

# Dual Pivot Quicksort: Verification and Proof using KeY

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# Introduction

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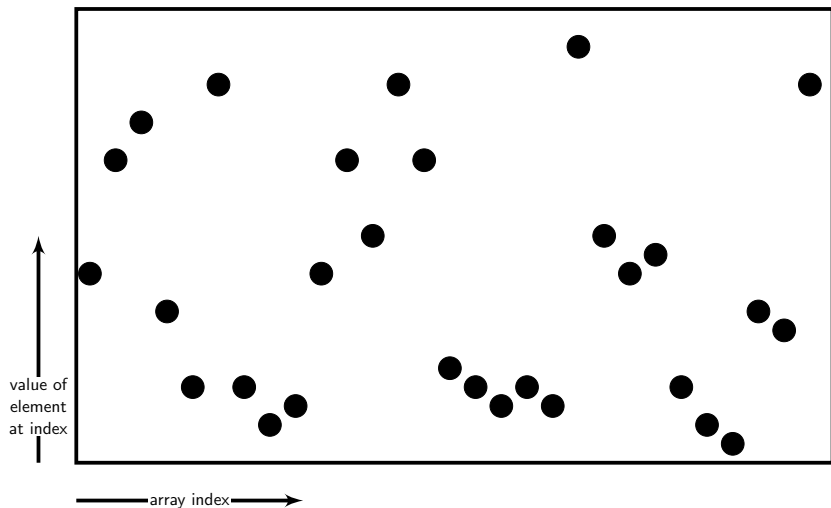
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- ▶ Widely used standard library algorithm
- ▶ Complex enough
- ▶ Simple enough

## Section 1

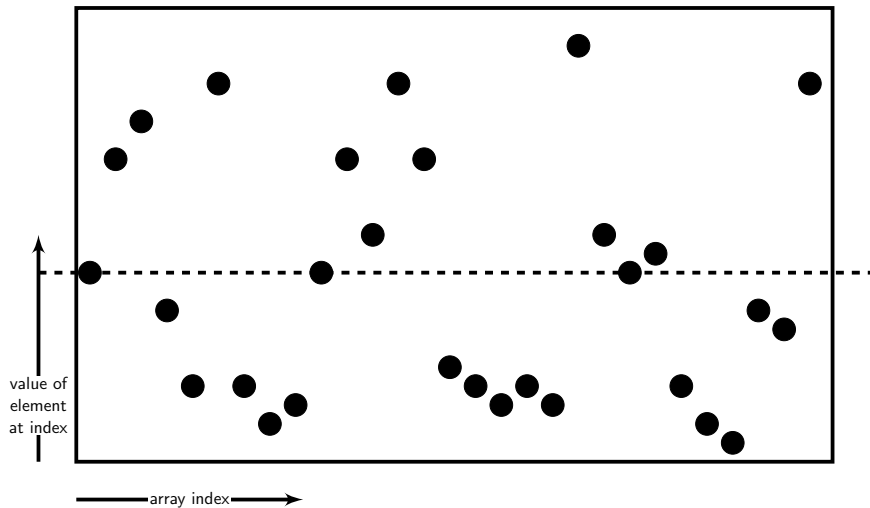
### Algorithm Description



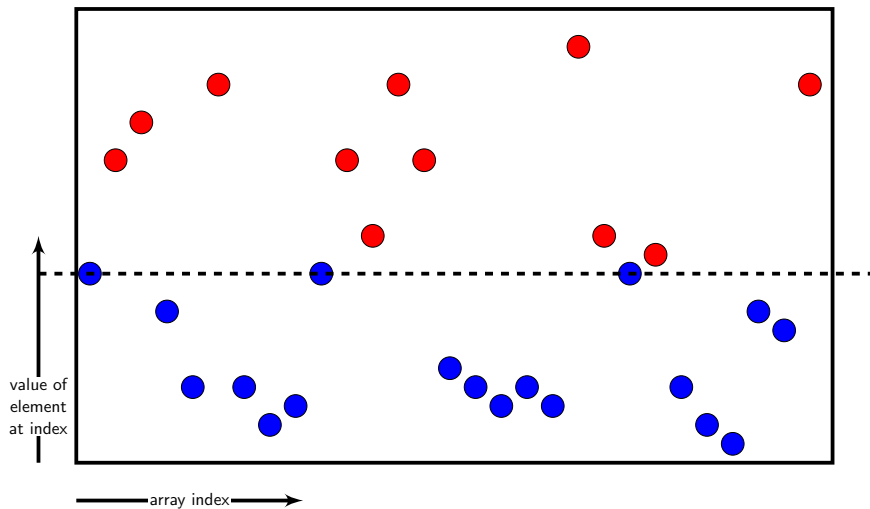
# Quicksort



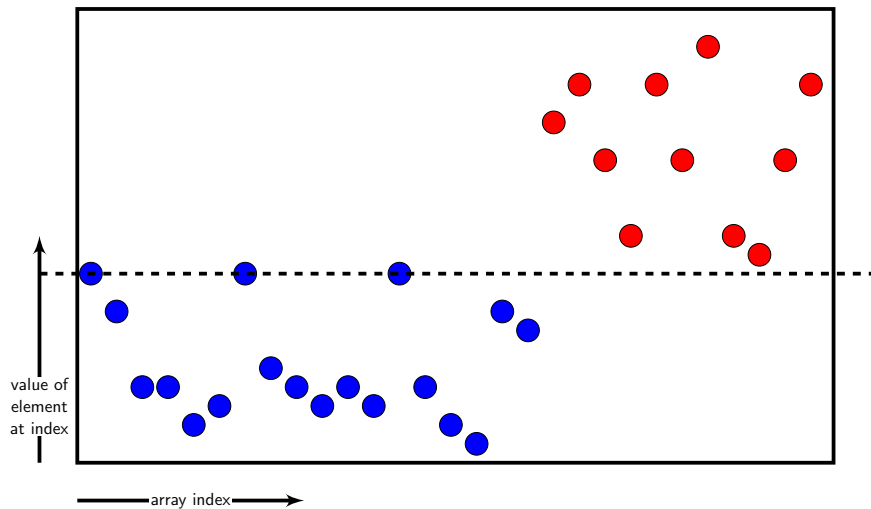
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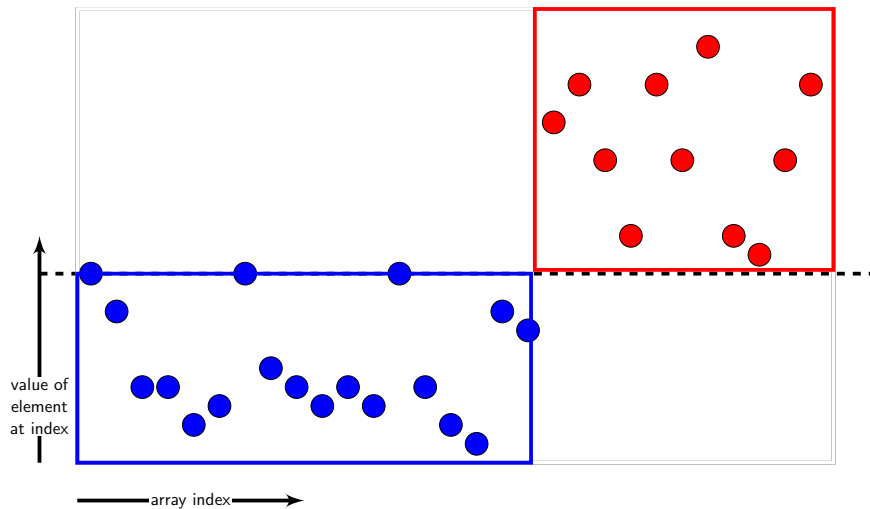
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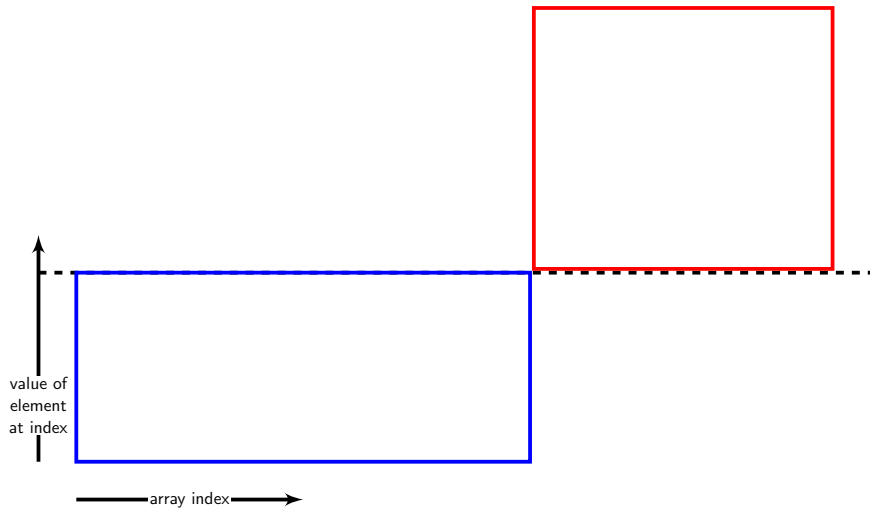
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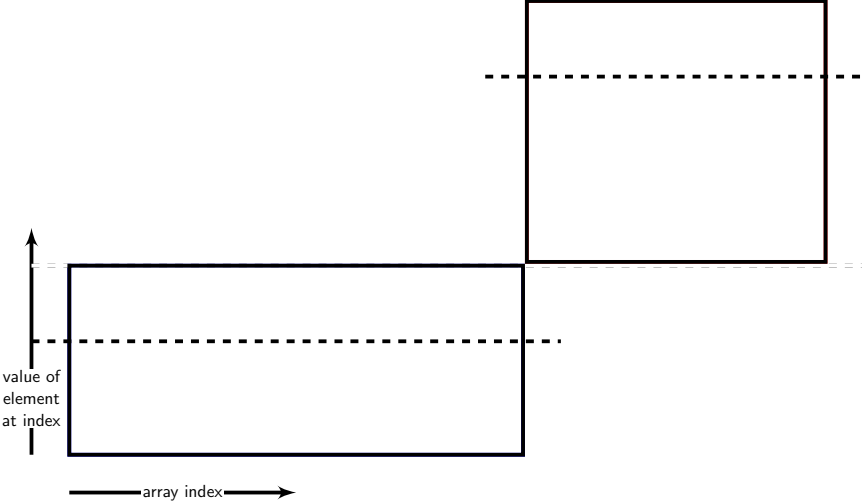
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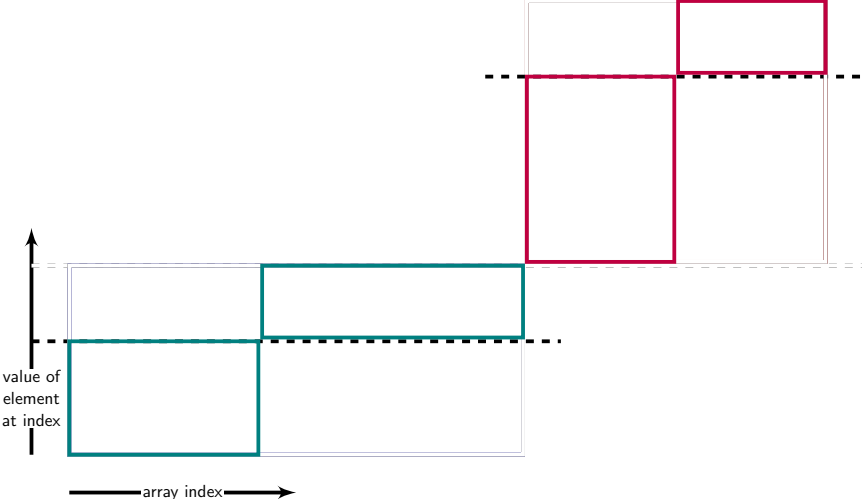
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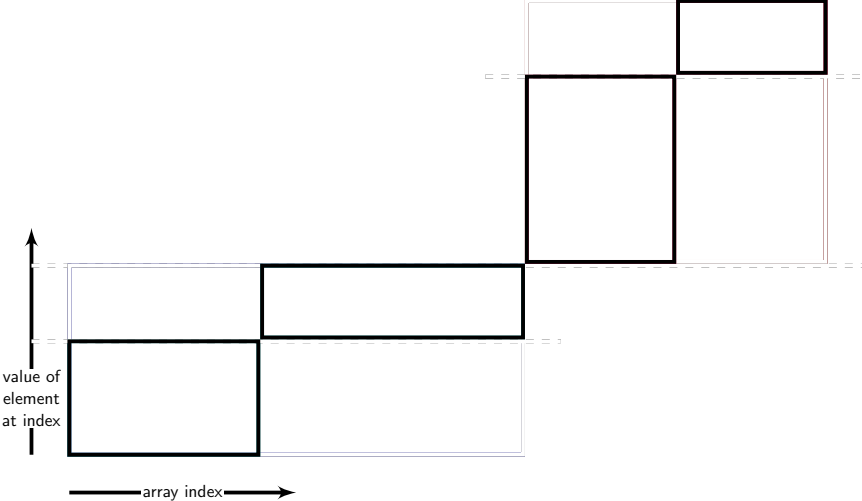


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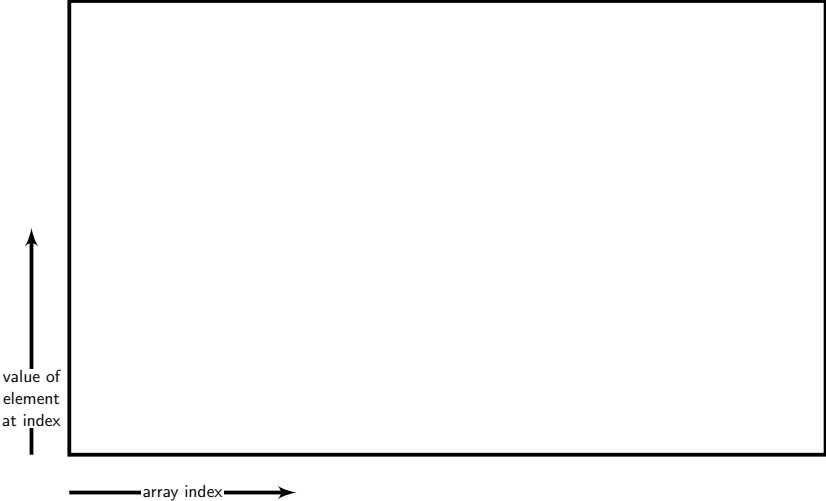




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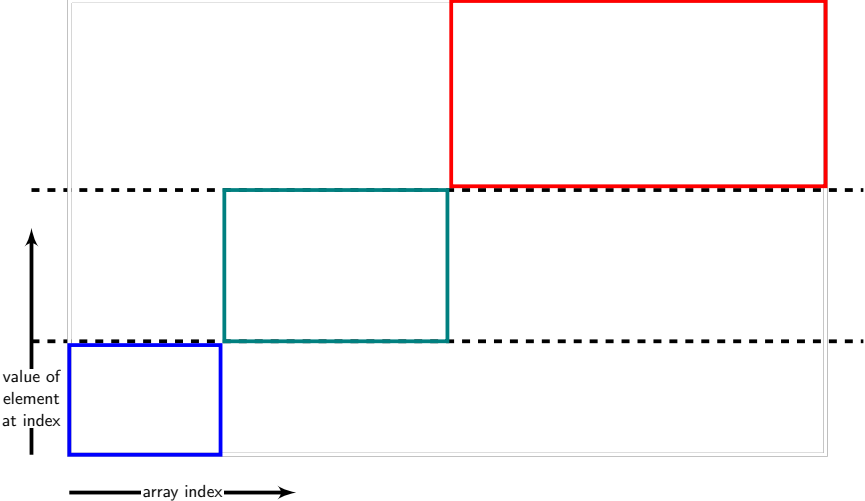
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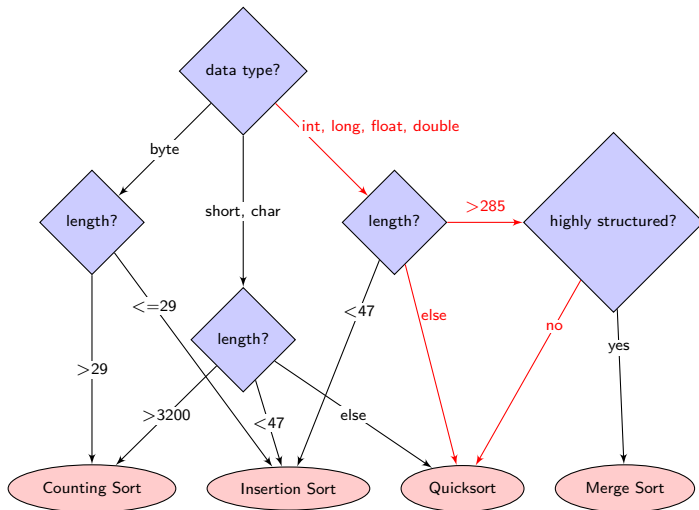
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- ▶ Theory: Average number of swaps reduced by 20% (Yaroslavskiy 2009)
- ▶ Practice: Multi-pivot Quicksorts are more cache-efficient (Kushagra 2014)
- ▶ Benchmarking shows it is faster



# Java Implementation – Choosing a Sorting Algorithm

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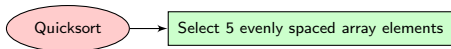


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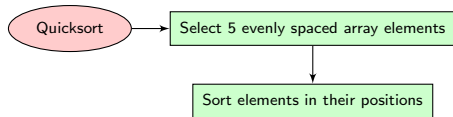


Quicksort

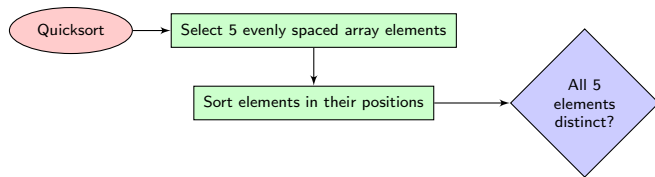
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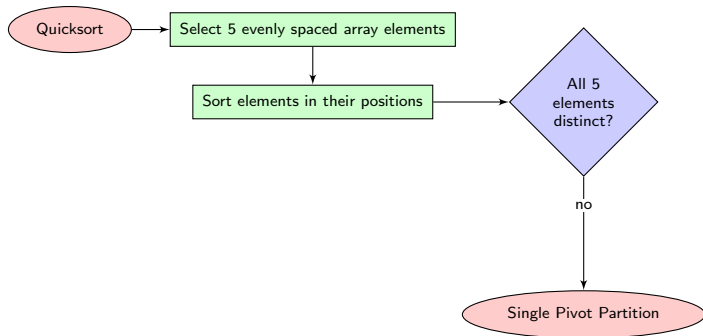
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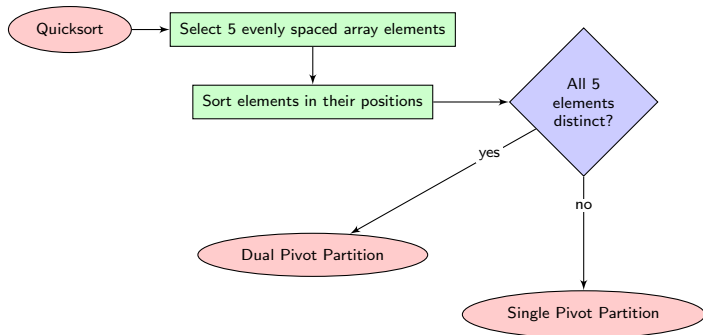
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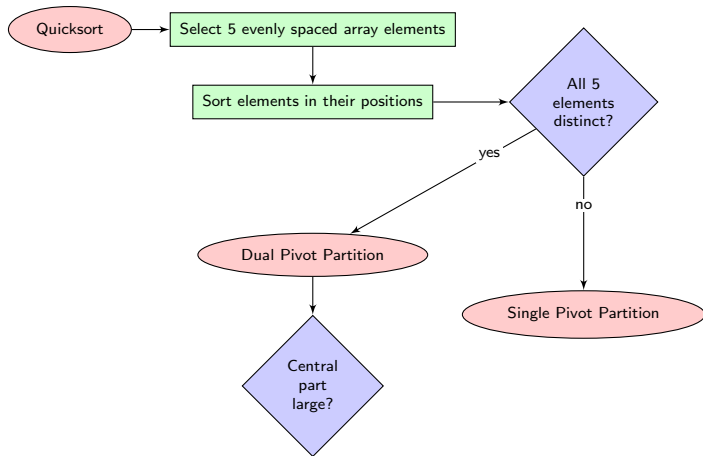


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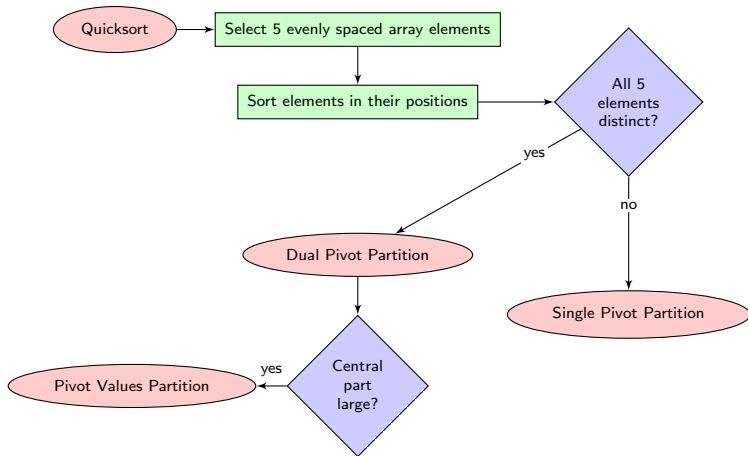




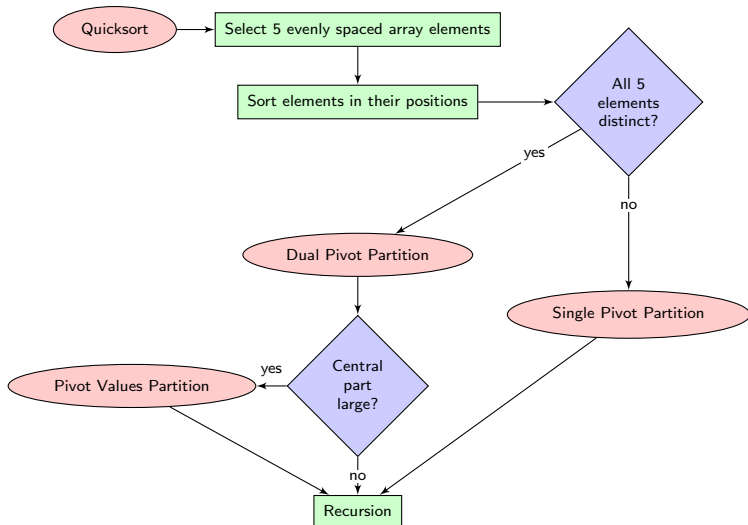
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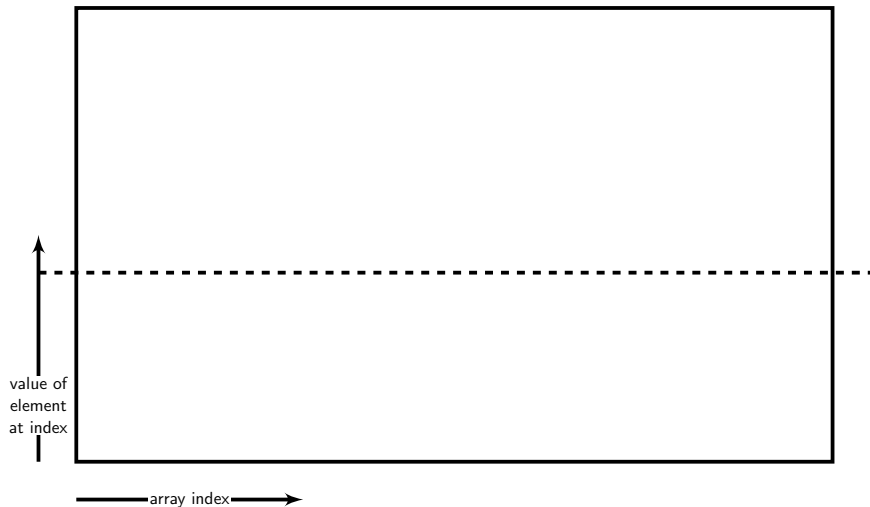
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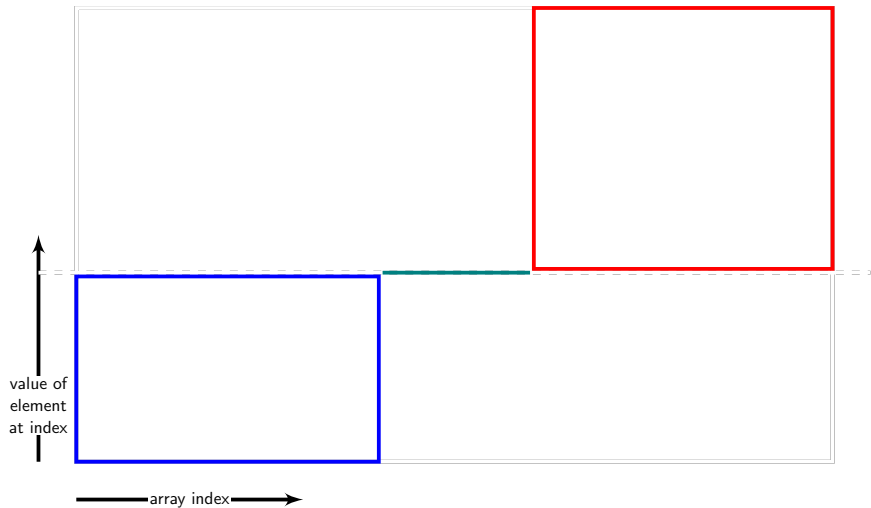
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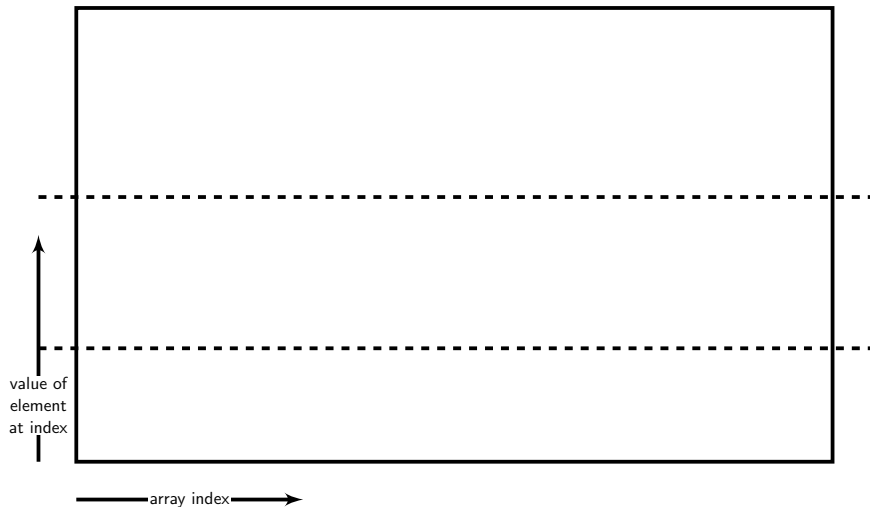
## Java Implementation – Single Pivot Partition



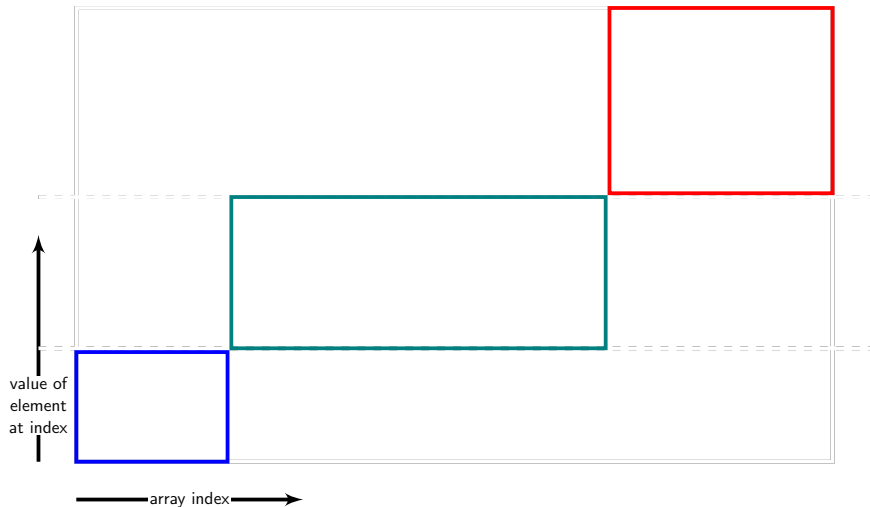
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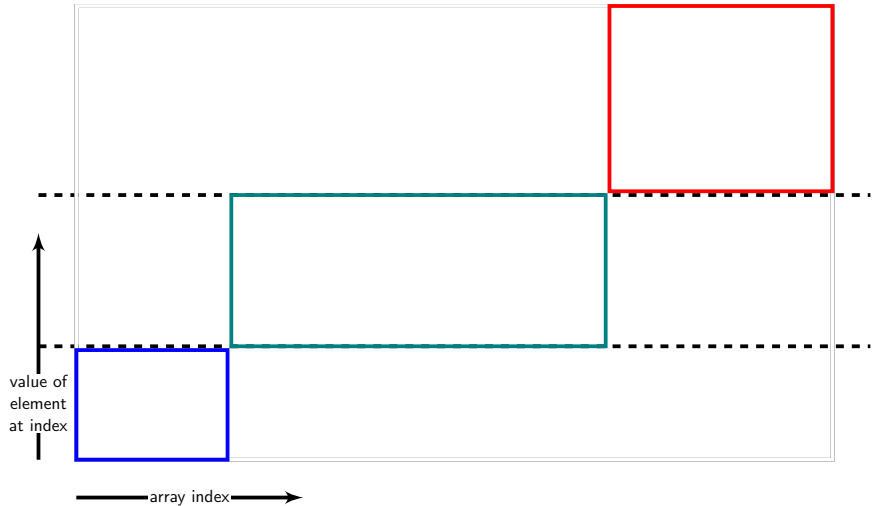
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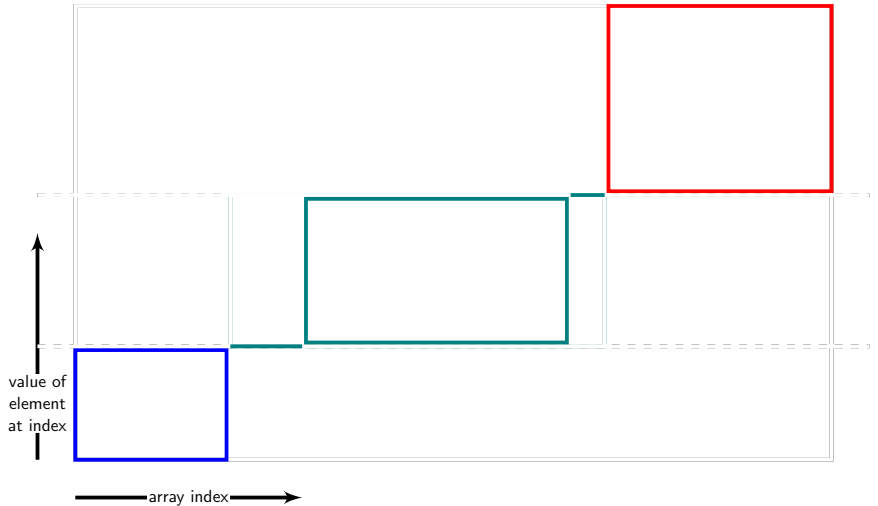


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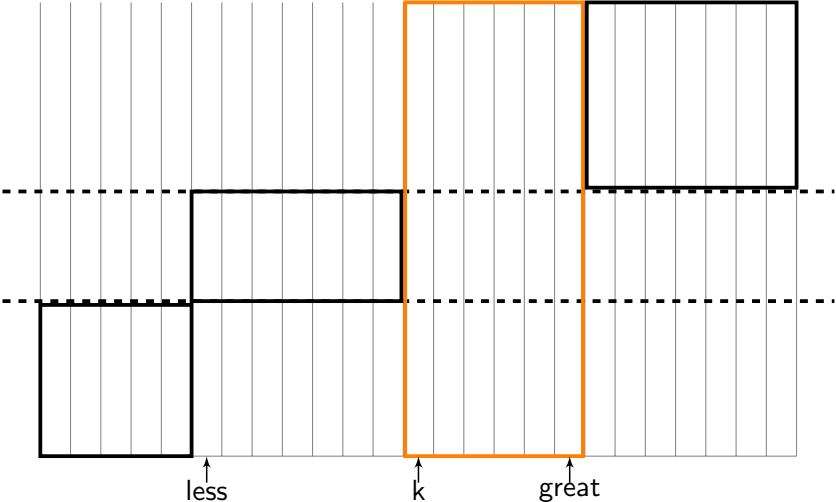




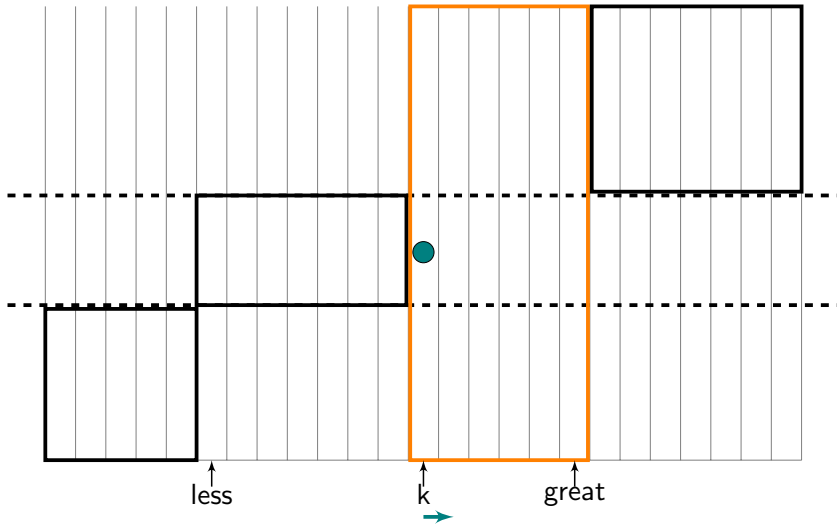
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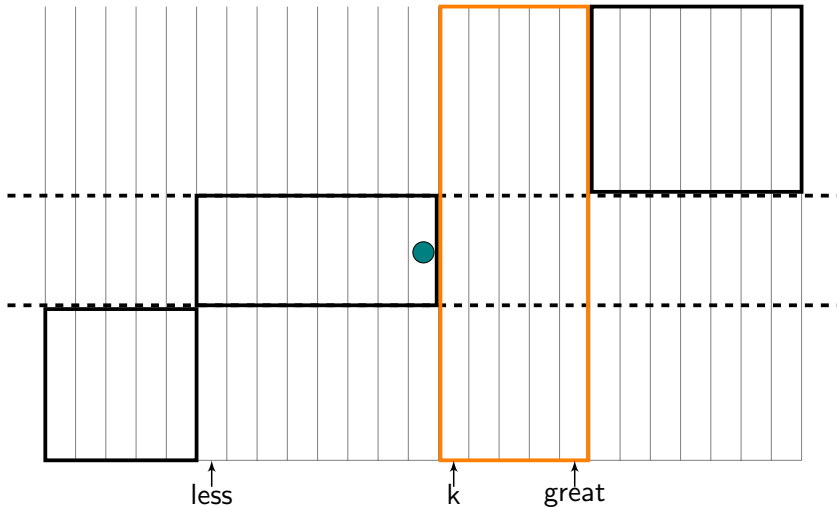
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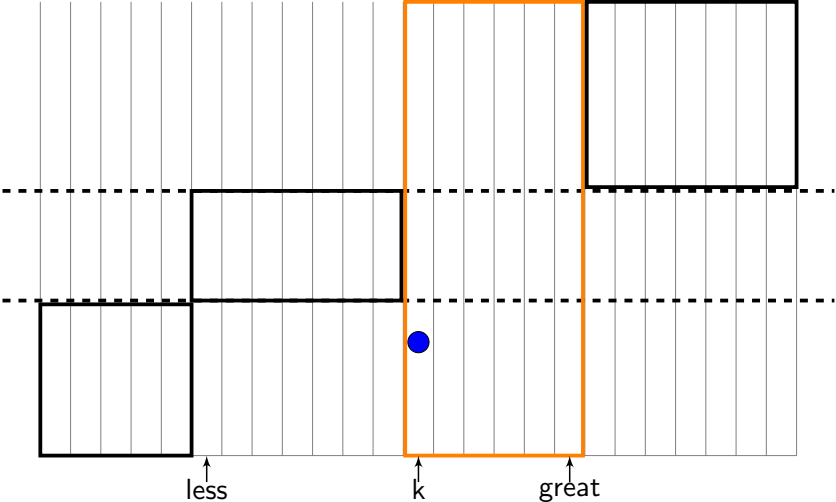
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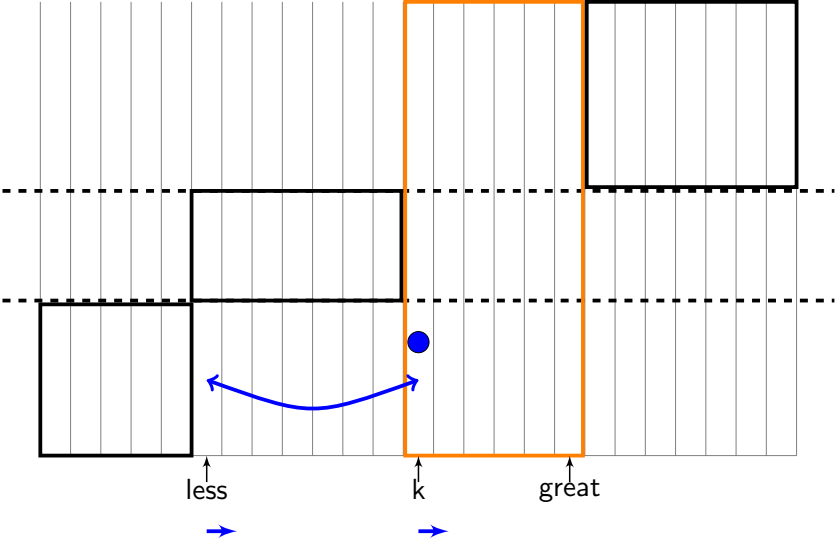
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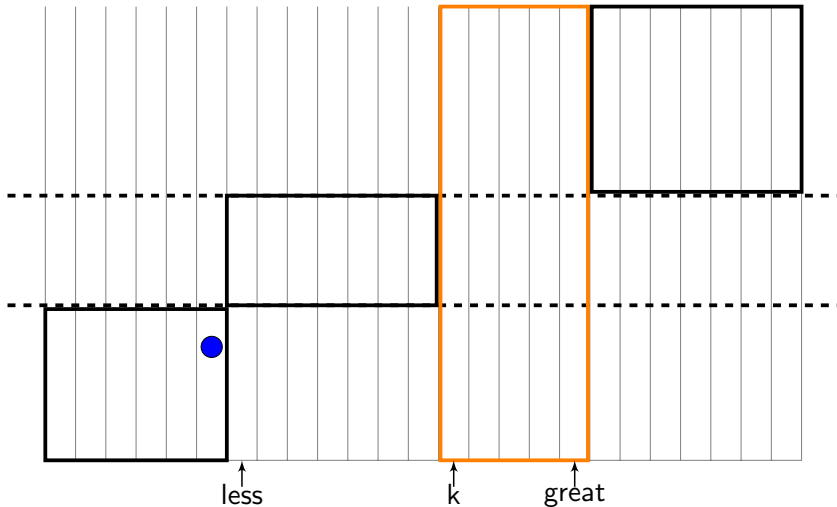
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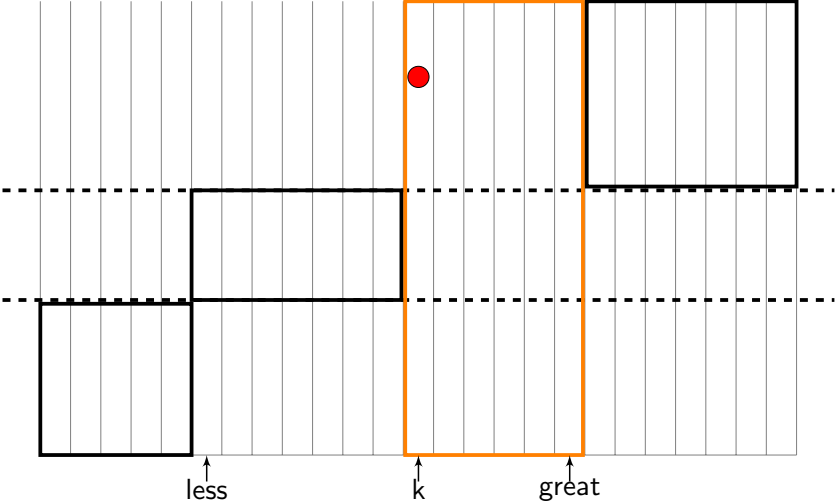
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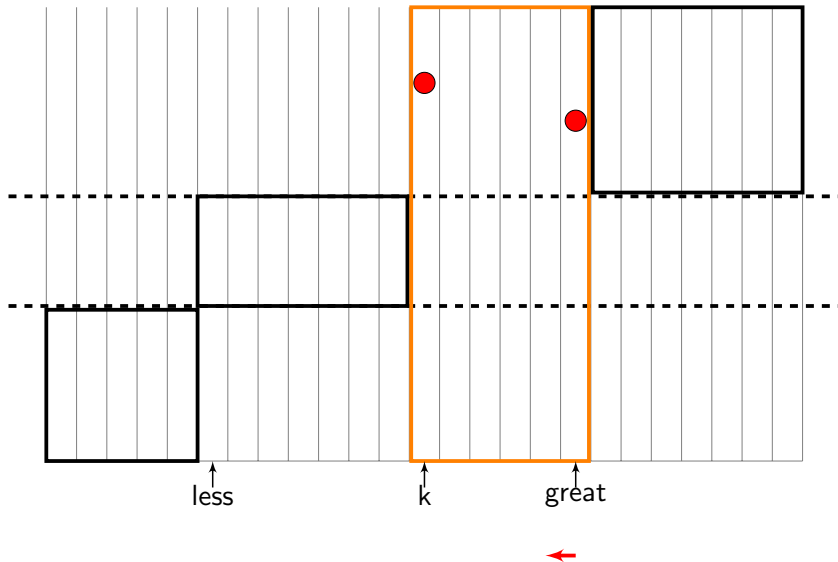


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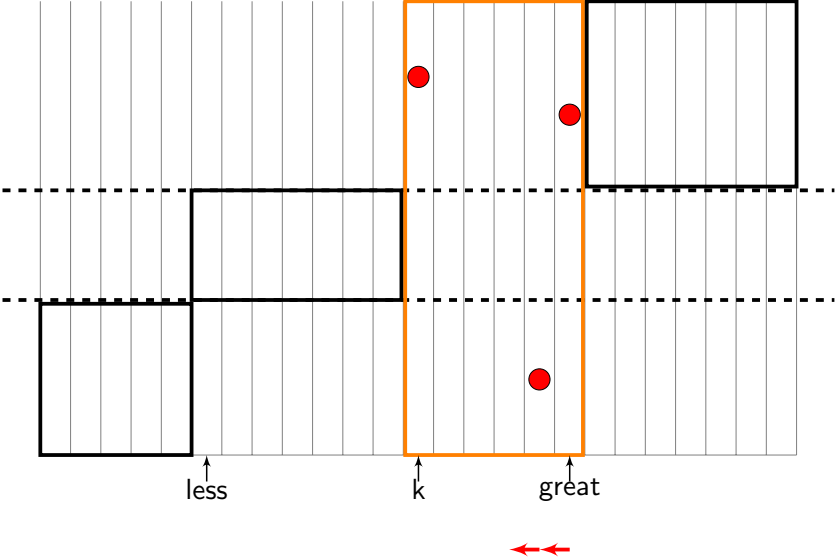




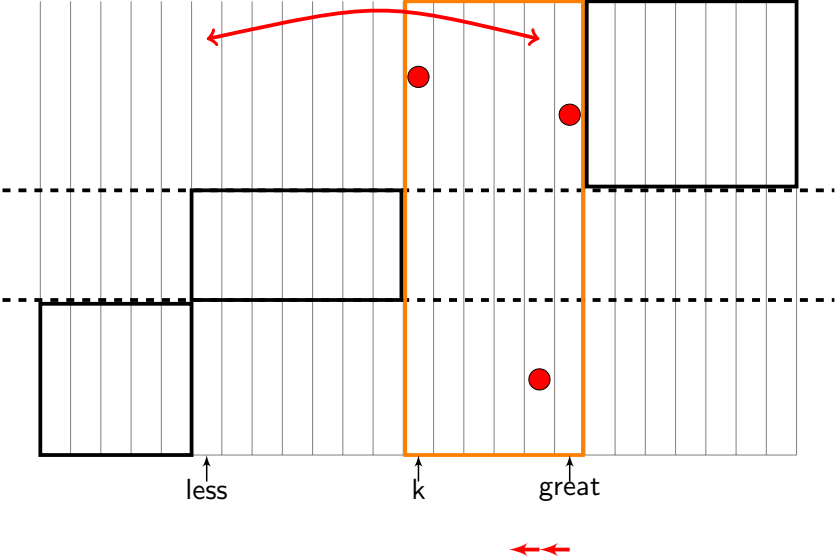
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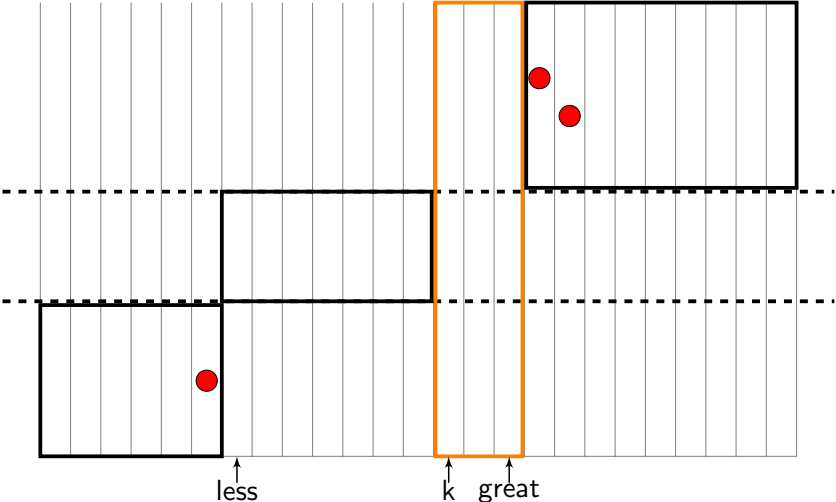
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## Section 2

### Specification and Proof

# Work Flow

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- ▶ Subdivision into three classes: One per partitioning style
- ▶ Writing specification
  - Running KeY
  - Adapting specification or source code

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- ▶ If proof fails:
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  - ▶ Adapt specification (or source code)
- ▶ If no proof is found:
  - ▶ Increase number of steps (?)
  - ▶ Interactive Rule Apps (Quantifier Instantiation, if-then-else-split)
  - ▶ Heap Simplification + SMT Solver

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  - ▶ Method extraction
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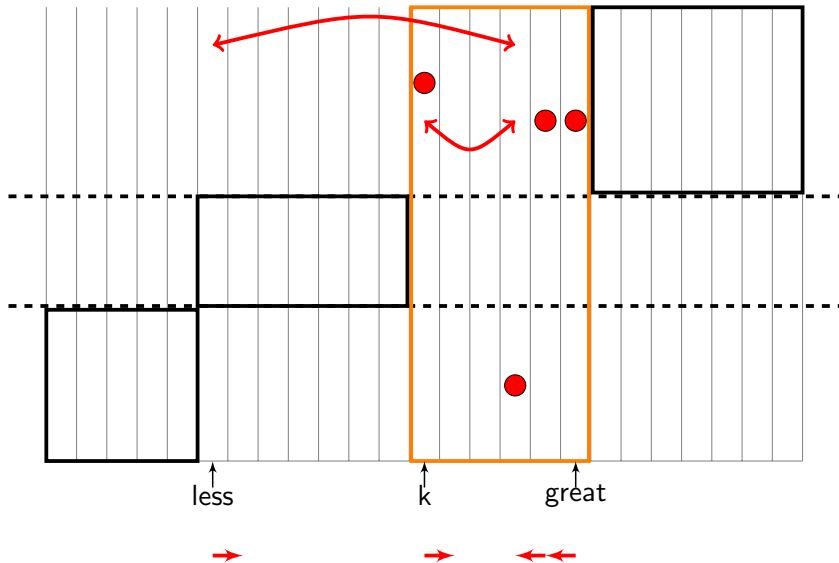
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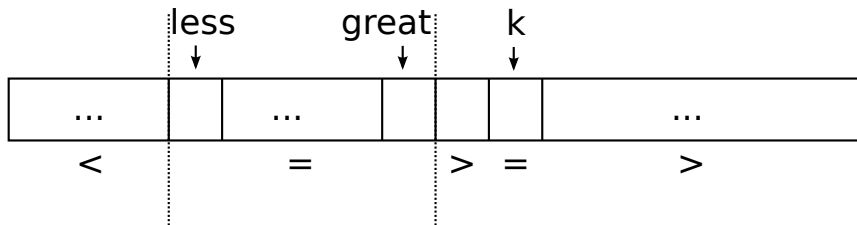
```
while (a[great] > pivot2) {  
    if (great-- == k) {  
        break outer;  
    }  
}
```

```
while (a[great] == pivot2) {  
    if (great-- == k) {  
        break outer;  
    }  
}
```

```
while (a[great] > pivot) {  
    --great;  
}  
...
```



# Violation of Single Pivot Partition Invariant



## Section 3

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## Statistics – Single Pivot Partition

| Method                   | Nodes | Branches | Time [s] | Rule Apps | Interactive | SMT |
|--------------------------|-------|----------|----------|-----------|-------------|-----|
| case_right               | 14784 | 114      | 17,7     | 18919     | 0           | 0   |
| split                    | 17609 | 90       | 23,8     | 24189     | 0           | 0   |
| sort(array, left, right) | 18495 | 101      | 18,8     | 22839     | 0           | 0   |
| sort(array)              | 654   | 7        | 0,4      | 1342      | 0           | 0   |
| Total                    | 51542 | 312      | 60.7     | 67289     | 0           | 0   |

## Statistics – Swap Pivot Values Partition

| Method          | Nodes  | Branches | Time [s] | Rule Apps | Interactive | SMT |
|-----------------|--------|----------|----------|-----------|-------------|-----|
| move_great_left | 1245   | 16       | 0,8      | 2346      | 0           | 0   |
| move_less_right | 2120   | 14       | 1,8      | 3224      | 0           | 0   |
| swap_values     | 123636 | 407      | 246,6    | 138039    | 0           | 0   |
| Total           | 127001 | 437      | 249.2    | 143609    | 0           | 0   |

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| Method                 | Nodes  | Branches | Time [s] | Rule Apps | Interactive | SMT |
|------------------------|--------|----------|----------|-----------|-------------|-----|
| calc_indices           | 24533  | 8        | 49,6     | 24835     | 0           | 0   |
| insertionsort_indices  | 50816  | 365      | 137,4    | 73056     | 0           | 34  |
| prepare_indices        | 5332   | 28       | 6,4      | 7153      | 0           | 0   |
| move_great_left        | 1650   | 15       | 1,1      | 2605      | 0           | 0   |
| move_great_in_loop     | 1580   | 18       | 1,1      | 2787      | 0           | 0   |
| move_less_right        | 1928   | 14       | 1,4      | 2967      | 0           | 0   |
| loop_body              | 52134  | 287      | 57,3     | 56263     | 18          | 0   |
| split                  | 28751  | 98       | 109,6    | 51666     | 0           | 36  |
| sort(int[],left,right) | 51342  | 305      | 459,6    | 76973     | 114         | 116 |
| sort(int[])            | 611    | 5        | 0,4      | 1236      | 0           | 0   |
| Total                  | 218677 | 1143     | 823,9    | 299541    | 132         | 186 |
| Entire Proof           | 297220 | 1892     | 1133,8   | 510439    | 132         | 186 |