

<b>CS 4/56101</b>	<b>Kent State University</b> Dept. of Math & Computer Science <u>LECT-7</u>
<b>Design and Analysis of Algorithms</b>	

# Divide & Conquer Sort

## Divide and Conquer



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```
void Sort(List *list)
{
    if (list has length >= 1)
    {
        Partition list into lowlist, highlist;
        Sort(lowlist);
        Sort(highlist);
        Combine(lowlist, highlist);
    }
}
```

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## Merge Sort Example



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### Mergesort:

We chop the list into two sublists of sizes as nearly equal as possible and then sort them separately. Afterward, we carefully merge the two sorted sublists into a single sorted list.

- Let's Sort:

26 33 35 29 19 12 22

**Note:** When we cannot divide into two equal list we will make the first one large.

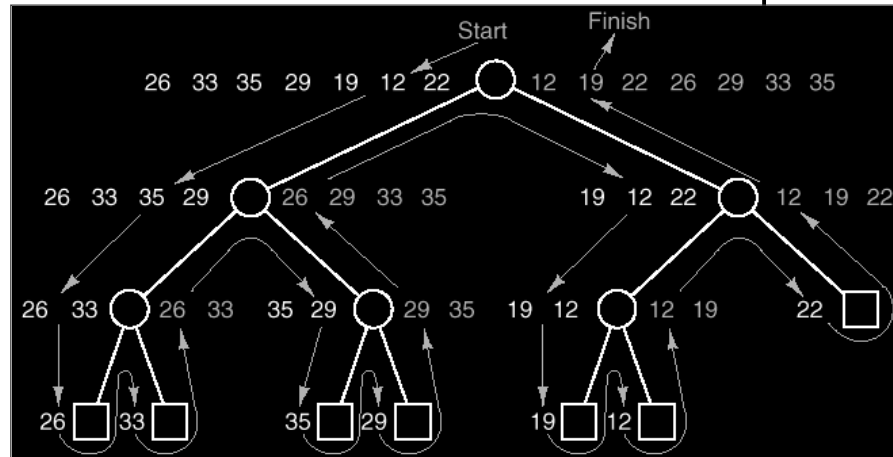
```
void Sort(List *list)
{
    if (list has length >= 1)
    {
        Partition list into lowlist, highlist;
        Sort(lowlist);
        Sort(highlist);
        Combine(lowlist, highlist);
    }
}
```

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ALG00S, javed@kent.edu  
Javed I. Khan@1999

## Recursion Tree of Merge Sort



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## Quick Sort Example

### Quicksort:

We first choose some key from the list for which, we hope, about half the keys will come before and half after. Call this key the *pivot*. Then we partition the items so that all those with keys less than the pivot come in one sublist, and all those with greater keys come in another. Then we sort the two reduced lists separately, put the sublists together, and the whole list will be in order.

- Let's Sort:

26 33 35 29 19 12 22

Note: Let us pick the first element on the list as the pivot.



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```
void Sort(List *list)
{
    if (list has length >= 1)
    {
        Partition list into lowlist, highlist;
        Sort(lowlist);
        Sort(highlist);
        Combine(lowlist, highlist);
    }
}
```

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## Execution Trace of Quick Sort

Sort (26, 33, 35, 29, 12, 22)

Partition into (19, 12, 22) and (33, 35, 29); pivot = 26  
Sort (19, 12, 22)

Partition into (12) and (22); pivot = 19  
Sort (12)  
Sort (22)  
Combine into (12, 19, 22)

Sort (33, 35, 29)

Partition into (29) and (35); pivot = 33  
Sort (29)  
Sort (35)  
Combine into (29, 33, 35)

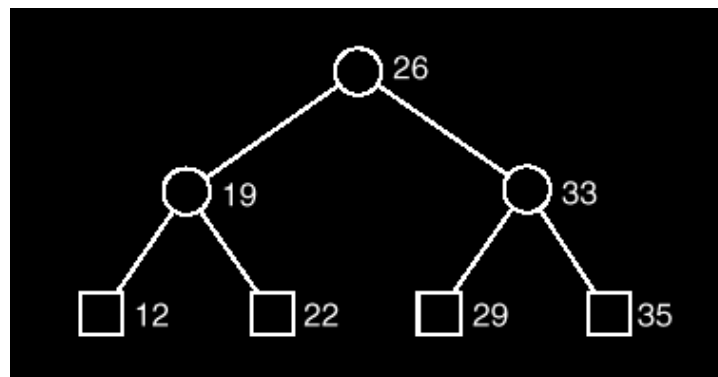
Combine into (12, 19, 22, 26, 29, 33, 35)



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## Recursion Tree of Quick Sort



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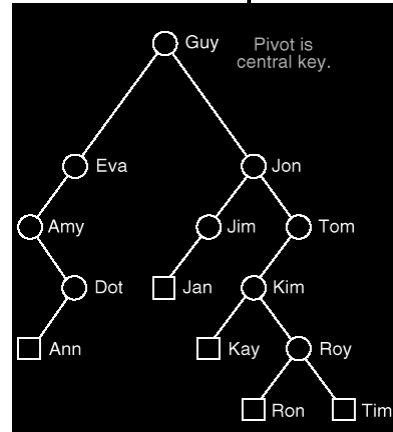
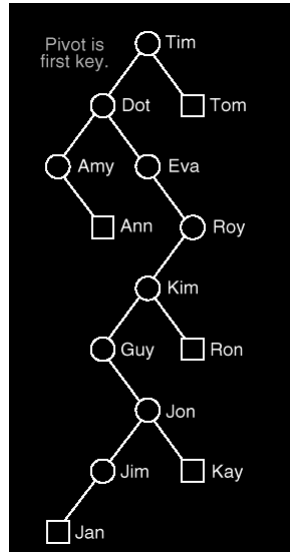
## Another Example with QS



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Unsorted

Tim  
Dot  
Eva  
Roy  
Tom  
Kim  
Guy  
Amy  
Jon  
Ann  
Jim  
Kay  
Ron  
Jan



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## Main for Merge Sort



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```
void MergeSort(List *list)
{
    List secondhalf; /* holds the second half of the list after
division */

    if (ListSize(list) > 1) { /* Is there a need to sort? */
        Divide(list, &secondhalf); /* Divide the list in half. */
        MergeSort(list); /* Sort the first half. */
        MergeSort(&secondhalf); /* Sort the second half. */
        Merge(list, &secondhalf, list); /* Merge the two sorted
sublists. */
    }
}
```

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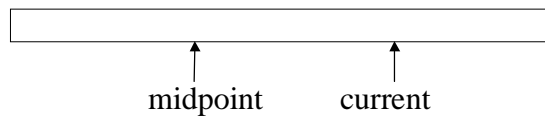
## Divide (Linked List)

```

void Divide(List *list, List *secondhalf)
{
    ListNode *current, *midpoint;

    if ((midpoint = list->head) == NULL)
        secondhalf->head = NULL;
    else {
        for (current = midpoint->next; current; ) {
            current = current->next;
            if (current) {
                midpoint = midpoint->next;
                current = current->next;
            }
        }
        secondhalf->head = midpoint->next;
        midpoint->next = NULL;
    }
}

```

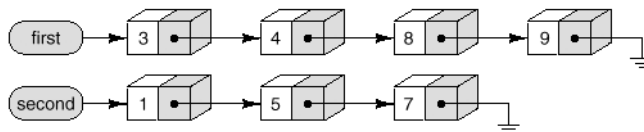


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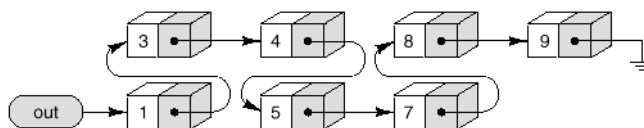
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## Merging Two Sorted List

Initial situation:



After merging:



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## Code for Merge (Linked List)

```
void Merge(List *first, List *second, List *out)
{
    ListNode *p1, *p2; /* pointers to traverse first and second lists */
    ListNode *lastsorted; /* always points to last node of sorted list */

    if (!first->head)
        *out = *second;
    else if (!second->head)
        *out = *first;
    else {
        p1 = first->head; /* First find the head of the merged list. */
        p2 = second->head;
        if (LE(p1->entry.key, p2->entry.key)) {
            *out = *first;
            p1 = p1->next;
        } else {
            *out = *second;
            p2 = p2->next;
        }
        lastsorted = out->head; /* lastsorted gives last entry of merged list. */
        while (p1 && p2)
            if (LE(p1->entry.key, p2->entry.key)) {
                lastsorted->next = p1;
                lastsorted = p1;
                p1 = p1->next;
            } else {
                lastsorted->next = p2;
                lastsorted = p2;
                p2 = p2->next;
            }
        if (p1) /* Attach the remaining list. */
            lastsorted->next = p1;
        else
            lastsorted->next = p2;
    }
}
```



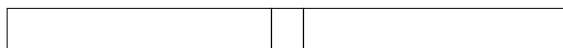
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## Quick Sort for Contiguous List

```
void RecQuickSort(List *list, Position low, Position
high)
{
    Position pivotpos; /* position of the pivot
after partitioning */

    if (low < high) {
        pivotpos = Partition(list, low, high);
        RecQuickSort(list, low, pivotpos - 1);
        RecQuickSort(list, pivotpos + 1, high);
    }
}
```



pivotpos

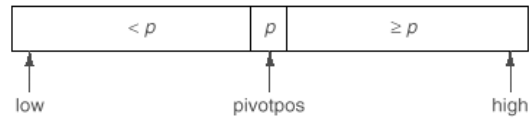


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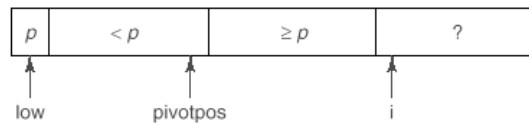
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# Partitioning in Quick Sort

Goal (postcondition):



Loop invariant:

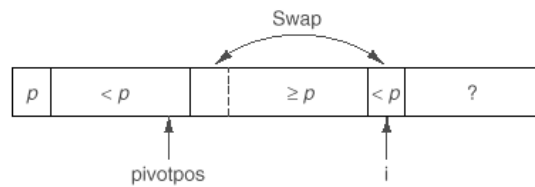


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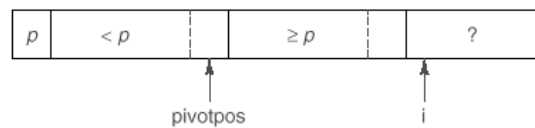
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# Partitioning in Quick Sort

Restore the invariant:

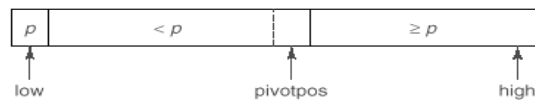


If entry is  
smaller than  
pivot



If entry is  
larger or  
equal to the  
pivot

Final position:



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## Partition (code)

```
Position Partition(List *list, Position low, Position high)
{
    ListEntry pivot;
    Position i, lastsmall, pivotpos;

    Swap(low, (low + high) / 2, list);
    pivot= list->entry[low];
    pivotpos = low;
    for (i = low + 1; i <= high; i++)
        if (LT(list->entry[i].key, pivot.key)) {
            Swap(++pivotpos, i, list);
            lastsmall++;
        } /* Move large entry to right and small to left. */
    Swap(low, pivotpos, list);
    return pivotpos;
}
```



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# Analysis of Quick & Merge Sort

## Need Volunteer!

- To keep various performances of various algorithms.
- Insertion Sort: Worst Case assignments?
- Selection Sort: Worst case comparisons?



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	<i>Selection</i>	<i>Insertion (average)</i>
<i>Assignments of entries</i>	$3.0n + O(1)$	$0.25n^2 + O(n)$
<i>Comparisons of keys</i>	$0.5n^2 + O(n)$	$0.25n^2 + O(n)$

**Worst case of Selection Sort is twice as bad than average case.**

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## Few Results!

$$S_n = 1 + 2 + 3 + \dots + n = \frac{n(n+1)}{2}$$

$$1^2 + 2^2 + 3^2 + \dots + n^2 = \frac{n(n+1)(2n+1)}{6}$$

$$1 + a^1 + a^2 + \dots + a^m = \frac{a^{m+1} - 1}{(a - 1)}$$

$$\log_b x = \log_a x \cdot \log_b a$$

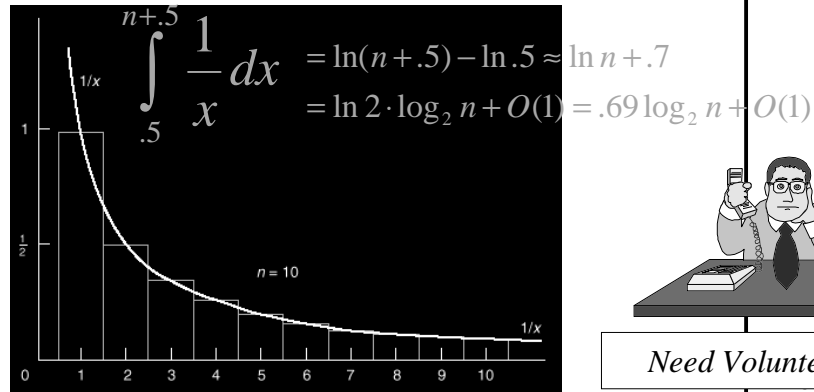


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## Harmonic Numbers

$$H_n = \frac{1}{n} + \frac{1}{n-1} + \dots + \frac{1}{3} + \frac{1}{2} + 1$$



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## Analysis of Merge Sort

- Merging two lists of size  $k$  requires at most  $(k-1)$  comparisons. There are:

$$\begin{aligned} & (n-1) + 2 \cdot \left(\frac{n}{2} - 1\right) + 4 \cdot \left(\frac{n}{4} - 1\right) + \dots + n \cdot \left(\frac{n}{n} - 1\right) \\ &= n + n + \dots + n - (2^0 + 2^1 + 2^2 + 2^3 + \dots + 2^{\log n - 1}) \\ &= n \log n - 1 \frac{(2^{\log n} - 1)}{(2 - 1)} \\ &= n \log n - (n - 1) = n \log n - n + 1 \end{aligned}$$

- Note this is worst case at exact count!
- Exercise E2 outlines a method which shows average case is:

$$= n \log n - 1.1583n + 1$$



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## Merge Sort: the ultimate sorting method?

- Average Performance:

$$= n \log n - 1.1583n + 1$$

- The lowest bound of any comp. sorting algorithm we have derived:

$$\log n! \approx n \cdot \log n - 1.44n + O(\log n)$$

- It is indeed, for linked list in random initial order, it is difficult to surpass.



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**QUIZ: Can we  
improve finding  
the middle?**

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## Merge Sort: the ultimate sorting method?

- Unfortunately Merge Sort for contiguous is not an unqualified success.
- The difficulty is merging in-place. It
  - Requires extra  $O(n)$  space.
  - One algorithm has been found that use a no extra space, but requires  $O(n^2)$  time.
  - Yet another algorithms been found that little extra space and requires  $O(n)$  time, but is very complex.
- solutions requires:
  - more space
  - or more time
  - or more programming effort.



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## Worst Case Analysis of Quick Sort

- Count of Comparisons and Swaps

$$c(n) = n - 1 + c(r) + c(n - r - 1)$$

- Comparison and Swap counts will be different.
- Comparison Count: Worst Case:

$$c(1) = 0$$

$$c(2) = 1 + c(1) = 1$$

$$c(3) = 2 + c(2) = 2 + 1$$

$$c(4) = 3 + c(3) = 3 + 2 + 1$$

$$c(n) = n - 1 + c(n - 1) = ?$$

$$= \frac{n(n-1)}{2} = .5n^2 - .5n$$



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$$= 0.5n^2 - 0.5n$$



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## WC Analysis of Quick Sort (cont..)

- Swap Count: Worst Case:
  - partition function performs one swap inside the loop when the key is smaller than the pivot.
  - It performs two swaps outside the loop
  - In worst case it will perform  $(n-1)+2=n+1$  swaps.

$$S(n) = n + 1 + S(n - 1)$$

- The partition function is called only when  $n > 1$ , and  $S(2) = 3$

$$S(n) = (n + 1) + n + (n - 1) + \dots + 3$$

$$= \text{????}$$

$$= .5n^2 + 1.5n - 1$$

- Number of assignments are three times the number of swaps!



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$$= 1.5n^2 + 4.5n - 3$$



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## Average case Analysis of Quick Sort

- Counting Swaps:
  - The pivot selection will partition the list into two parts. The partition can be anywhere between  $p=1$  to  $n$  in the list. For  $n>1$ :

$$S(n, p) = (p+1) + S_{avg}(p-1) + S_{avg}(n-p)$$

- To determine the average case we will allow all possibilities of  $p=1$  to  $n$  and take an average over the sum of all:

$$S_{avg}(n) = \frac{1}{n} \sum_{p=1}^n S(n, p)$$

$$S_{avg}(n) = \frac{n}{2} + \frac{3}{2} + \frac{2}{n} [S(0) + S(1) + \dots + S(n-1)]$$

An equation of this form is called a **recurrence relation** because it expresses the answer to a problem in terms of earlier, smaller cases of the same problem.



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## Solving Recurrence

$$S_a(n) = \frac{n}{2} + \frac{3}{2} + \frac{2}{n} [S_a(0) + S_a(1) + \dots + S_a(n-1)]$$

- From the recurrence we can write:

$$S_a(n-1) = \frac{n-1}{2} + \frac{3}{2} + \frac{2}{n-1} [S_a(0) + S_a(1) + \dots + S_a(n-2)]$$

- with multiplying  $n$  and  $n-1$  respectively and subtracting:

$$n.S_a(n) - (n-1).S_a(n-1) = n+1 + 2S_a(n-1)$$

$$\frac{S_a(n)}{n+1} = \frac{1}{n} + \frac{S(n-1)}{n}$$

$$\frac{S_a(n)}{n+1} = \frac{1}{n} + \frac{1}{n-1} + \dots + \frac{1}{3} + \frac{S(2)}{3} = ???$$



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## Solving Recurrence (contd..)

$$S_a(n) = \frac{n}{2} + \frac{3}{2} + \frac{2}{n} [S_a(0) + S_a(1) + \dots + S_a(n-1)]$$

- From the recurrence we can write:

$$S_a(n-1) = \frac{n-1}{2} + \frac{3}{2} + \frac{2}{n-1} [S_a(0) + S_a(1) + \dots + S_a(n-2)]$$

- with multiplying n and n-1 respectively and subtracting:

$$n.S_a(n) - (n-1).S_a(n-1) = n+1 + 2S_a(n-1)$$

$$\frac{S_a(n)}{n+1} = \frac{1}{n} + \frac{S(n-1)}{n}$$

$$\frac{S_a(n)}{n+1} = \frac{1}{n} + \frac{1}{n-1} + \dots + \frac{1}{3} + \frac{S(2)}{3} = \ln n + O(1)$$

$$S_a(n) \approx .69(n \log n) + O(n)$$

- Each swap needs at least 3 assignments



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**$= 2n \log n + O(n)$**



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## Average case Analysis of Quick Sort

- Counting Comparisons:
  - The partition of a list will make exactly n-1 comparisons:

$$C(n, p) = (n-1) + C_{avg}(p-1) + C_{avg}(n-p)$$

- Solution can be derived in the exactly same way!

- I have not decided, whether I will make it a part of midterm or a future quiz, but I will advise you to try it out for every step tonight! And the final step will look this:

$$C_{avg}(n) = 2n \ln n + O(n) \approx 1.39n \log n + O(n)$$



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## Comparisons with Insertion and Selection sort

- What was the weak point of insertion sort?
  - too much swapping or too much comparisons
- What was the weak point of selection sort?
  - too much swapping or too much comparisons



*Worst Case Volunteers Wakeup!*



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## Worst Case Comparisons

- Quick sort is three times worse in Swaps than Insertion sort!
- Quick sort is three times worse in number of comparisons than Selection sort!
- Hence in the worst case the so-called Quick sort is a disaster! Its name is nothing less than false advertising!
- Then why we have not scrapped Quick sort yet?



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## Average Case Comparisons



*Average Case Volunteers Wakeup!*

- The average case for quick sort on contiguous list is one of the most efficient among the known algorithms.
- It requires just 39% more comparisons than mergesort (or best possible case).
- It requires about 100% more assignments than mergesort (in good architecture only 39% more).
  - Considering a  $2n$  space contiguous implementation of the merging algorithm for merge sort.



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**QUIZ: How can we ensure that a sorting problem always appears as an average case to a quick sort?**

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