



Algorithm MergeSort

- Professor John von Neumann (**1945!**): a recursive divide-and-conquer approach
- **Three basic steps:**
 - If the number of items is 0 or 1, return
 - Otherwise, partition the array into two halves and recursively sort the first and the second halves separately
 - Finally, merge the two sorted halves into a sorted array
- Linear time merging $O(n)$ yields MergeSort time complexity $O(n \log n)$

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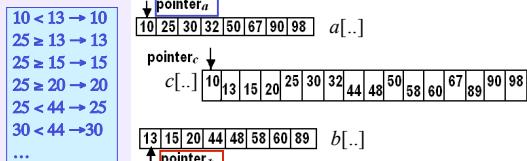
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$O(n)$ Merge of Sorted Arrays

```
if a[pointera] < b[pointerb] then c[pointerc] ← a[pointera];
pointera ← pointera + 1; pointerc ← pointerc + 1
else c[pointerc] ← b[pointerb];
pointerb ← pointerb + 1; pointerc ← pointerc + 1
```



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Structure of MergeSort

```
begin MergeSort (an integer array a[] of size n)
1. Allocate a temporary array* tmp[] of size n
2. RecursiveMergeSort( a, tmp, 0, n - 1 )
end MergeSort
```

* To merge each successive pair of the ordered subarrays $a[\text{left}], \dots, a[\text{centre}]$ and $a[\text{centre}+1], \dots, a[\text{right}]$ and copy the merged array back to $a[\text{left}], \dots, a[\text{right}]$

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Recursive MergeSort

```
begin RecursiveMergeSort (an integer array a[] of size n);
   a temporary array tmp of size n; range: left, right )
• if left < right then
•   centre ← ⌊(left + right)/2⌋
•   RecursiveMergeSort( a, tmp, left, centre );
•   RecursiveMergeSort( a, tmp, centre + 1, right );
•   Merge( a, tmp, left, centre + 1, right );
• end if
end RecursiveMergeSort
```

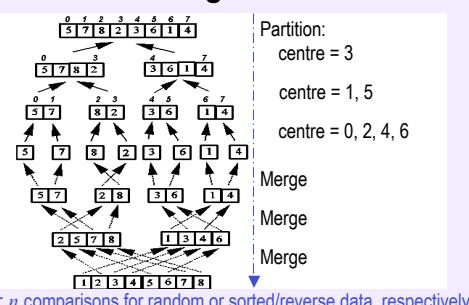
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How MergeSort works



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Analysis of MergeSort

- + $O(n \log n)$ best-, average-, and worst-case complexity because the merging is always linear
- Extra $O(n)$ temporary array for merging data
- Extra copying to the temporary array and back
- Useful only for external sorting
- For internal sorting: **QuickSort** and **HeapSort** are much better

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Algorithm QuickSort

- Sir C.A.R. Hoare (1961): the divide-and-conquer approach
- Four basic steps:
 - If $n = 0$ or 1 , return
 - Otherwise, choose one of the items as a **pivot**
 - Partition the remaining items into two disjoint subarrays by placing the items greater than the pivot to its right and all the others to its left
 - Return the result of **QuickSort** of the left subarray, followed by the pivot, followed by the result of **QuickSort** of the right subarray

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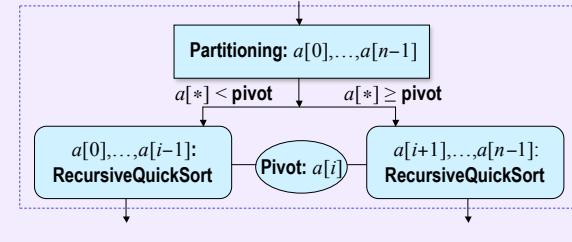
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Recursive QuickSort

$$\bullet \quad T(n) = c \cdot n \text{ (pivot positioning)} + T(i) + T(n - 1 - i)$$



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Analysis of QuickSort: the worst case $O(n^2)$

- If the pivot happens to be the largest (or smallest) item, then one subarray is always empty whereas the second subarray contains all the items except the pivot
- Time for partitioning an array: cn
- Running time for sorting: $T(n) = T(n - 1) + cn$
 - “Telescoping” (recall the basic recurrences):

$$T(n) = c \frac{n(n+1)}{2}$$

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Analysis of QuickSort: the average case $O(n \log n)$

- The left and right subarrays contain i and $n - 1 - i$ items, respectively; $i = 0, \dots, n - 1$
- Time for partitioning an array: cn
- Average running time for sorting:

$$T(n) = \frac{2}{n} (T(0) + \dots + T(n-2) + T(n-1)) + cn, \text{ or}$$

$$nT(n) = 2(T(0) + \dots + T(n-2) + T(n-1)) + cn^2$$

$$(n-1)T(n-1) = 2(T(0) + \dots + T(n-2)) + c(n-1)^2$$

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Analysis of QuickSort: the average case $O(n \log n)$

$$nT(n) - (n-1)T(n-1) \rightarrow nT(n) = (n+1)T(n-1) + 2cn$$

"Telescoping": $\frac{T(n)}{n+1} \cong \frac{T(n-1)}{n} + \frac{2c}{n+1}$

Explicit form: $\frac{T(n)}{n+1} = \frac{T(0)}{1} + 2c\left(\frac{1}{2} + \frac{1}{3} + \frac{1}{4} + \dots + \frac{1}{n+1}\right)$
 $\approx 2cH_{n+1} \approx C \log n$

where $H_n = 1 + \frac{1}{2} + \frac{1}{3} + \dots + \frac{1}{n} \approx \ln n + 0.577$

is the n^{th} harmonic number

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Analysis of QuickSort: the choice of the pivot

- **Never use** the first $a[\text{low}]$ or the last $a[\text{high}]$ item!
- A reasonable choice → the middle item:

$$a[\text{middle}] = \left\lfloor \frac{\text{low} + \text{high}}{2} \right\rfloor$$

where $\lfloor z \rfloor$ is an integer “floor” of the real value z
- **Good choice** → the median of three:
 - median $\{a[\text{low}], a[\text{middle}], a[\text{high}]\}$
 - Example: median{45, 19, 75} → $[19 \leq 45 \leq 75] = 45$

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Pivot positioning in QuickSort: low=0 , middle=4, high=9

Data to be sorted										Description	
0	1	2	3	4	5	6	7	8	9	←Index	
25	8	2	91	70	50	20	31	15	65	Initial array a	
25	8	2	91	65	50	20	31	15	70	$i = \text{MedianOfThree}(a, \text{low}, \text{high})$; $p = a[i]$; $\text{swap}(i, a[\text{high}-1])$	
25	8	2	91	15	50	20	31	65	70	i j Condition	
25	8	2	91	15	50	20	31	65	70	$a[i] < p > a[j]$; $i++$	
							31			1 7	$a[i] < p > a[j]$; $i++$
							31			2 7	$a[i] < p > a[j]$; $i++$

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Pivot positioning in QuickSort: low=0 , middle=4, high=9

25	8	2	91	15	50	20	31	65	70	i	j	Condition
			91 31				31 91	65		3	7	$a[i] \geq p > a[j]$; swap; $i++$; $j--$
				15	20			65		4	6	$a[i] < p > a[j]$; $i++$
					50	20		65		5	6	$a[i] < p > a[j]$; $i++$
						20		65		6	6	$a[i] < p > a[j]$; $i++$
								65		7	6	$i > j$; break
25	8	2	31	15	50	20	65	91	70			$\text{swap}(a[i], p = a[\text{high}-1])$

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Data selection: QuickSelect

- Goal: find the k -th smallest item of an array a of size n
- If k is fixed (e.g., the median), then selection should be faster than sorting
- Linear average-case time $O(n)$ by a small change of QuickSort
- Basic Recursive QuickSelect: to find the k -th smallest item in a subarray:
 $(a[\text{low}], a[\text{low}+1], \dots, a[\text{high}])$
such that $0 \leq \text{low} \leq k-1 \leq \text{high} \leq n-1$

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Recursive QuickSelect

- If $\text{high} = \text{low} = k-1$: return $a[k-1]$; otherwise pick a median-of-three pivot and split the remaining items into two disjoint subarrays just as in QuickSort:
 $a[\text{low}], \dots, a[i-1] < a[i] = \text{pivot} \leq a[i+1], \dots, a[\text{high}]$
- Recursive calls:
 - $k \leq i$: **RecursiveQuickSelect**(a , low , $i-1$, k)
 - $k = i+1$: **return** $a[i]$
 - $k \geq i+2$: **RecursiveQuickSelect**(a , $i+1$, high , k)

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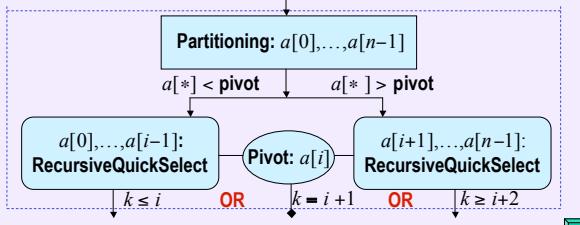
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Recursive QuickSelect

Average running time $T(n) = cn$ (partitioning of an array)
+ average time for selecting among i or $(n-1-i)$ items where i varies from 0 to $n-1$



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QuickSelect: low=0, high=n-1

- $T(n) = c \cdot n$ (splitting the array) + { $T(i)$ OR $T(n-1-i)$ }
- Average running time:

$$T(n) = \frac{1}{n} (T(0) + \dots + T(n-2) + T(n-1)) + cn$$
or
$$nT(n) = T(0) + \dots + T(n-2) + T(n-1) + cn^2$$

$$(n-1)T(n-1) = T(0) + \dots + T(n-2) + \dots + c(n-1)^2$$

$$nT(n) - (n-1)T(n-1) \rightarrow T(n) - T(n-1) \cong 2c$$
or $T(n)$ is $O(n)$

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