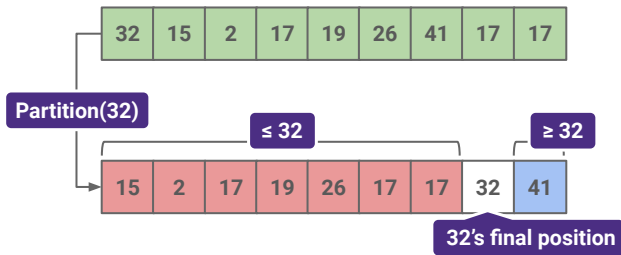


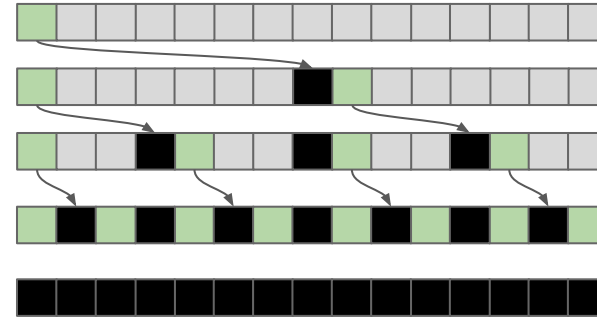
Naive Quicksort

Demo

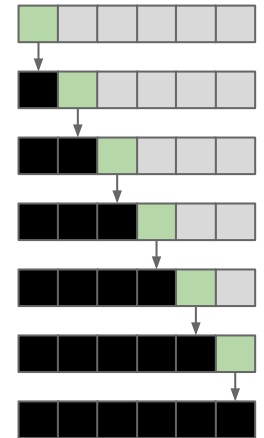
1. Partition around a **pivot item**, e.g. leftmost item.
2. Quicksort left side, all keys \leq pivot.
3. Quicksort right side, all keys \geq pivot.



3



Quicksort Case Analysis



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When poll is active, respond at [PollEv.com/kevinl](https://www.poll-ev.com/kevinl)

Give the tight asymptotic time complexity of naive quicksort assuming no duplicate keys.

$\Omega(N), O(N \log N)$

$\Omega(N), O(N^2)$

$\Omega(N \log N), O(N \log N)$

$\Omega(N \log N), O(N^2)$

$\Omega(N^2), O(N^2)$

Not sure

Start the presentation to see live content. Still no live content? Install the app or get help at [PollEv.com/app](https://www.poll-ev.com/app)

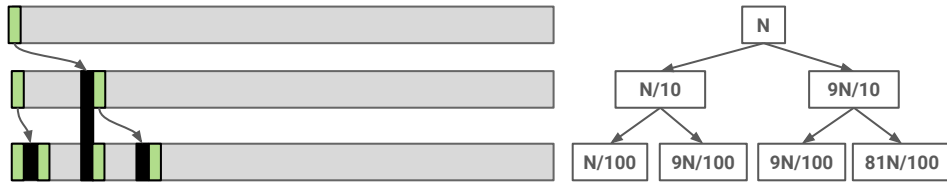
Total Result

Sort	Best-Case	Worst-Case	Space	Stable	Notes
Selection Sort	$\Theta(N^2)$	$\Theta(N^2)$	$\Theta(1)$	No	
Heapsort	$\Theta(N)$	$\Theta(N \log N)$	$\Theta(1)$	No	Slow in practice.
Merge Sort	$\Theta(N \log N)$	$\Theta(N \log N)$	$\Theta(N)$	Yes	Fastest stable sort.
Insertion Sort	$\Theta(N)$	$\Theta(N^2)$	$\Theta(1)$	Yes	Best for small or almost sorted inputs.
Naive Quicksort	$\Theta(N \log N)$	$\Theta(N^2)$	$\Theta(N)$	Yes	2x or more slower than merge sort.
Java Quicksort	$\Omega(N)$	$O(N^2)$?	No	Fastest comparison sort.

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Argument 1: 10% Case

Suppose the pivot is always at least 10% from either edge (not to scale).



Work at each level is in $O(N)$.

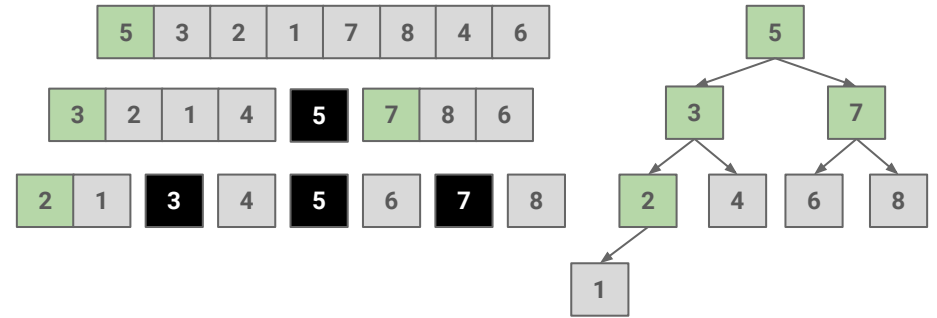
Height is about $\log_{10/9} N \in O(\log N)$.

Overall: $O(N \log N)$.

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Argument 2: Binary Search Tree Analogy

Random insertion into a binary search tree is expected to take $O(N \log N)$ time.



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Optimizing Quicksort

Naive Quicksort.

Recursive Depth. $\Omega(\log N)$, $O(N)$.

Pivot choice. Leftmost item. $\Theta(1)$

Common worst-case: **sorted array!**

Partitioning. Allocate a new array. $\Theta(N)$

Slow but stable.

Common worst-case: **all duplicates!**

Java Quicksort – 5x or more faster.

Recursive Depth. $\Omega(\log N)$, $O(N)$.

Pivot choice. Approximate median. $\Theta(1)$

Resilient to worst-case inputs.

Partitioning. Long-distance swaps. $\Theta(N)$

In-place, fast, but unstable.

3-way partition to handle duplicates.

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Median-Finding

Goal. Find the median item in $O(N)$ time.

Reduces to the **selection problem**.

Selection. Given an array of N items, find item of rank K .

For median, find $K = N / 2$.

How difficult is this problem?

- Why is the time complexity of selection in $\Omega(N)$?
- Describe an $O(N \log N)$ runtime algorithm for selection with any K .
- Describe an $O(N)$ runtime algorithm for selection with $K = 0, 1, 2$.

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If selection reduces to sorting, which of the following statements about problem difficulty is true?

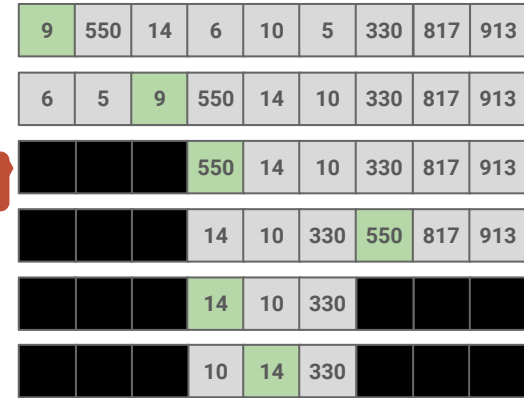
Selection \leq Sorting

Sorting \leq Selection

Selection $>$ Sorting

Sorting $>$ Selection

Not sure



Median can't be here

Quickselect: Partition-selection with leftmost item as pivot

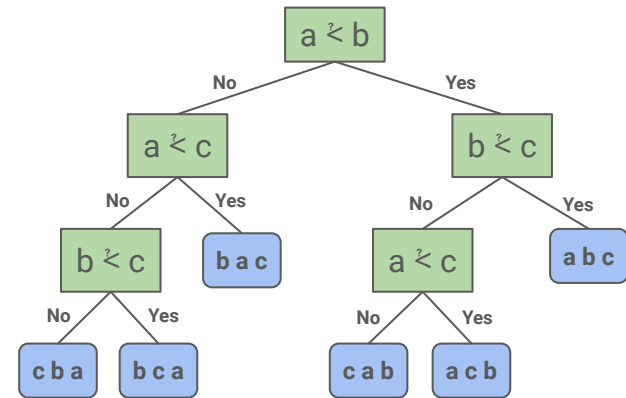
Approximate Median-Finding

Unfortunate reality: Quicksort with quickselect pivots is significantly slower than merge sort.

Goal. Find the **approximate median** item in $\Theta(1)$ time.

Median-of-3. Pick 3 items and take the median of the sample.

```
if (a < b)
  if (b < c) return b;
  else if (a < c) return c;
  else return a;
else
  if (a < c) return a;
  else if (b < c) return c;
  else return b;
```



Median-of-3 Decision Tree

Hoare Partitioning

Demo

Hoare partitioning. In-place, **unstable** partitioning algorithm. Initialize an int **L** and an int **G**.

- L.** Left pointer that loves small items < pivot.
- G.** Right pointer that loves big items > pivot.

Idea. Walk towards each other, swapping anything they don't like.

End result is that things on left are "small" and things on the right are "large".

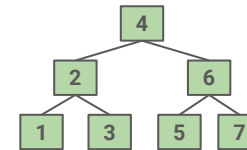
Hoare partitioning improves real-world runtime and space complexity.

Asymptotic time complexity still depends on pivot choice!

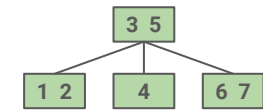
22

Dual-Pivot Quicksort: Data Structure Analogy

If classic quicksort is analogous to BSTs, then dual-pivot quicksort is analogous to 2-3 trees.



"Classic Quicksort"



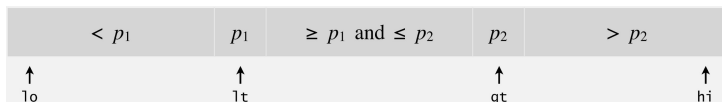
Dual-Pivot Quicksort

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Dual-Pivot Quicksort

Use **two partitioning keys** p_1 and p_2 and partition into three subarrays:

- Keys less than p_1 .
- Keys between p_1 and p_2 .
- Keys greater than p_2 .



Recursively quicksort the three subarrays (skip middle subarray if $p_1 = p_2$).

Now widely used. Java 8, Python unstable sort, Android, ...

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Algorithms (Robert Sedgwick, Kevin Wayne/Princeton)

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Java Quicksort	$\Theta(N)$	$\Theta(N^2)$	$O(\log N)$	No	Fastest comparison sort.

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