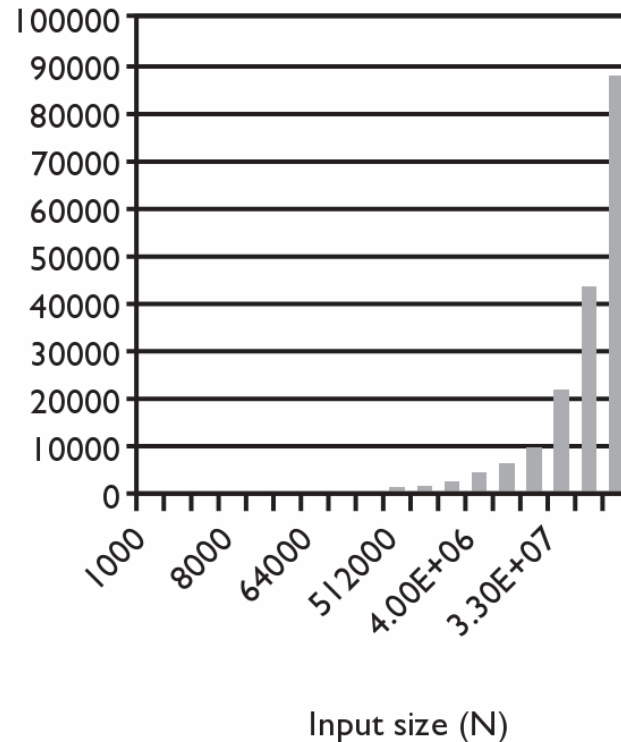
        // recursively sort the two halves
        mergeSort(left);
        mergeSort(right);

        // merge the sorted halves into a sorted whole
        merge(a, left, right);
    }
}
```

# Merge sort runtime

- What is the complexity class (Big-Oh) of merge sort?

N	Runtime (ms)
1000	0
2000	0
4000	0
8000	0
16000	0
32000	15
64000	16
128000	47
256000	125
512000	250
1e6	532
2e6	1078
4e6	2265
8e6	4781
1.6e7	9828
3.3e7	20422
6.5e7	42406
1.3e8	88344



# Recursive code and runtime

- It is difficult to look at a recursive method and estimate its runtime.
  - Let  $T(N)$  = Runtime for merge sort to process an array of size  $N$ .

mergeSort(a, length= $N$ ):

if  $N \geq 2$ :

```
left = copyOfRange(0, N/2) // approx. N/2 time
right = copyOfRange(N/2, N) // approx. N/2 time
mergeSort(left) // T(N/2)
mergeSort(right) // T(N/2)
merge(a, left, right) // approx. N time
```

- $T(N) = N/2 + N/2 + T(N/2) + T(N/2) + N$
- $T(N) = 2T(N/2) + 2N,$  when  $N \geq 2$
- $T(1) = 1,$  when  $N = 1$

- **recurrence relation:** An equation that recursively defines a sequence, specifically the runtime of a recursive algorithm.



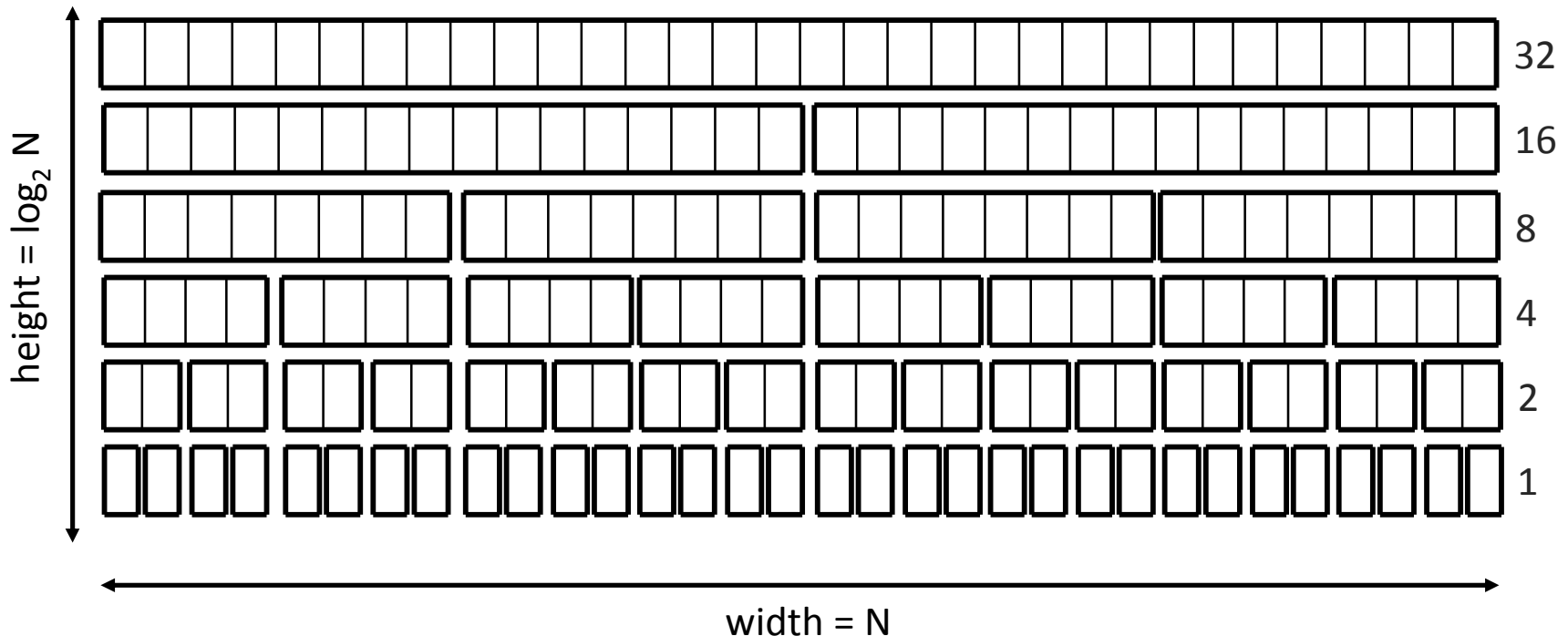
# Recurrence relations

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- Intuition about recurrence relations: Use *repeated substitution*.
- $T(N) = 2 T(N/2) + 2N$ 
  - $T(N/2) = 2 T(N/4) + 2(N/2)$
- $T(N) = 2 ( 2 T(N/4) + 2(N/2) ) + 2N$   
 $T(N) = 4 T(N/4) + 4N$ 
  - $T(N/4) = 2 T(N/8) + 2(N/4)$
- $T(N) = 4 ( 2 T(N/8) + 2(N/4) ) + 4N$   
 $T(N) = 8 T(N/8) + 6N$
- $T(N) = 16 T(N/16) + 8N$
- $T(N) = 32 T(N/32) + 10N$
- ...
- $T(N) = 2^k T(N/2^k) + 2kN$ 
  - At what value of  $k$  will we hit  $T(1)$  ?
- Let  $k = \log_2 N$ .
- $T(N) = 2^{\log_2 N} T(N/2^{\log_2 N}) + 2 (\log_2 N) N$
- $T(N) = N T(N/N) + 2 N \log_2 N$
- $T(N) = N T(1) + 2 N \log_2 N$
- $T(N) = 2 N \log_2 N + N$
- $T(N) = O(N \log N)$

# More runtime intuition

- Merge sort performs  $O(N)$  operations on each level. *(width)*
  - Each level splits the array in 2, so there are  $\log_2 N$  levels. *(height)*
  - Product of these =  $N * \log_2 N = O(N \log N)$ . *(area)*
  - Example:  $N = 32$ . Performs  $\sim \log_2 32 = 5$  levels of  $N$  operations each:



# Quick sort

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- **quick sort:** Orders a list of values by partitioning the list around one element called a *pivot*, then sorting each partition.
  - invented by British computer scientist C.A.R. Hoare in 1960
- Quick sort is another divide and conquer algorithm:
  - Choose one element in the list to be the pivot.
  - *Divide* the elements so that all elements less than the pivot are to its left and all greater (or equal) are to its right.
  - *Conquer* by applying quick sort (recursively) to both partitions.
- Runtime:  $O(N \log N)$  average,  $O(N^2)$  worst case.
  - Generally somewhat faster than merge sort.

# Choosing a "pivot"

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- The algorithm will work correctly no matter which element you choose as the pivot.
  - A simple implementation can just use the first element.
- But for efficiency, it is better if the pivot divides up the array into roughly equal partitions.
  - What kind of value would be a good pivot? A bad one?

index	0	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16
value	8	18	12	-4	27	30	36	50	7	68	91	56	2	85	42	98	25

# Partitioning an array

- Swap the pivot to the last array slot, temporarily.
- Repeat until done partitioning (until  $i, j$  meet):
  - Starting from  $i = 0$ , find an element  $a[i] \geq \text{pivot}$ .
  - Starting from  $j = N-1$ , find an element  $a[j] \leq \text{pivot}$ .
  - These elements are out of order, so swap  $a[i]$  and  $a[j]$ .
- Swap the pivot back to index  $i$  to place it between the partitions.

index	0	1	2	3	4	5	6	7	8	9
value	6	1	4	9	0	3	5	2	7	8

8  $i$  | | | | | | | |  $\leftarrow$   $j$  6

2  $i$   $\rightarrow$   $\rightarrow$  | |  $j$  8

5  $i$   $\rightarrow$  | 9

6 9

2	1	4	5	0	3	6	8	7	9
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# Quick sort example

index	0	1	2	3	4	5	6	7	8	9
value	<b>65</b>	23	81	43	92	39	57	16	75	32

choose pivot=65

<b>32</b>	23	<b>81</b>	43	92	39	57	<b>16</b>	75	<b>65</b>
32	23	<b>16</b>	43	<b>92</b>	39	<b>57</b>	<b>81</b>	75	65
32	23	16	43	<b>57</b>	39	<b>92</b>	81	75	65
32	23	16	43	57	39	<b>92</b>	81	75	65
32	23	16	43	57	39	<b>65</b>	81	75	<b>92</b>

swap pivot (65) to end

swap 81, 16

swap 57, 92

swap pivot back in

recursively quicksort each half

<b>32</b>	23	16	43	57	39
<b>39</b>	23	<b>16</b>	43	57	<b>32</b>
<b>16</b>	23	<b>39</b>	43	57	32
16	23	<b>32</b>	43	57	<b>39</b>

pivot=32

swap to end

swap 39, 16

swap 32 back in

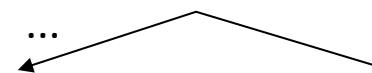
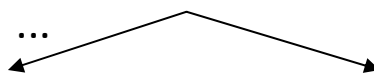
<b>81</b>	75	92
<b>92</b>	<b>75</b>	<b>81</b>
75	92	81
75	<b>81</b>	<b>92</b>

pivot=81

swap to end

swap 92, 75

swap 81 back in



# Quick sort code

---

```
public static void quickSort(int[] a) {
    quickSort(a, 0, a.length - 1);
}
private static void quickSort(int[] a, int min, int max) {
    if (min >= max) { // base case; no need to sort
        return;
    }

    // choose pivot; we'll use the first element (might be bad!)
    int pivot = a[min];
    swap(a, min, max); // move pivot to end

    // partition the two sides of the array
    int middle = partition(a, min, max - 1, pivot);

    swap(a, middle, max); // restore pivot to proper location

    // recursively sort the left and right partitions
    quickSort(a, min, middle - 1);
    quickSort(a, middle + 1, max);
}
```

# Partition code

---

```
// partitions a with elements < pivot on left and
// elements > pivot on right;
// returns index of element that should be swapped with pivot
private static int partition(int[] a, int i, int j, int pivot) {
    while (i <= j) {
        // move index markers i,j toward center
        // until we find a pair of out-of-order elements
        while (i <= j && a[i] < pivot) { i++; }
        while (i <= j && a[j] > pivot) { j--; }

        if (i <= j) {
            swap(a, i, j);
            i++;
            j--;
        }
    }

    return i;
}
```



# Quick sort runtime

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- Best-case analysis: If partition divides the array fairly evenly.

- Let  $T(N)$  = Runtime for quick sort to process an array of size  $N$ .

quickSort(a, length= $N$ ):

swap pivot to end.

//  $O(1)$

mid = partition(a, pivot).

// approx.  $N$  time

swap pivot to mid.

//  $O(1)$

quickSort(min, mid-1).

//  $T(N/2)$  if left size  $\approx N/2$

quickSort(mid+1, max).

//  $T(N/2)$  if right size  $\approx N/2$

- $T(N) = 2T(N/2) + k_1N + k_2(1)$

for some constants  $k_1, k_2$

- $T(N) = O(N \log N)$

- Worst-case: What if the pivot is chosen poorly?

What is the runtime?

- $T(N) = T(N-1) + T(1) + k_1N + k_2(1) = O(N^2)$

# Choosing a better pivot

---

- Choosing the first element as the pivot leads to very poor performance on certain inputs (ascending, descending)
  - does not partition the array into roughly-equal size chunks
- Alternative methods of picking a pivot:
  - *random*: Pick a random index from  $[min .. max]$
  - *median-of-3*: look at left/middle/right elements and pick the one with the medium value of the three:
    - $a[min]$ ,  $a[(max+min)/2]$ , and  $a[max]$
    - better performance than picking random numbers every time
    - provides near-optimal runtime for almost all input orderings

index	0	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16
value	8	18	91	-4	27	30	86	50	65	78	5	56	2	25	42	98	31

# Stable sorting

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- **stable sort:** One that maintains relative order of "equal" elements.
  - important for secondary sorting, e.g.
    - sort by name, then sort again by age, then by salary, ...
- All of the  $N^2$  sorts shown are stable, as is shell sort.
  - bubble, selection, insertion, shell
- Merge sort is stable.
- Quick sort is *not* stable.
  - The partitioning algorithm can reverse the order of "equal" elements.
  - For this reason, Java's `Arrays/Collections.sort()` use merge sort.

# Unstable sort example

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- Suppose you want to sort these points by Y first, then by X:
  - $[(4, 2), (5, 7), (3, 7), (3, 1)]$
- A stable sort like merge sort would do it this way:
  - $[(3, 1), (4, 2), (5, 7), (3, 7)]$  sort by y
  - $[(3, 1), (3, 7), (4, 2), (5, 7)]$  sort by x
  - Note that the relative order of (3, 1) and (3, 7) is maintained.
- Quick sort might leave them in the following state:
  - $[(3, 1), (4, 2), (5, 7), (3, 7)]$  sort by y
  - $[(3, 7), (3, 1), (4, 2), (5, 7)]$  sort by x
  - Note that the relative order of (3, 1) and (3, 7) has reversed.