

Week 4: Monday

EECS 281

Roadmap

Mon 5/22	Quicksort	Section: Sorting algorithms	Project 2 due
Tue 5/23	Mergesort		
Wed 5/24	Midterm Exam review	Section: Midterm Exam review	
Thu 5/25	Midterm Exam		
Fri 5/26	Lab 4 and Lab 5 due		
Tue 5/30	Intro to Hashing		
Wed 5/31	Hashing and Collision Resolution	Section: Hashing	
Thu 6/1	Tree ADT, Searching in Trees		

Agenda

Disjoint sets

Queue with two stacks

Fibonacci iterator

Searching

Sorting

Bubble sort

Insertion sort

Selection sort

Merge sort

Heapsort

Quicksort

260

slides

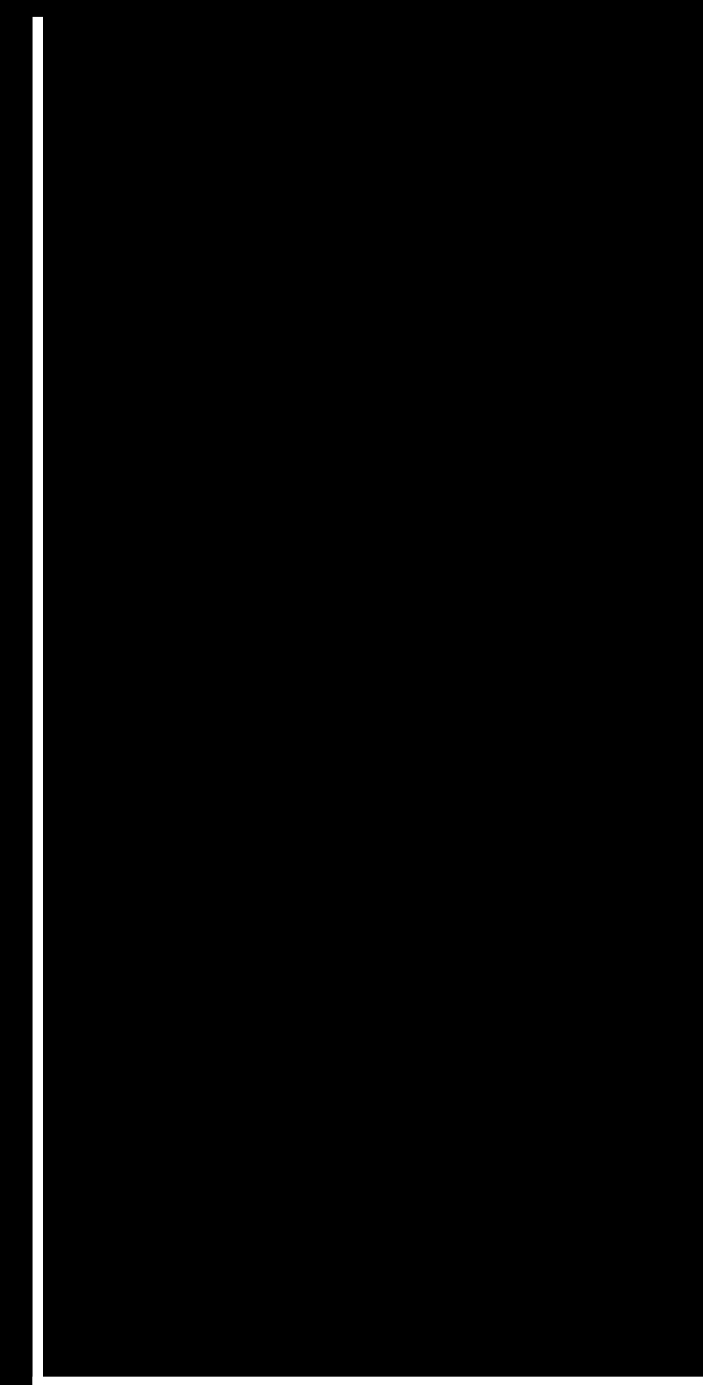
Queue with two stacks



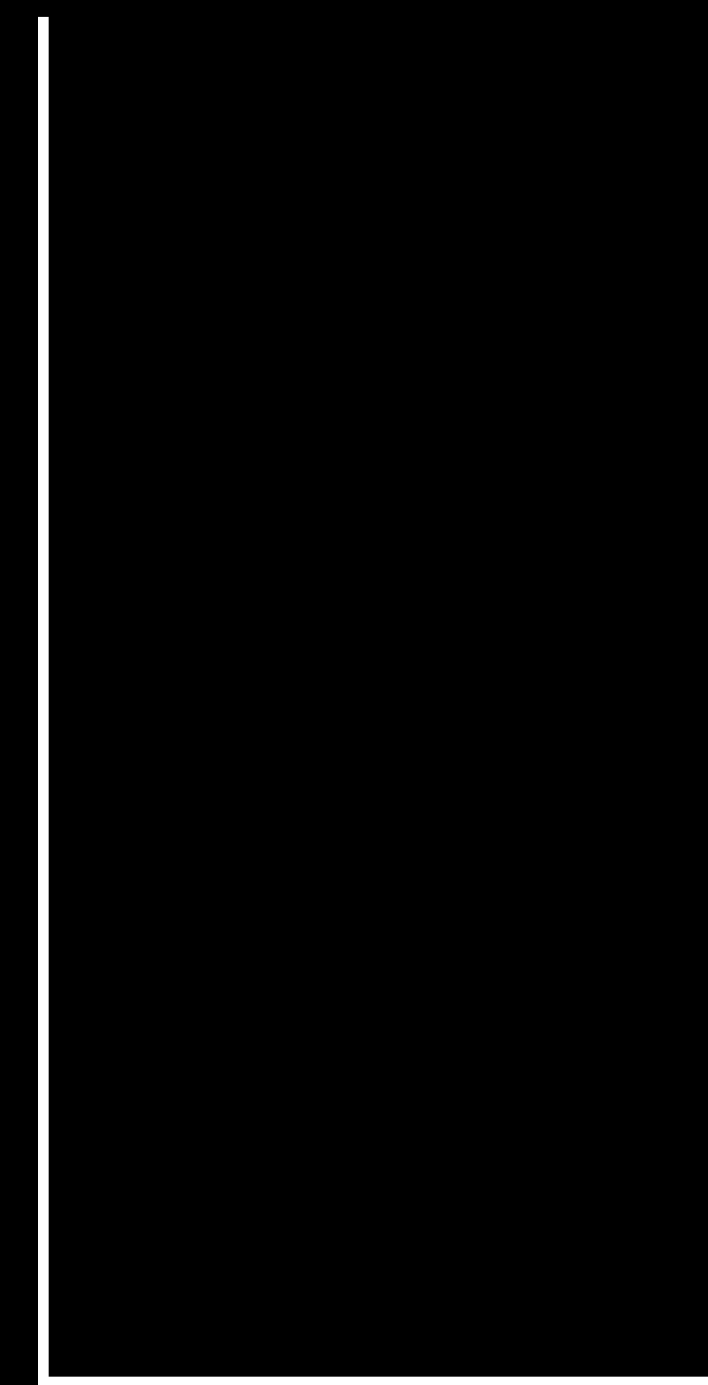
Queue with two stacks



Queue with two stacks



input



output

Fibonacci Iterator

$$F_n = F_{n-1} + F_{n-2}$$

Disjoint sets

No items are more than in one set

Universe of items: all items that can be a member of a set

Operations:

Union merges two sets into one

Find finds which set an item is in

Disjoint sets



NOKIA

YAHOO!

tumblr.



Disjoint sets



NOKIA

YAHOO!

tumblr.



Linked in

Disjoint sets

Microsoft



Skype



Tumblr

tumblr.

Yahoo!

YAHOO!

Nokia

NOKIA

Verizon

verizon✓

LinkedIn

Linked in

`find(Skype) → Skype`

`find(Tumblr) → Tumblr`

`find(LinkedIn) → LinkedIn`

Disjoint sets

Microsoft



Microsoft



Yahoo!

tumblr.

YAHOO!

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NOKIA

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Disjoint sets

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Quick Find

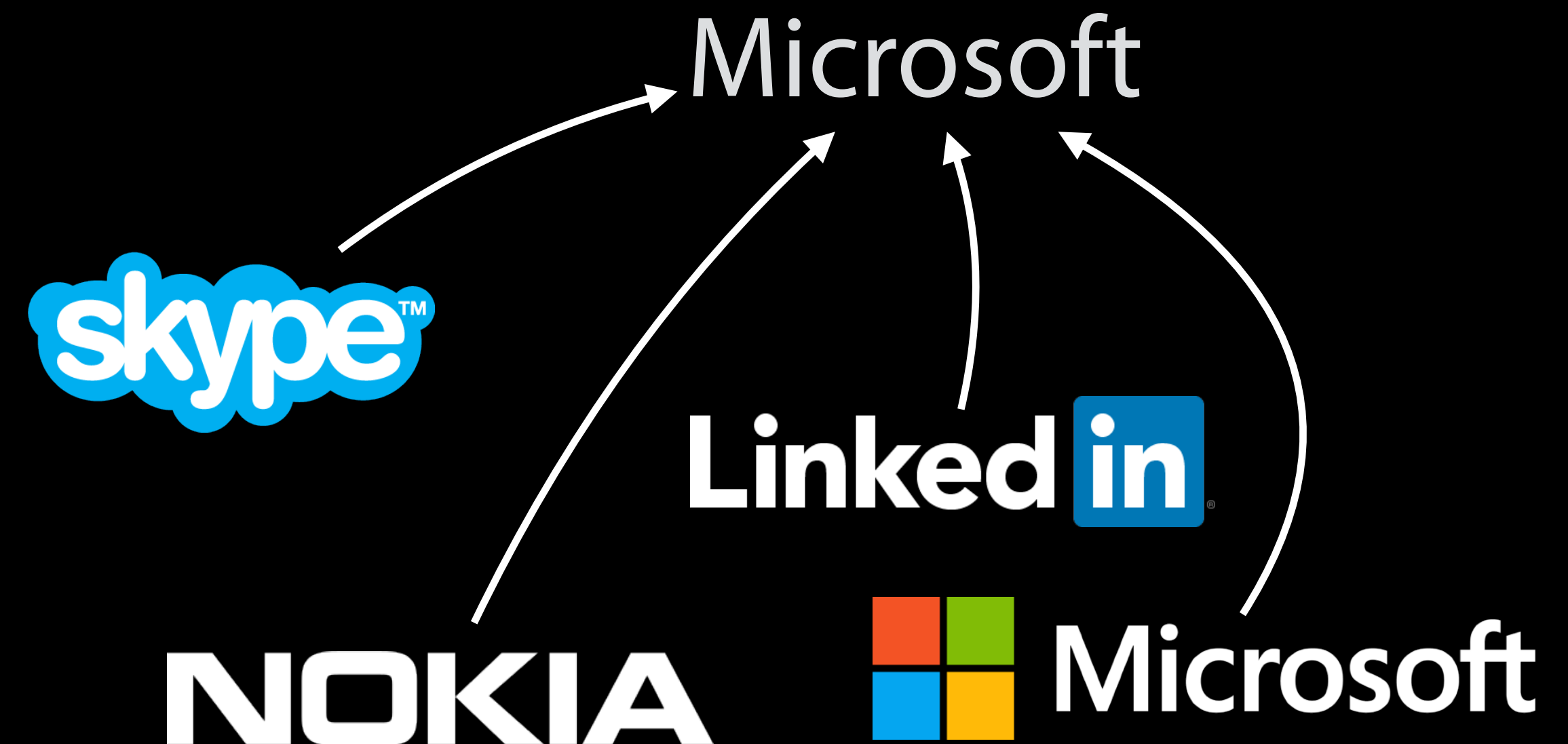
List-based disjoint sets

Each set references list of items in that set

Each item references the set that contains it

Find: $\Theta(1)$ time

Union: **slow**



Quick Find

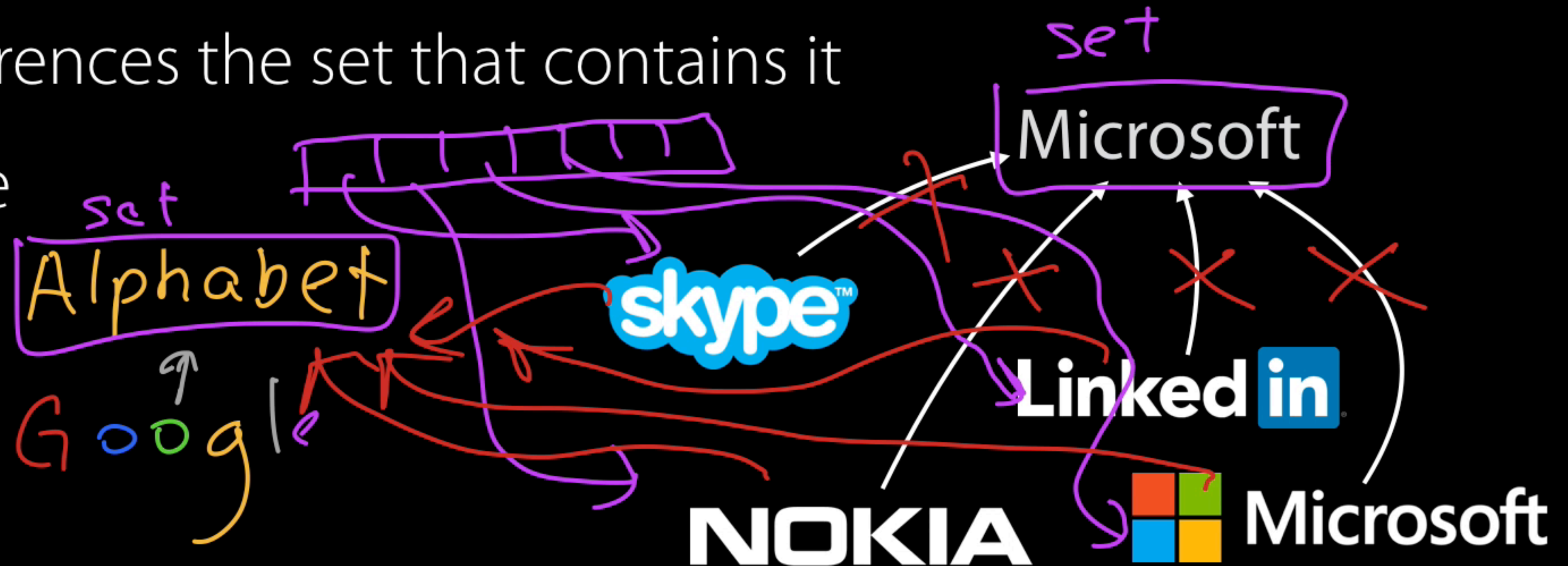
List-based disjoint sets

Each set references list of items in that set

Each item references the set that contains it

✓ Find: $\Theta(1)$ time

Union: **slow**



Quick Union

Union: $\Theta(1)$ time

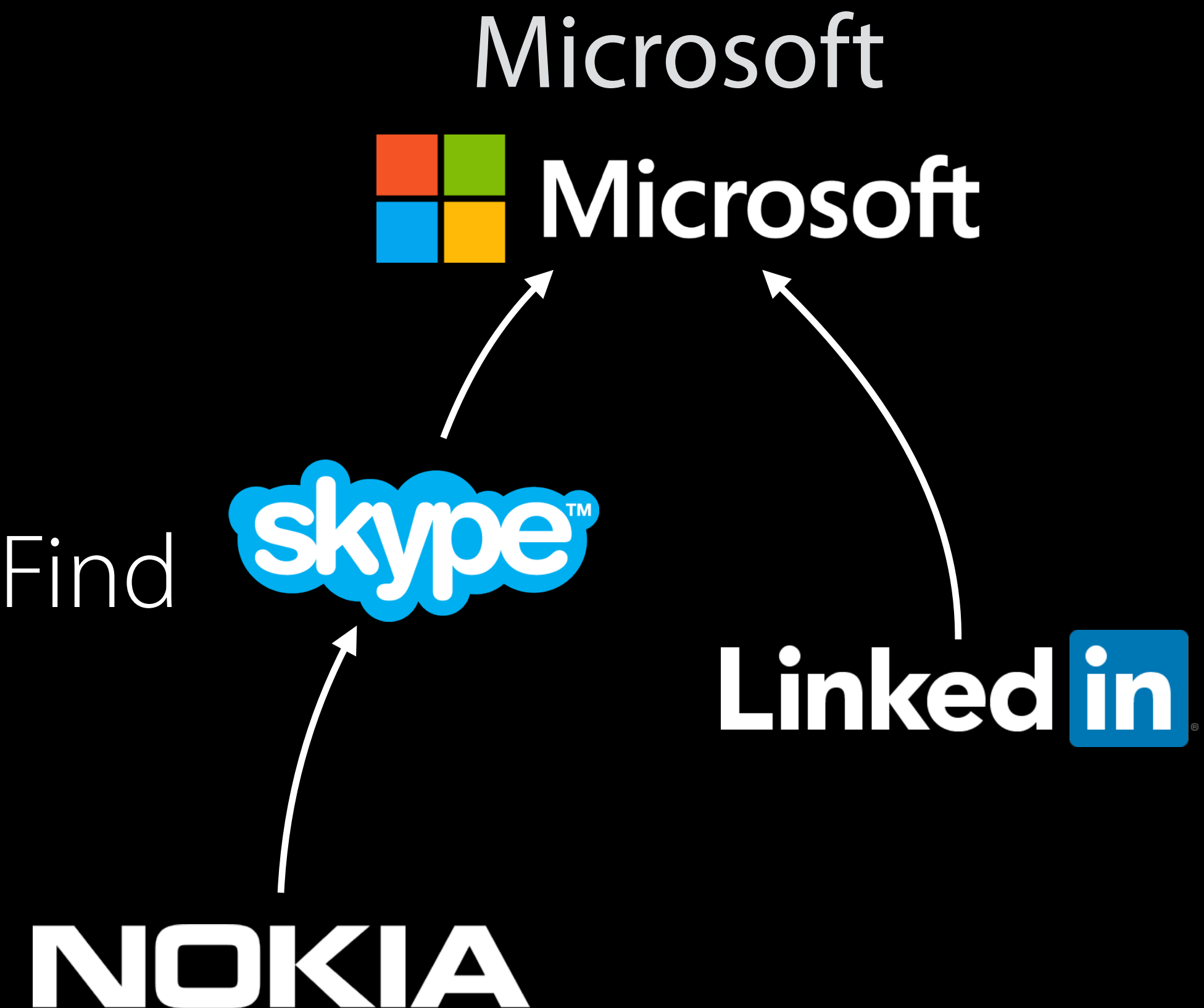
Find: **slower**

Quick Union is faster overall than Quick Find

Sets are stored as trees

Only parent references

True identity of each set is recorded at root



Quick Union

✓ Union: $\Theta(1)$ time

Find: **slower** $O(d)$ $d = \text{depth of a node}$

Quick Union is faster overall than Quick Find

Sets are stored as trees

Only parent references

True identity of each set is recorded at root

UNION BY SIZE At each node,

record size of tree
Make smaller tree subtree of larger one

set
Alphabet

Google

~~set~~
Microsoft

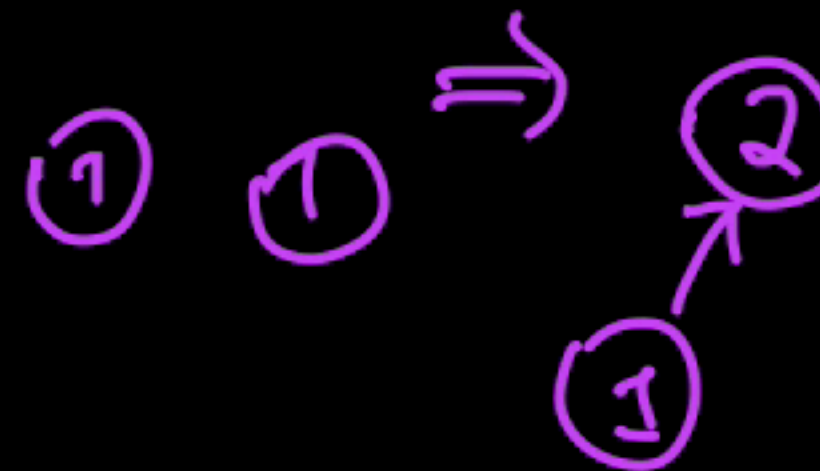


Microsoft



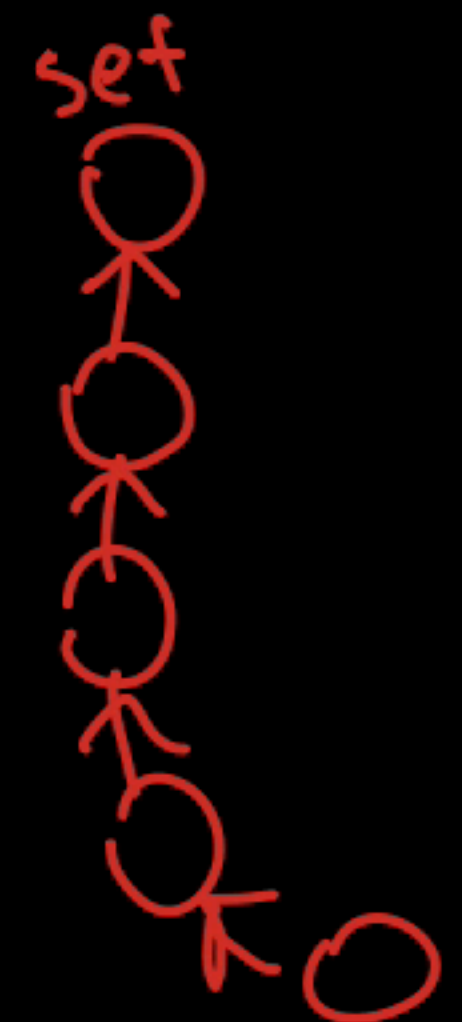
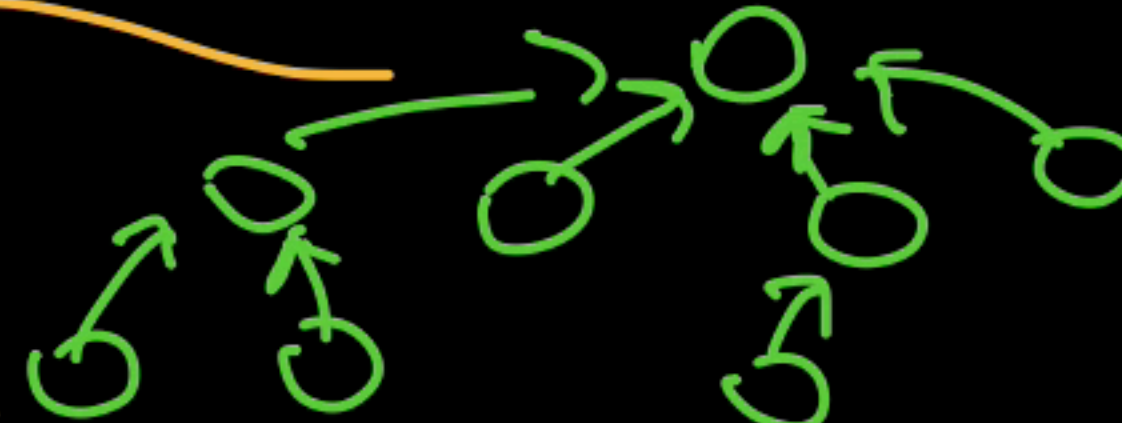
depth=2

LinkedIn



NOKIA

better:
set



Quick Union

Union: $\Theta(1)$ time

Find: **slower**

Quick Union is faster overall than Quick Find

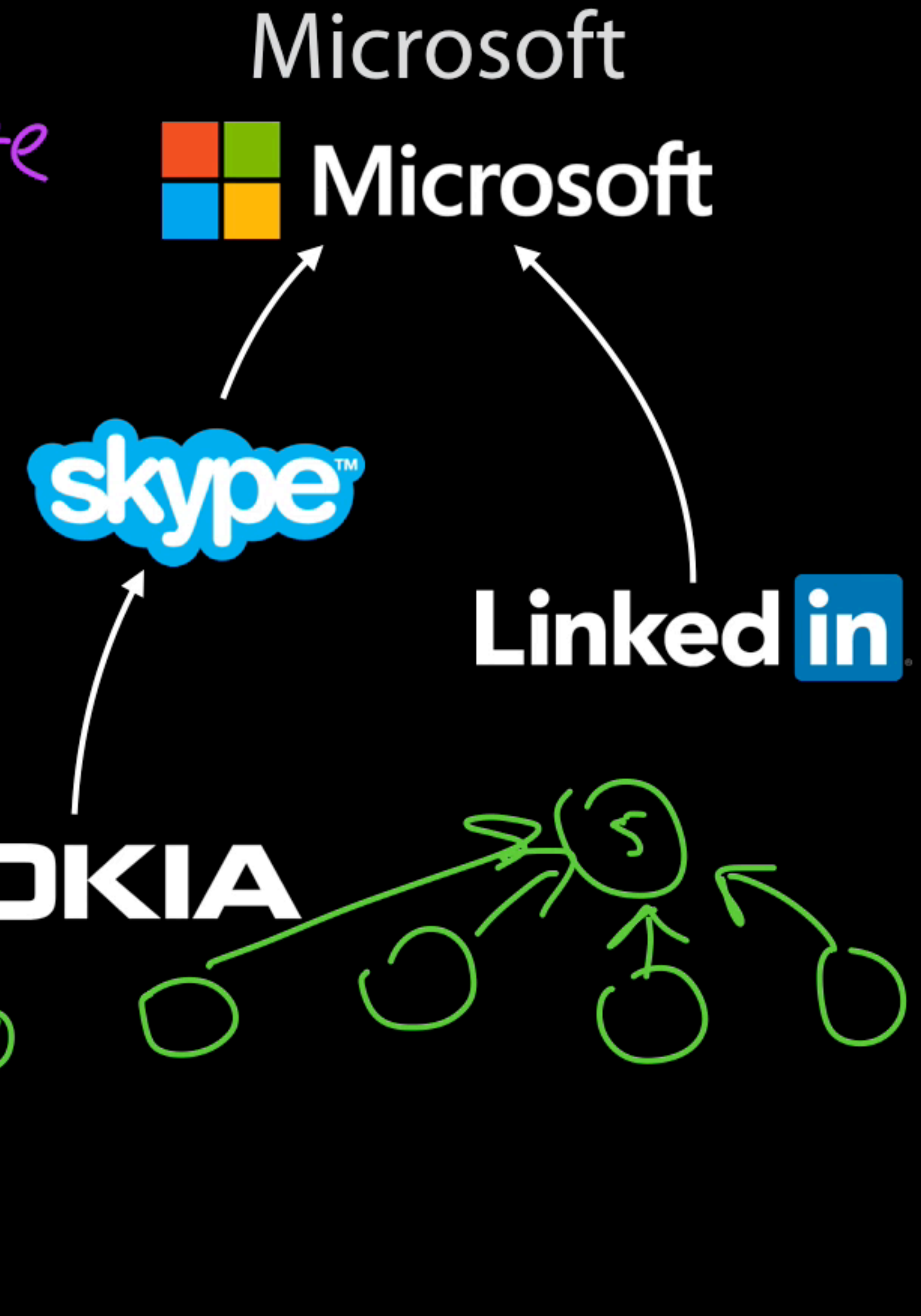
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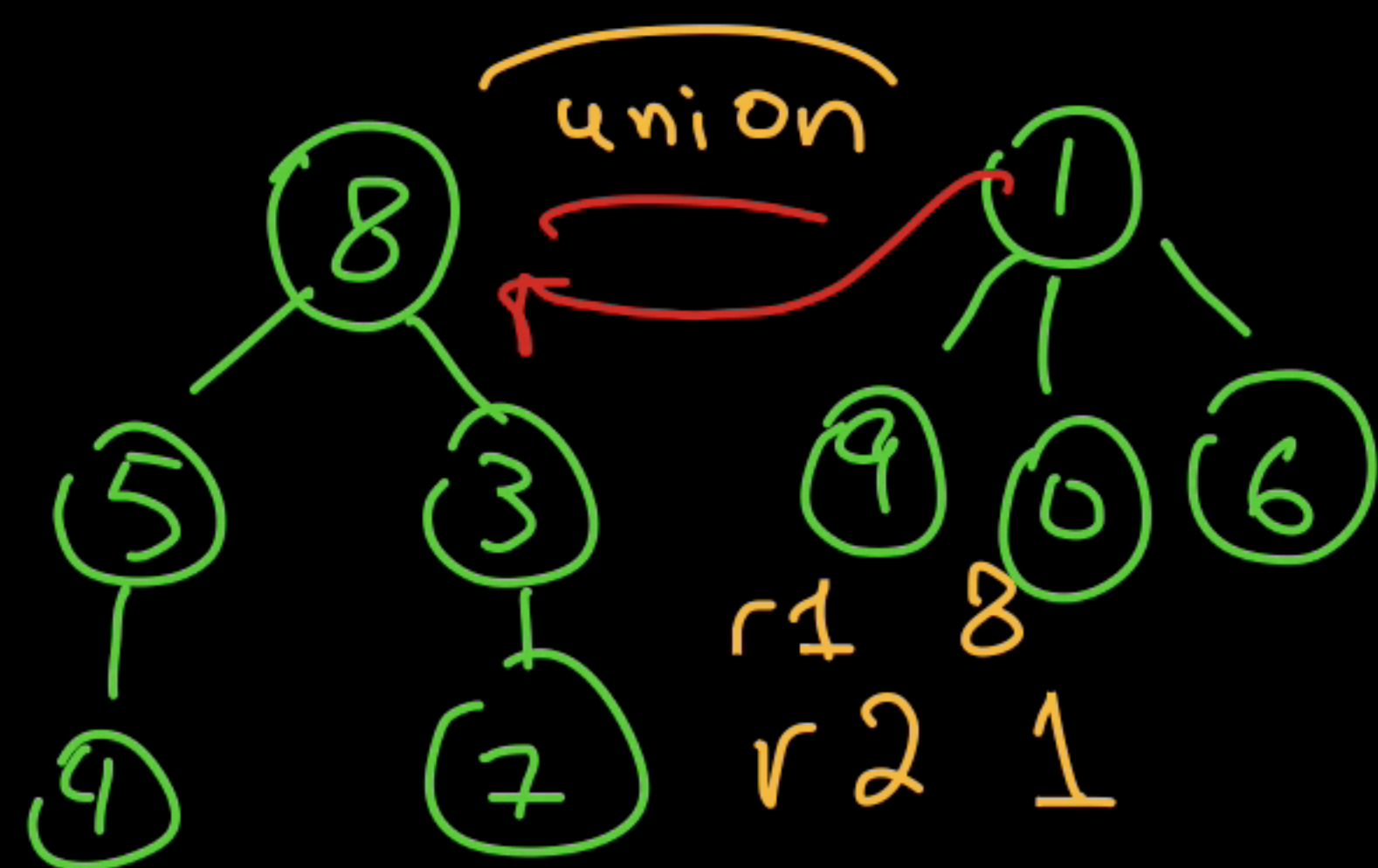
① Union by size

approx. by decr
size $\neq$ depth
 $\rightarrow$ want smaller



Disjoint Sets as an Array

- Items numbered from zero
- Array to record parent of each item
- If no parent $\rightarrow$ record size as neg. number



(2)

8								-9	
1	4	-1	8	5	8	1	3	-5	1
0	1	2	3	4	5	6	7	8	9

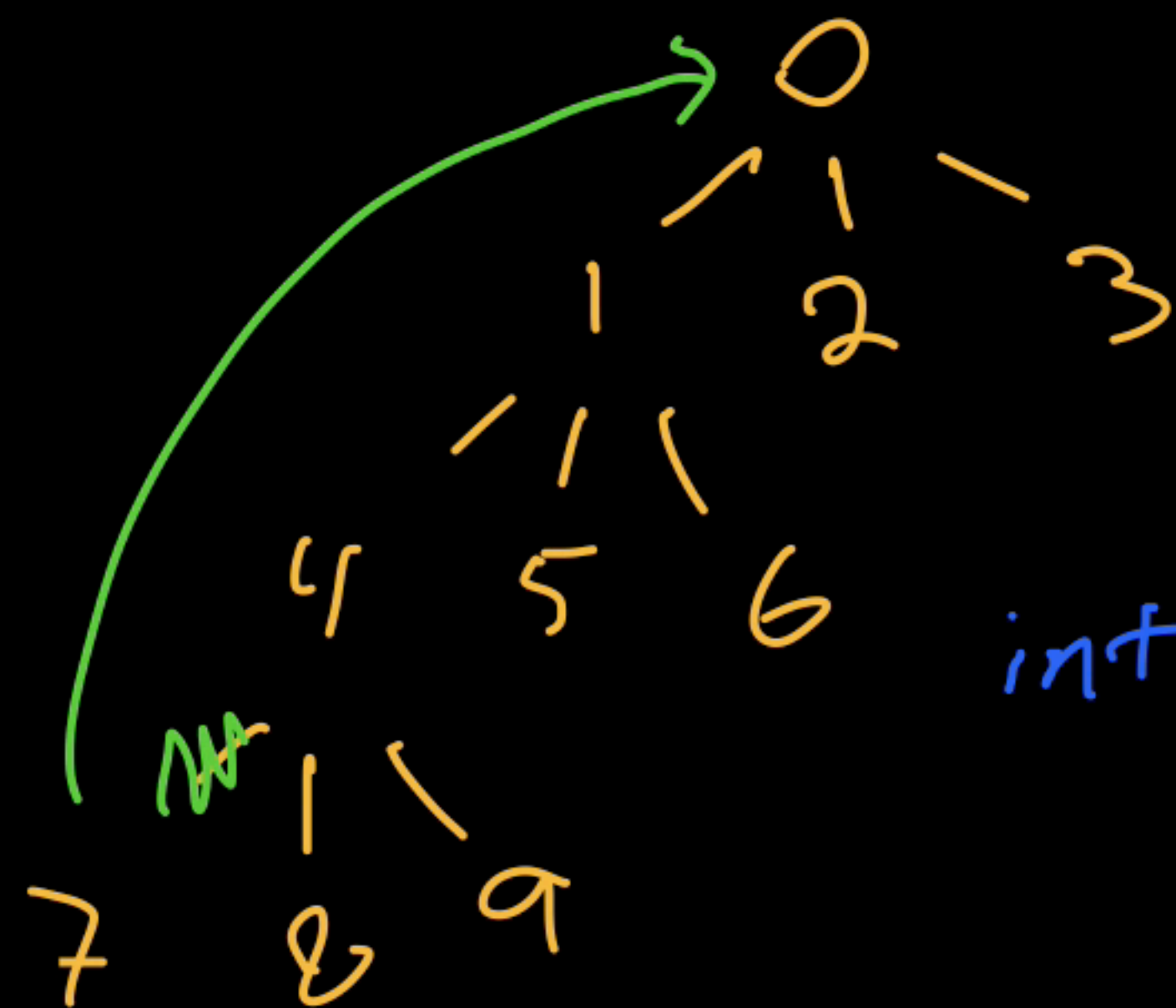
```
void union(int r1, int r2) {  
    if (a[r2] < a[r1]) {  
        a[r2] += a[r1];  
        a[r1] = r2;  
    } else {  
        ...  
    }
```

← R2 has larger tree

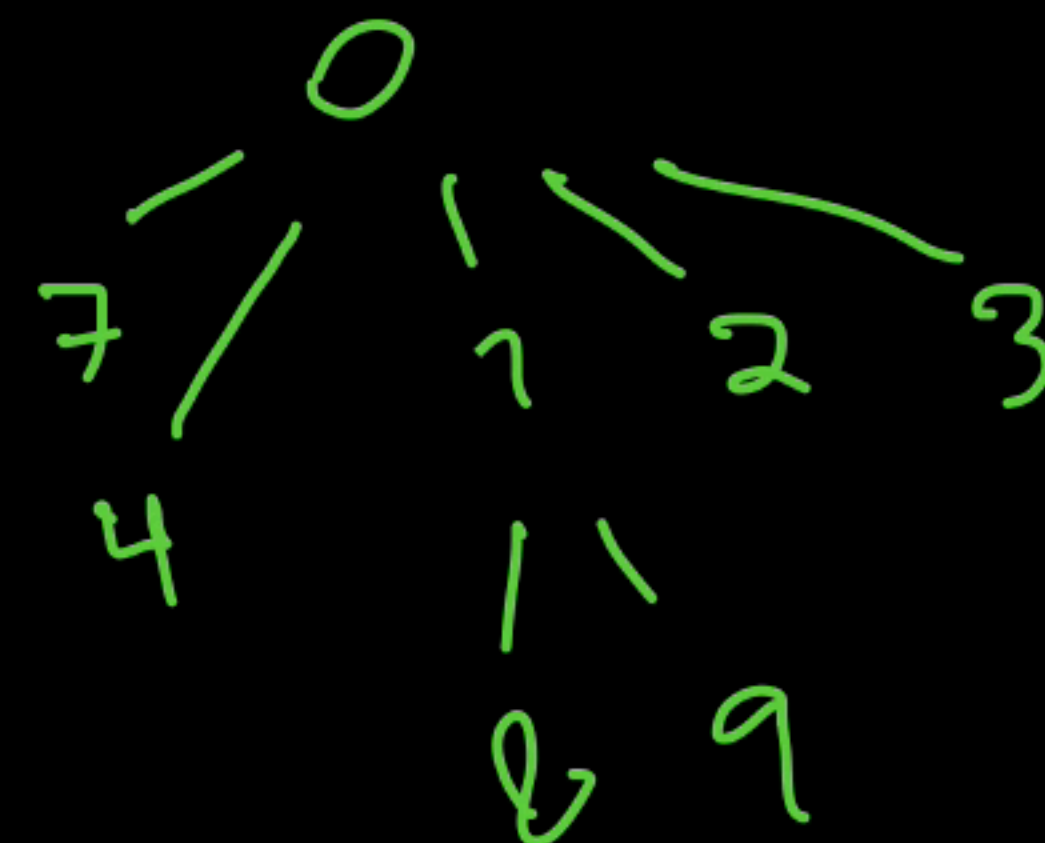
Optimizing

① Union by size

② Path compression



find(7)
find(4)



int find(int x) {

if (a[x] < 0) {
return x;

} else {
a[x] = find(a[x]);
return a[x];
}

Sequence^f Union+Find

$\Theta(n + f \cdot \alpha(f+n, n))$

extr slow growing
inverse Ackermann fn

← never > 4 avg case find $\Theta(1)$

```
break;
```

Sorting

Sorting

A **sort** is a permutation of a sequence of elements that brings them into order according to some **total order**.

A total order $\leq$ is...

total $x \leq y$ or $y \leq x$ for all x, y .

reflexive $x \leq x$.

antisymmetric $x \leq y$ and $y \leq x$ iff $x = y$.

transitive $x \leq y$ and $y \leq z$ implies $x \leq z$.

Alternative view point

An **inversion** is a pair of elements that are out of order.

0 1 1 2 3 4 8 6 9 5 7

6/55 inversions: (8,6) (8,5) (8,7) (6,5) (9,5) (9,7).

Goal of sorting: reduce the number of inversions to 0.

Alternative view point

An **inversion** is a pair of elements that are out of order.

0 1 1 2 3 4 8 6 9 5 7

The diagram shows an array of numbers: 0, 1, 1, 2, 3, 4, 8, 6, 9, 5, 7. Below the numbers, blue brackets are drawn to highlight specific pairs: one bracket under the 8 and 6, another bracket under the 8 and 5, and a third bracket under the 9 and 5. These pairs represent inversions where a larger number appears before a smaller number.

6/55 inversions: (8,6) (8,5) (8,7) (6,5) (9,5) (9,7).

Goal of sorting: reduce the number of inversions to 0.



Why sort?

Problems become easier

Searching

Finding median

Data compression

Computer graphics

Sorting Algorithms

Bubble sort

Selection sort

Insertion sort

Heapsort

Merge sort

Quicksort

Sorting Algorithms

Bubble sort

Selection sort

Insertion sort

Heapsort

Merge sort

Quicksort



*Elementary
Sorts*

Bubble sort

Reduce the number of inversions by going through the array and swapping adjacent elements if they are an inversion pair.

Bubble large elements up and bubble small elements down.

Repeat until A is sorted (no swaps in previous loop):

```
for i = 0 ... n - 2:  
    if A[i] > A[i + 1]:  
        swap A[i] > A[i + 1]
```


Bubble sort

Reduce the number of inversions by going through the array and swapping adjacent elements if they are an inversion pair.

Bubble large elements up and bubble small elements down.

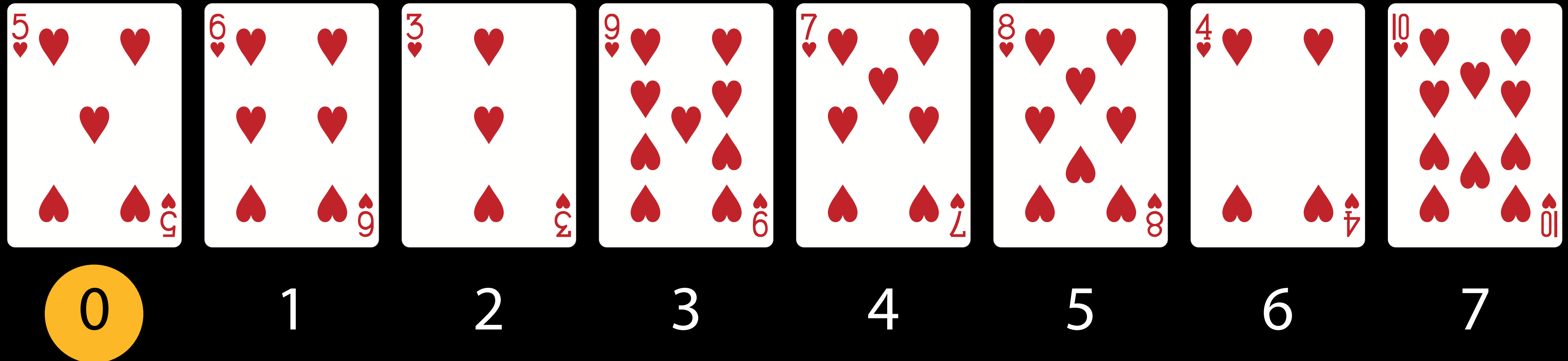
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Bubble sort

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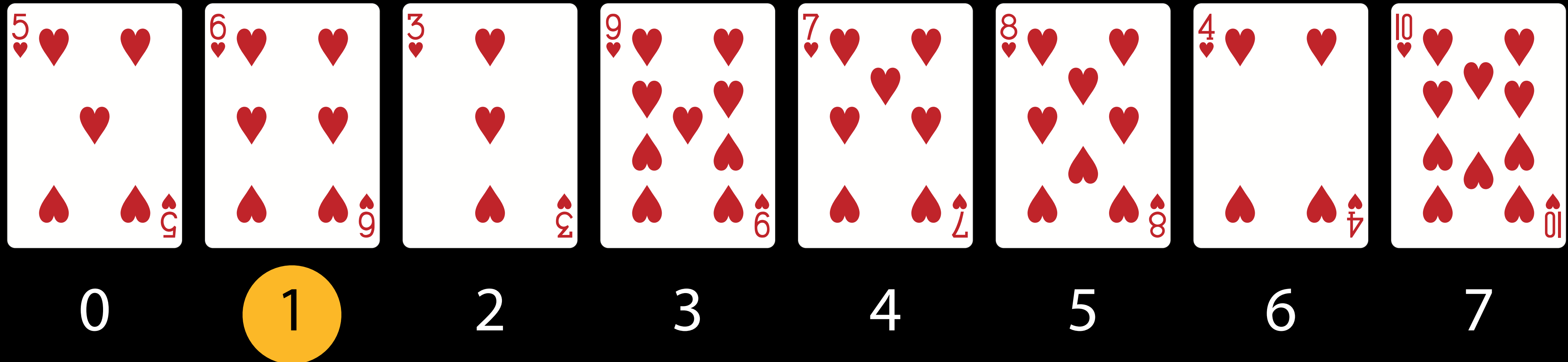
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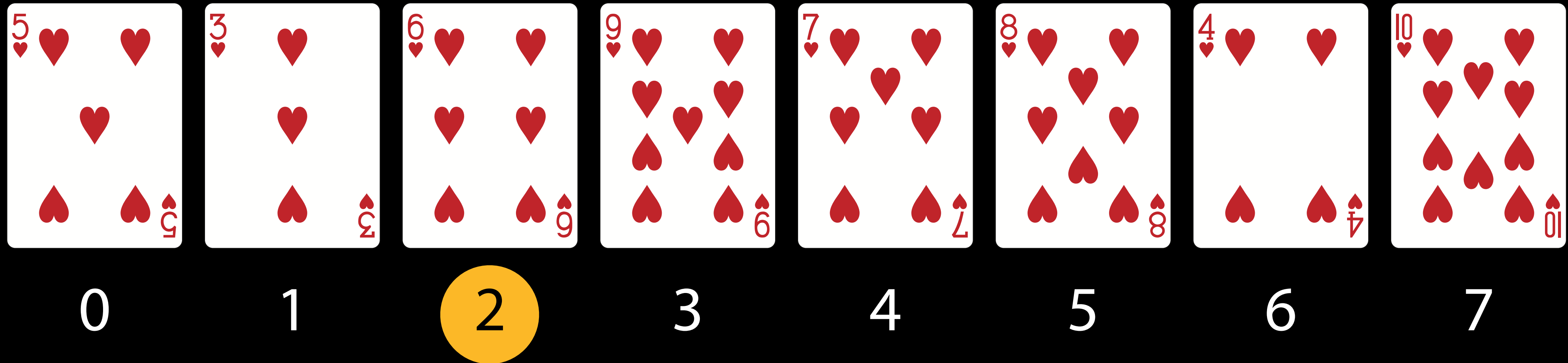
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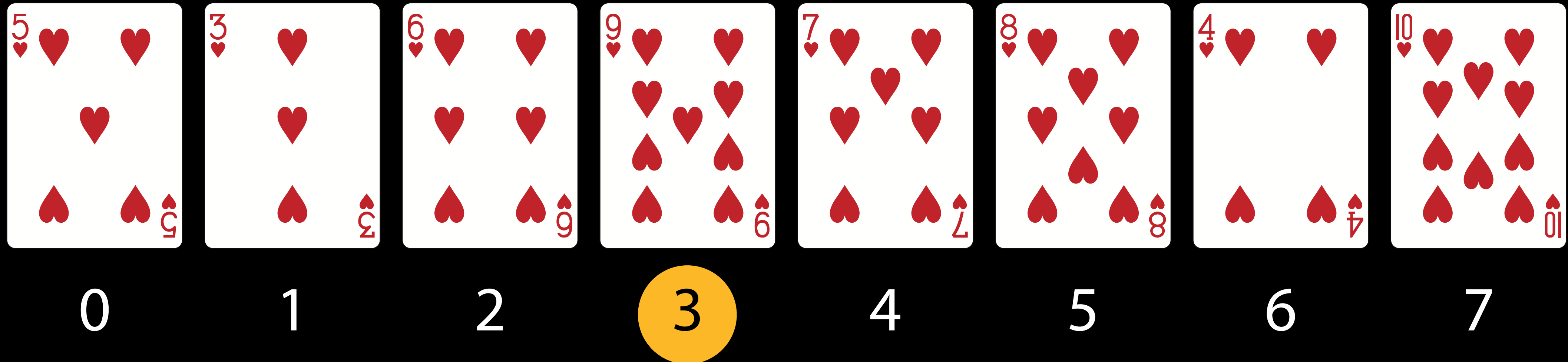
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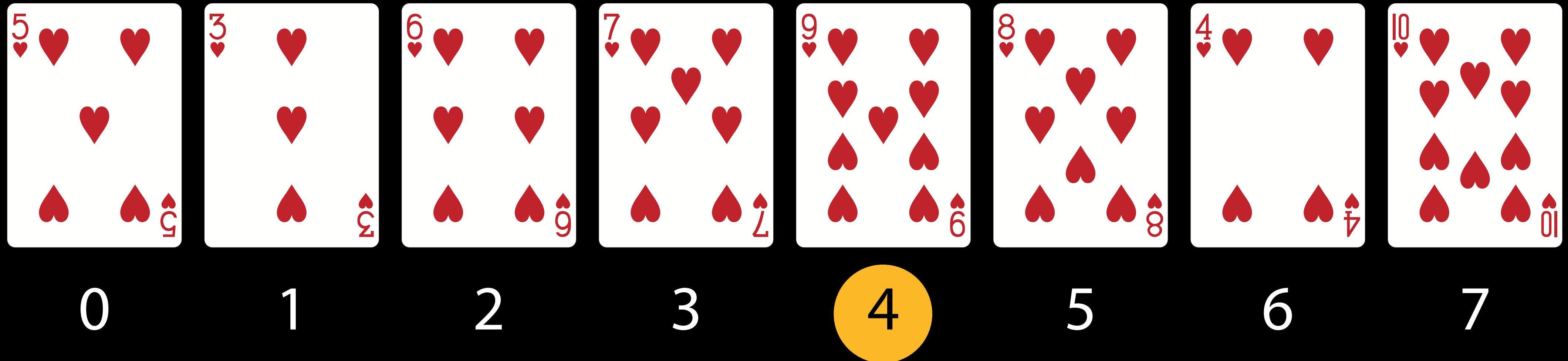
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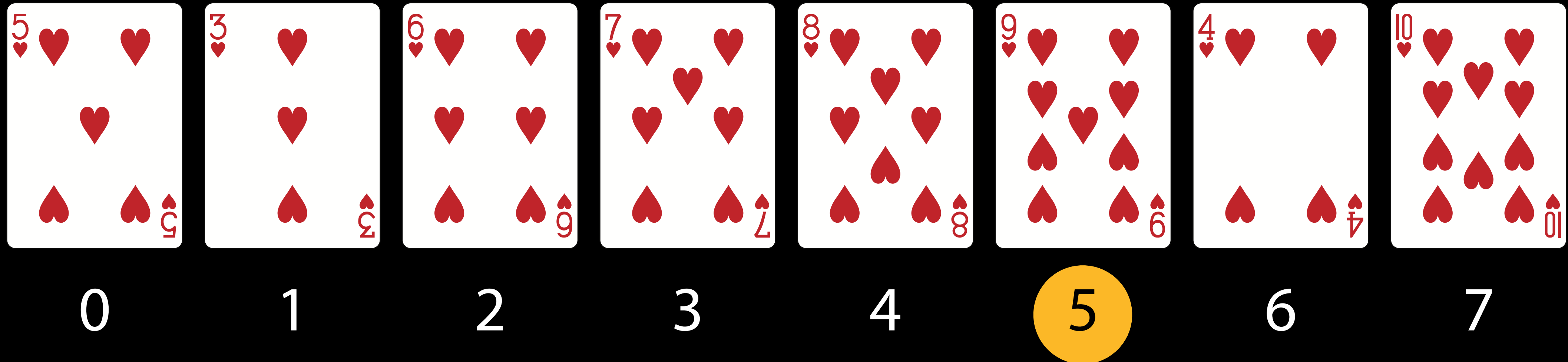
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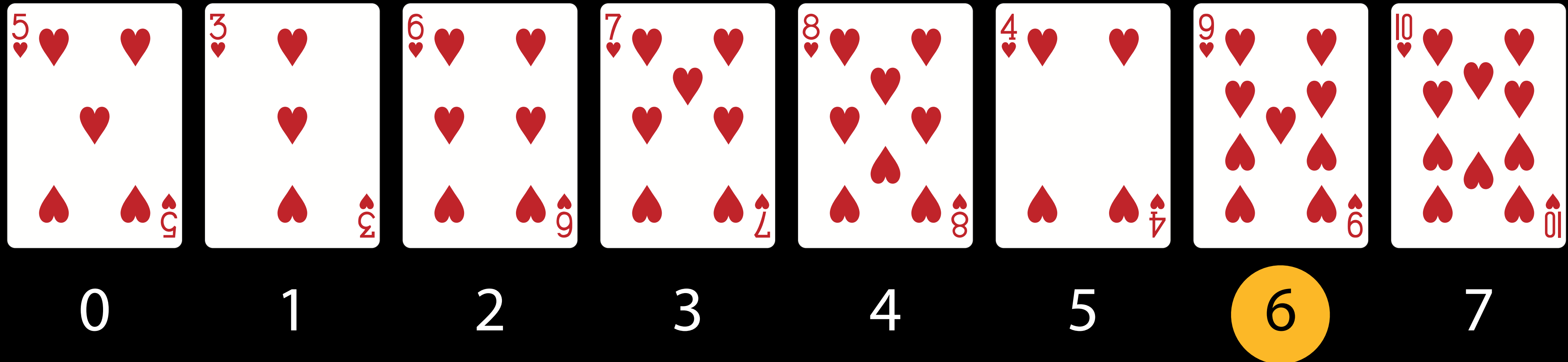
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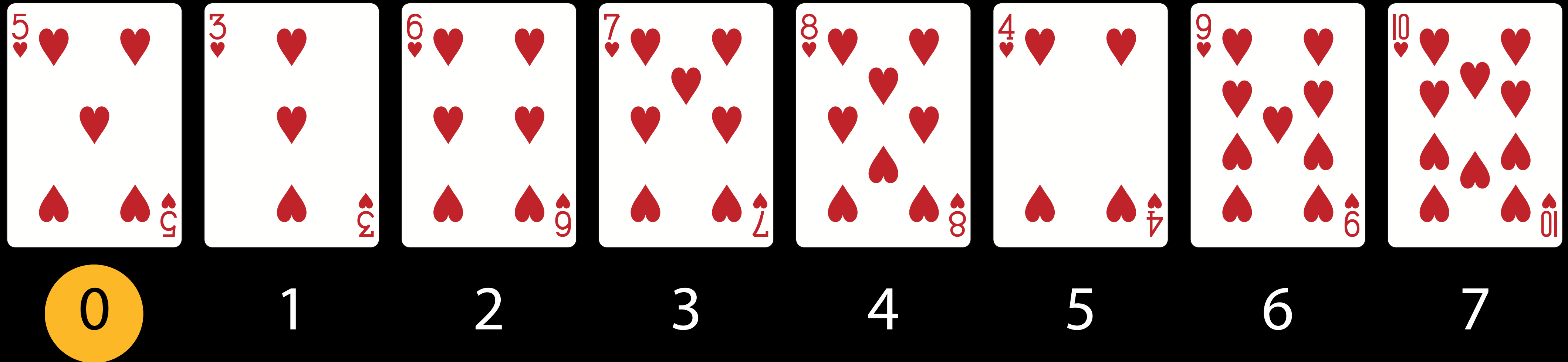
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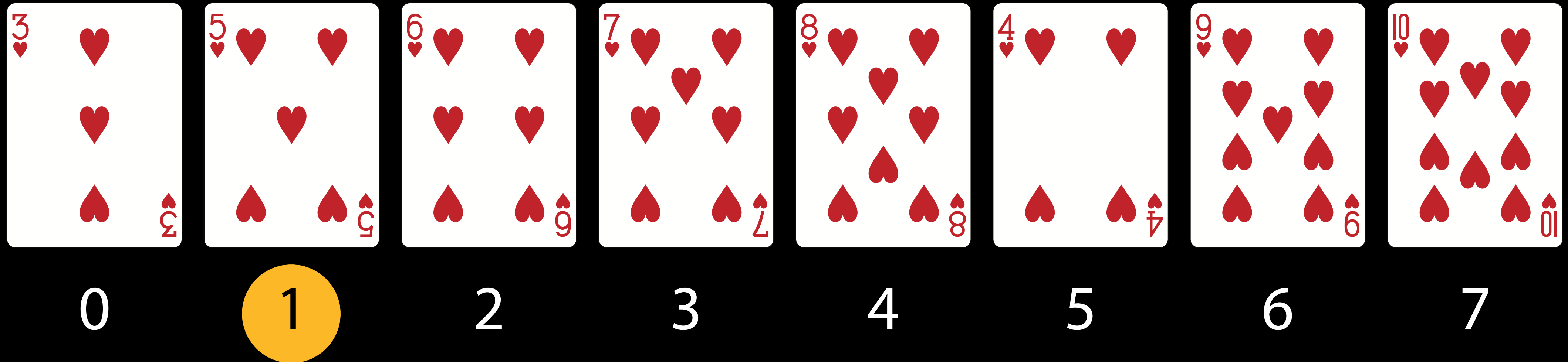
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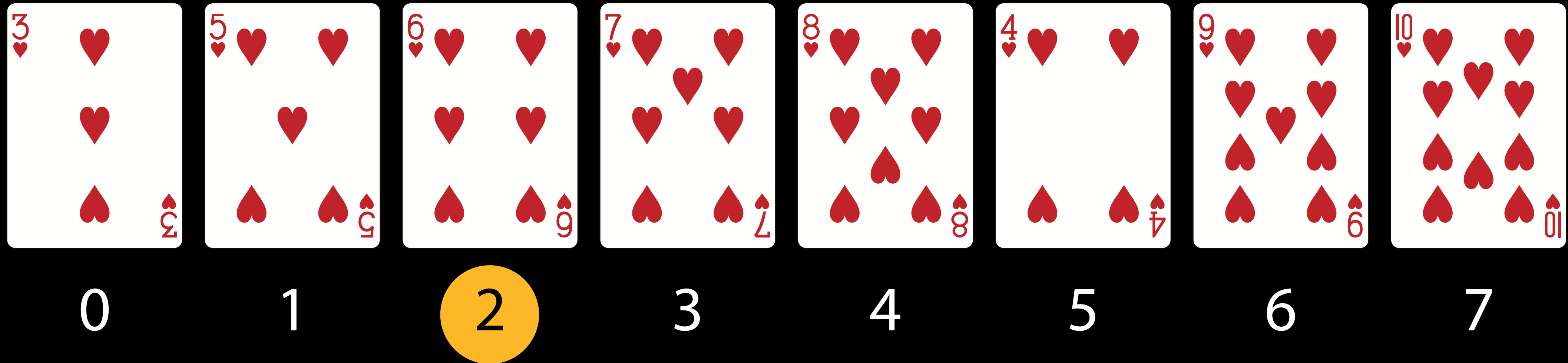
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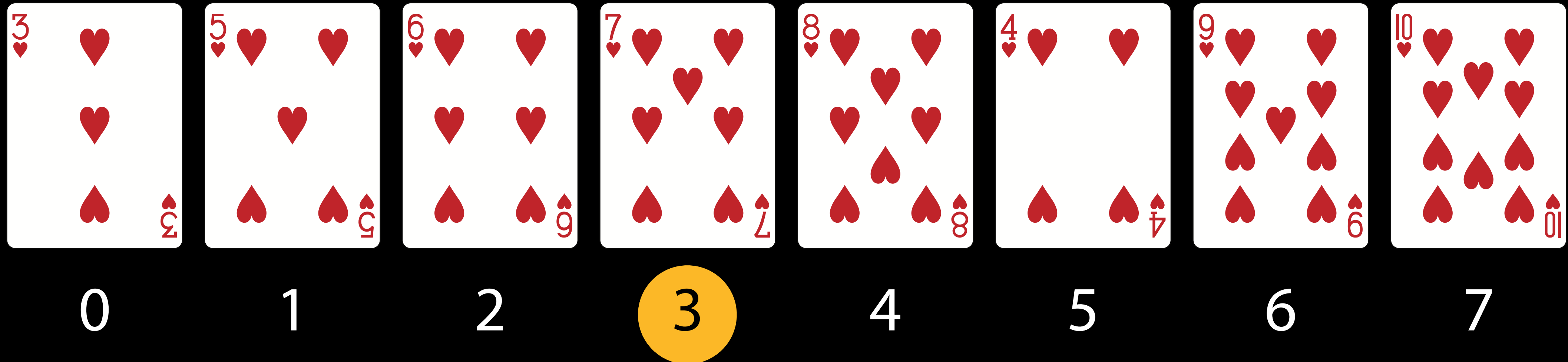
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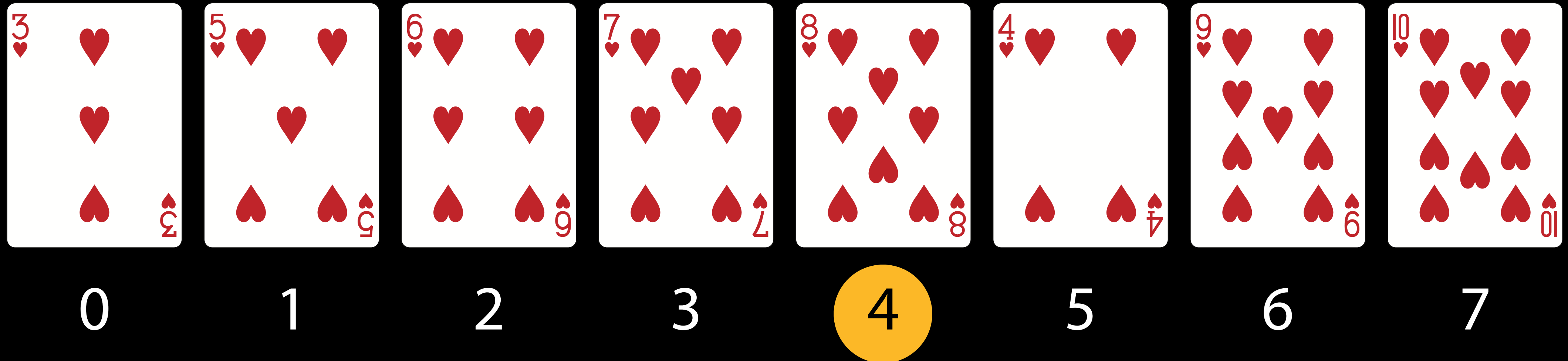
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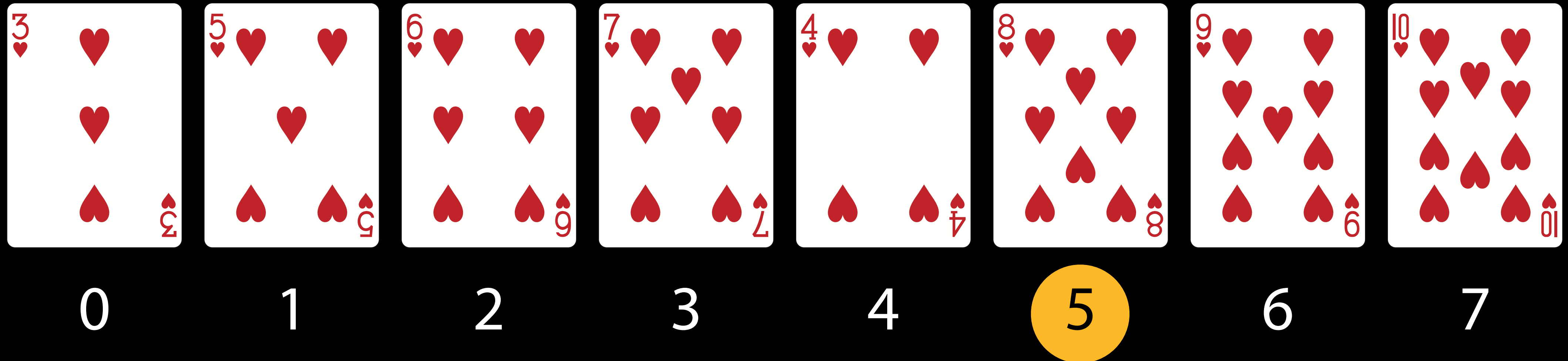
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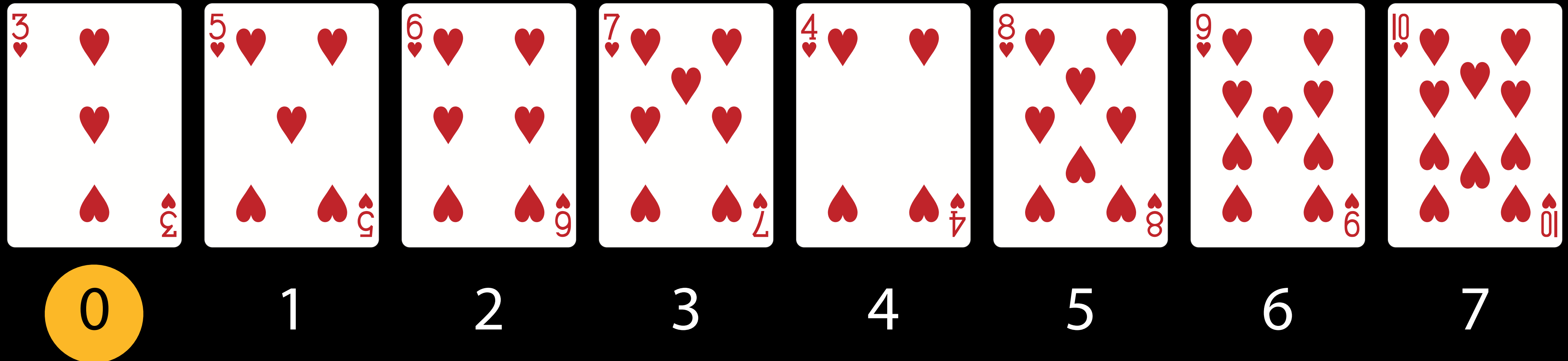
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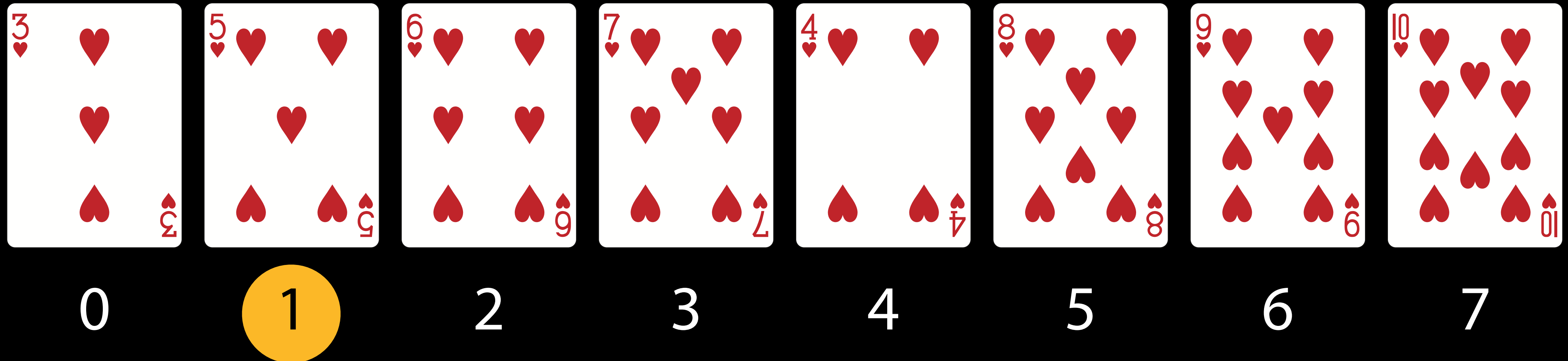
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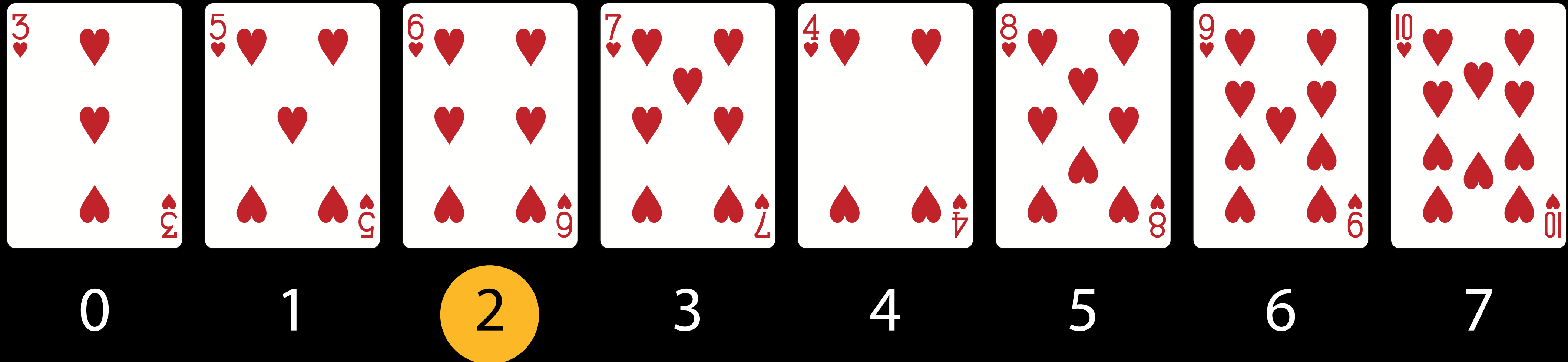
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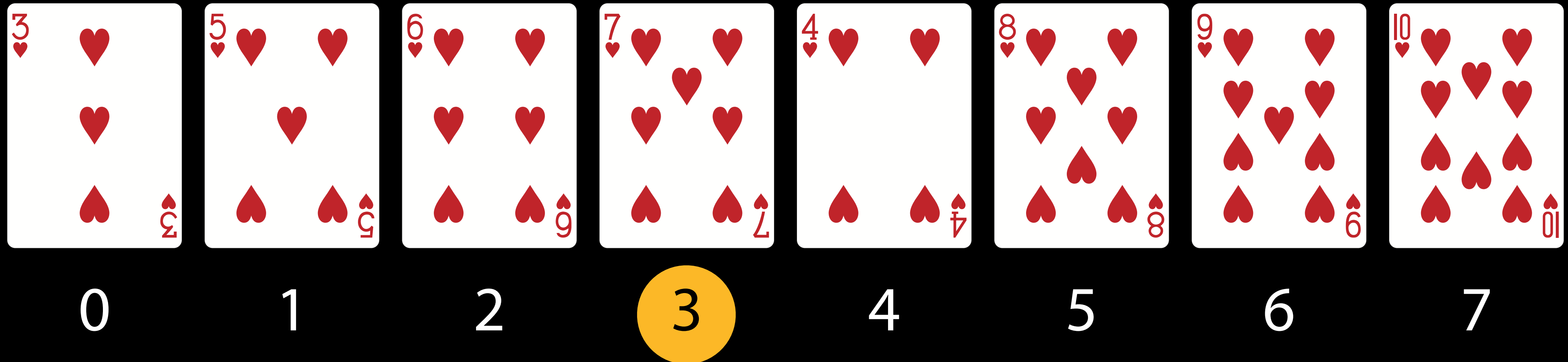
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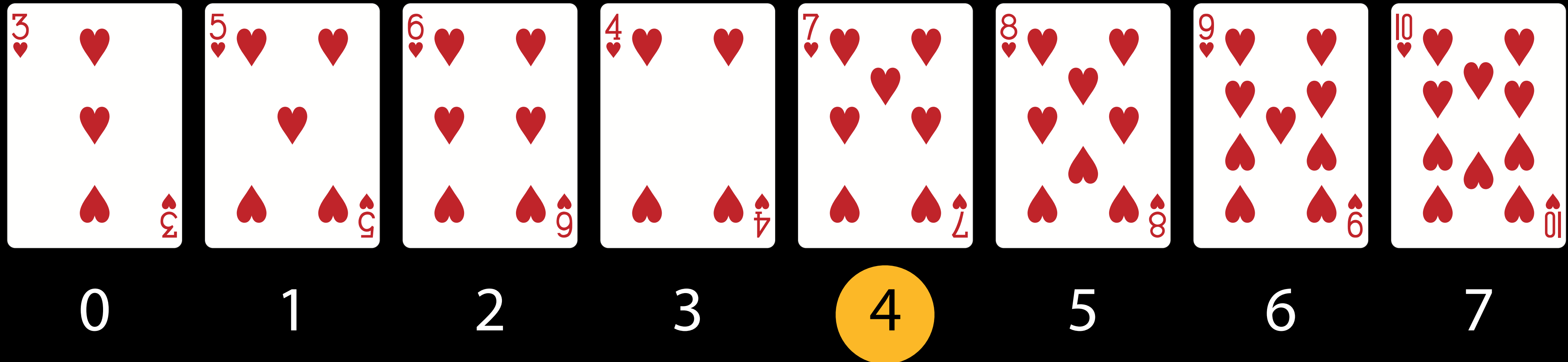
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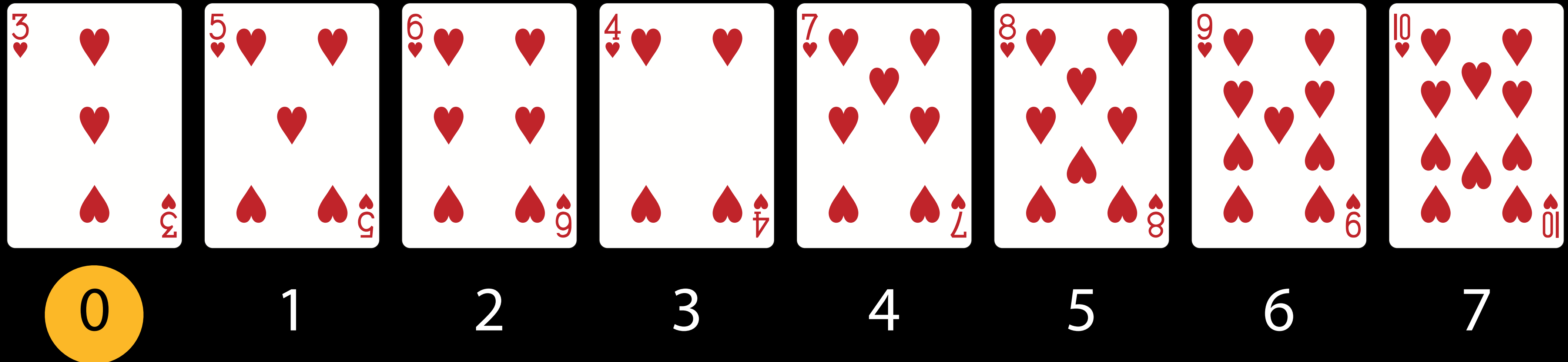
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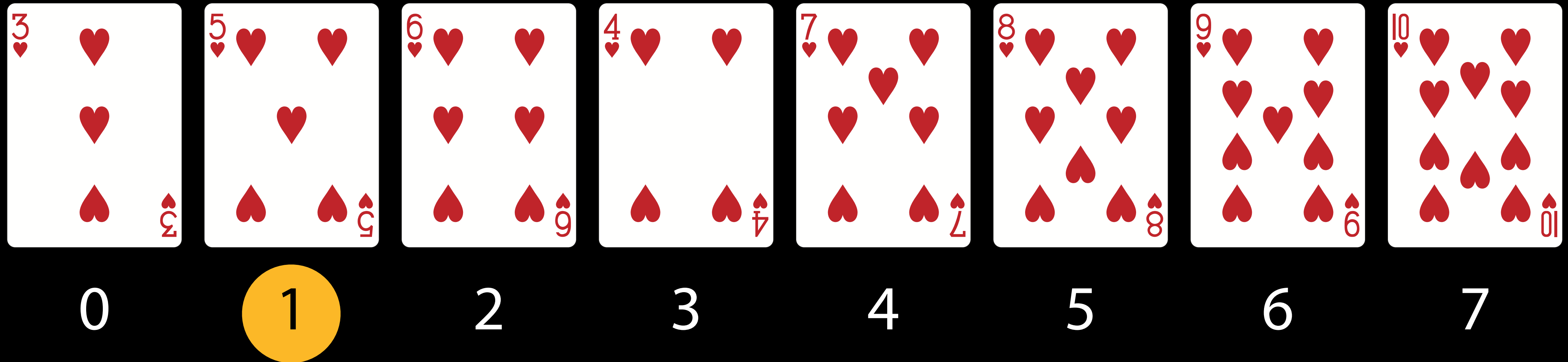
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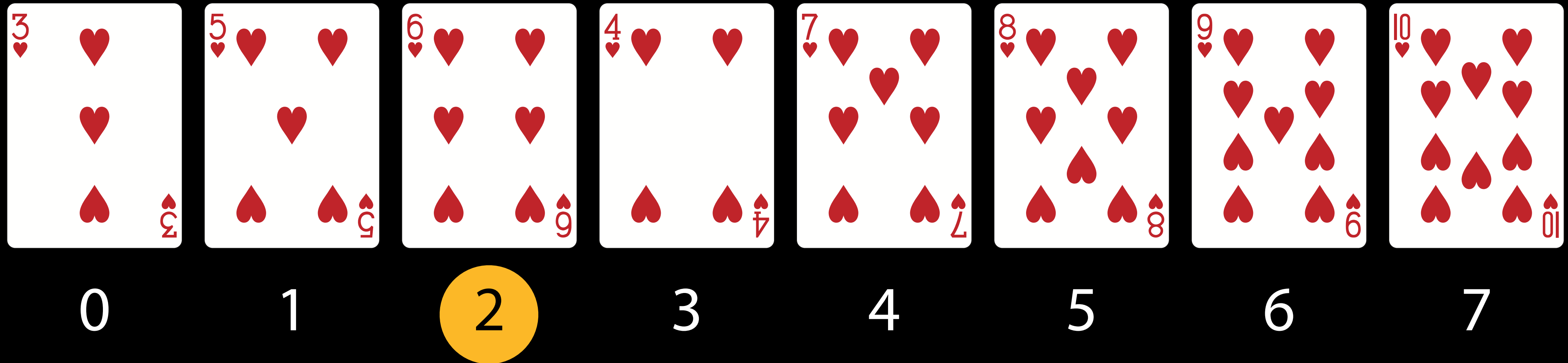
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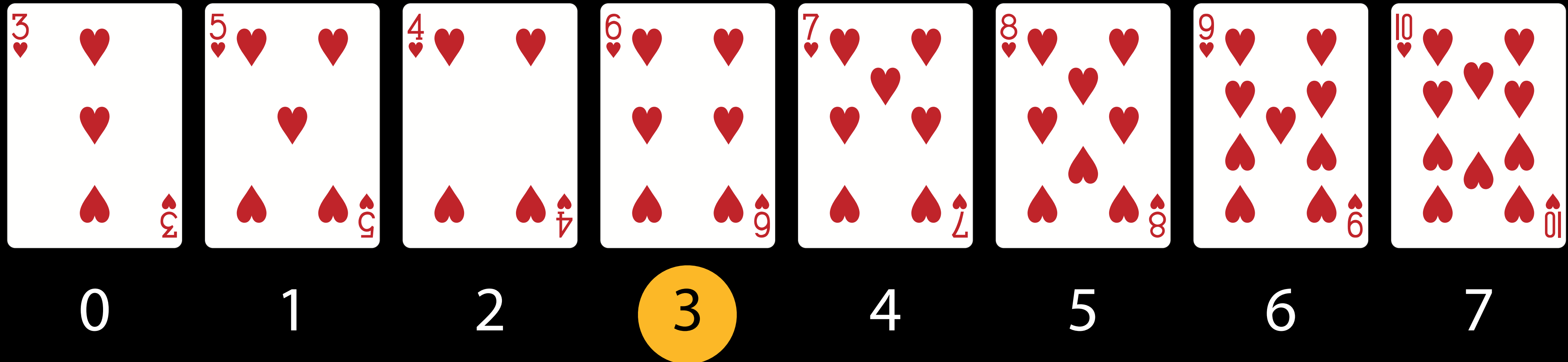
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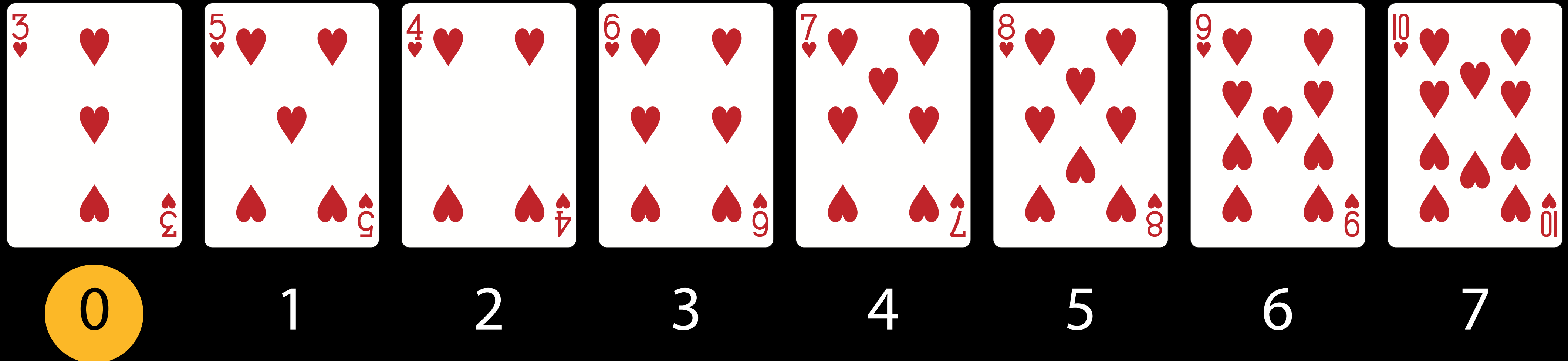
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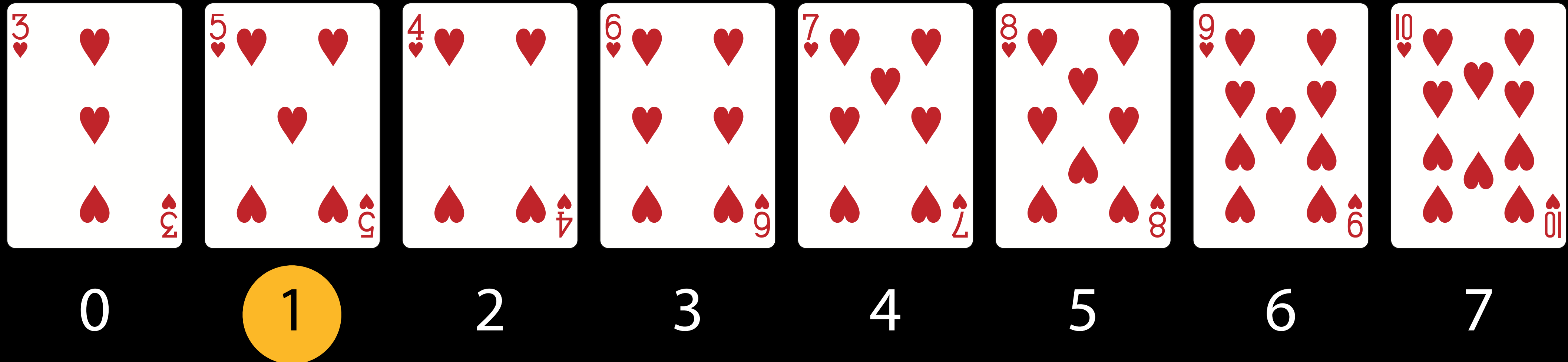
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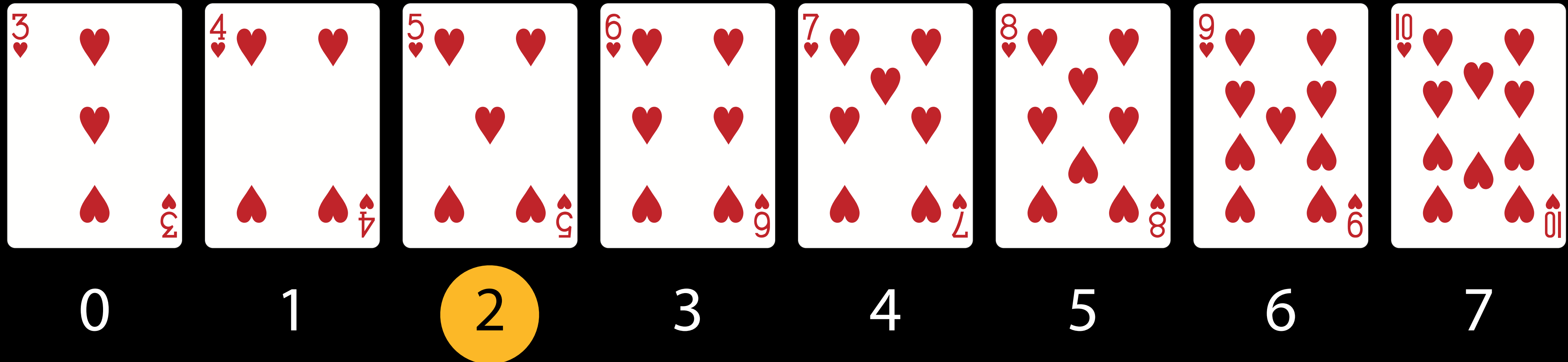
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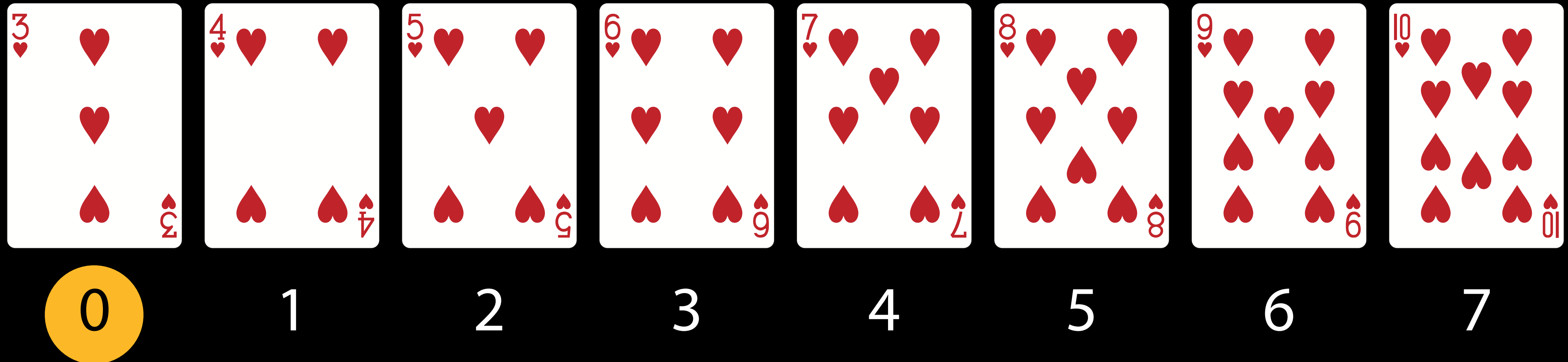
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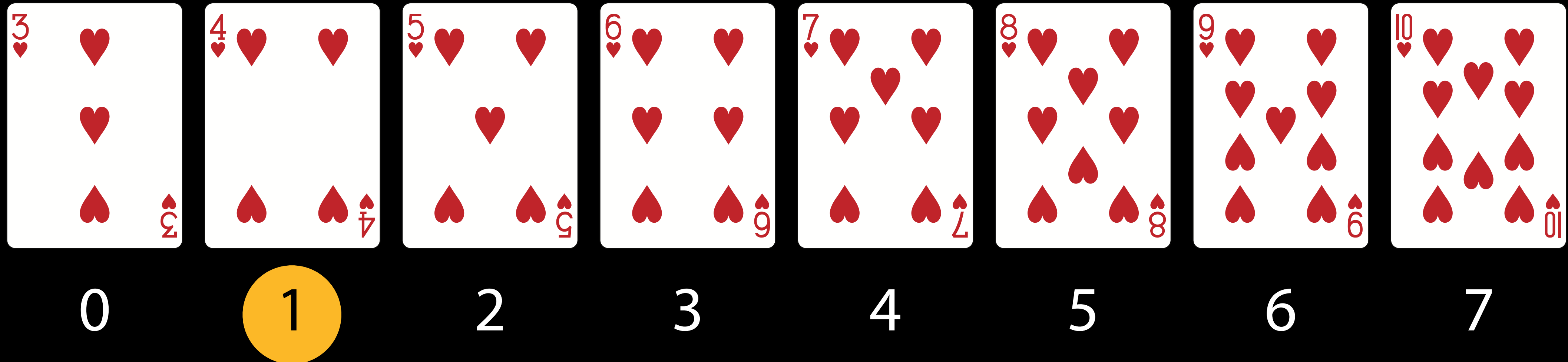
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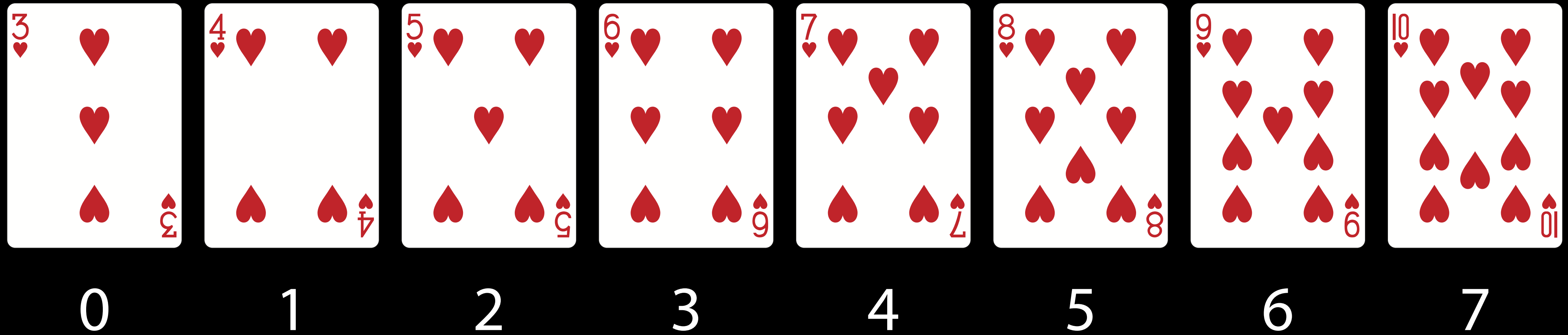
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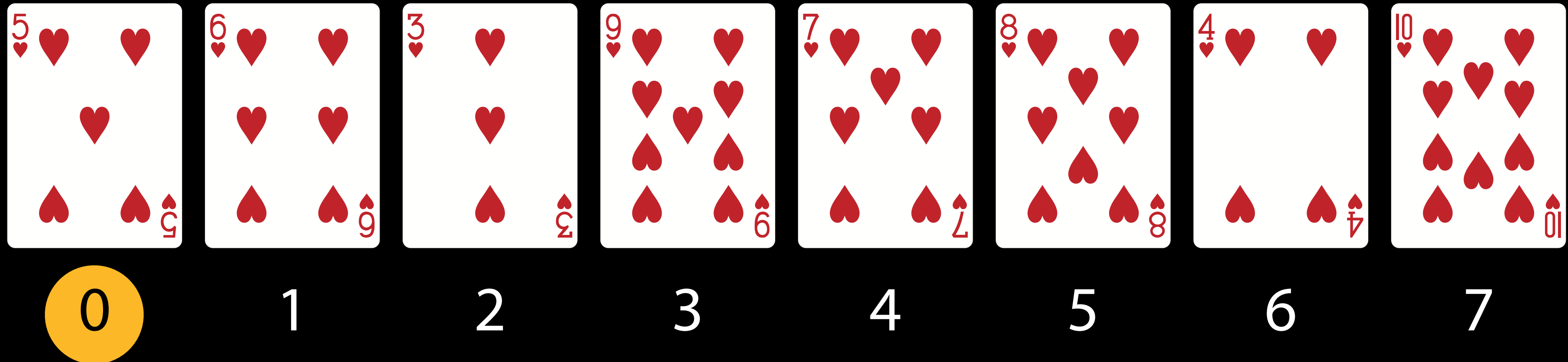


Selection sort

Find the smallest item in the unsorted part.

Swap this item to the front and “fix” it.

Repeat for unfixed items until all items are fixed.

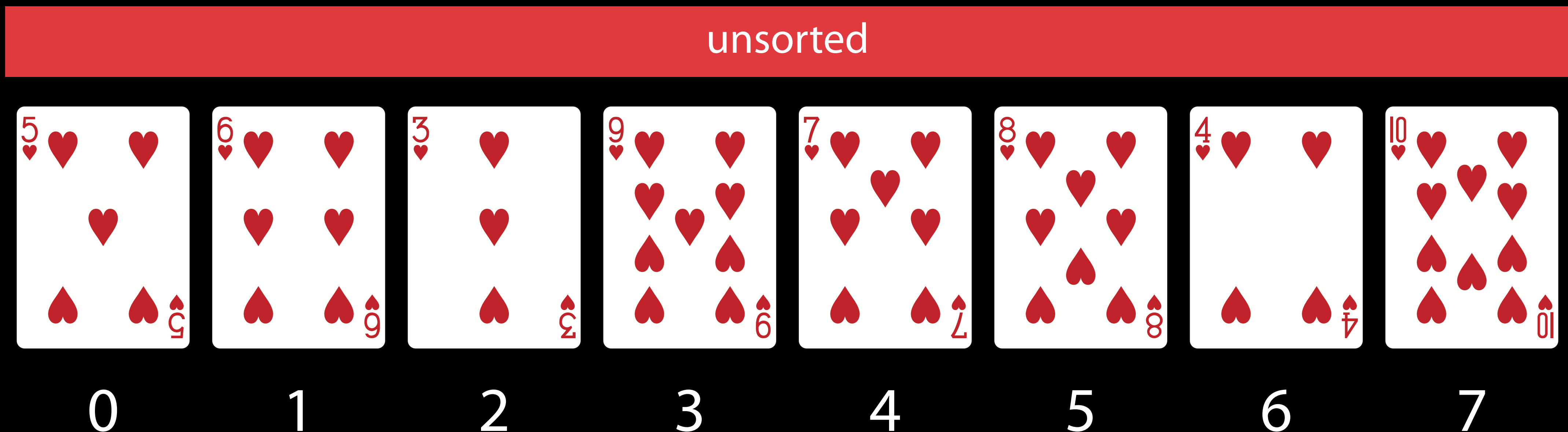


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

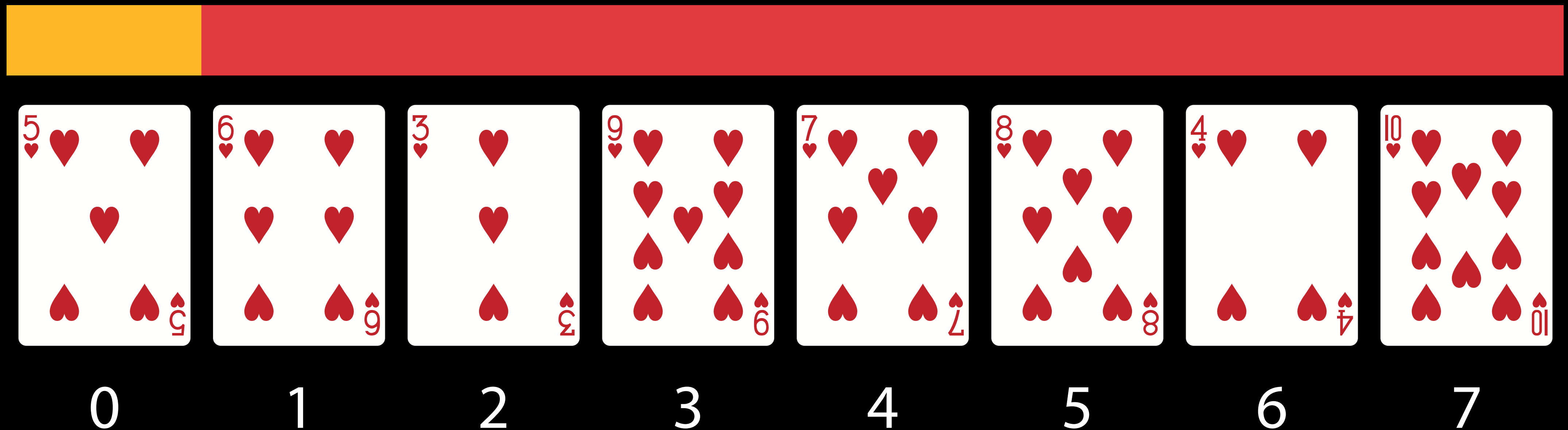


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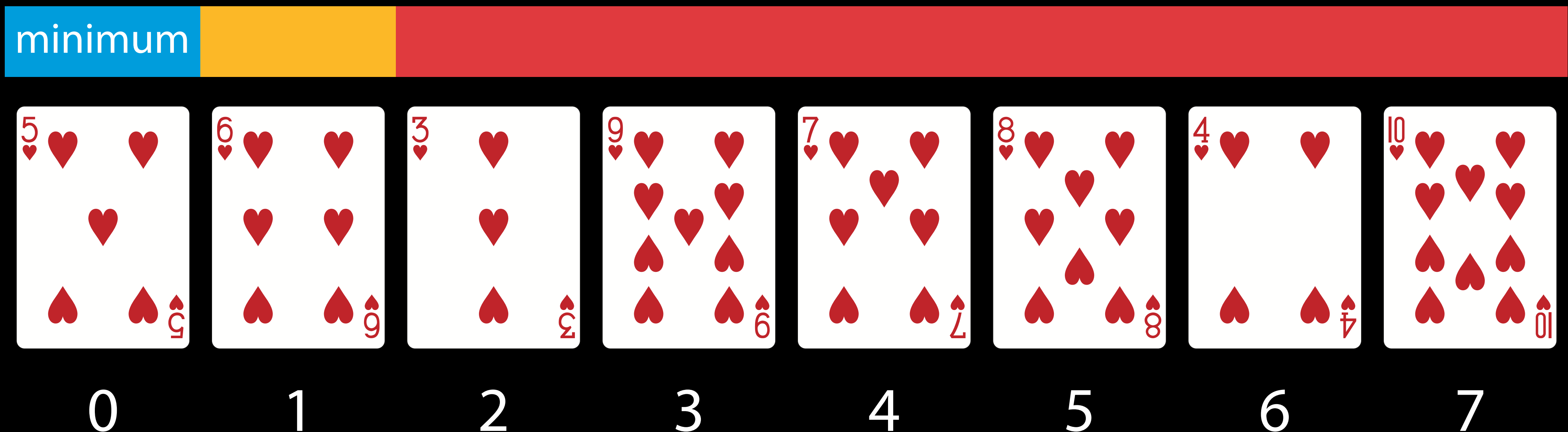


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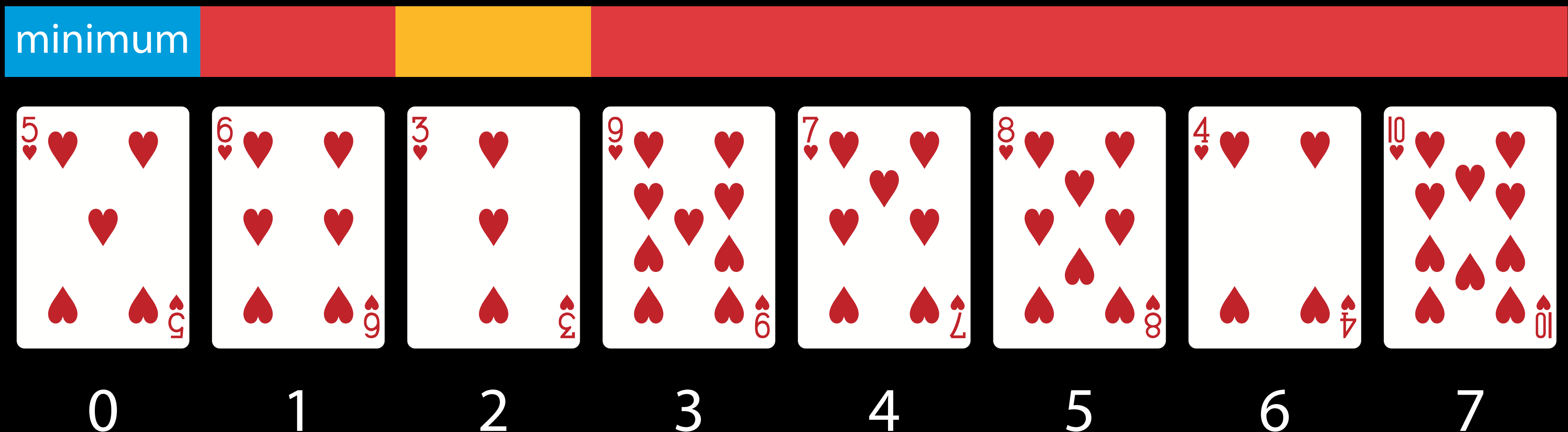


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Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

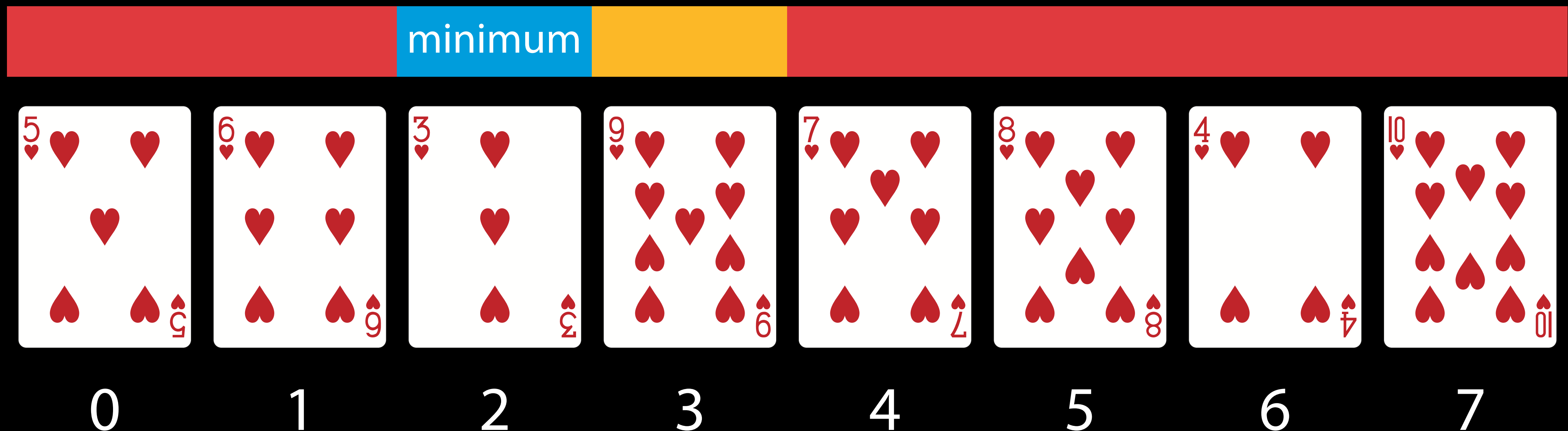


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

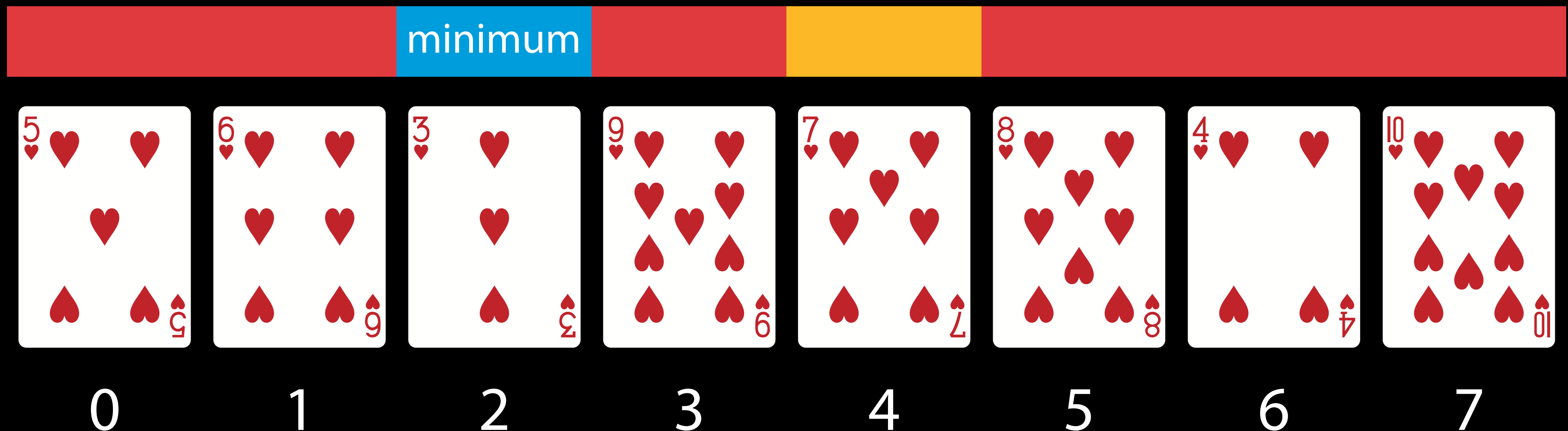


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

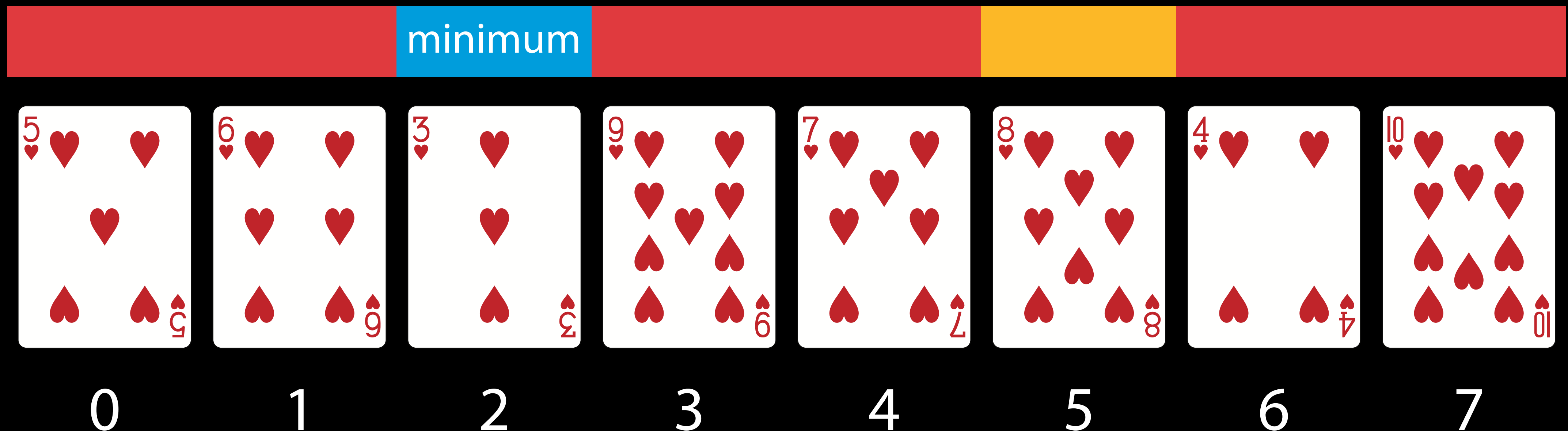


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

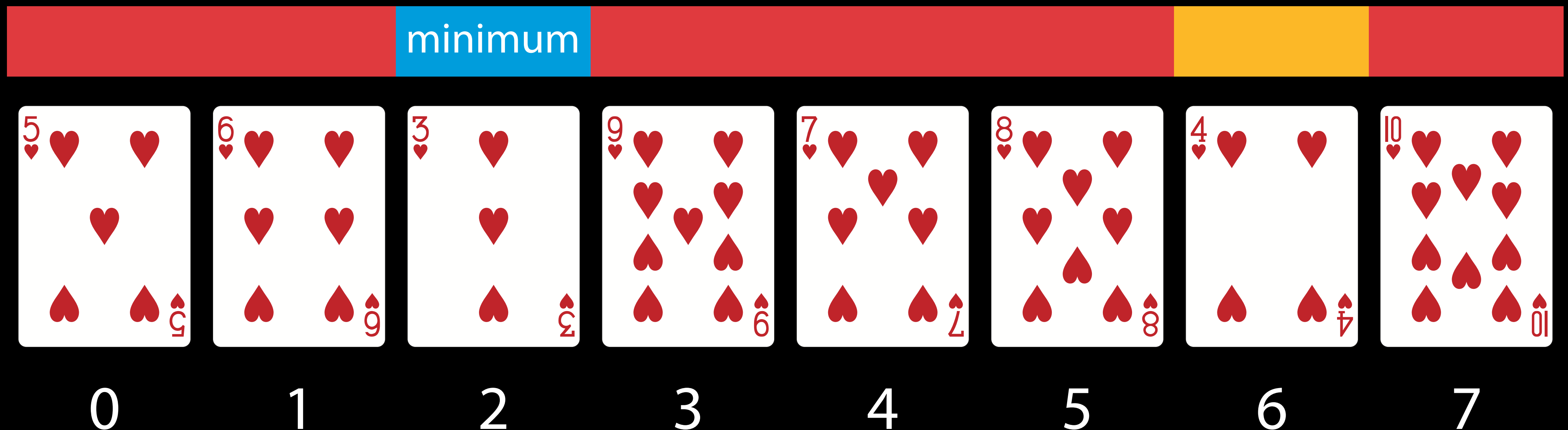


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

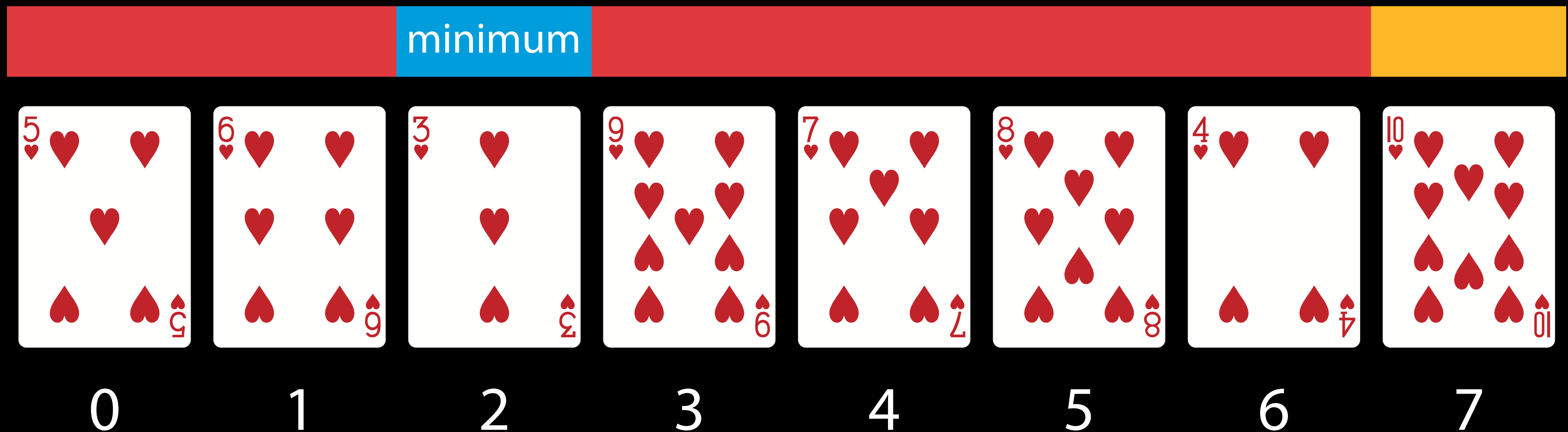


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

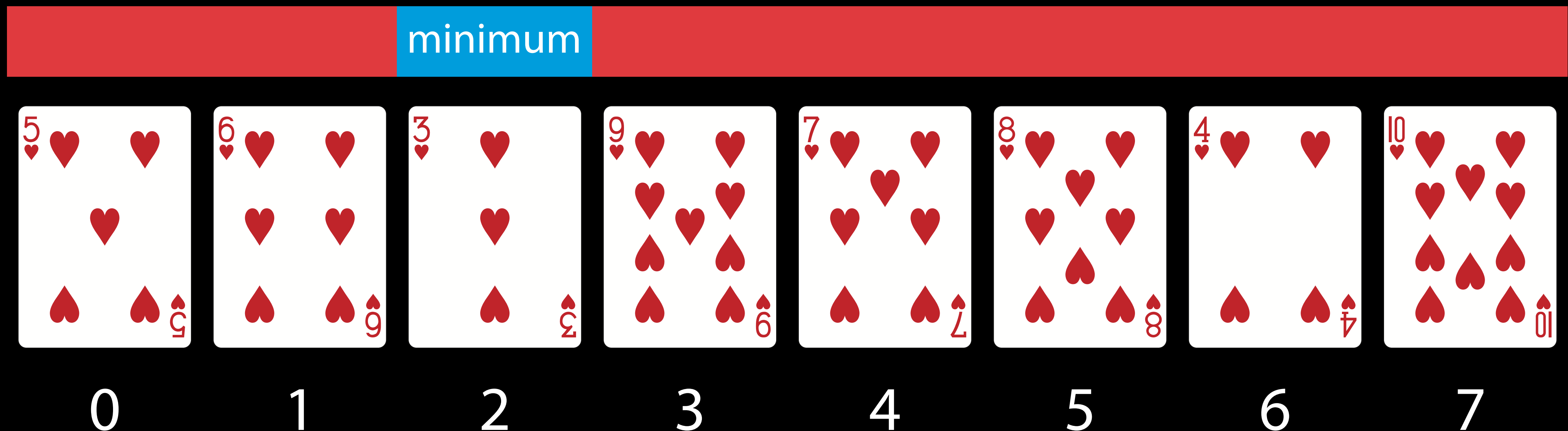


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

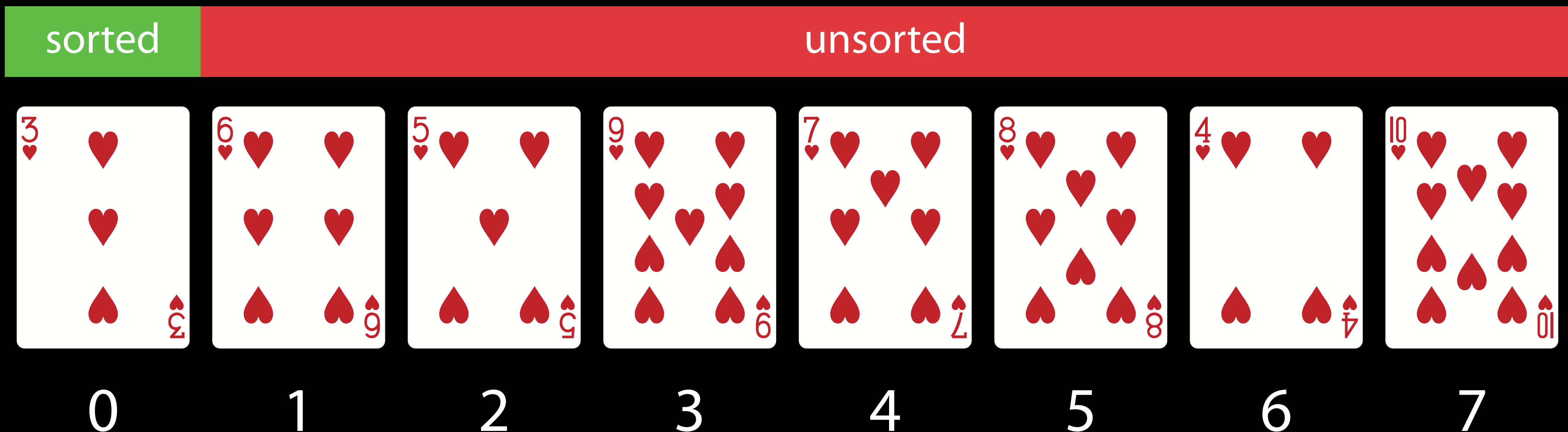


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

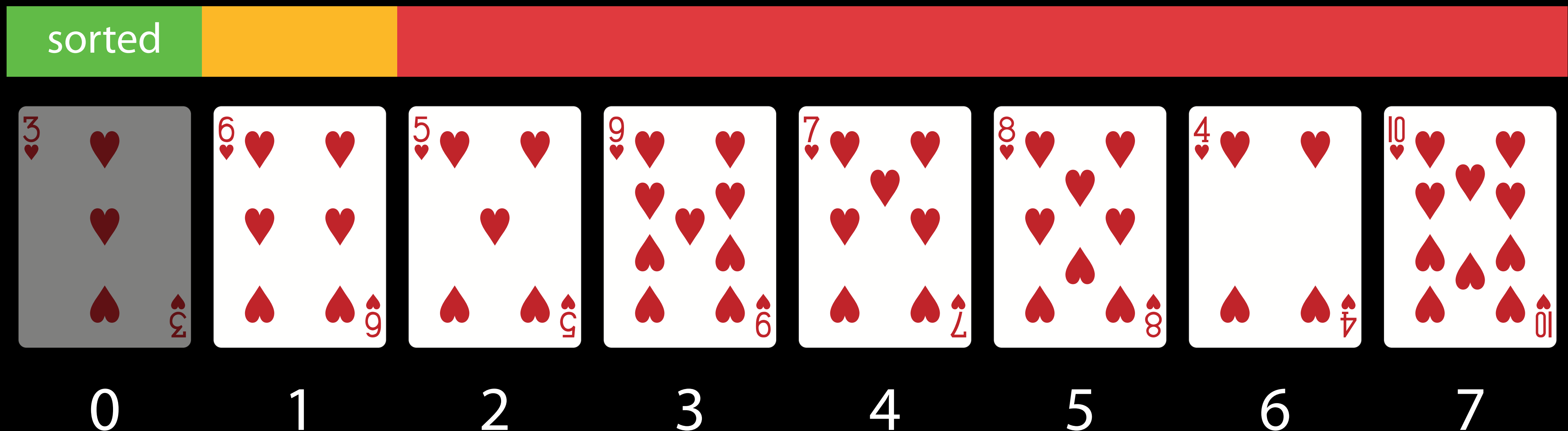


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

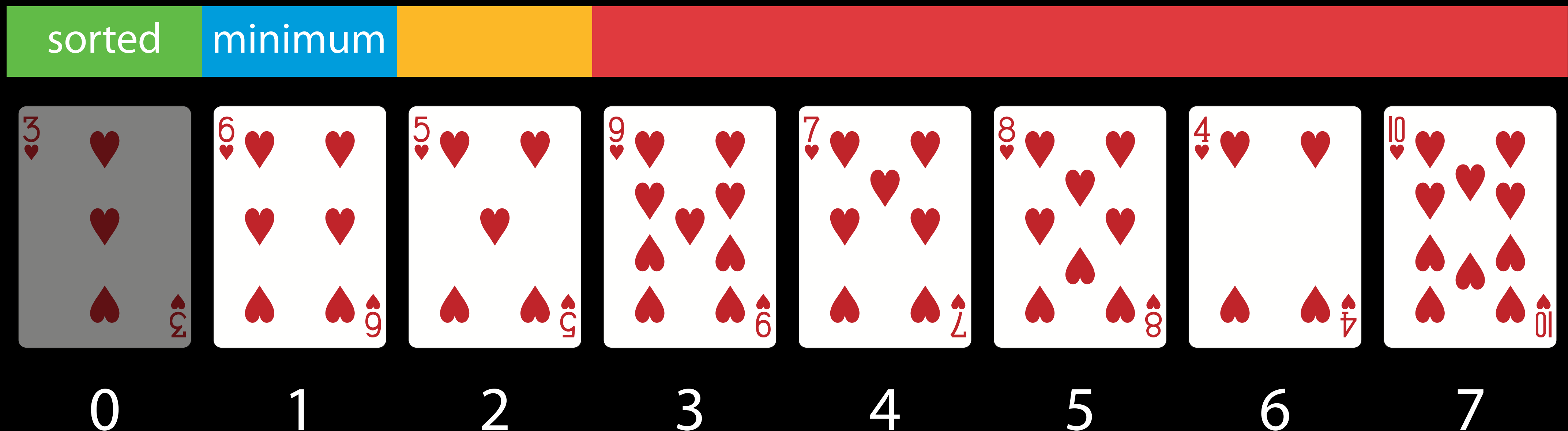


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

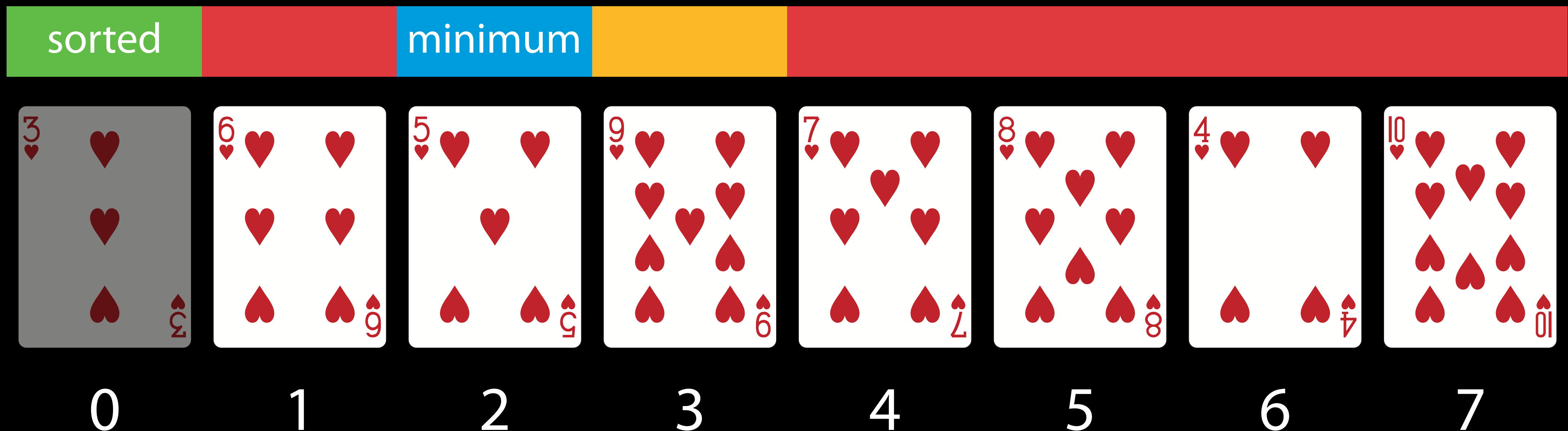


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

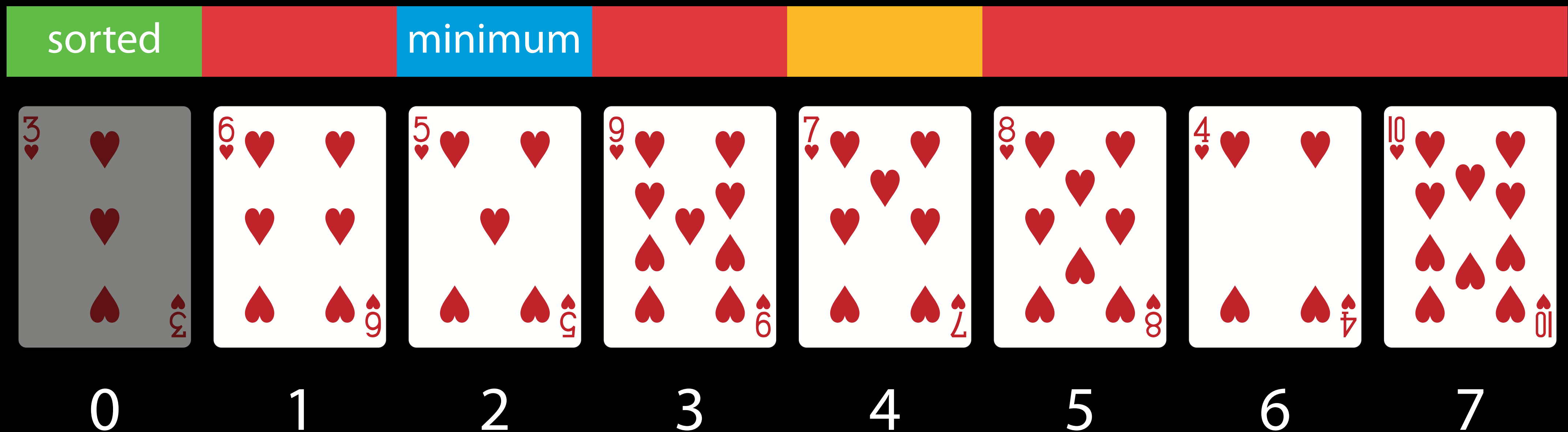


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

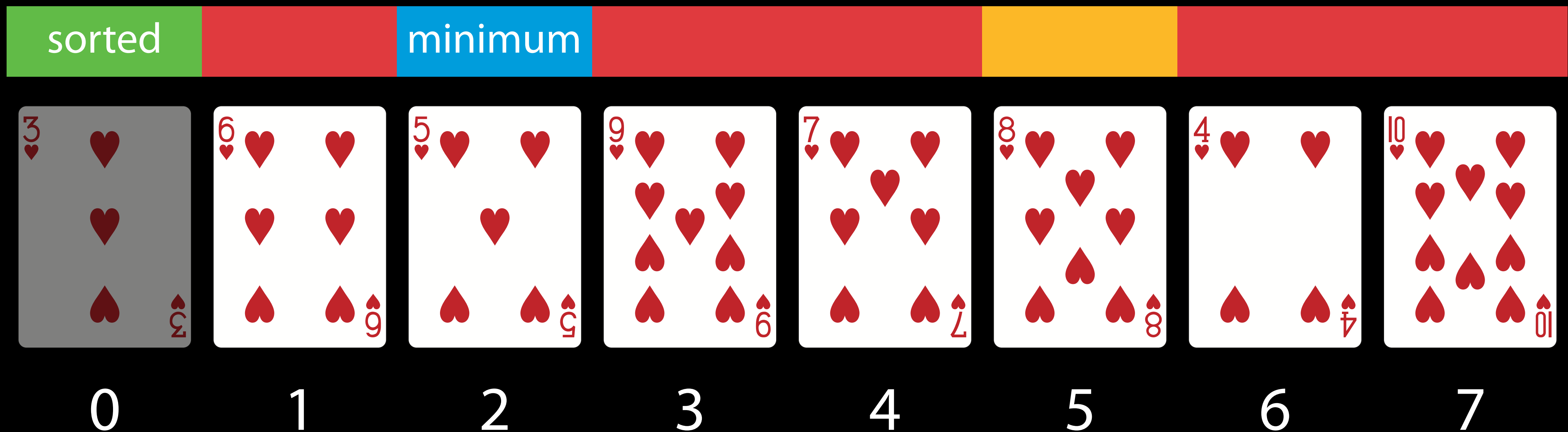


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

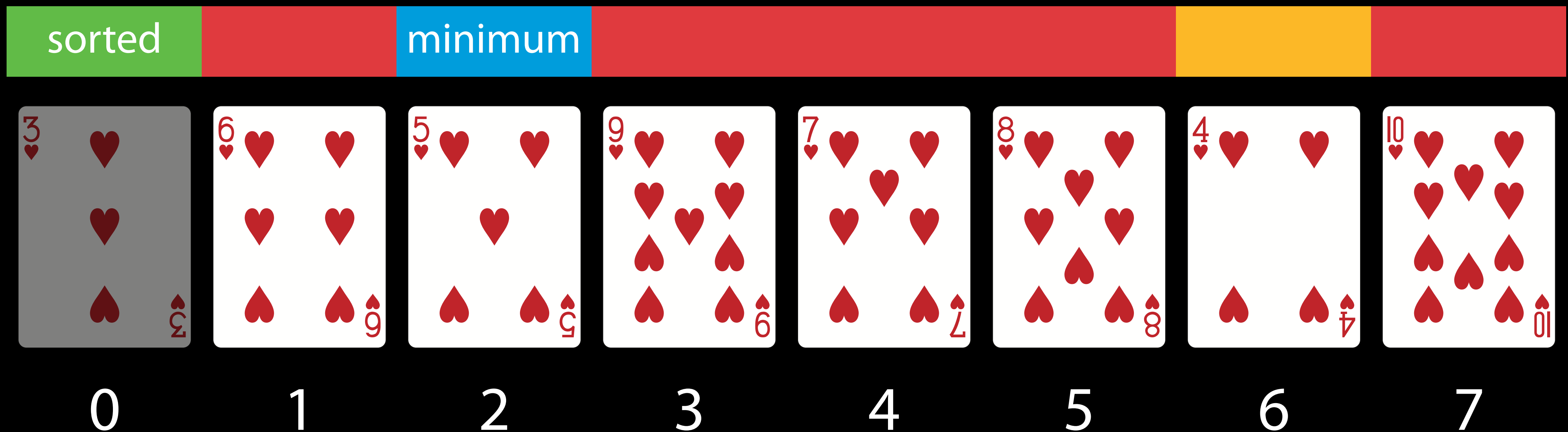


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

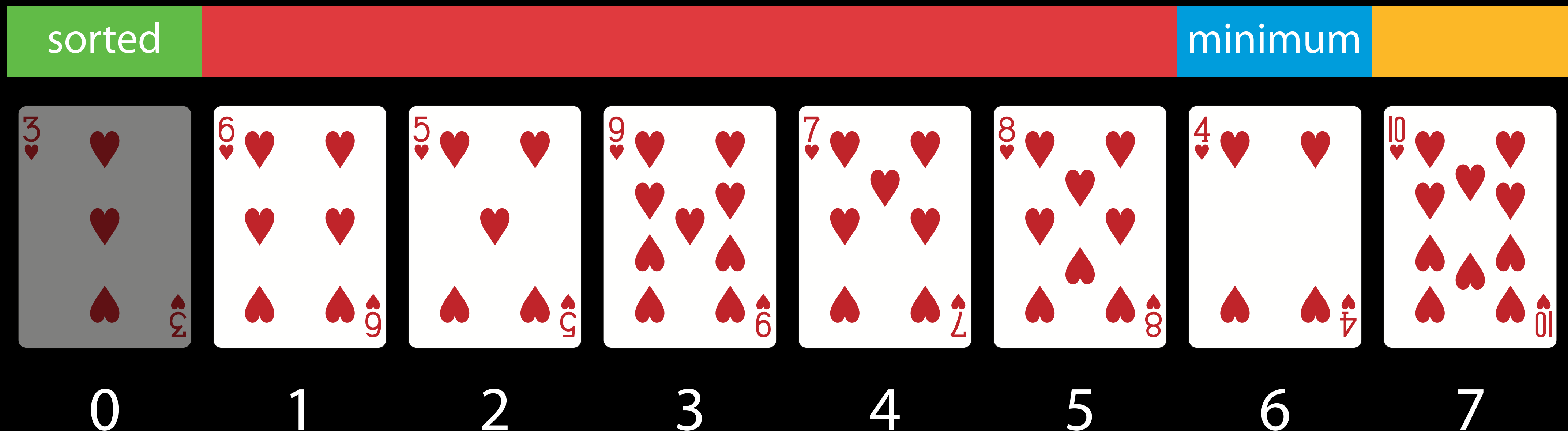


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

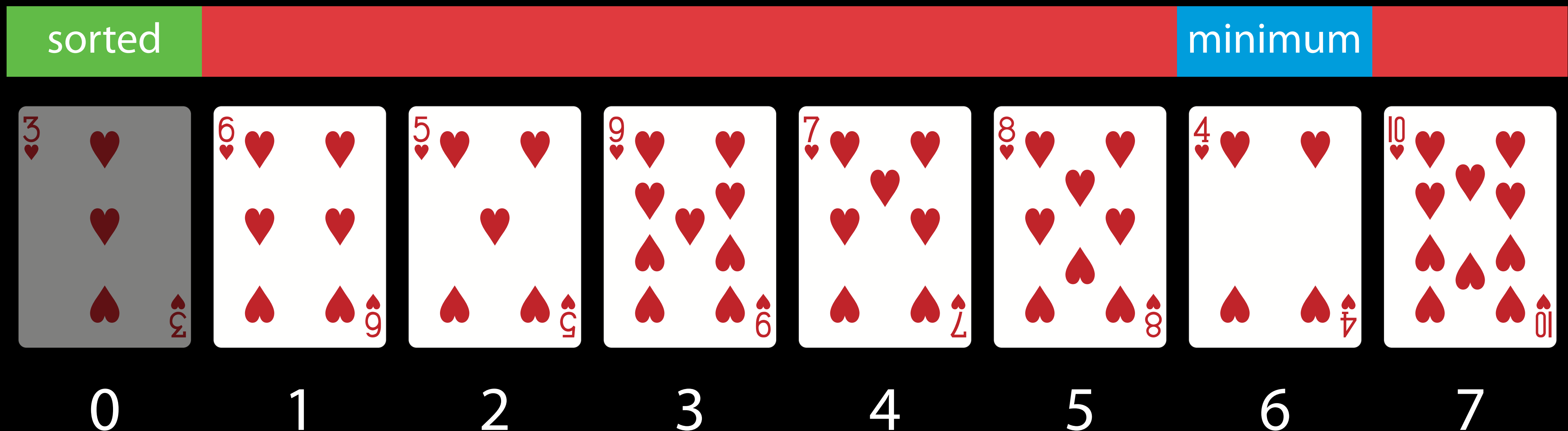


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

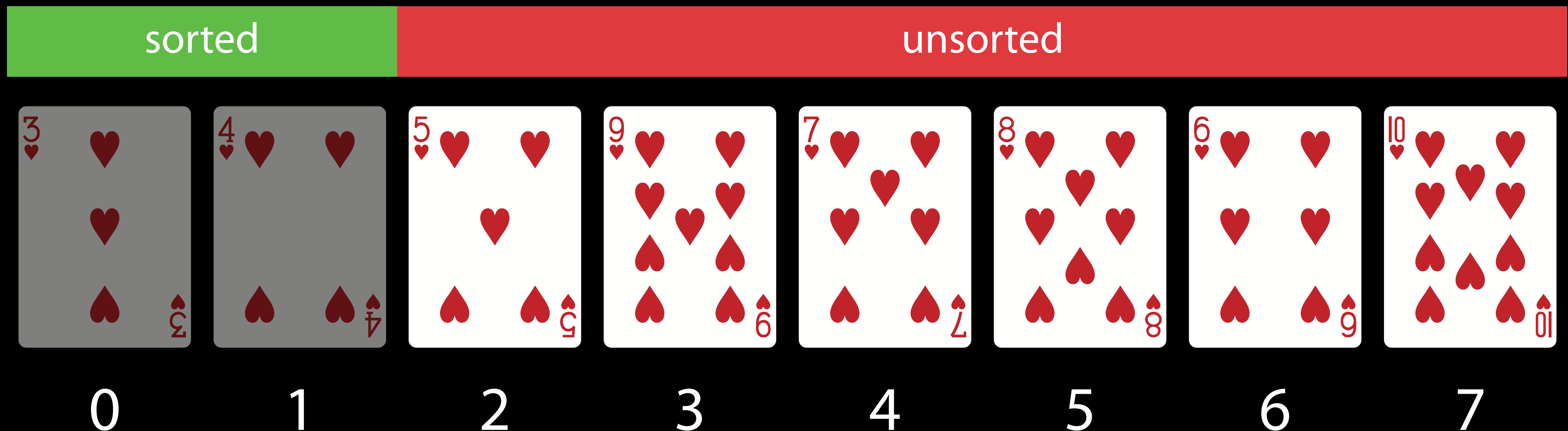


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

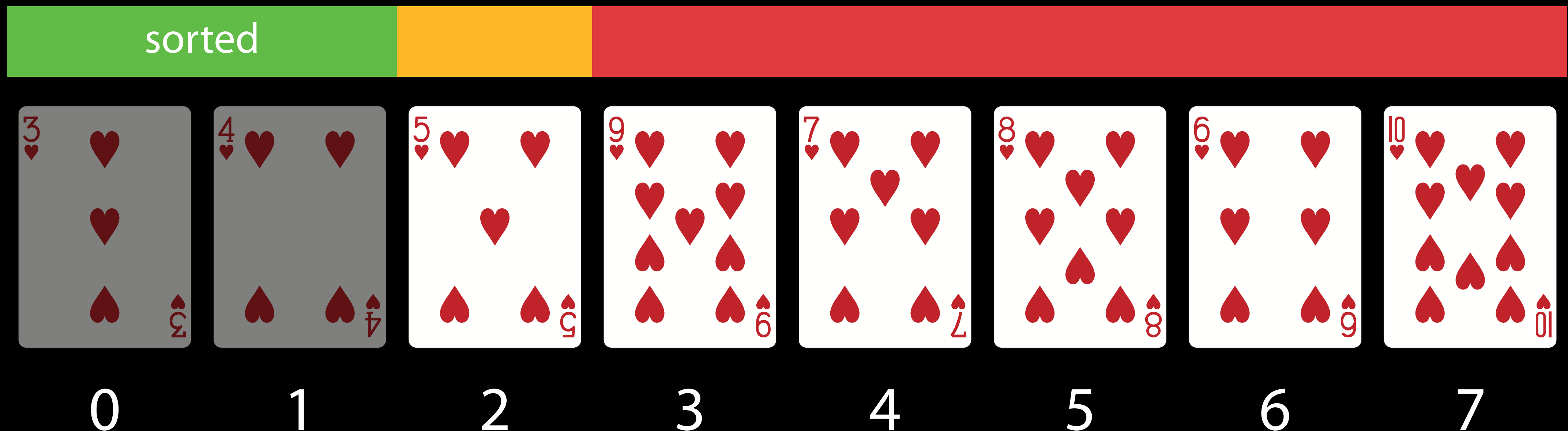


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

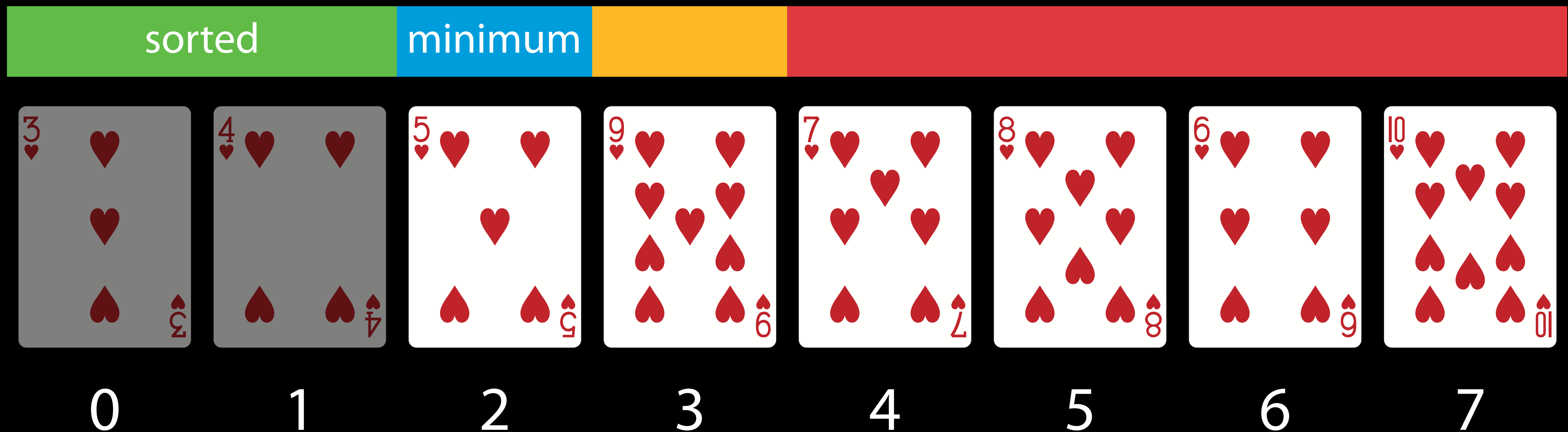


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

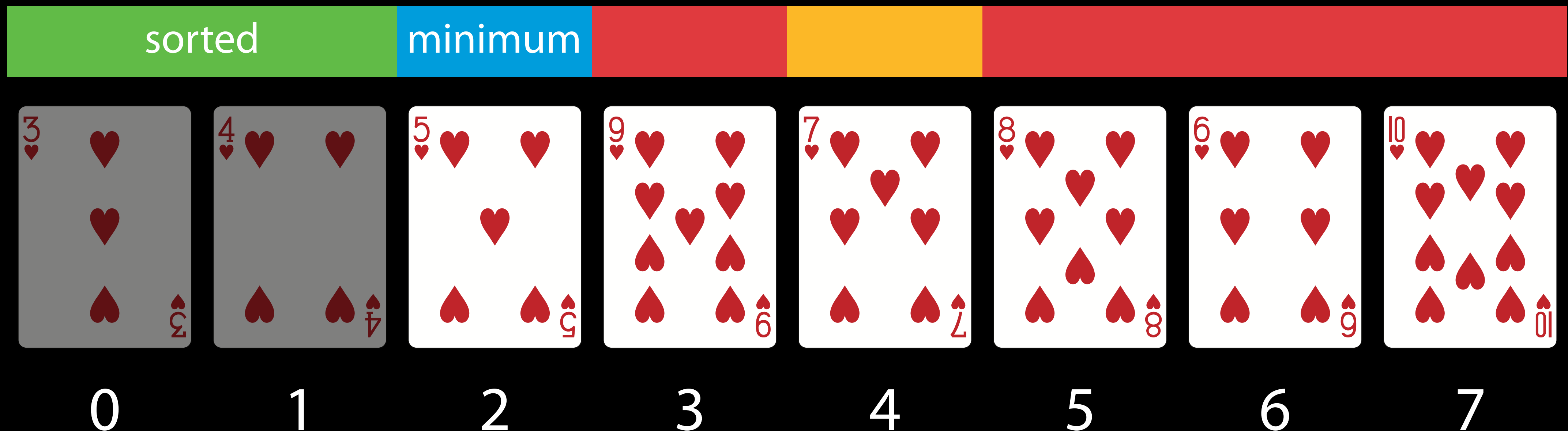


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

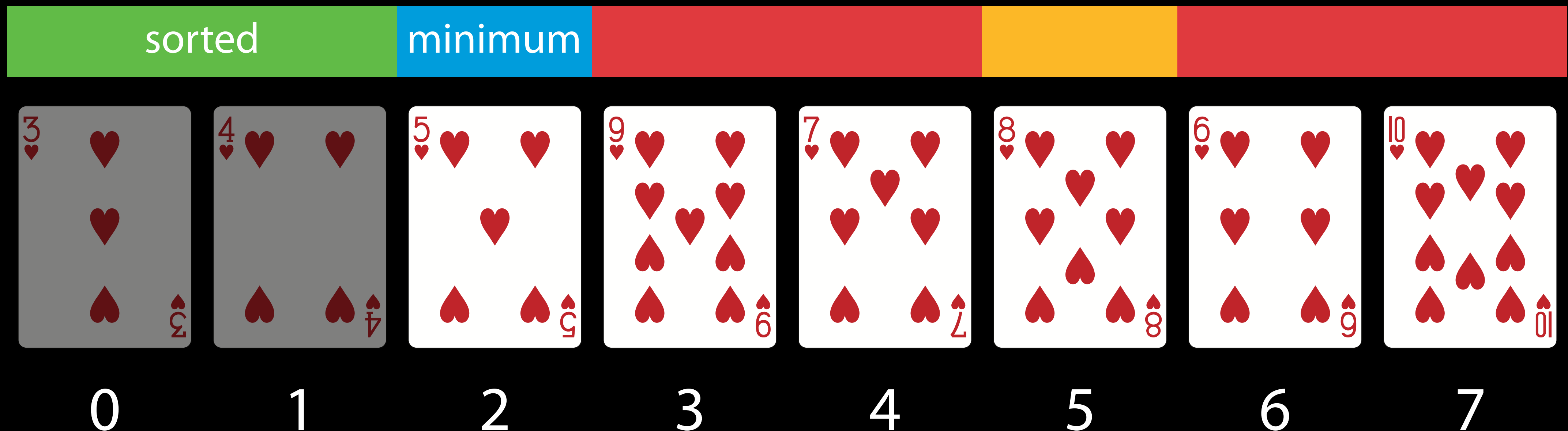


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

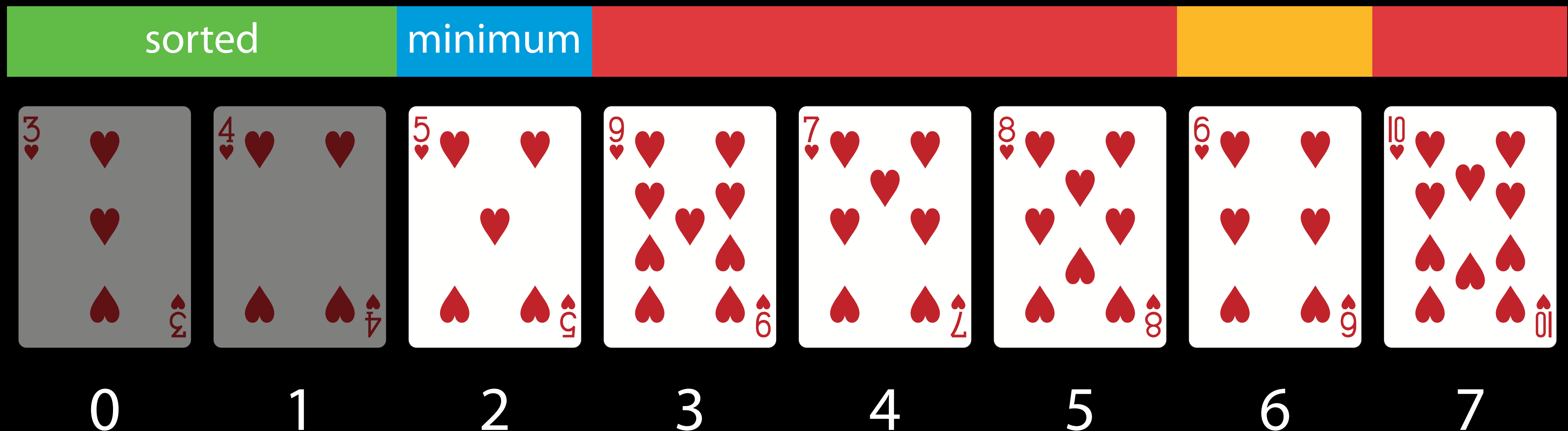


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

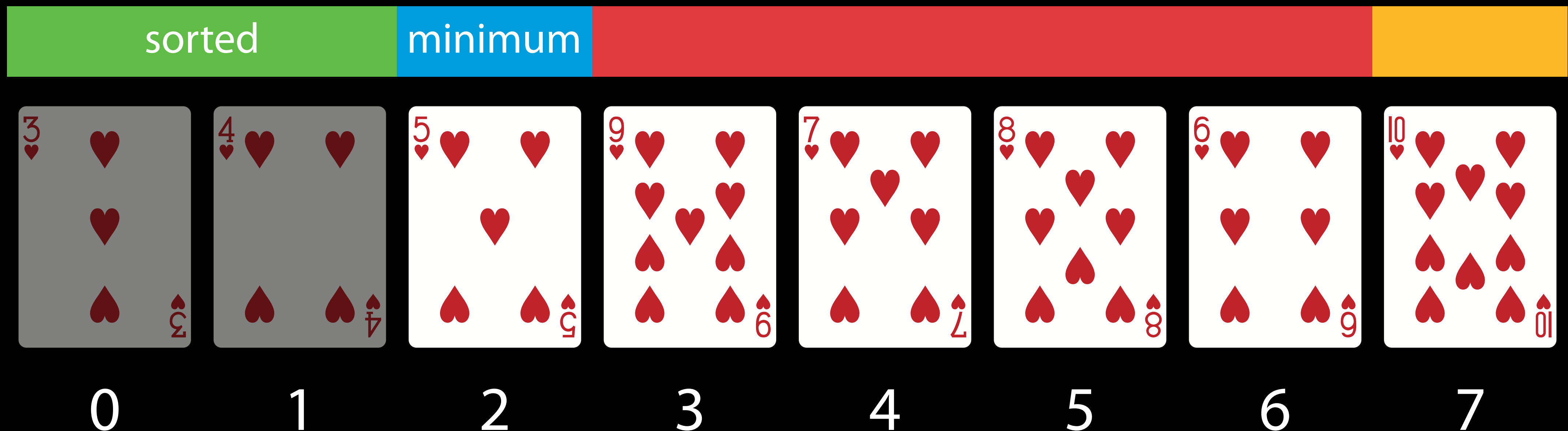


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

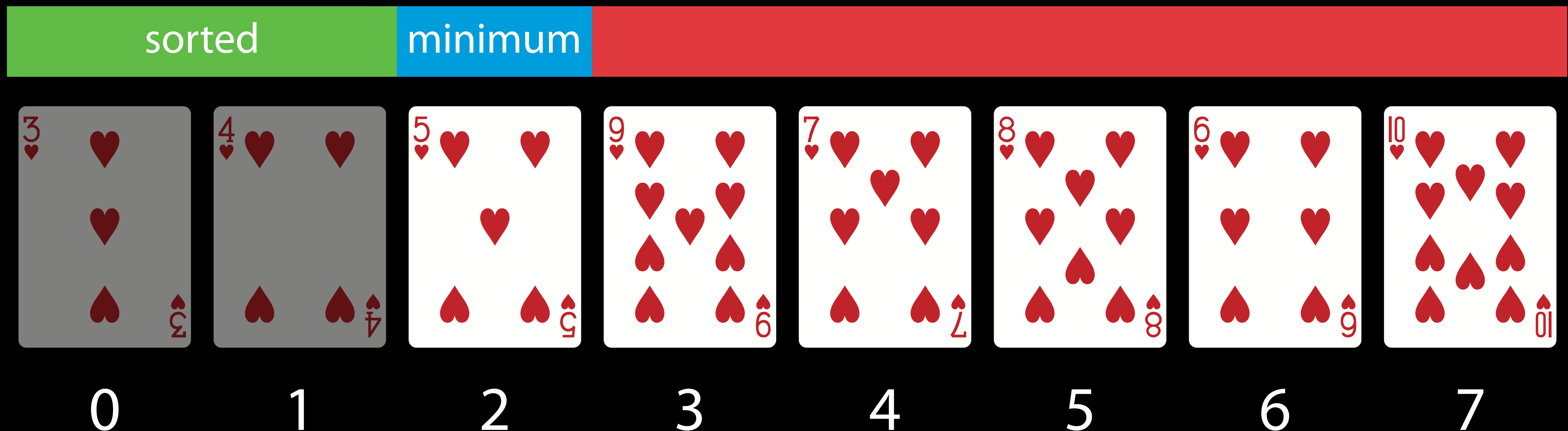


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

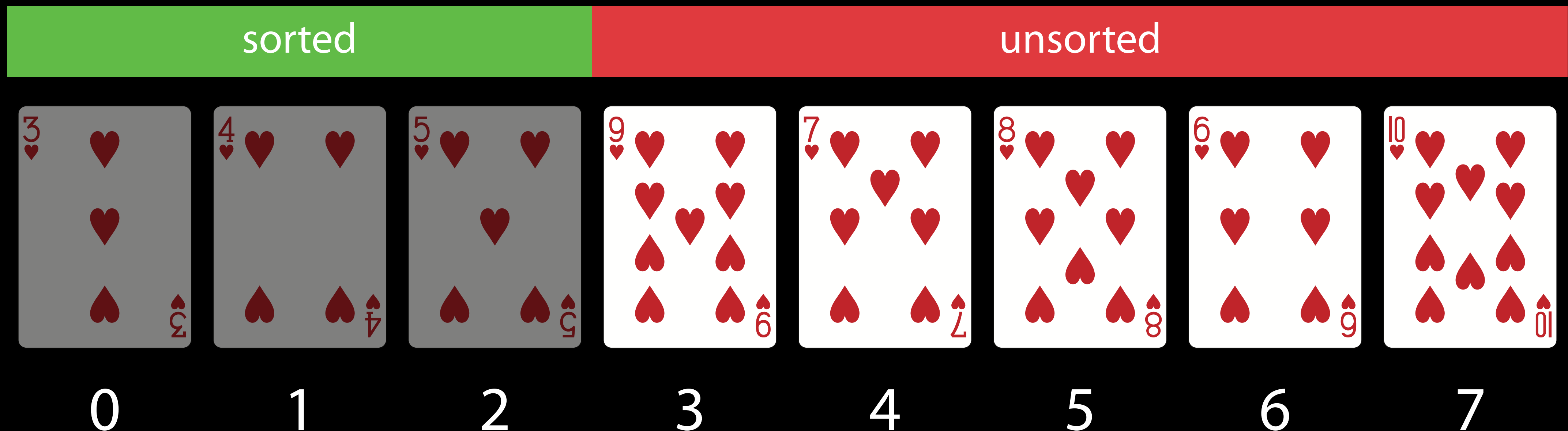


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

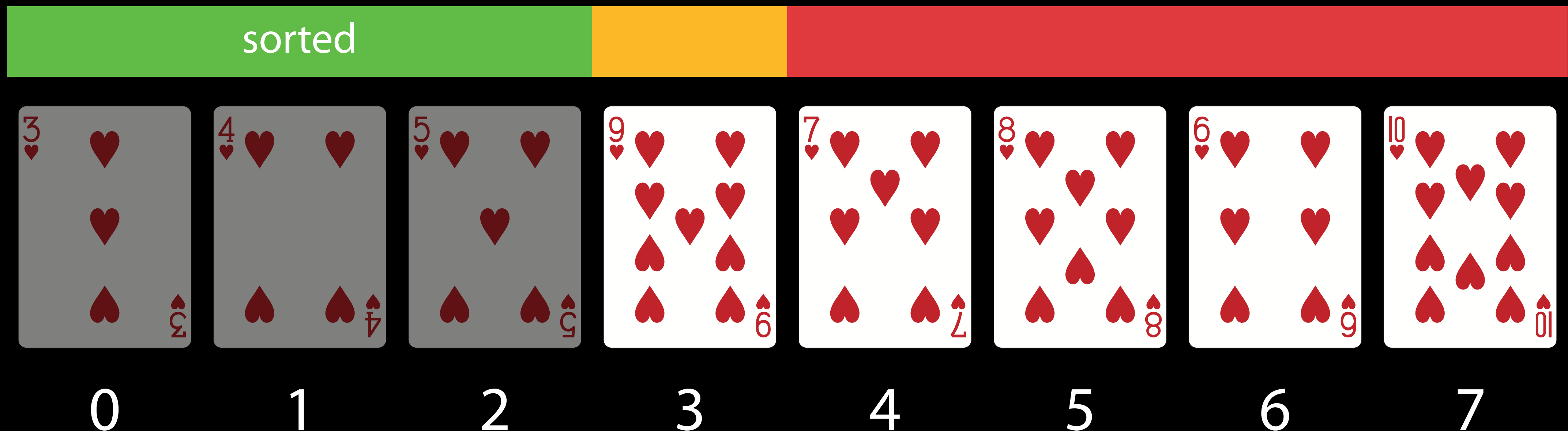


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

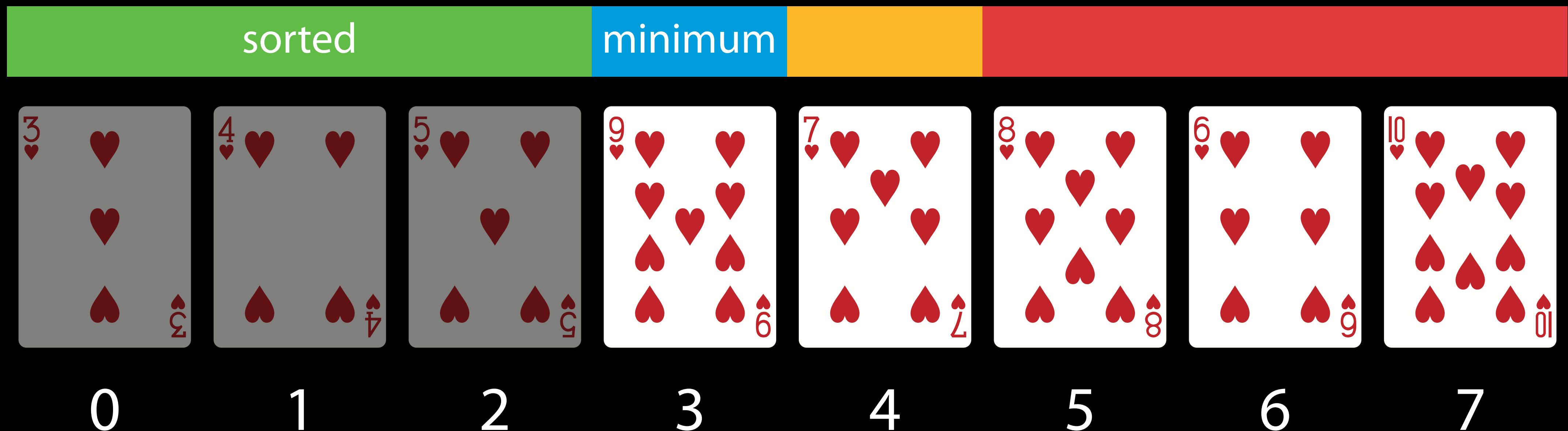


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

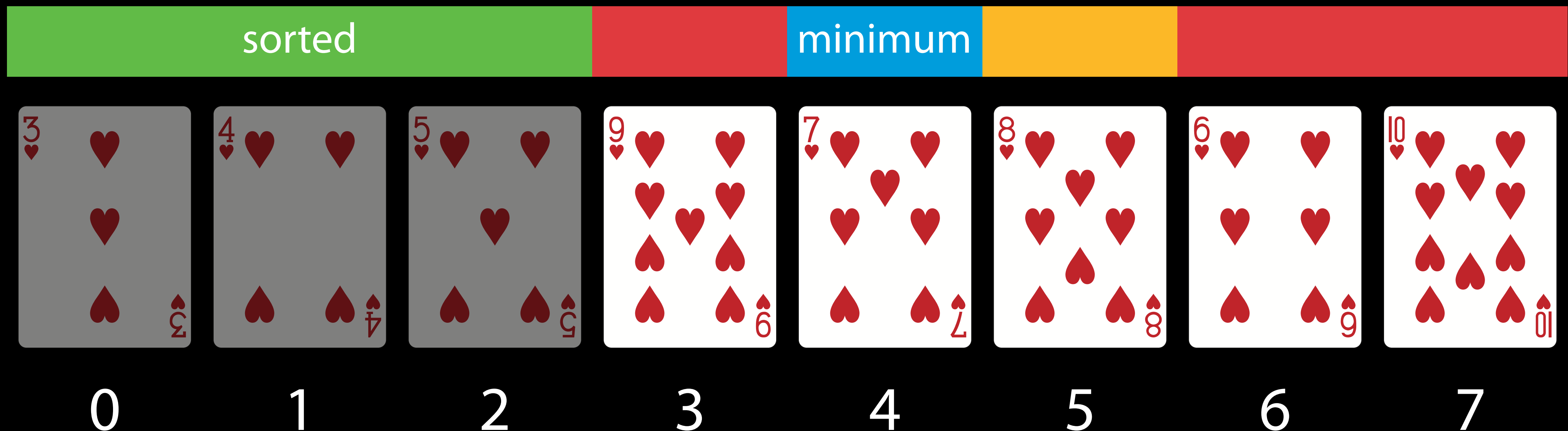


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

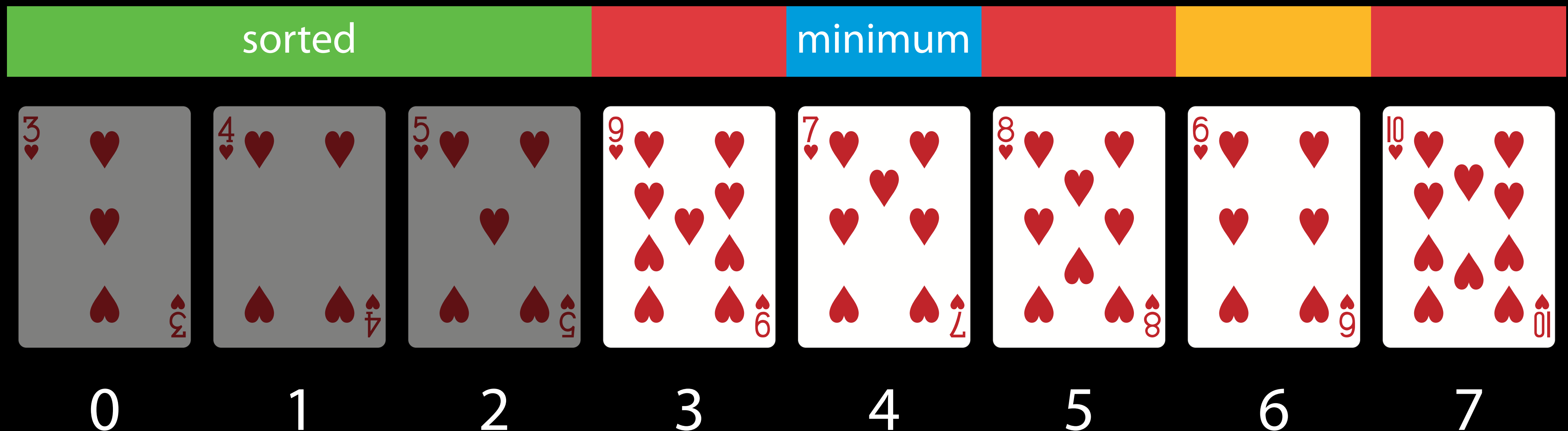


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

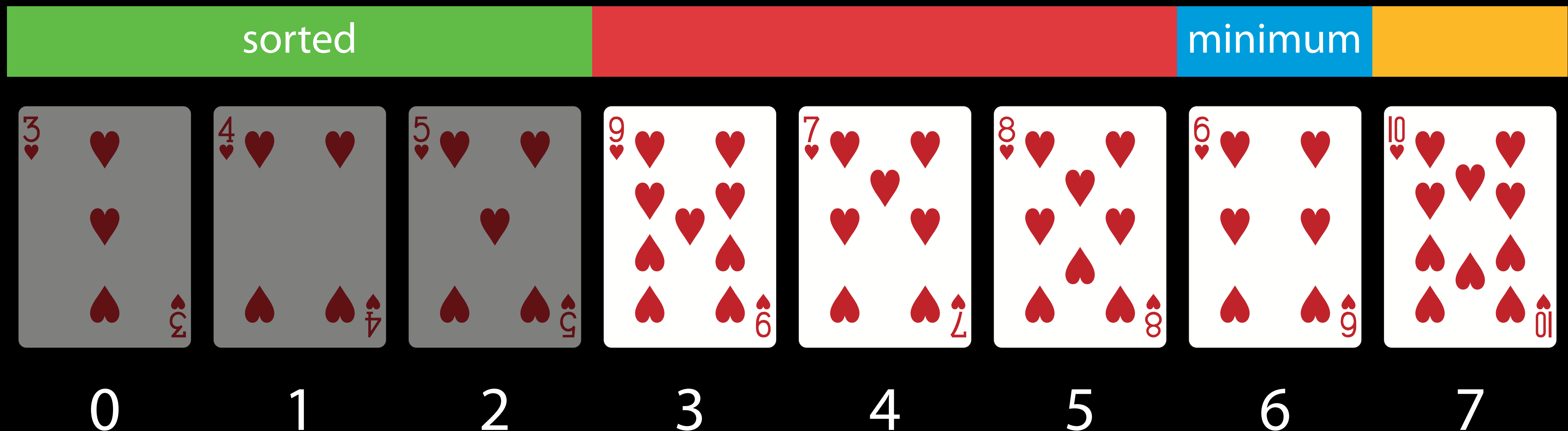


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

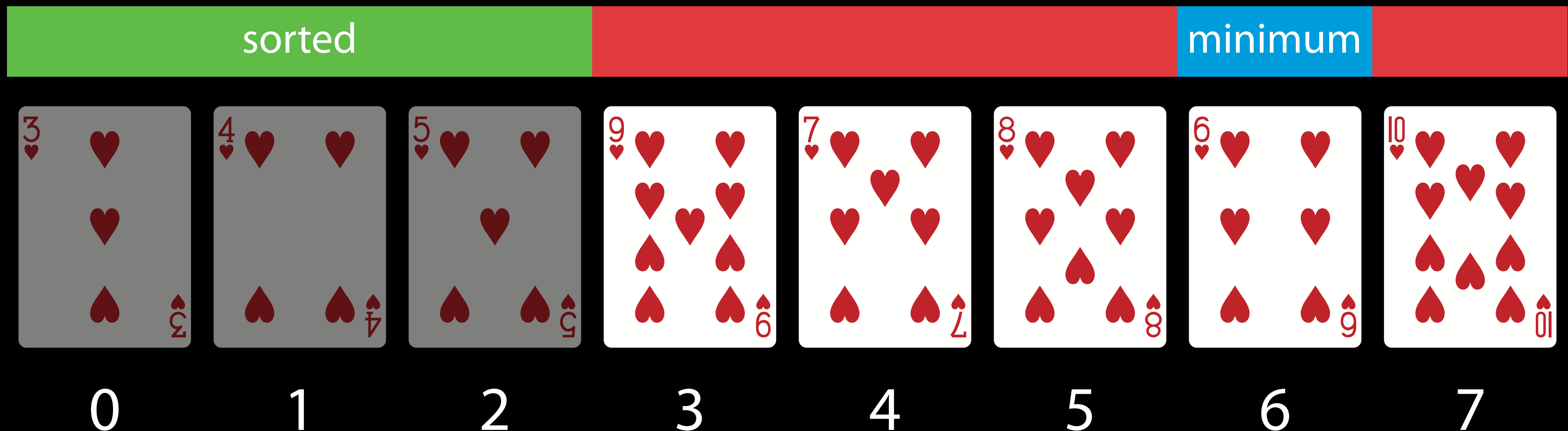


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

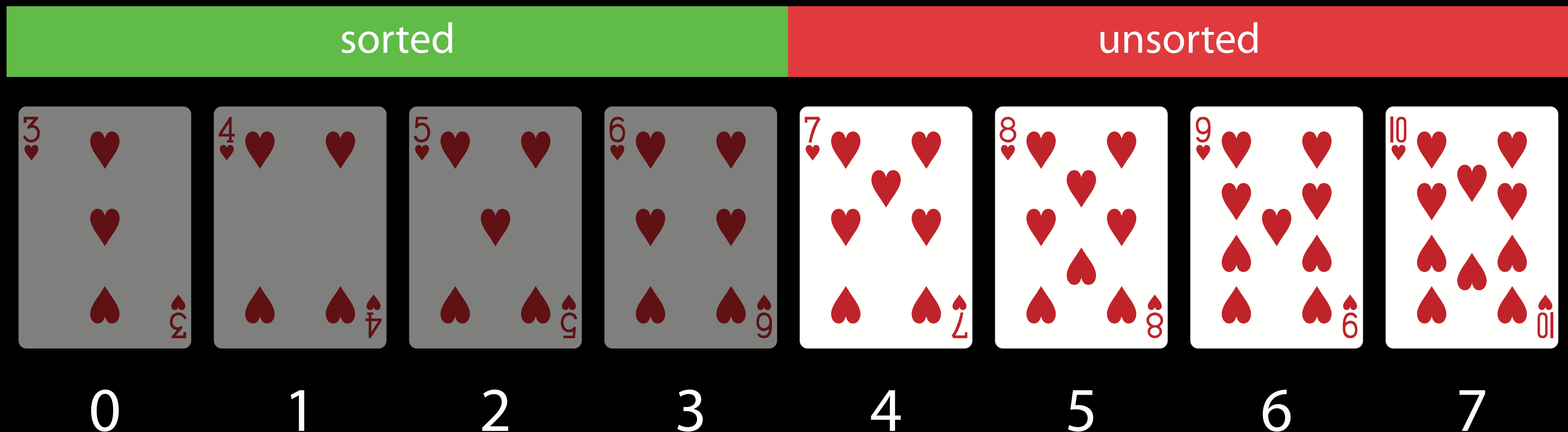


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

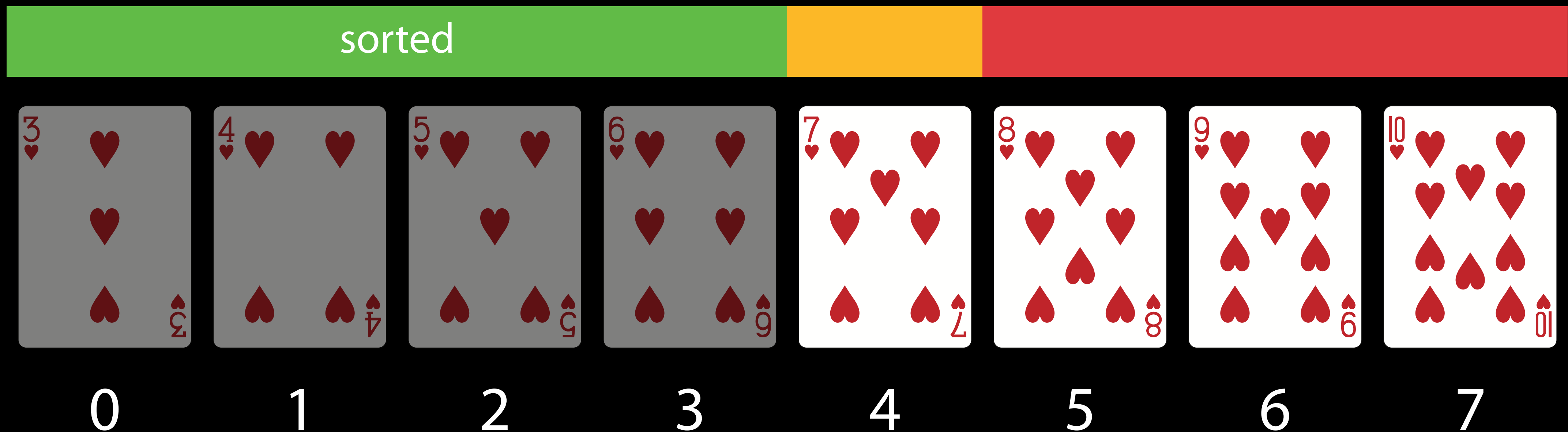


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

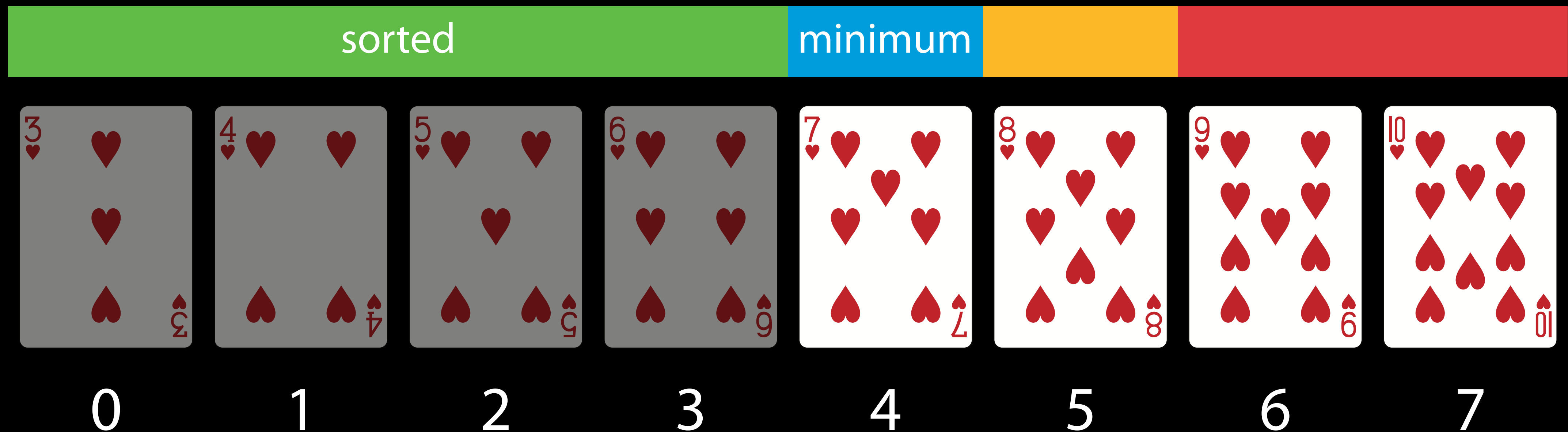


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

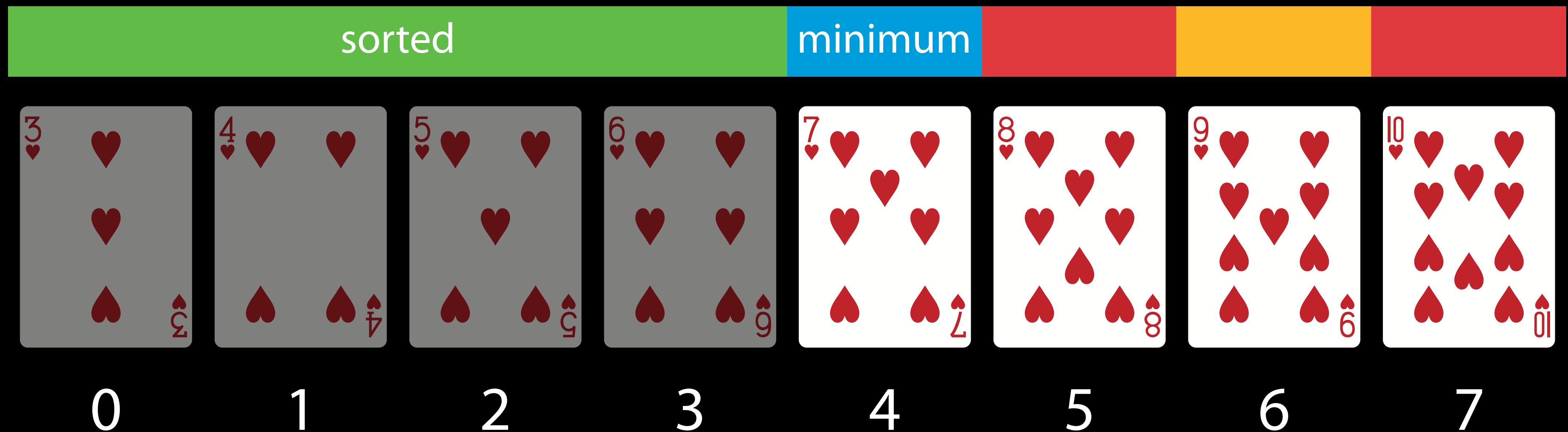


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

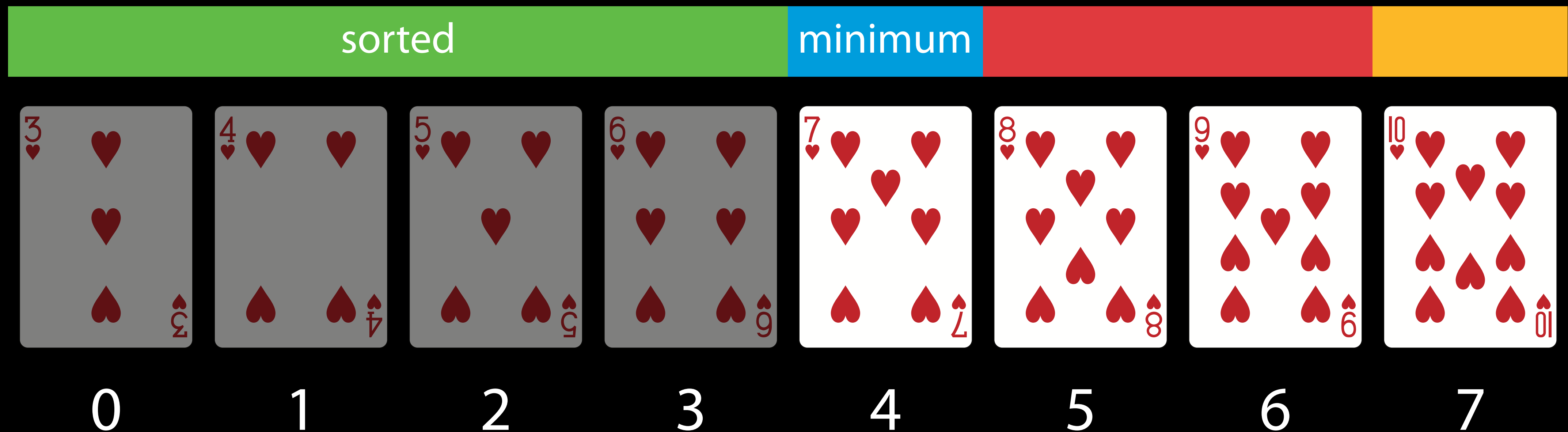


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

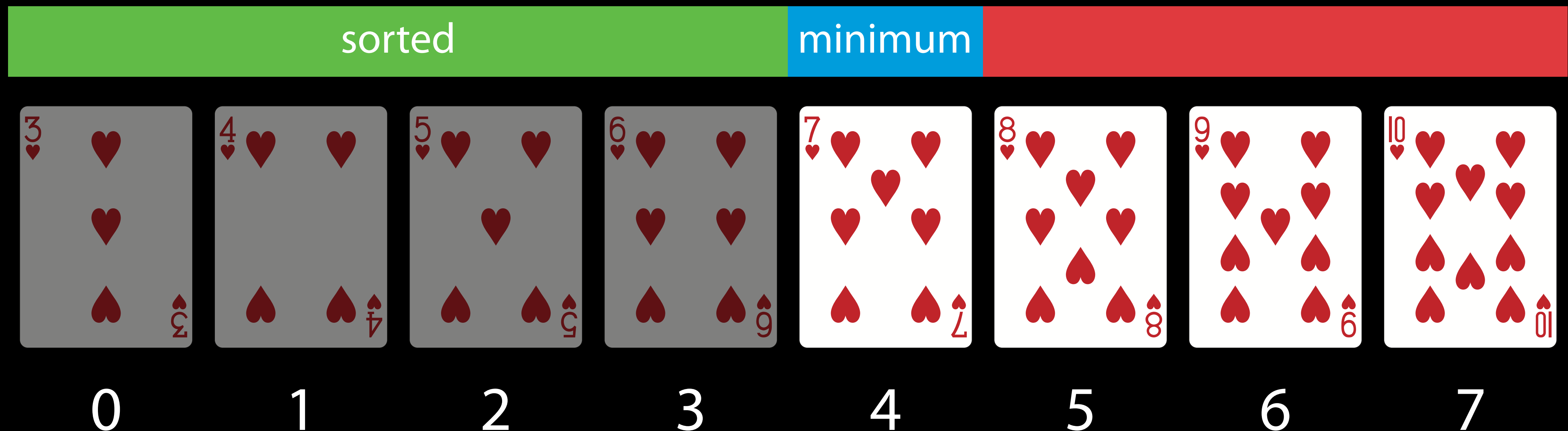


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

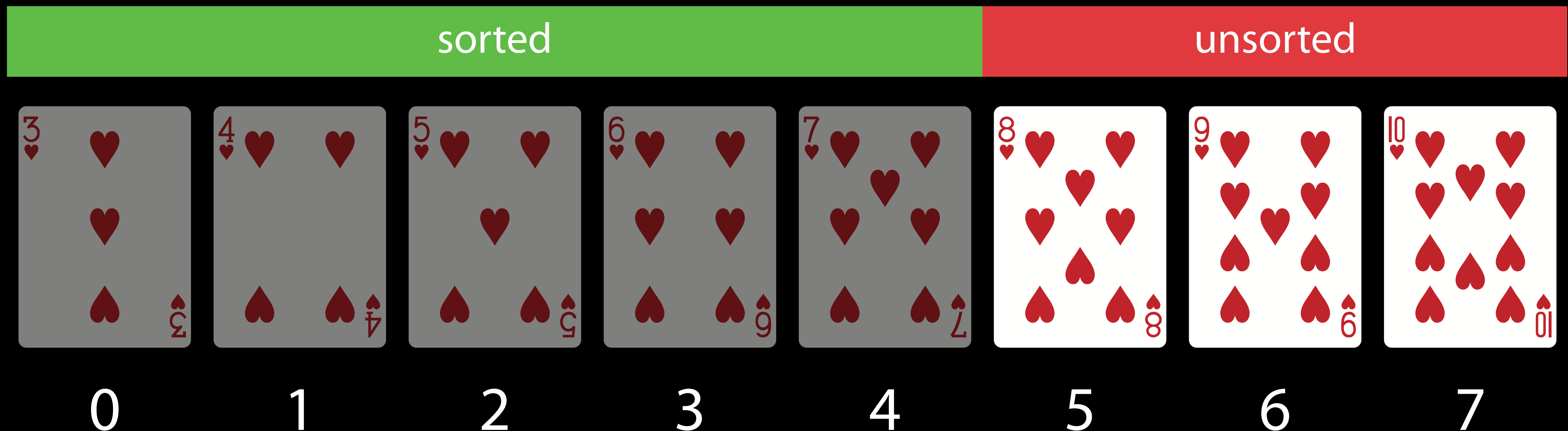


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

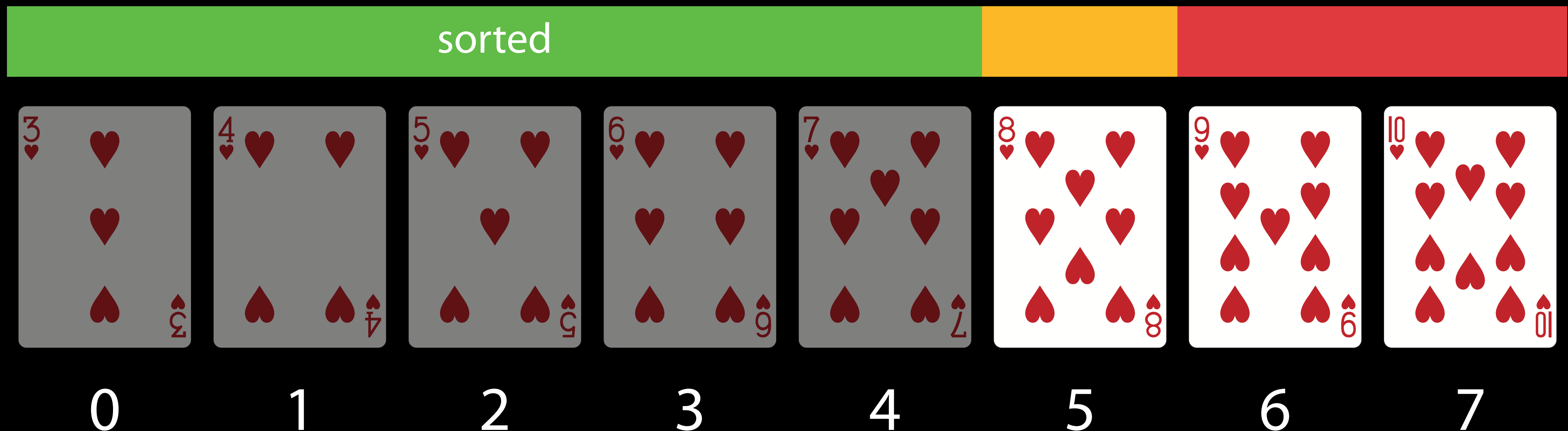


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

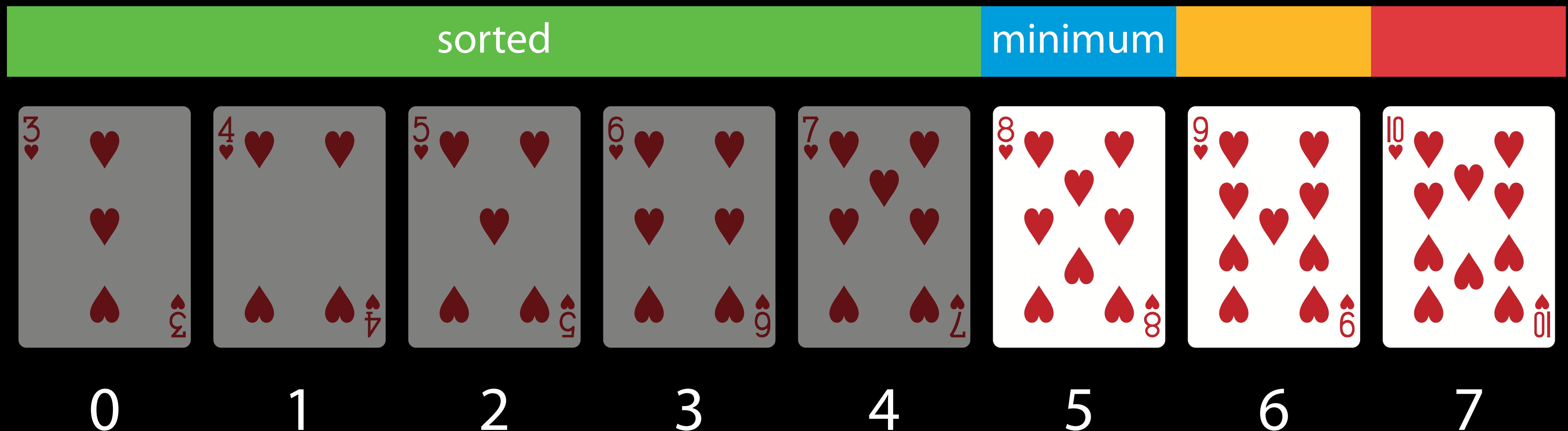


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

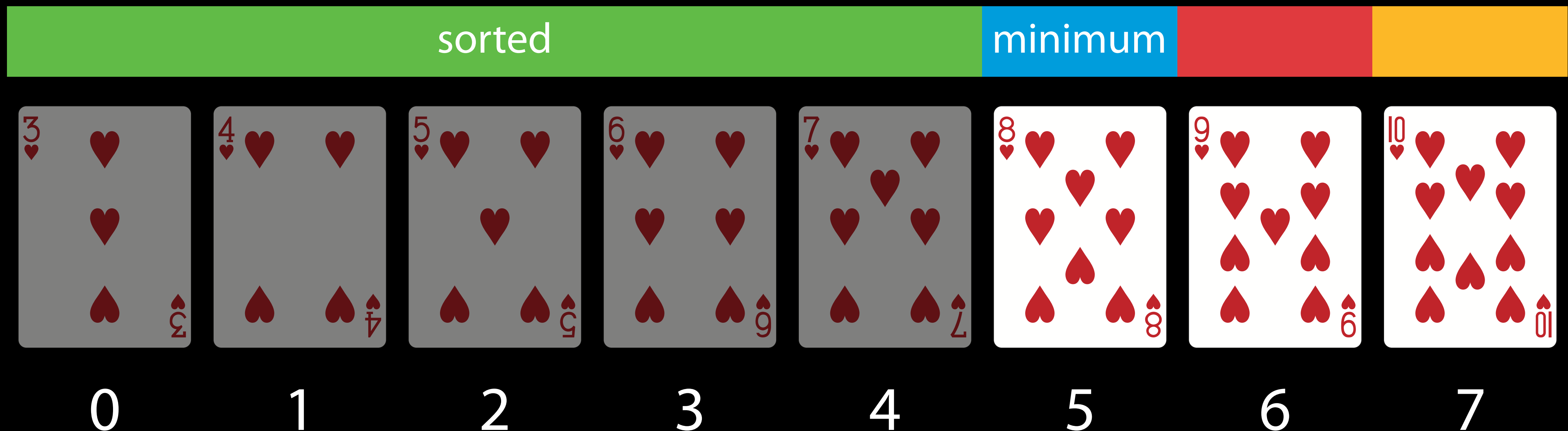


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

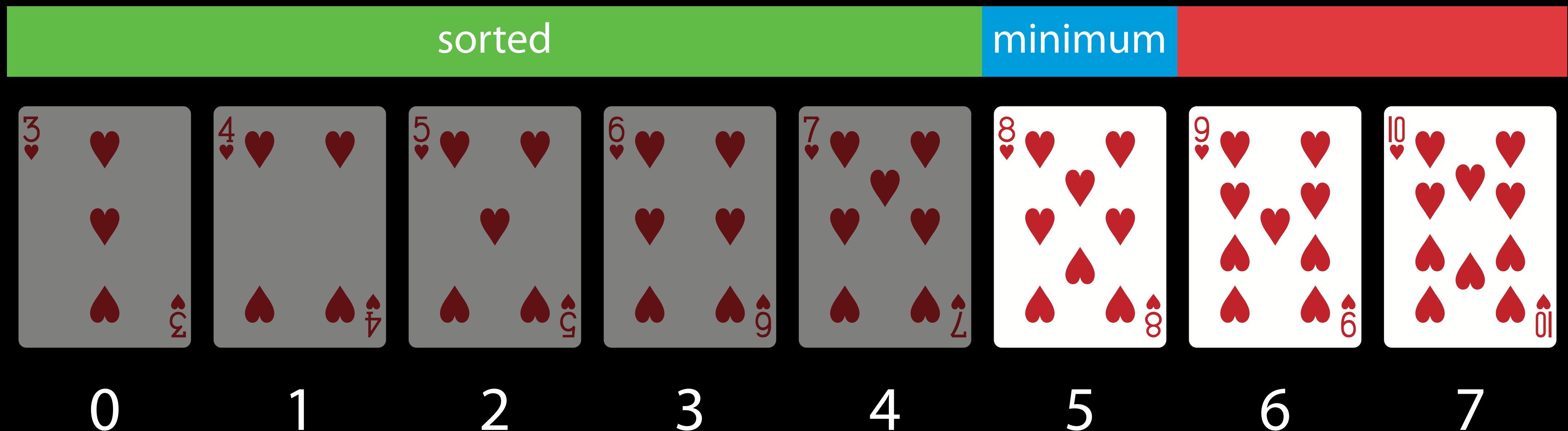


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

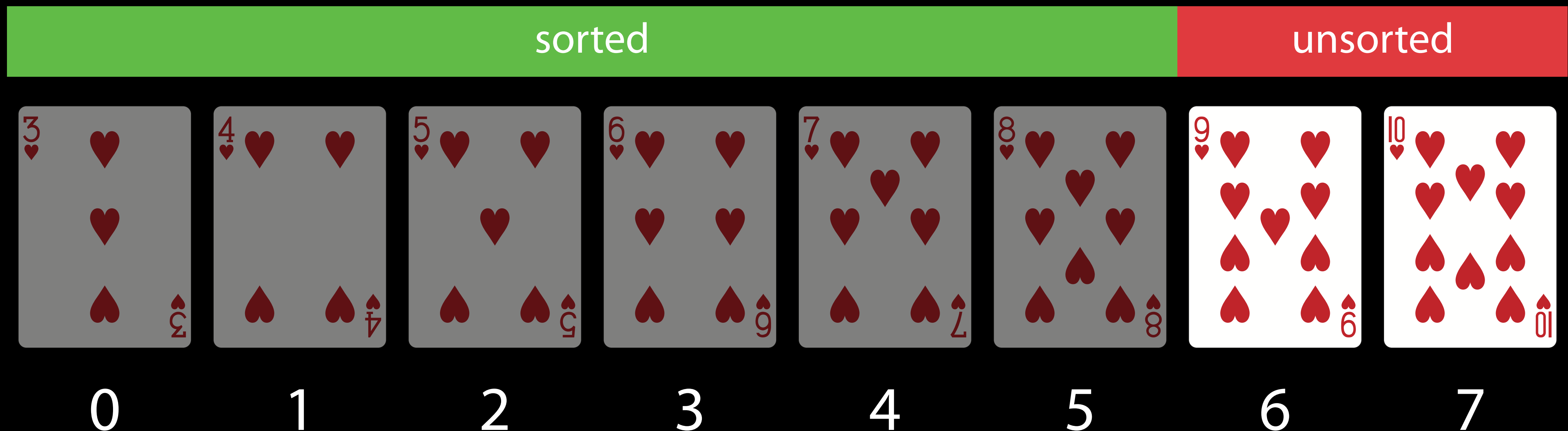


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

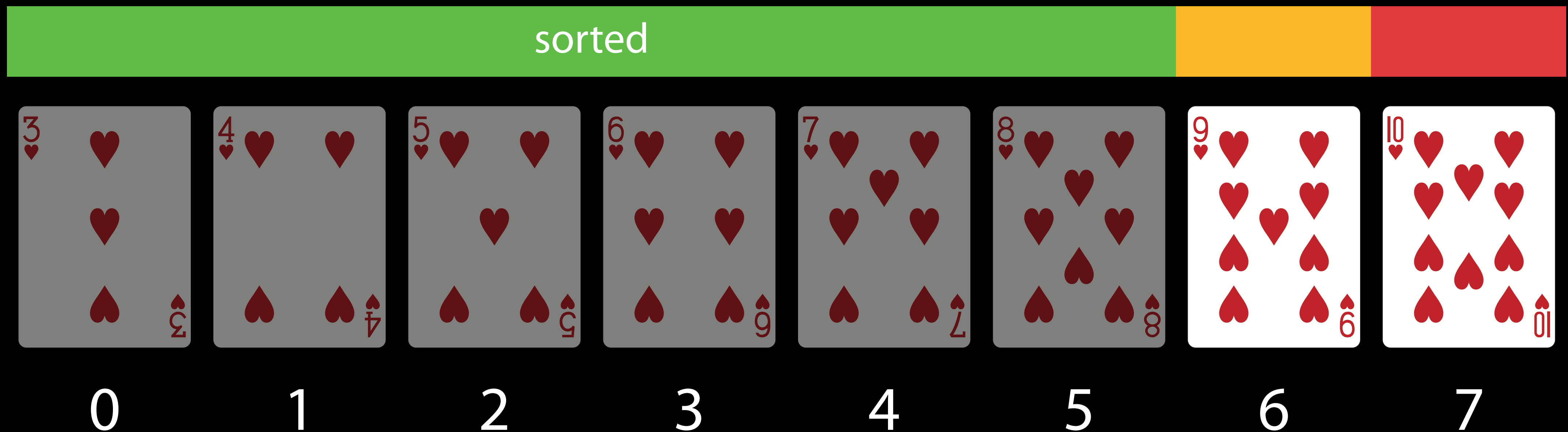


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

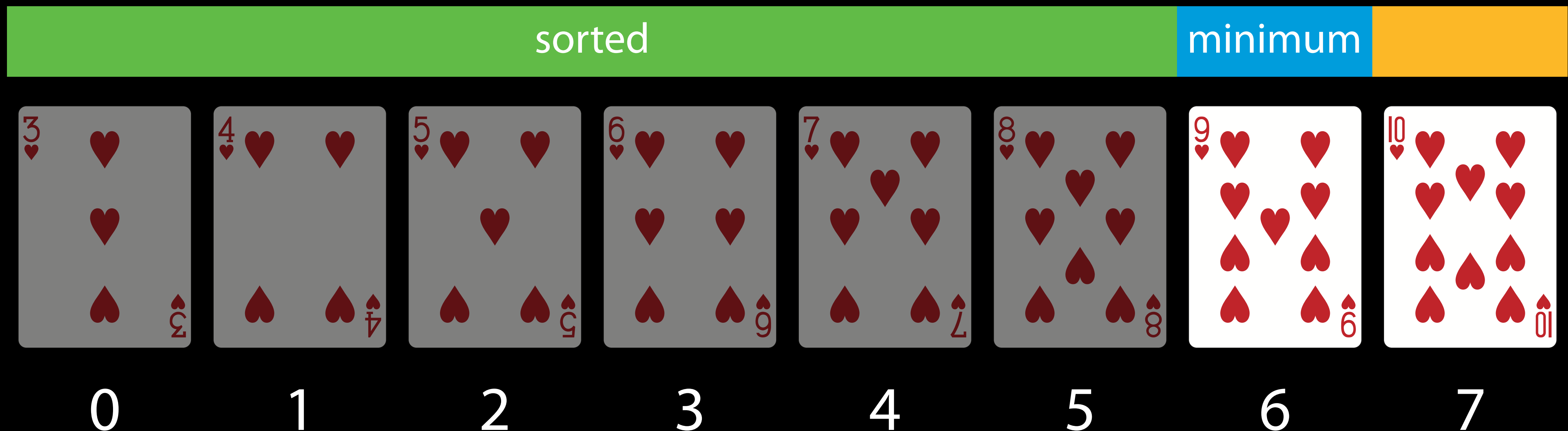


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

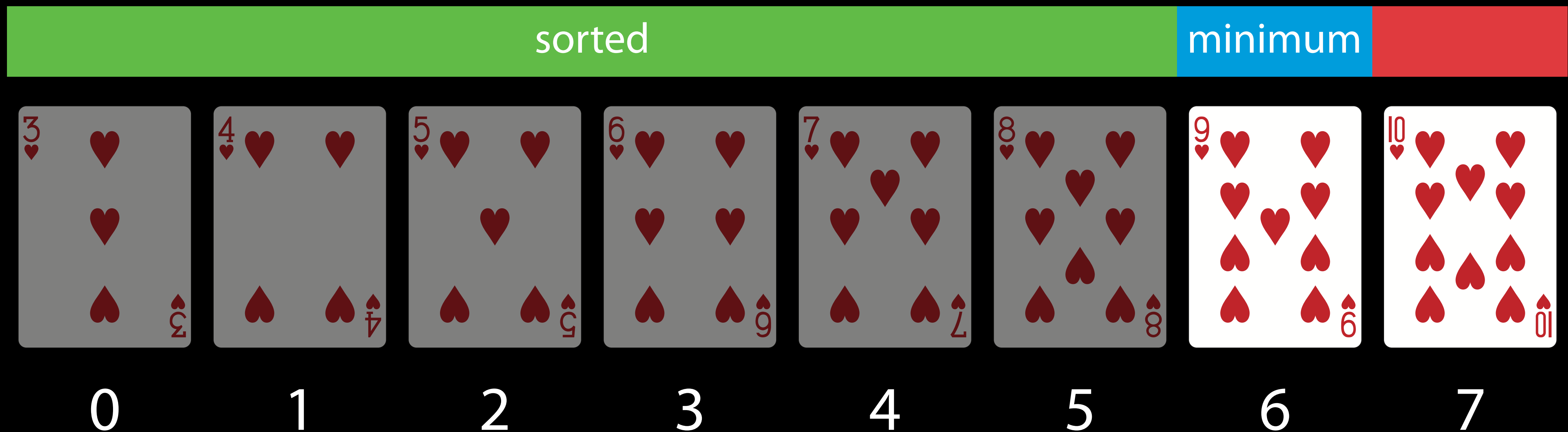


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

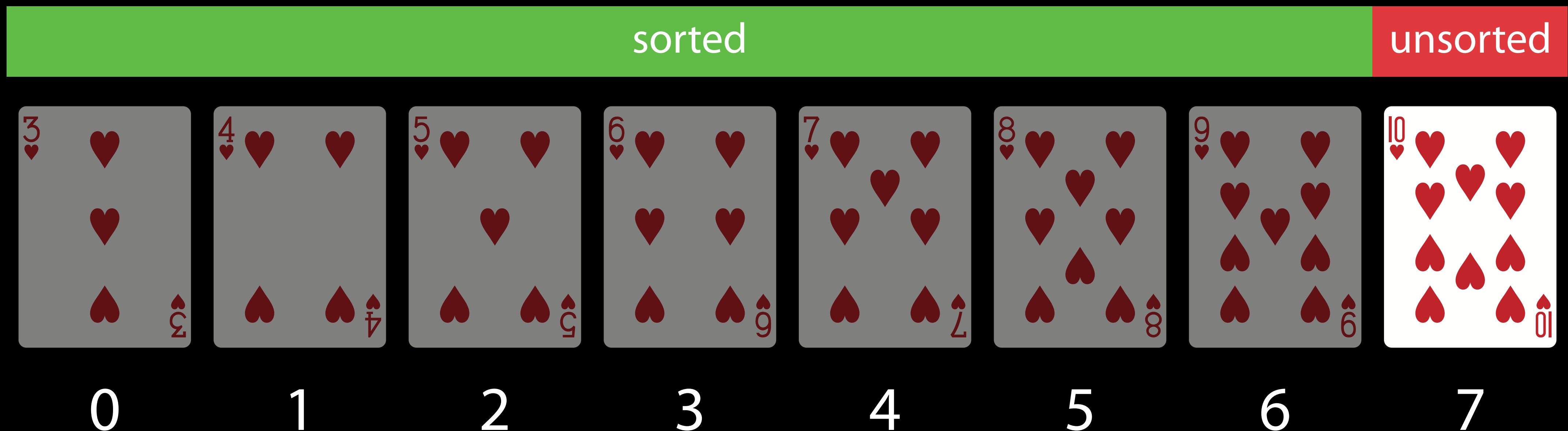


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

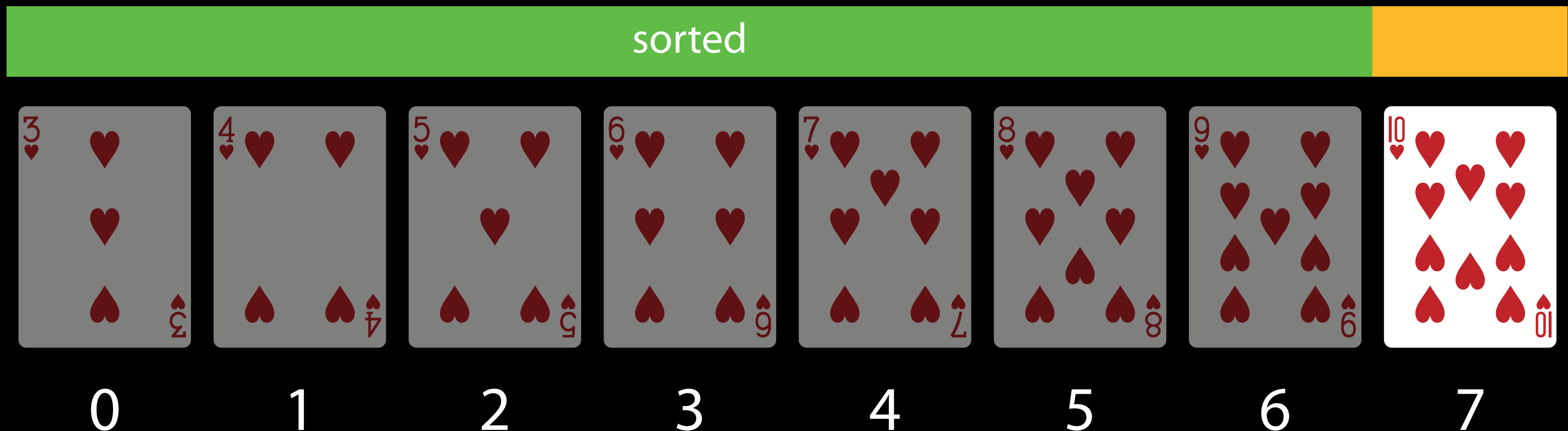


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

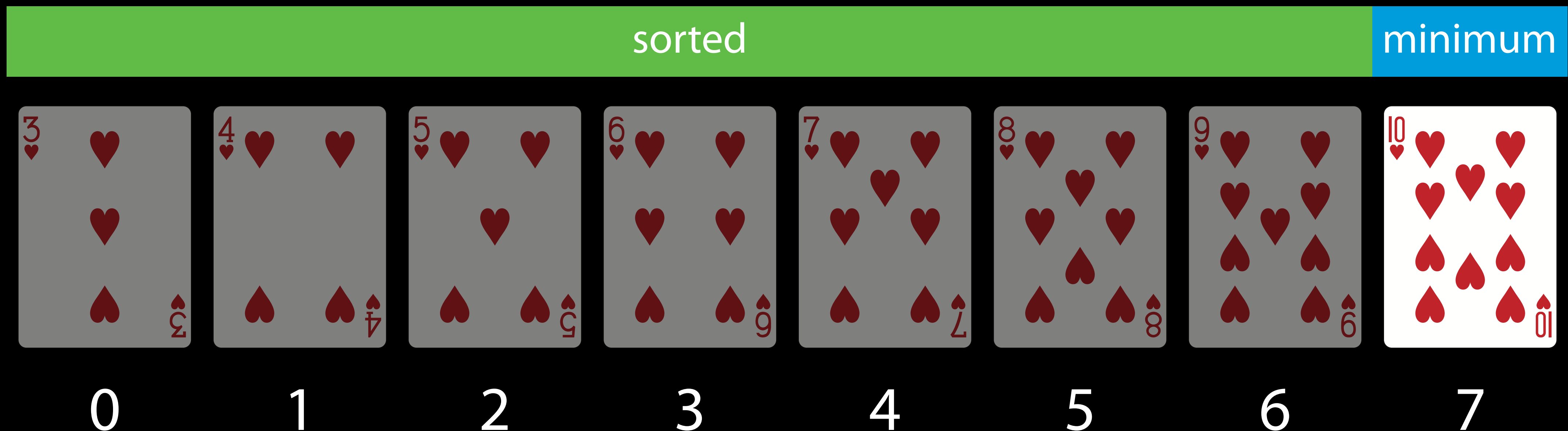


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

Repeat for all unsorted items until all items are in the sorted part.

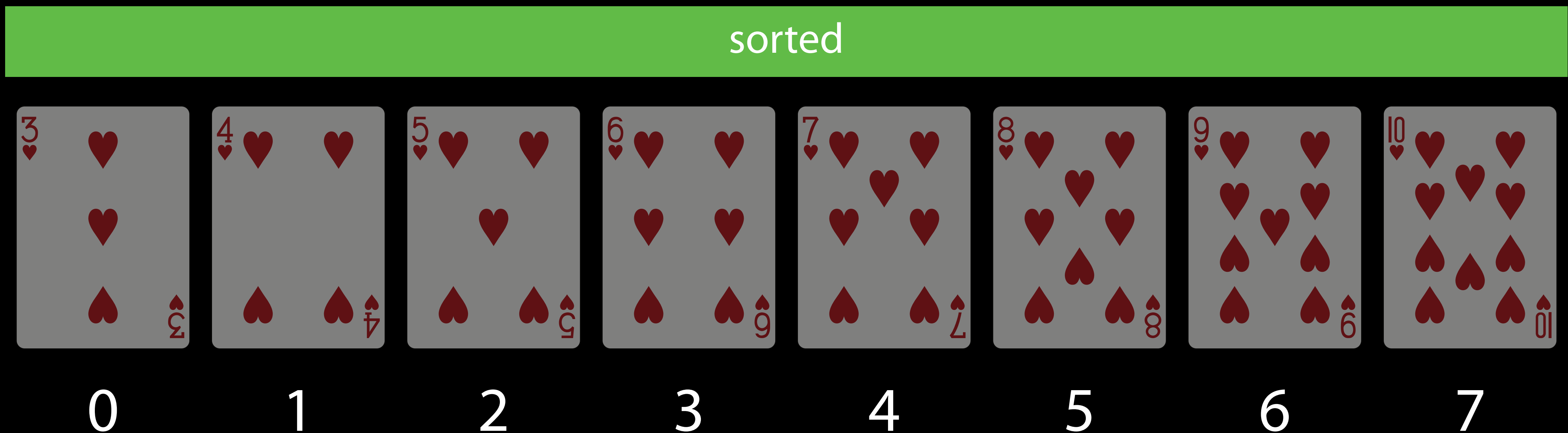


Selection sort

Select the smallest item in the unsorted part.

Swap it to the front of the unsorted part to put it in correct position.

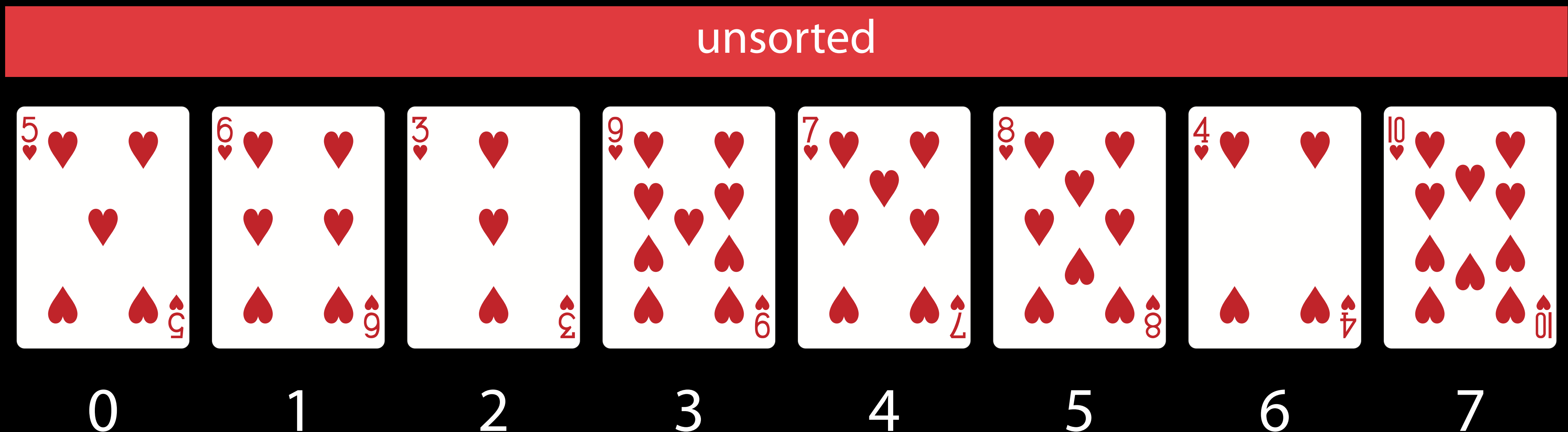
Repeat for all unsorted items until all items are in the sorted part.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

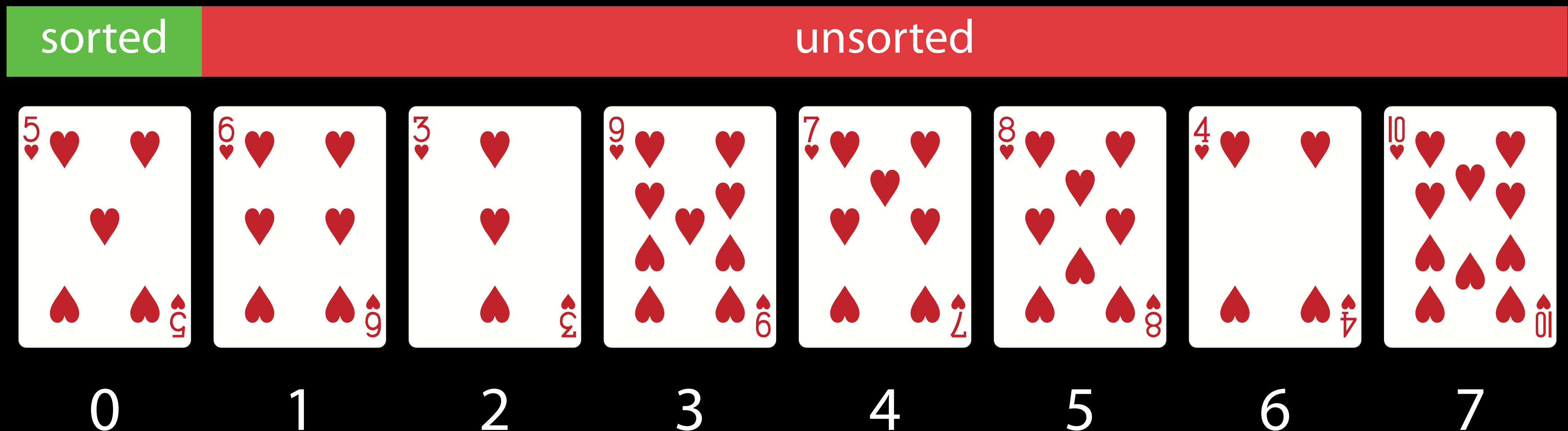
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

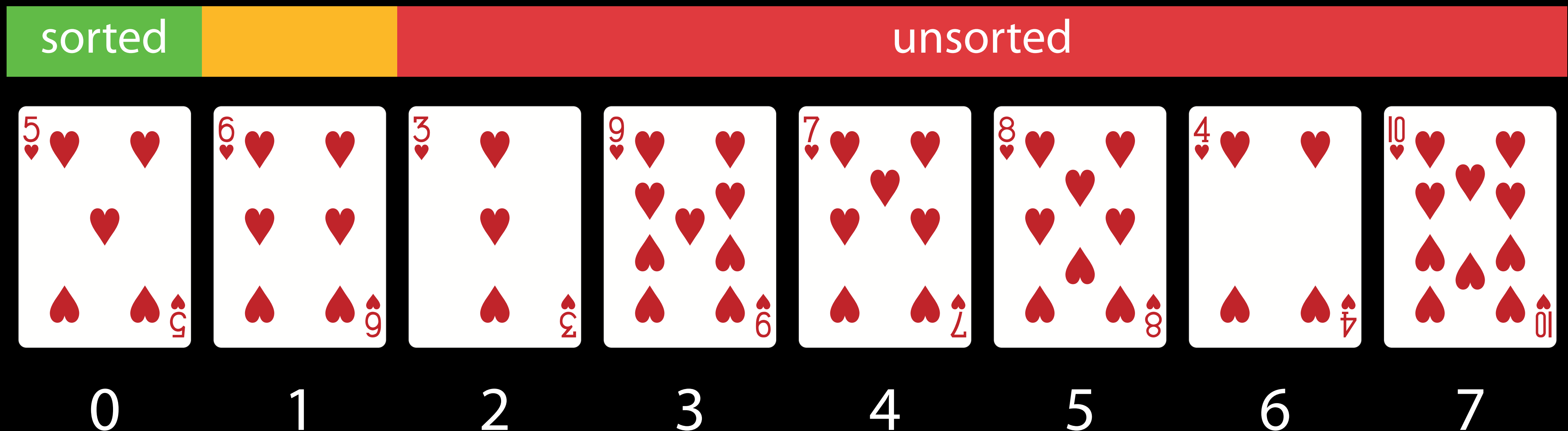
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

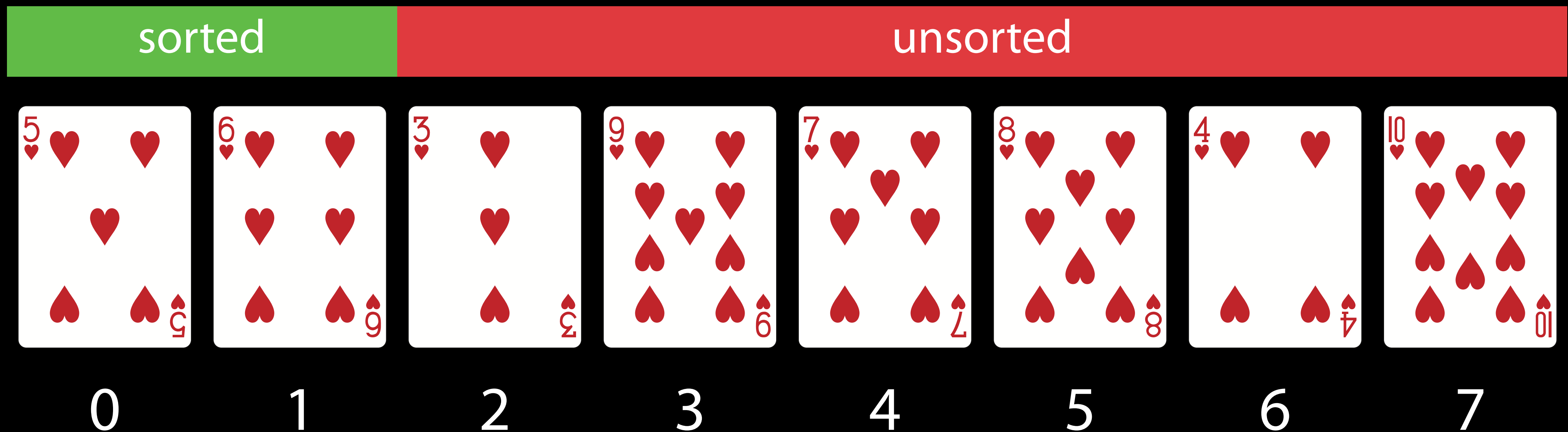
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

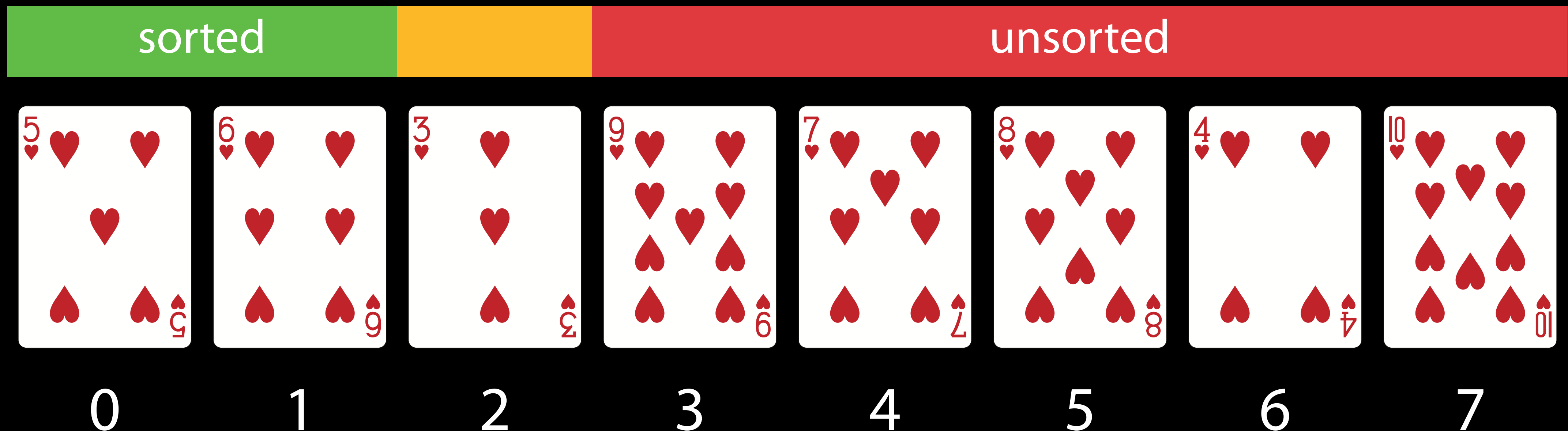
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

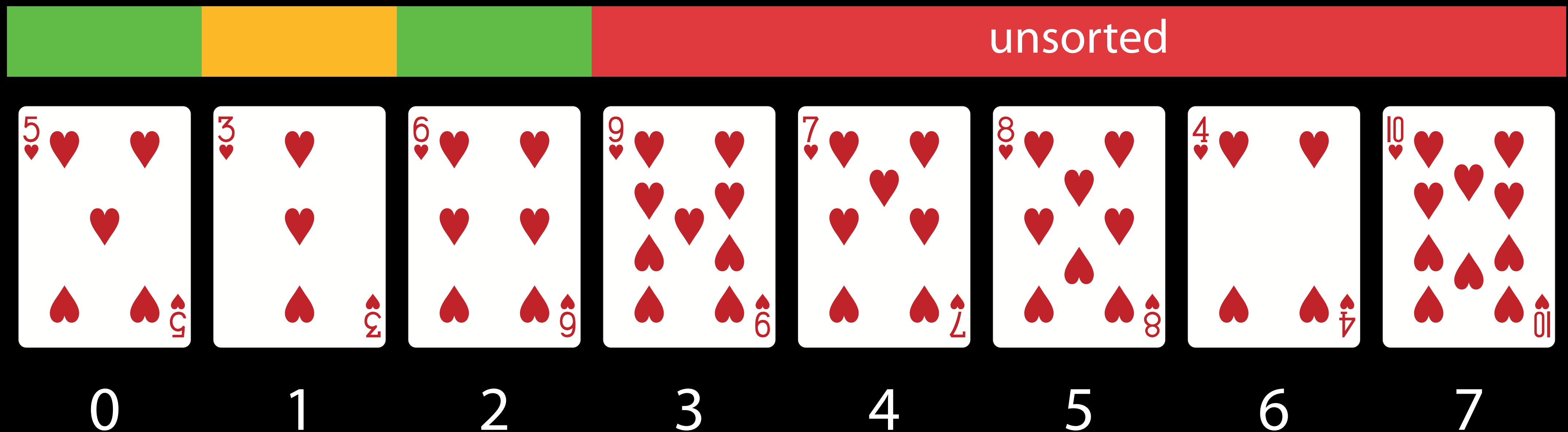
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

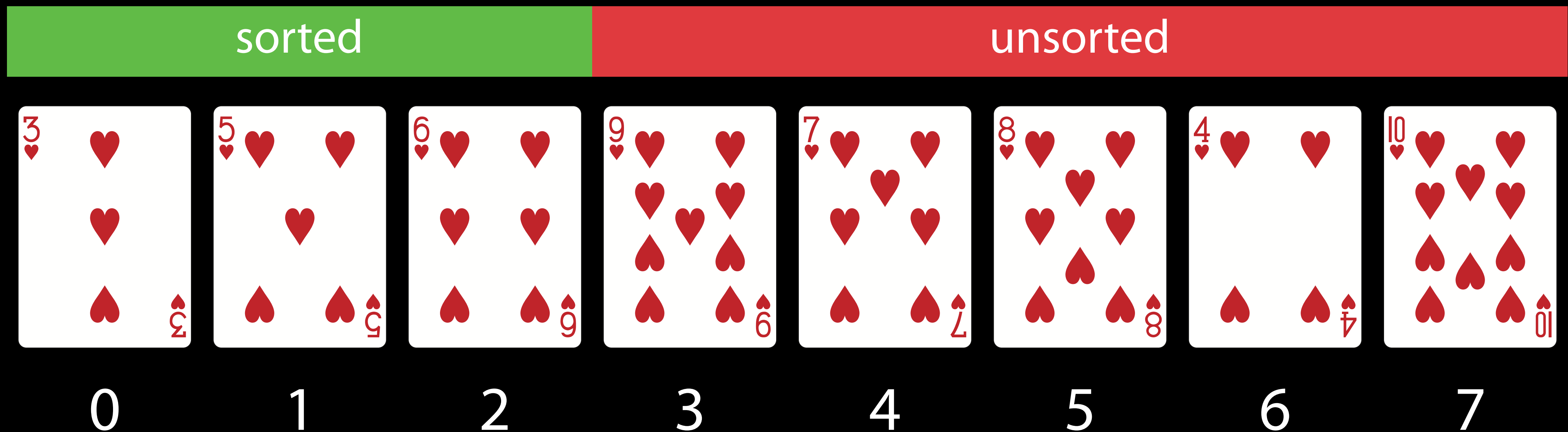
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

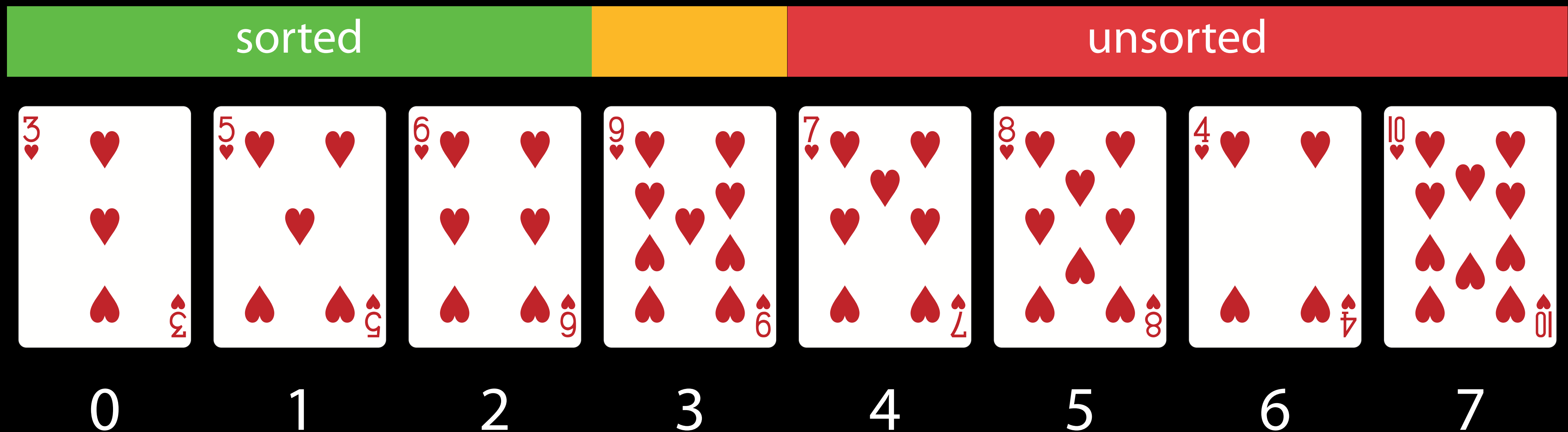
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

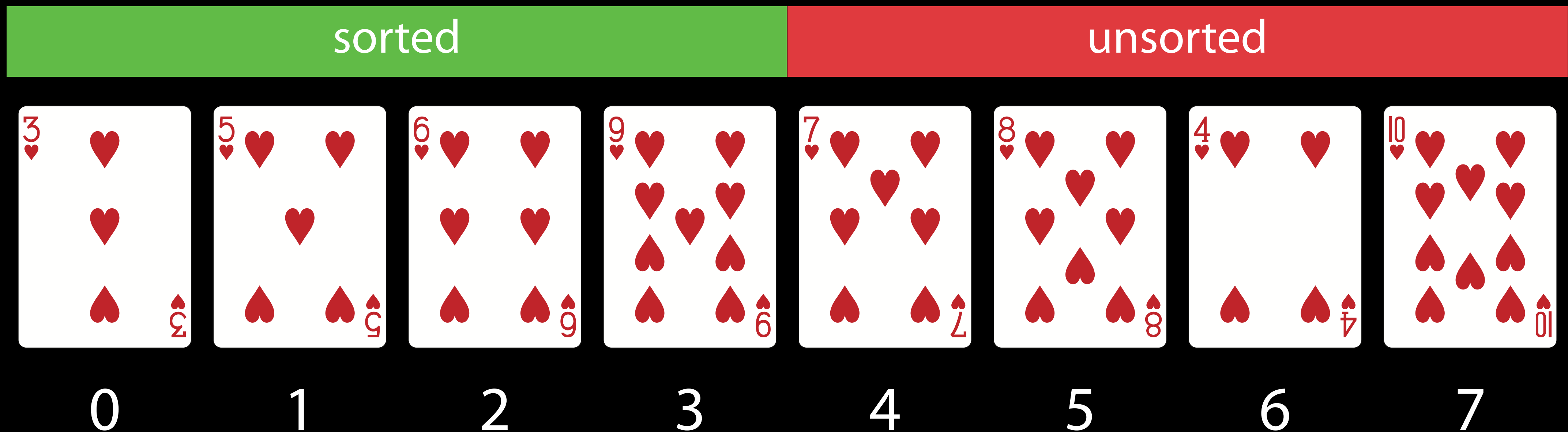
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

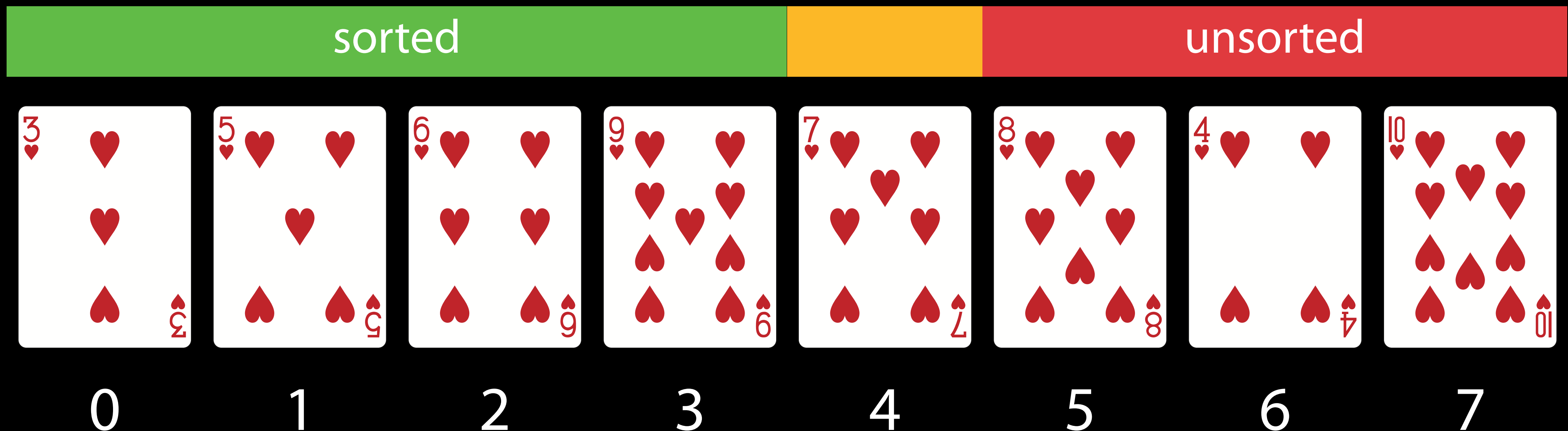
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

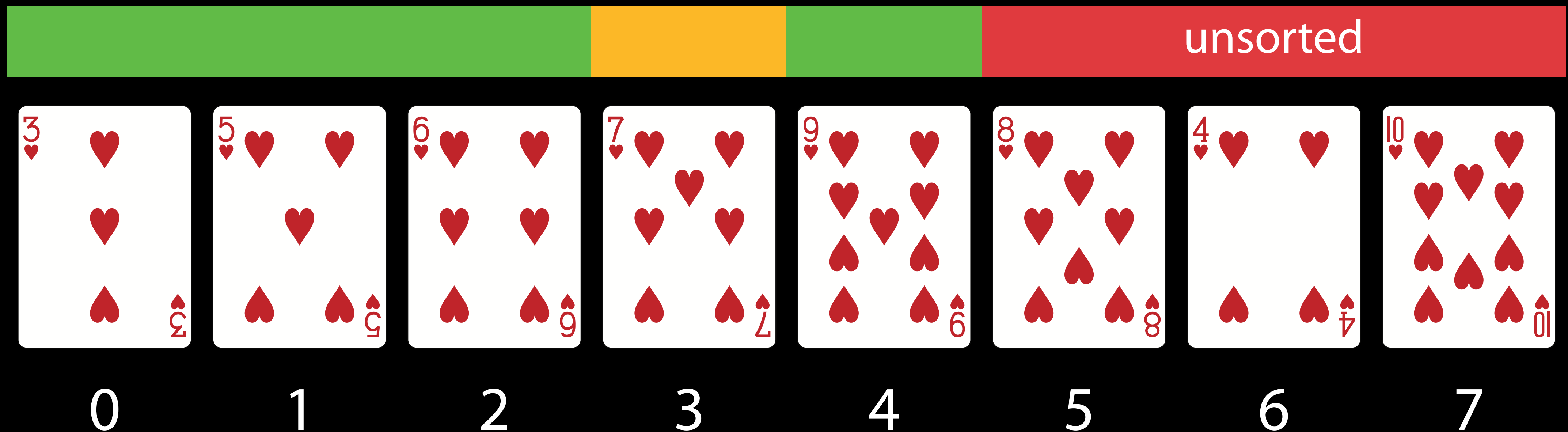
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

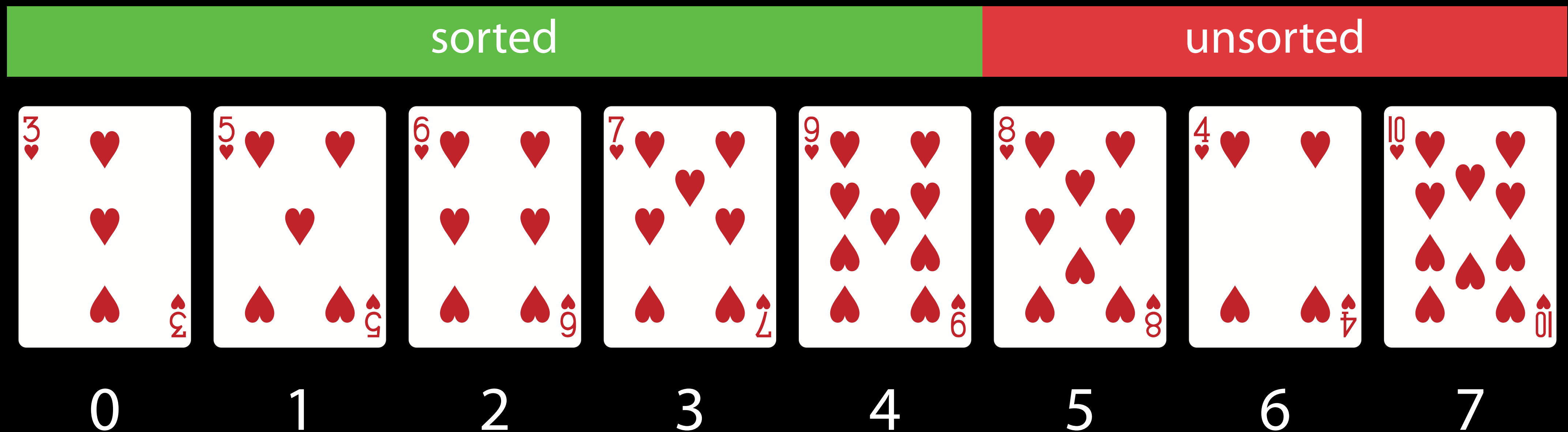
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

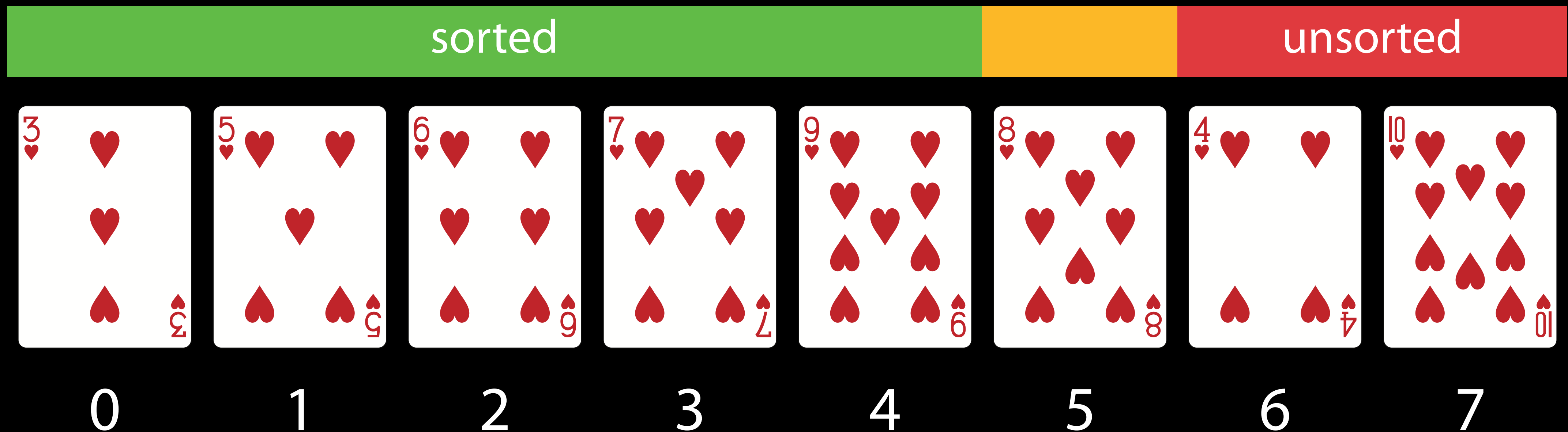
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

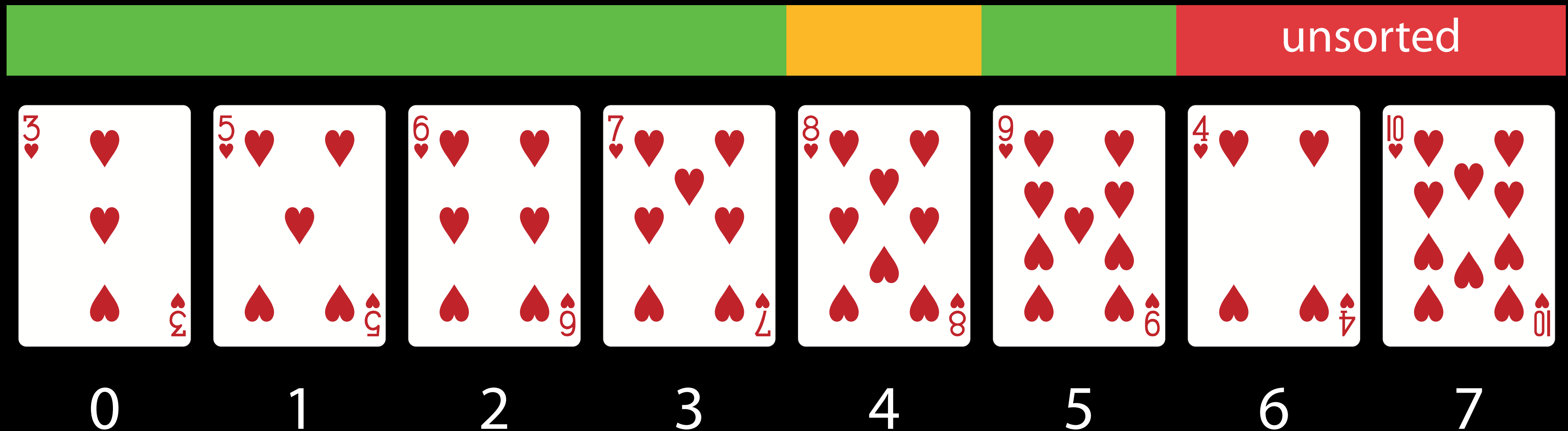
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

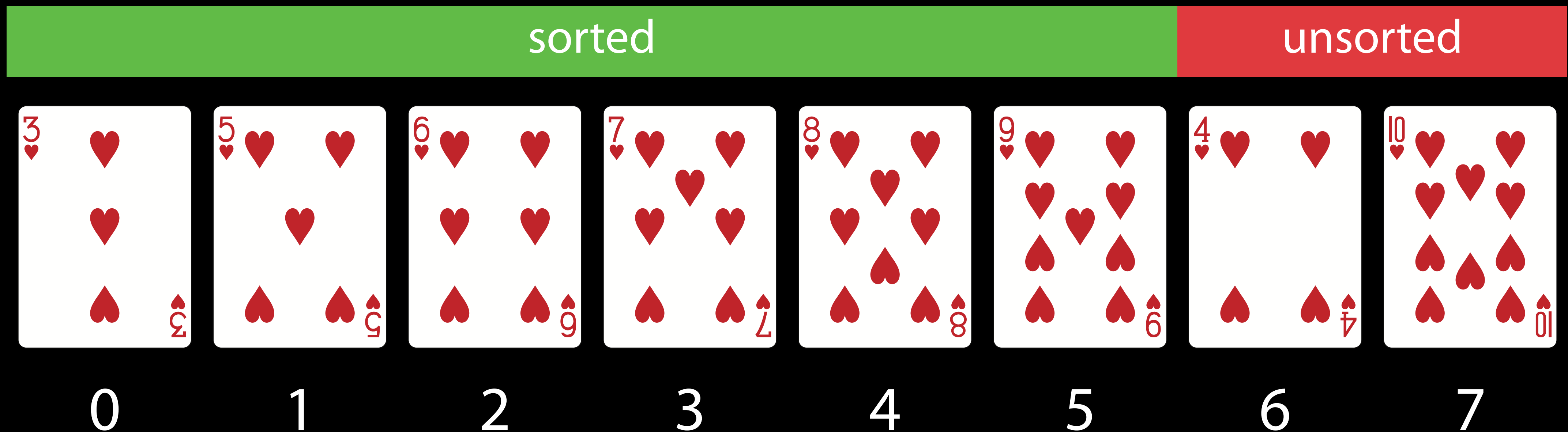
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

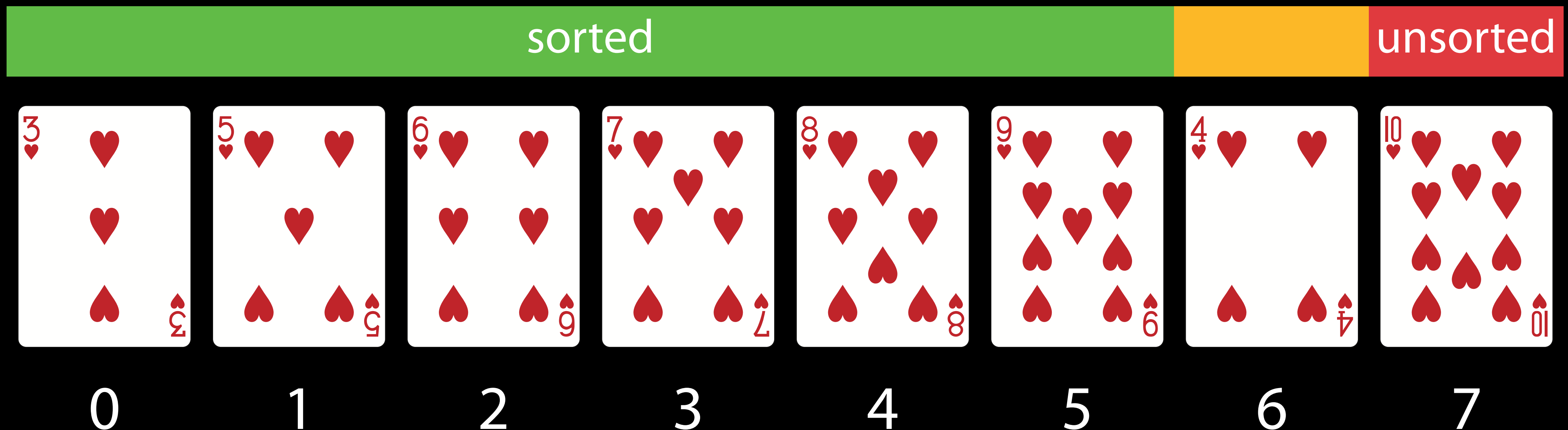
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

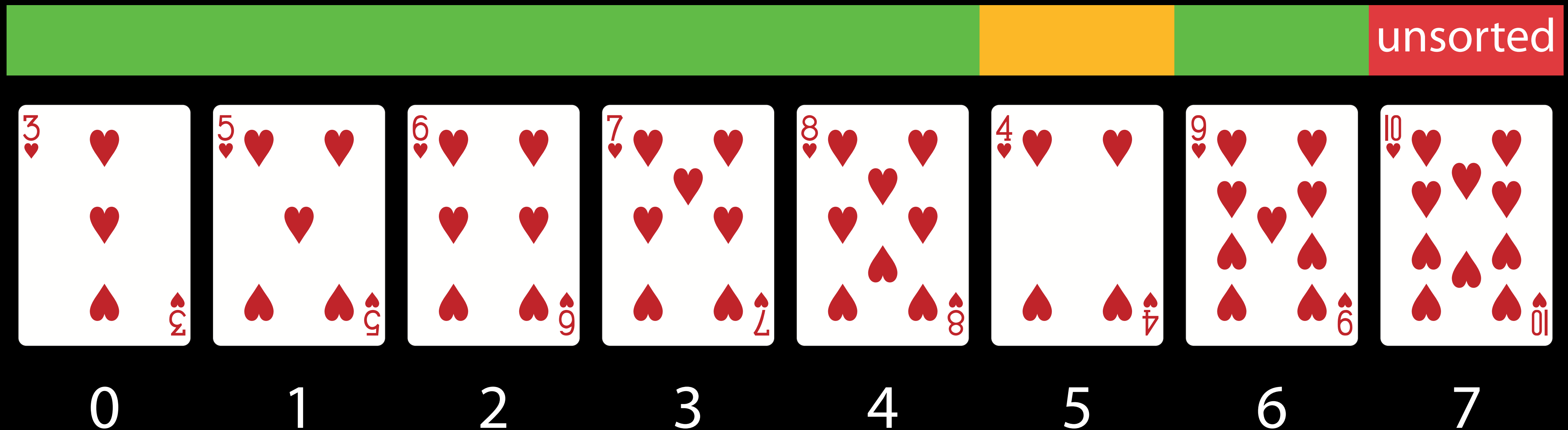
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

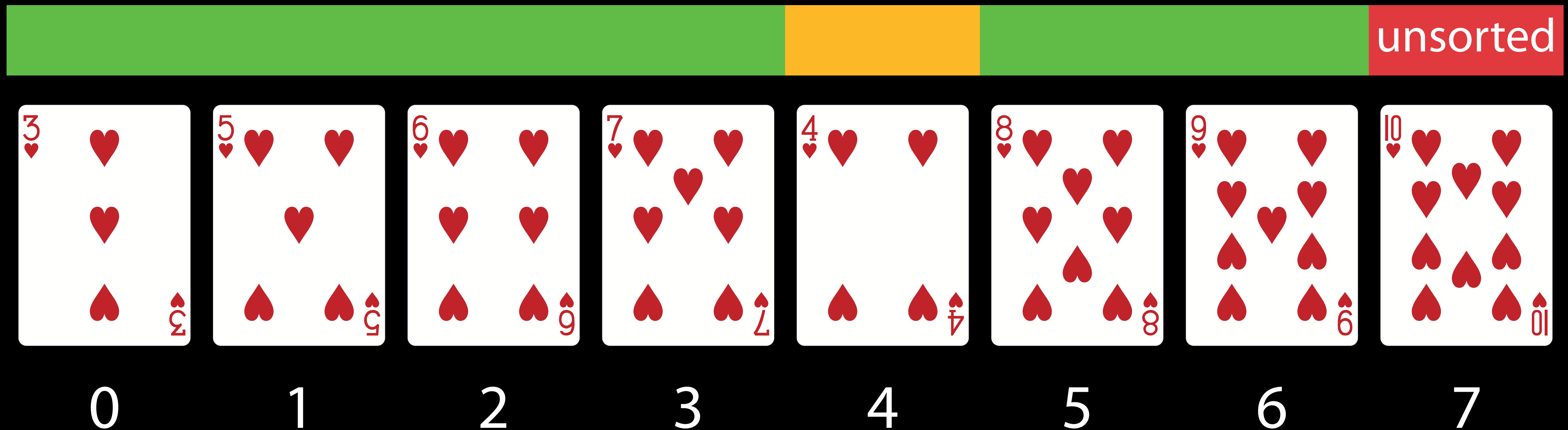
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

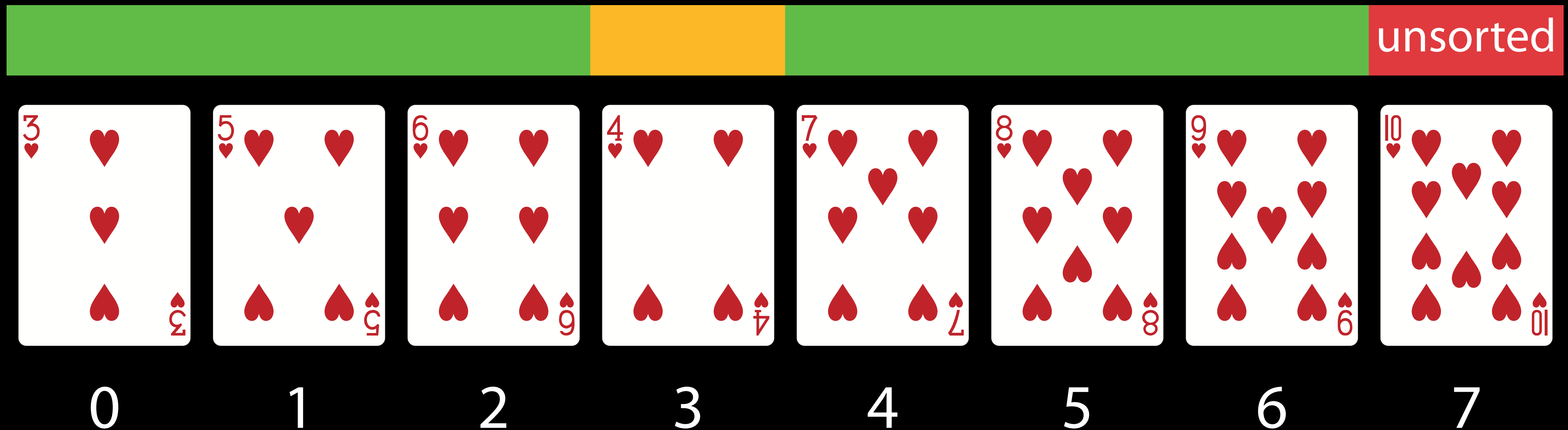
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

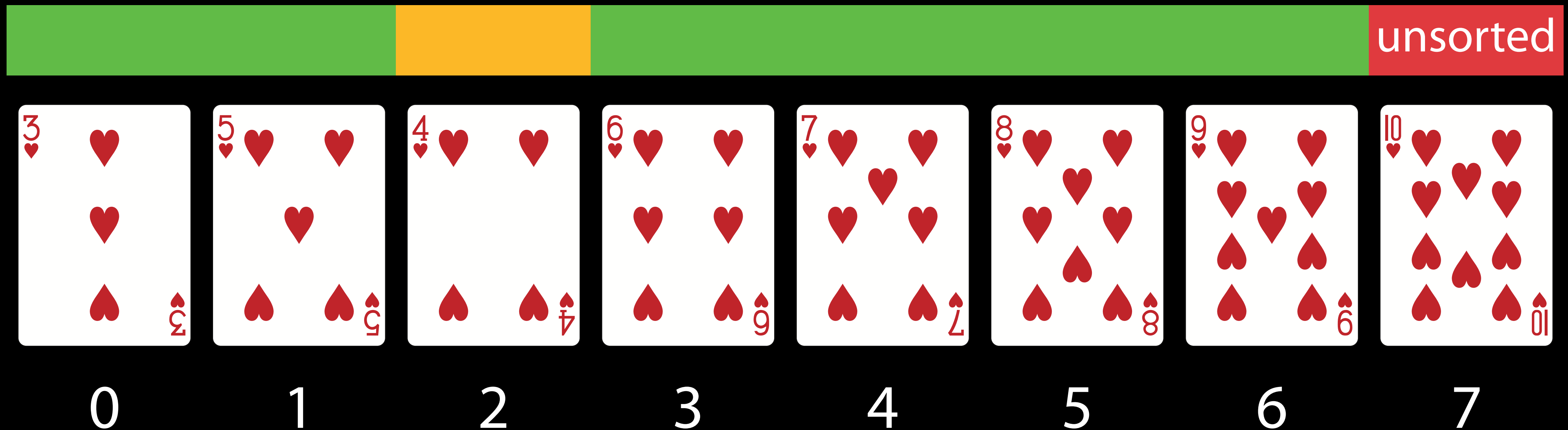
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

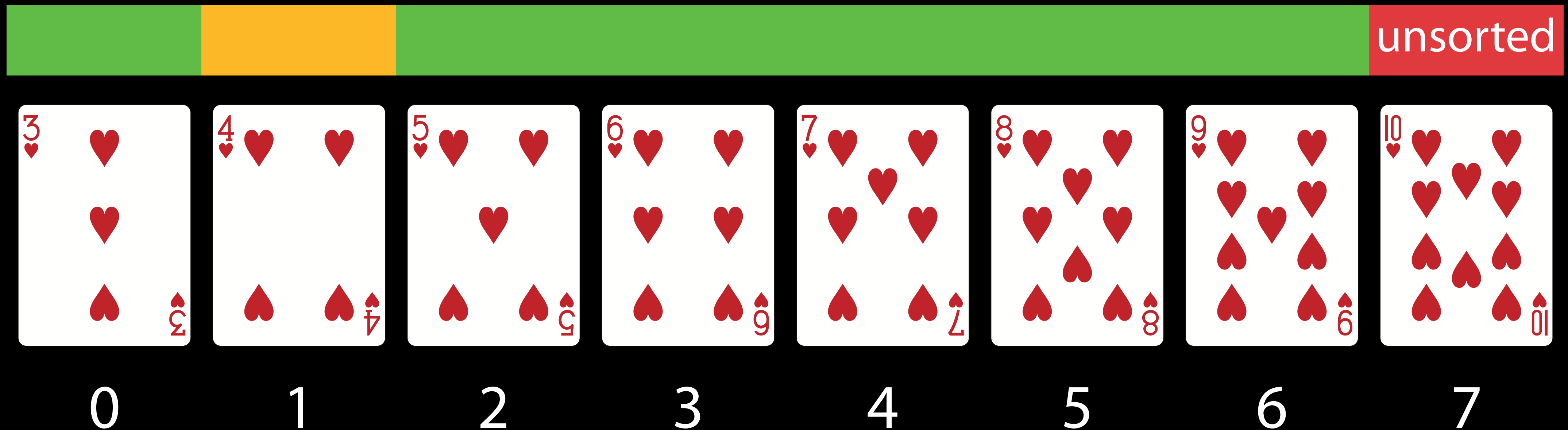
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

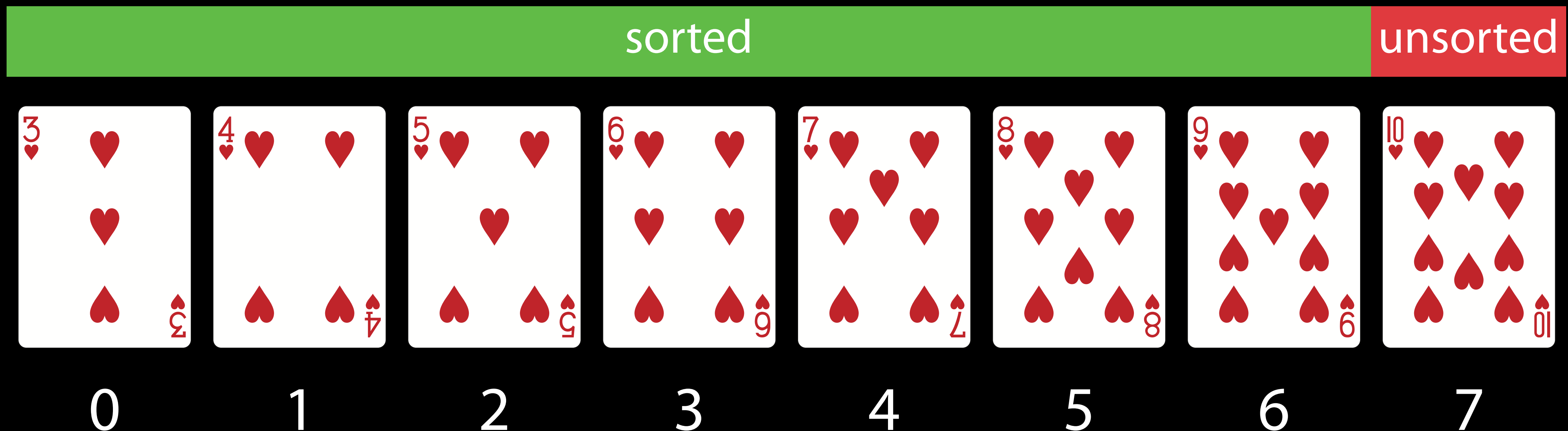
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

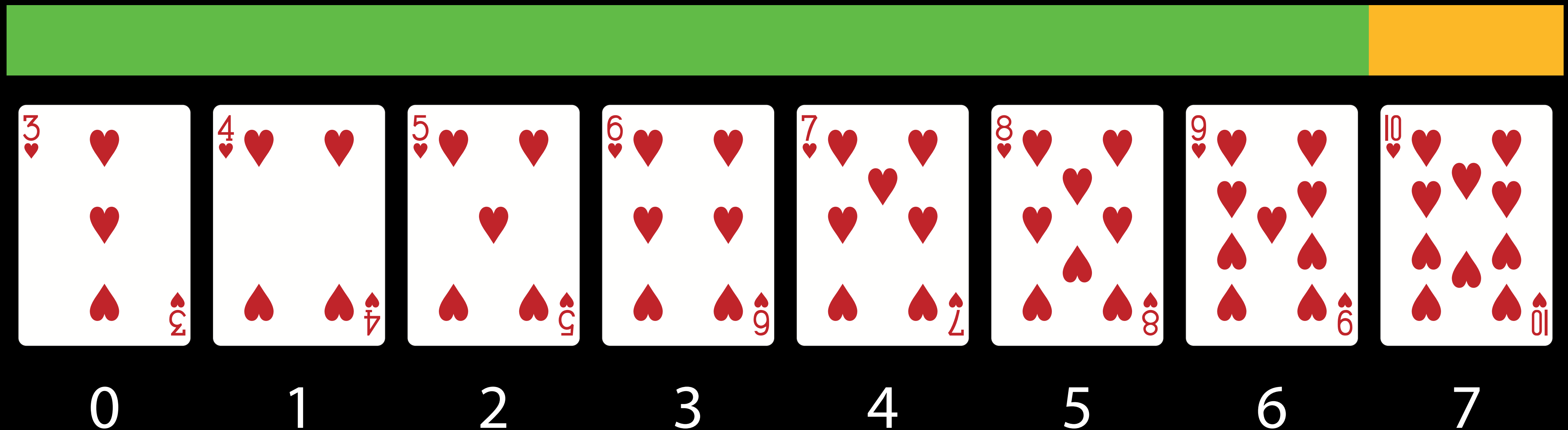
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

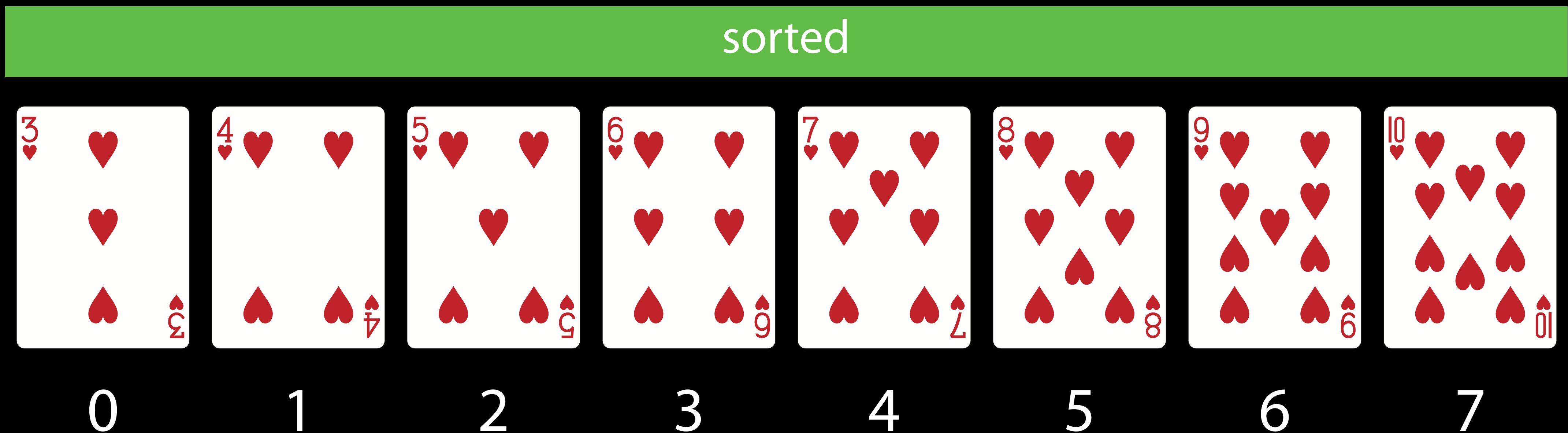
Do everything in place using swapping.



Insertion sort

Add each item from unsorted input, inserting into sorted output at the correct position.

Do everything in place using swapping.



Heapsort

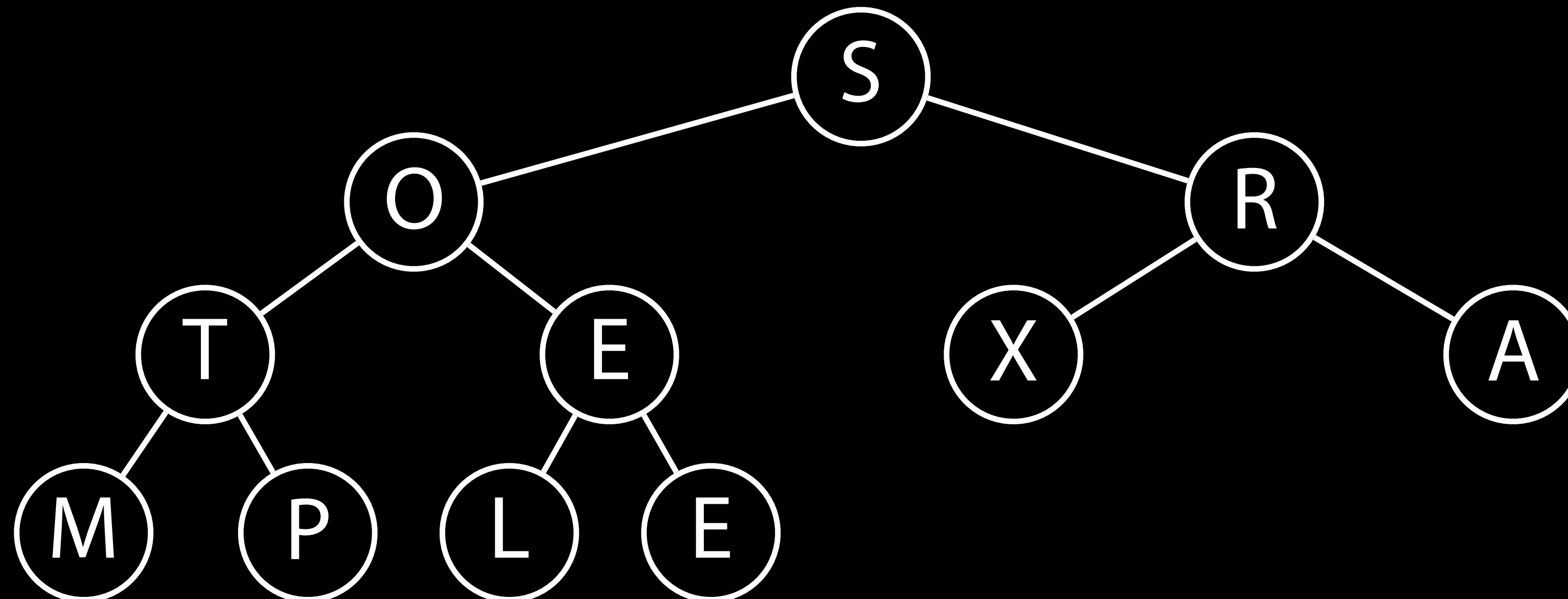
Build a max-heap using bottom-up method.

S	O	R	T	E	X	A	M	P	L	E
0	1	2	3	4	5	6	7	8	9	10

Heapsort

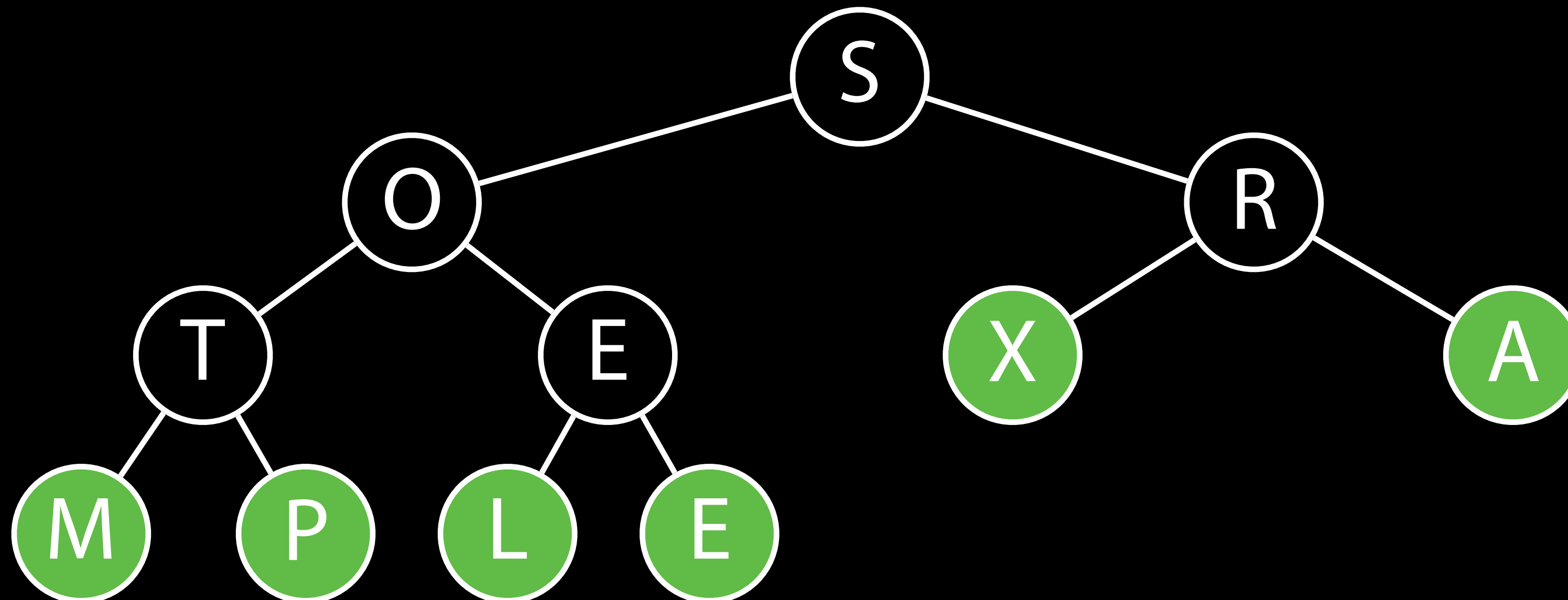
Build a max-heap using bottom-up method.

S	O	R	T	E	X	A	M	P	L	E
0	1	2	3	4	5	6	7	8	9	10



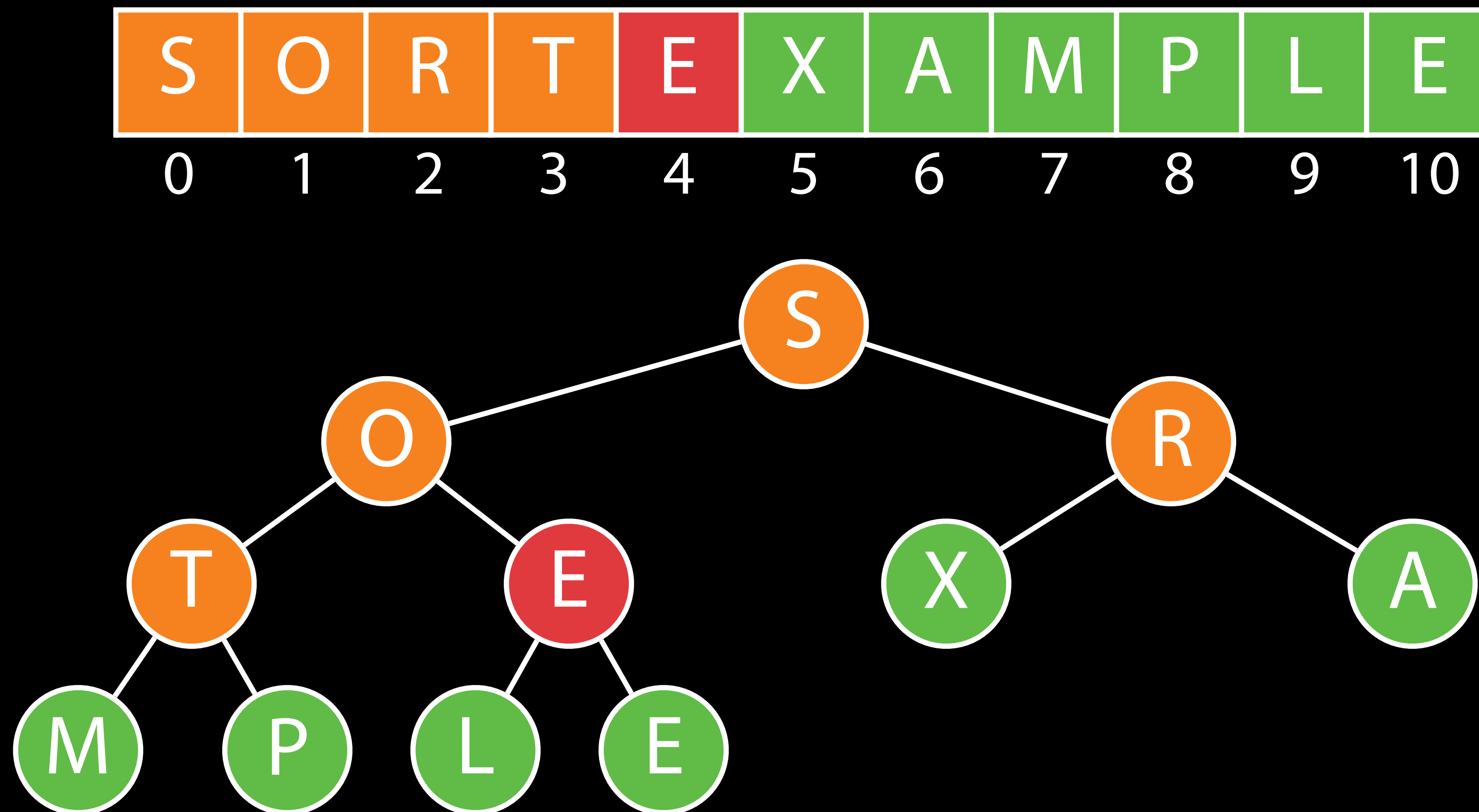
Heapsort

Build a max-heap using bottom-up method.



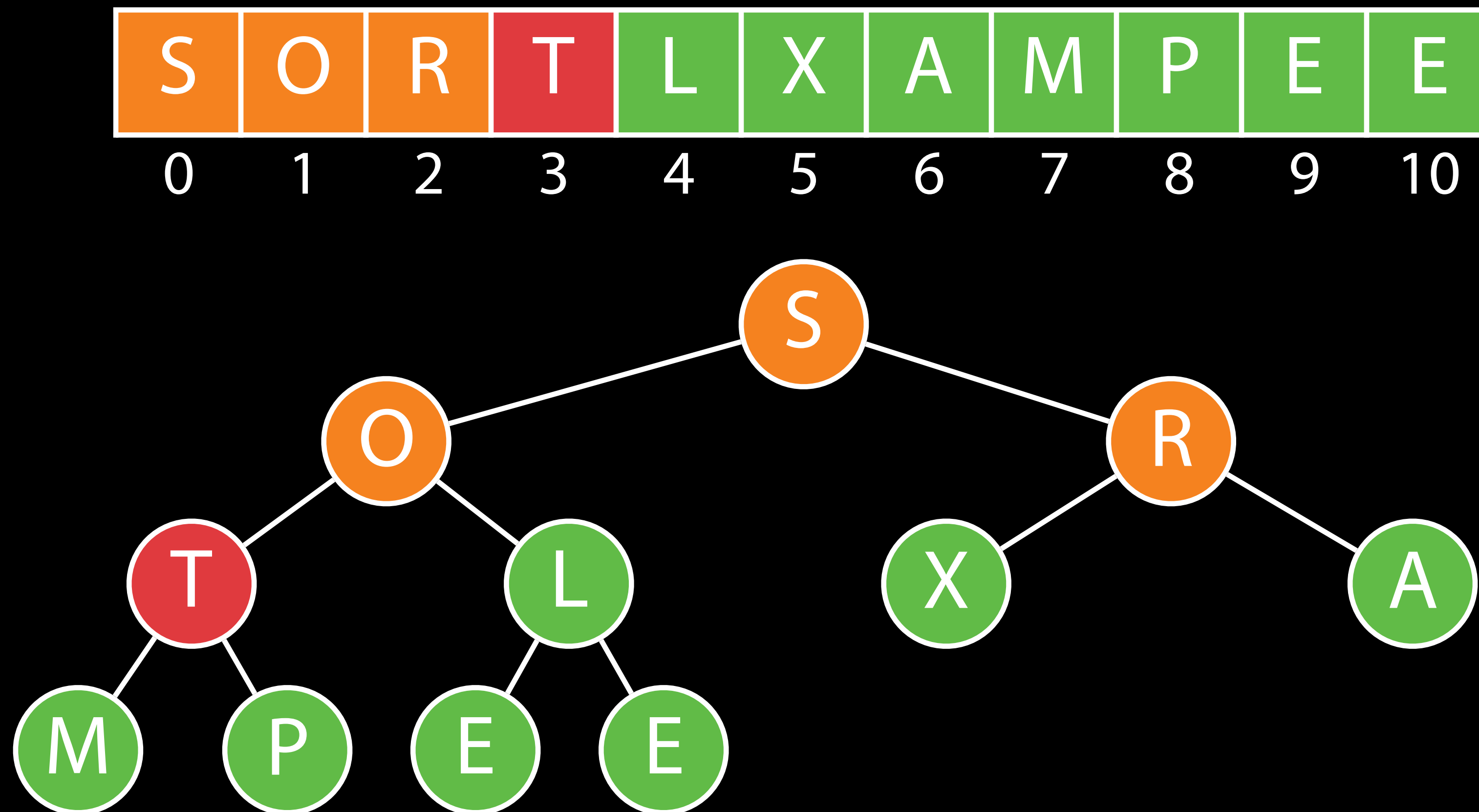
Heapsort

Build a max-heap using bottom-up method.



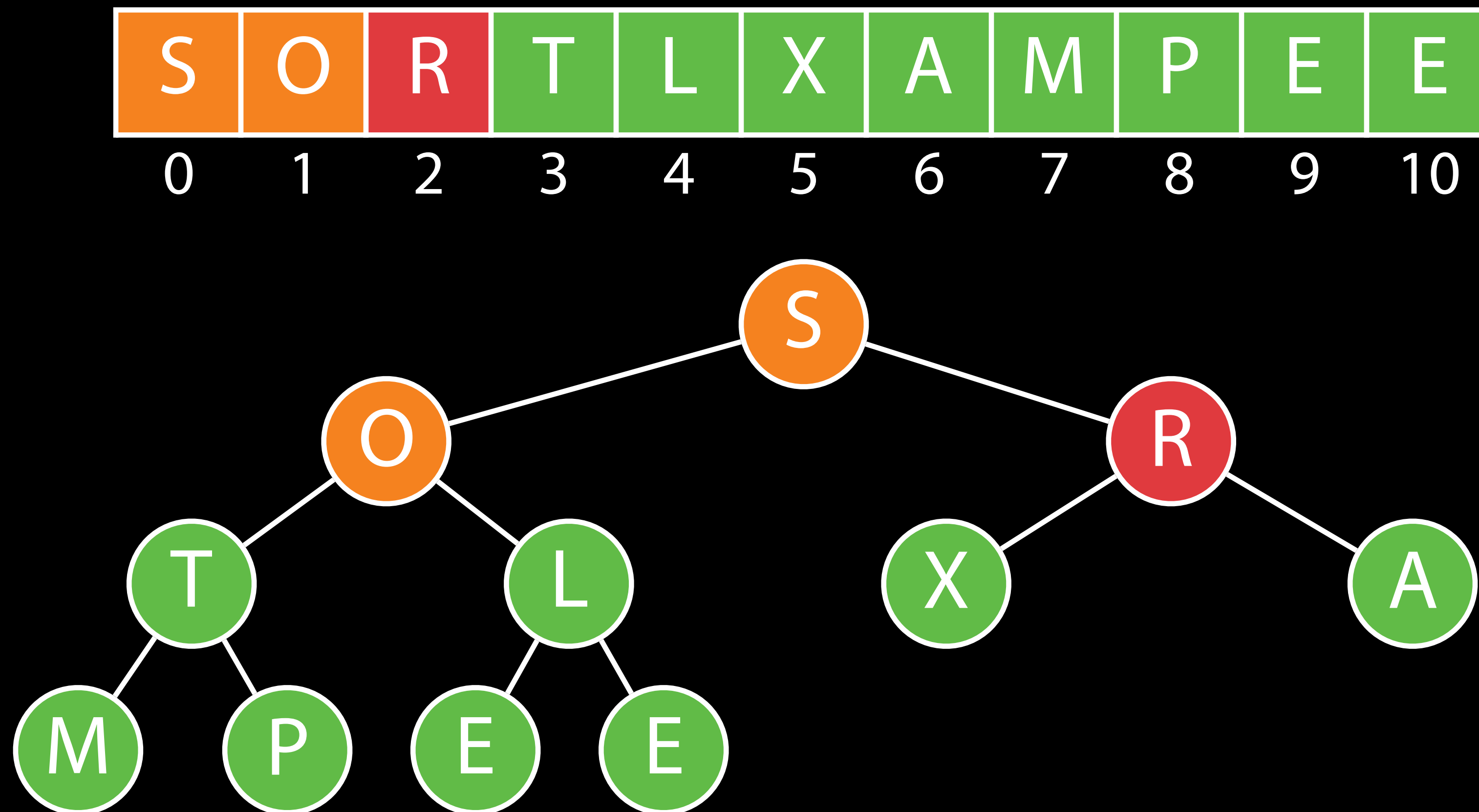
Heapsort

Build a max-heap using bottom-up method.



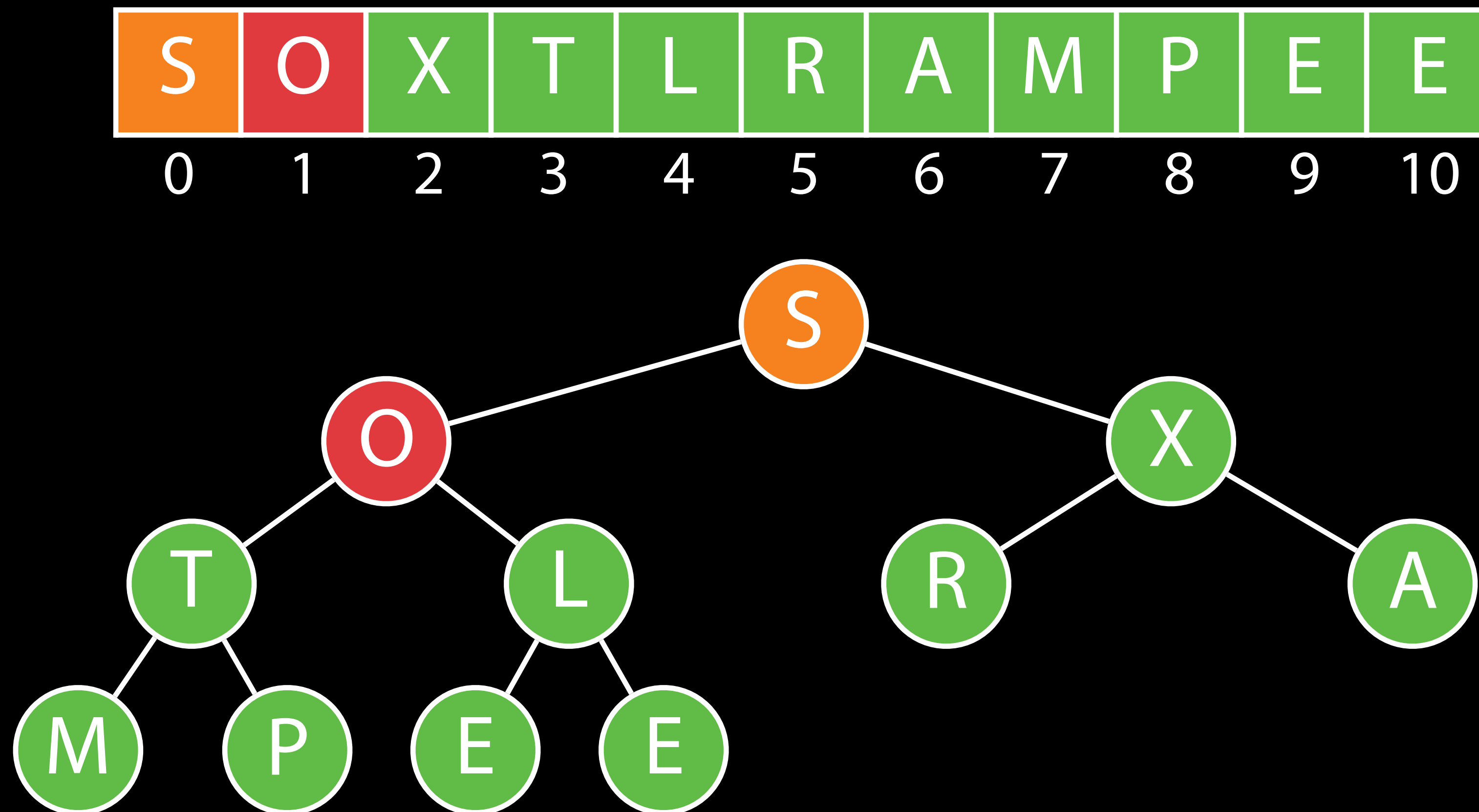
Heapsort

Build a max-heap using bottom-up method.



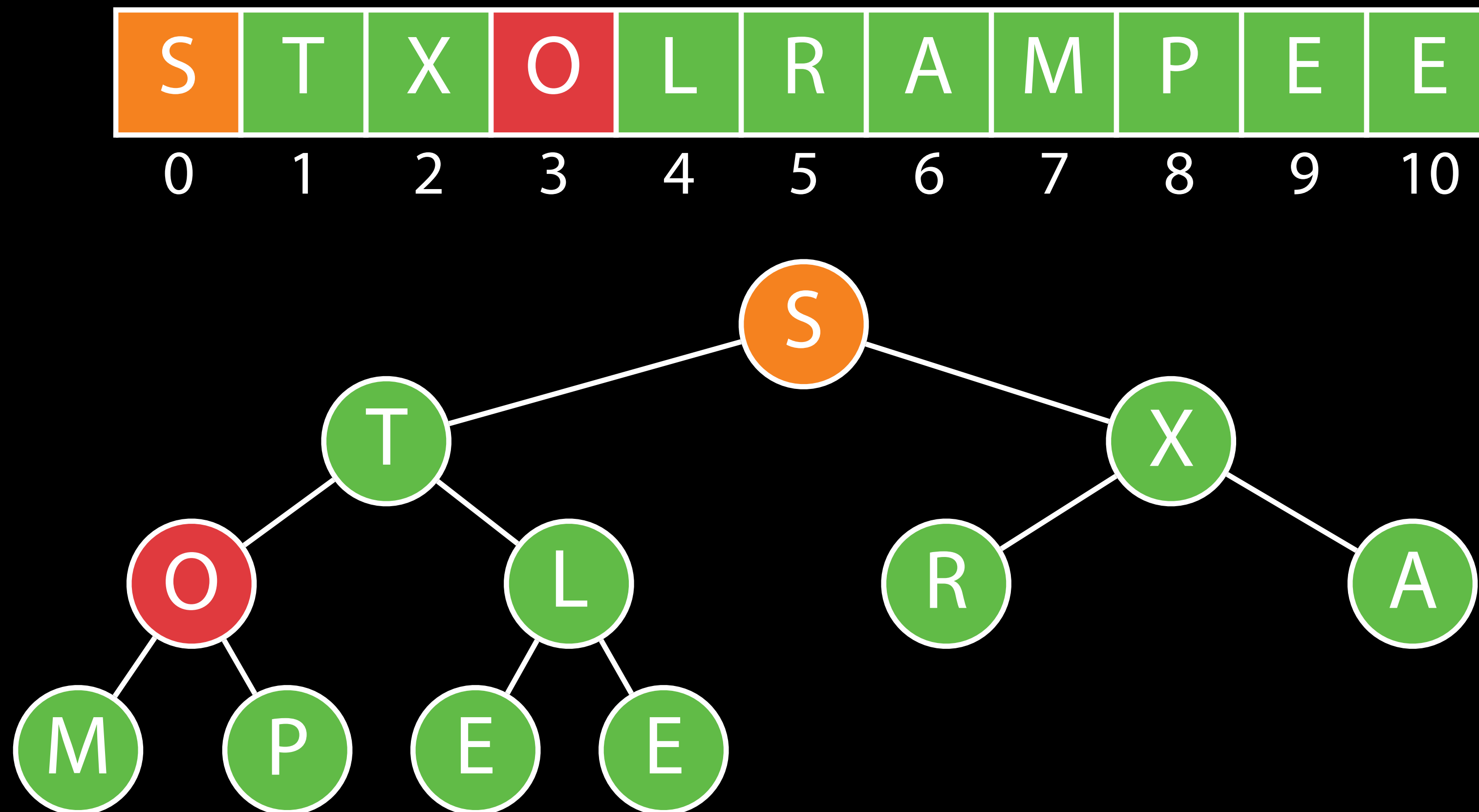
Heapsort

Build a max-heap using bottom-up method.



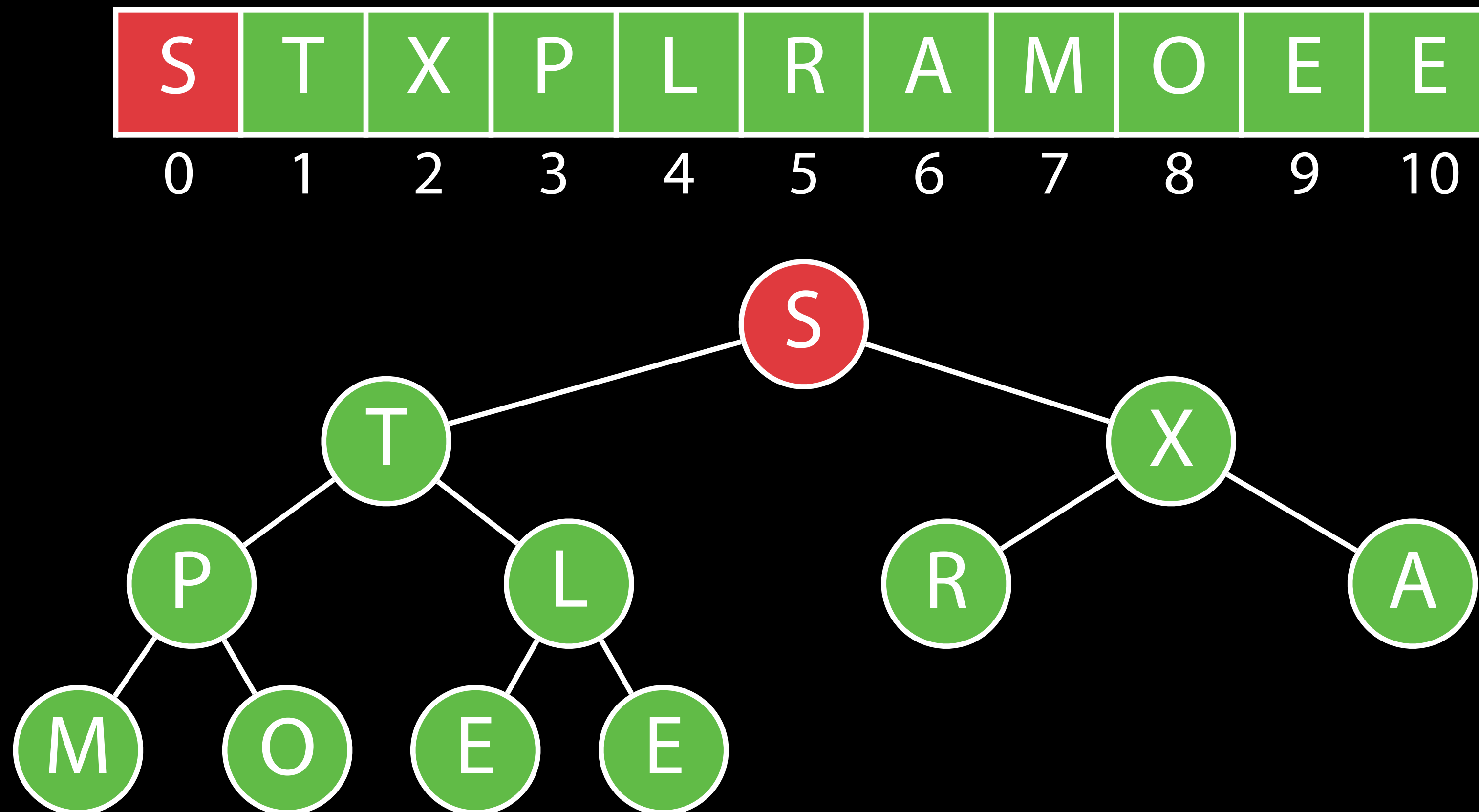
Heapsort

Build a max-heap using bottom-up method.



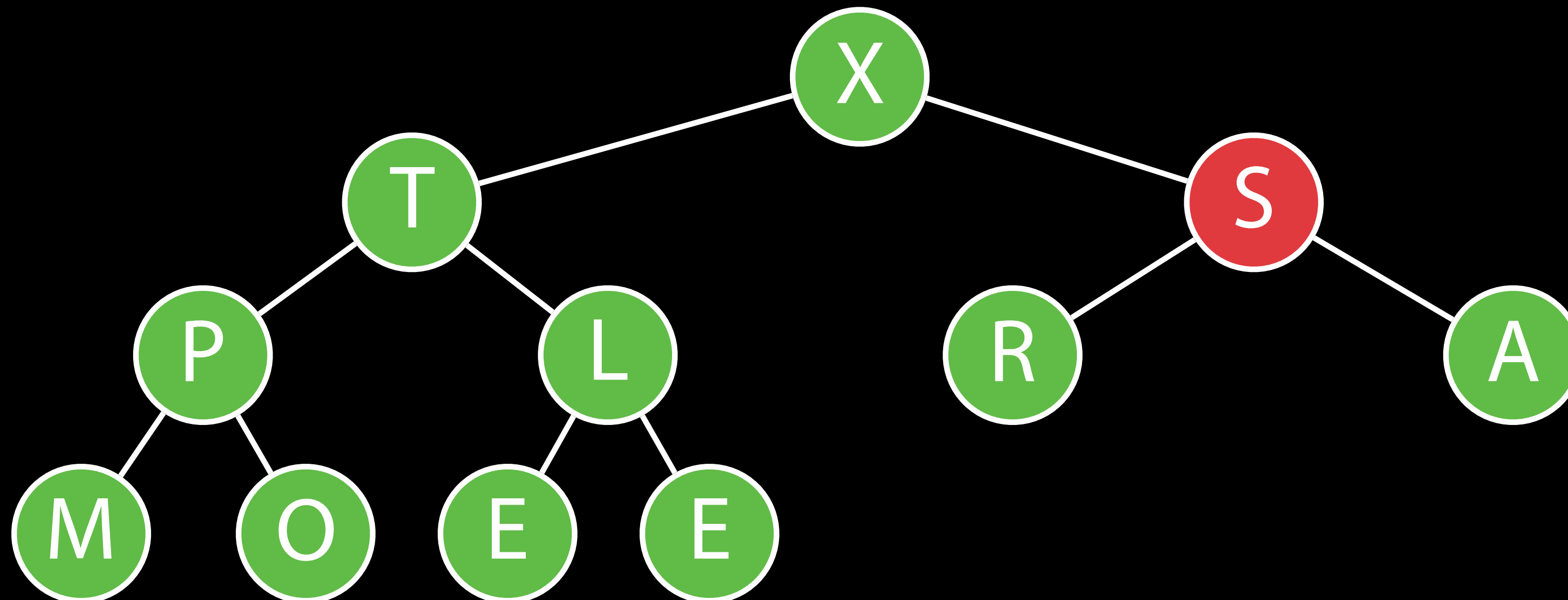
Heapsort

Build a max-heap using bottom-up method.



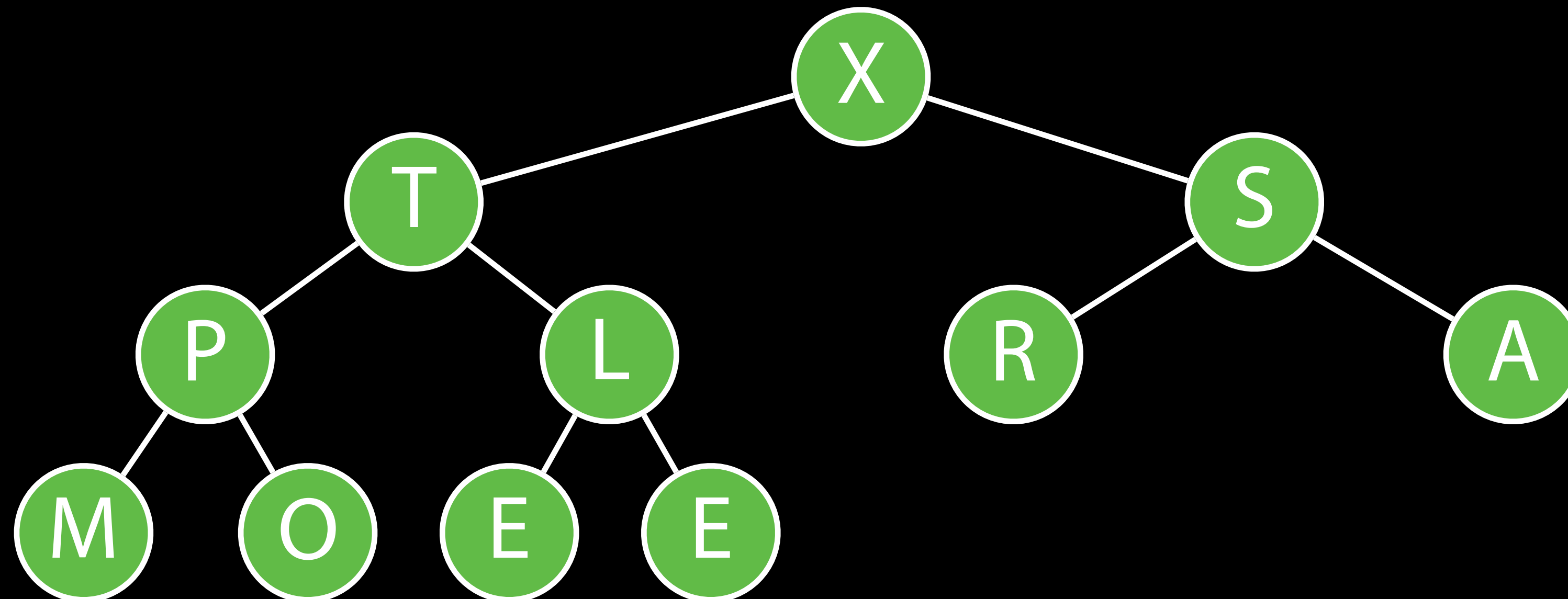
Heapsort

Build a max-heap using bottom-up method.



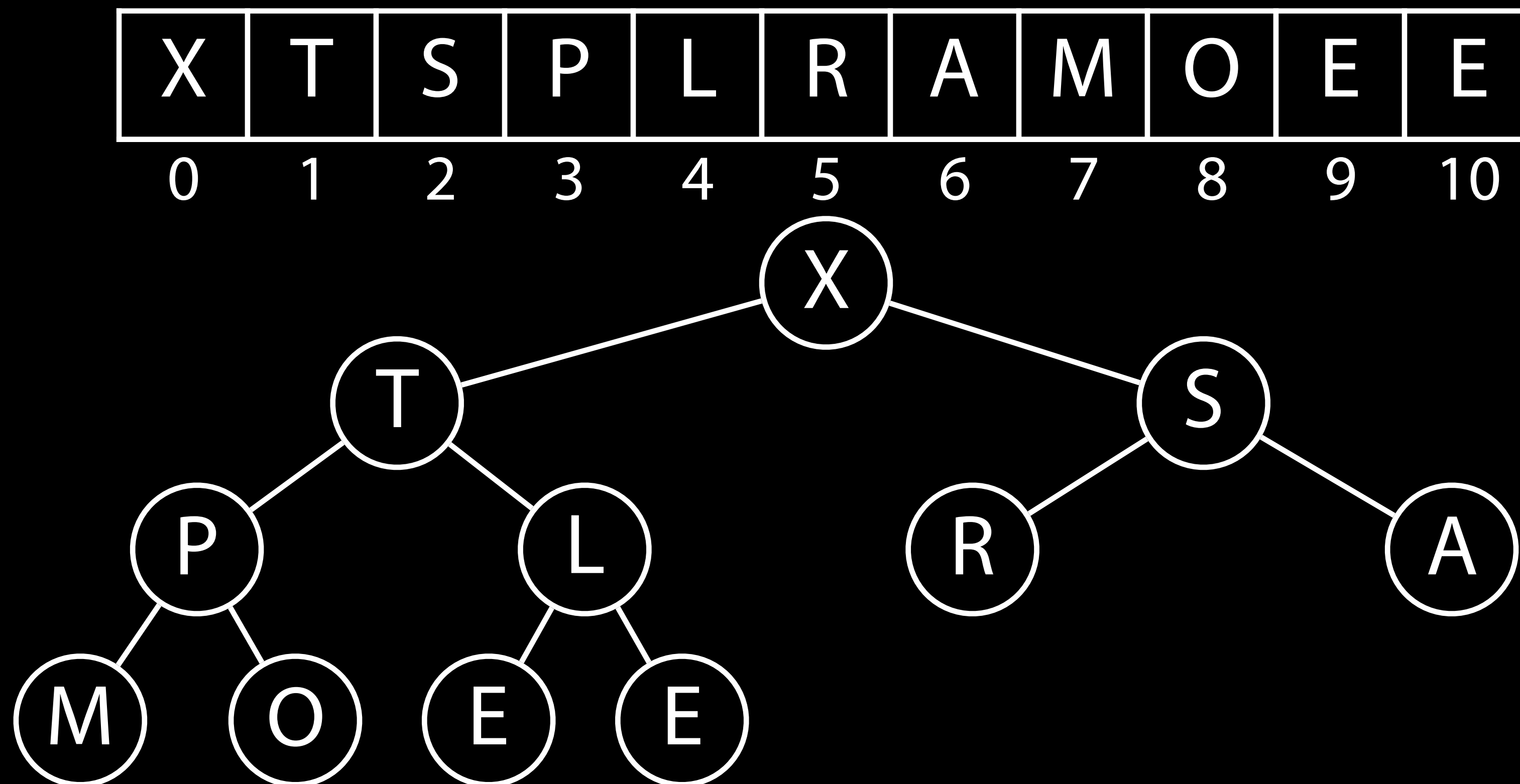
Heapsort

Build a max-heap using bottom-up method.



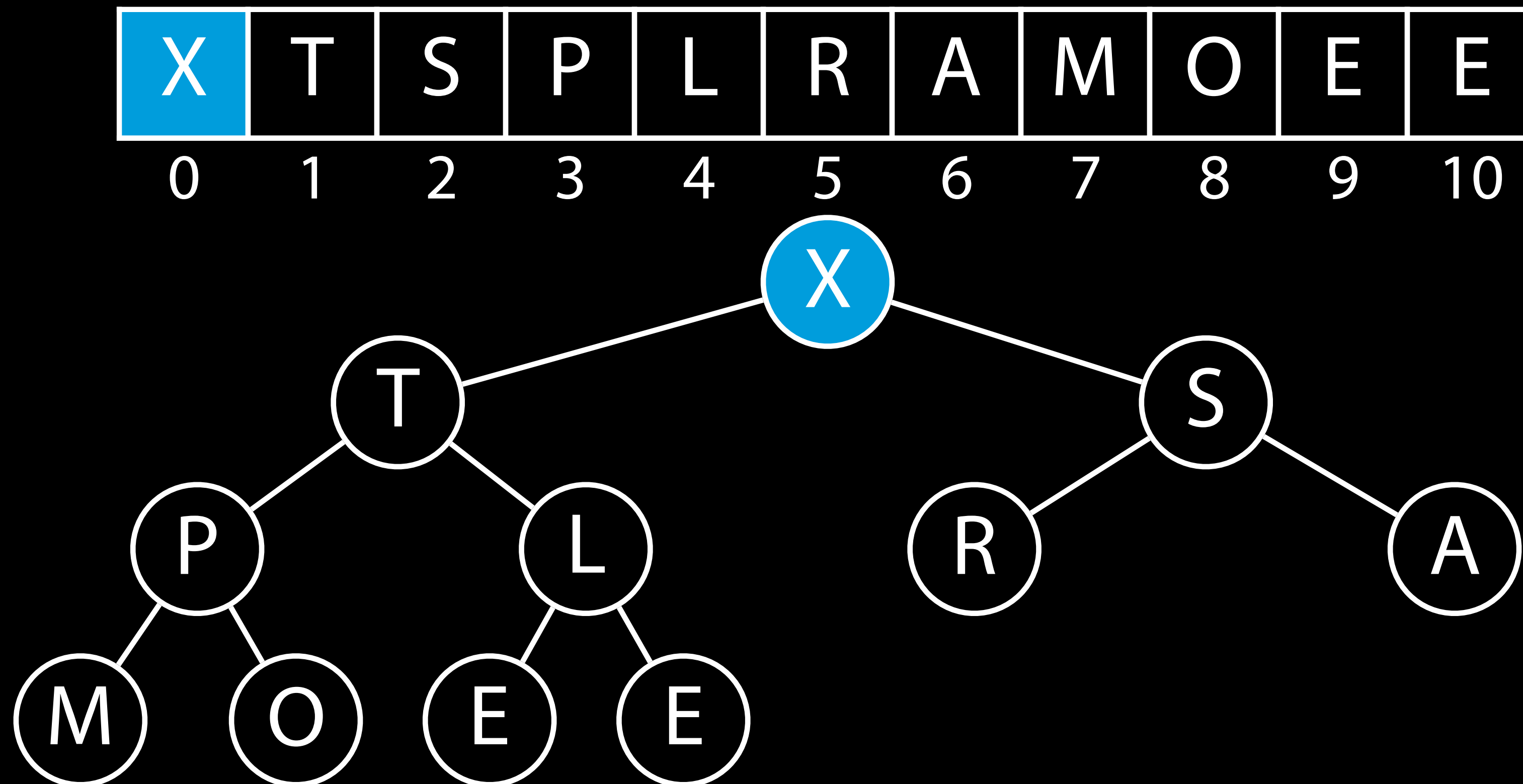
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



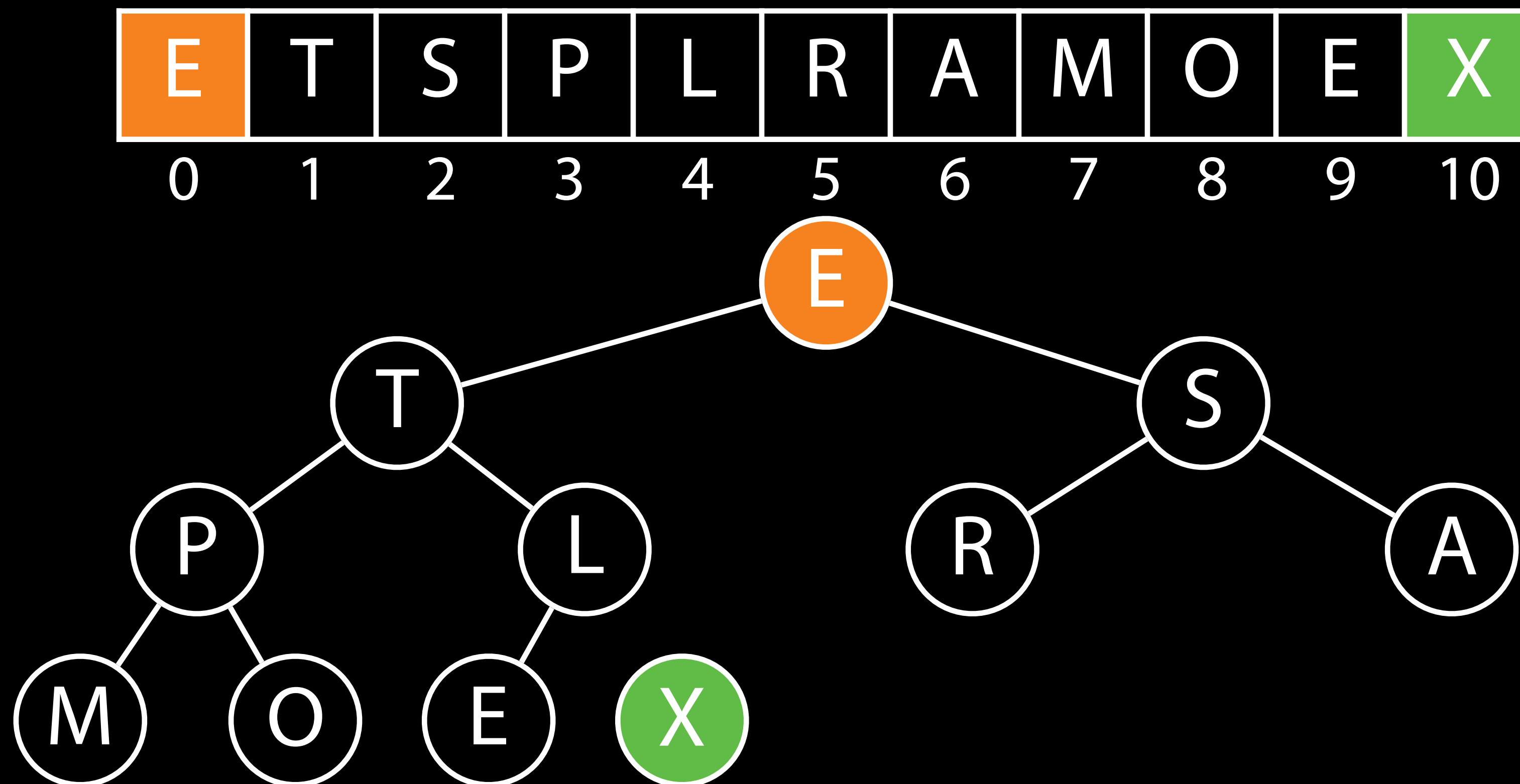
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



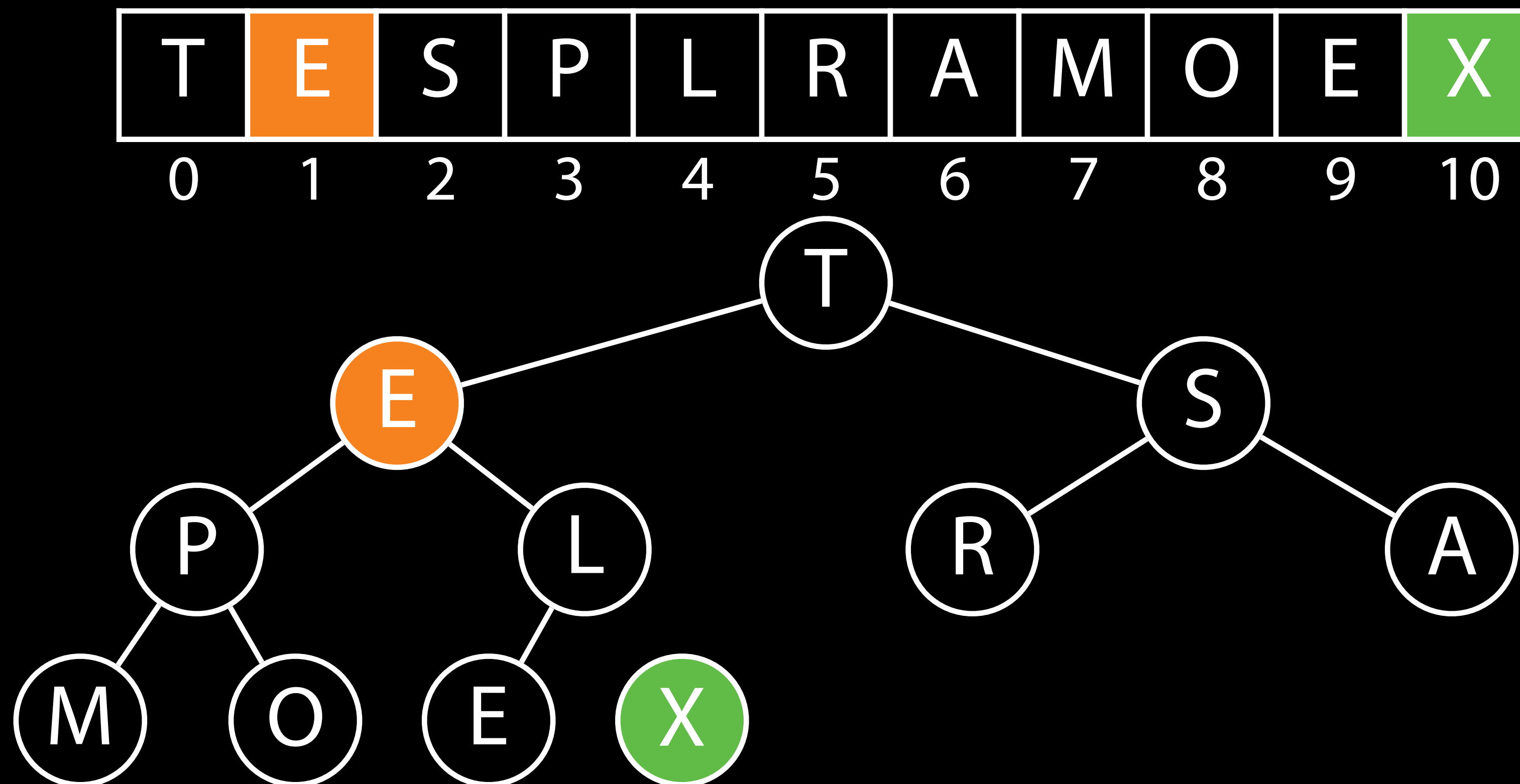
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



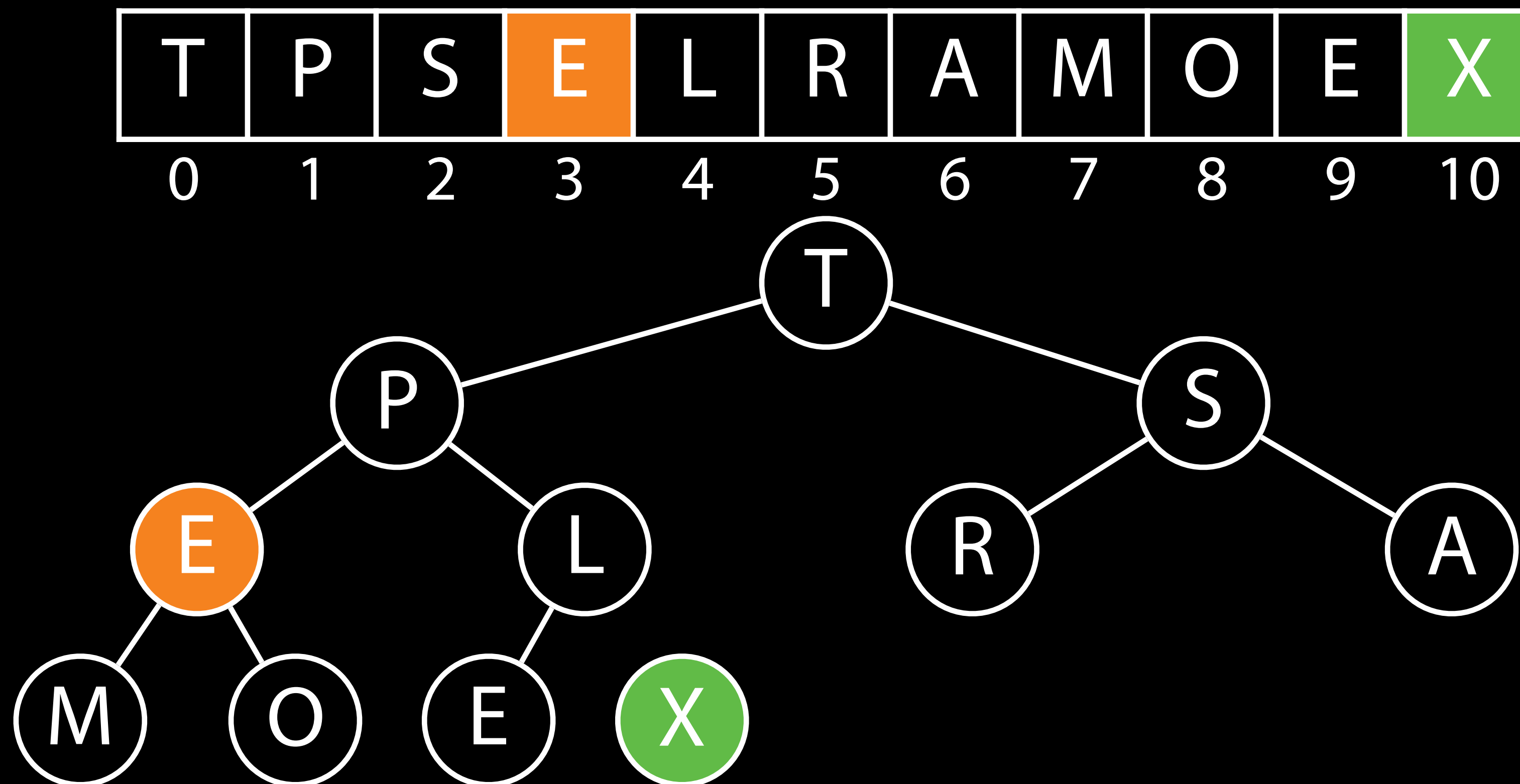
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



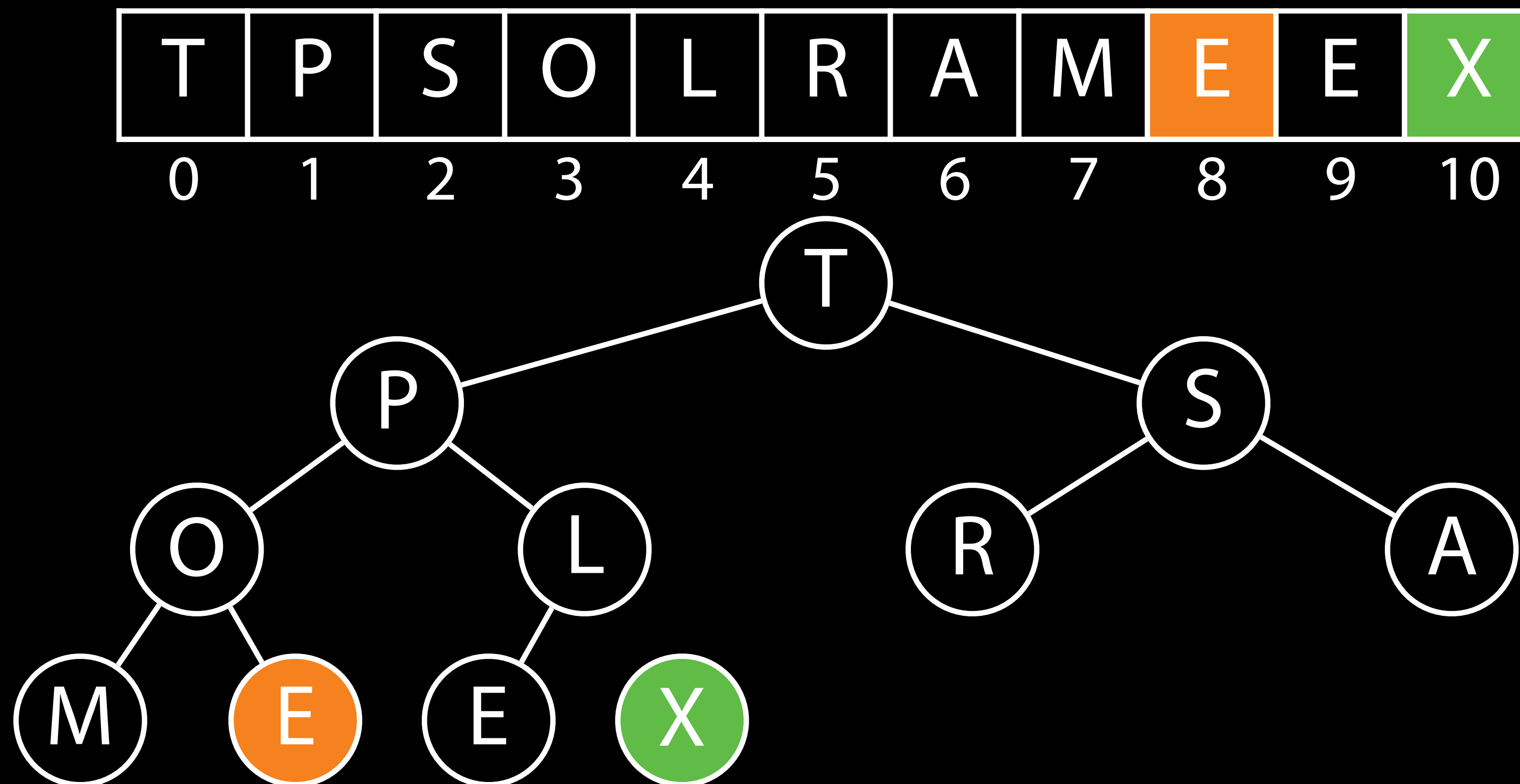
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



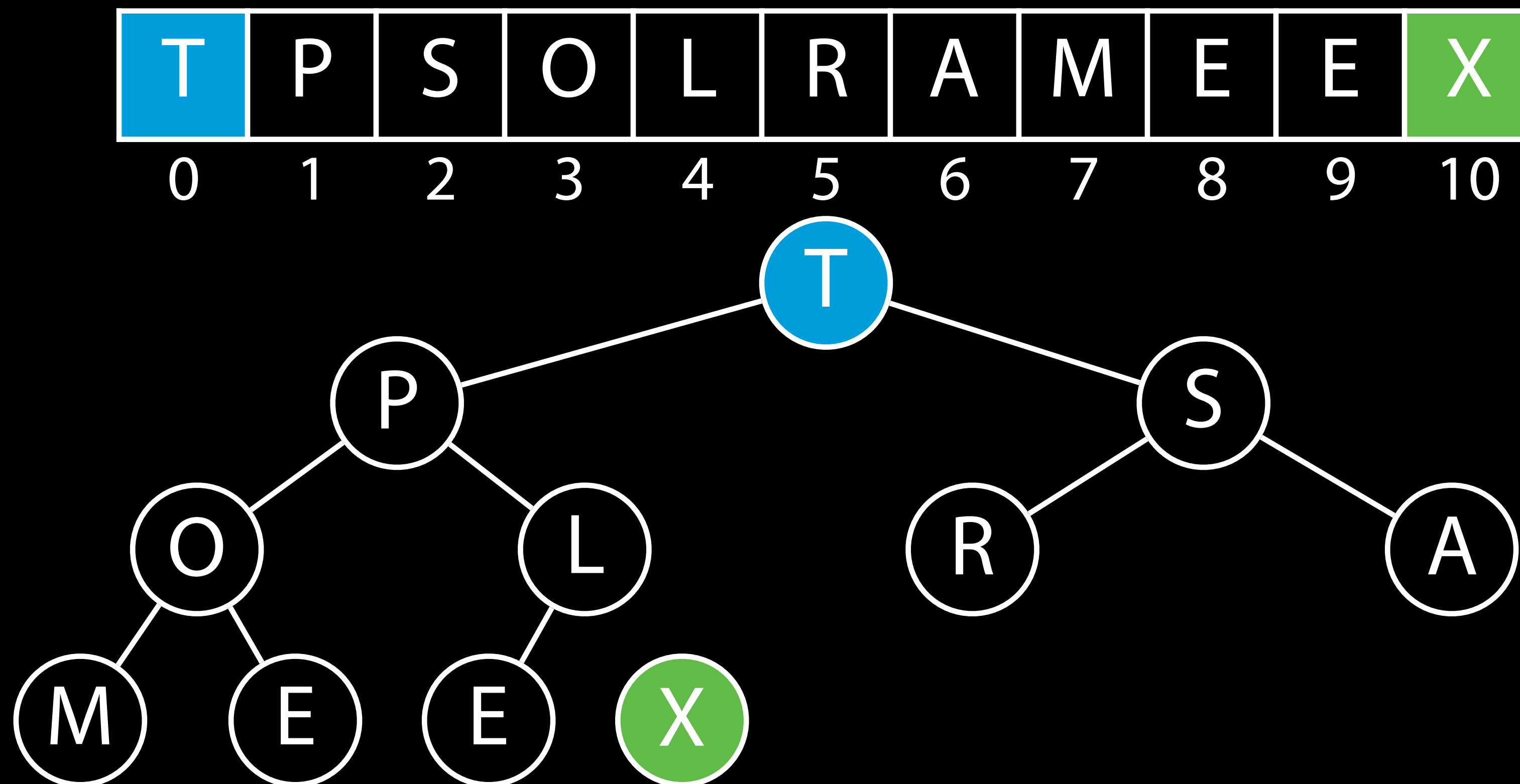
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



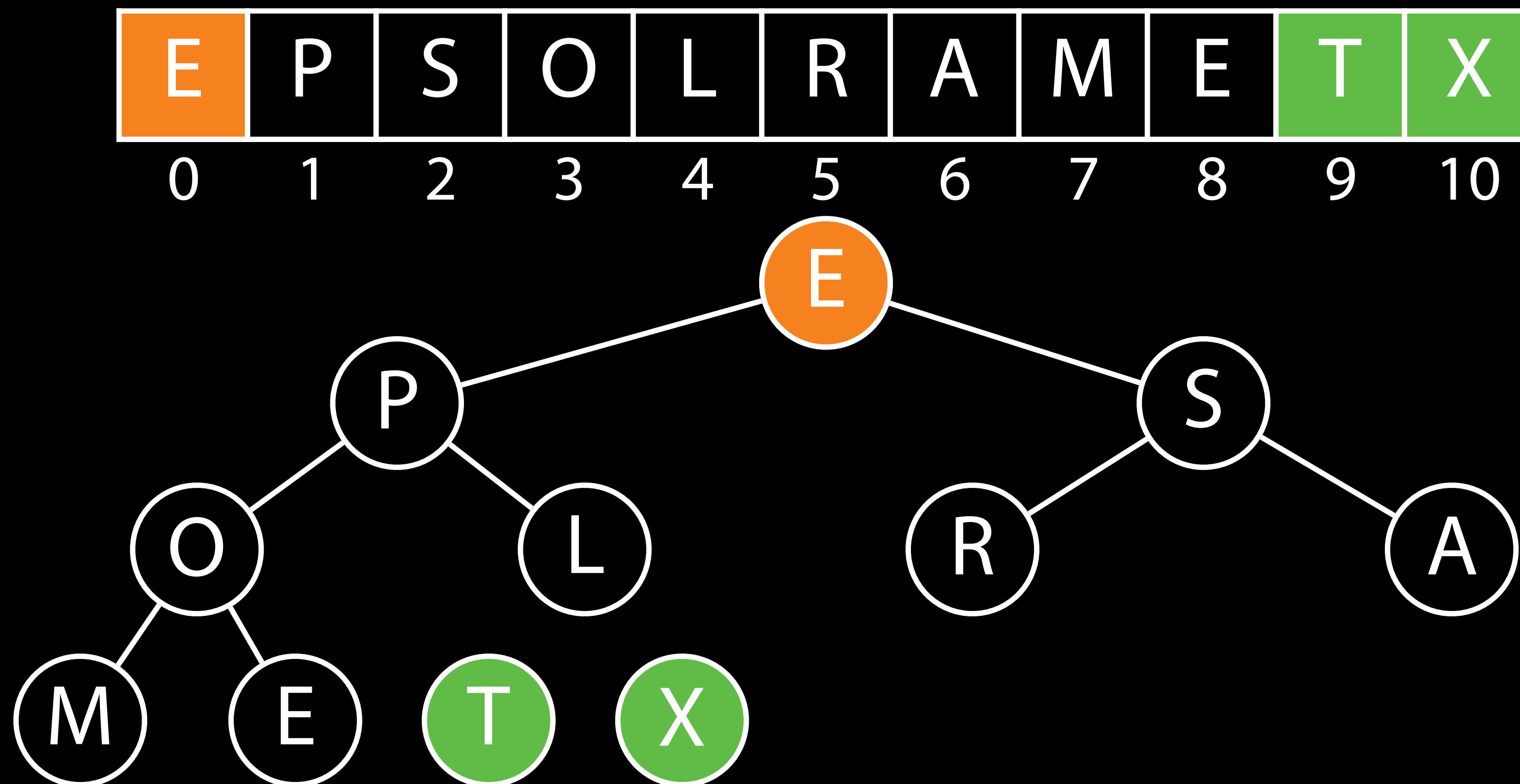
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



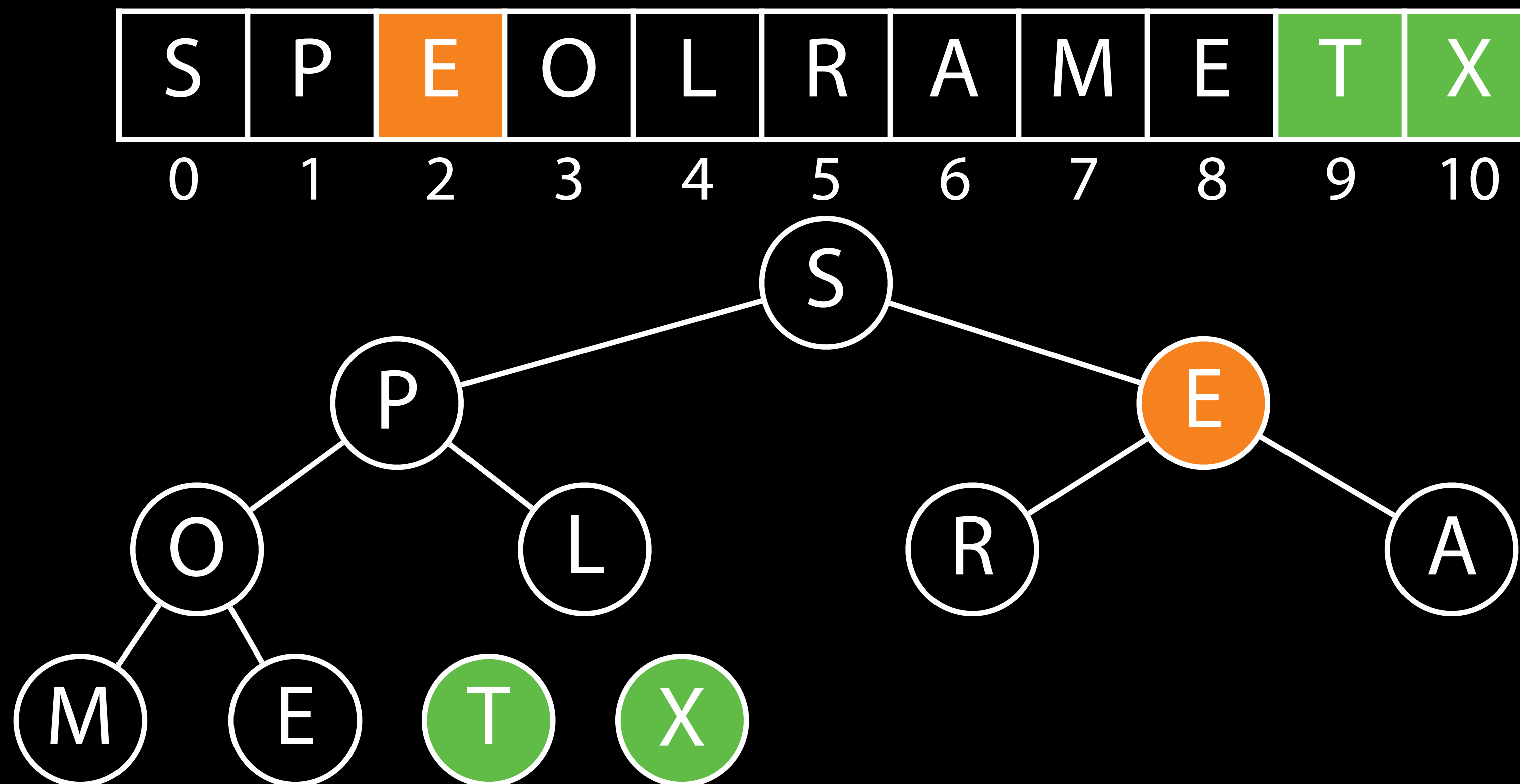
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



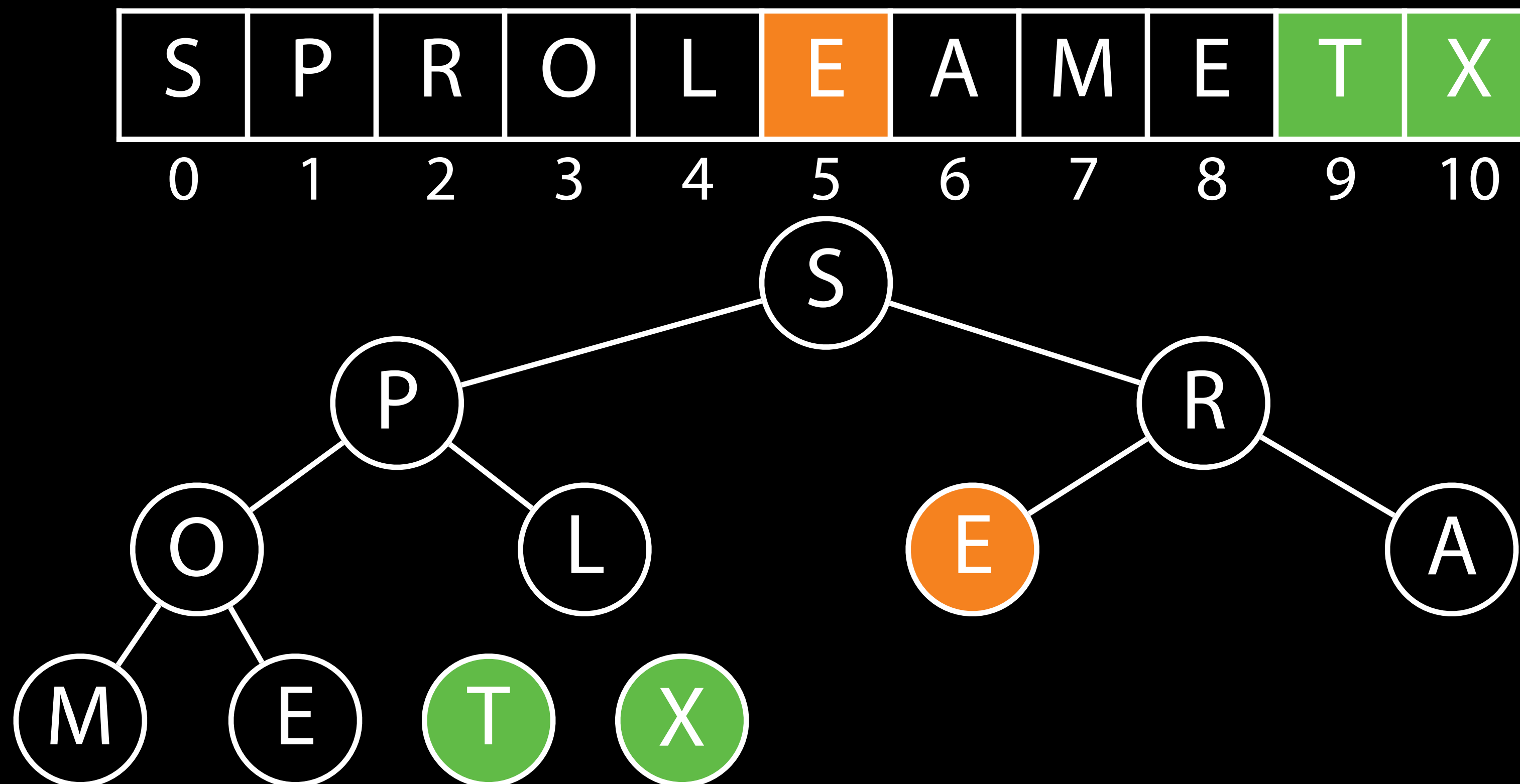
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



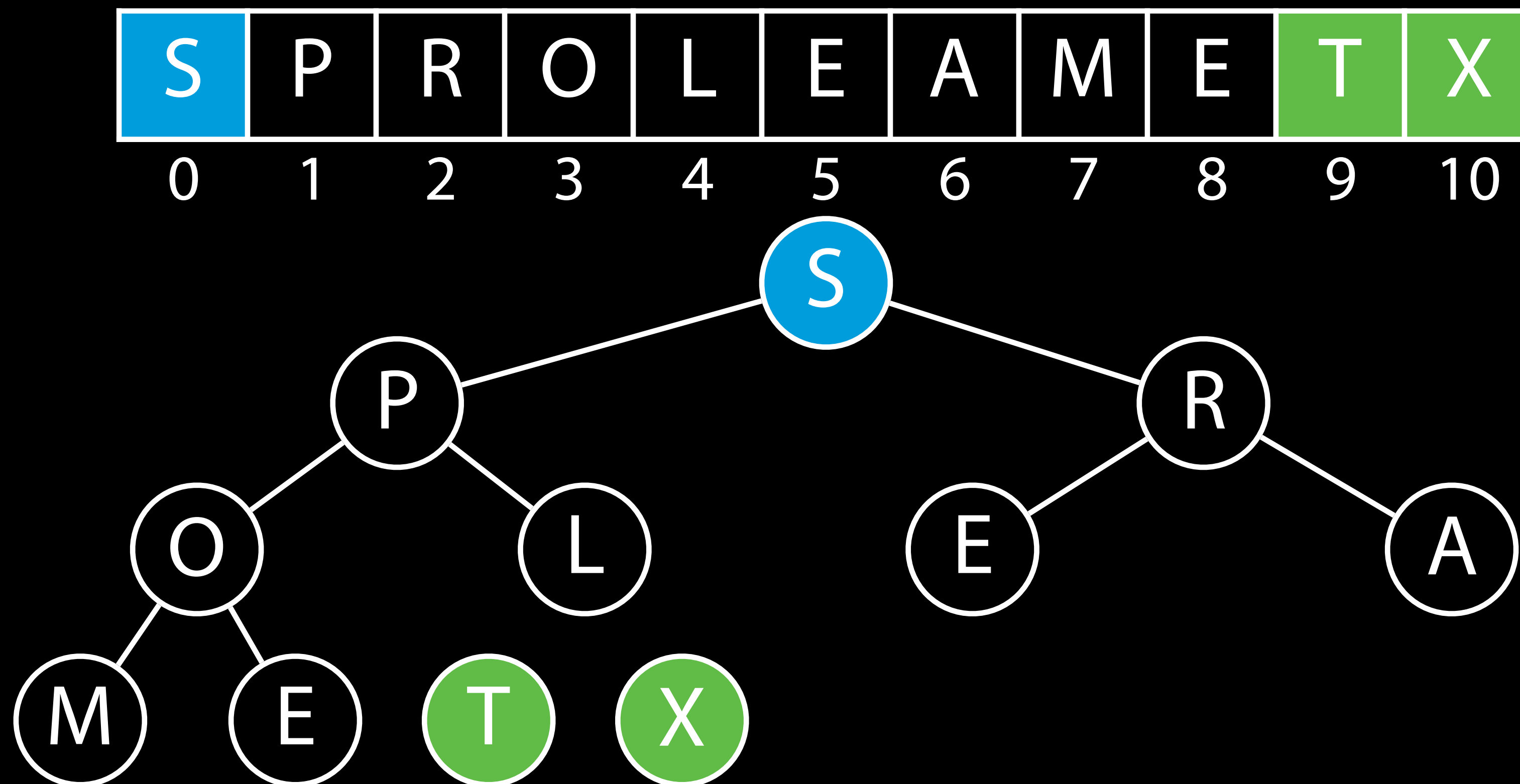
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



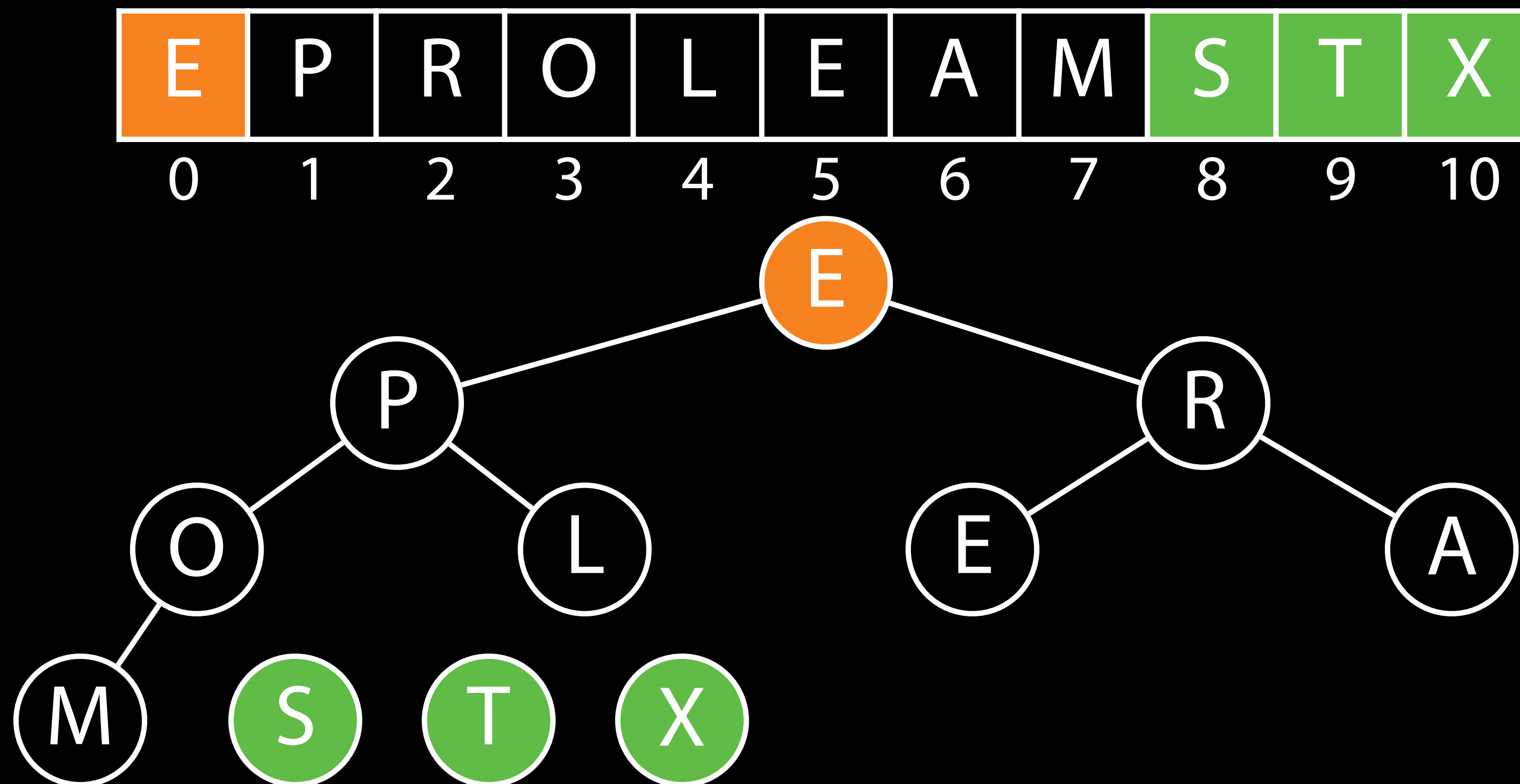
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



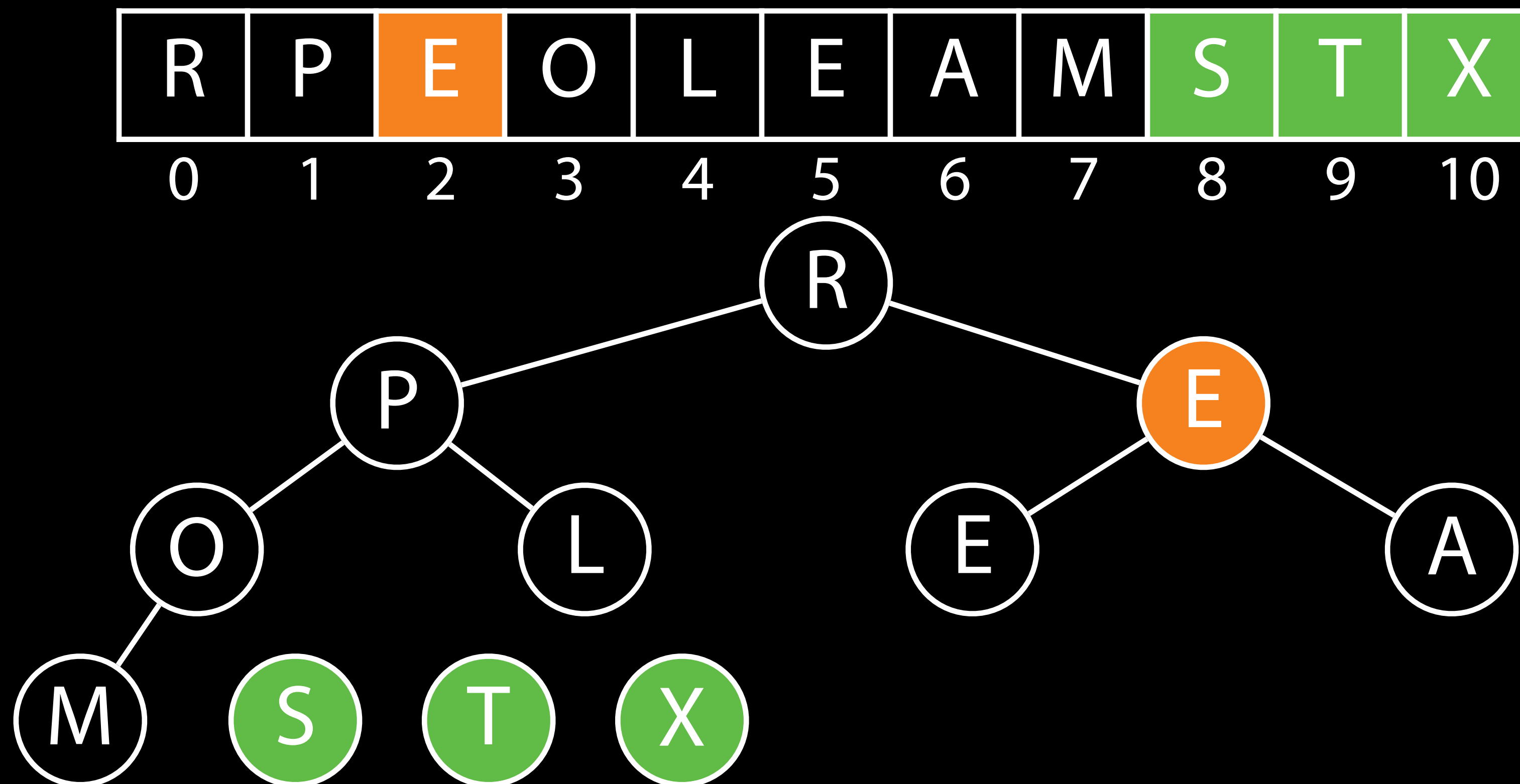
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



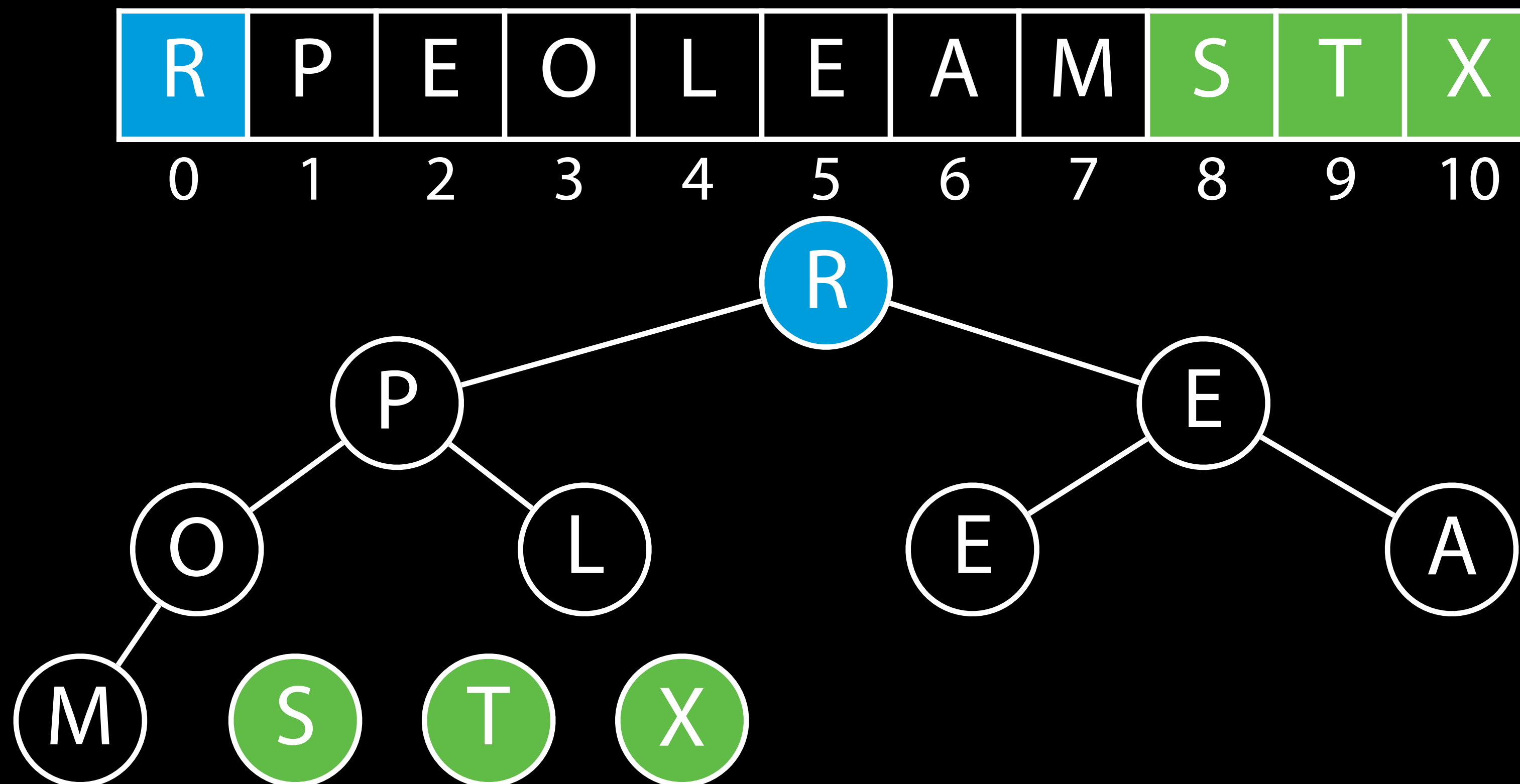
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



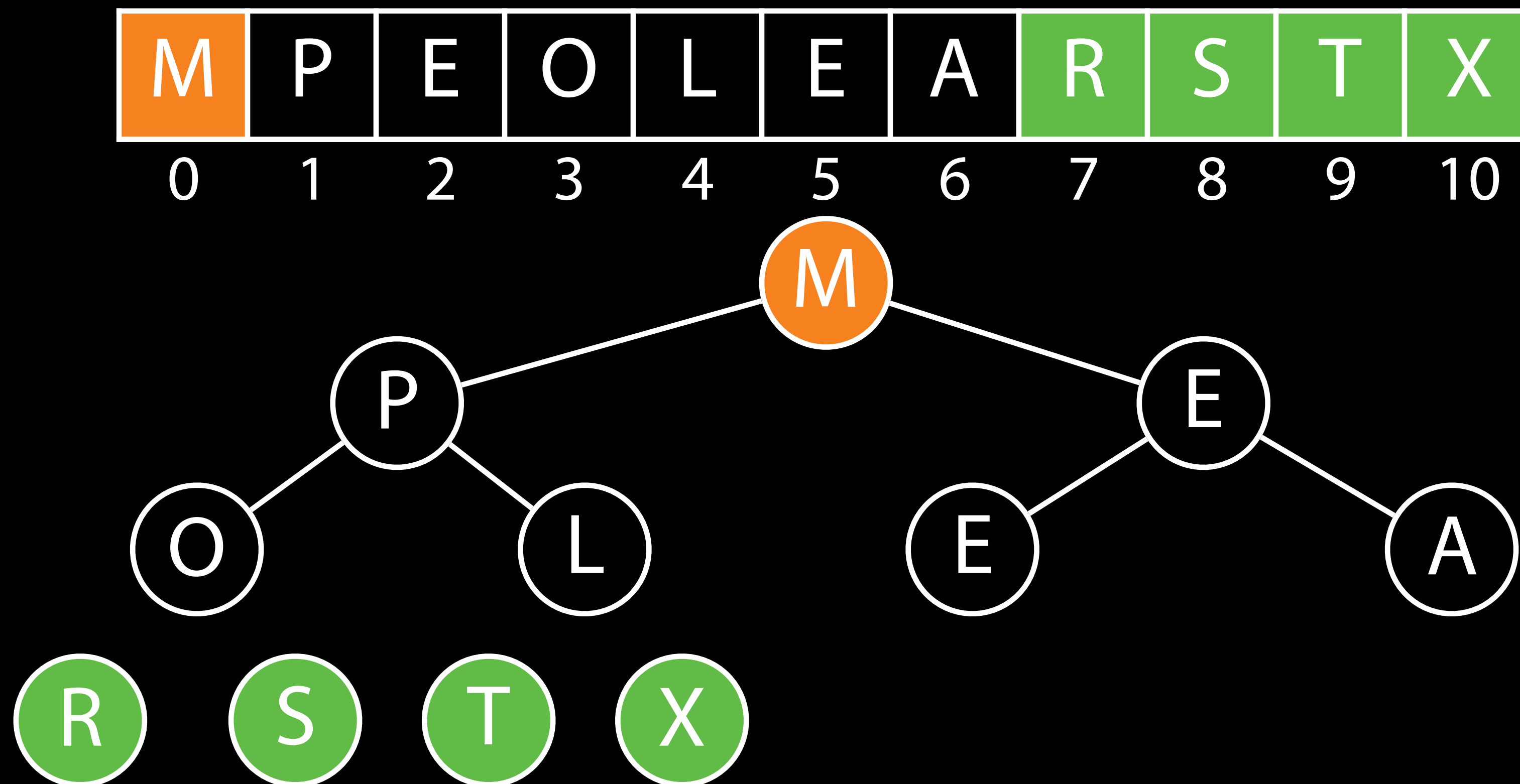
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



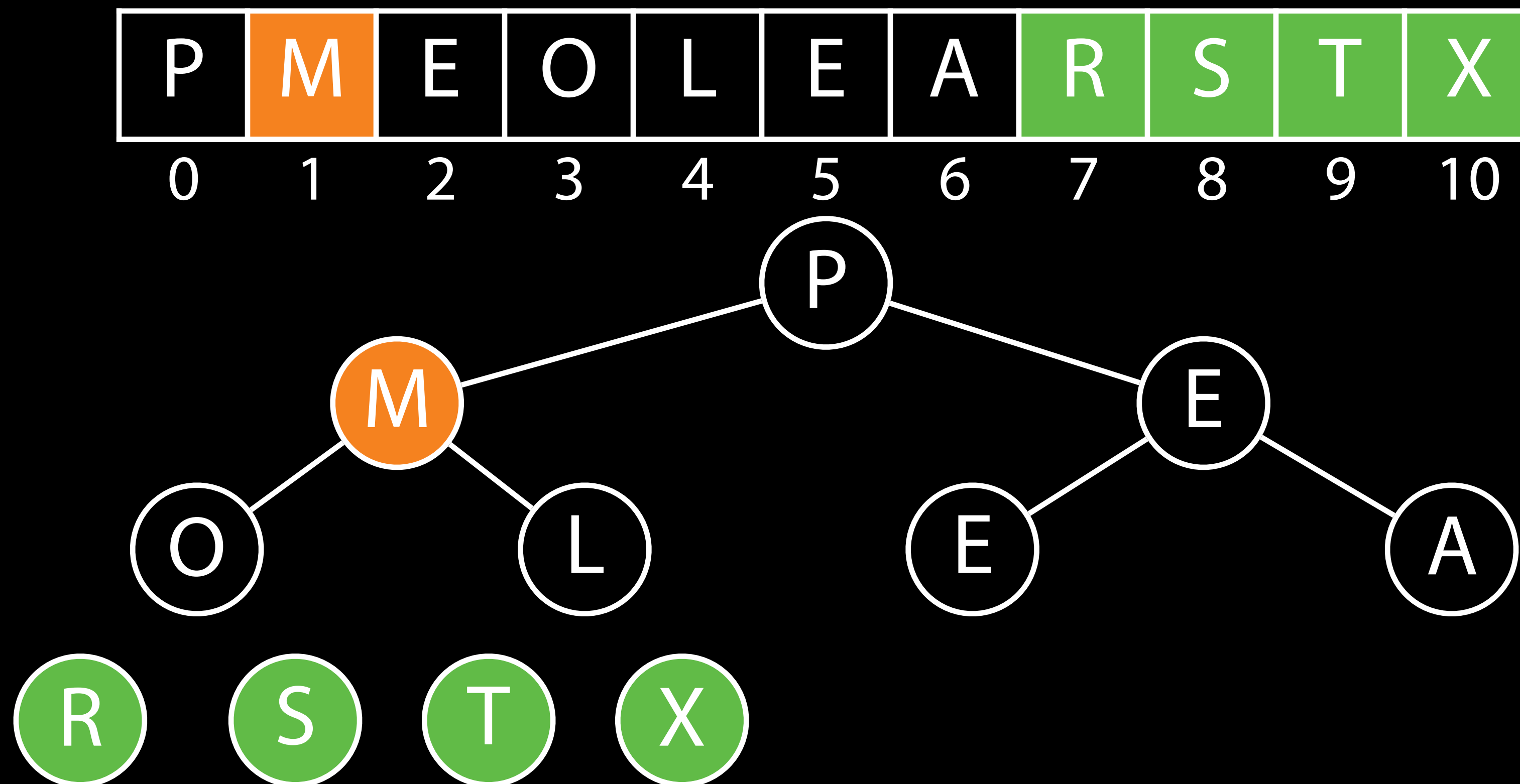
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



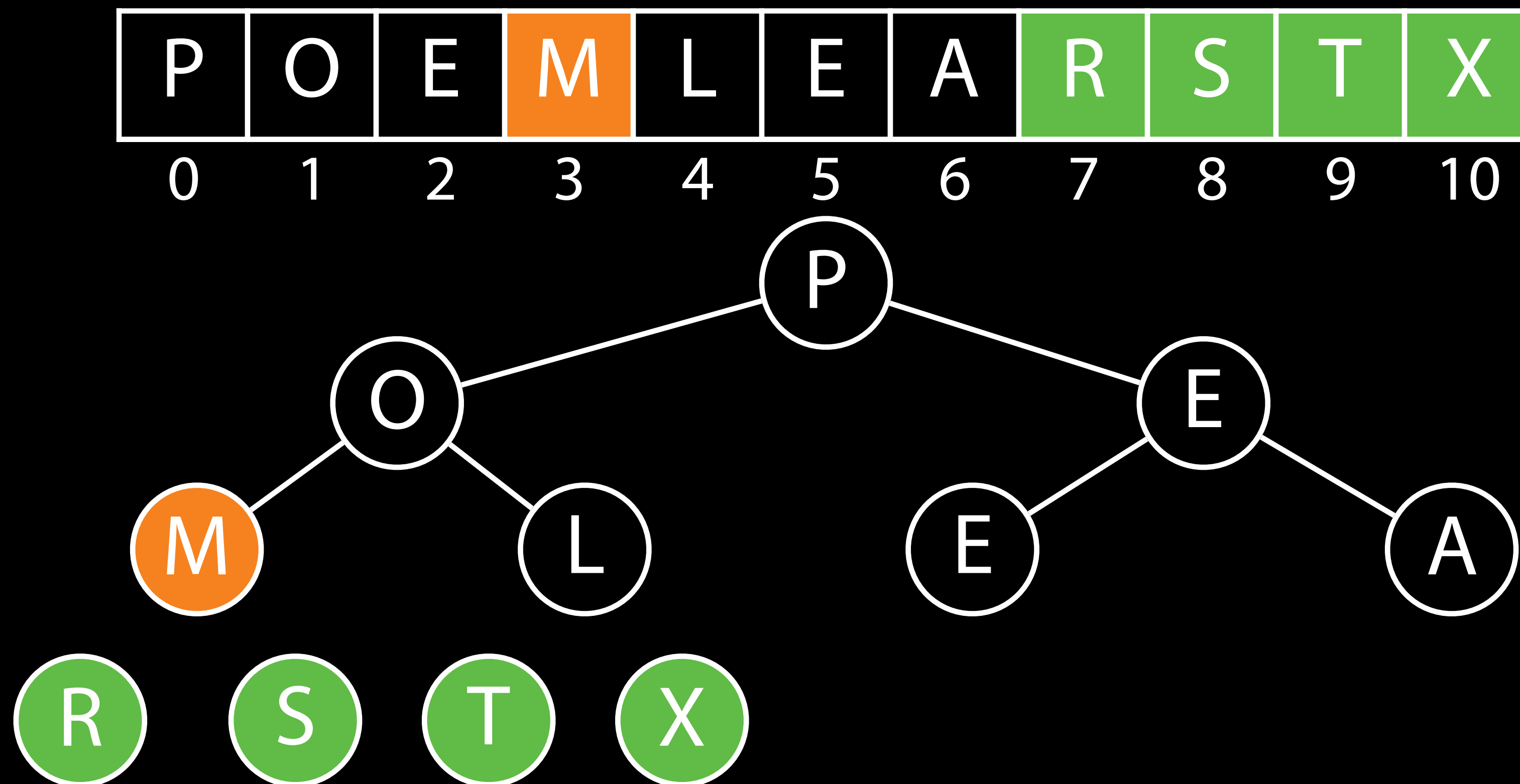
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



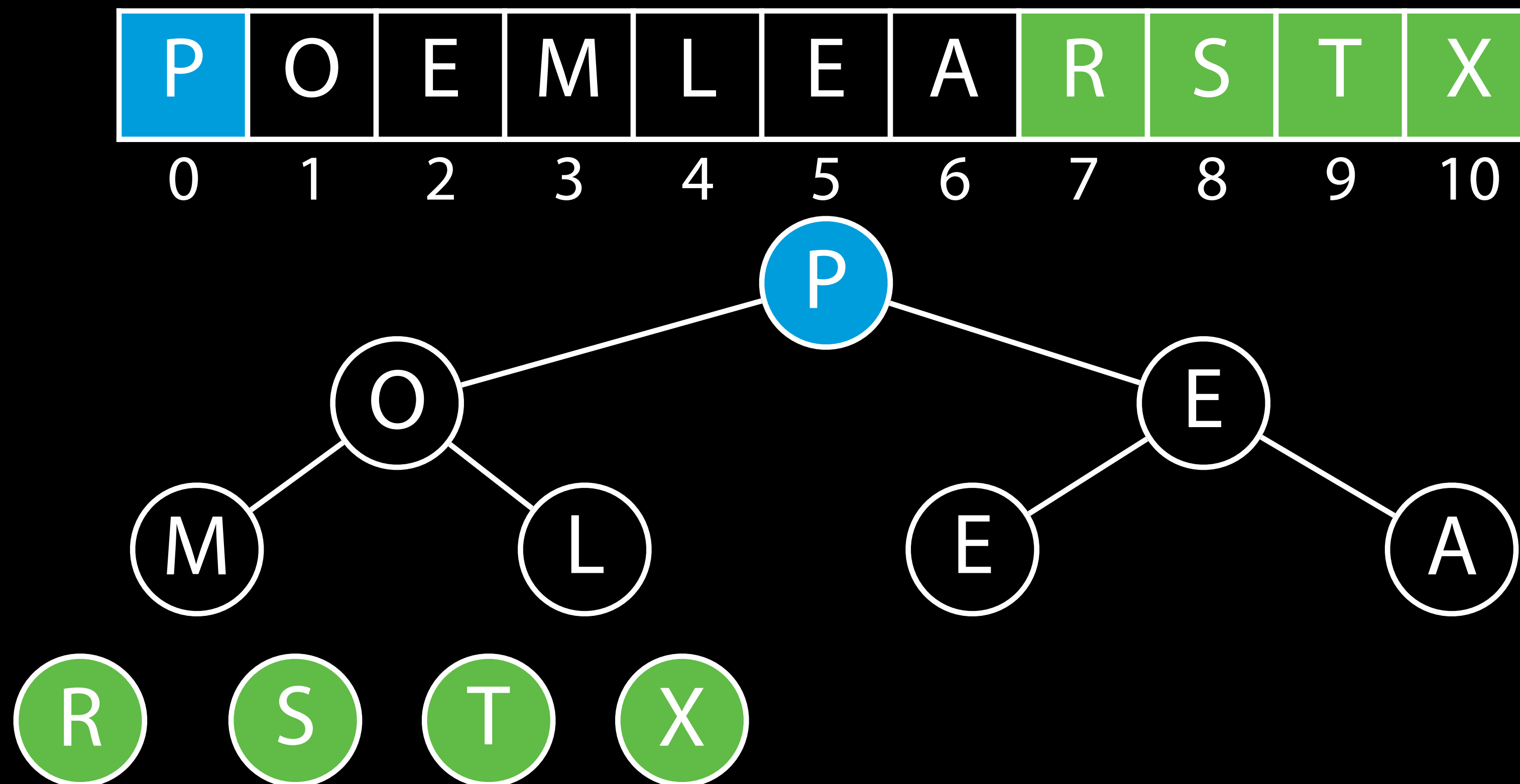
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



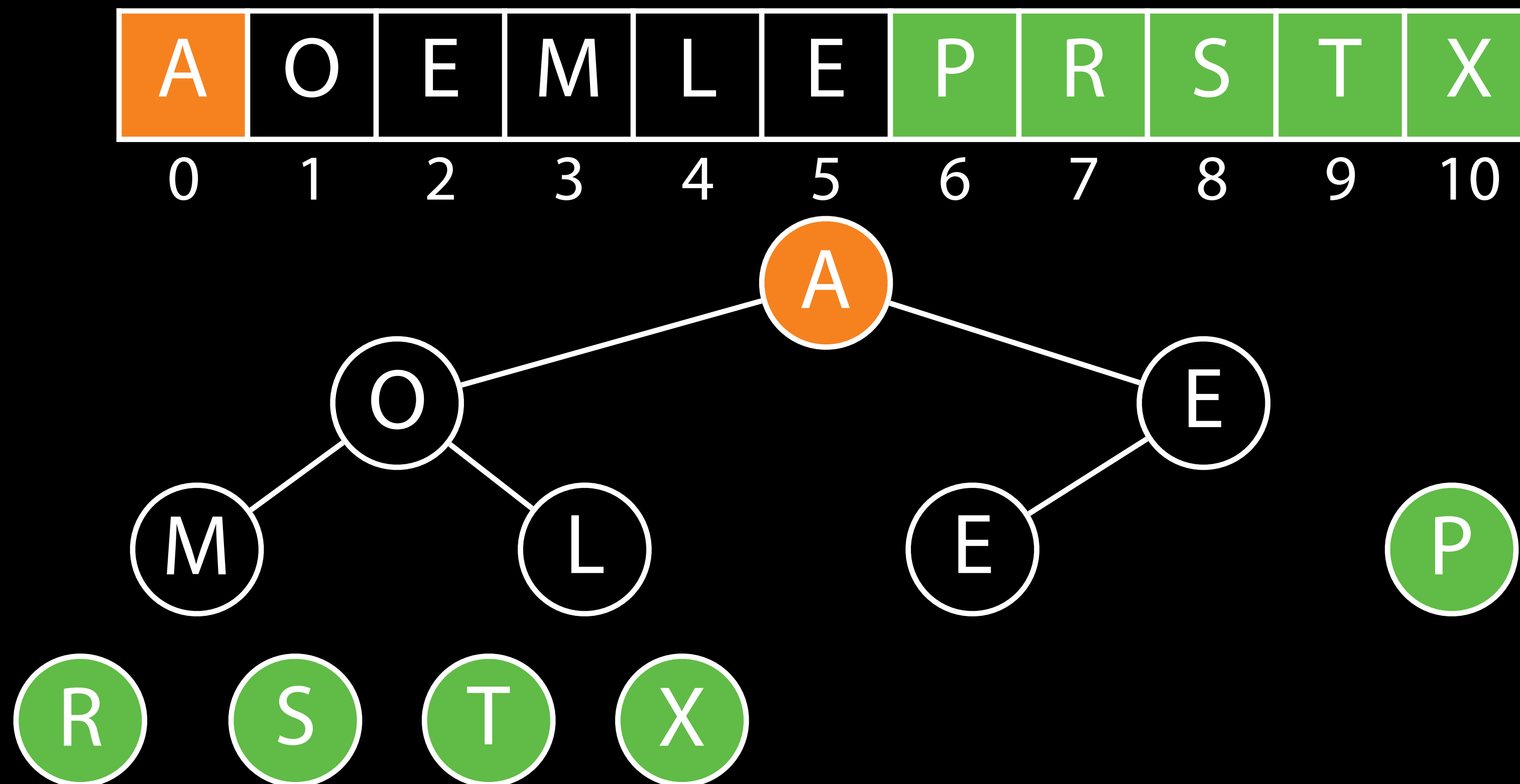
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



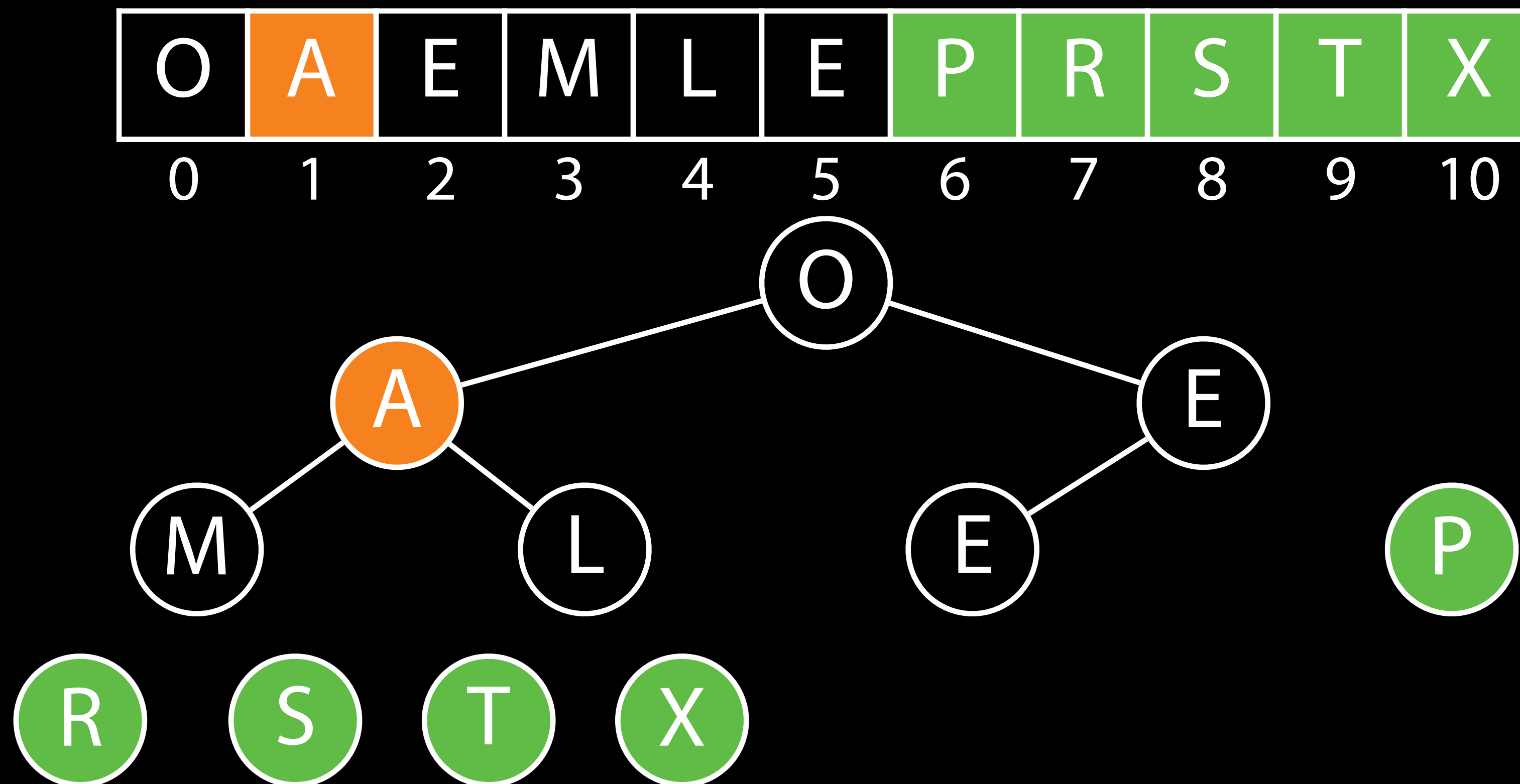
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



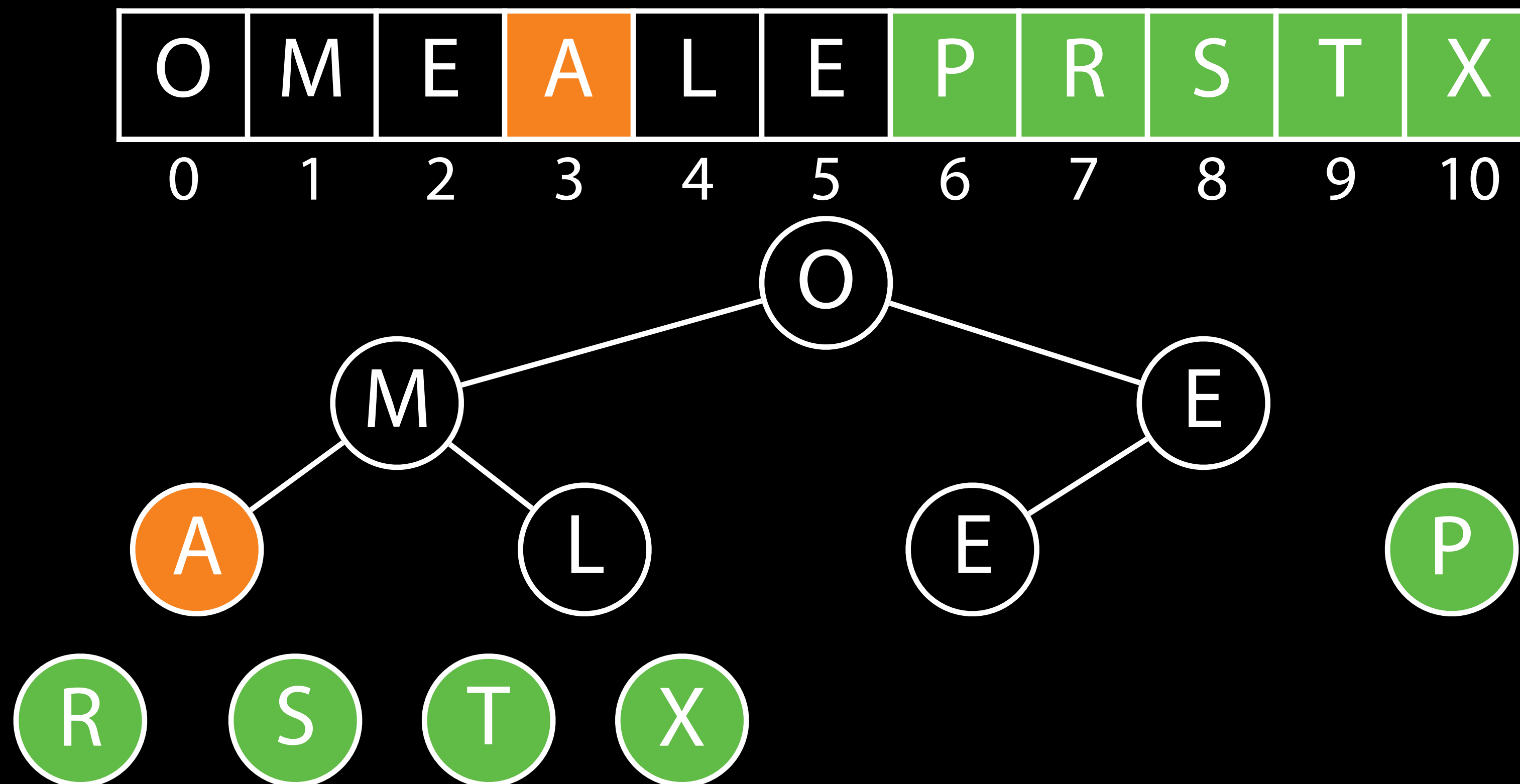
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



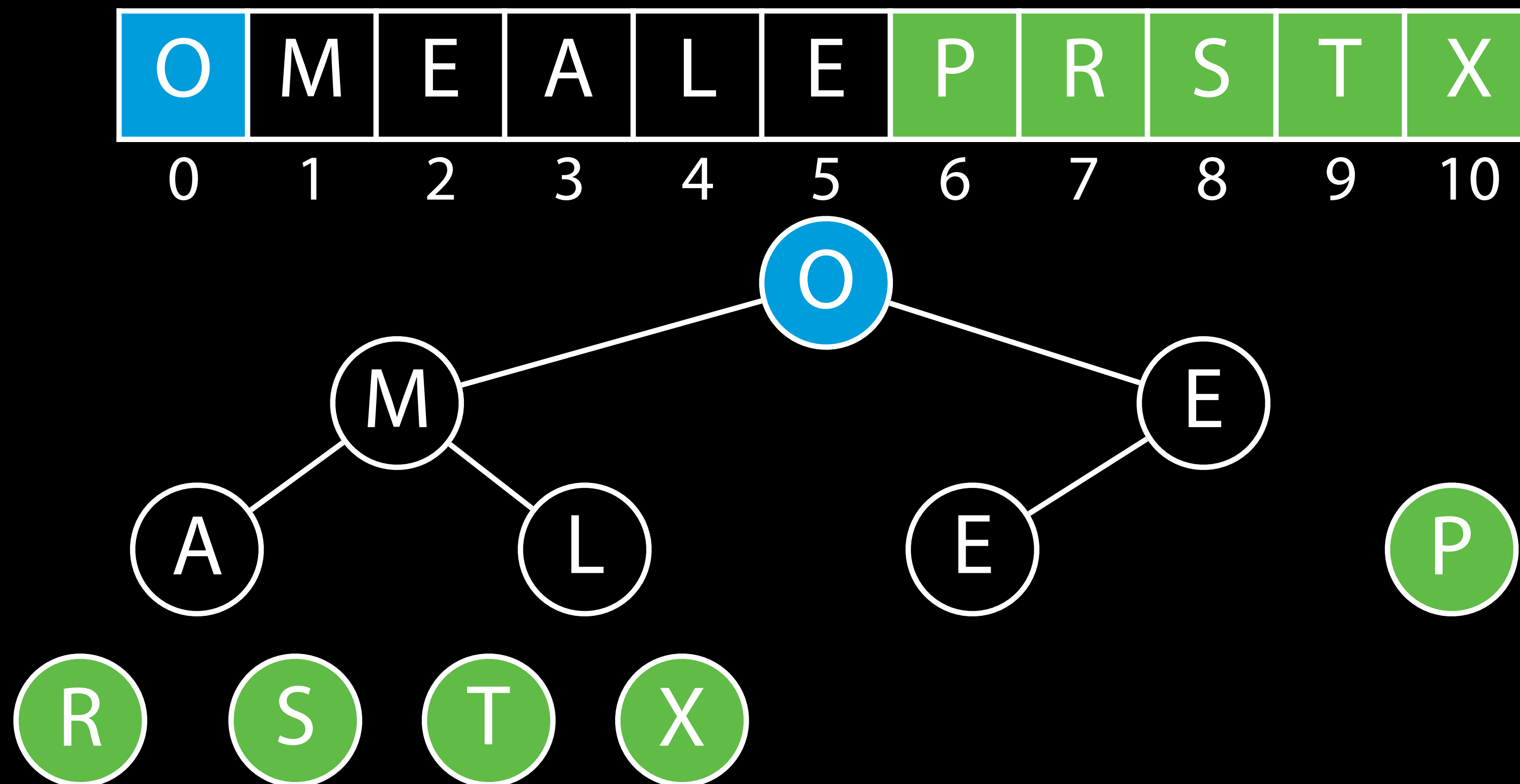
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



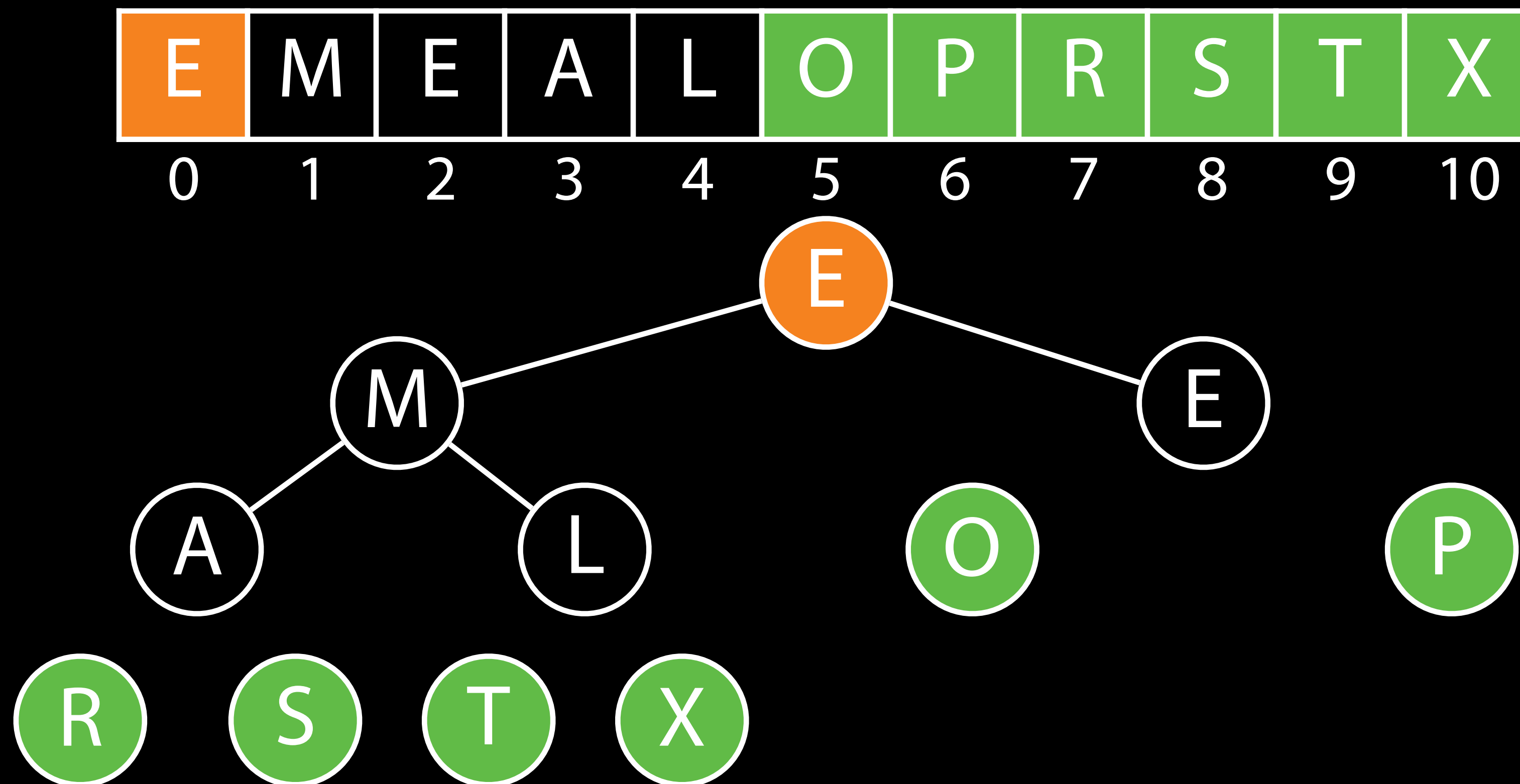
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



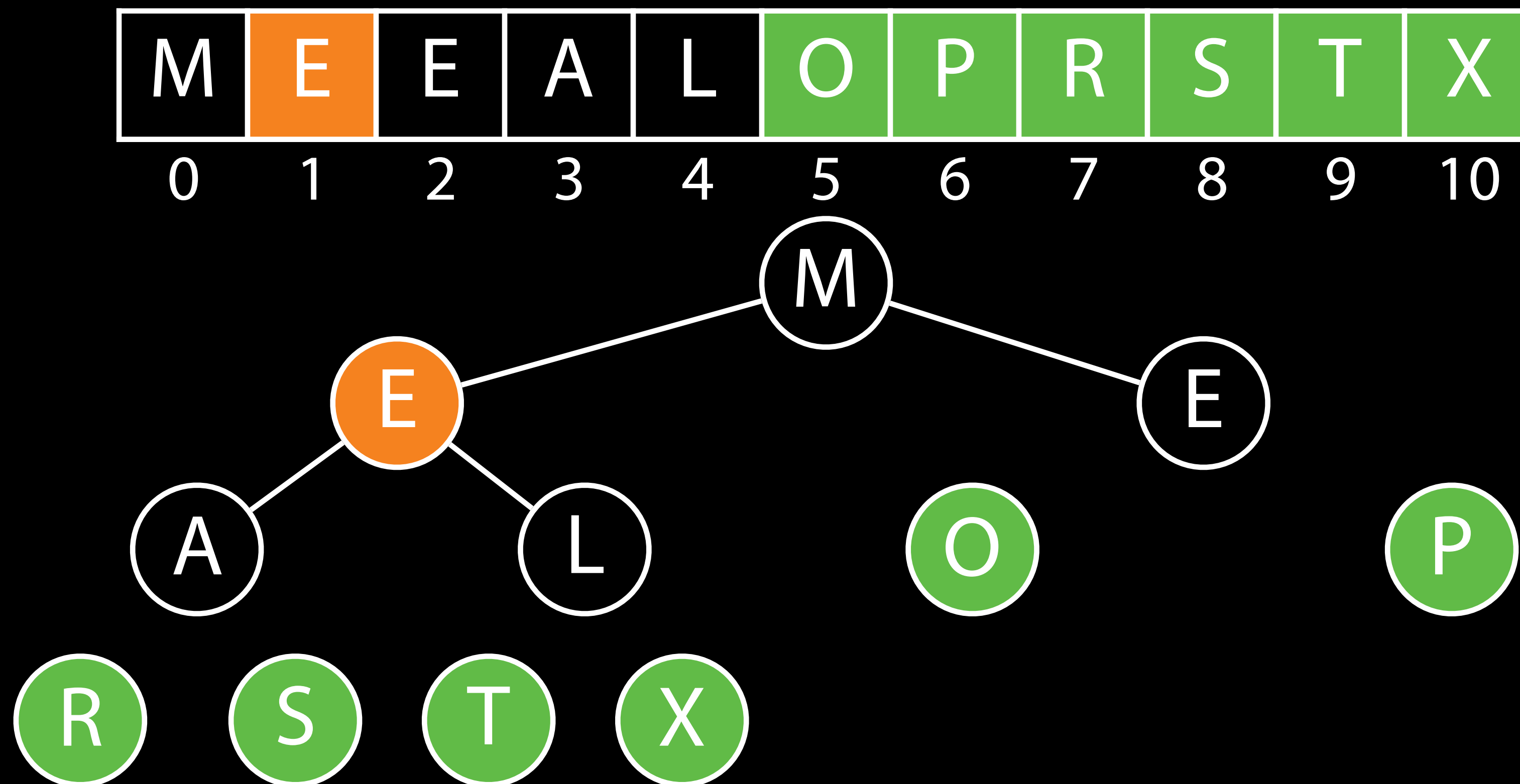
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



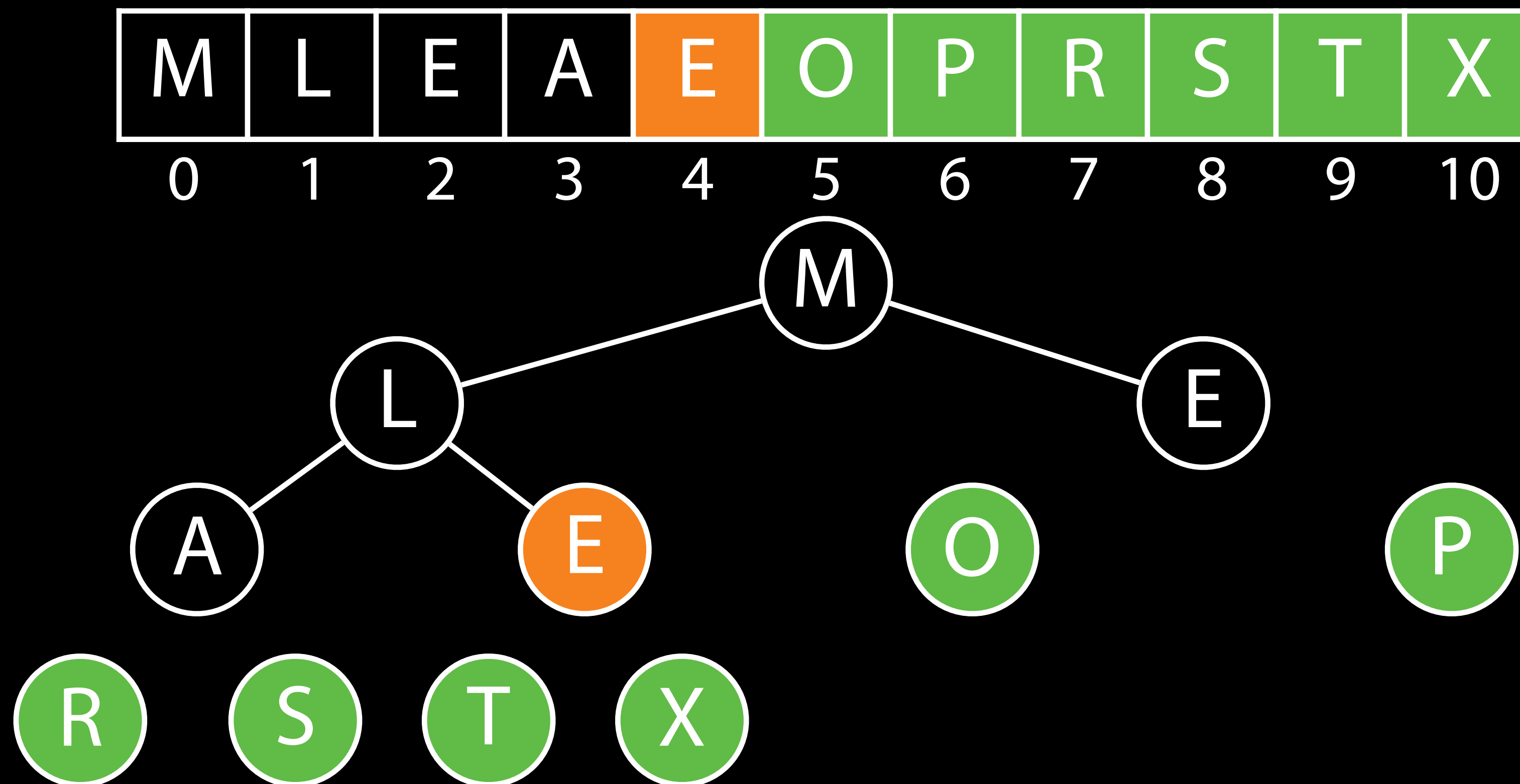
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



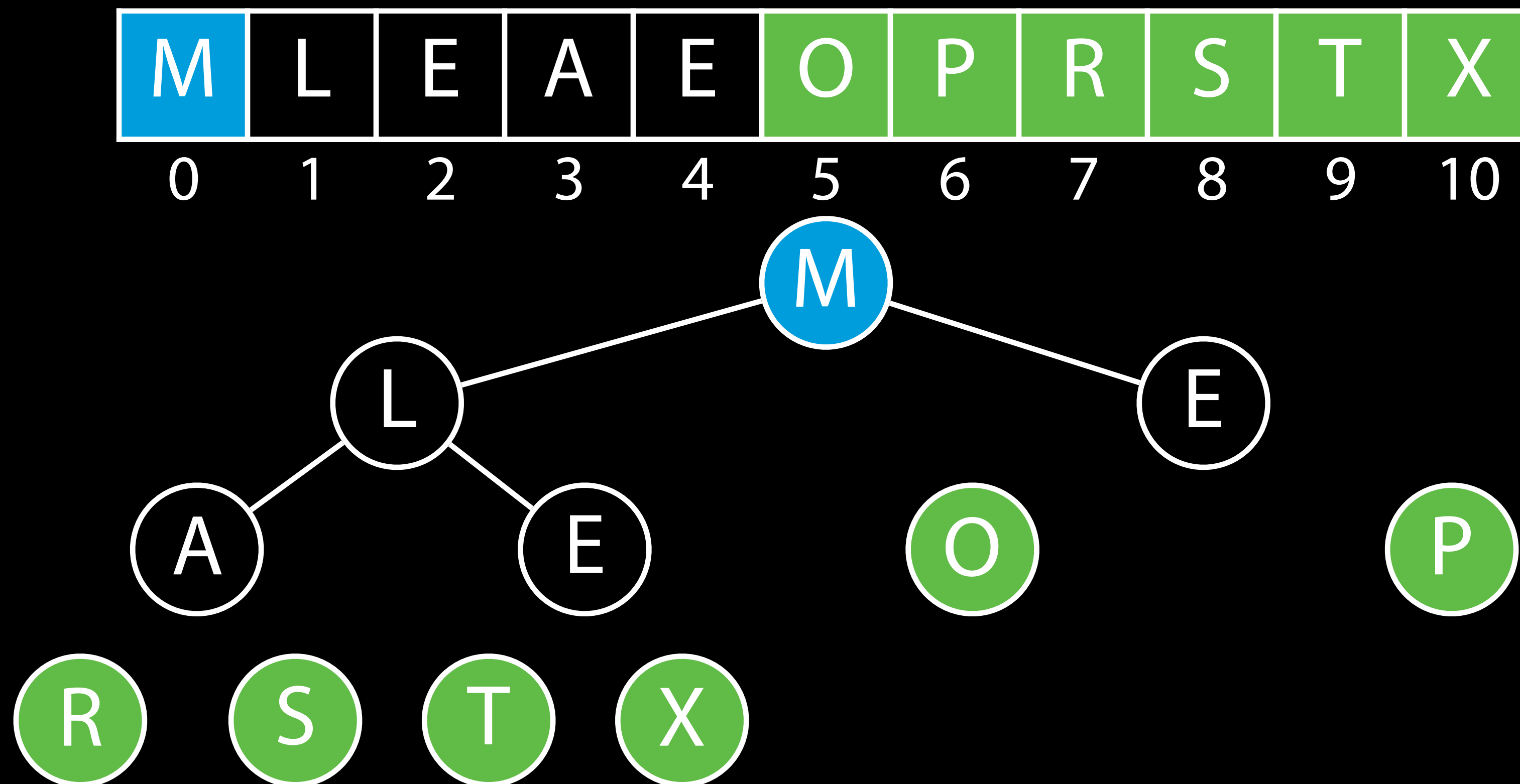
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



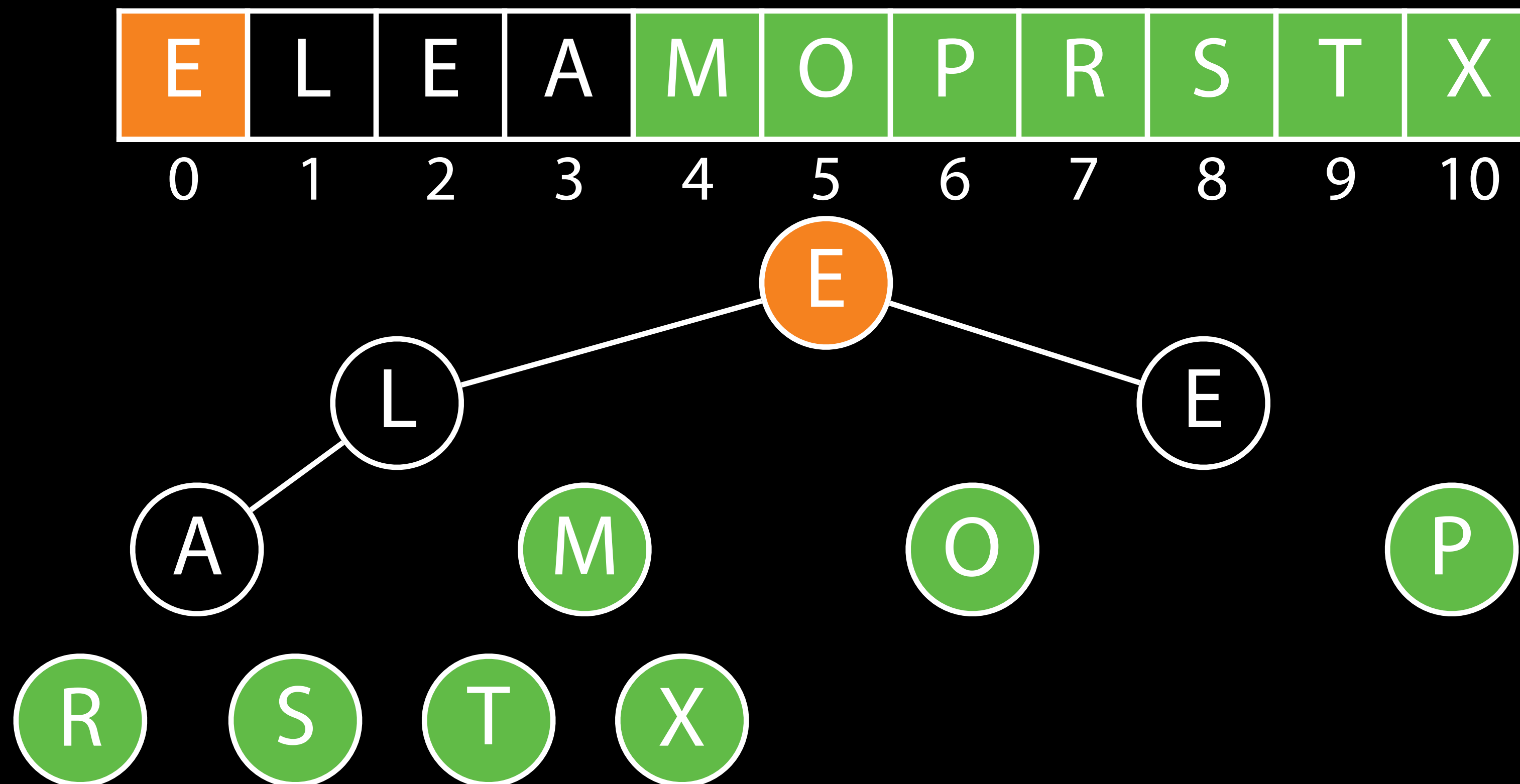
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



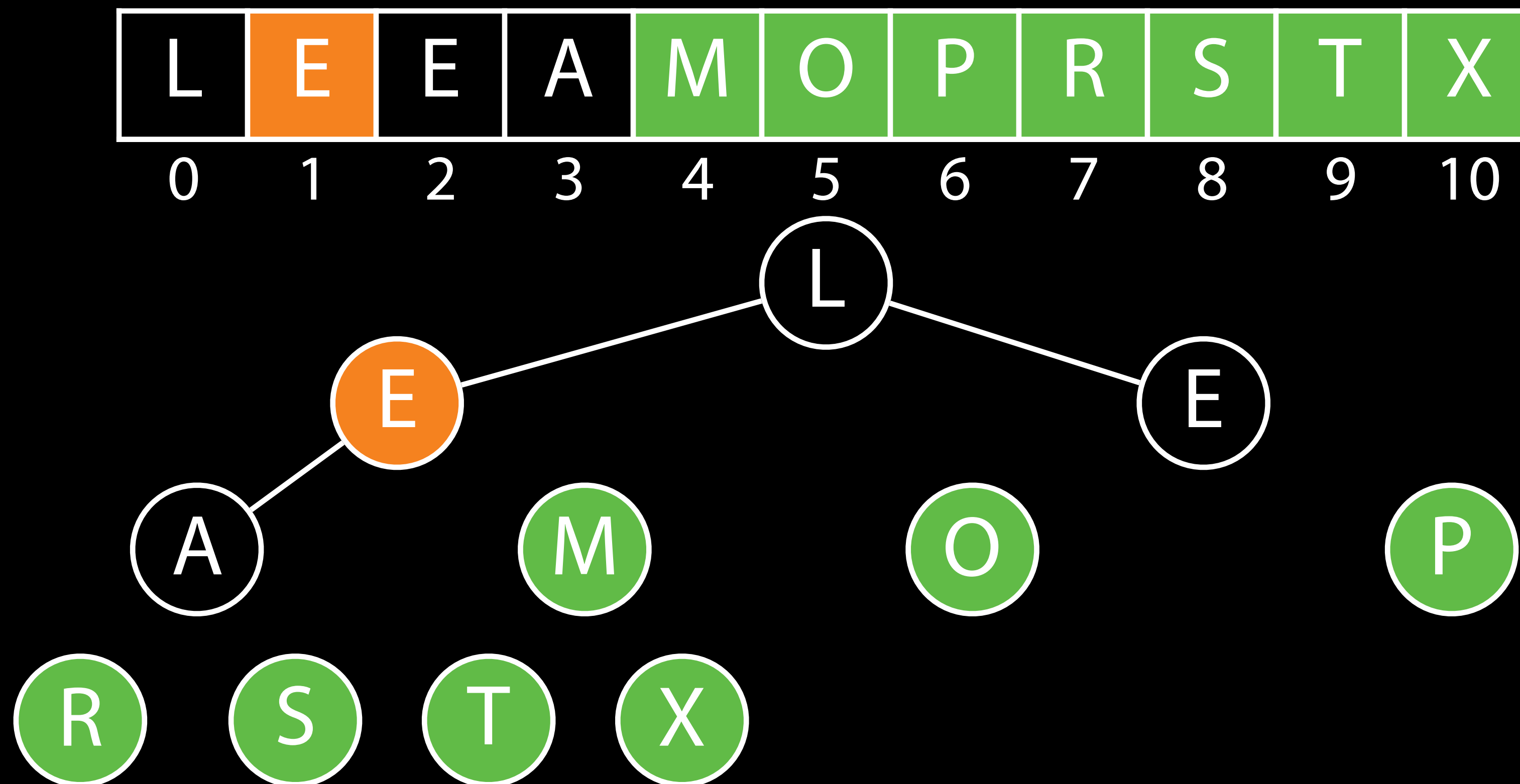
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



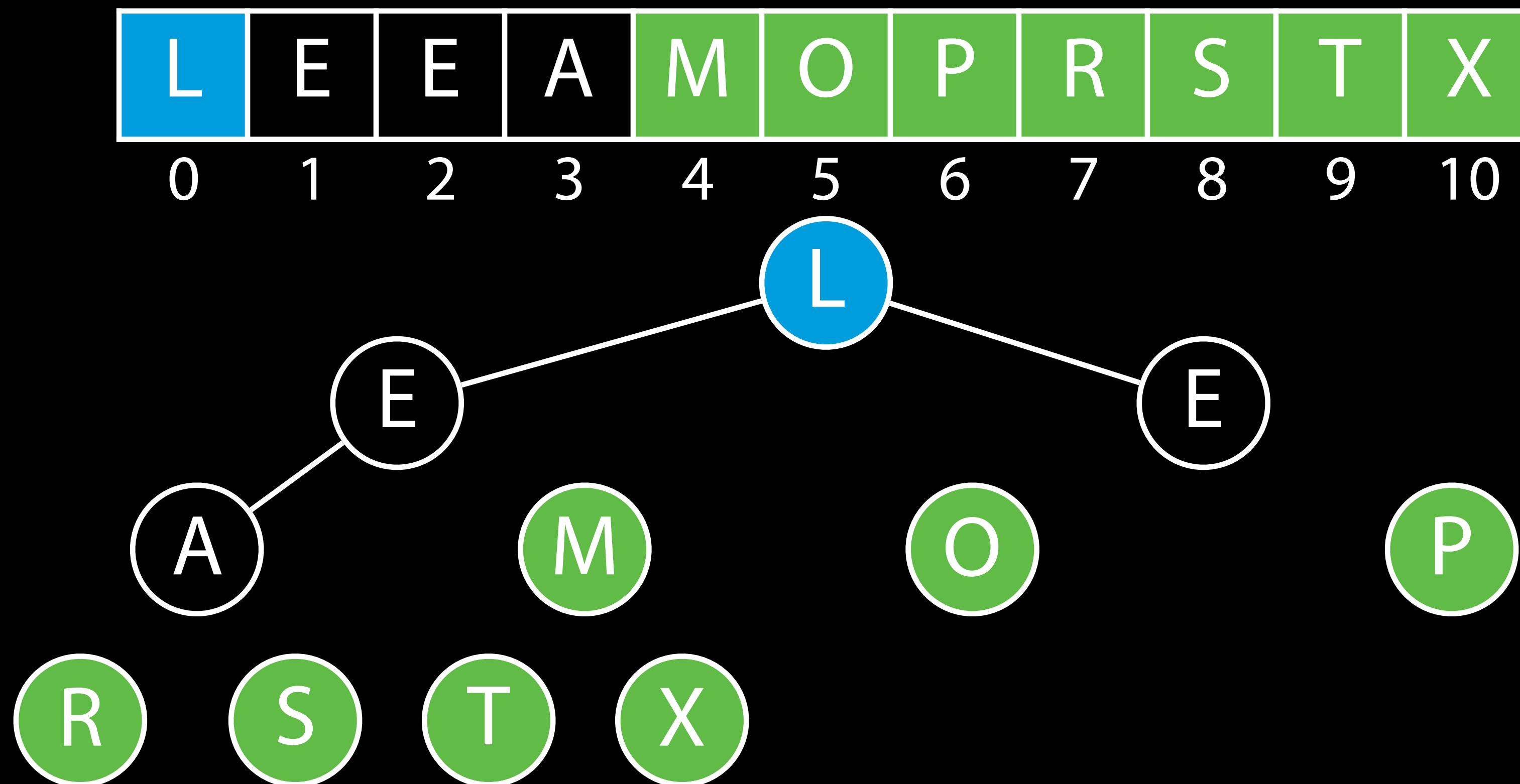
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



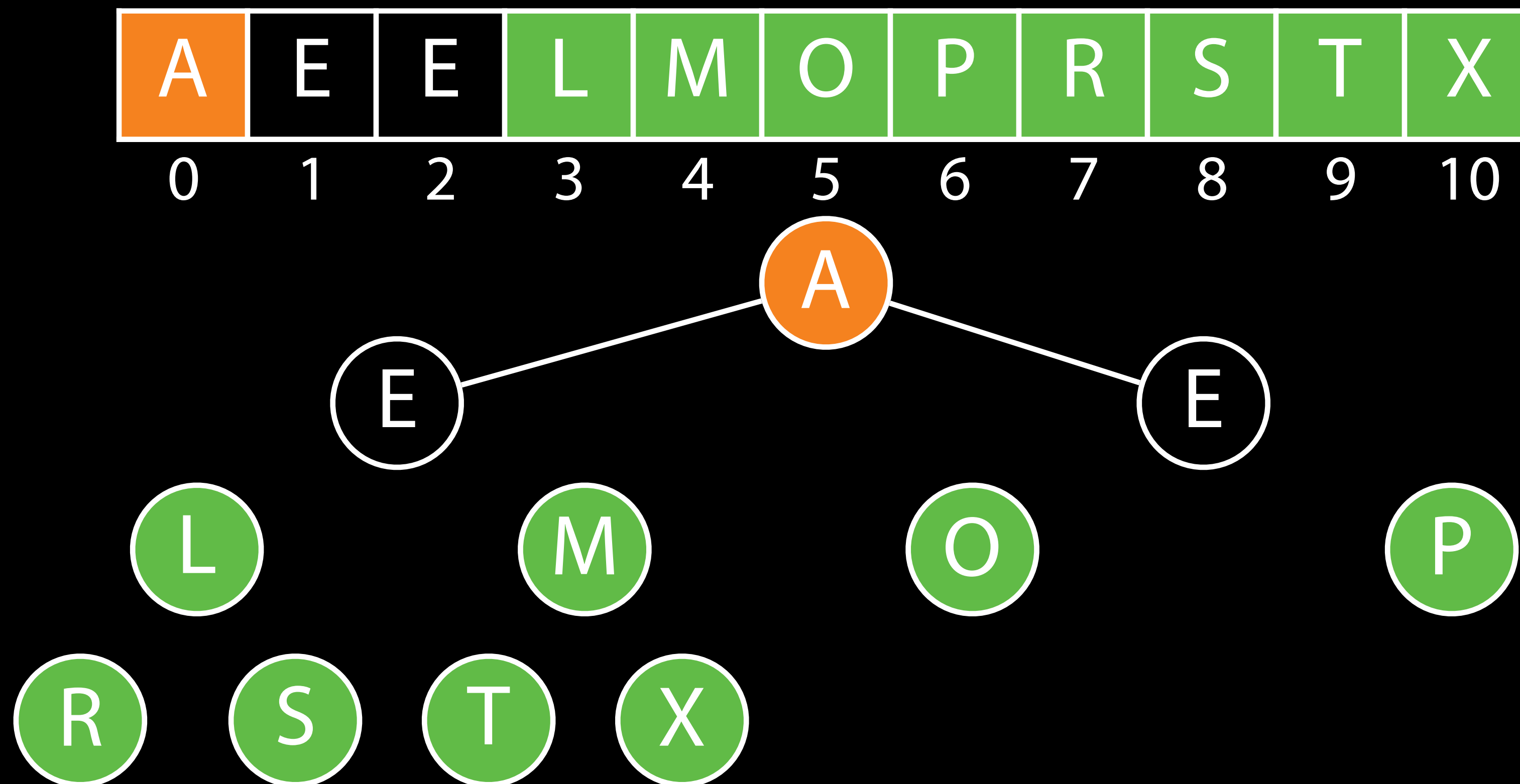
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



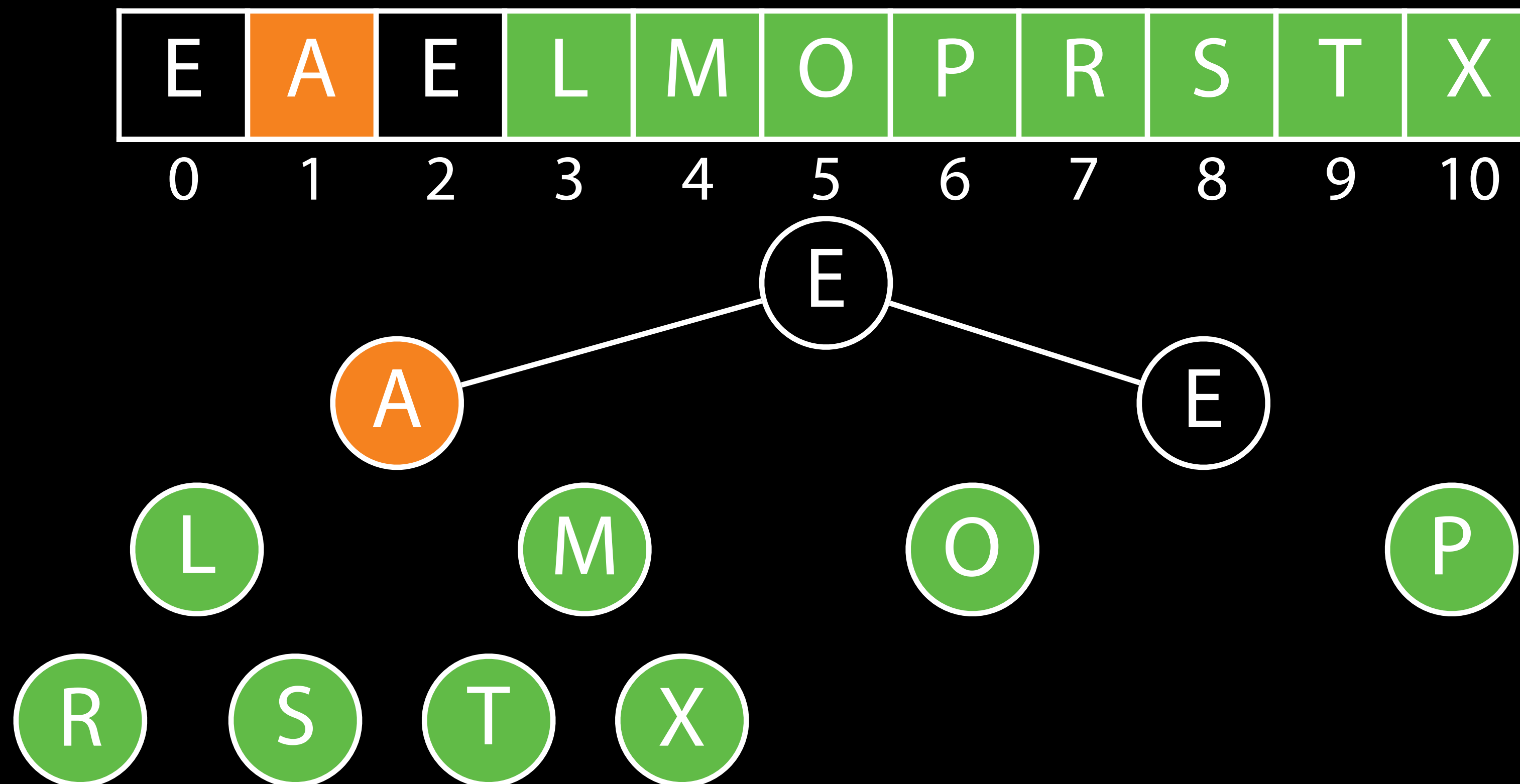
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



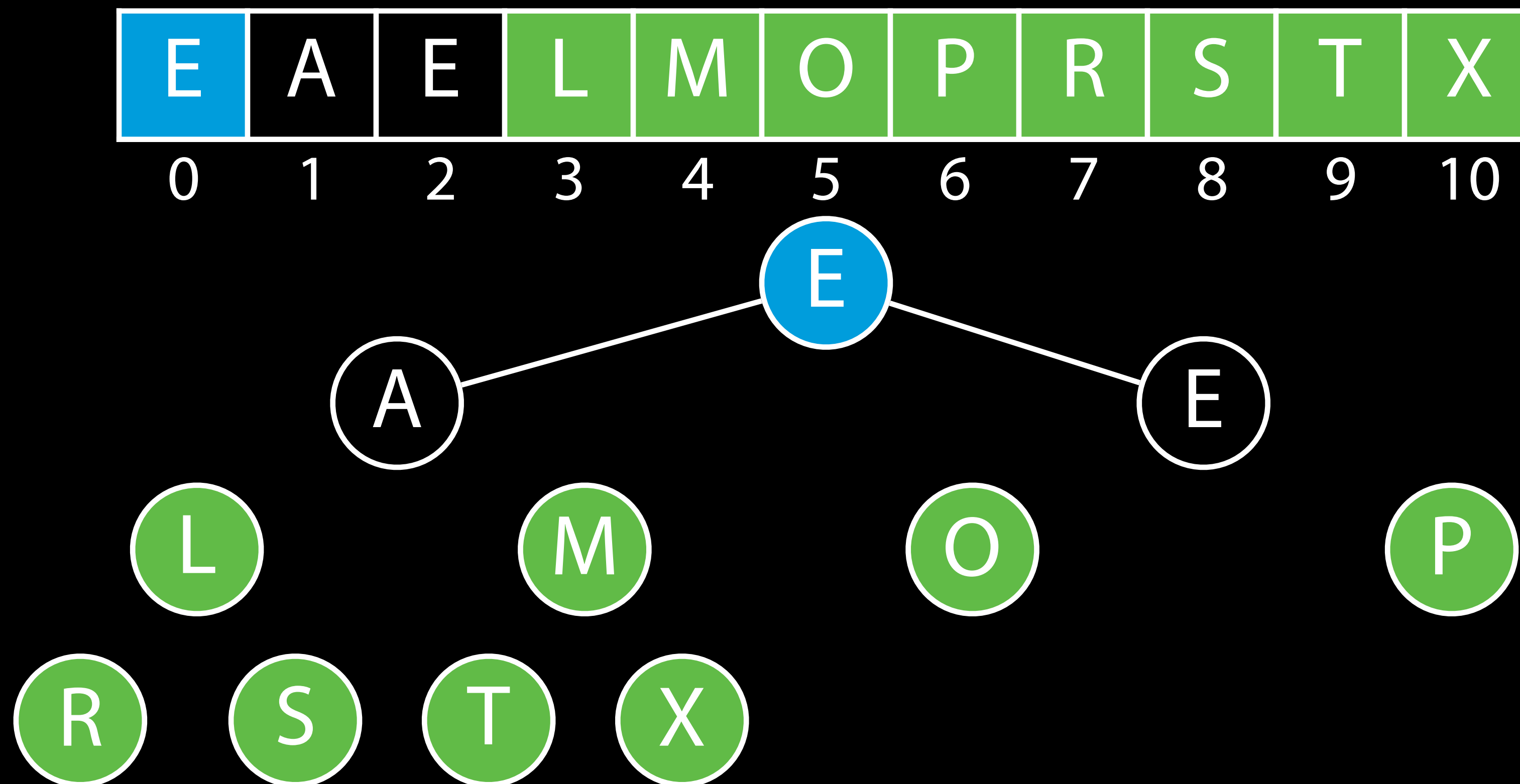
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



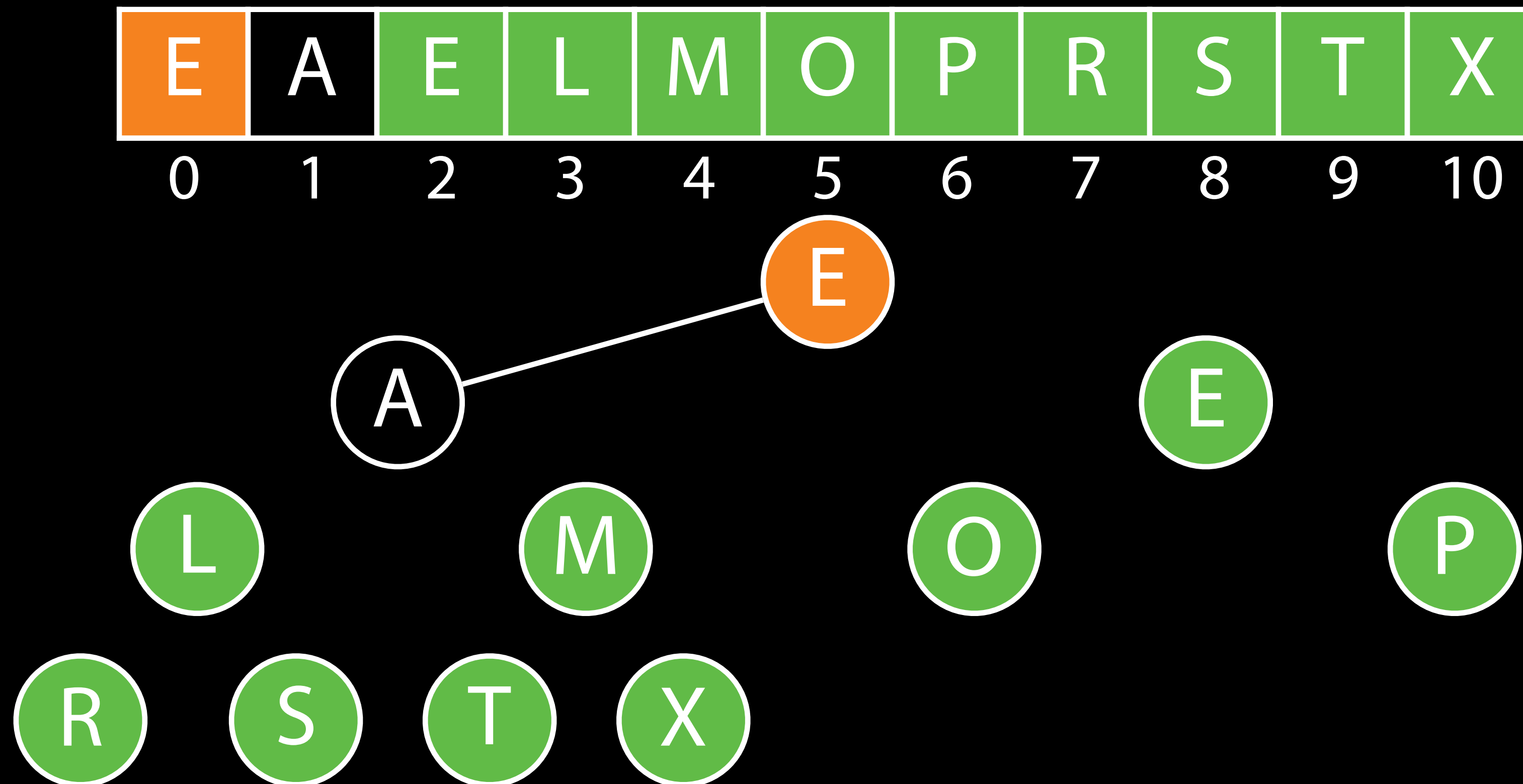
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



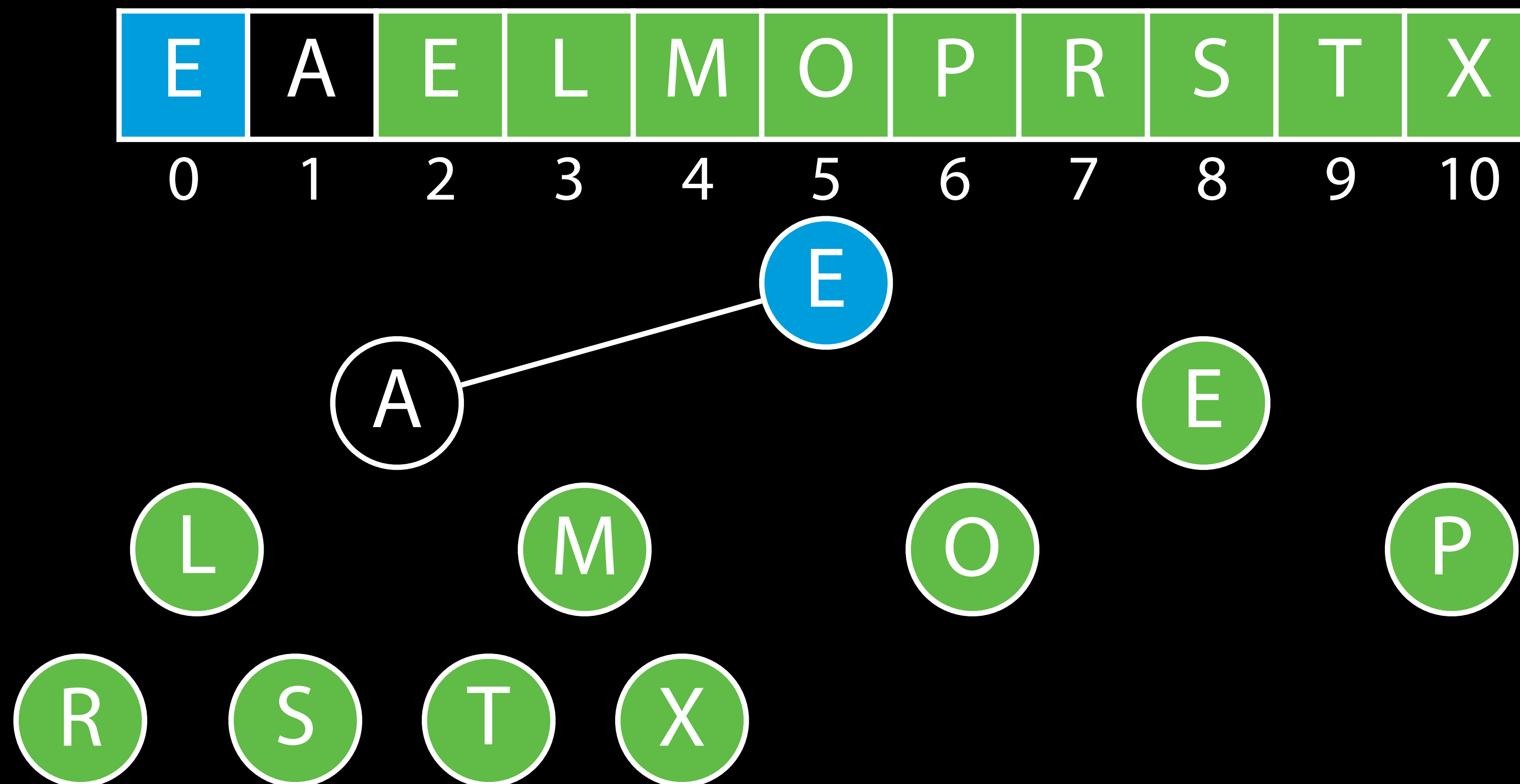
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



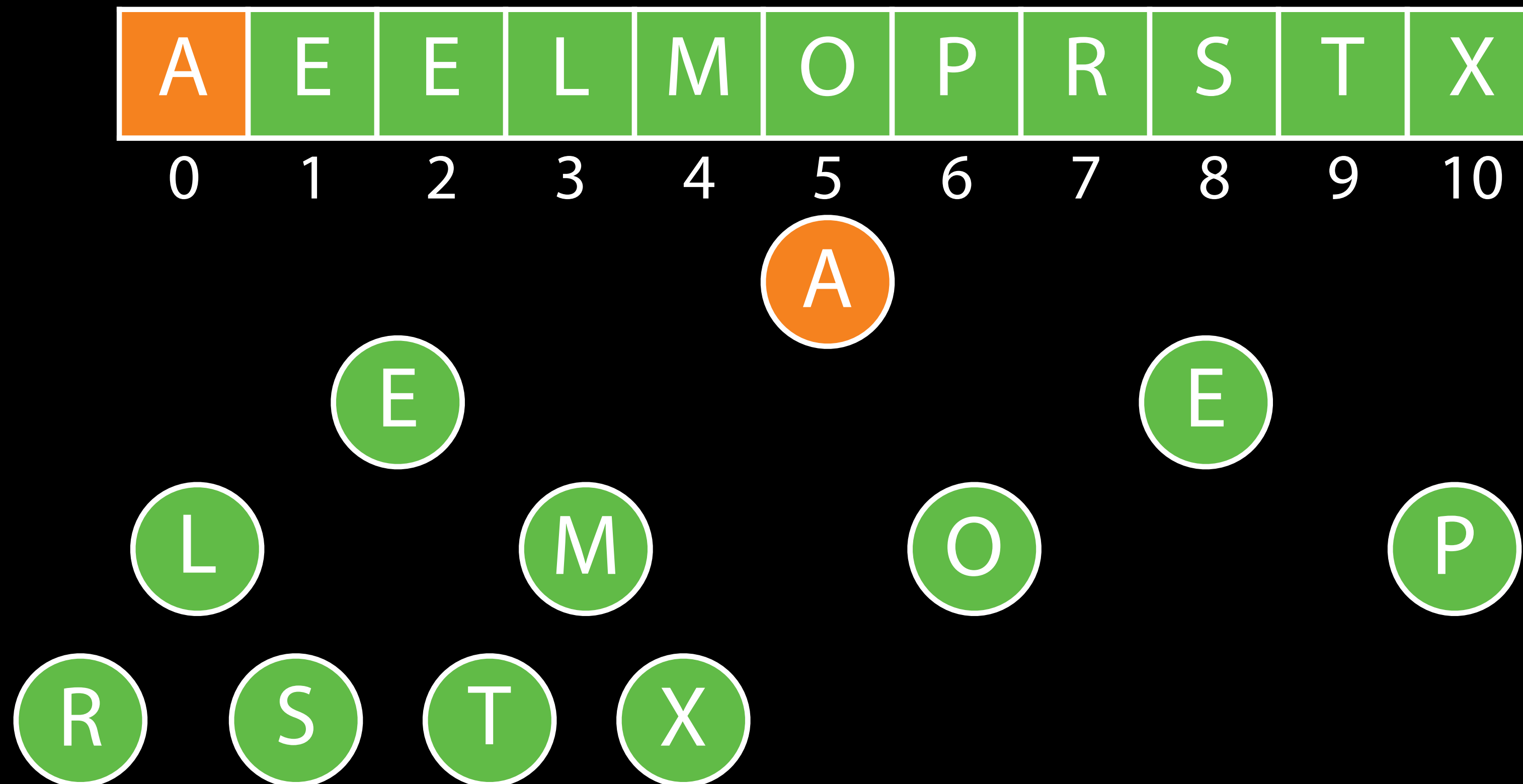
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



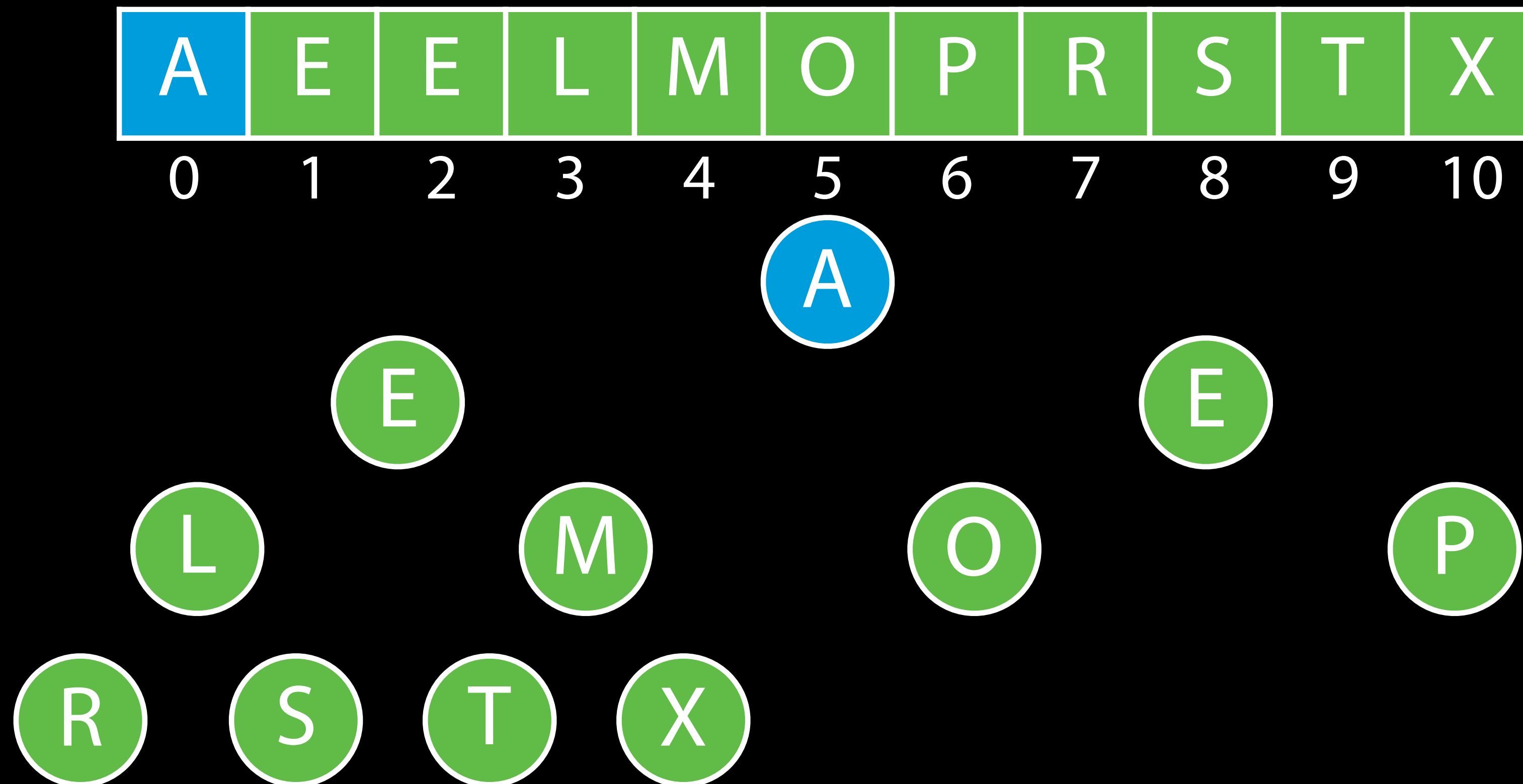
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



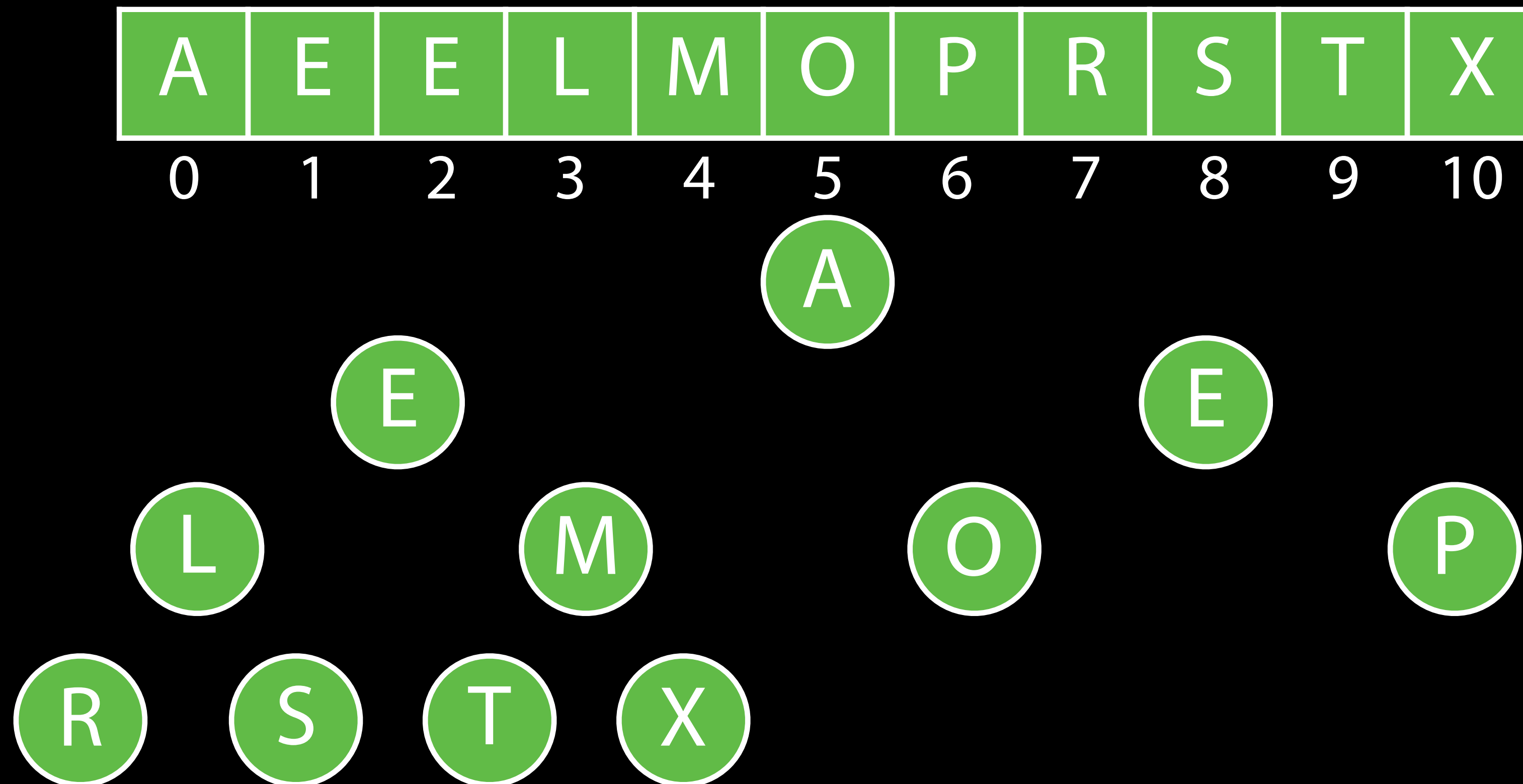
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



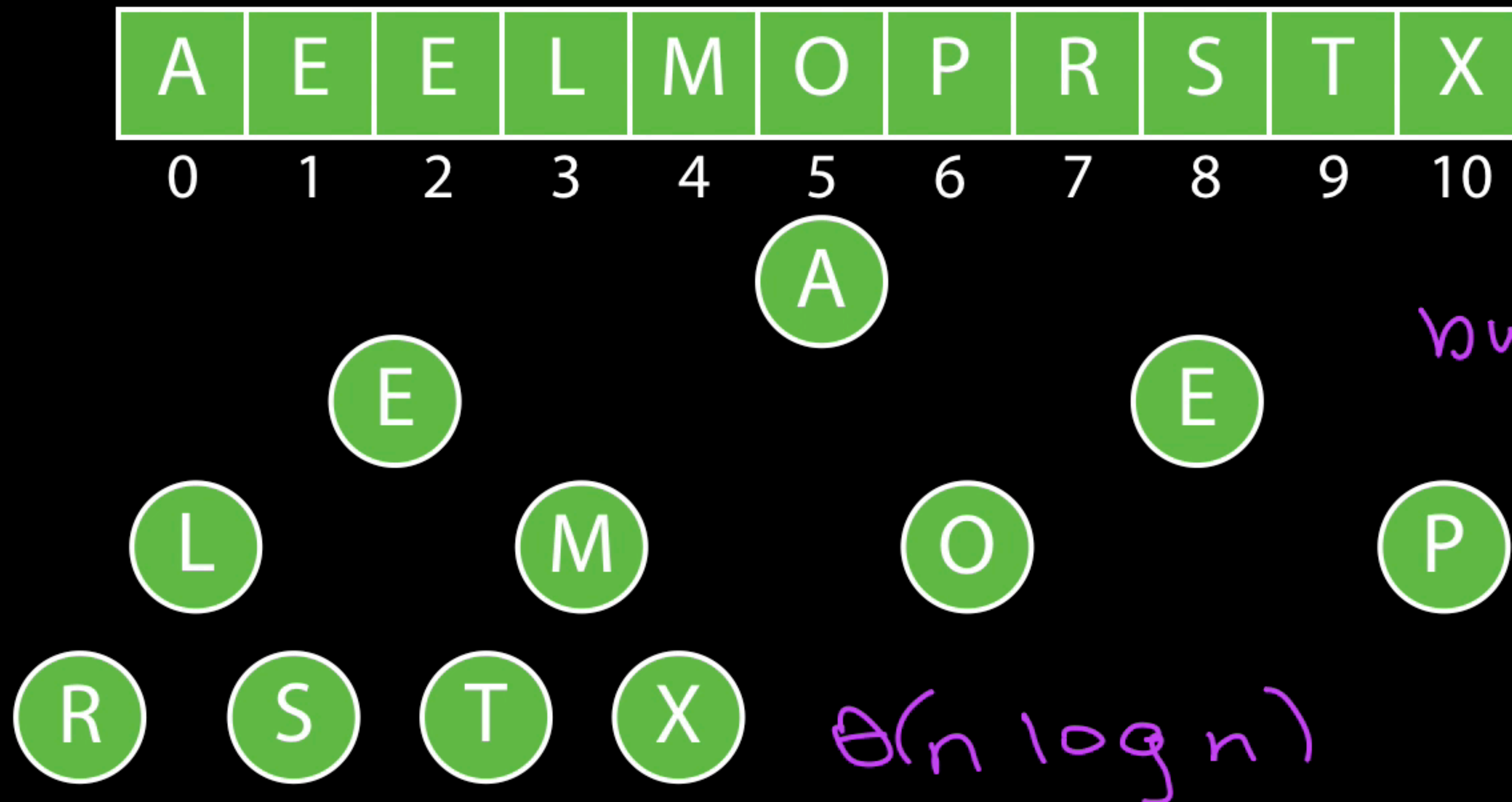
Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



Heapsort

Repeatedly delete the largest remaining item by swapping with the last item.



Build Max Heap n

n times
maxHeapify(0)
 $\log n$

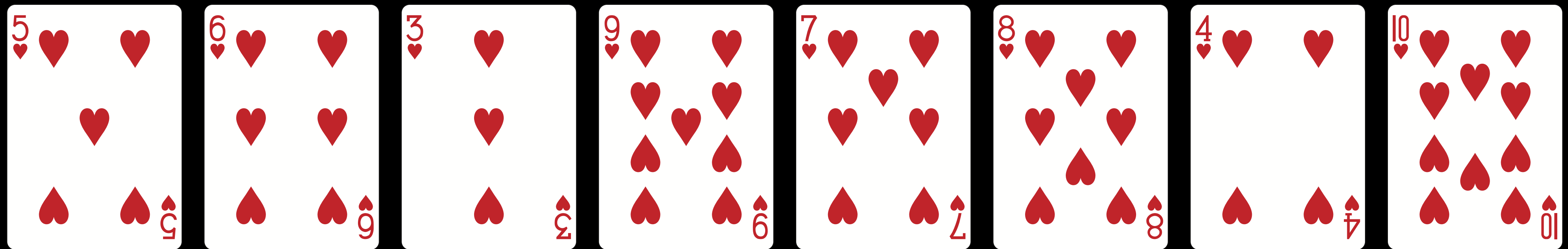
$\Theta(n \log n)$

Merge sort

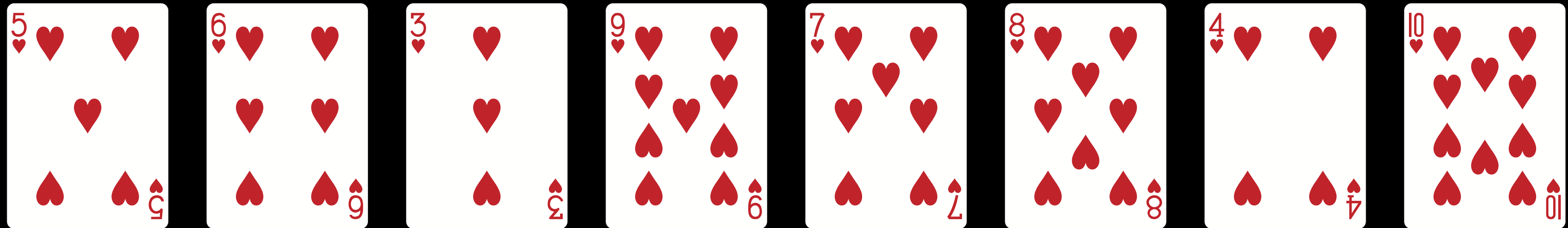
Sort the left half.

Sort the right half.

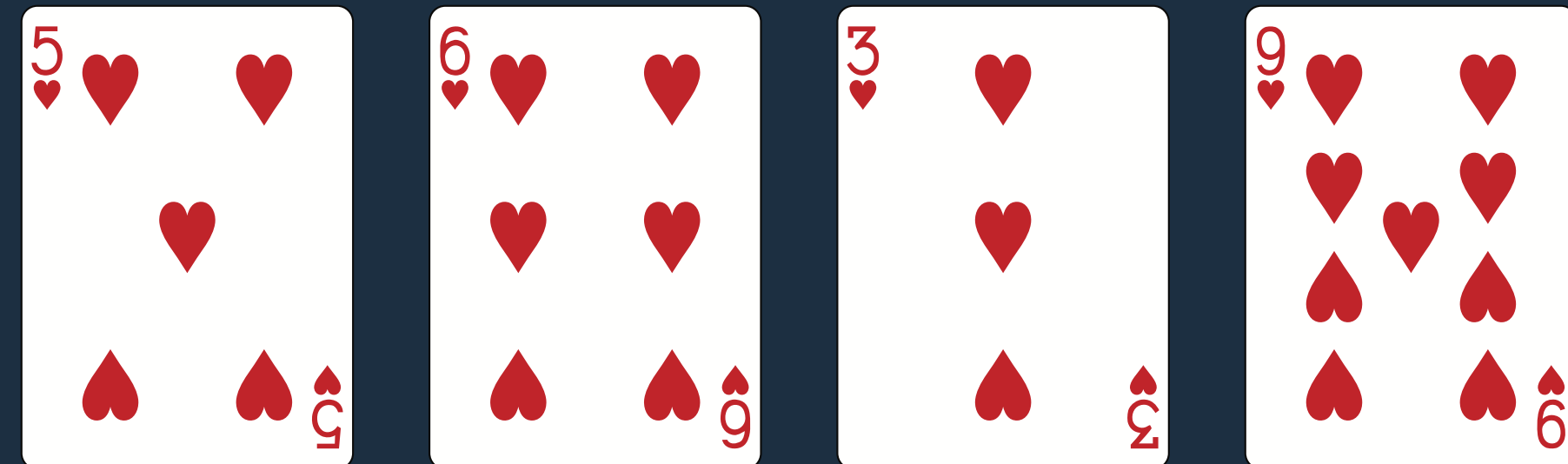
Merge the sorted halves.



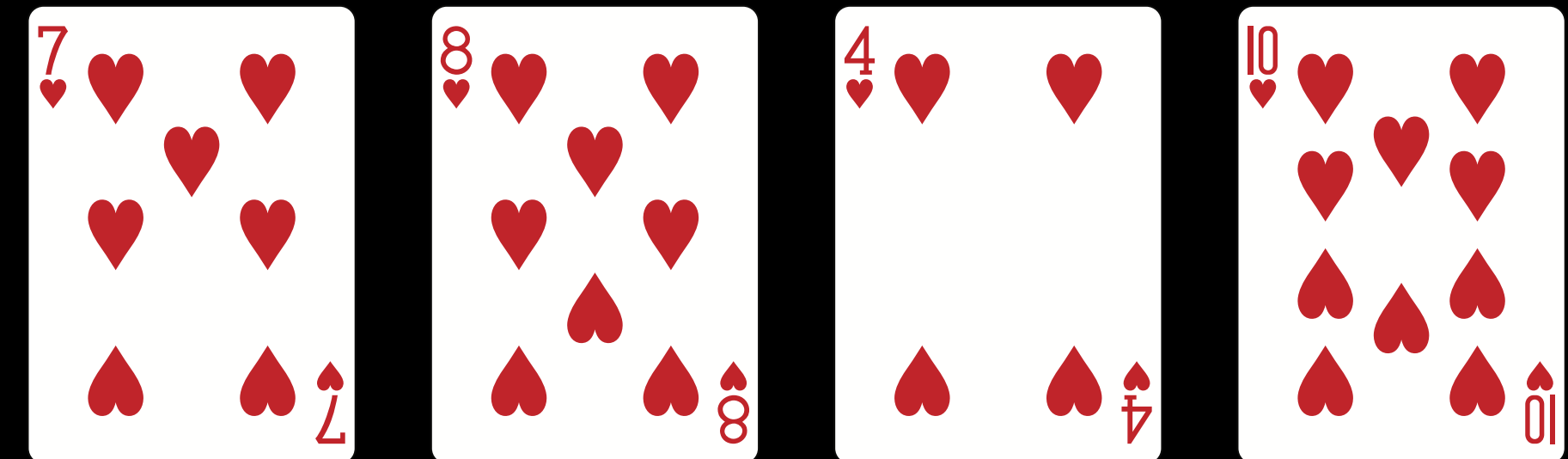
Merge sort



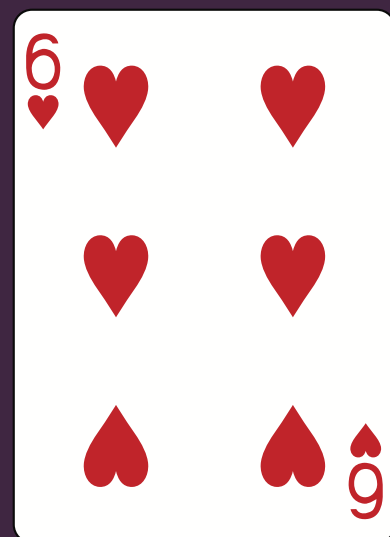
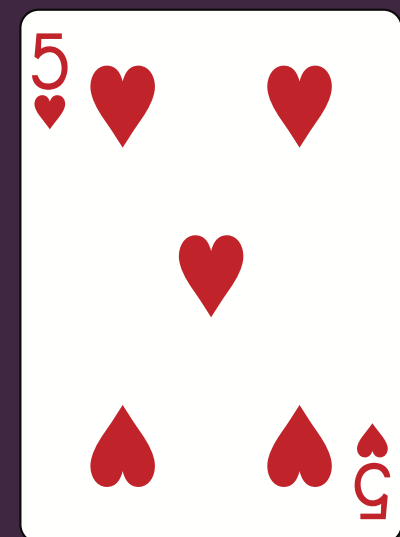
Merge sort



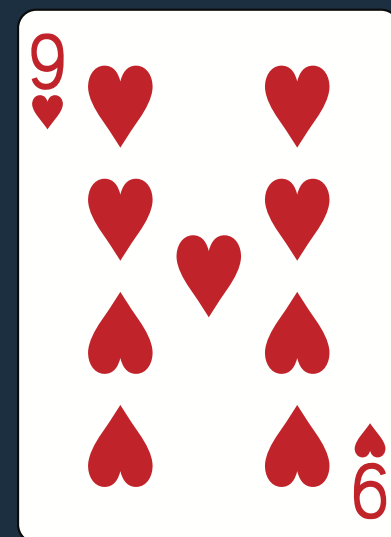
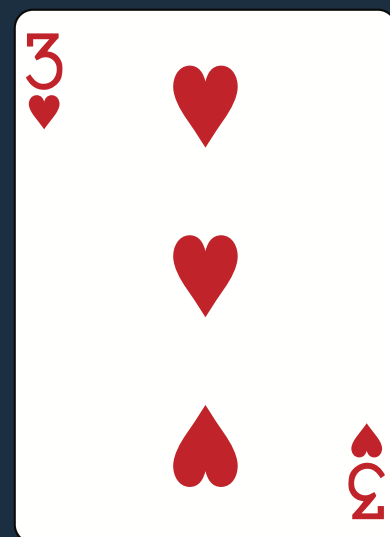
sort the left half



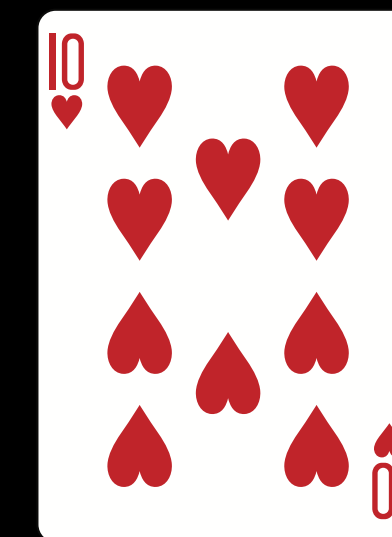
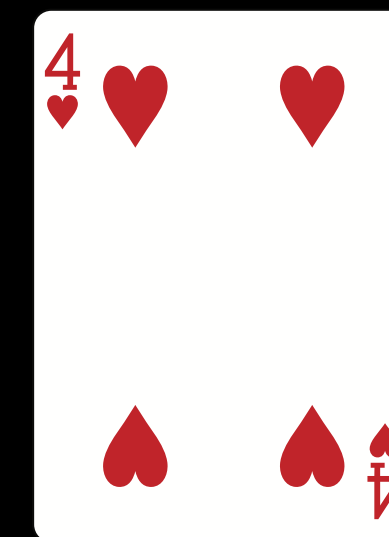
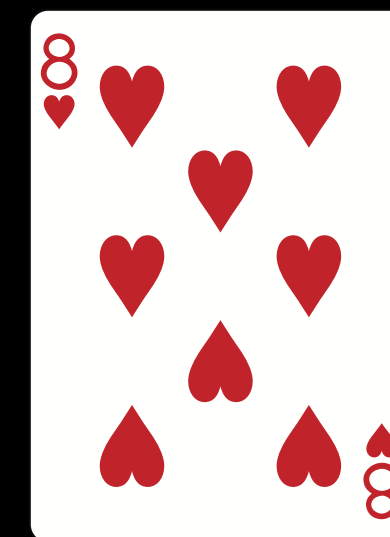
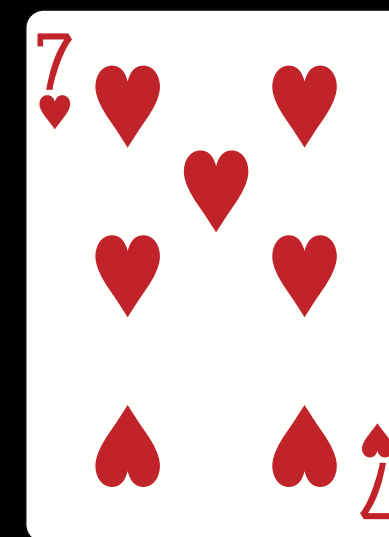
Merge sort



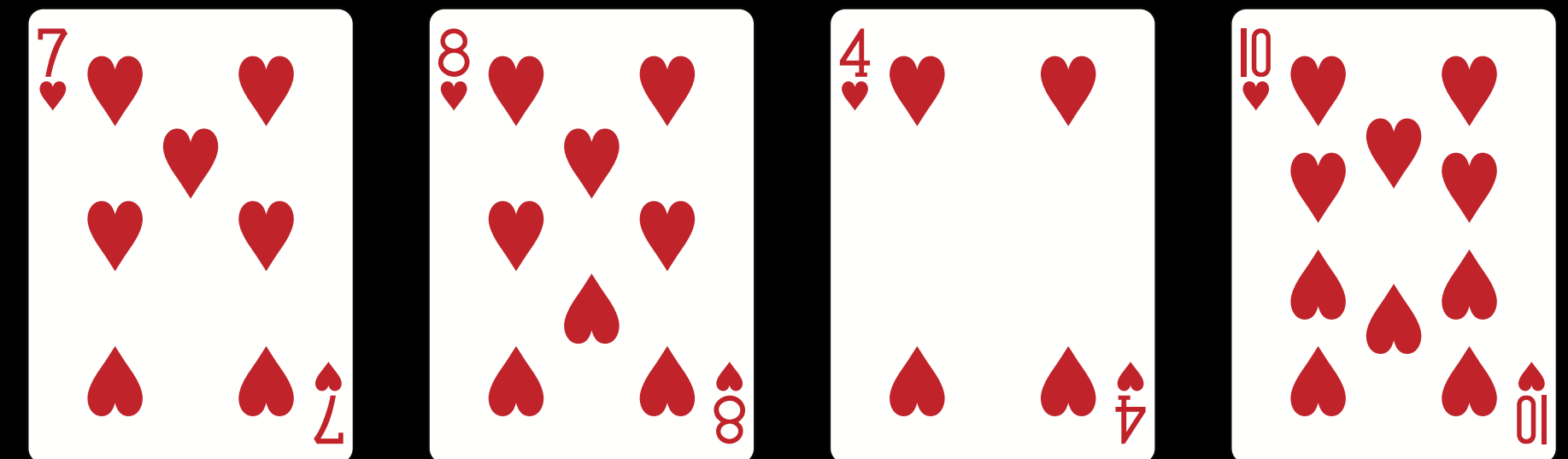
sort the left half



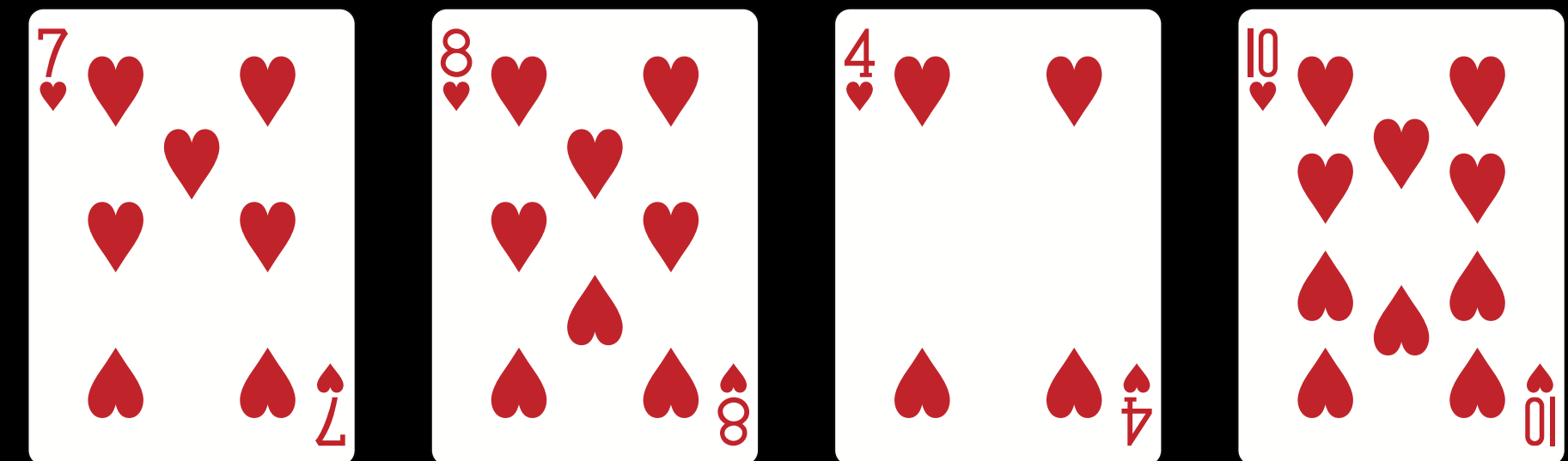
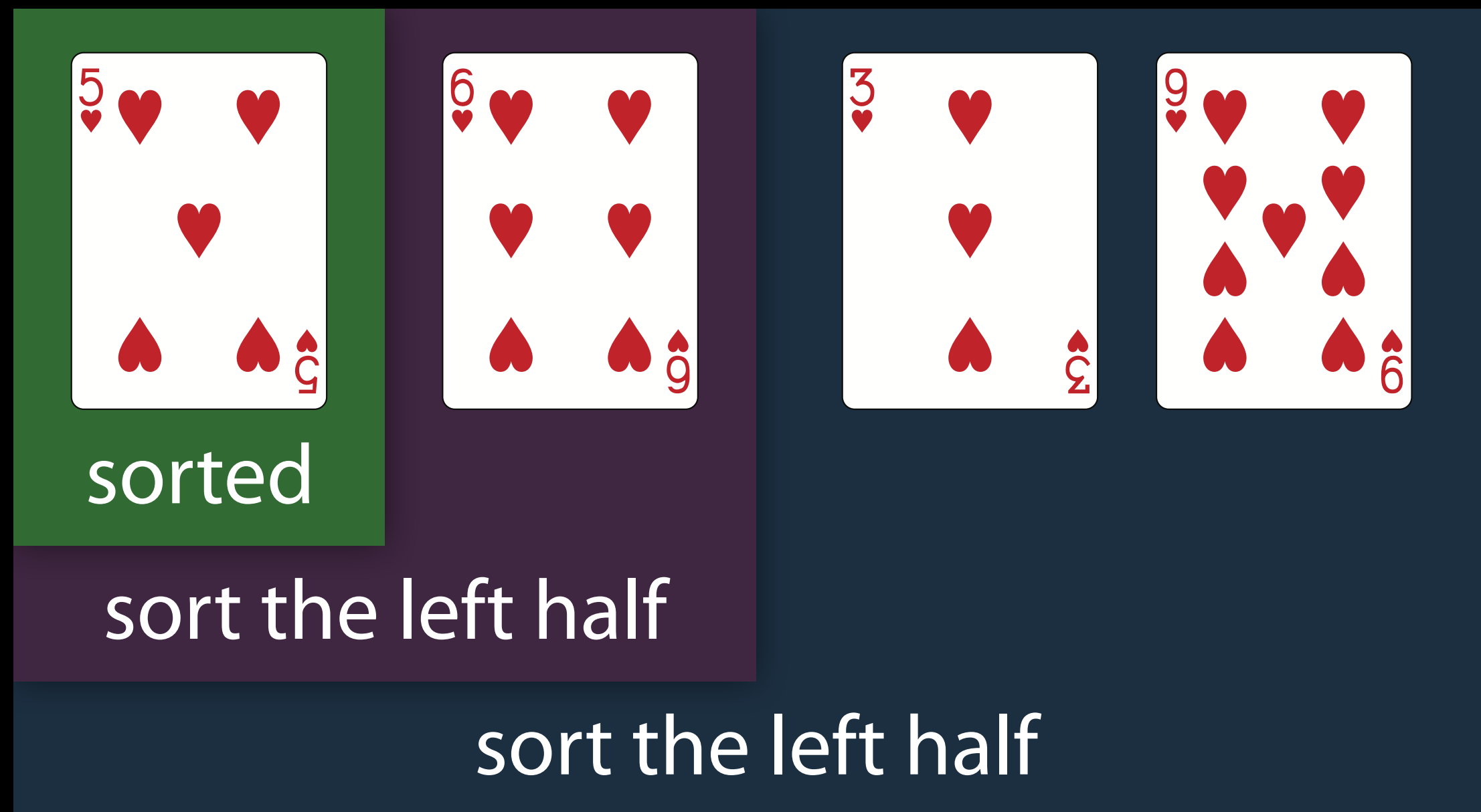
sort the left half



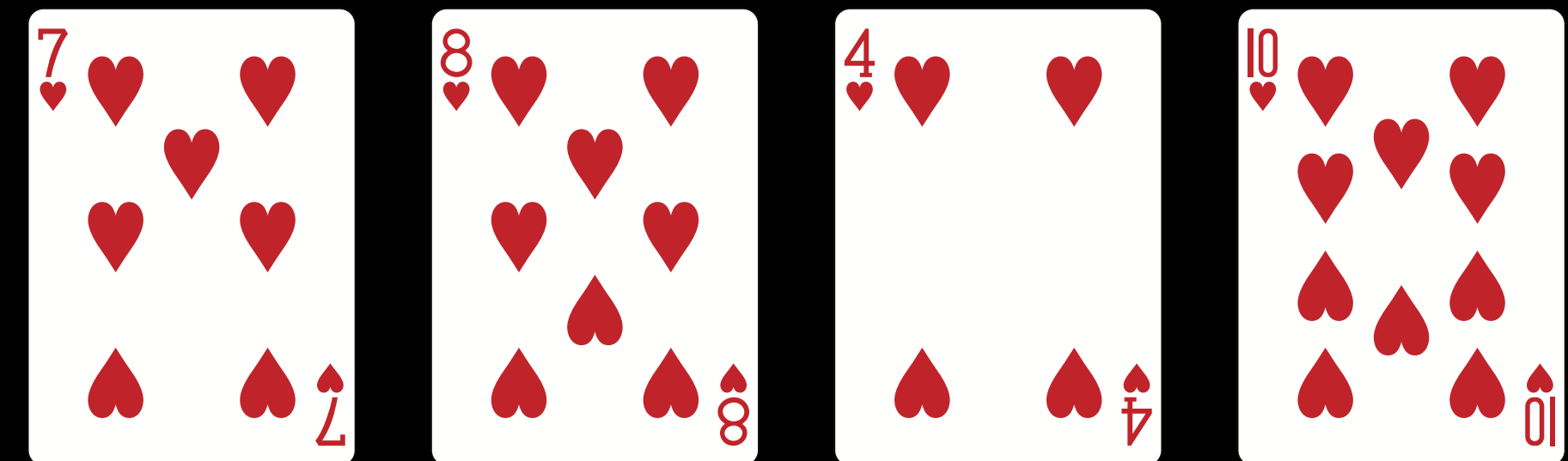
Merge sort



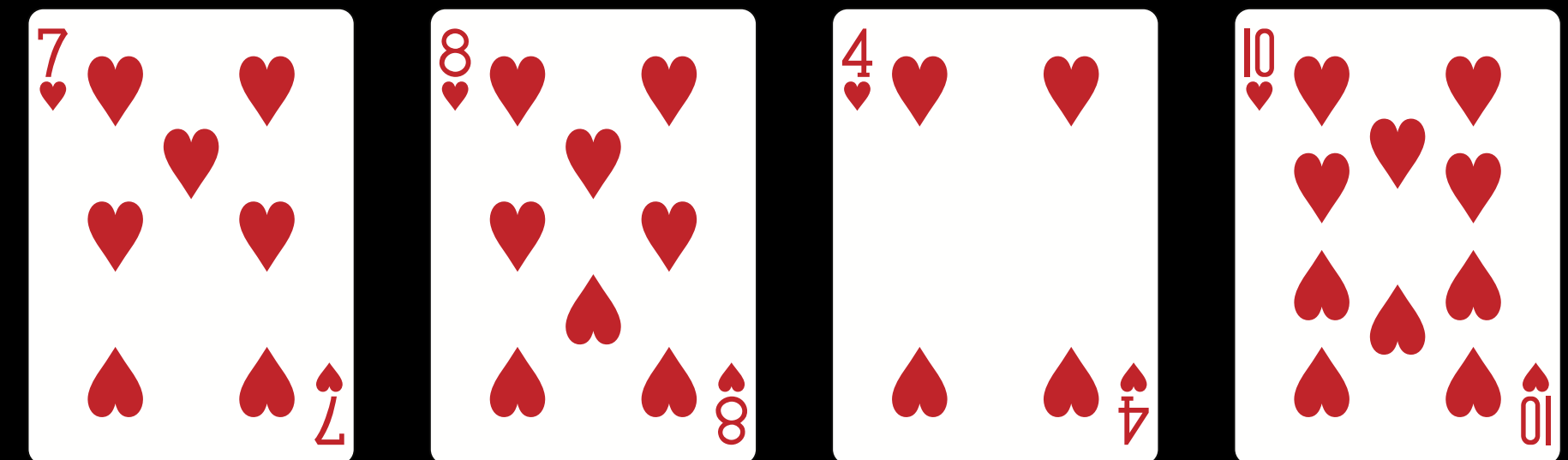
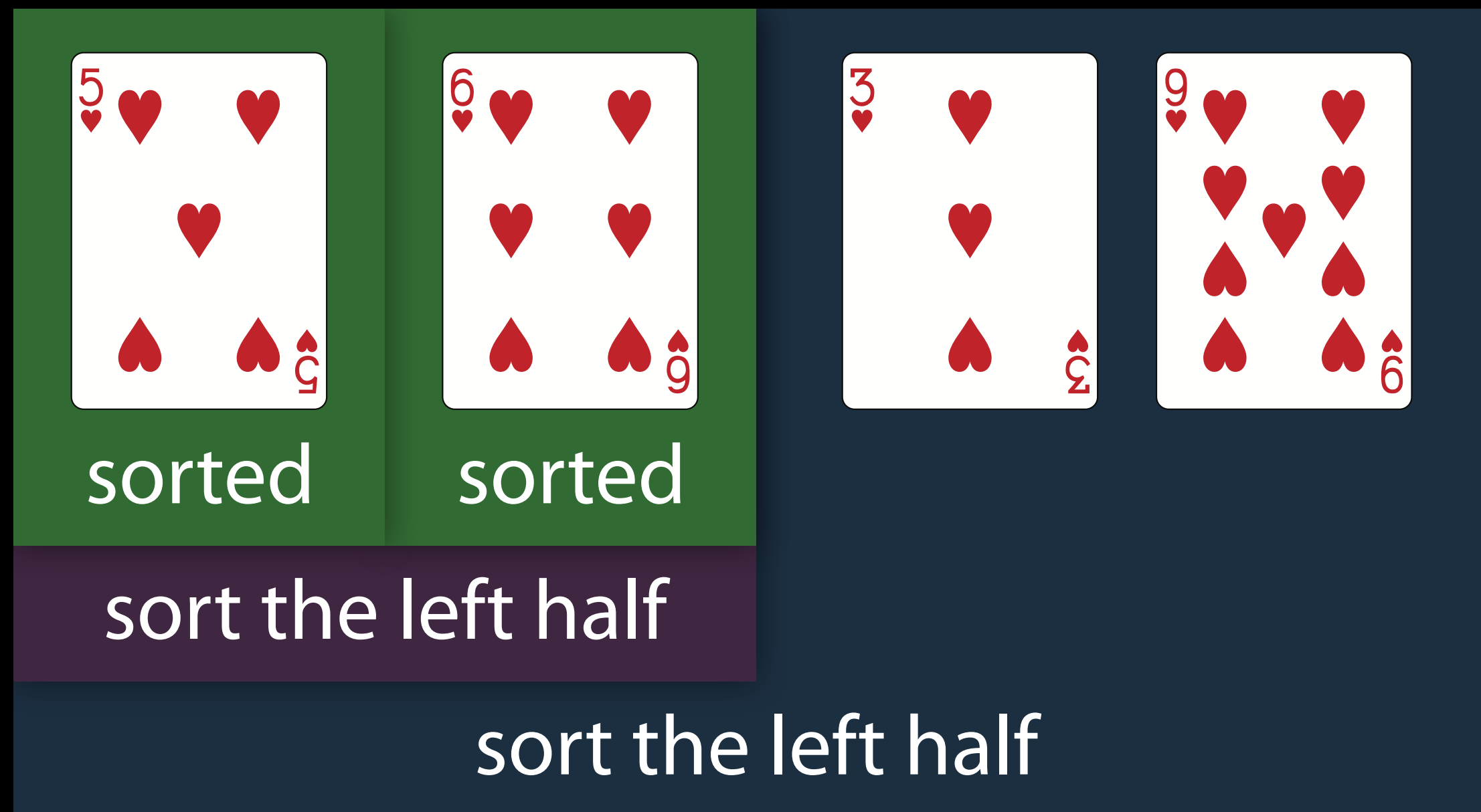
Merge sort



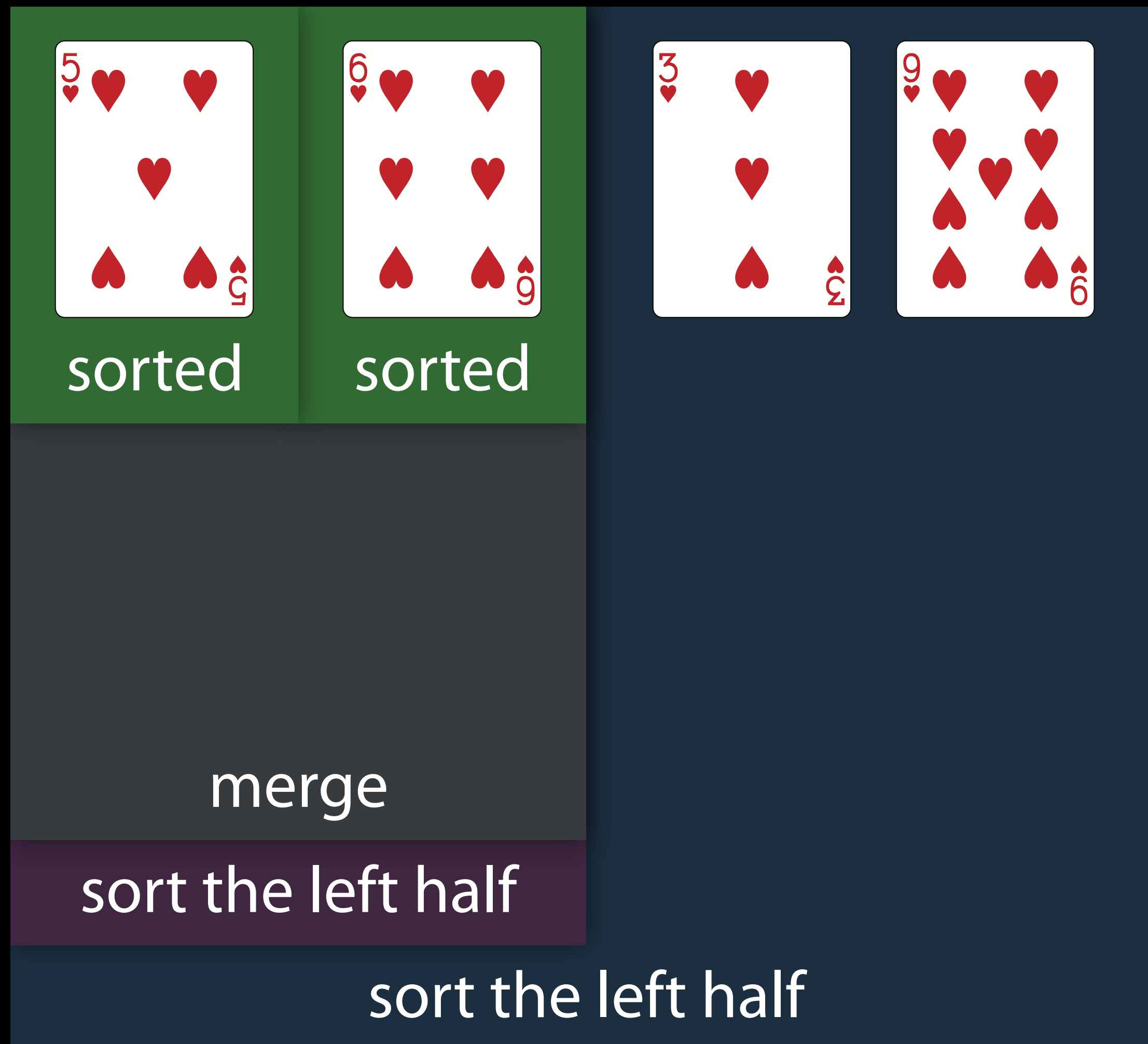
Merge sort



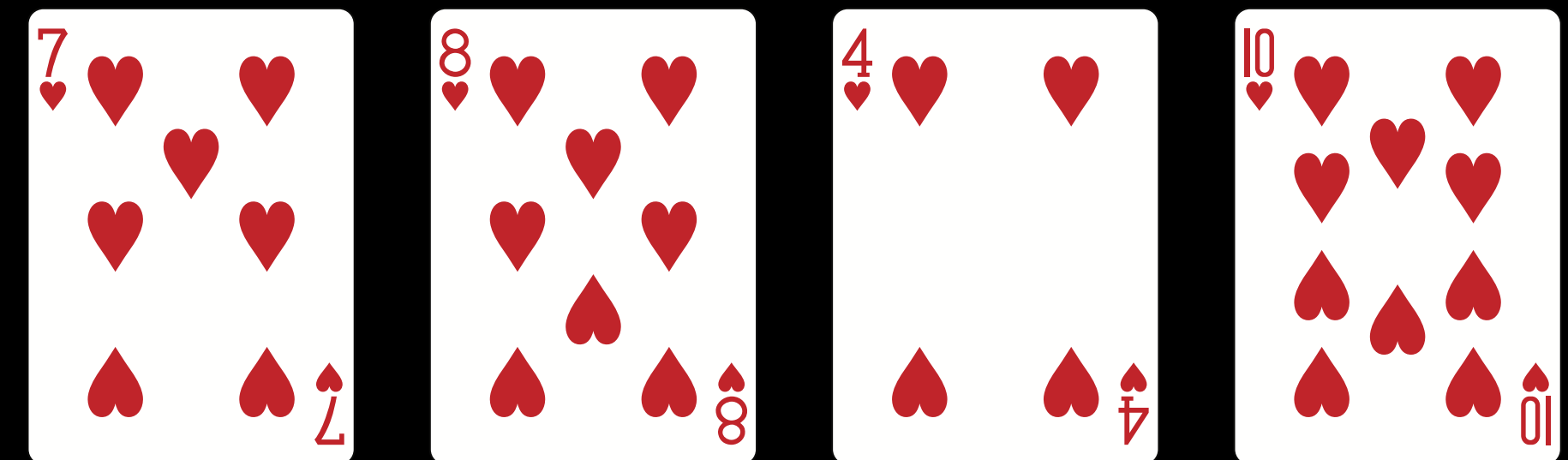
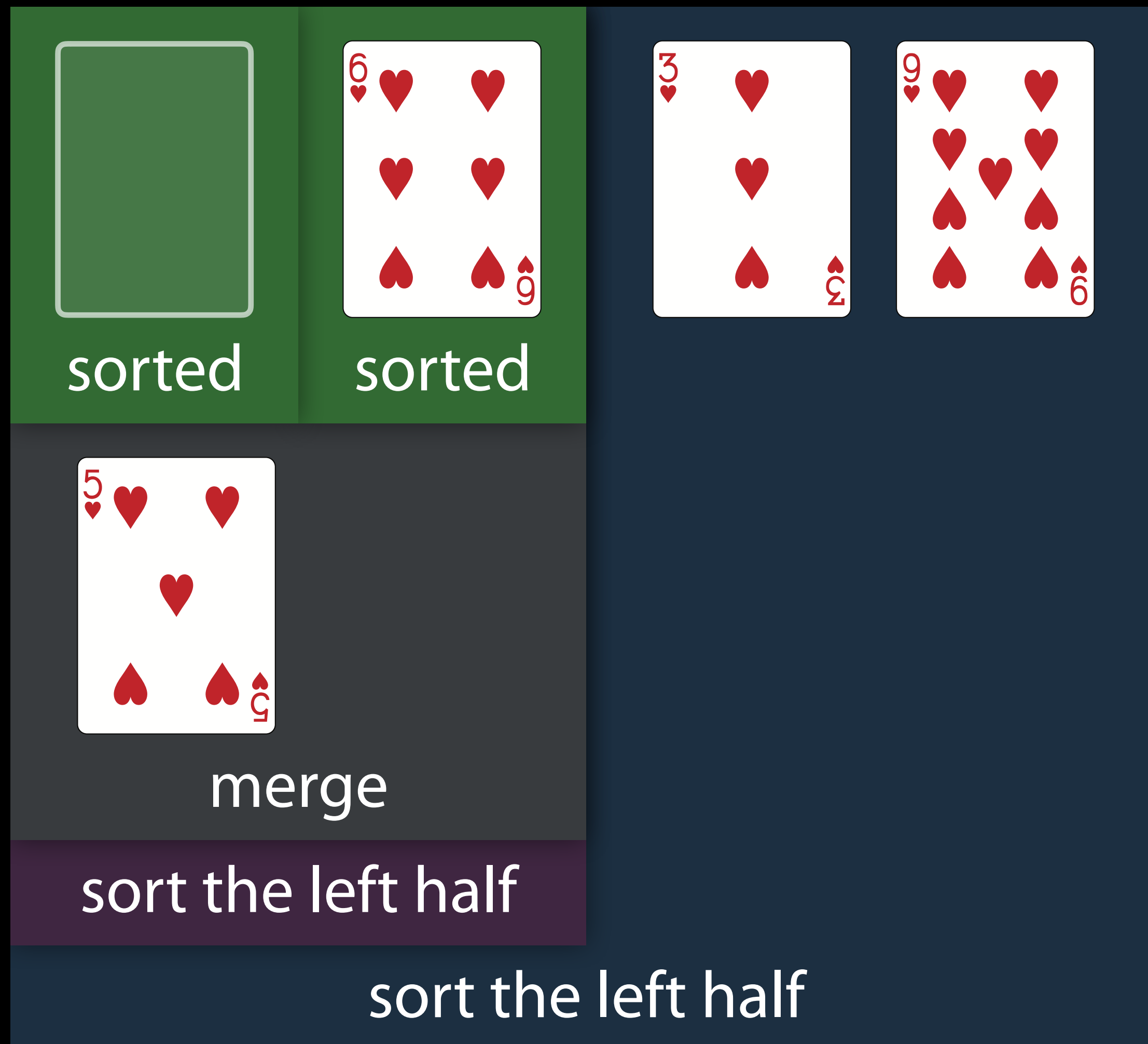
Merge sort



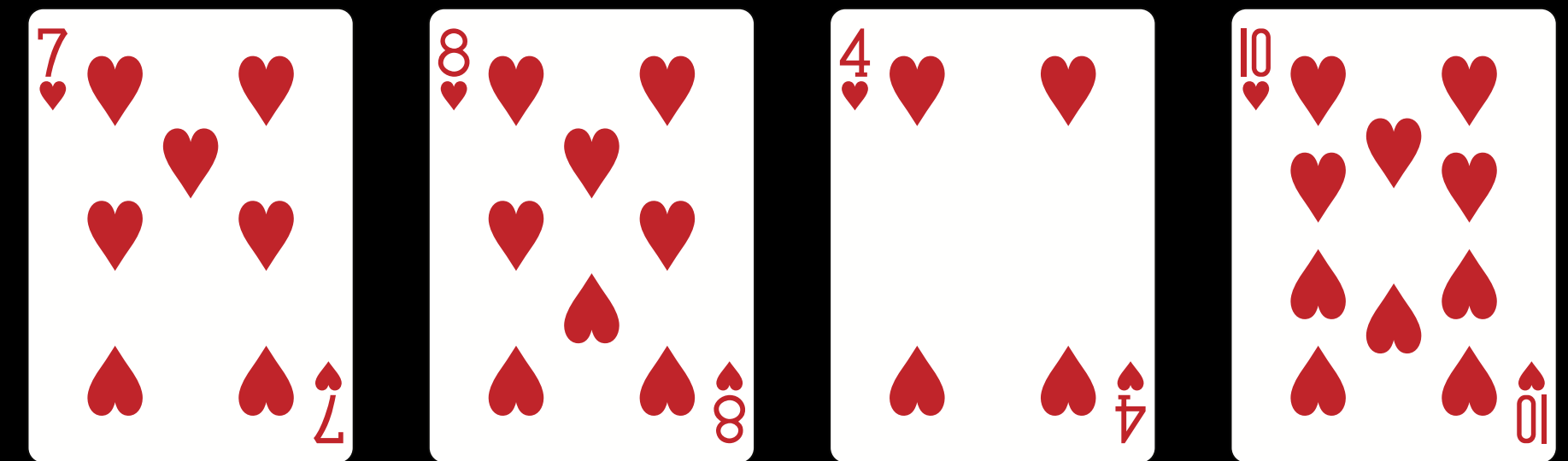
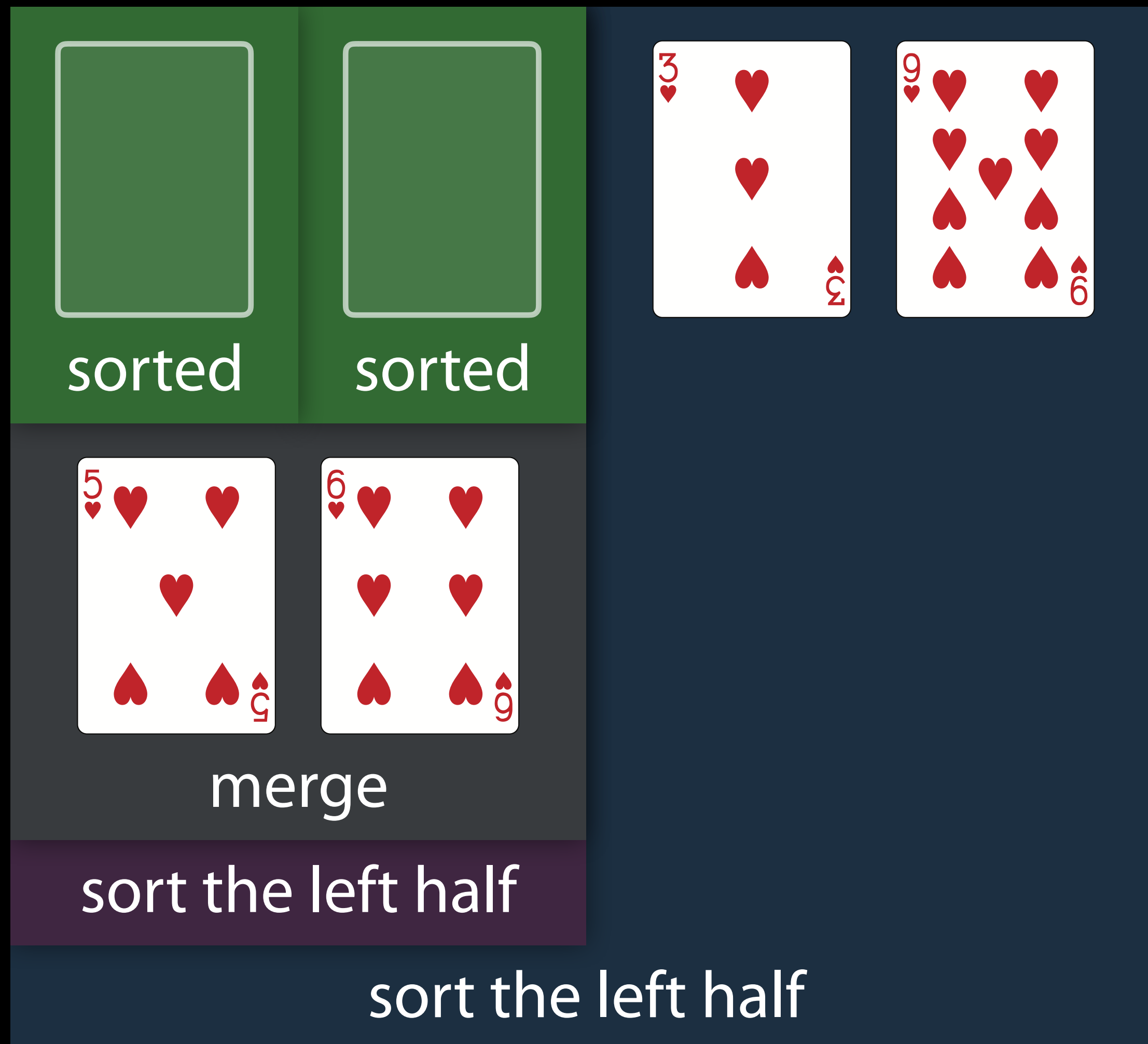
Merge sort



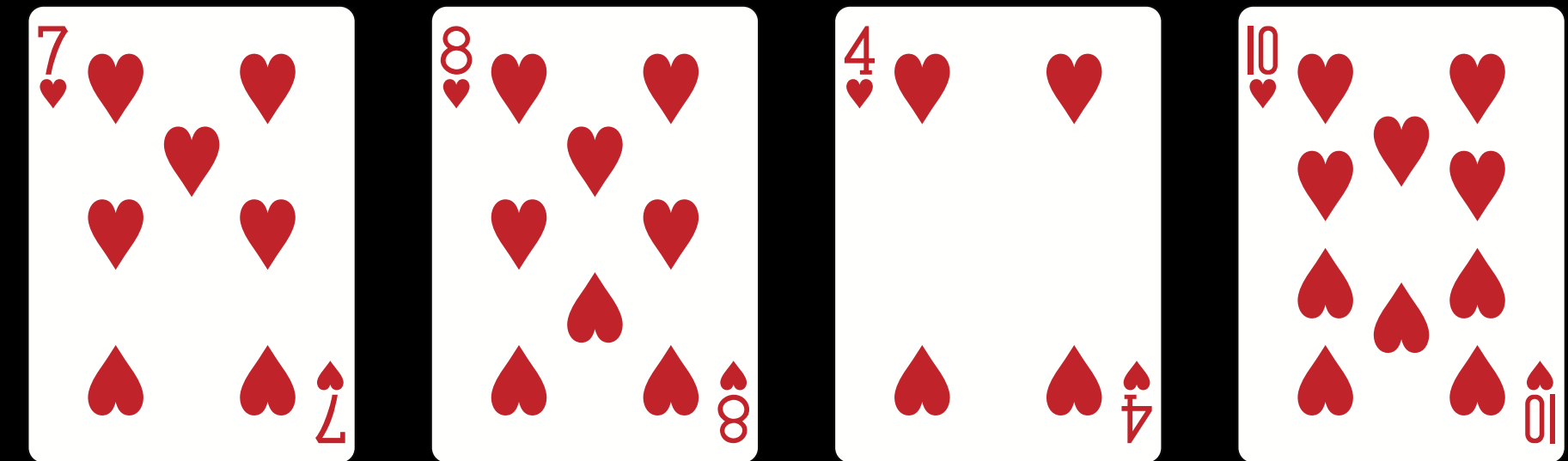
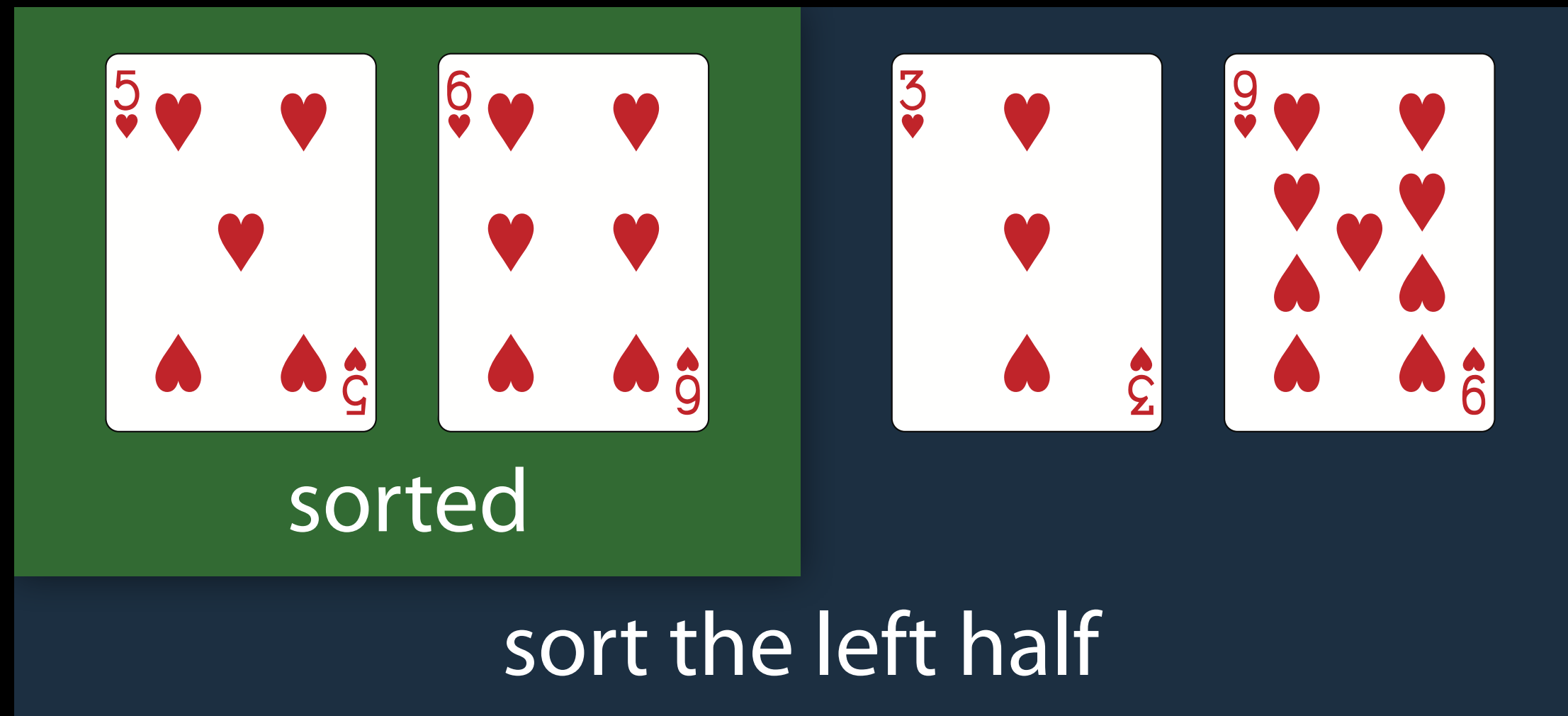
Merge sort



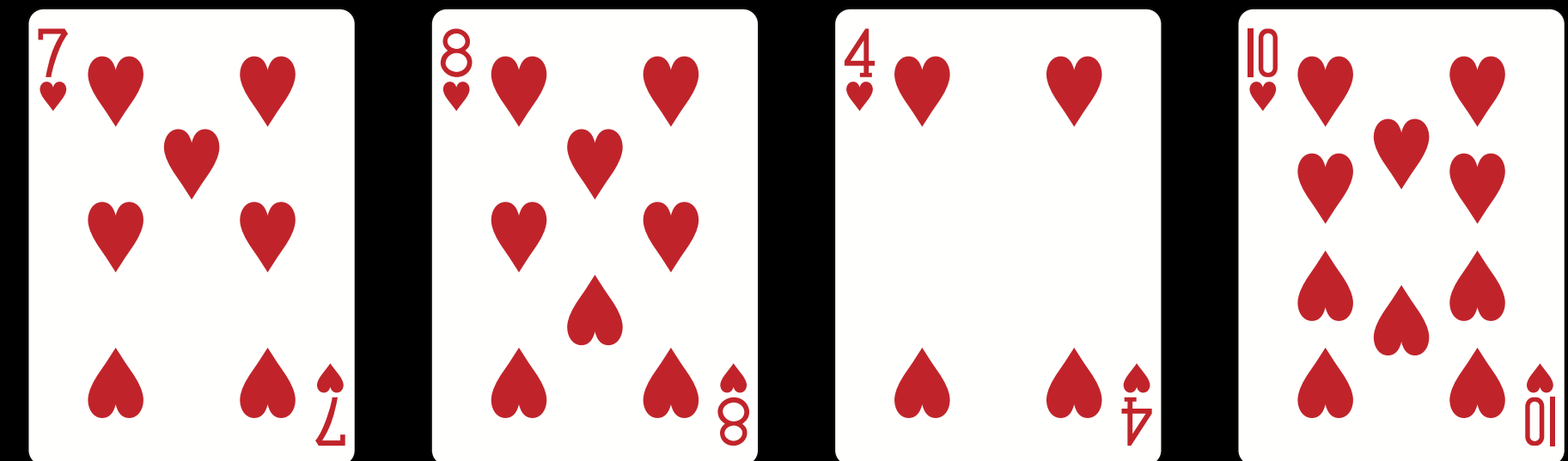
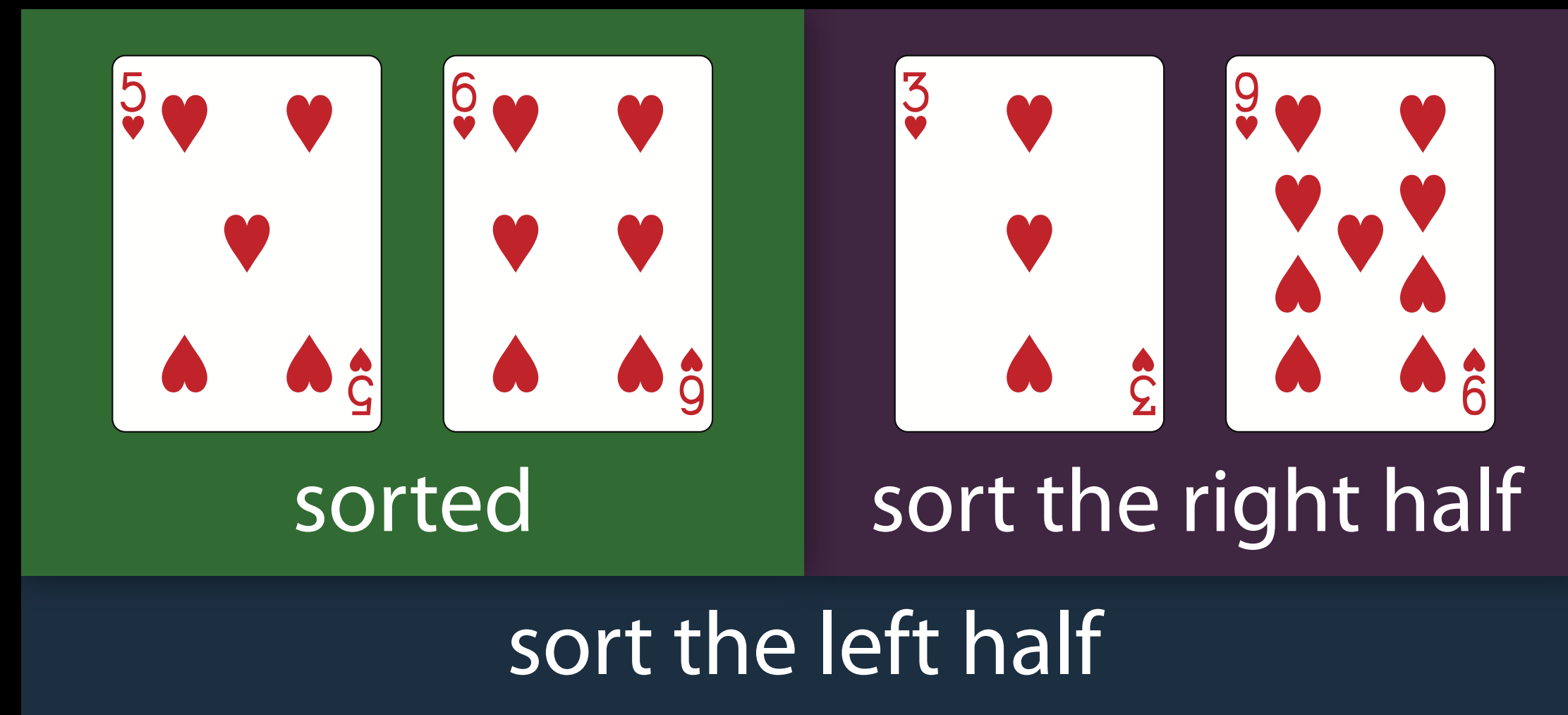
Merge sort



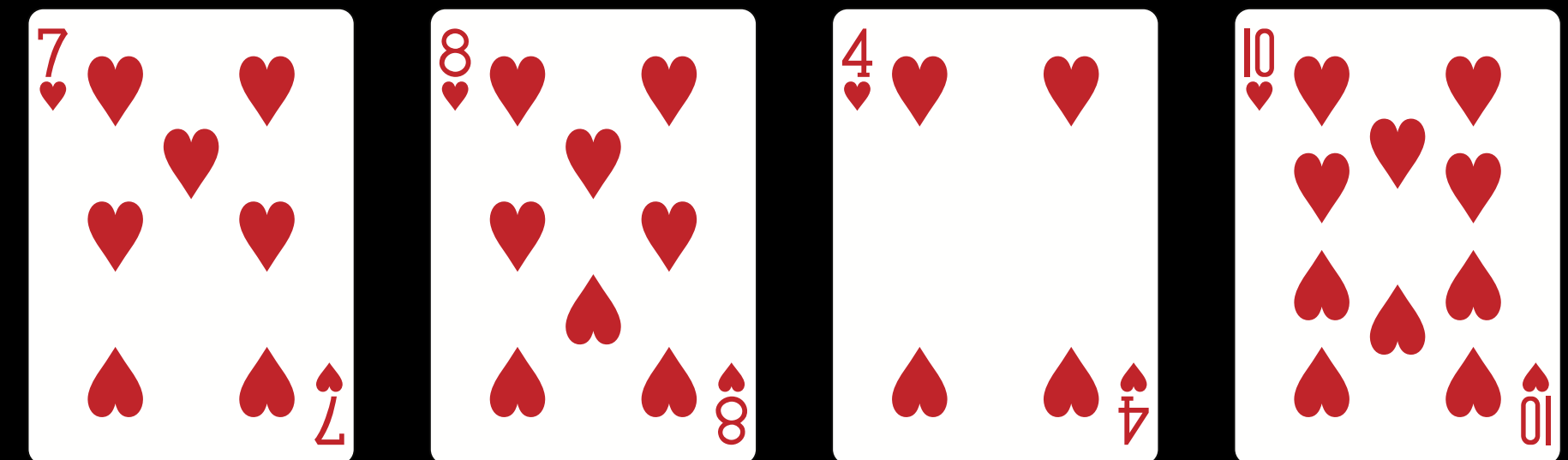
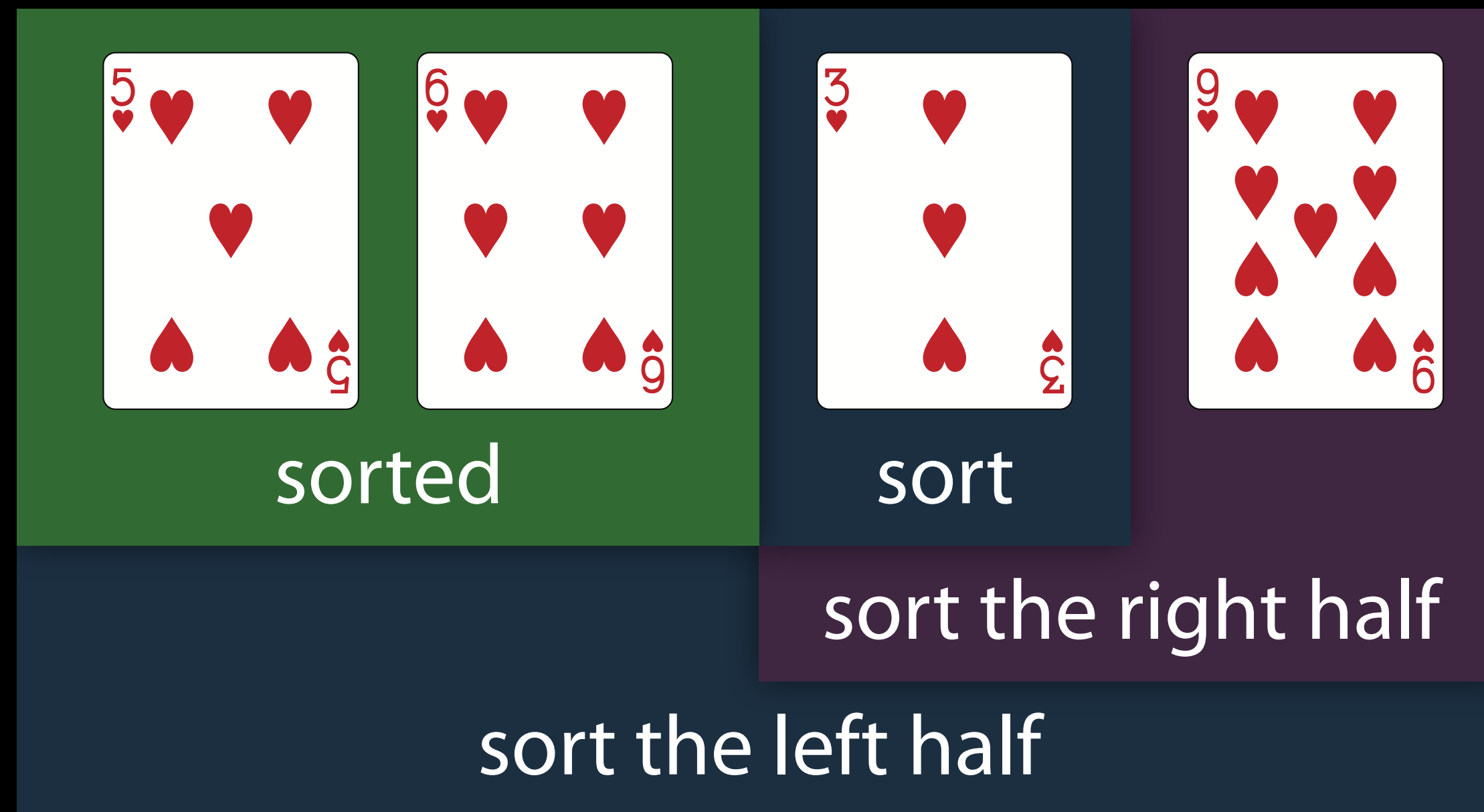
Merge sort



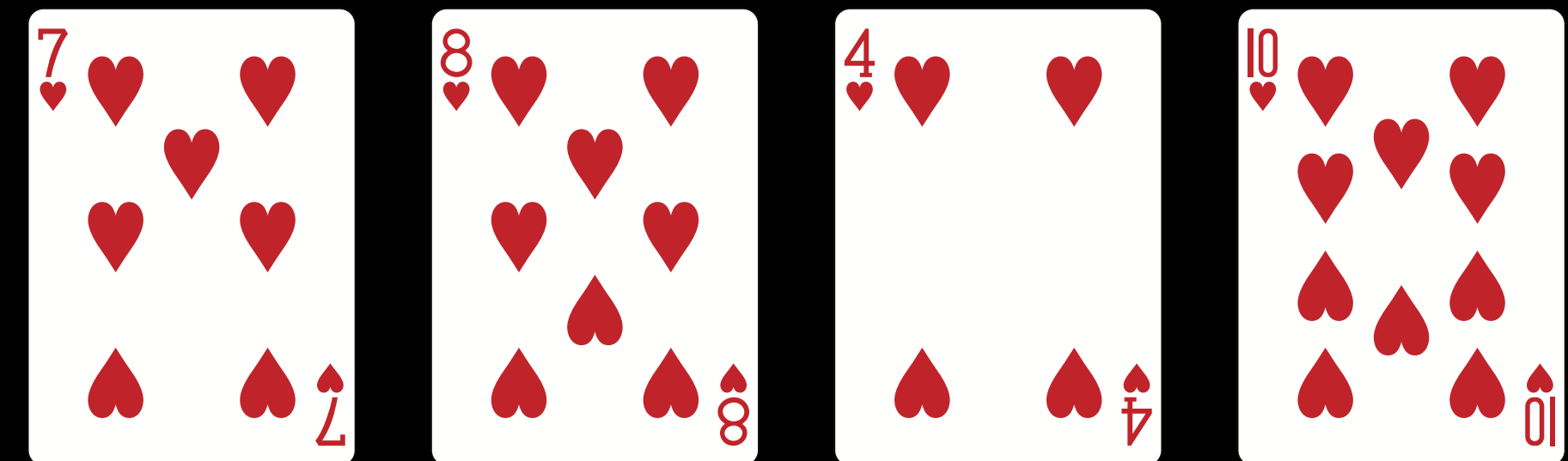
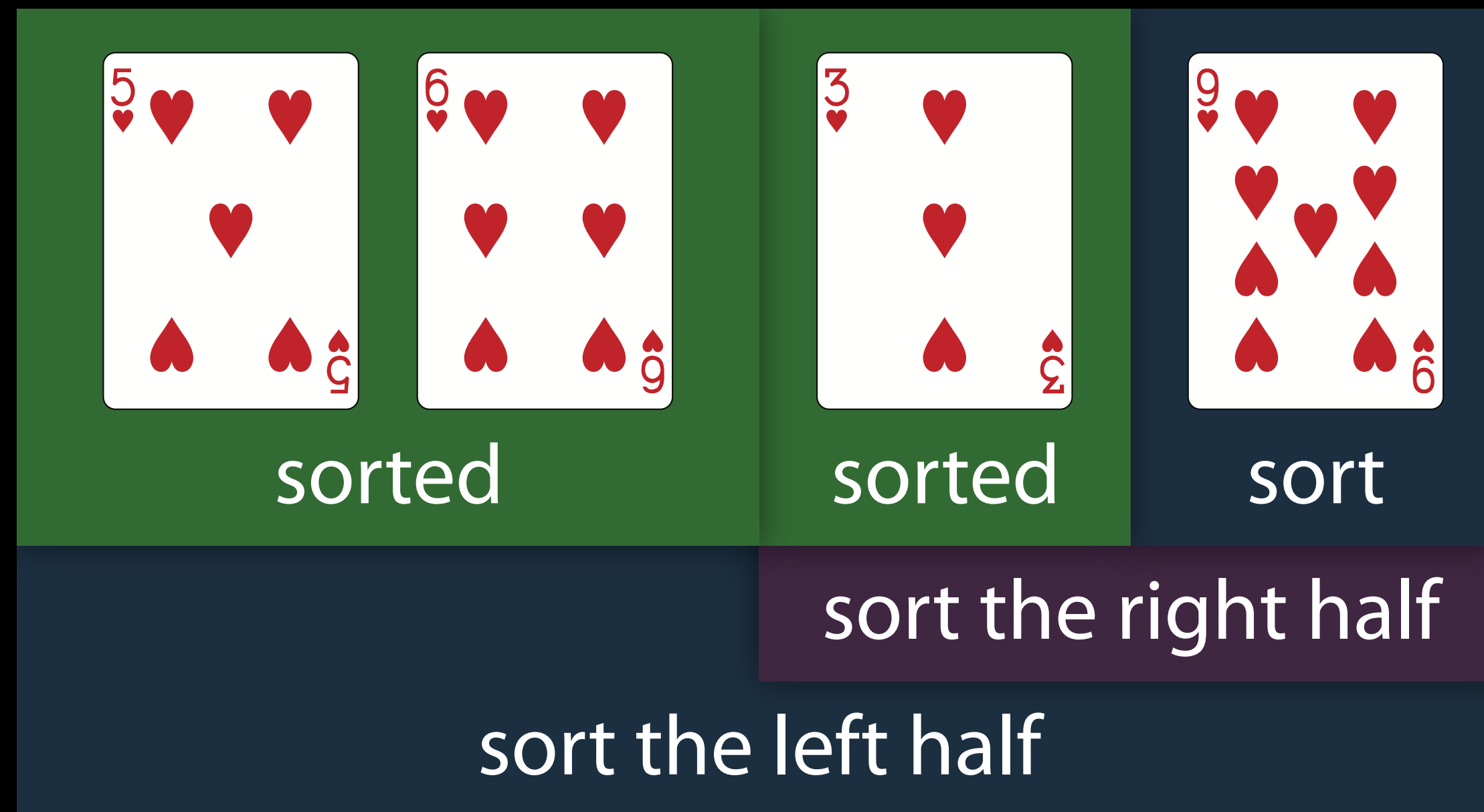
Merge sort



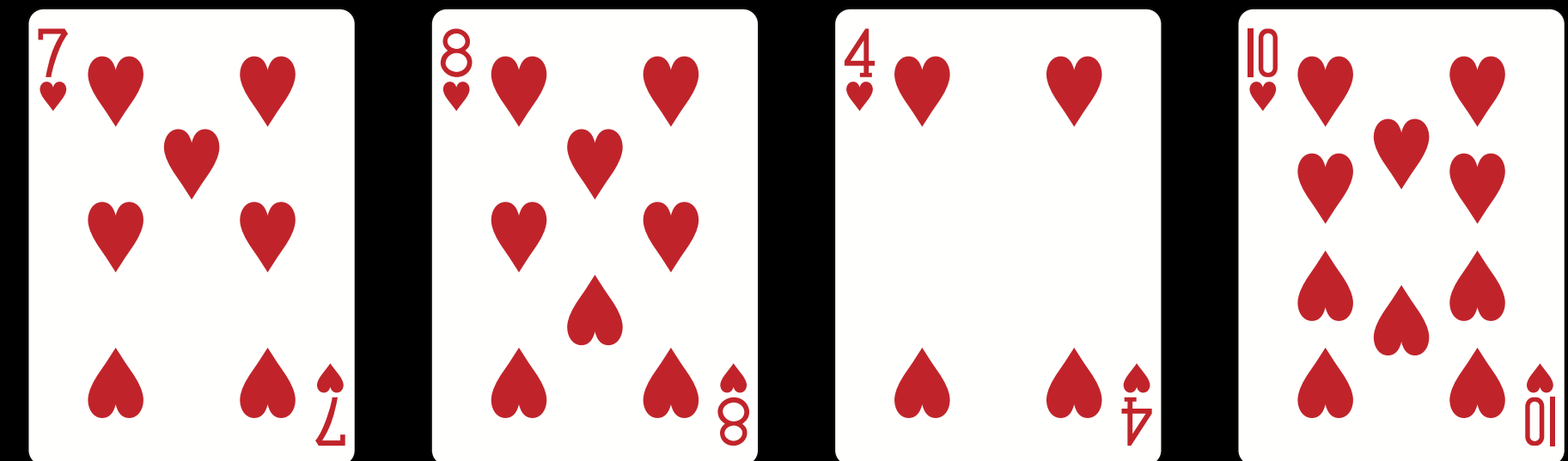
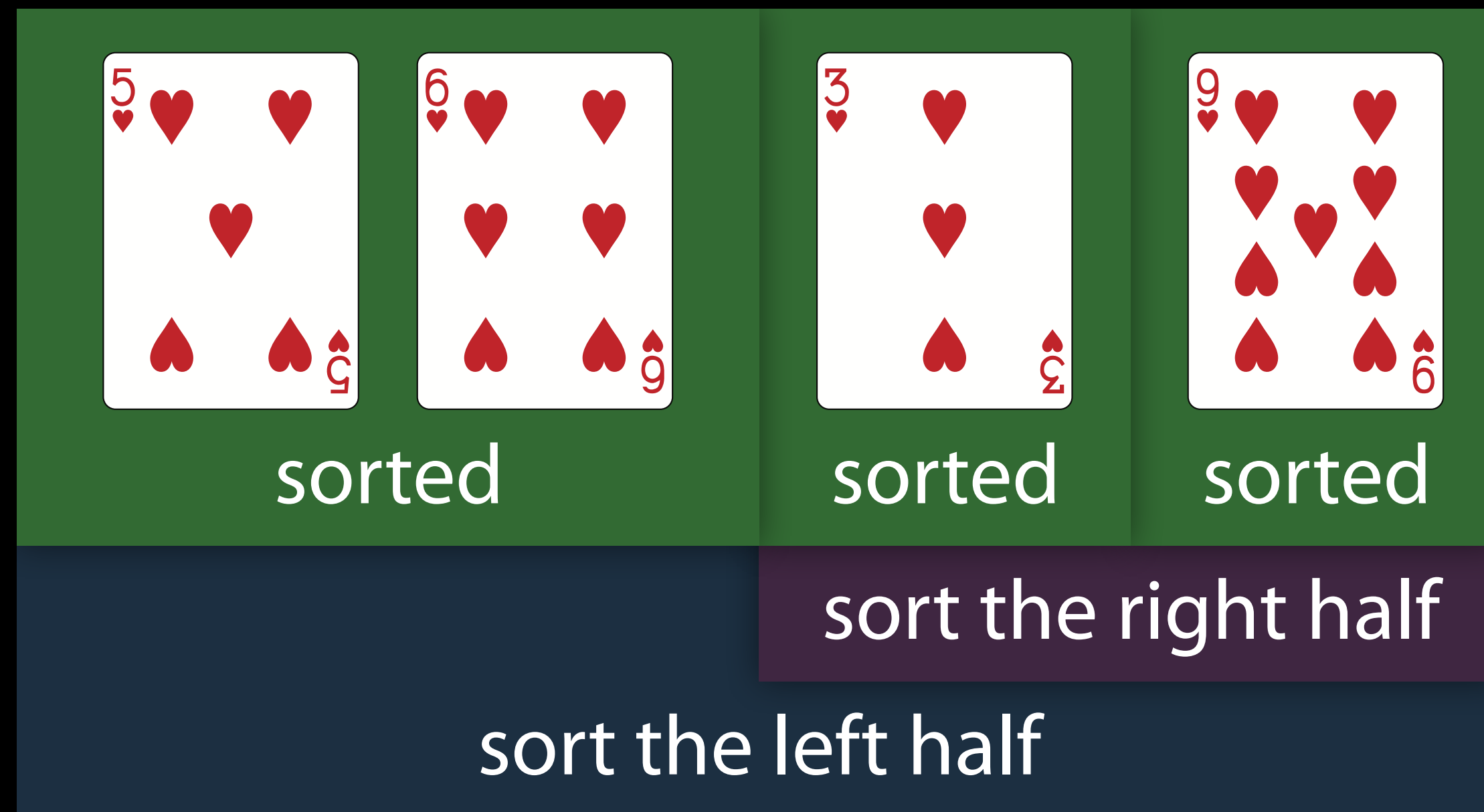
Merge sort



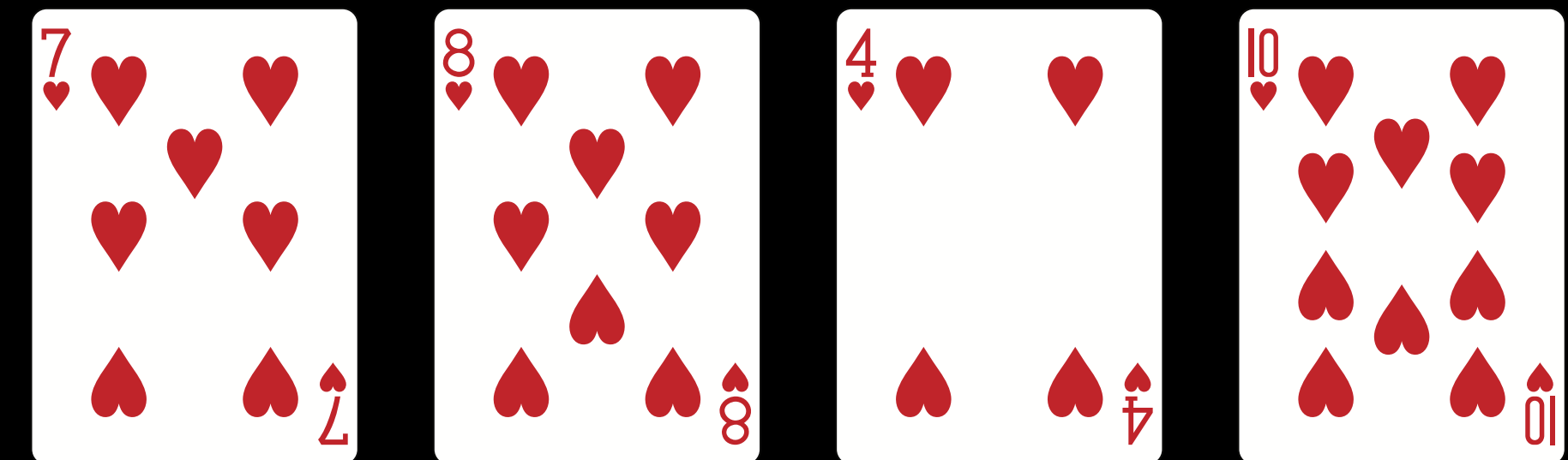
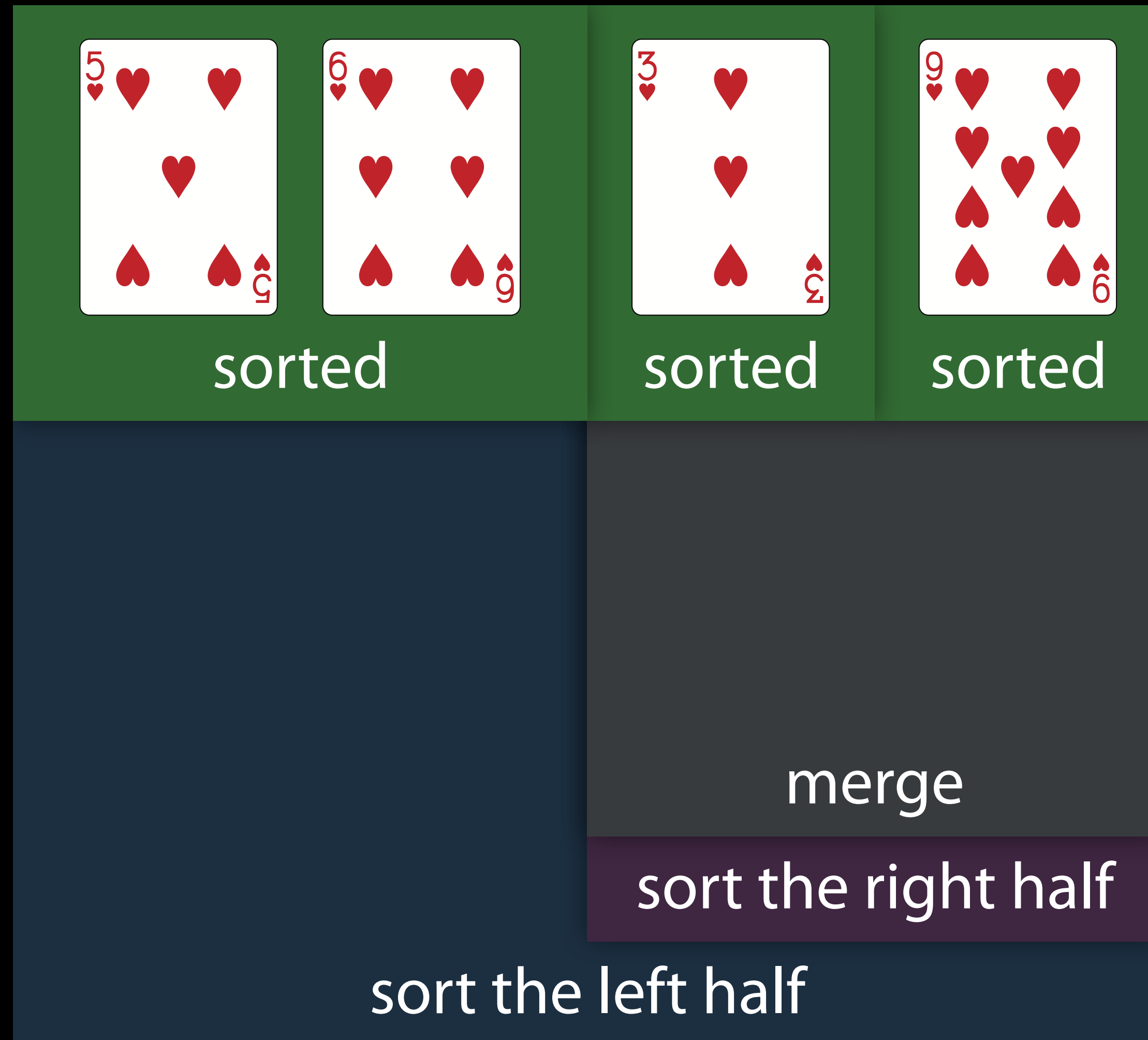
Merge sort



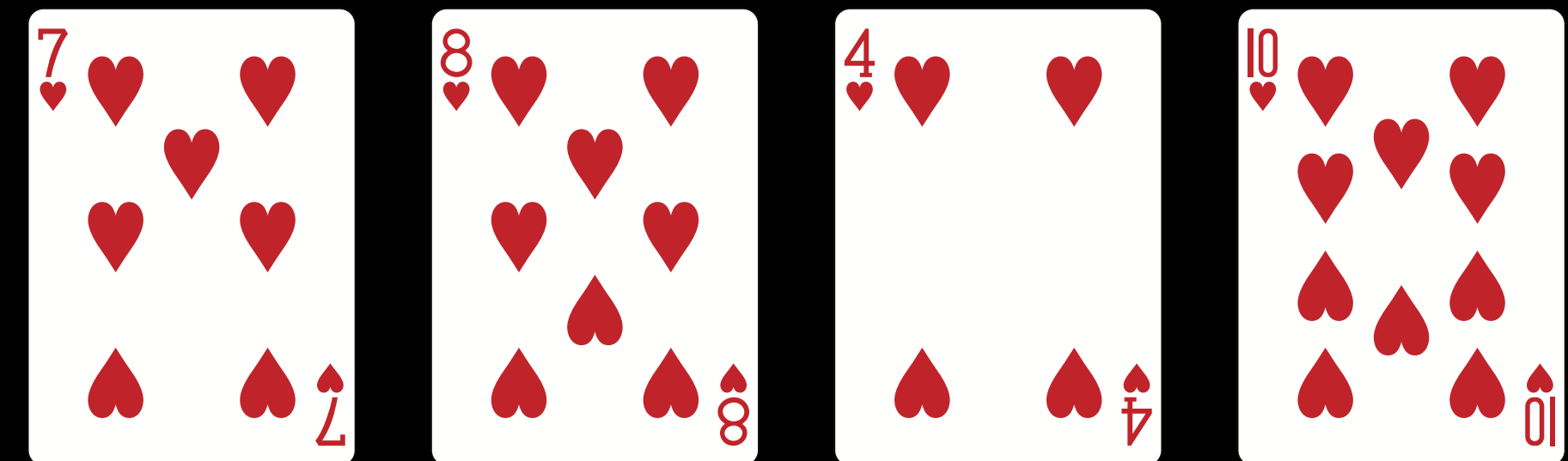
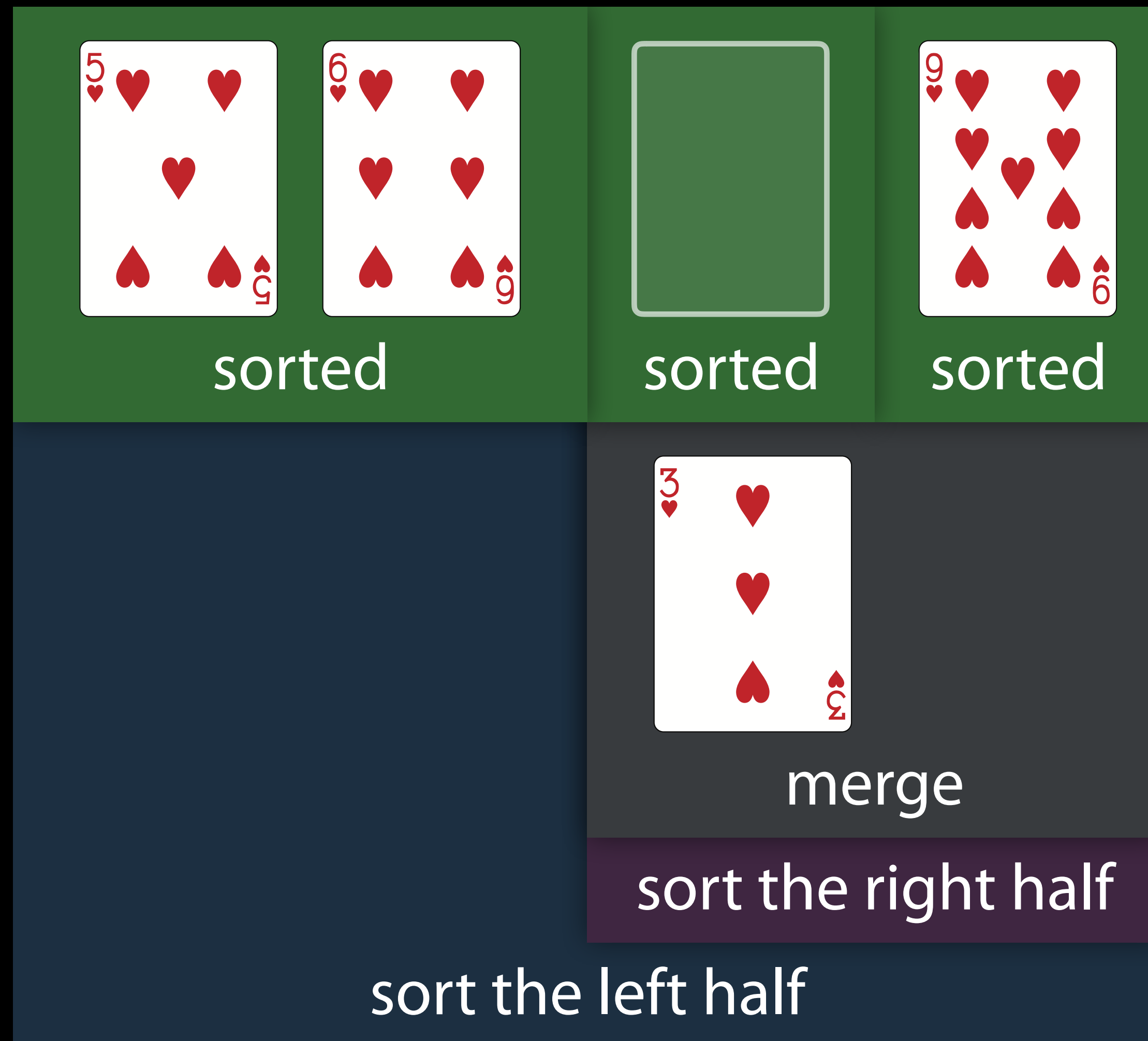
Merge sort



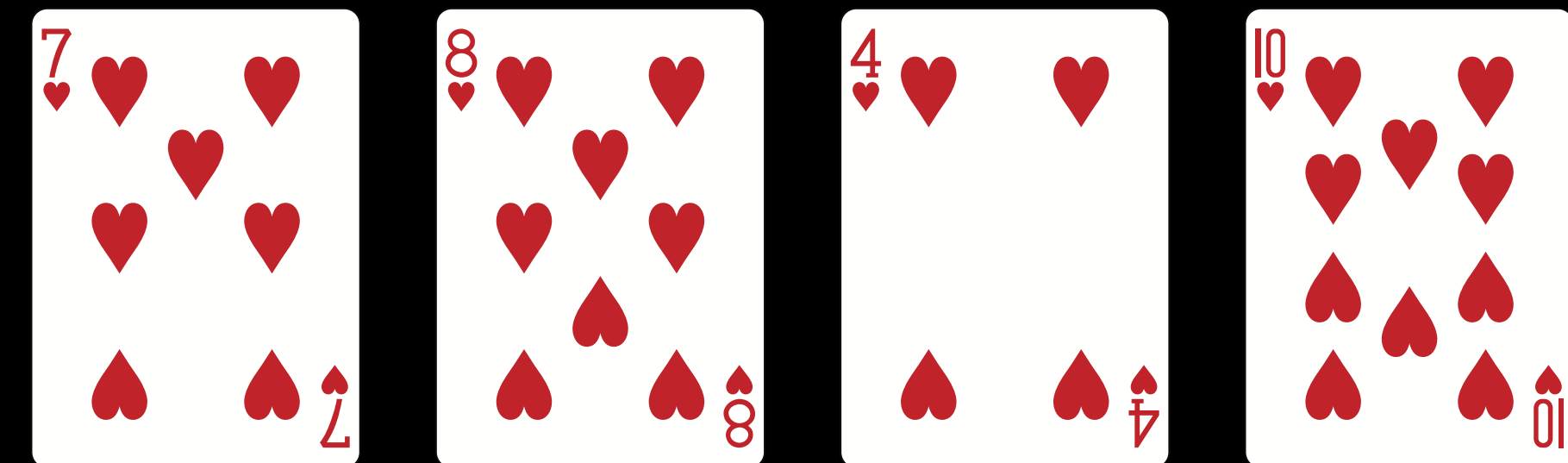
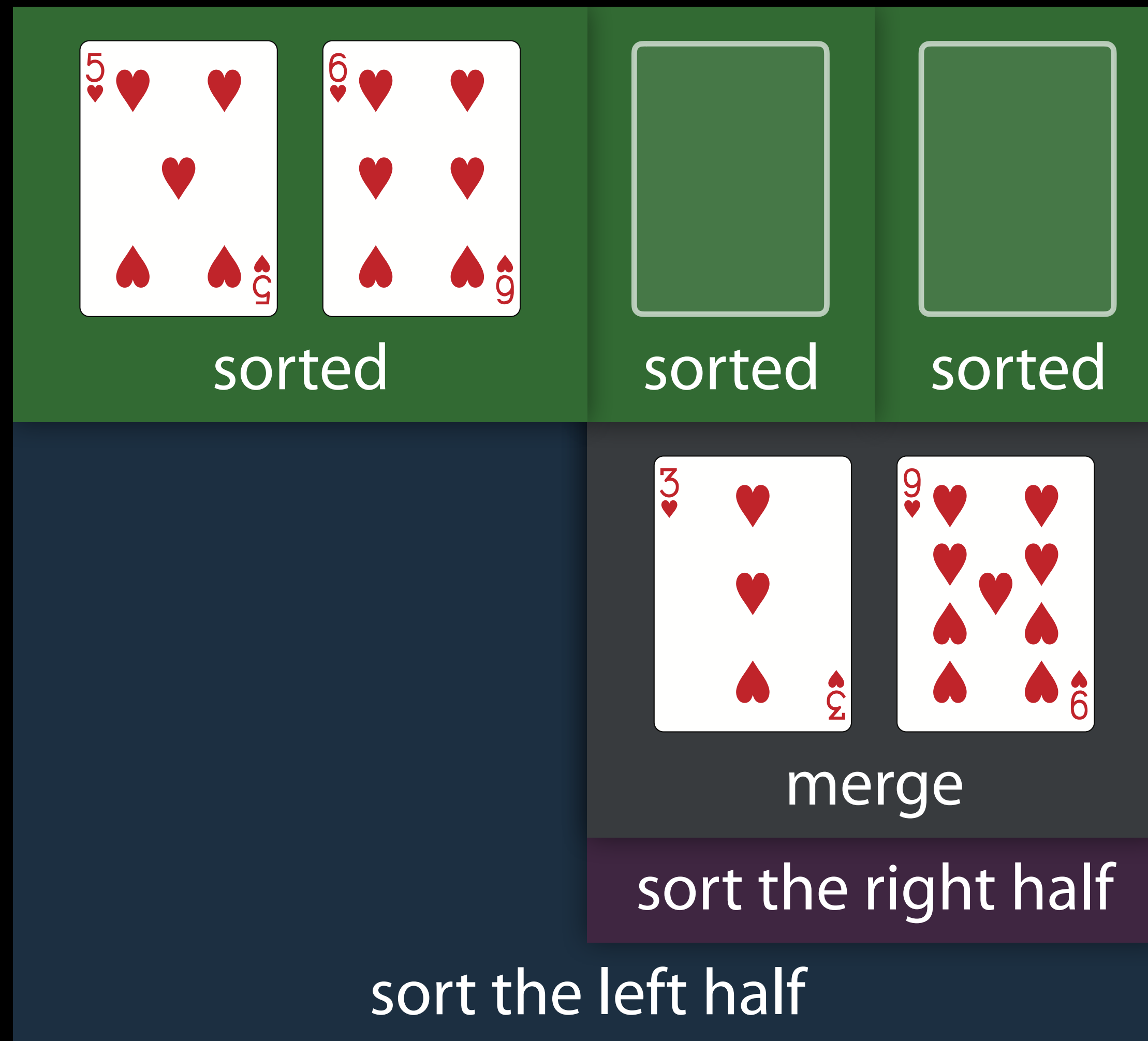
Merge sort



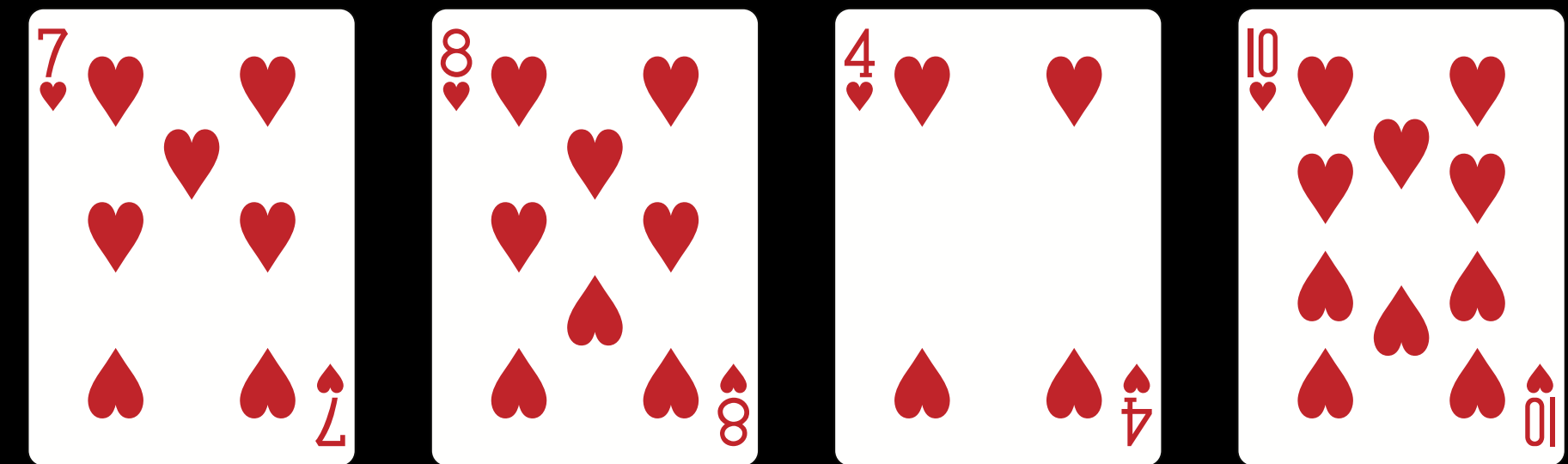
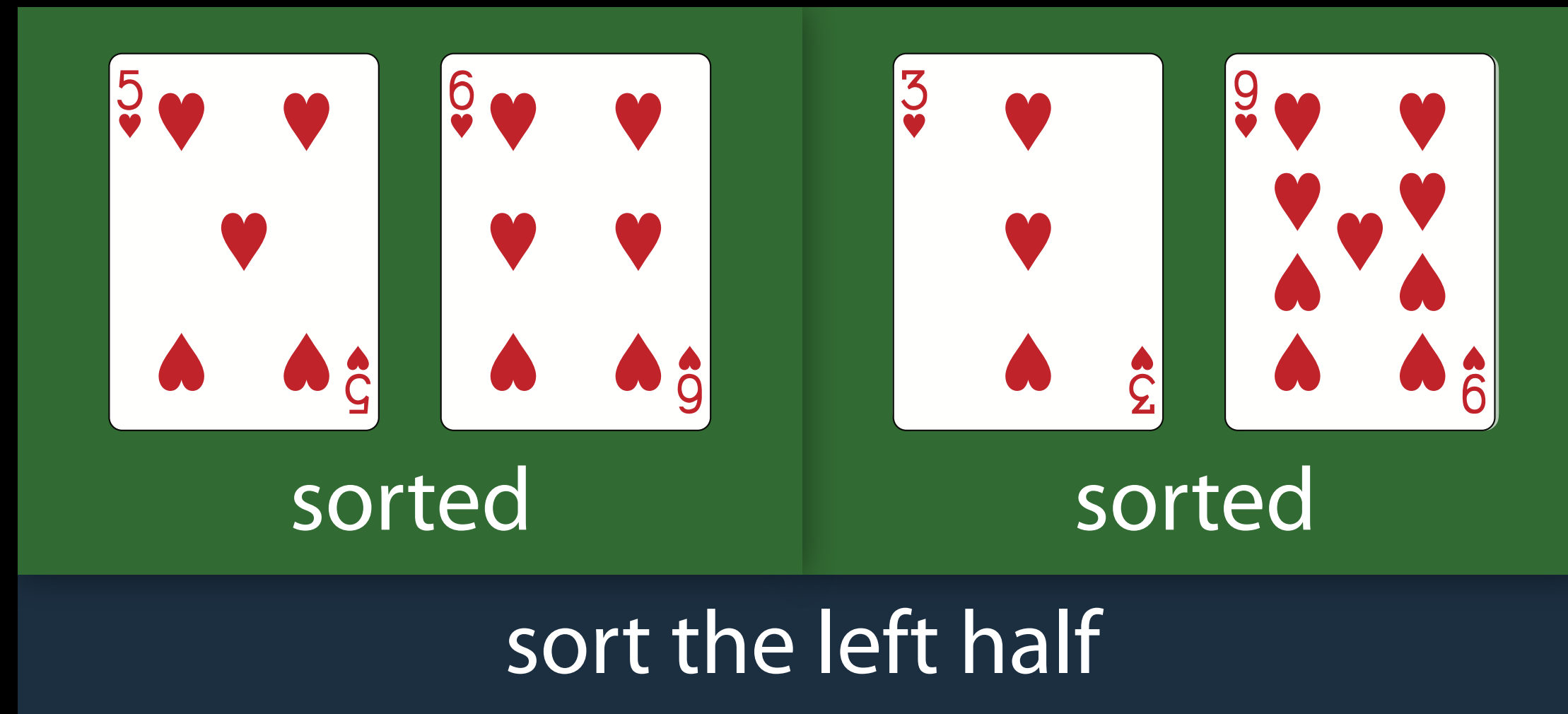
Merge sort



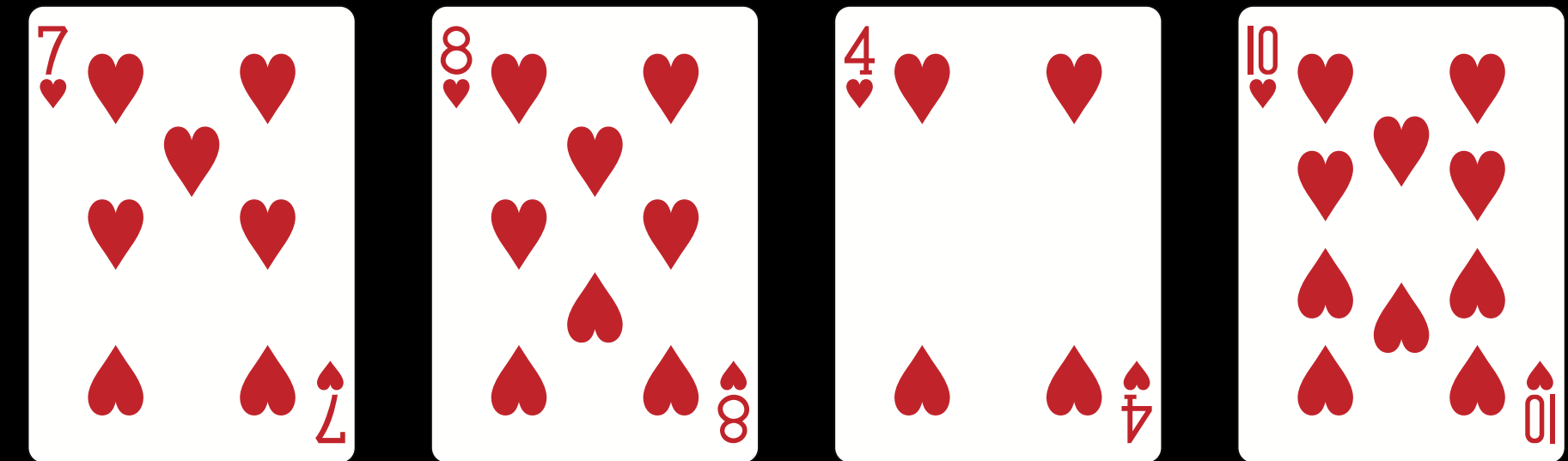
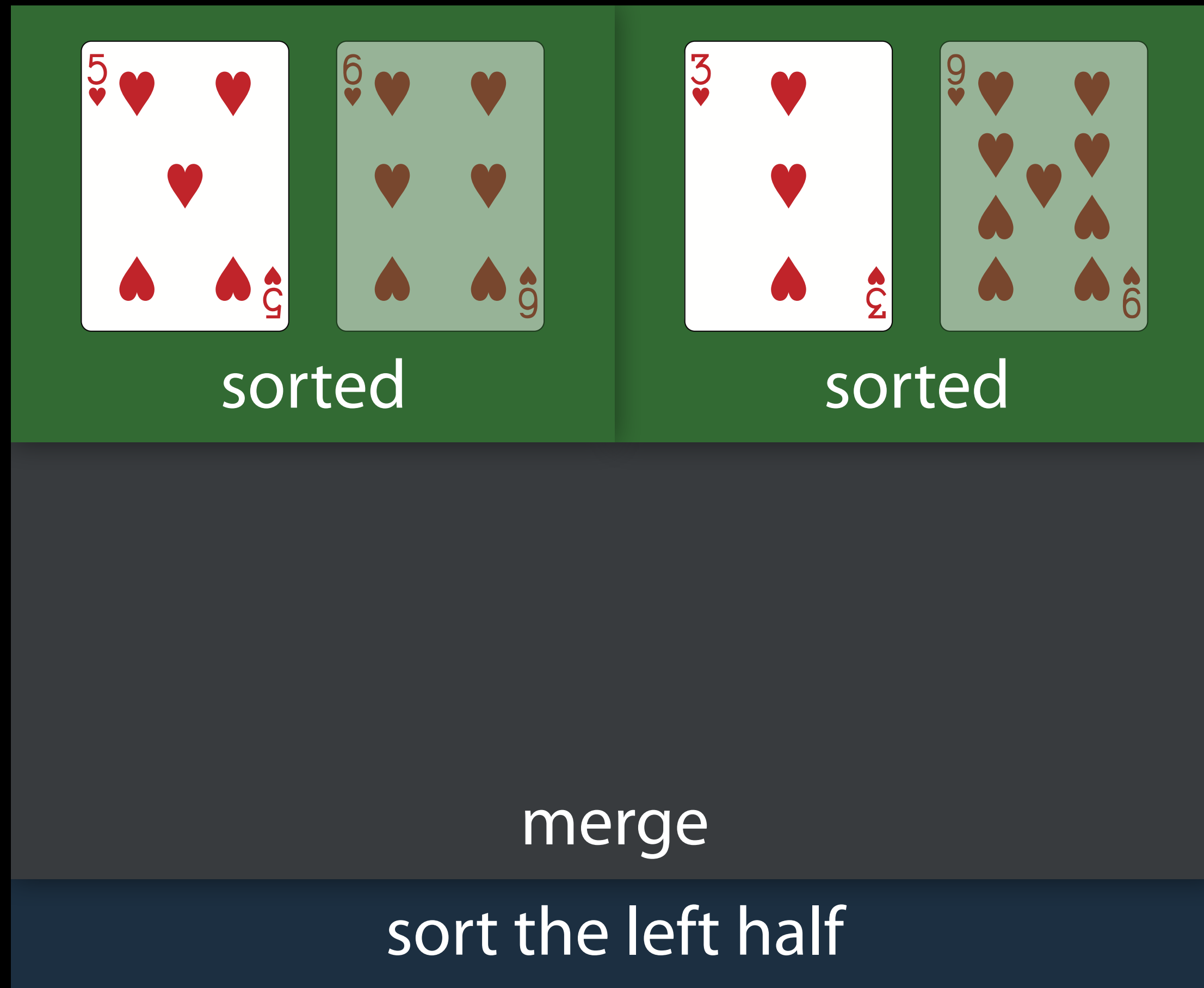
Merge sort



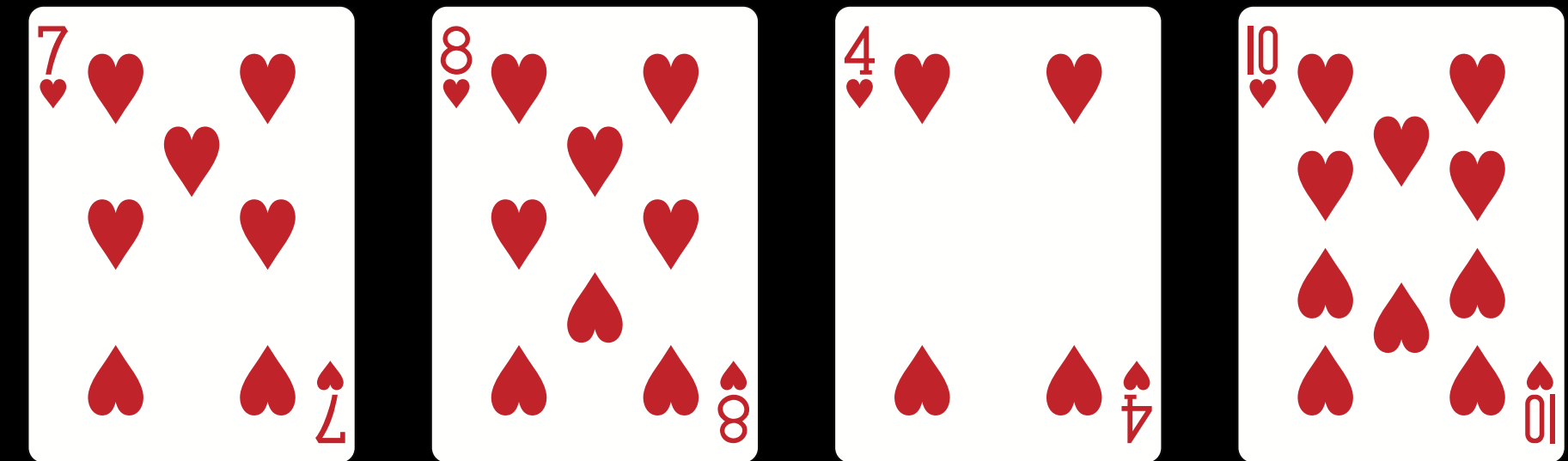
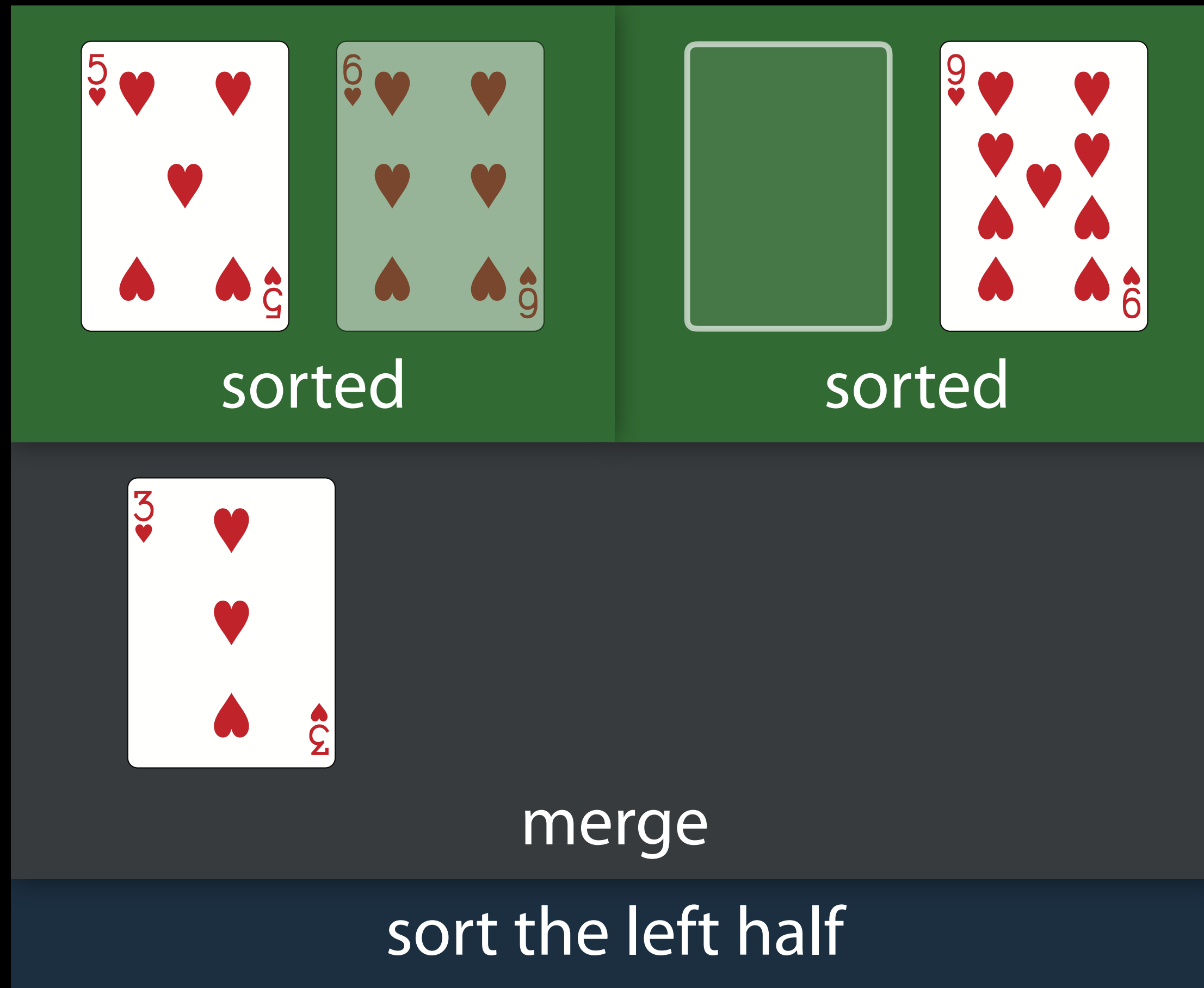
Merge sort



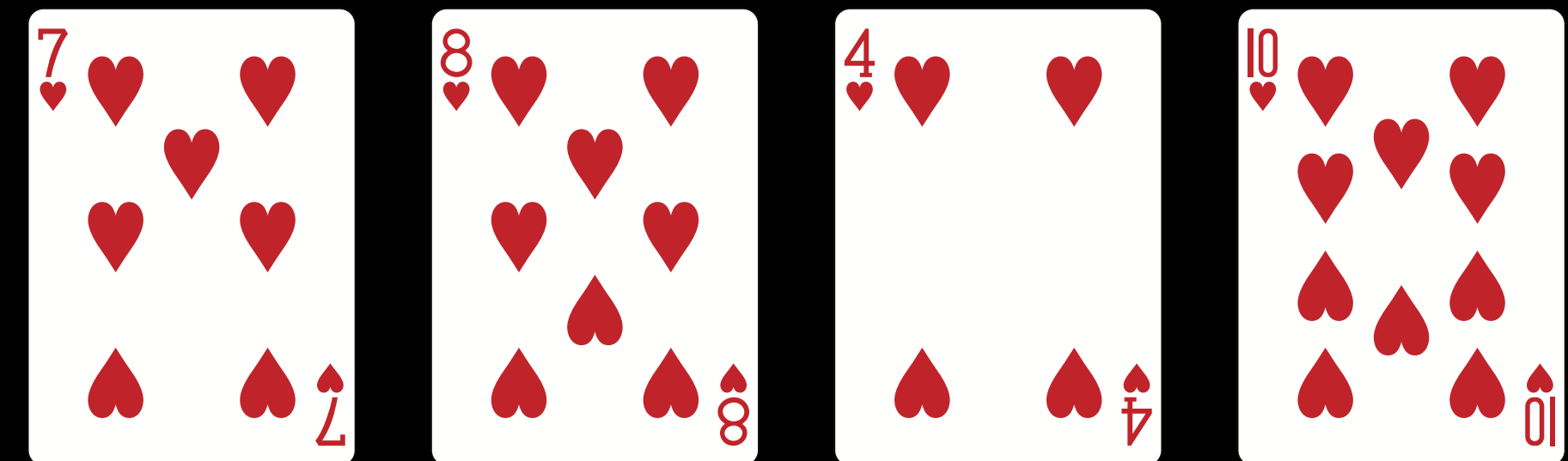
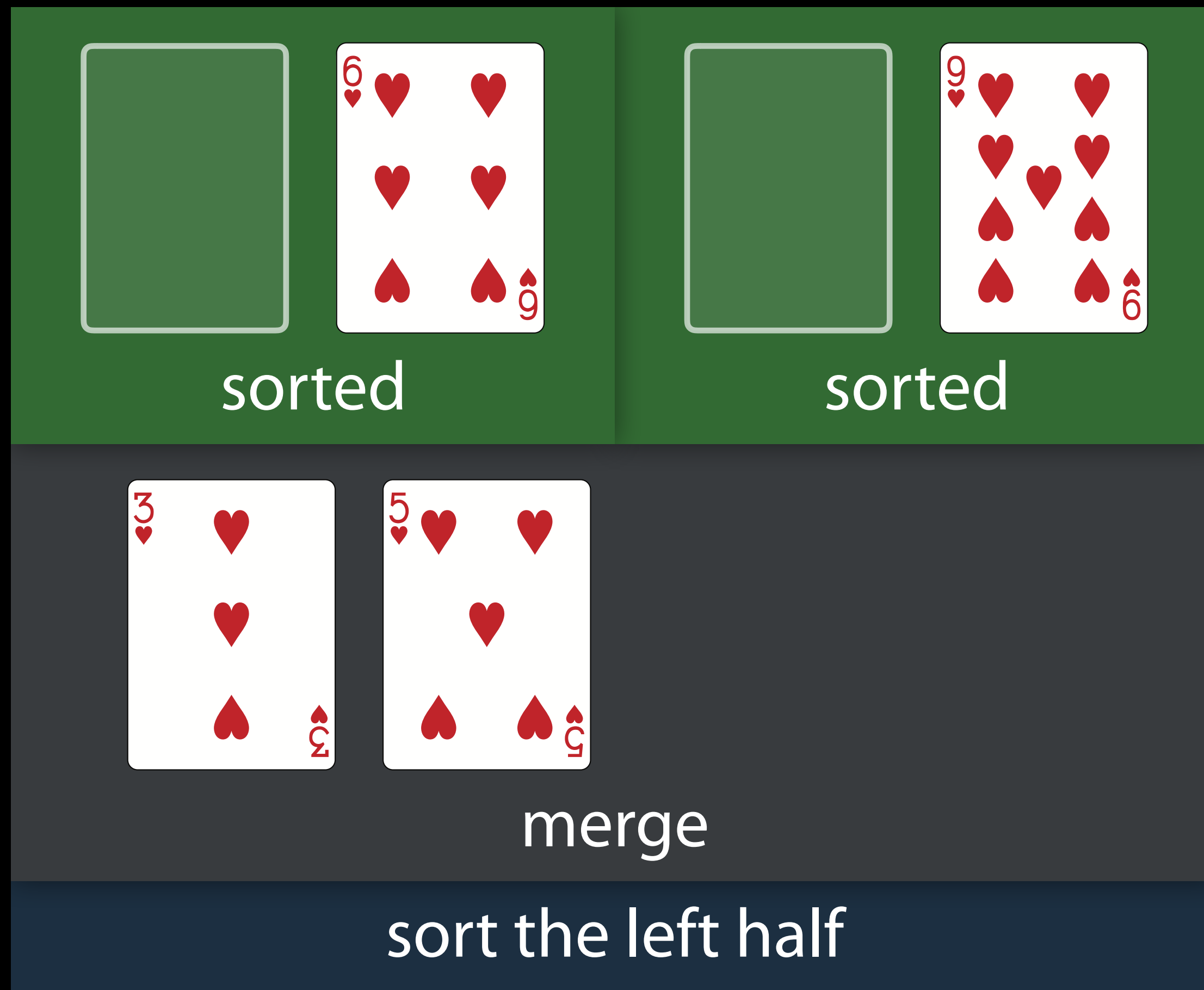
Merge sort



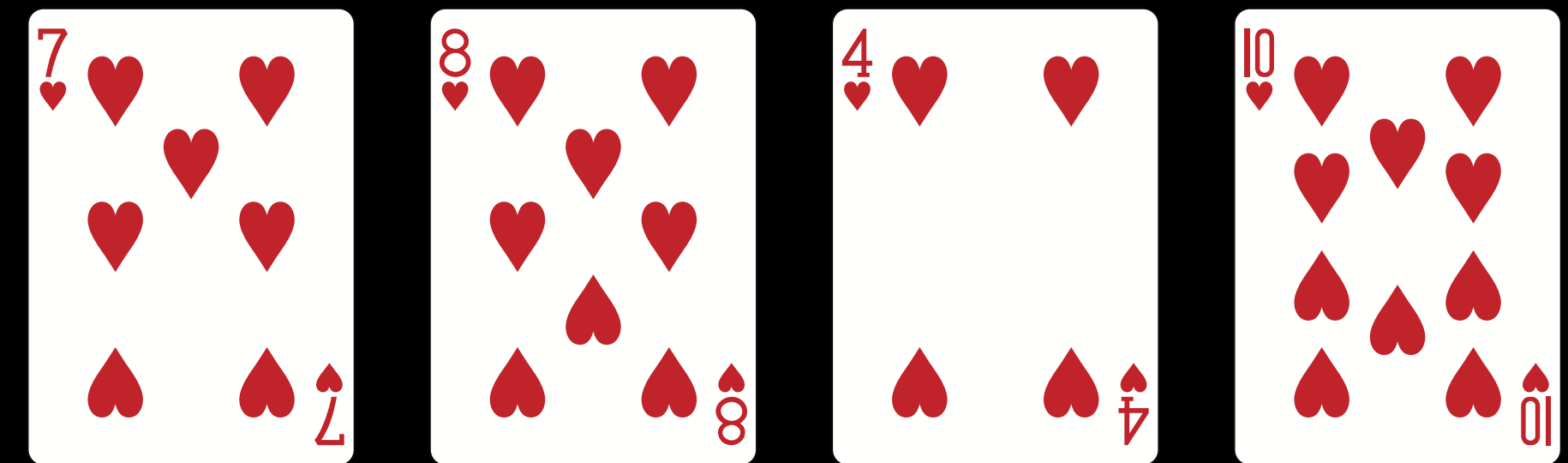
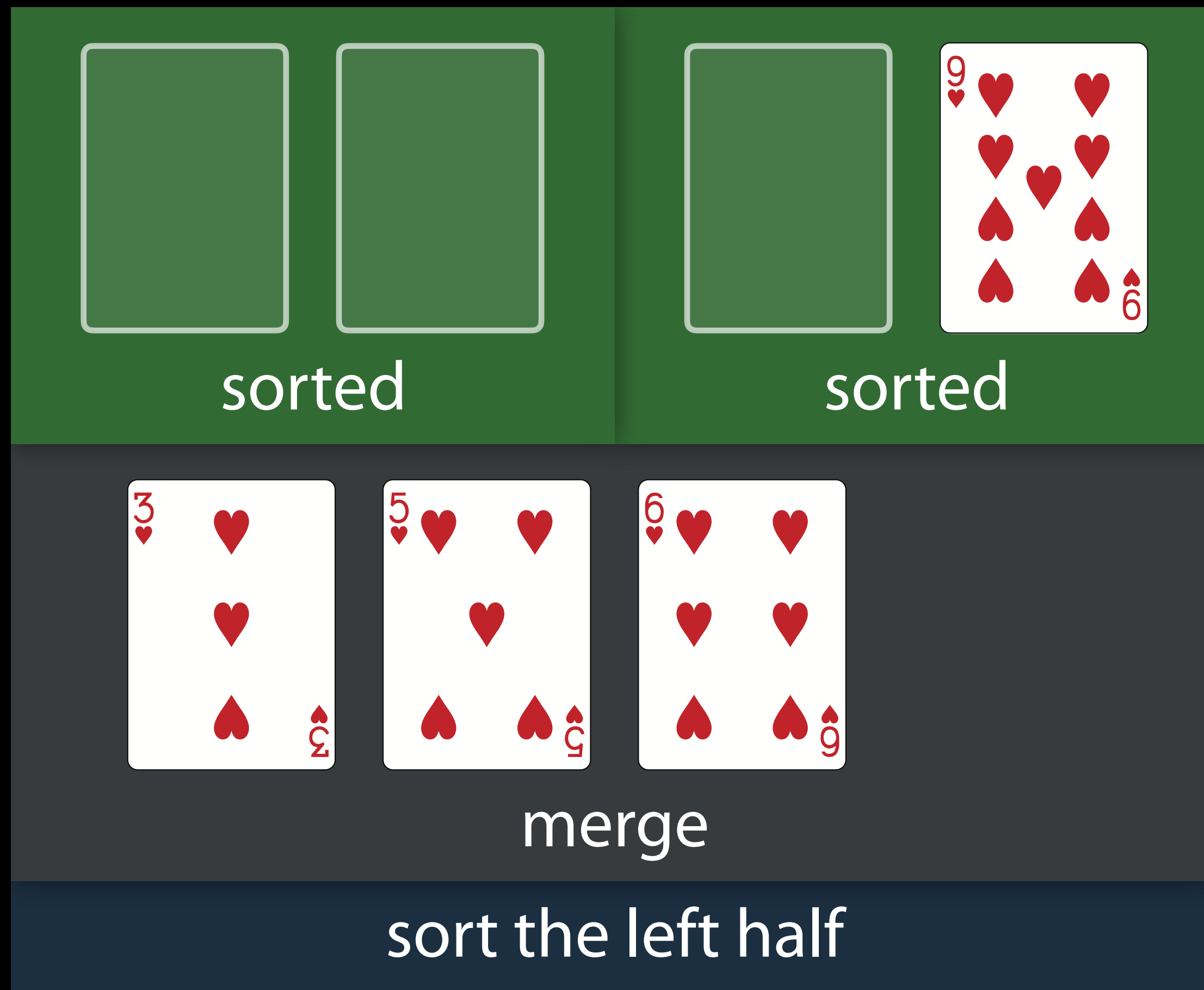
Merge sort



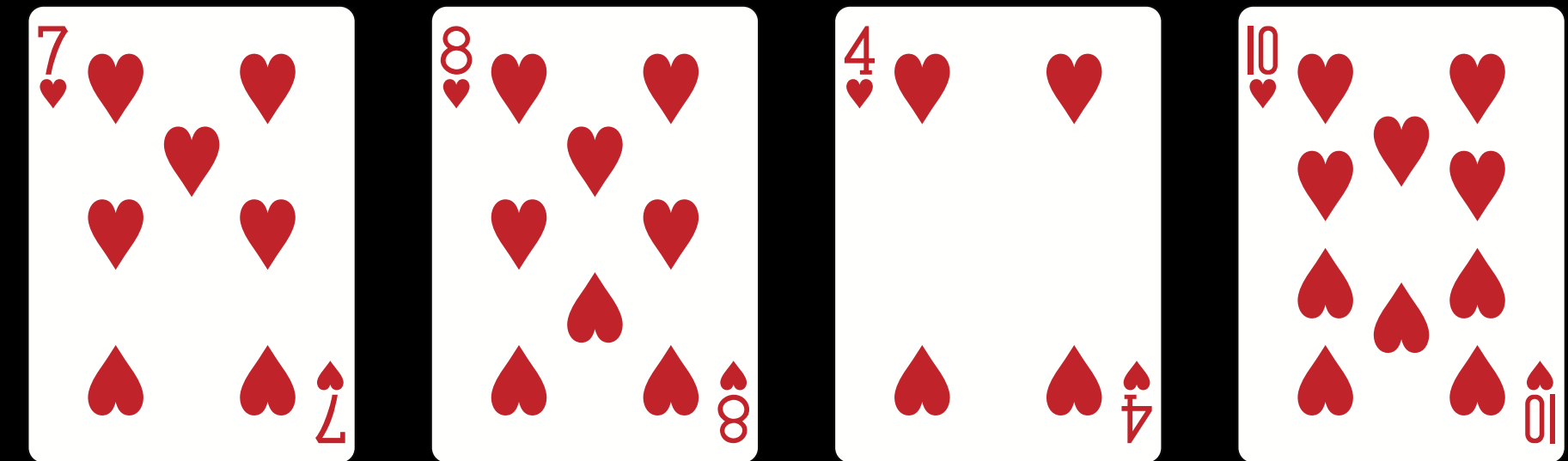
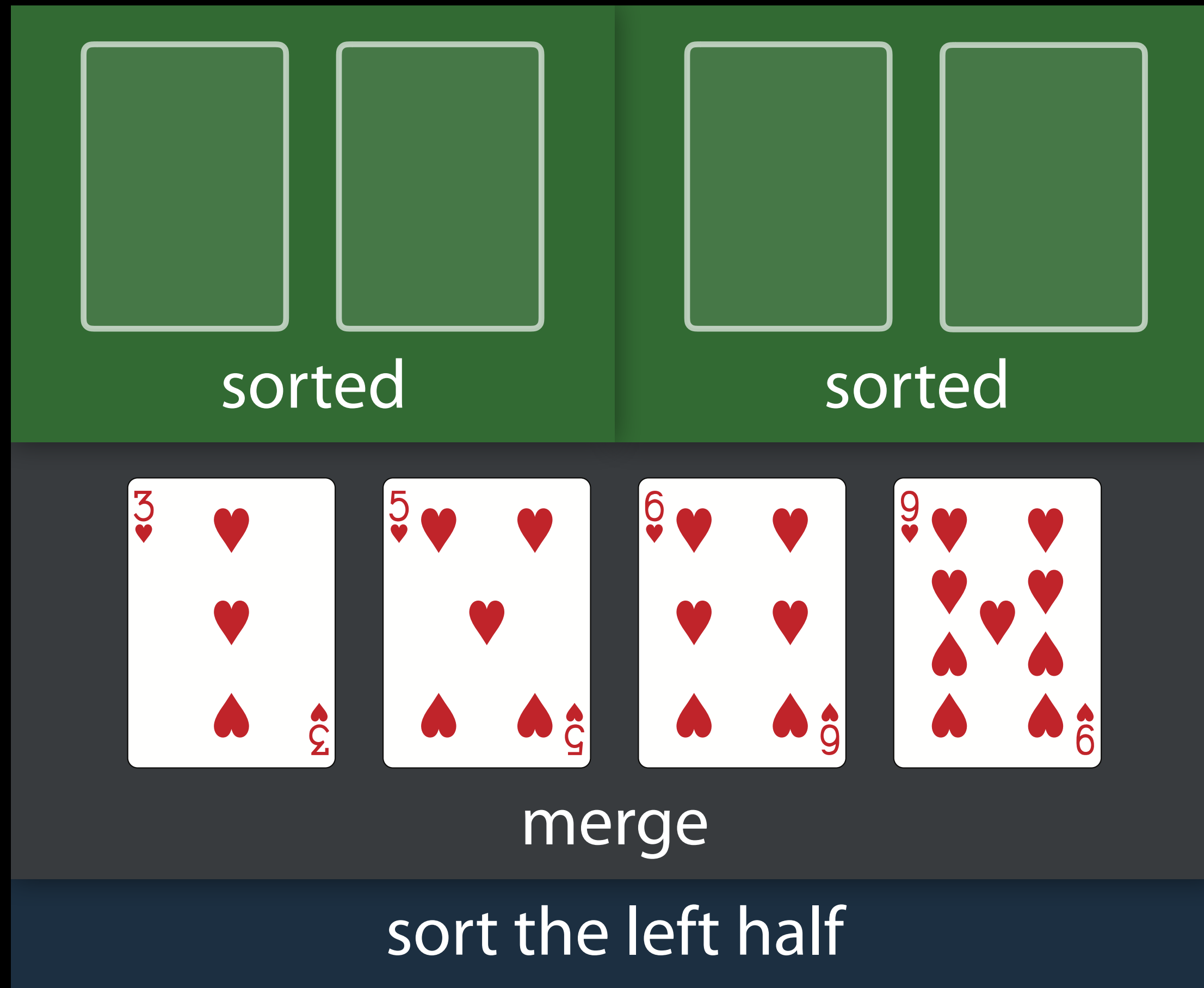
Merge sort



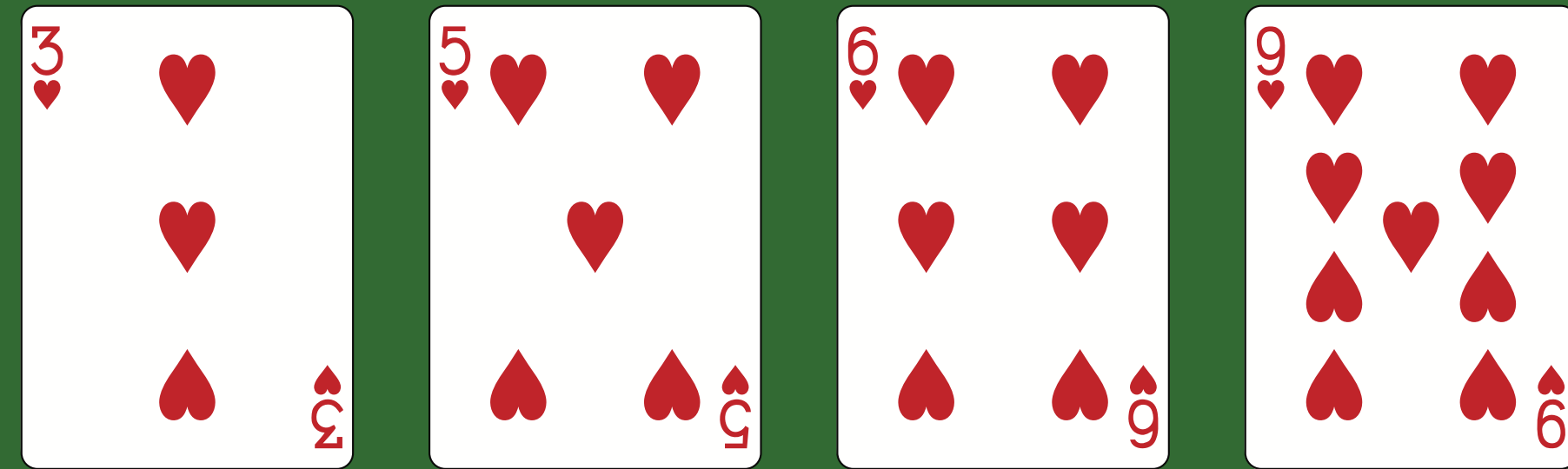
Merge sort



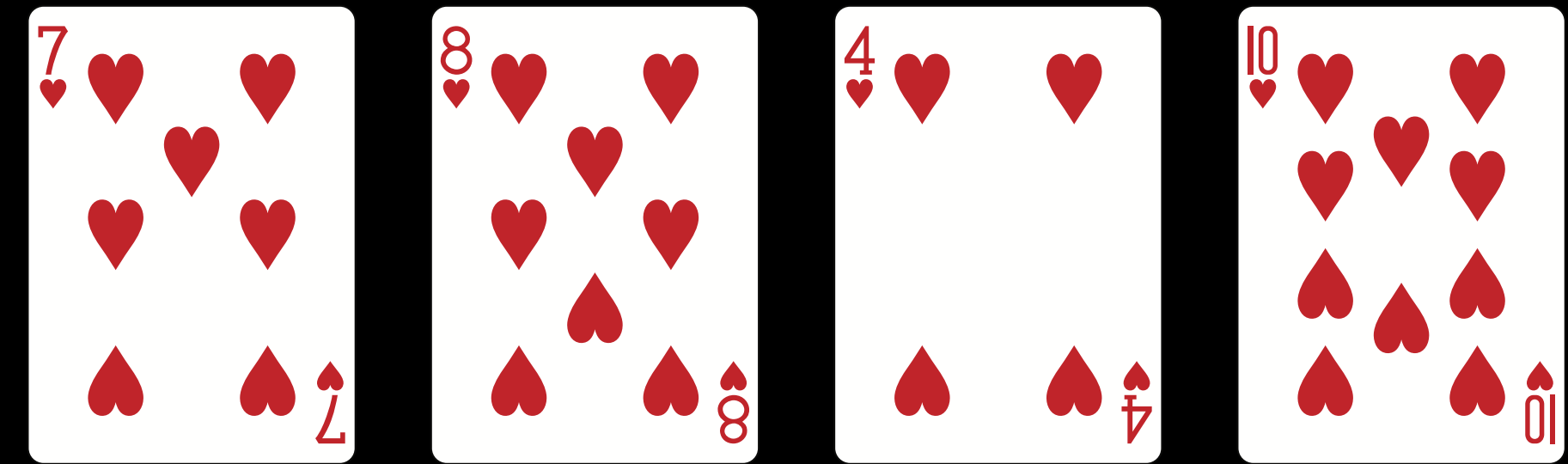
Merge sort



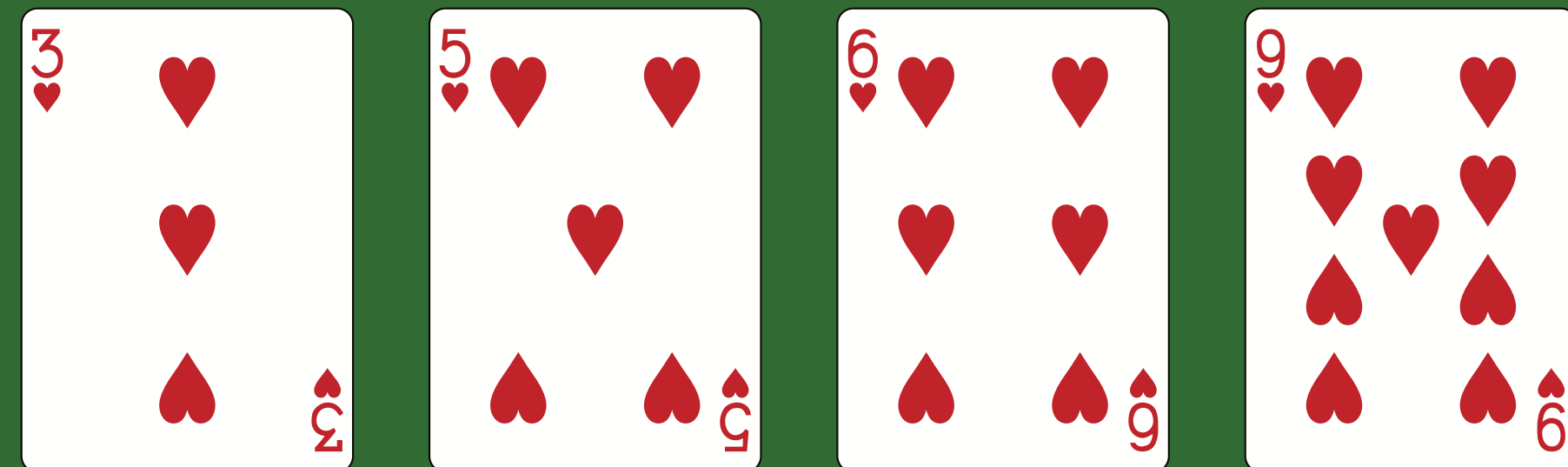
Merge sort



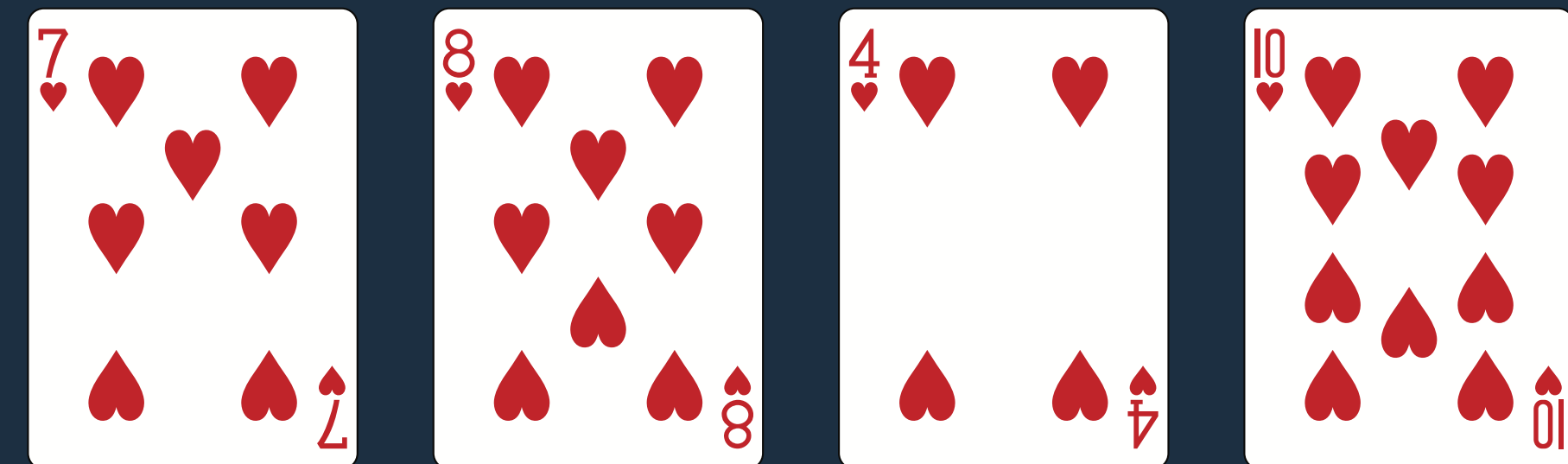
sorted



Merge sort

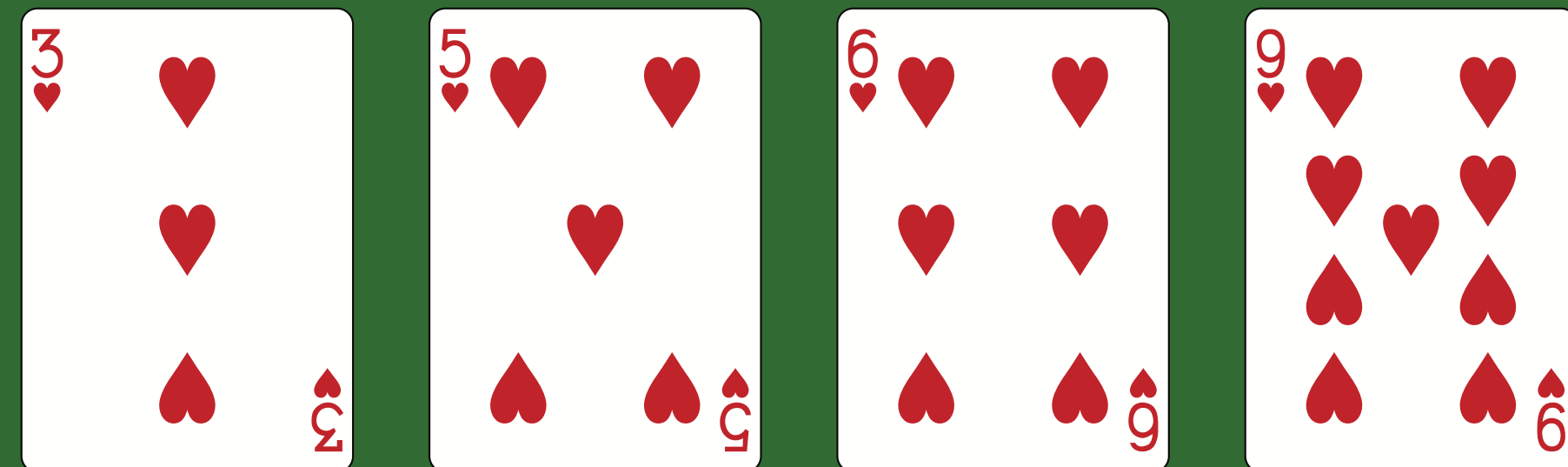


sorted

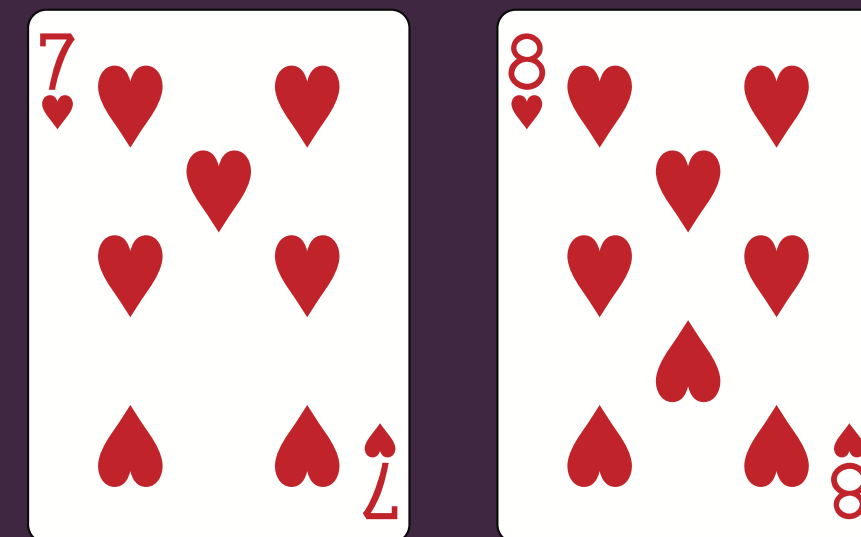


sort the right half

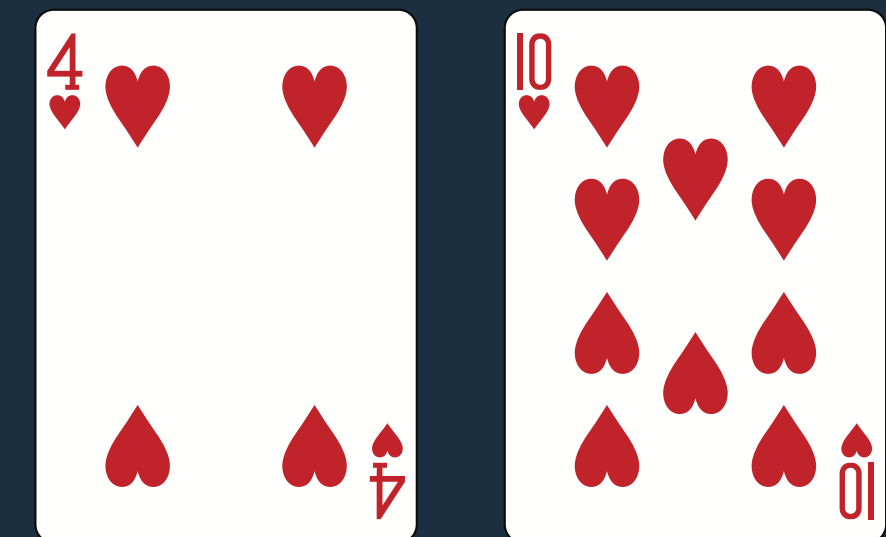
Merge sort



sorted

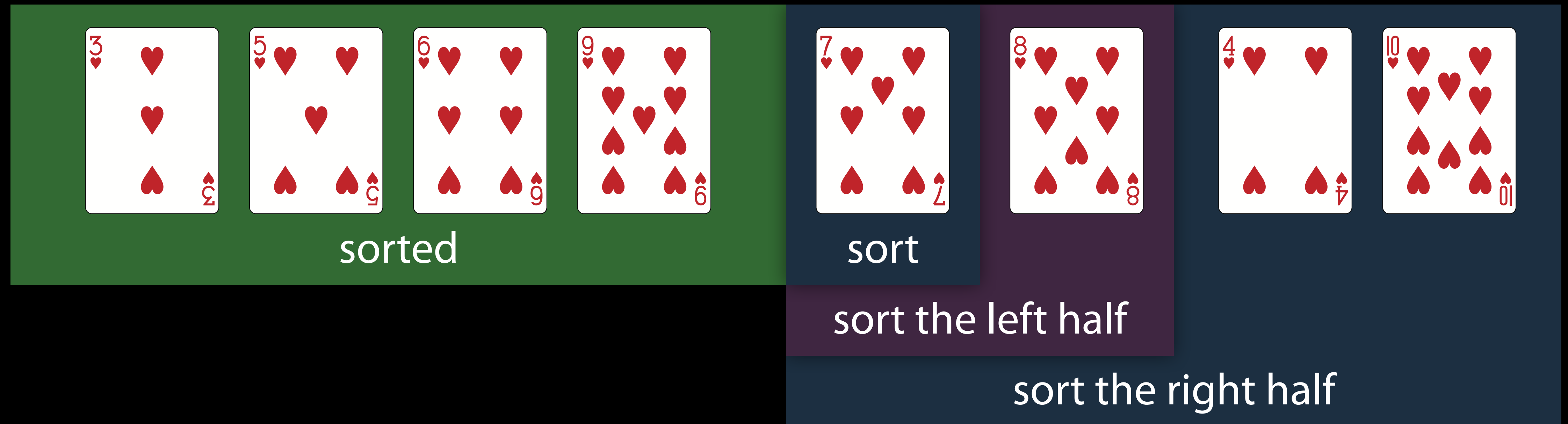


sort the left half

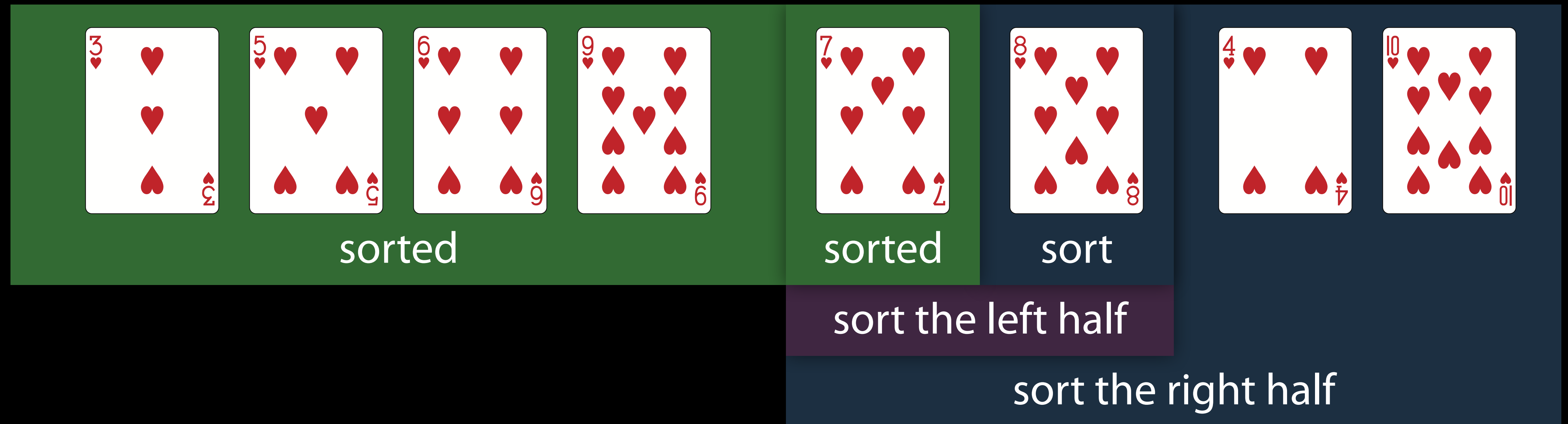


sort the right half

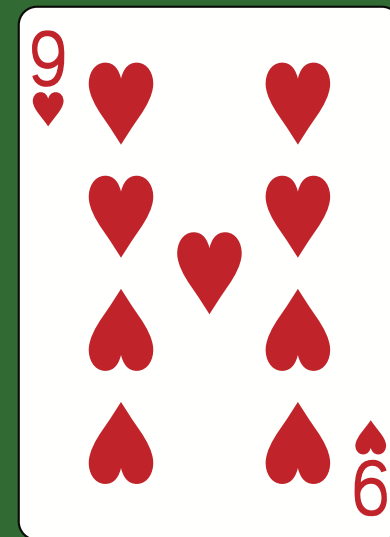
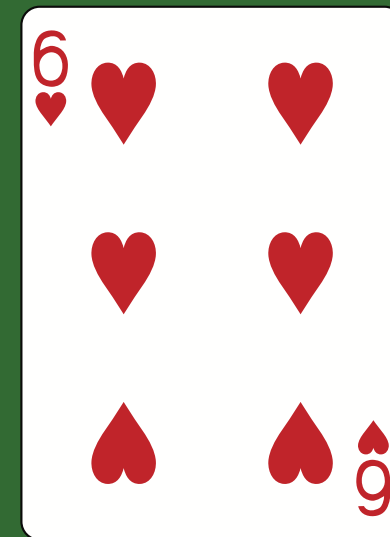
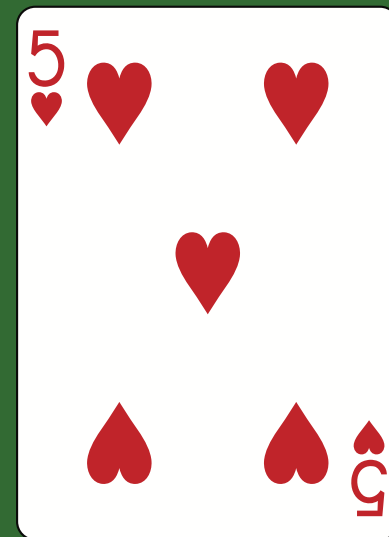
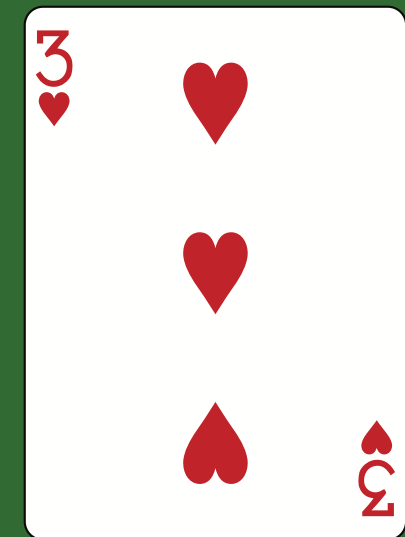
Merge sort



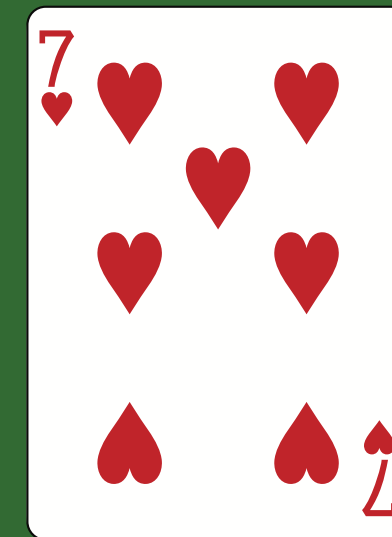
Merge sort



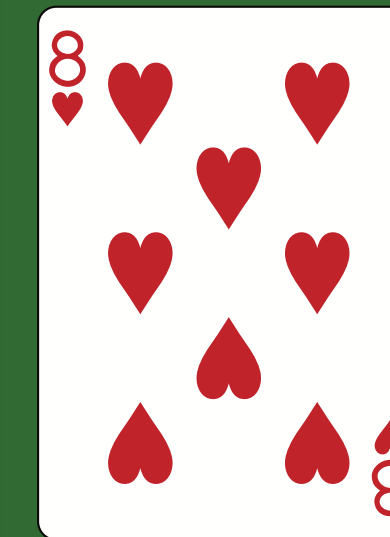
Merge sort



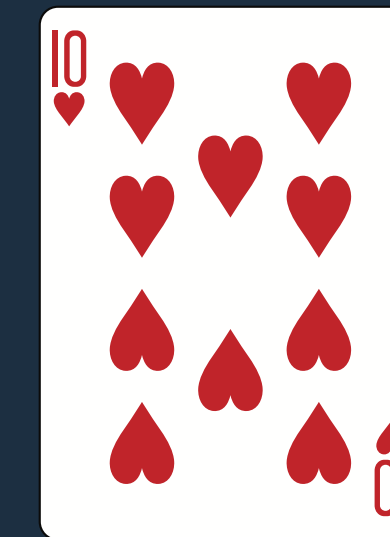
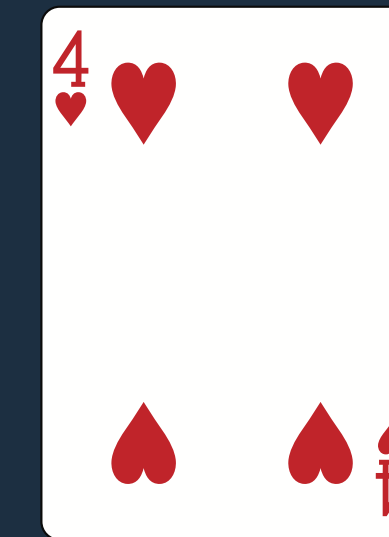
sorted



sorted



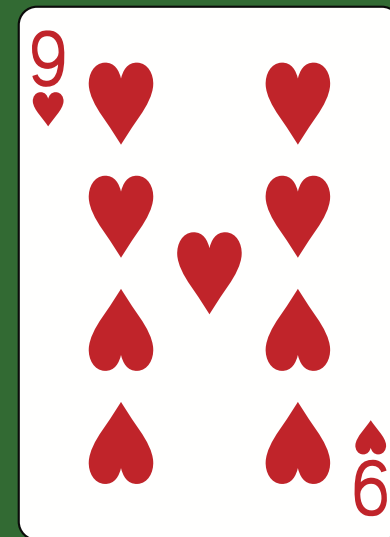
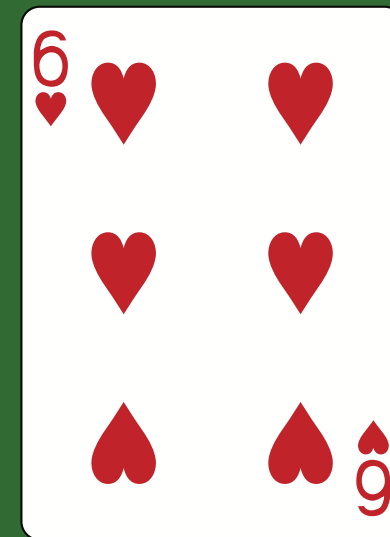
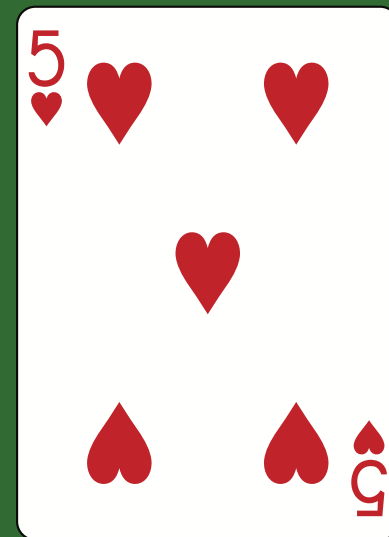
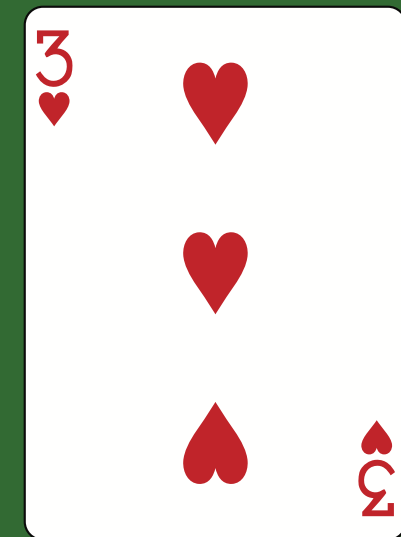
sorted



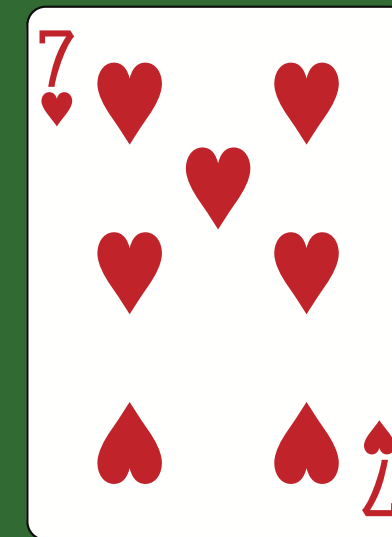
sort the left half

sort the right half

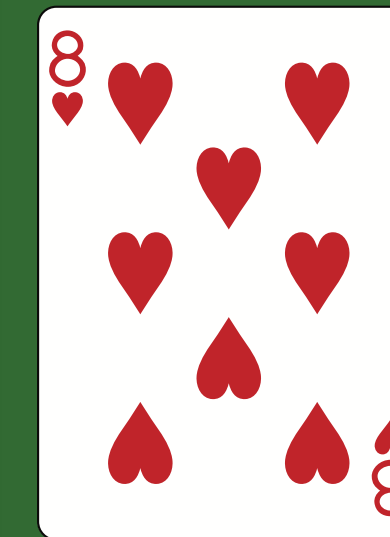
Merge sort



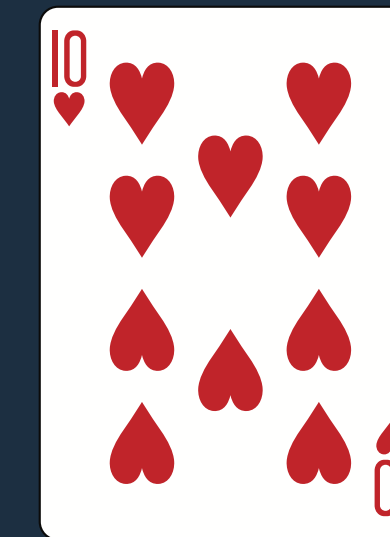
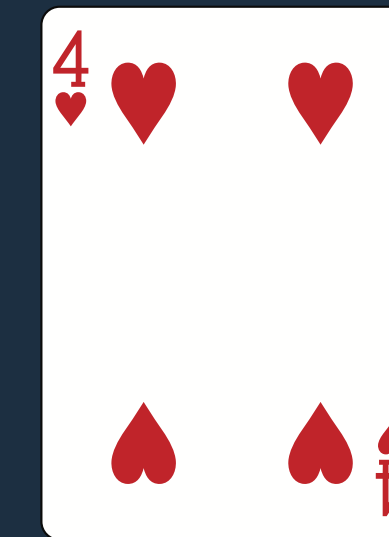
sorted



sorted



sorted

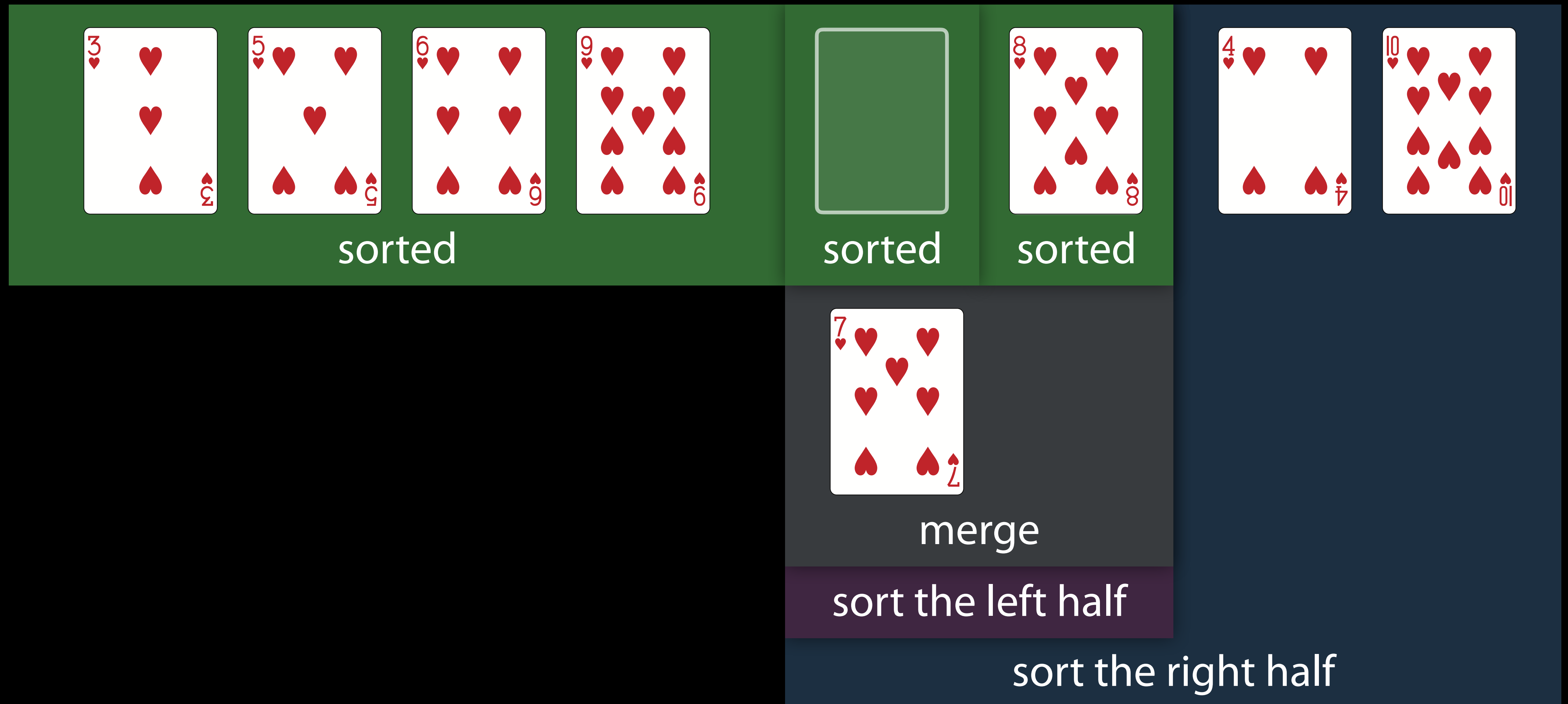


merge

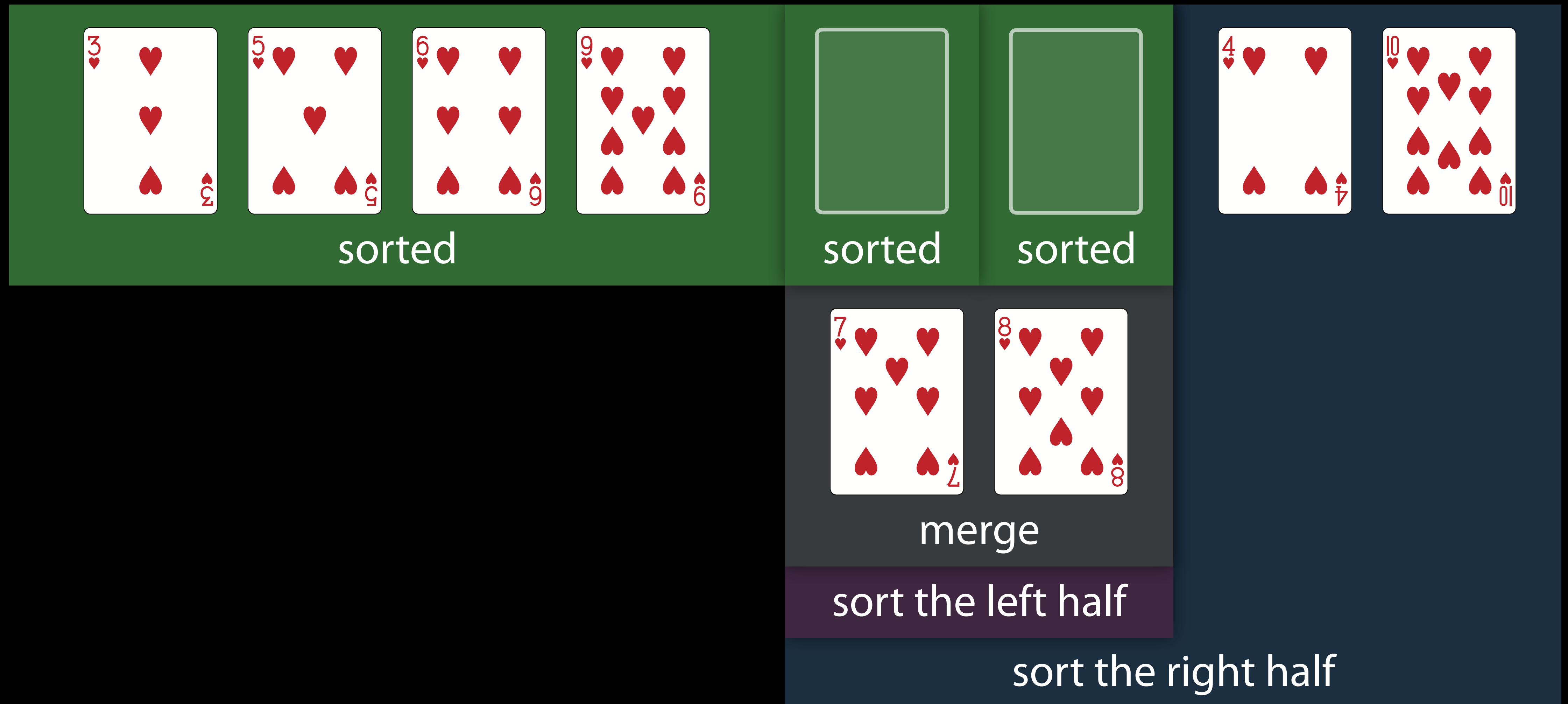
sort the left half

sort the right half

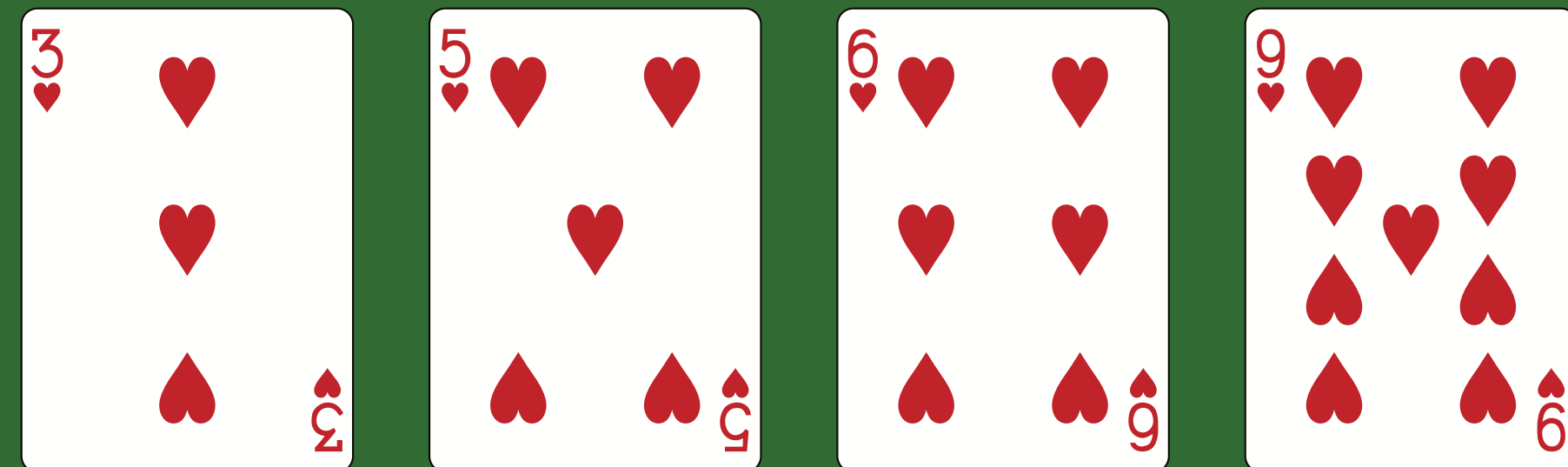
Merge sort



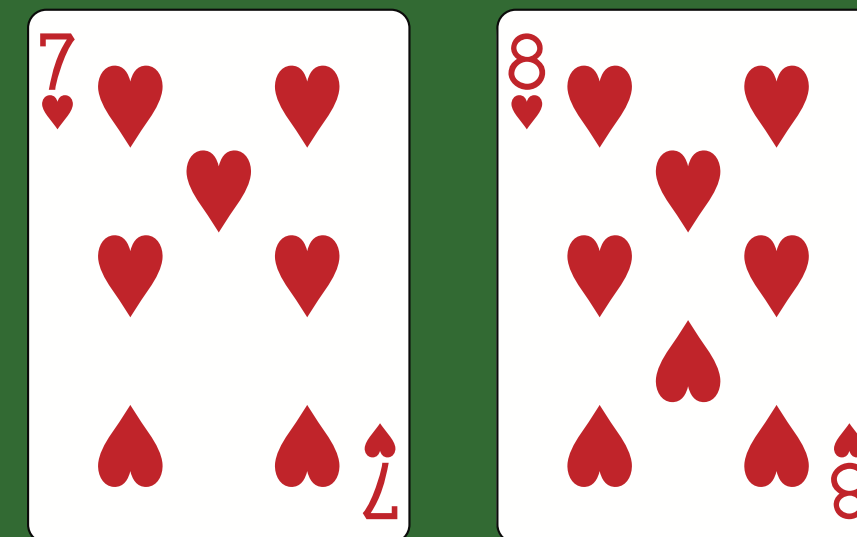
Merge sort



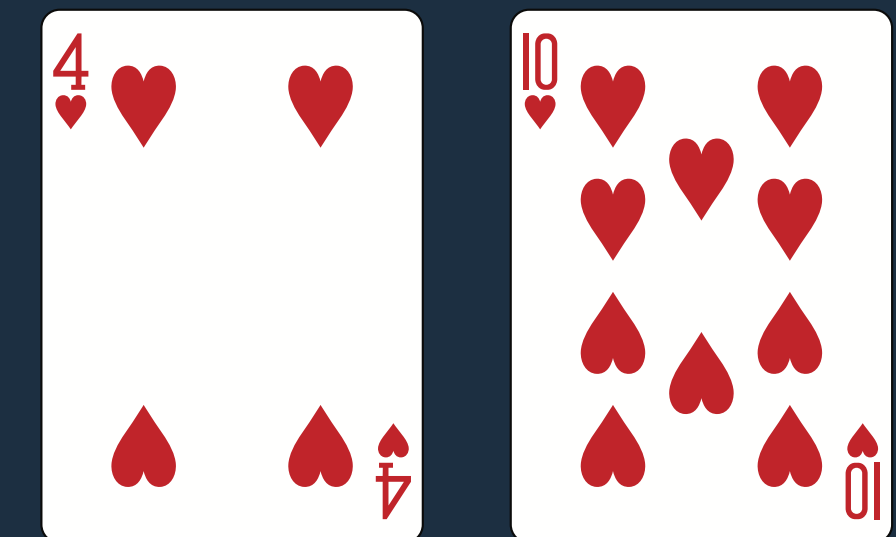
Merge sort



sorted

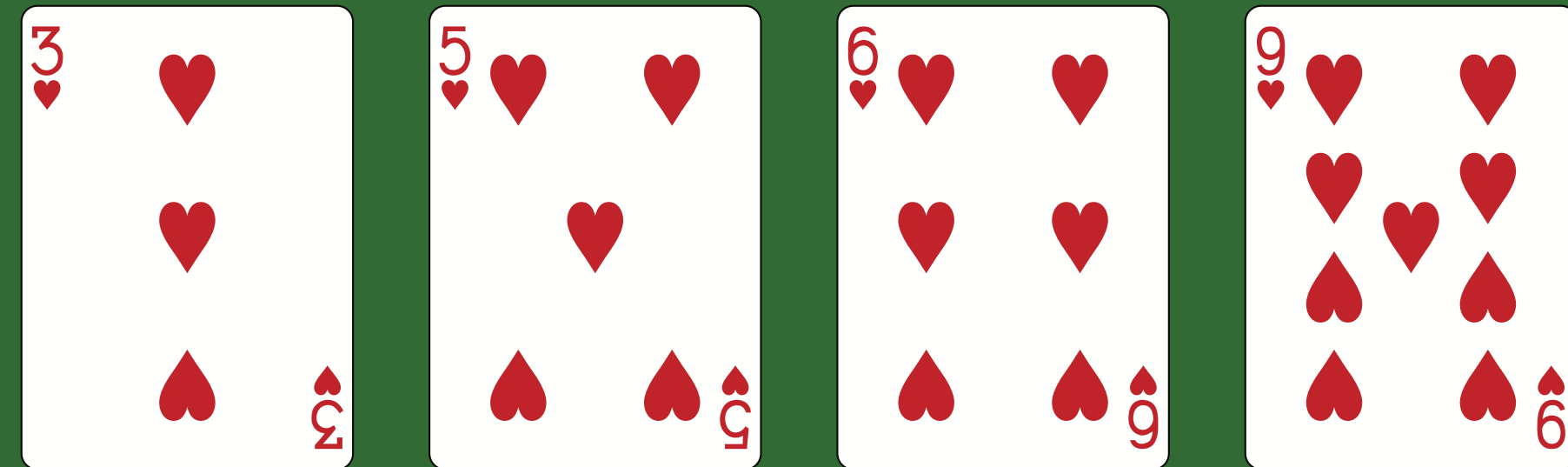


sorted

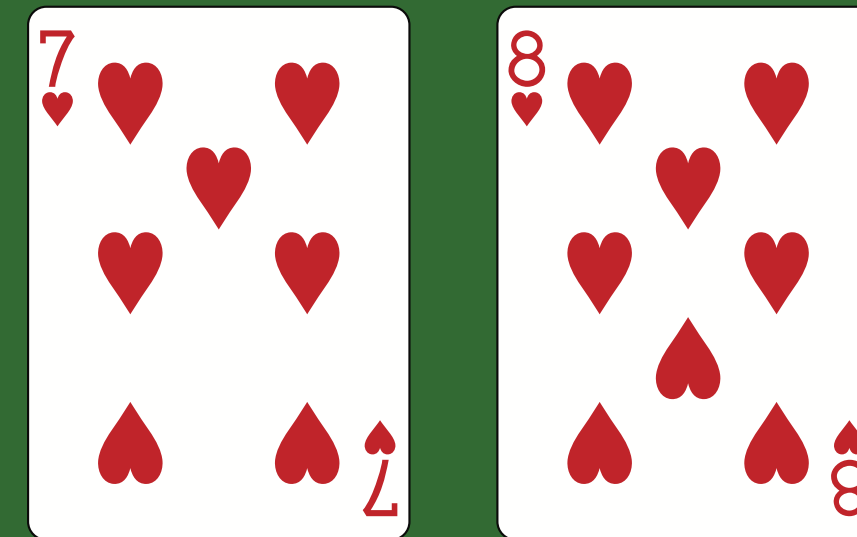


sort the right half

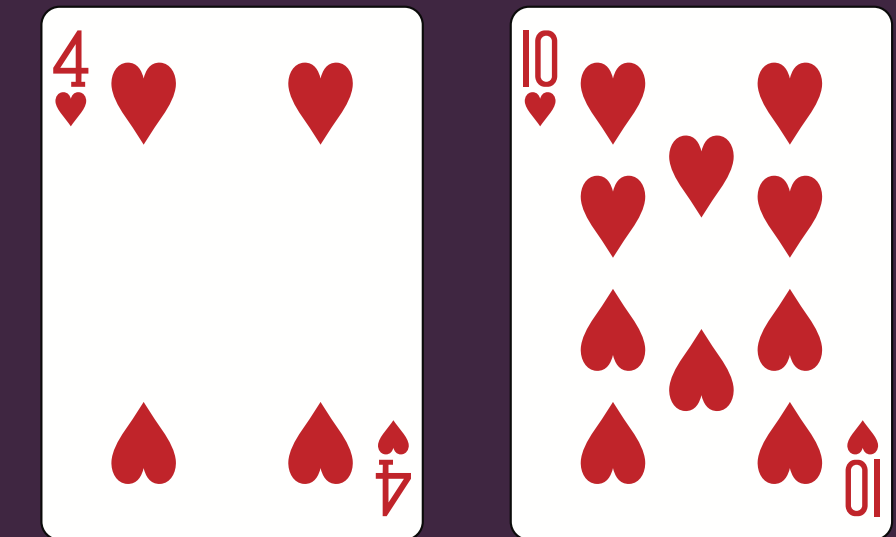
Merge sort



sorted



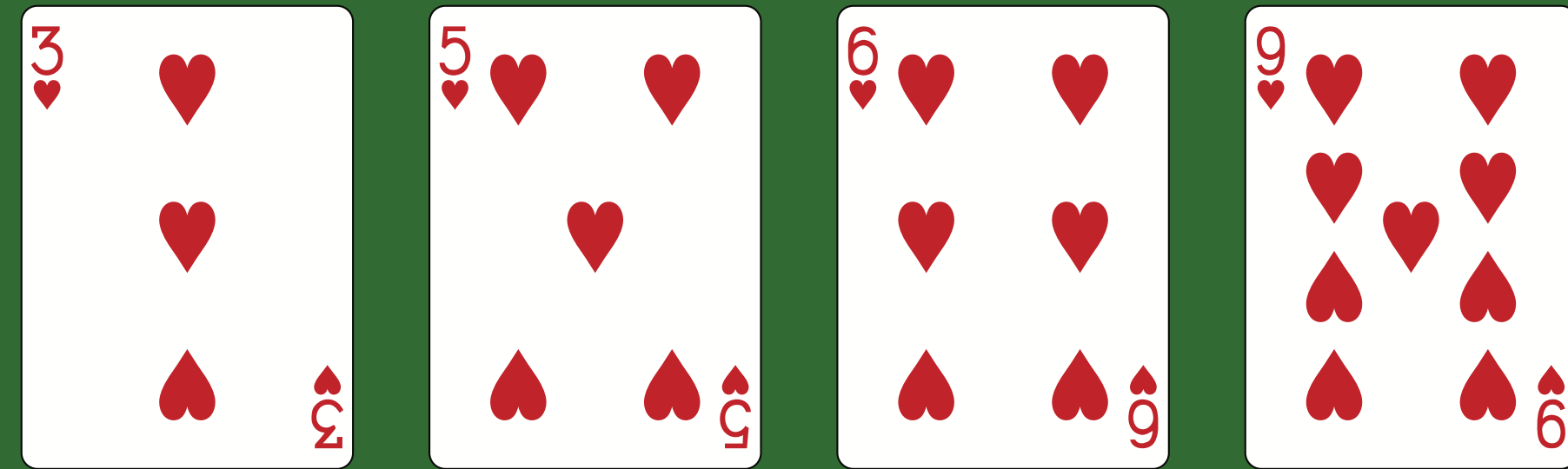
sorted



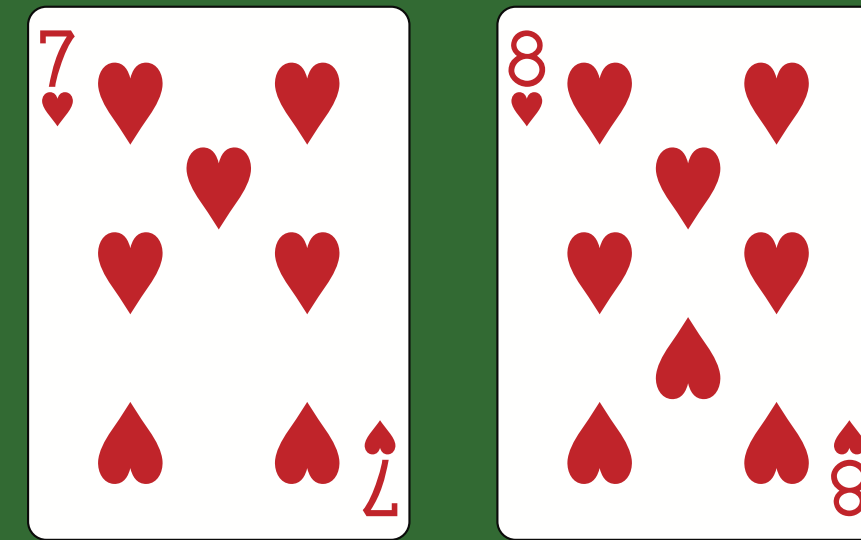
sort the right half

sort the right half

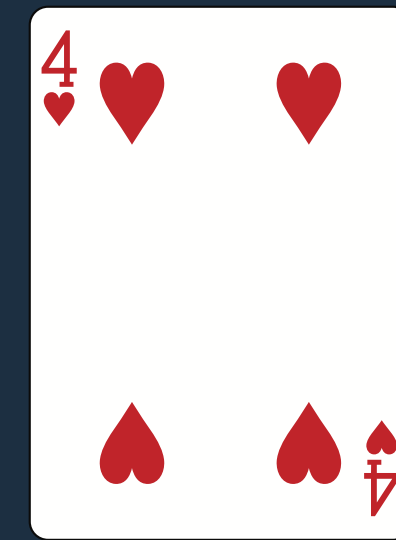
Merge sort



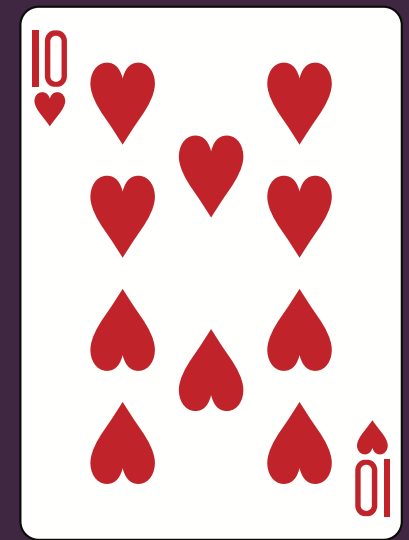
sorted



sorted



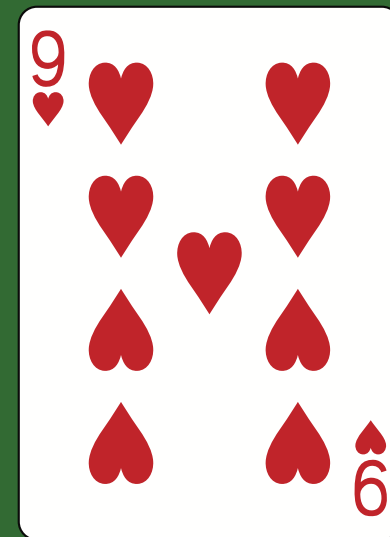
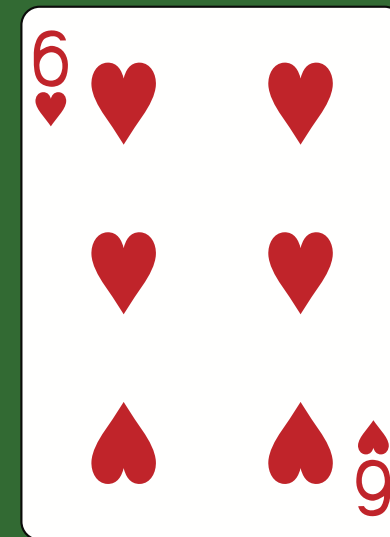
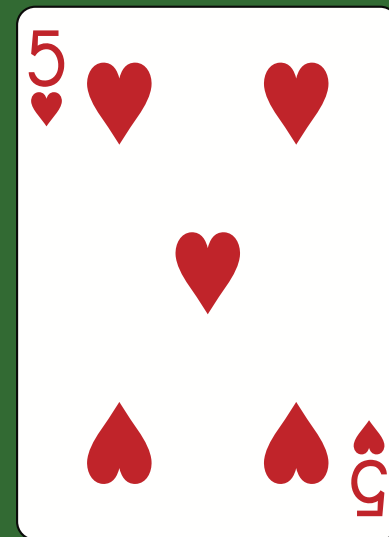
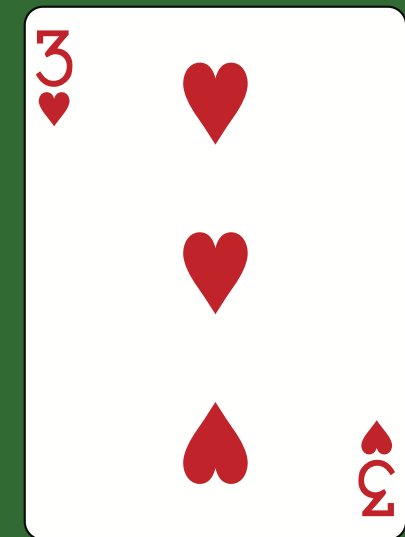
sort



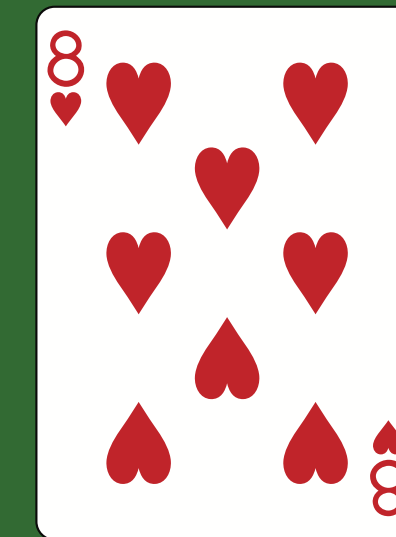
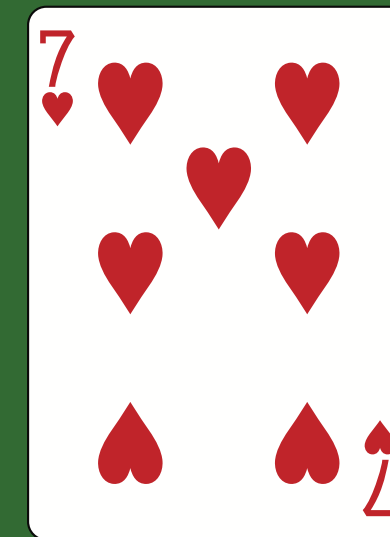
sort the right half

sort the right half

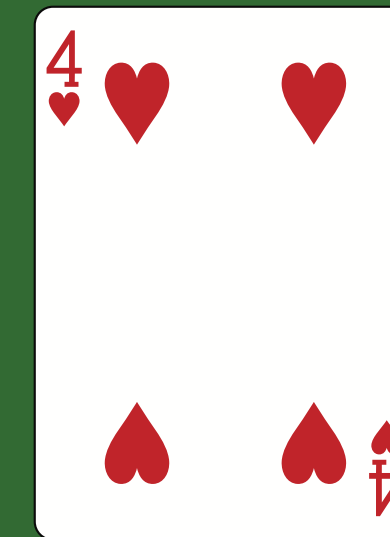
Merge sort



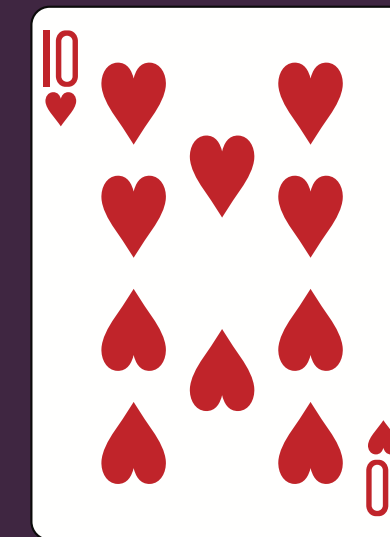
sorted



sorted



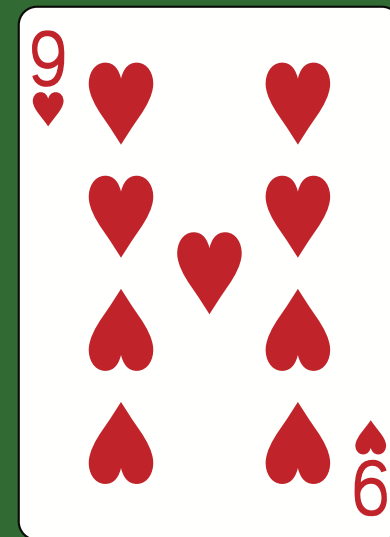
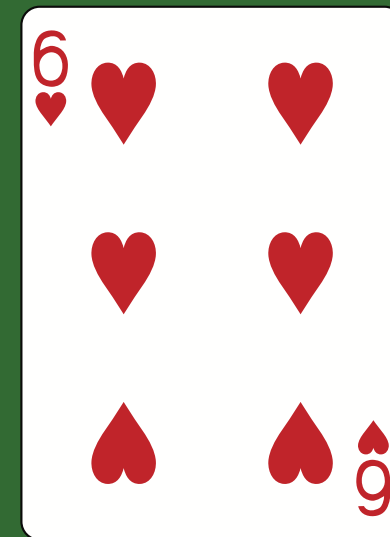
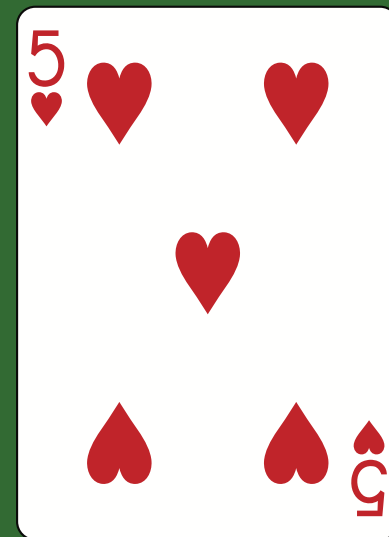
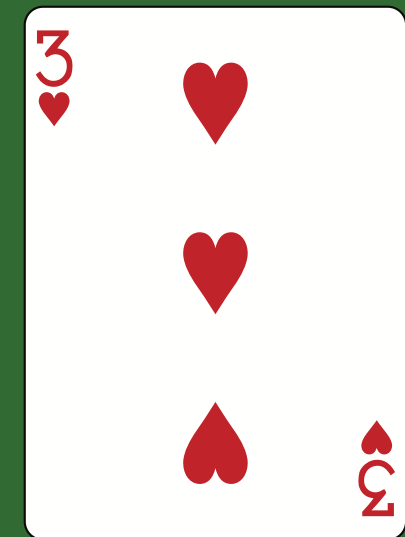
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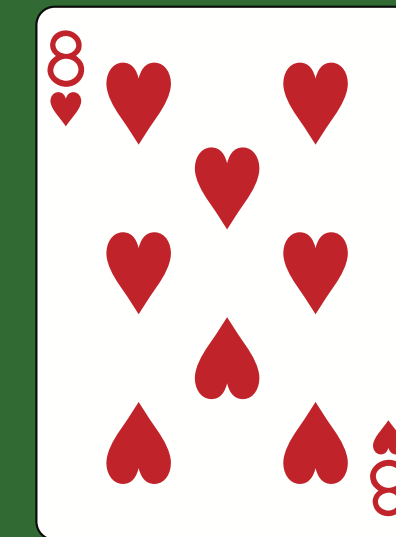
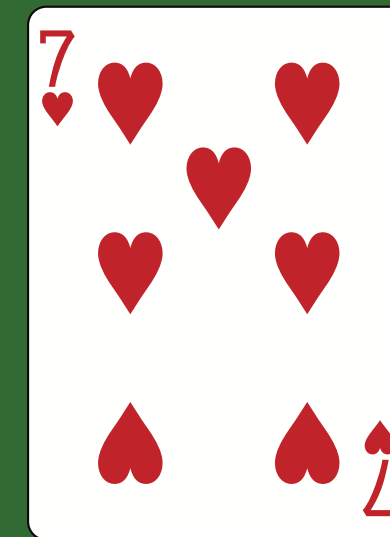
sort the right half

sort the right half

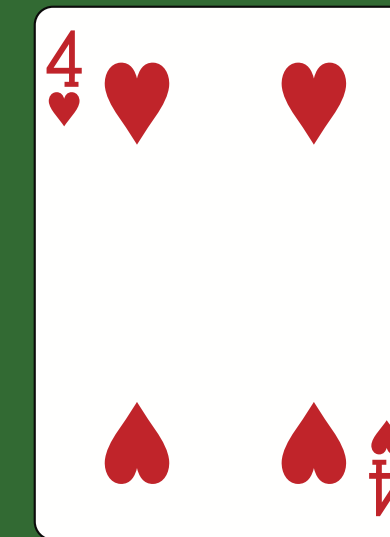
Merge sort



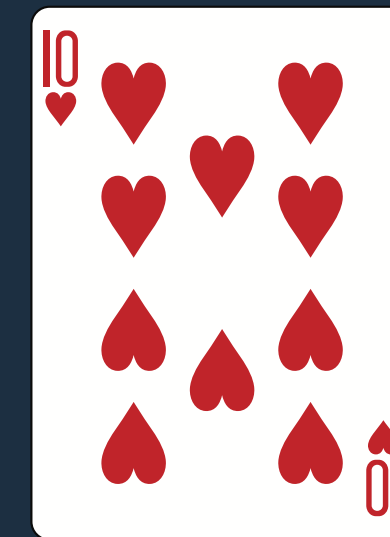
sorted



sorted



sorted

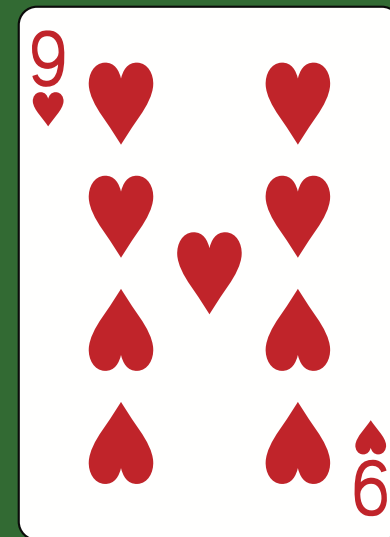
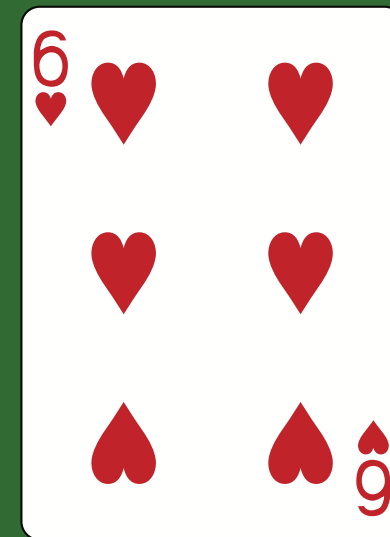
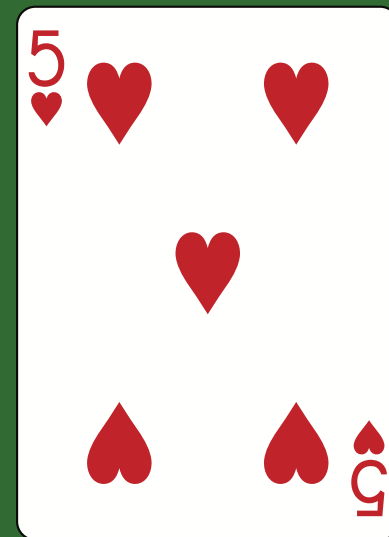
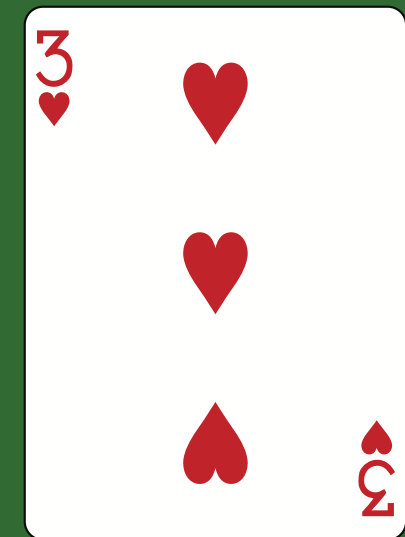


sort

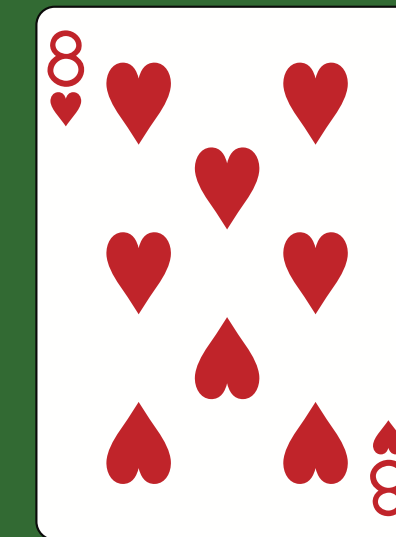
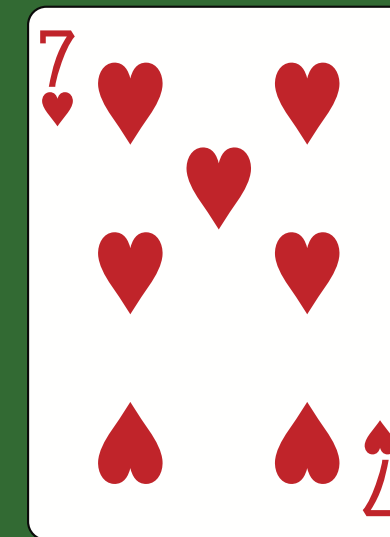
sort the right half

sort the right half

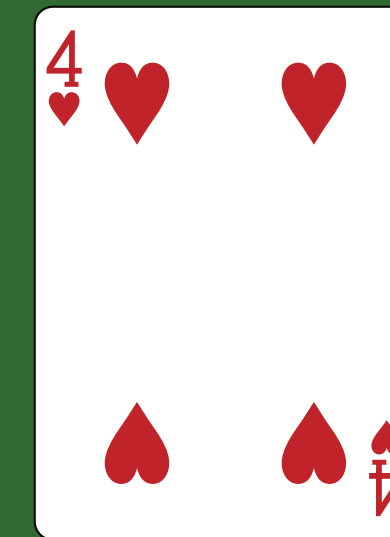
Merge sort



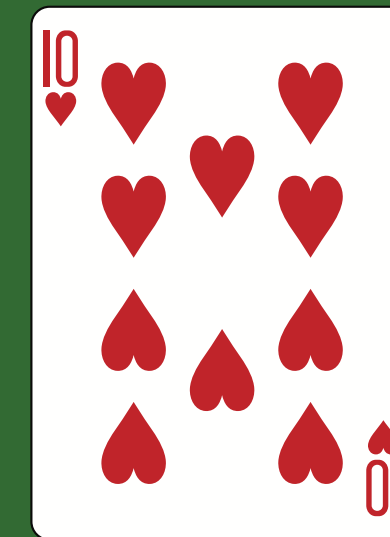
sorted



sorted



sorted

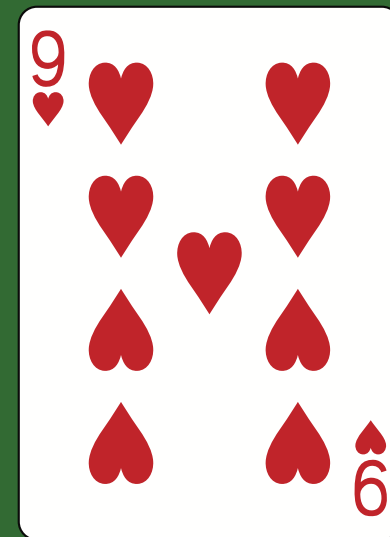
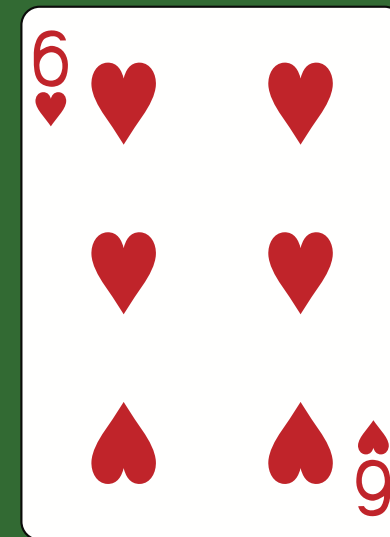
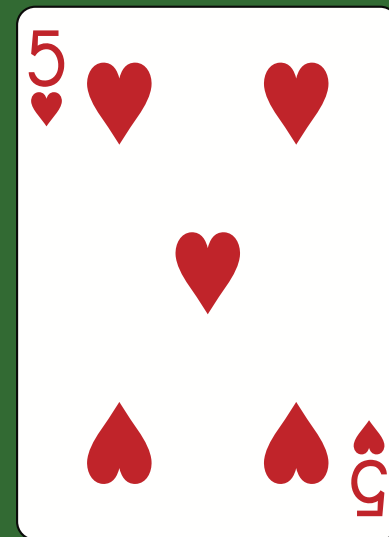
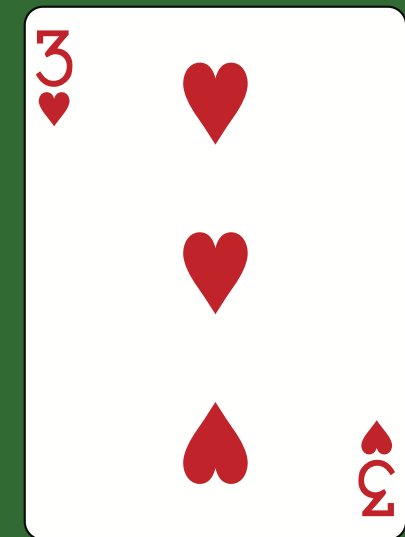


sorted

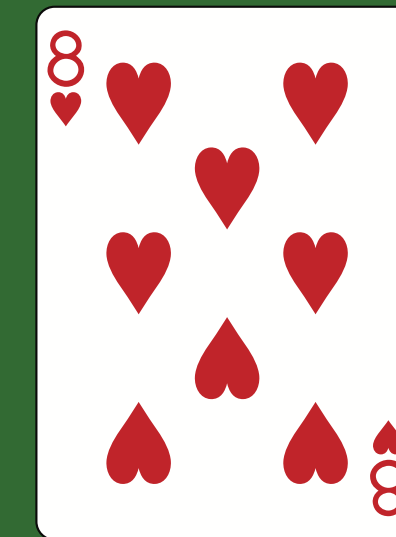
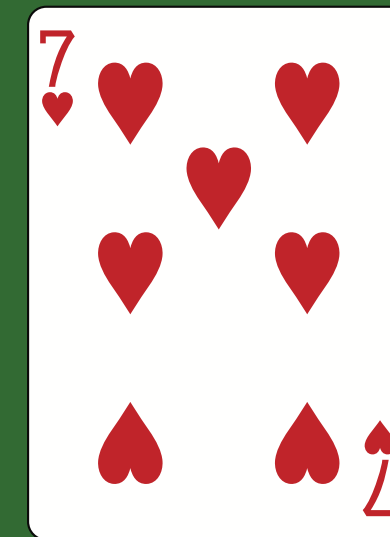
sort the right half

sort the right half

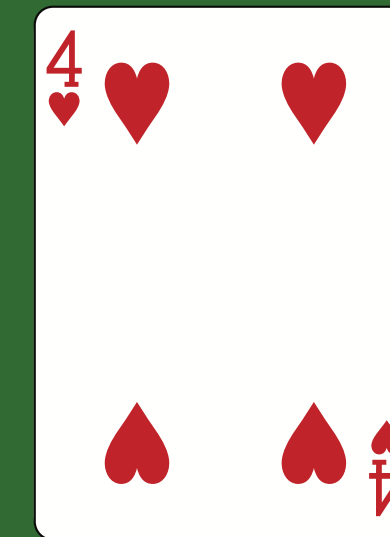
Merge sort



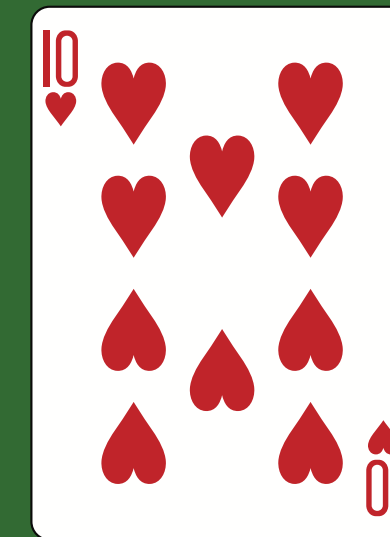
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sorted



sorted



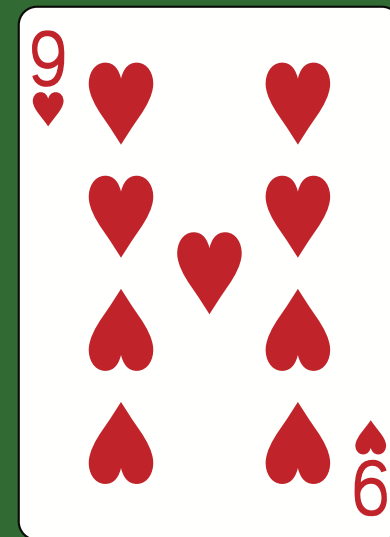
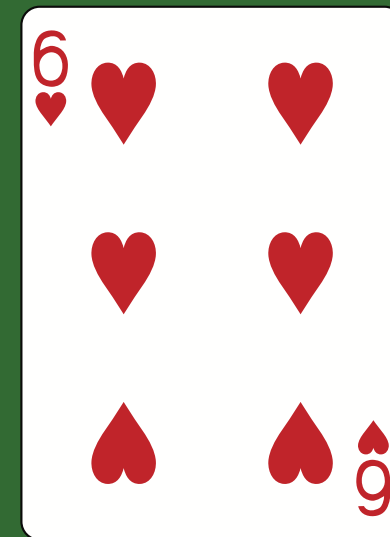
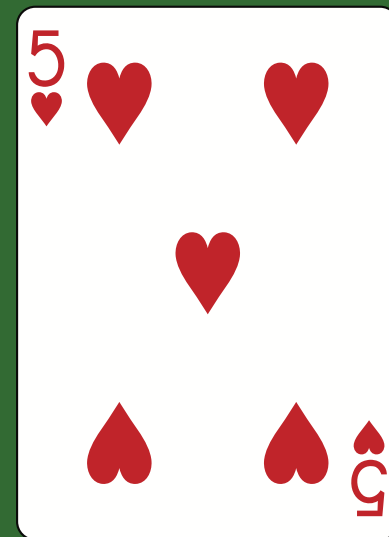
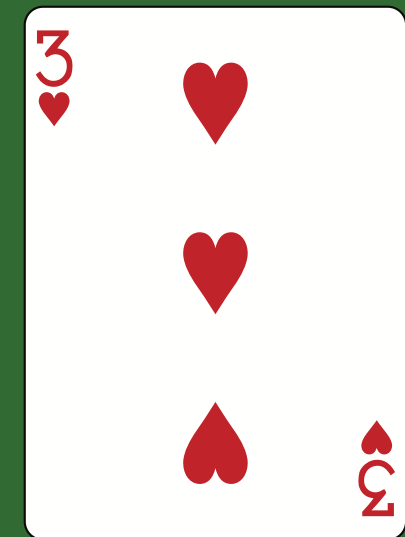
sorted

merge

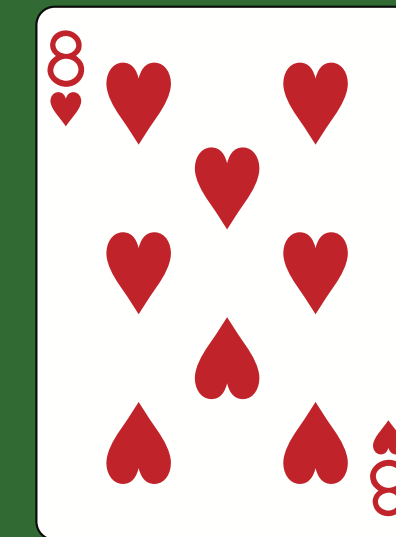
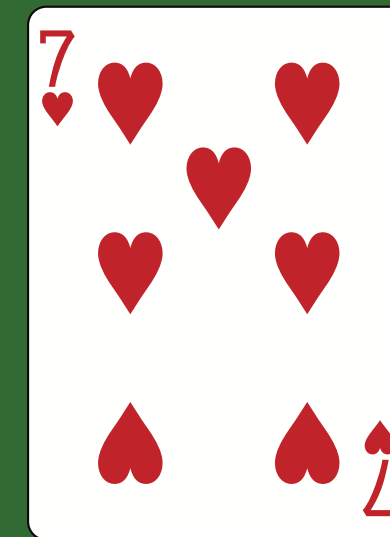
sort the right half

sort the right half

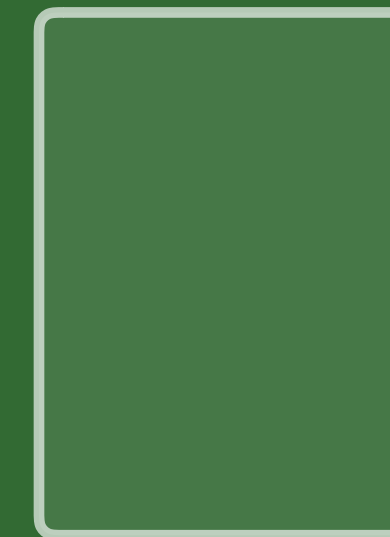
Merge sort



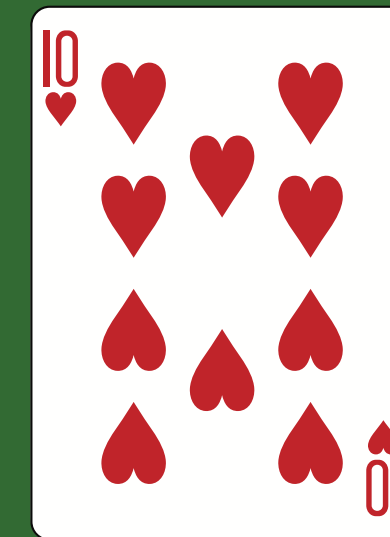
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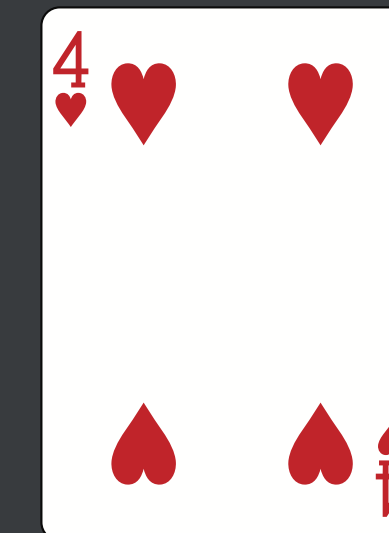
sorted



sorted



sorted

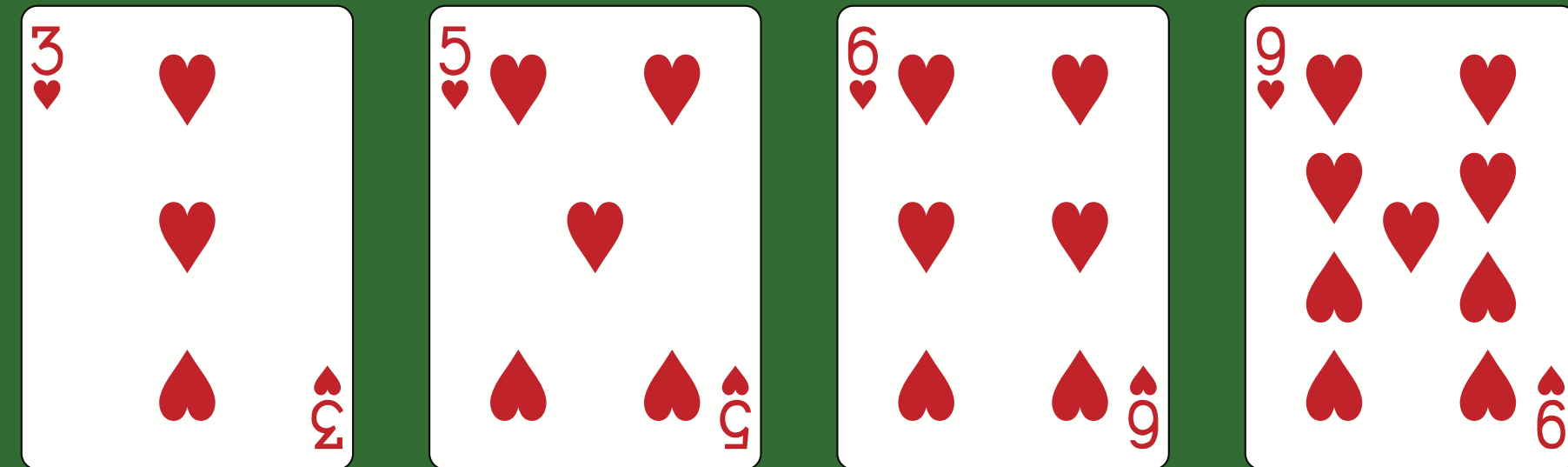


merge

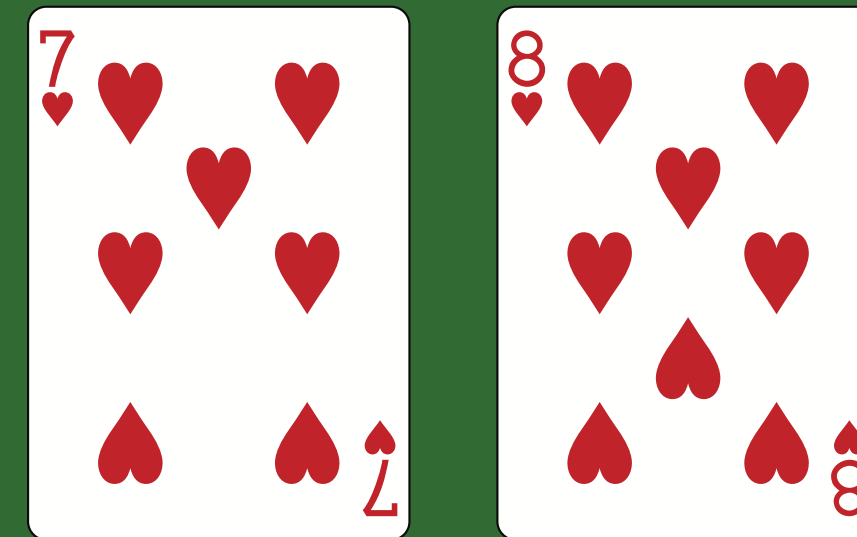
sort the right half

sort the right half

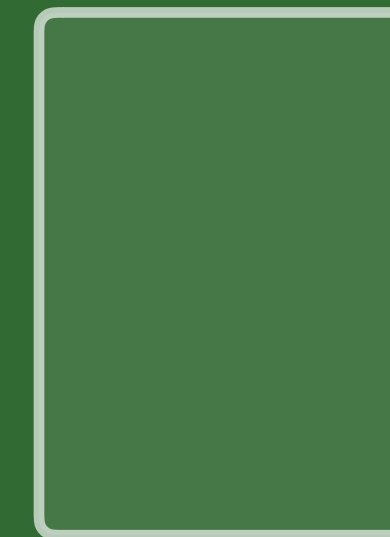
Merge sort



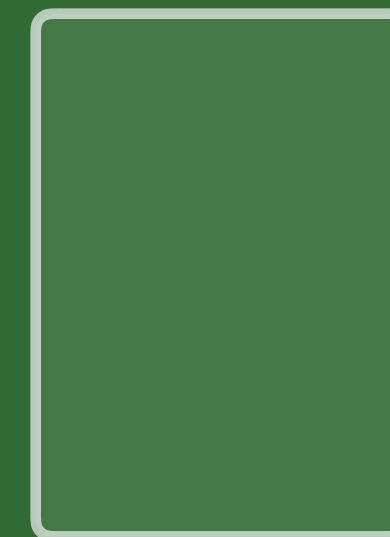
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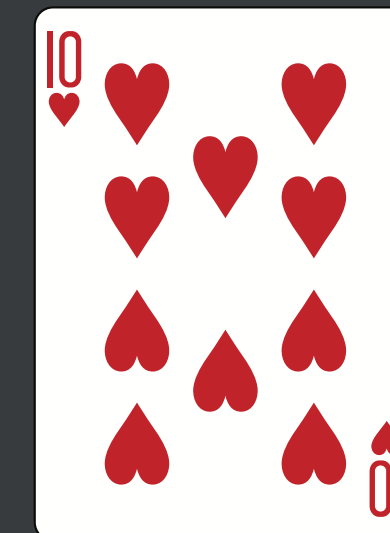
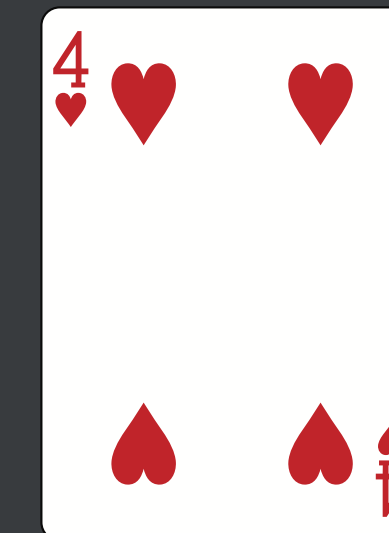
sorted



sorted



sorted

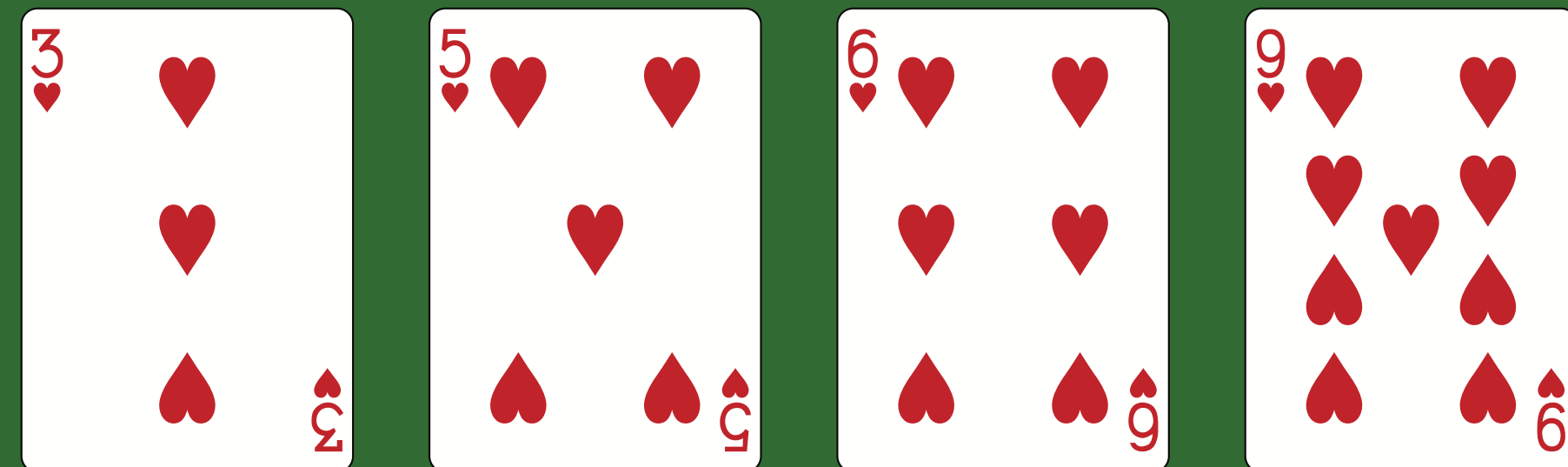


merge

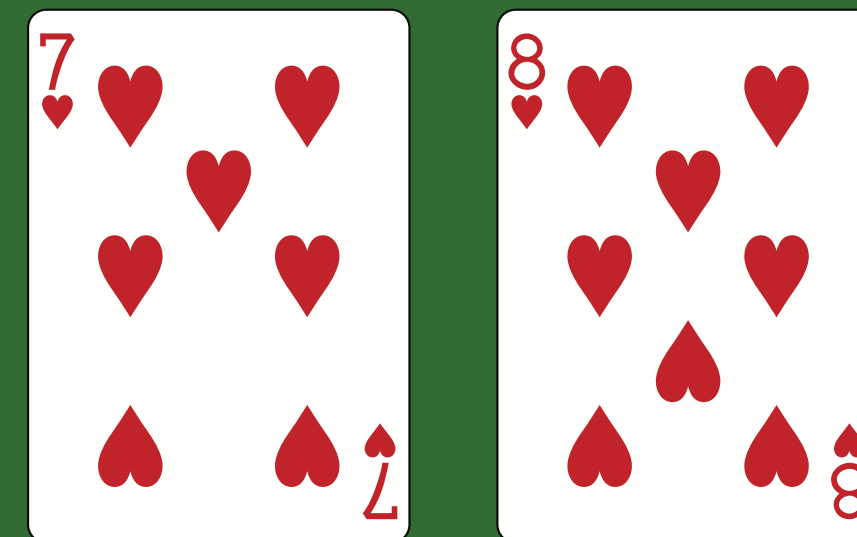
sort the right half

sort the right half

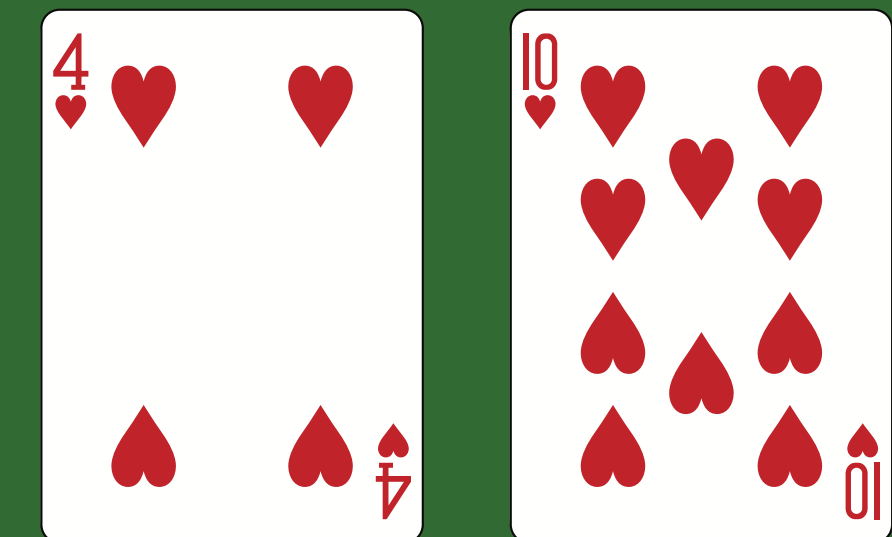
Merge sort



sorted



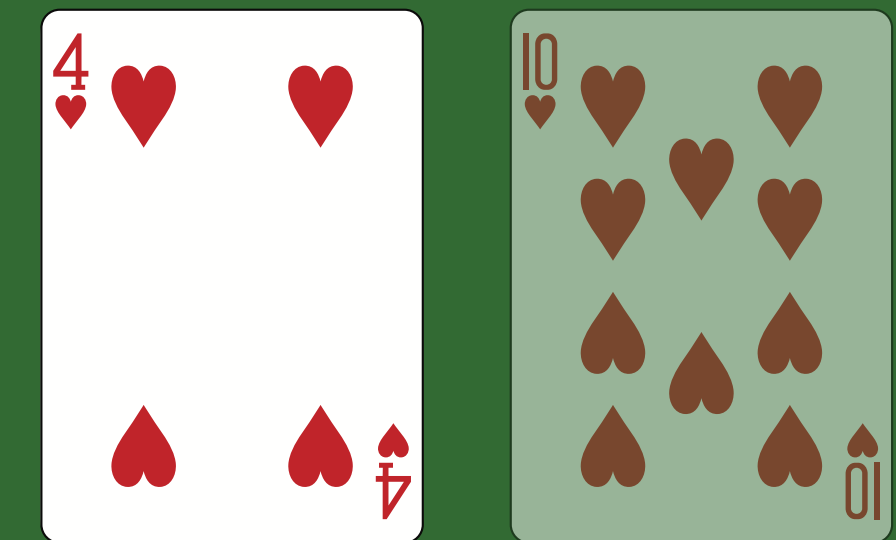
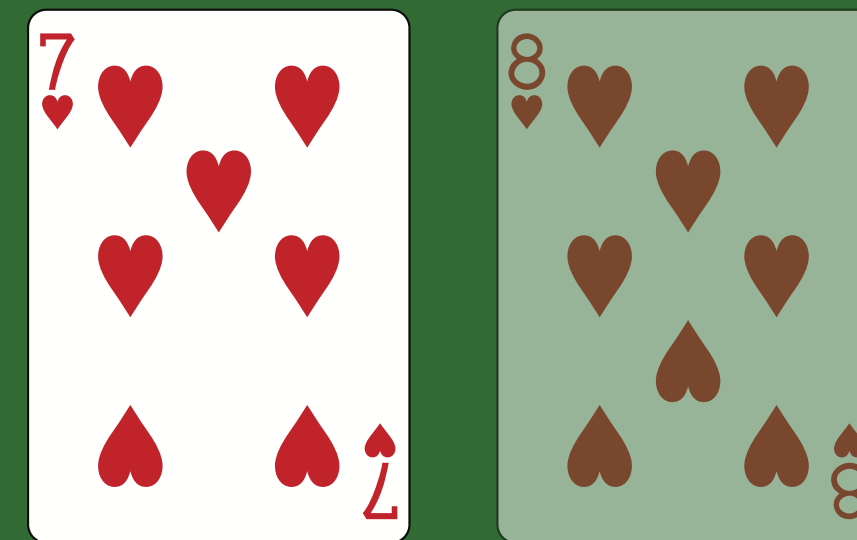
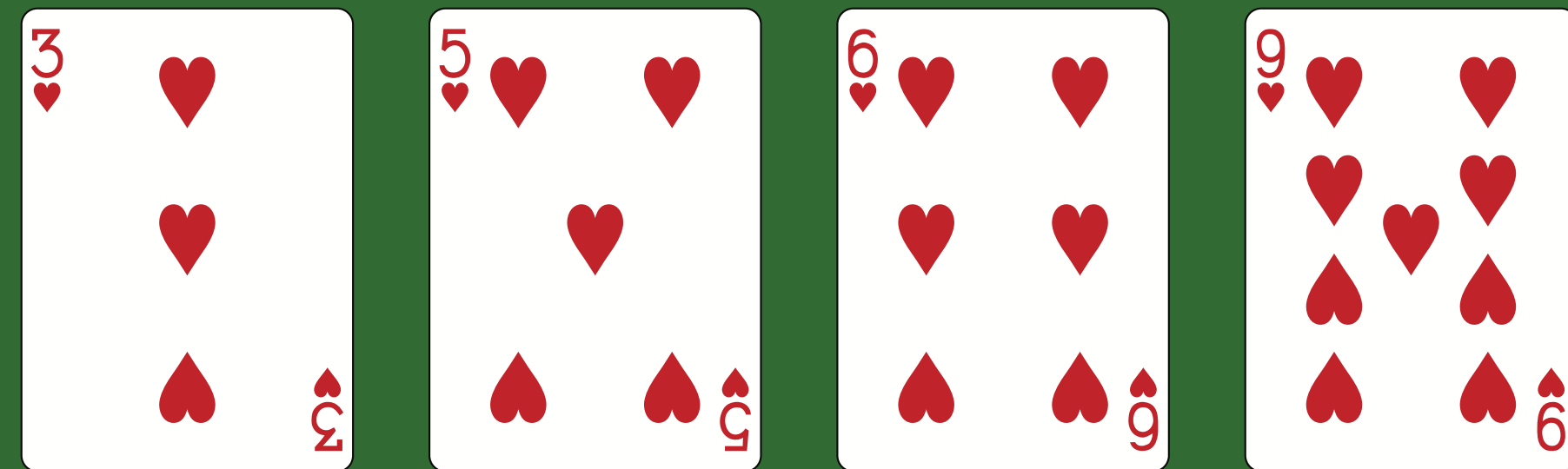
sorted



sorted

sort the right half

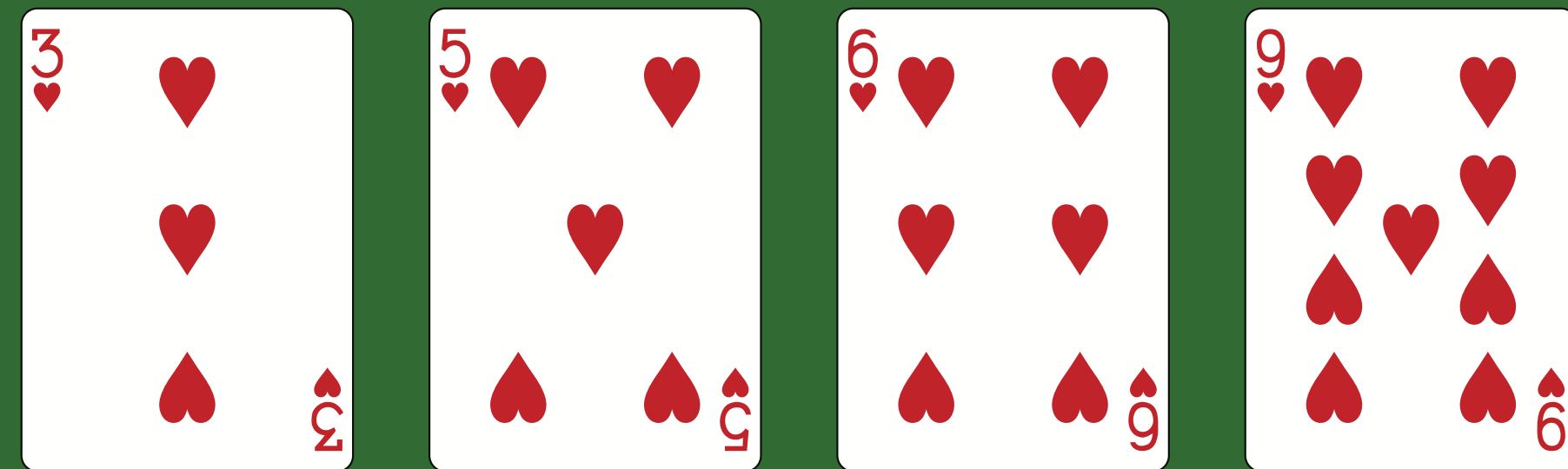
Merge sort



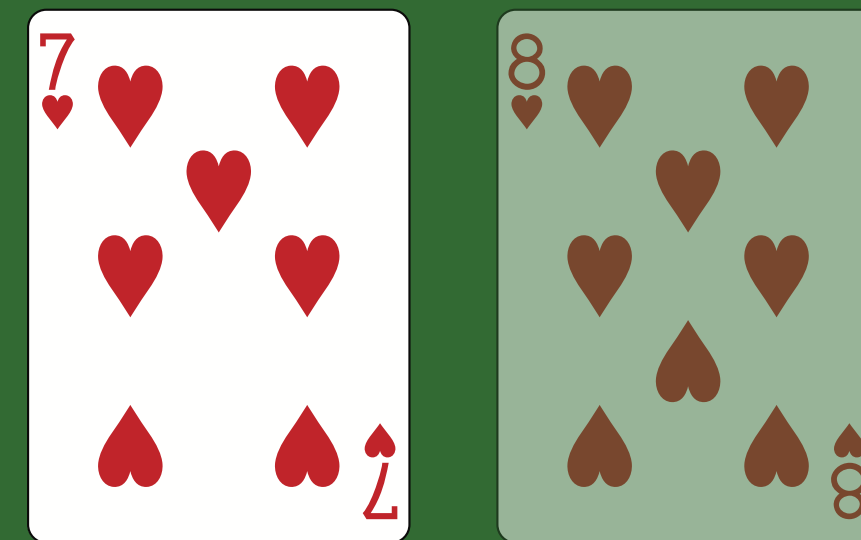
merge

sort the right half

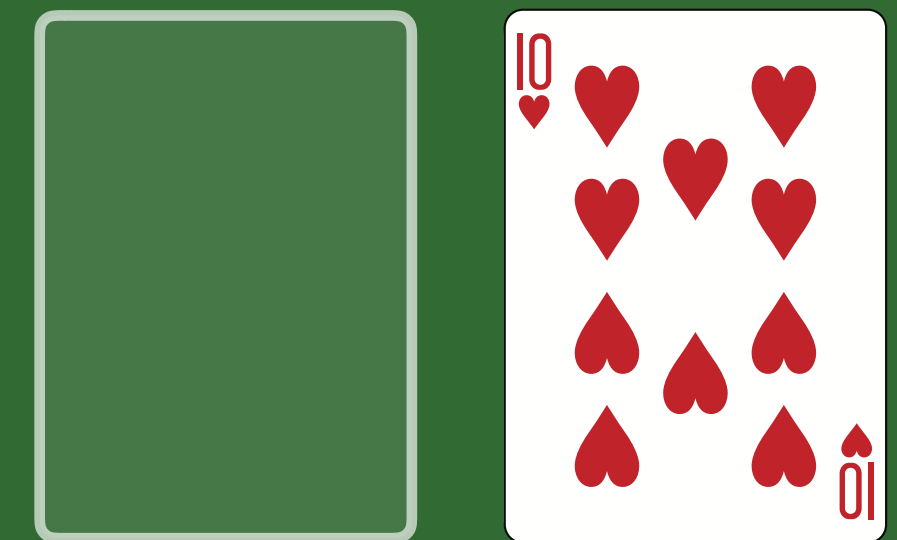
Merge sort



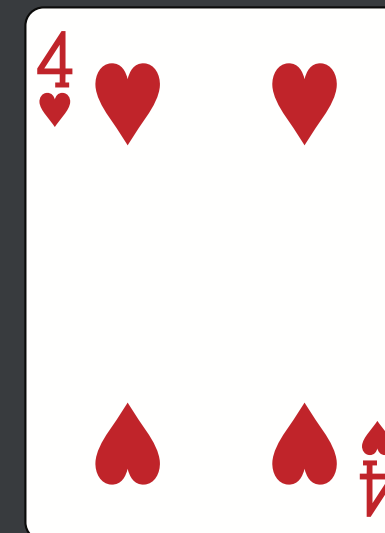
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sorted



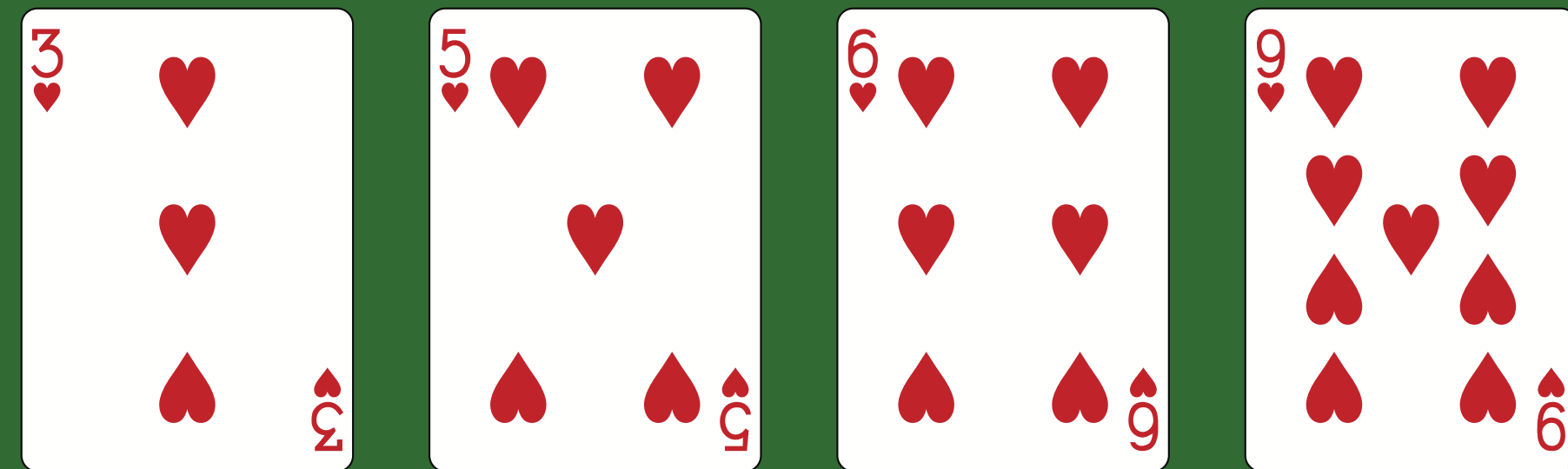
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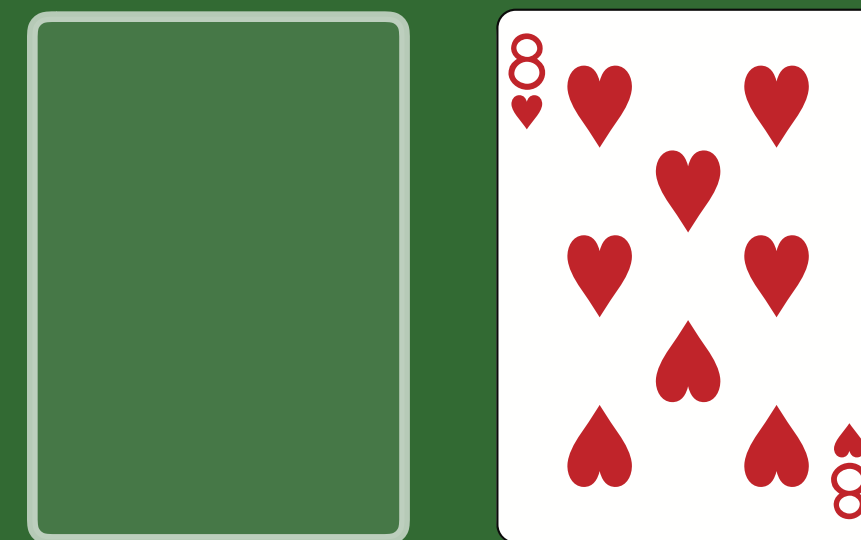
merge

sort the right half

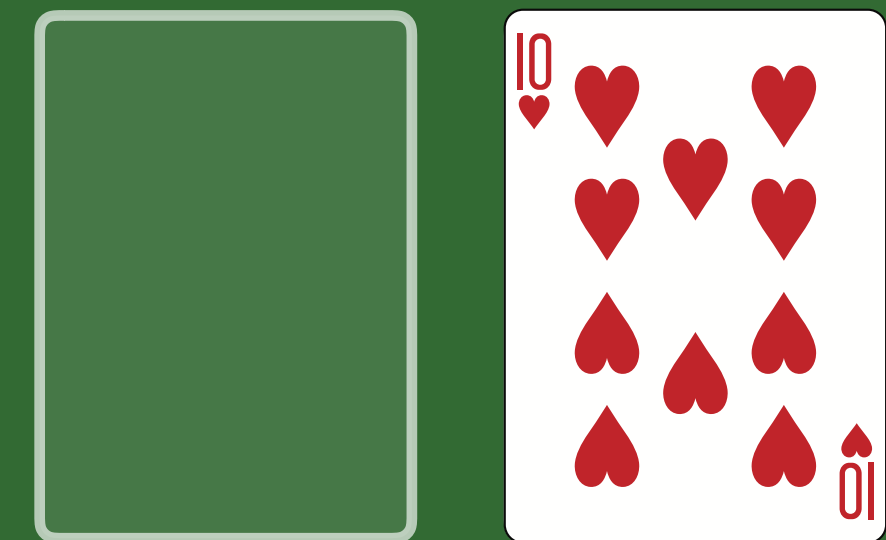
Merge sort



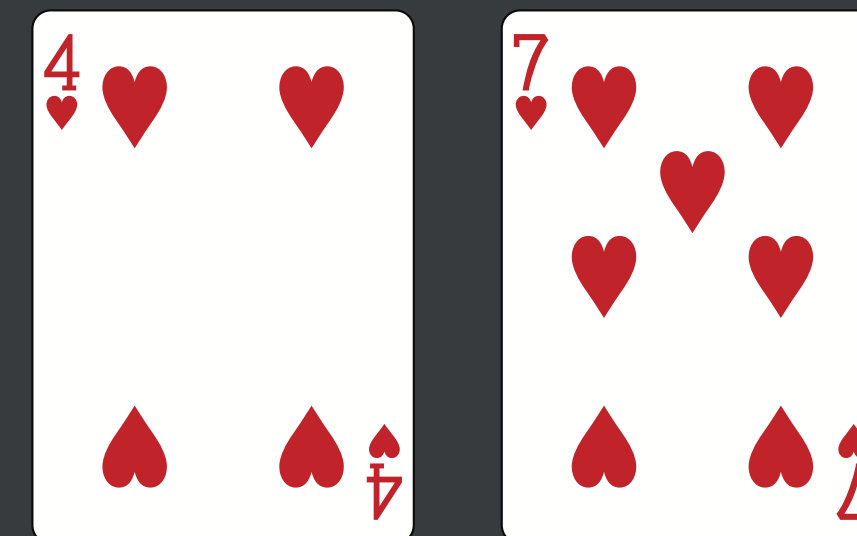
sorted



sorted



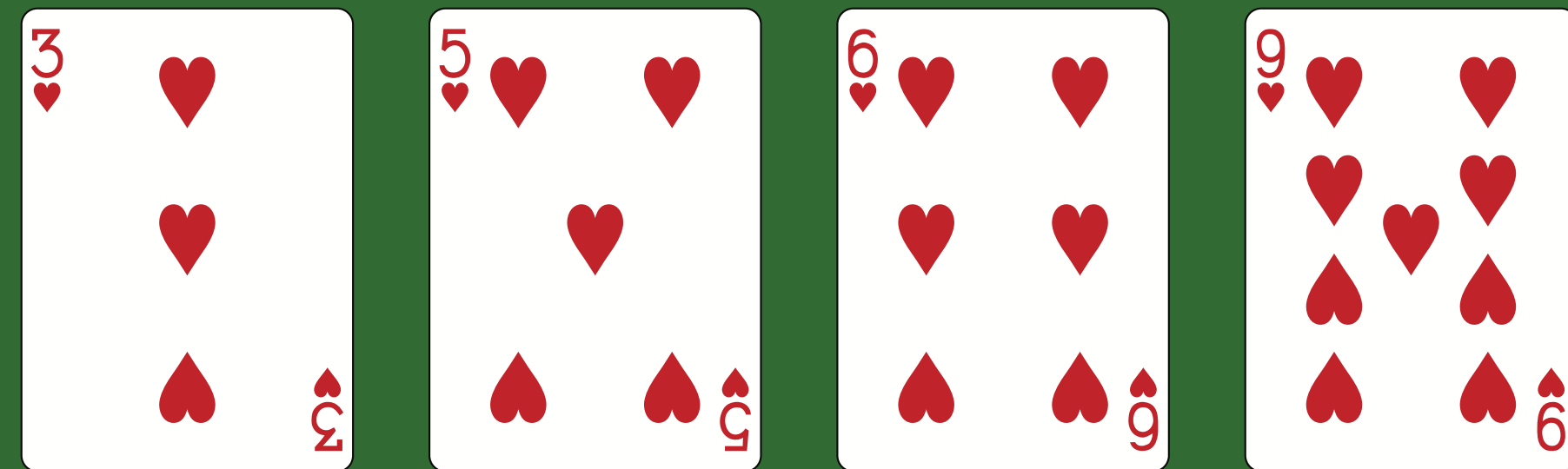
sorted



merge

sort the right half

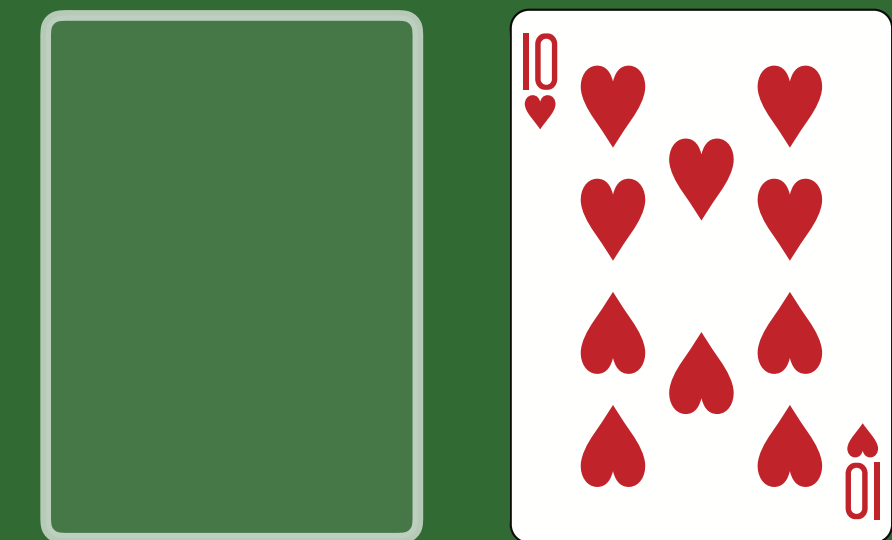
Merge sort



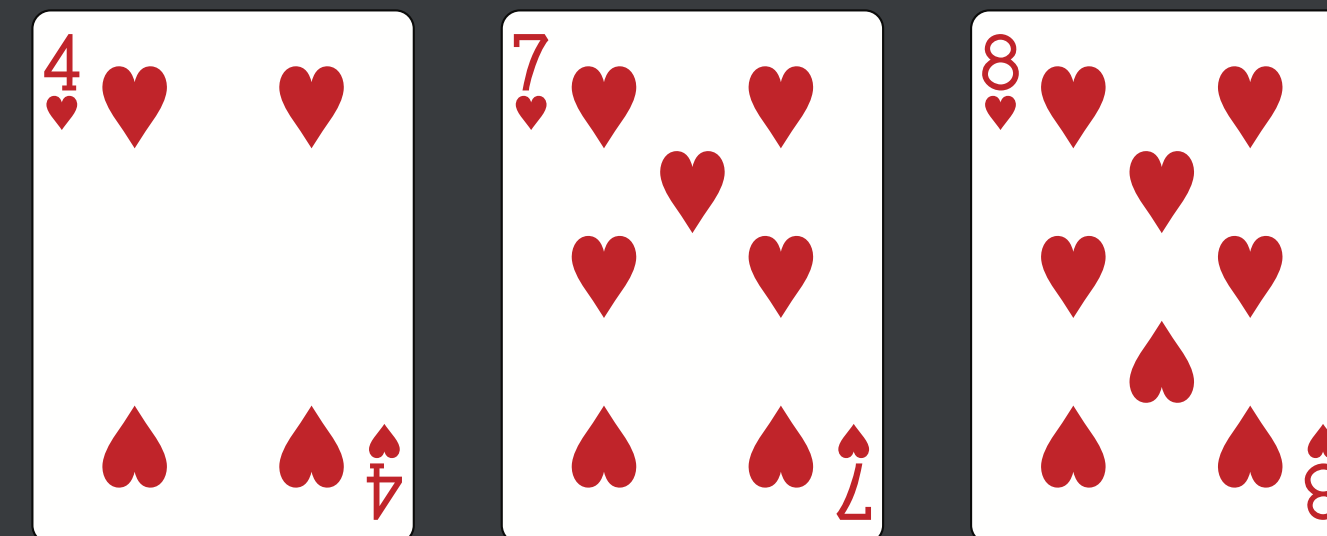
sorted



sorted



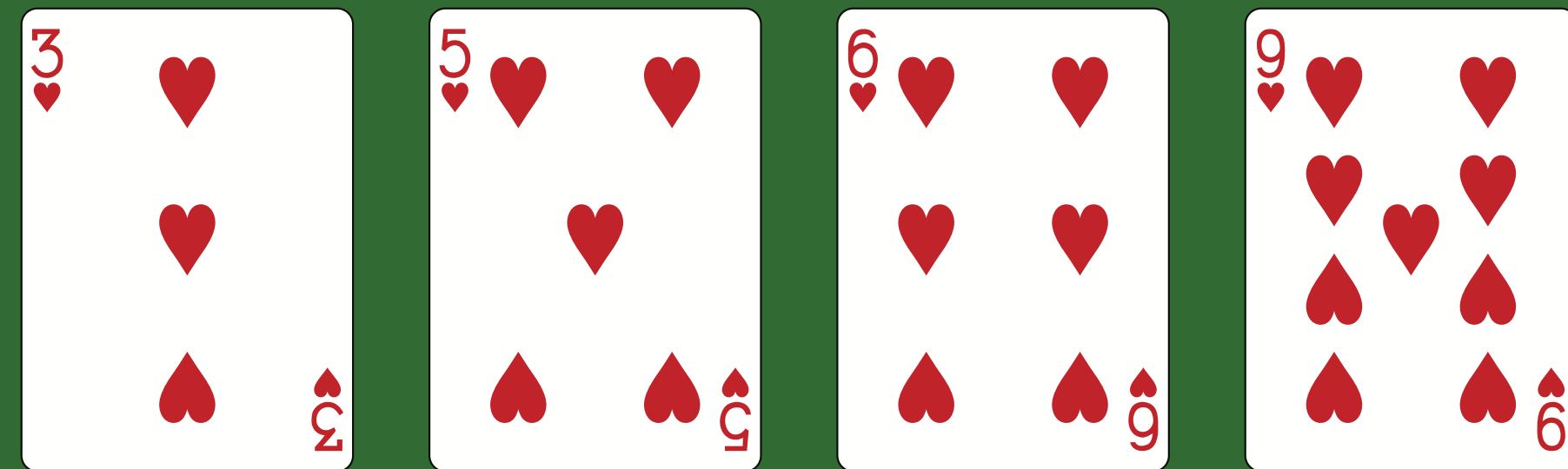
sorted



merge

sort the right half

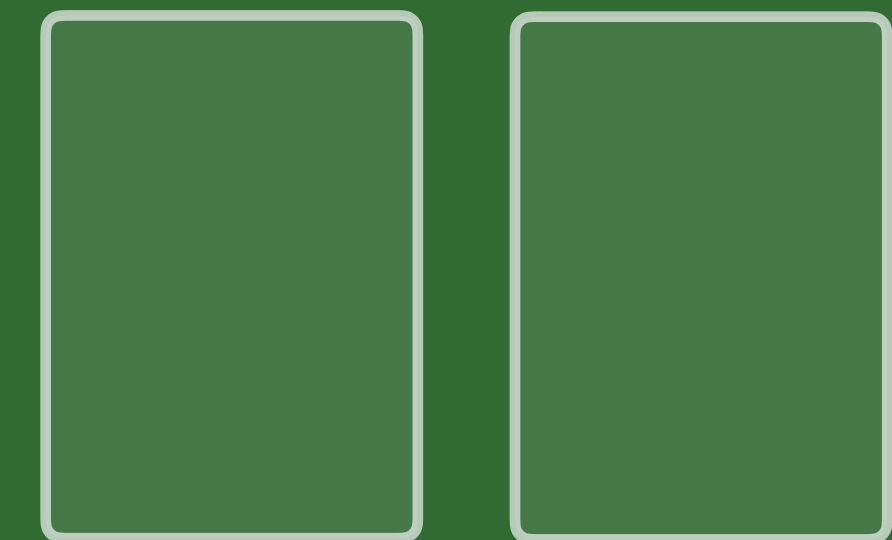
Merge sort



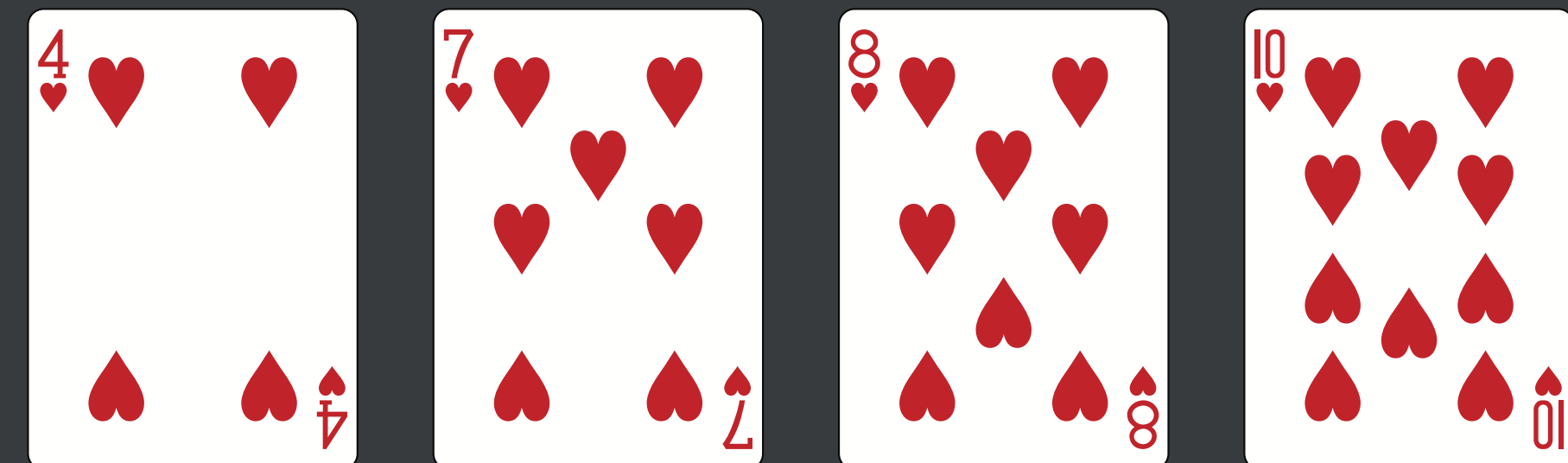
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sorted



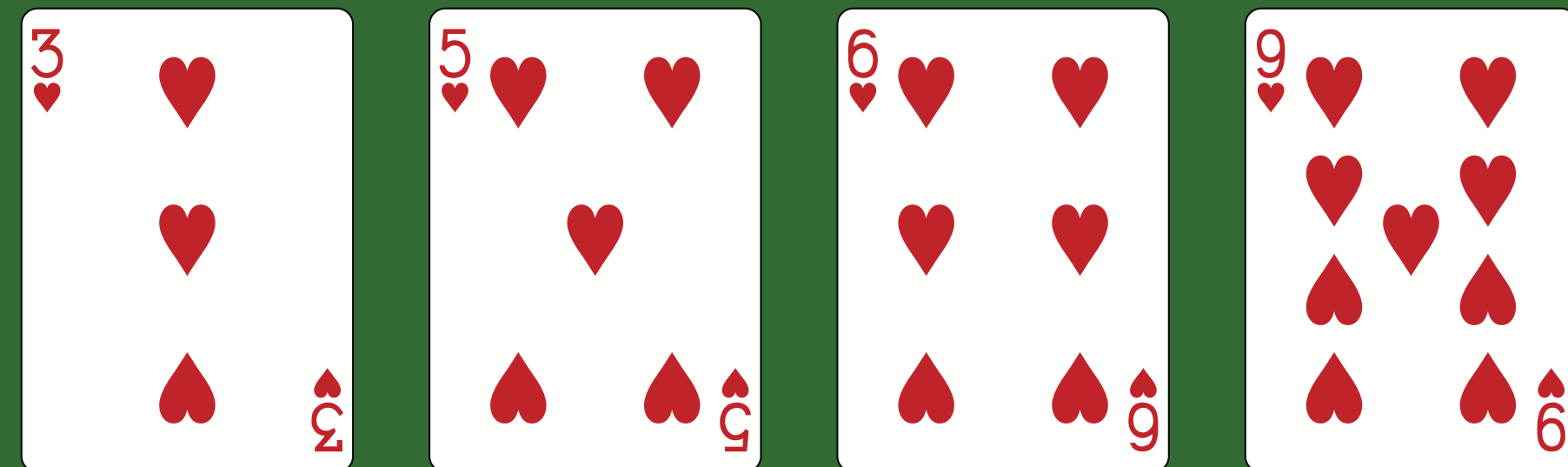
sorted



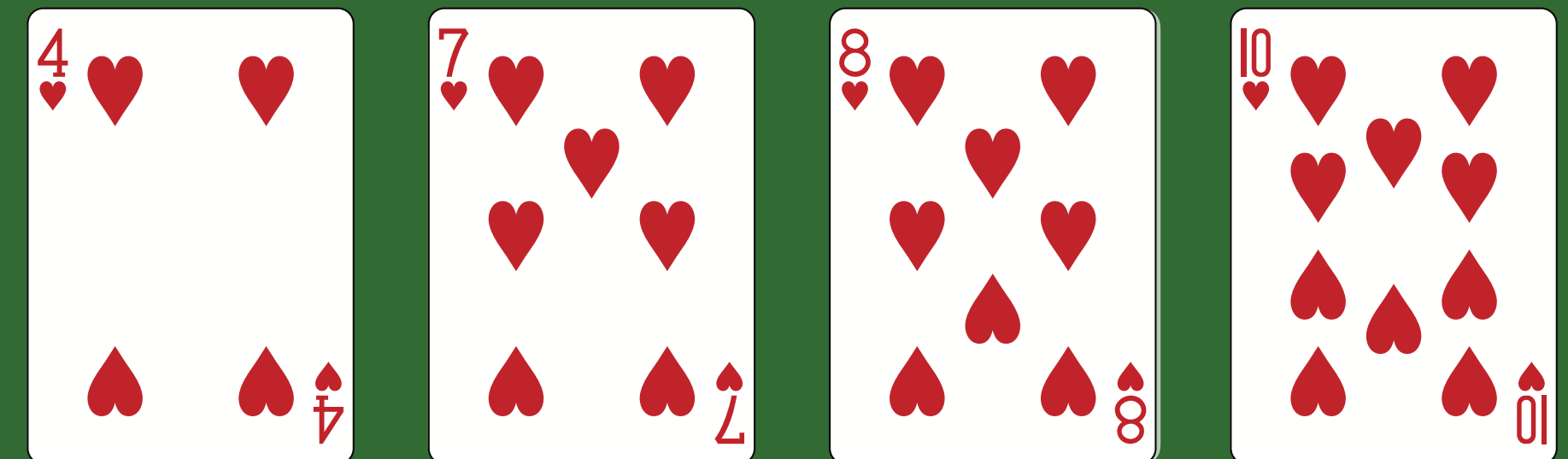
merge

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Merge sort

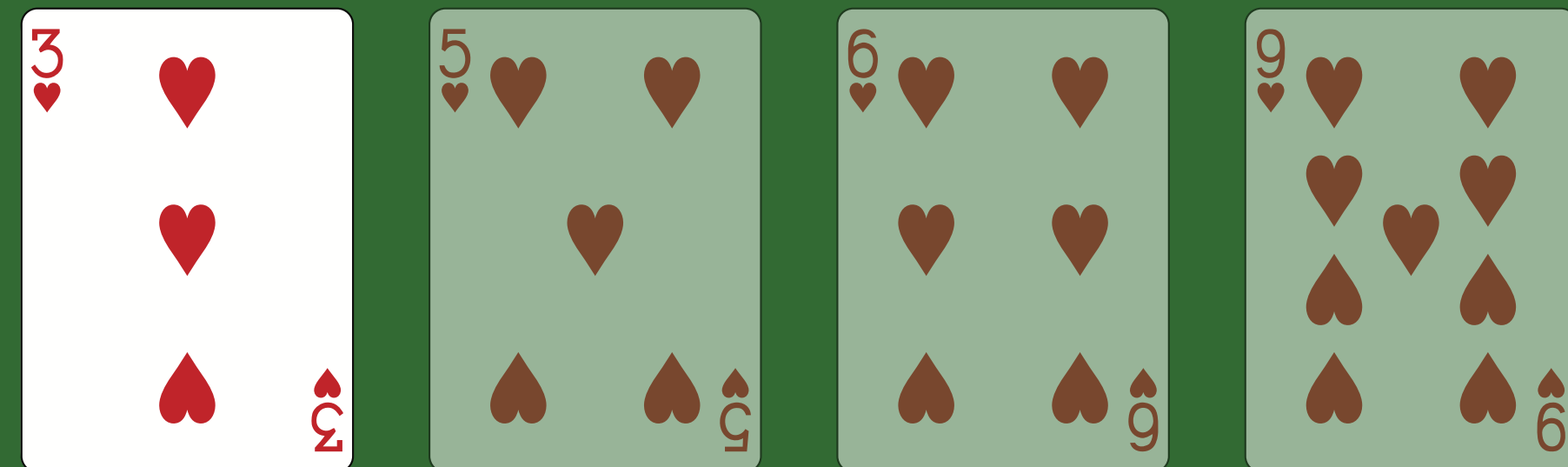


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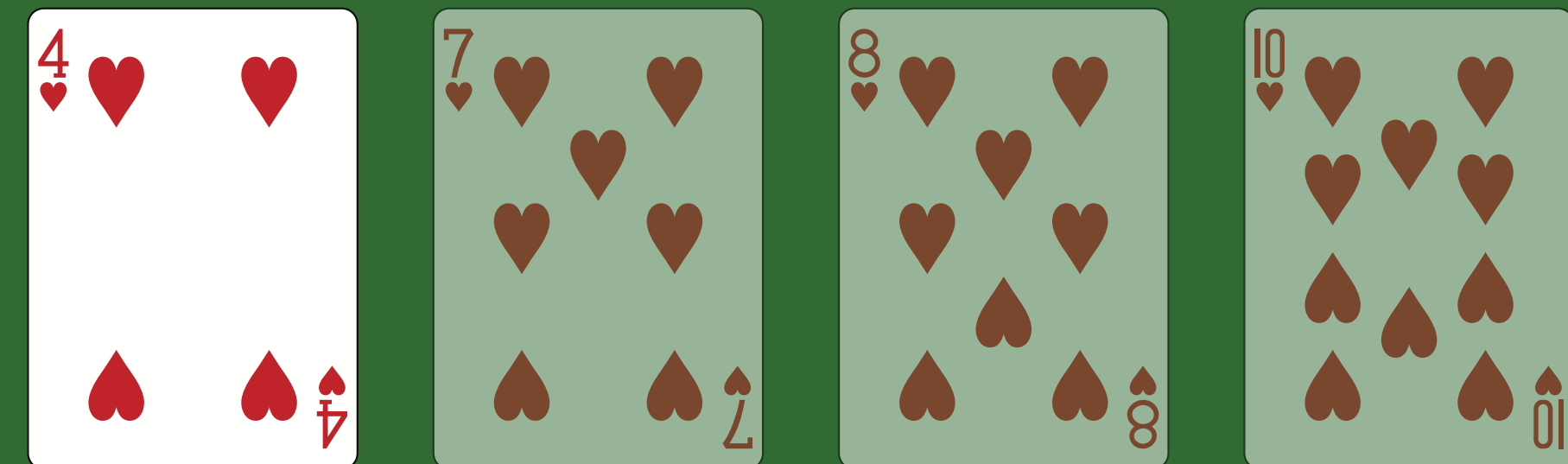


sorted

Merge sort



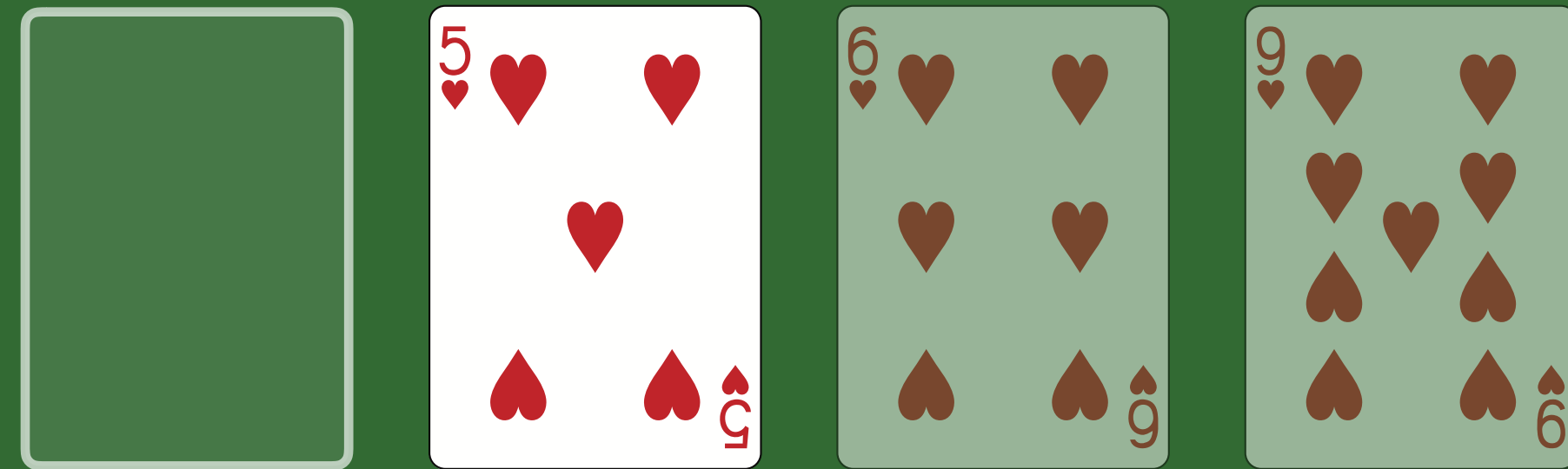
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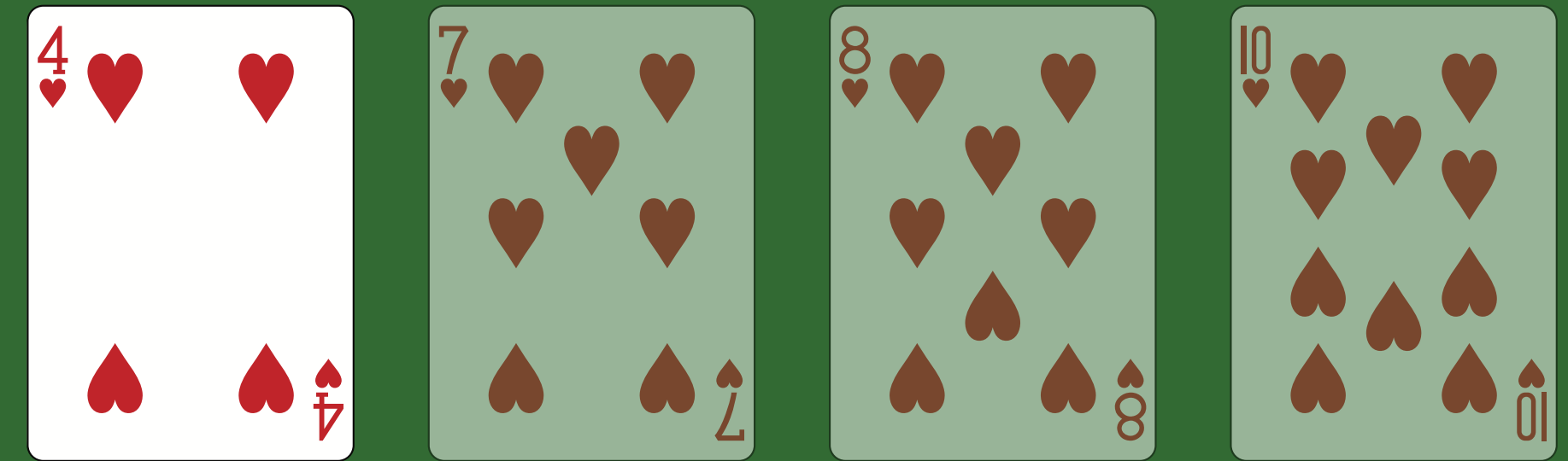
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merge

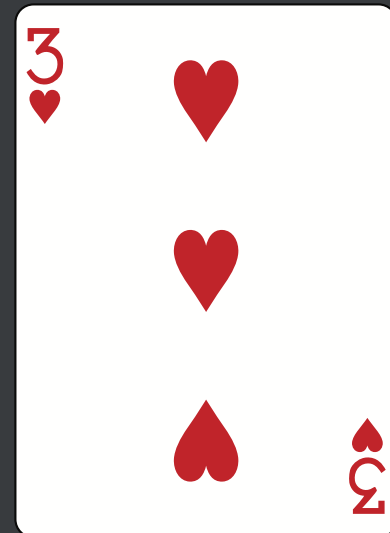
Merge sort



sorted

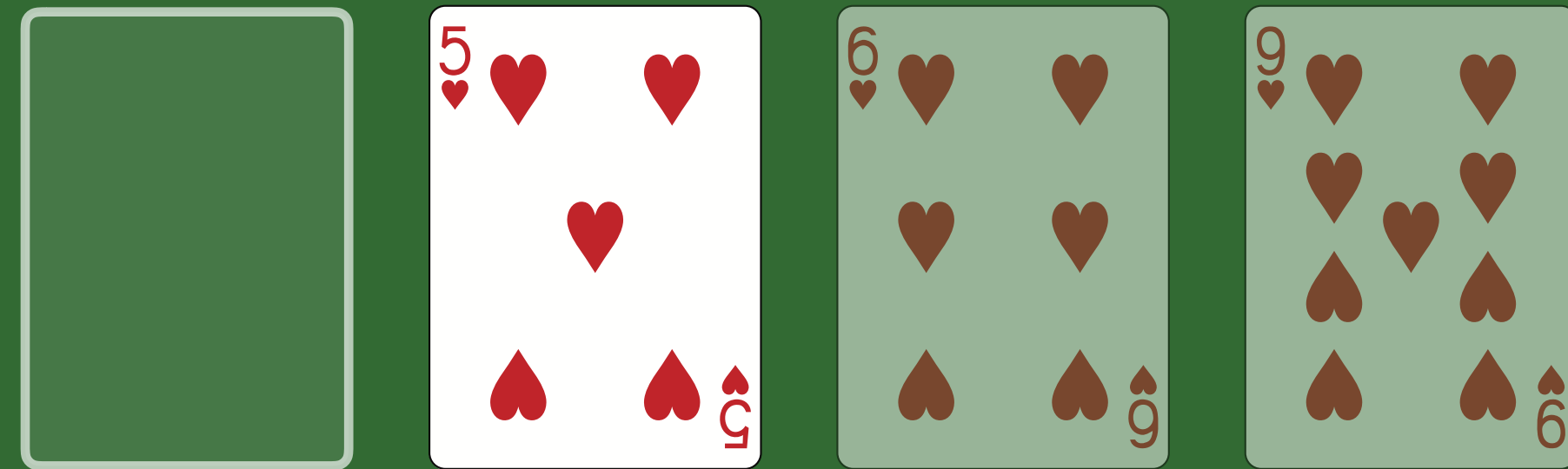


sorted

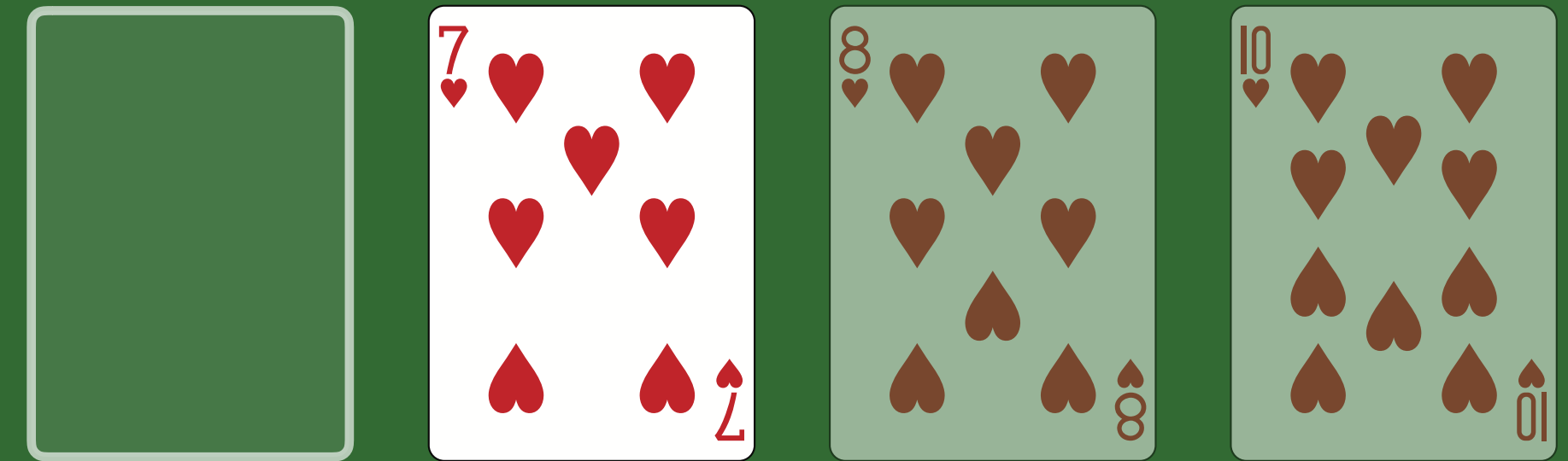


merge

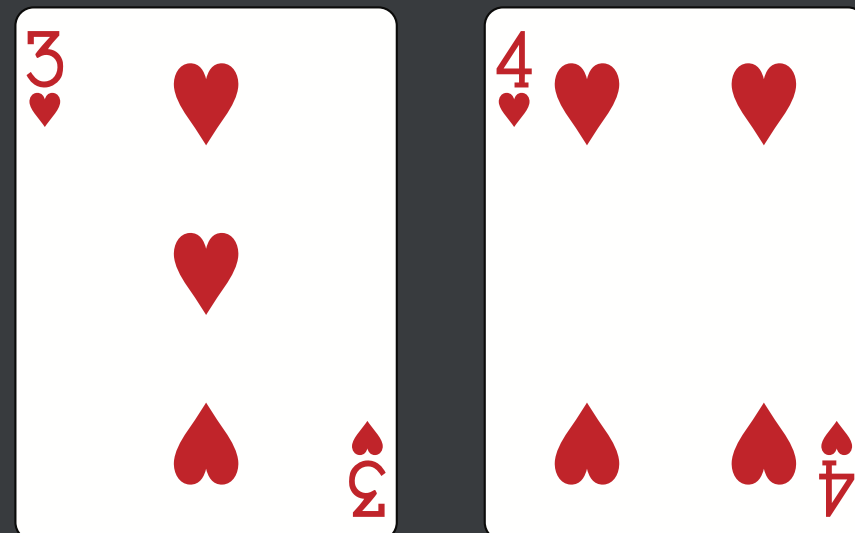
Merge sort



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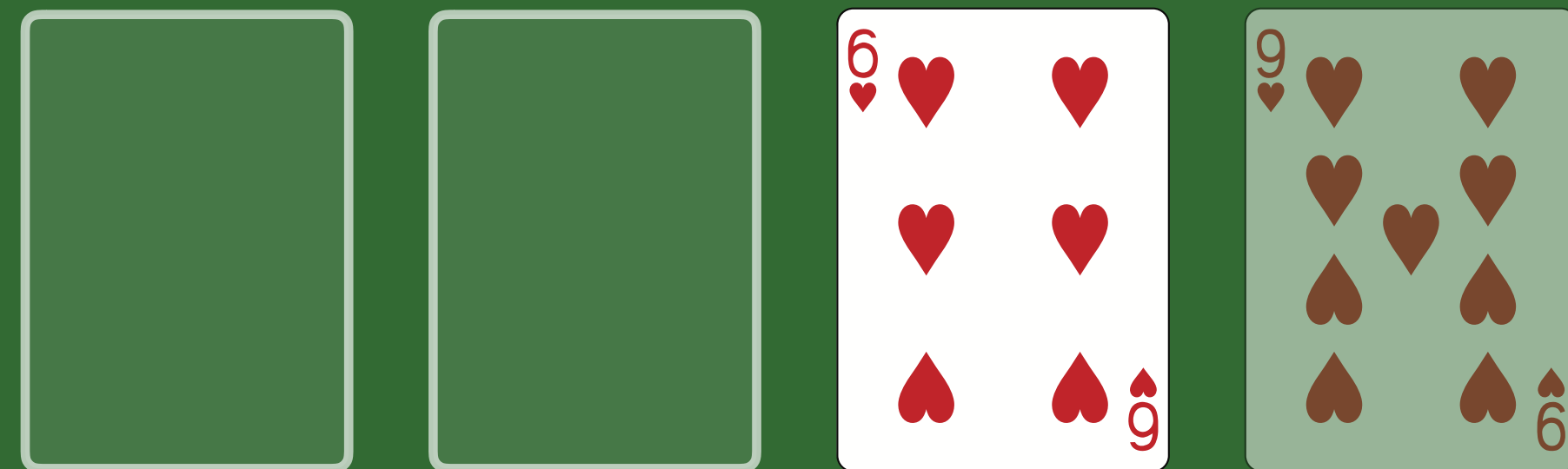


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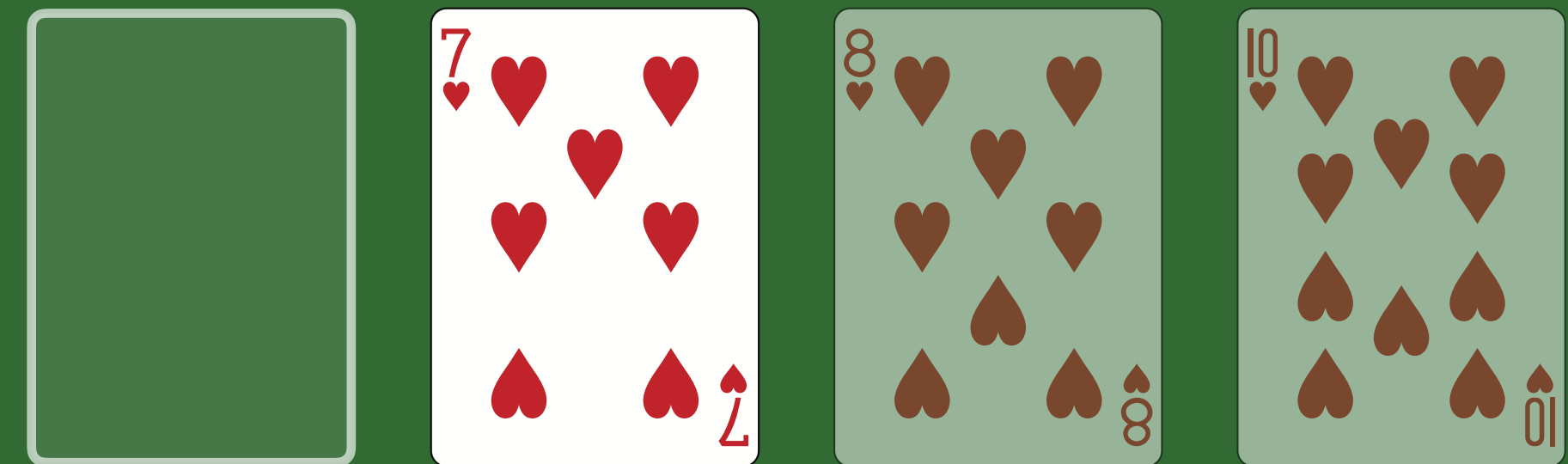


merge

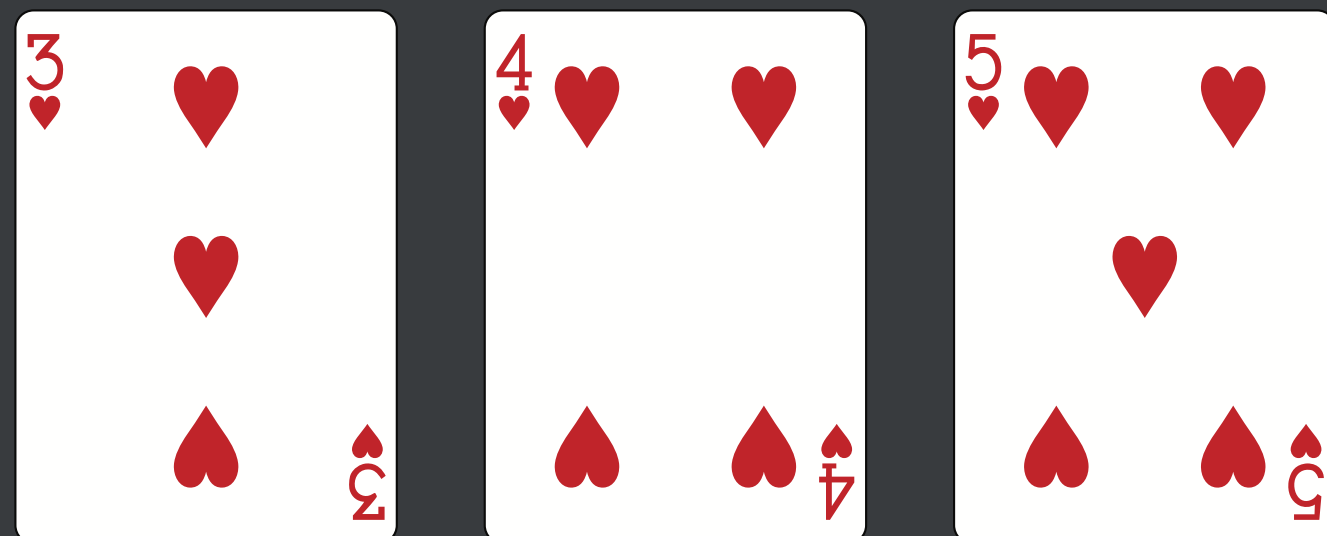
Merge sort



sorted

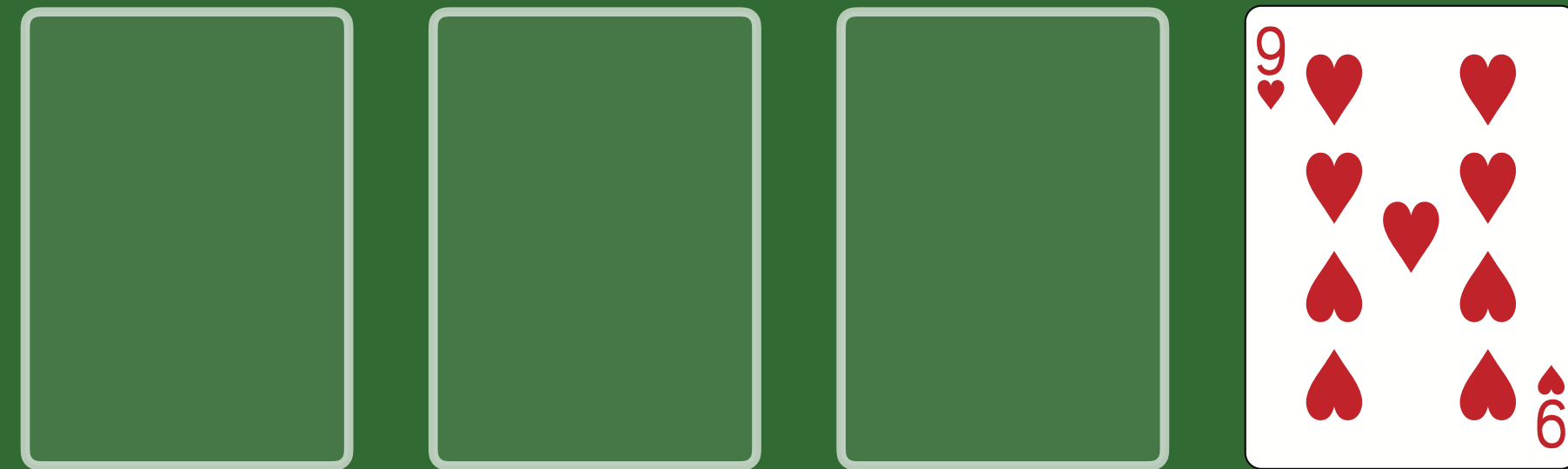


sorted

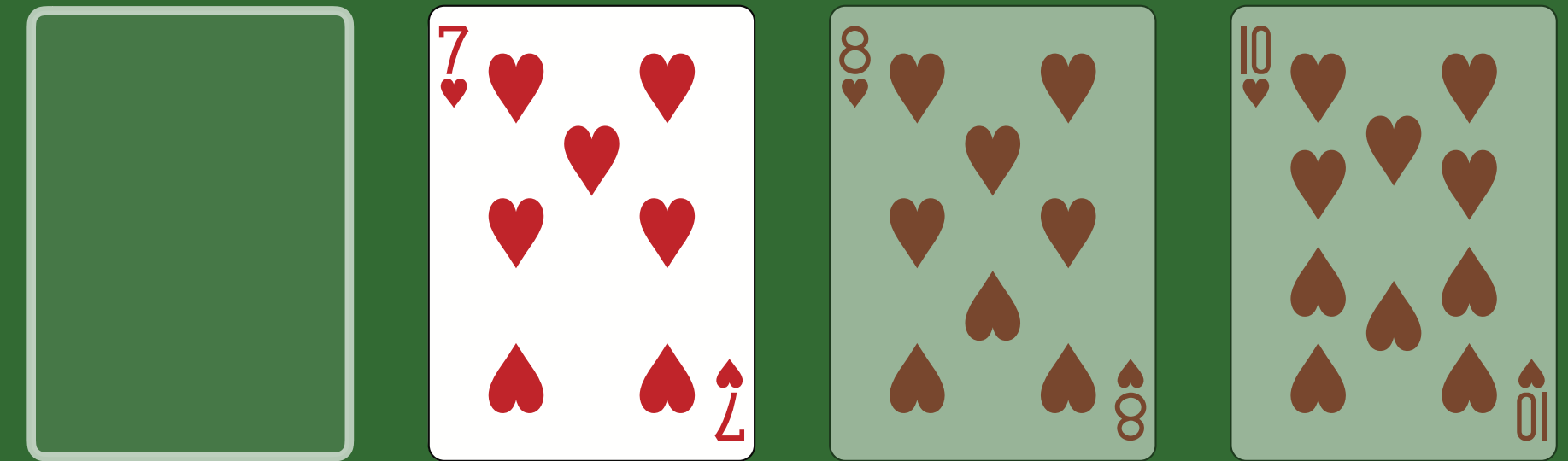


merge

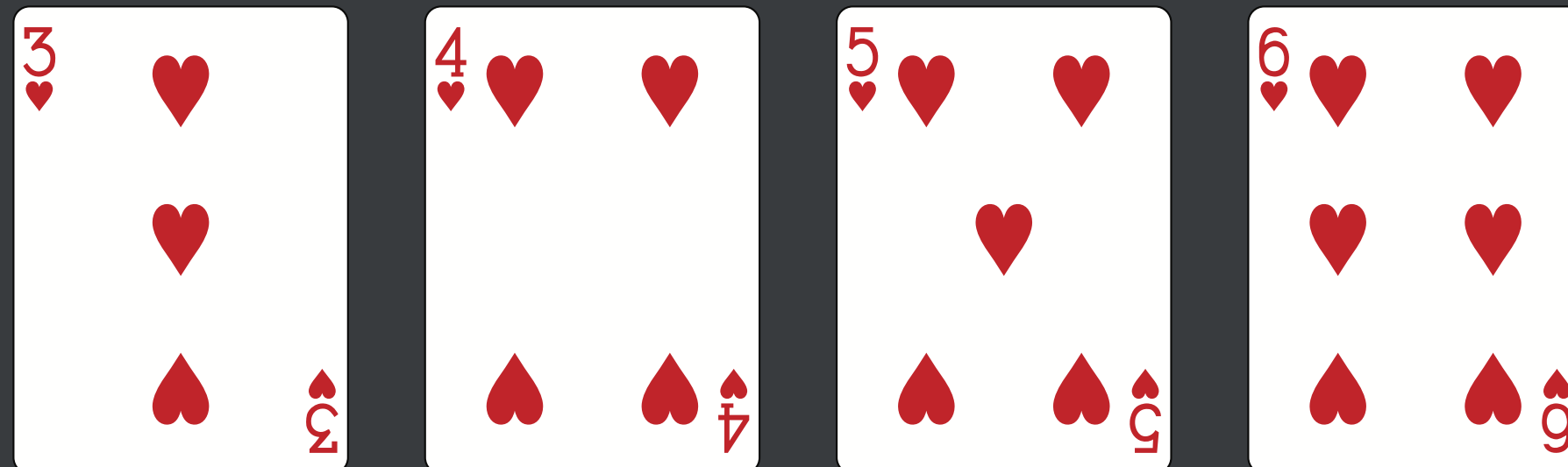
Merge sort



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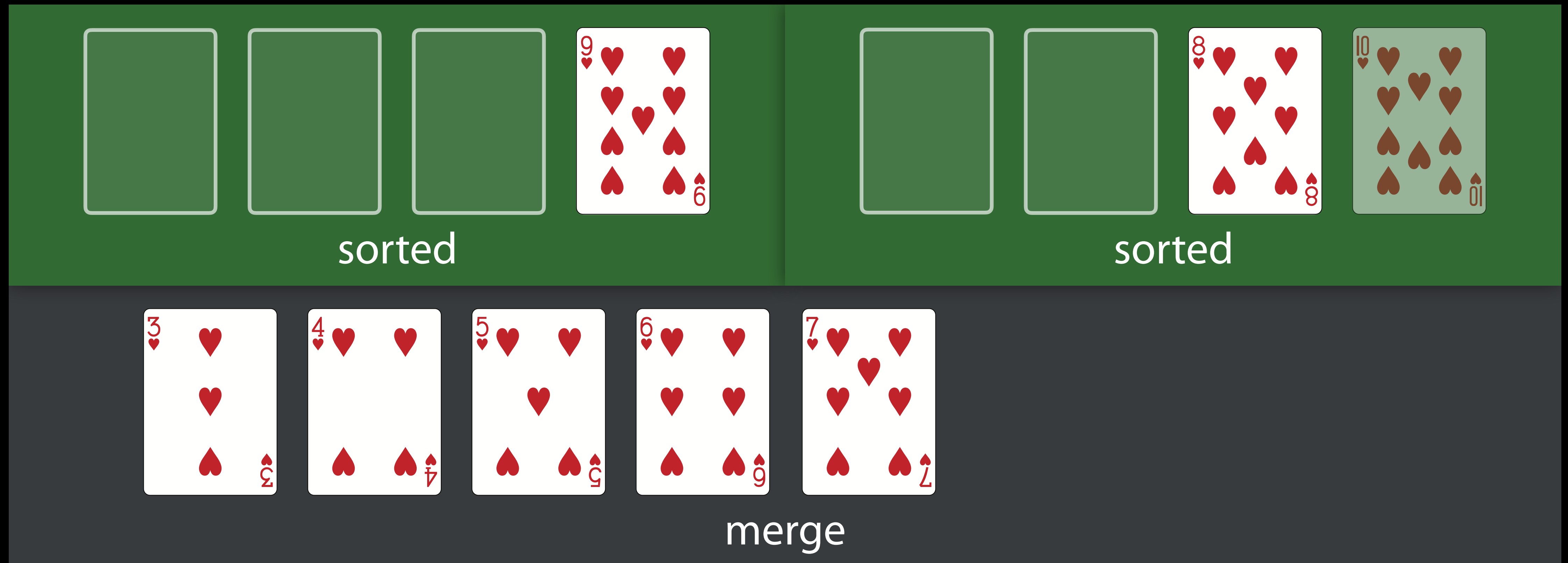


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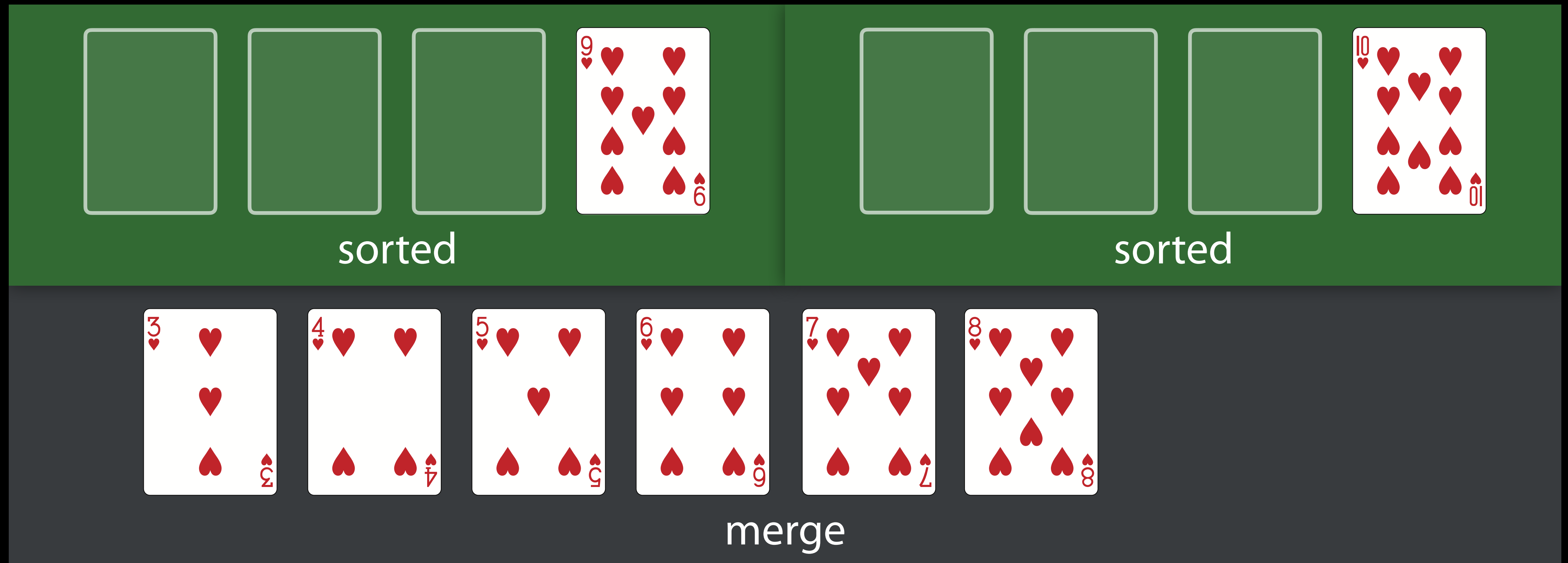


merge

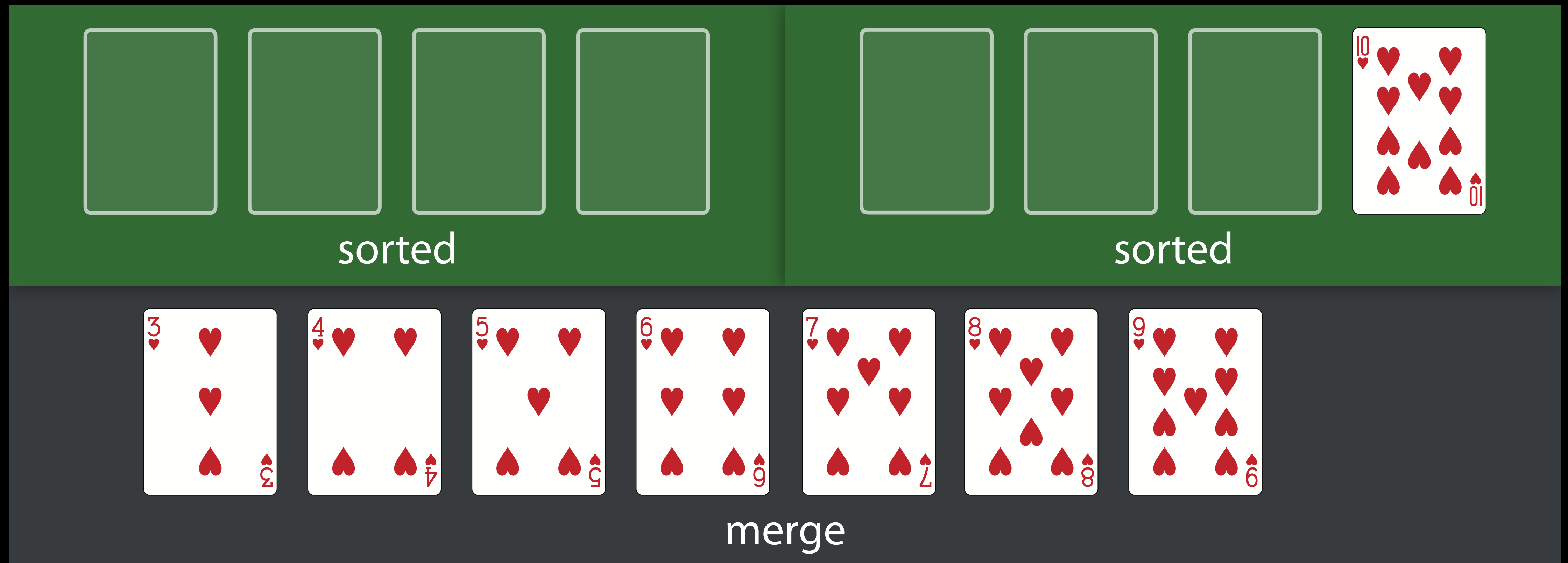
Merge sort



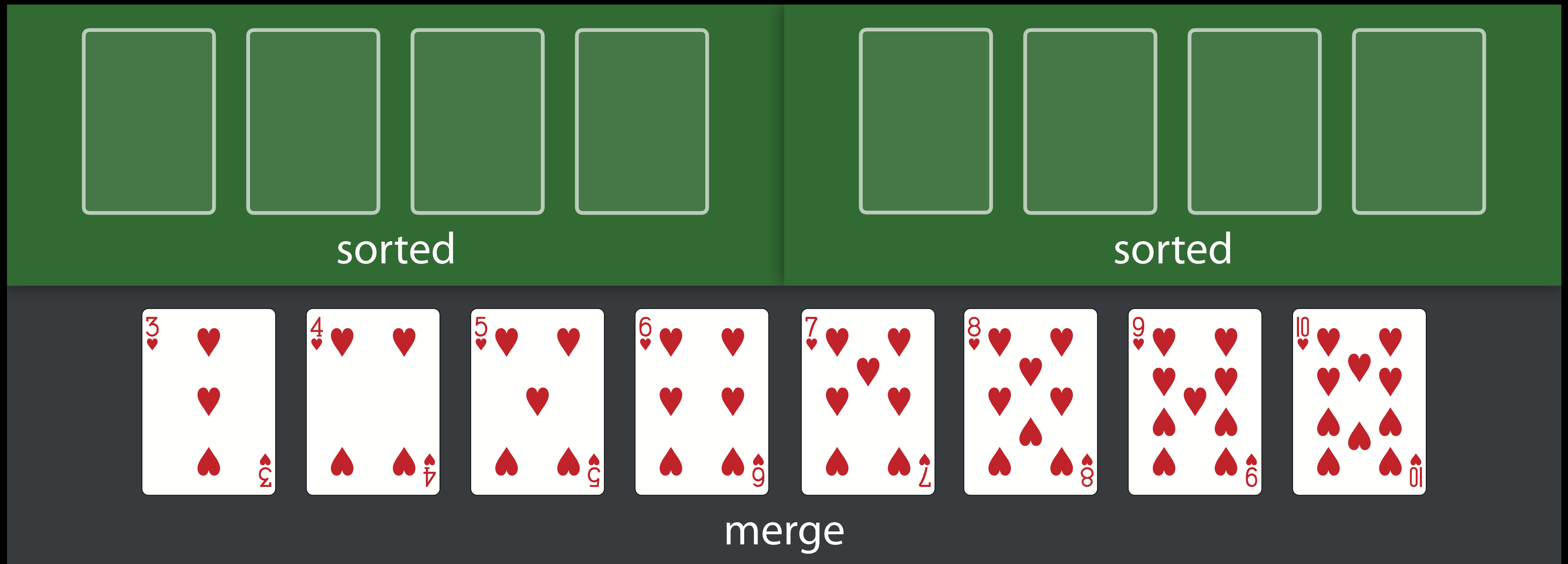
Merge sort



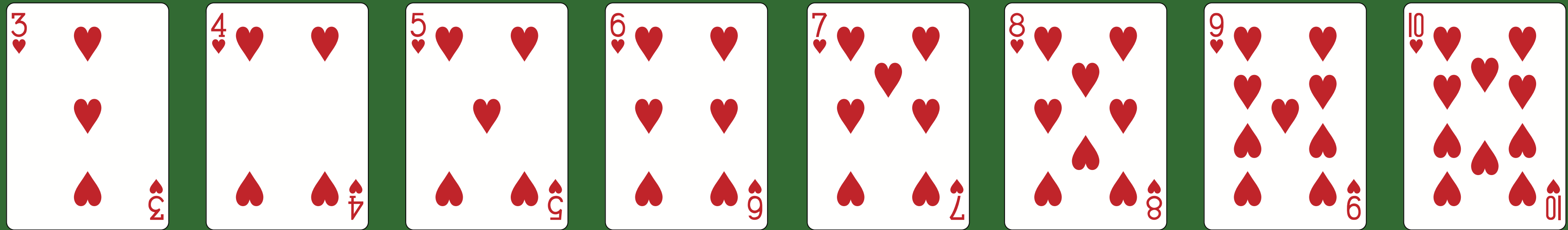
Merge sort



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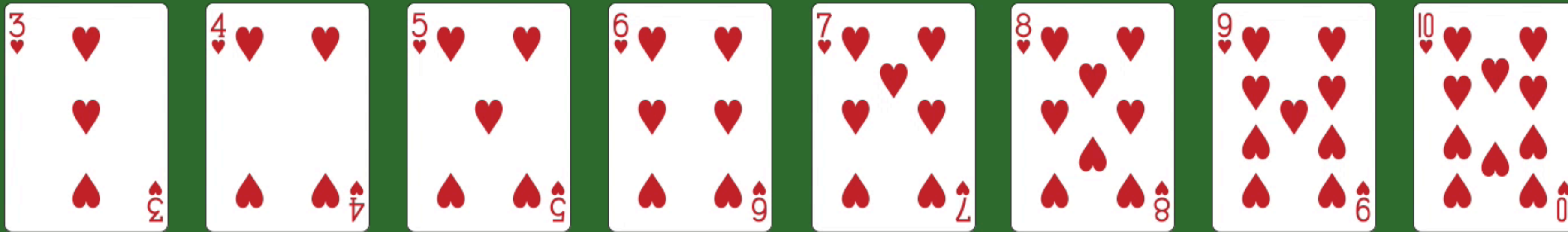


Merge sort



sorted

Merge sort



sorted

$$T(n) = 2T\left(\frac{n}{2}\right) + \Theta(n)$$

$$\hookrightarrow \Theta(n \log n)$$

Quicksort

Partitioning

To partition an array A on element $x = A[i]$ is to rearrange $A[]$ so that:

- x moves to position j (may be the same as i)
- All entries to the left of x are $\leq x$.
- All entries to the right of x are $\geq x$.

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$A[i]$ (pivot)

5	550	10	4	10	9	330
---	-----	----	---	----	---	-----

Which partitions are valid?

A.

4	5	9	10	330	10	550
---	---	---	----	-----	----	-----

B.

5	9	10	4	10	550	330
---	---	----	---	----	-----	-----

C.

5	4	9	10	10	550	330
---	---	---	----	----	-----	-----

D.

5	9	10	4	10	550	330
---	---	----	---	----	-----	-----

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Which partitions are valid?

✓ A.

4	5	9	10	330	10	550
---	---	---	----	-----	----	-----

✓ B.

5	9	10	4	10	550	330
---	---	----	---	----	-----	-----

✓ C.

5	4	9	10	10	550	330
---	---	---	----	----	-----	-----

D. ✗

5	9	10	4	10	550	330
---	---	----	---	----	-----	-----

Quicksort

Partitioning puts pivot in the correct position.

Keep partitioning until all items become pivots.

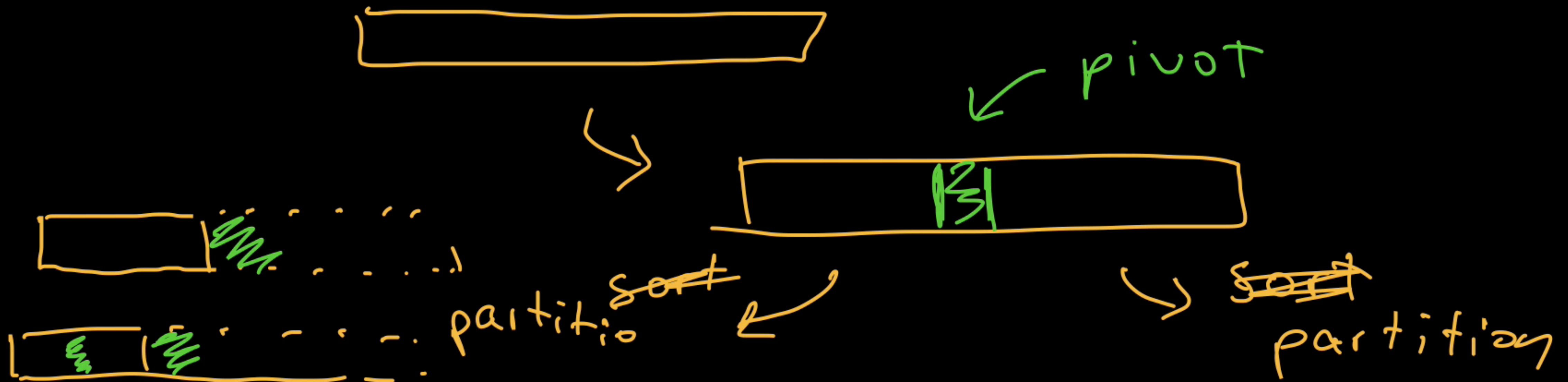
For most common situations, it is empirically the fastest sort.

Quicksort

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Partitioning

Put pivot at position 0

Create L and G pointers at left and right ends

L pointer is a friend to small items and hates large or equal items

G pointer is a friend to large items and hates small or equal items

Repeat until pointers cross:

- Walk pointers toward each other stopping on hated items

- When pointers have stopped, swap items and move pointers by one

Swap pivot and element pointed to by G

19	17	21	34	4	28	42	19	19
----	----	----	----	---	----	----	----	----

Partitioning

$\Theta(n)$ time
 $\Theta(1)$ space

Put pivot at position 0

Create L and G pointers at left and right ends

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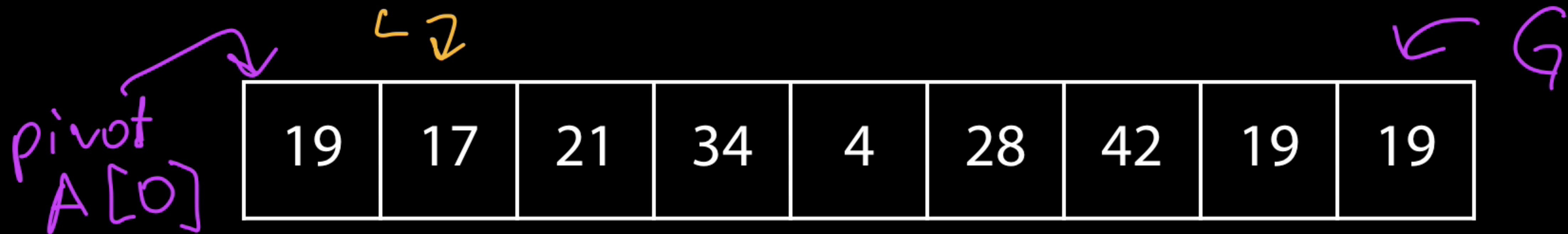
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Partitioning

$$\Theta(1)$$

Put pivot at position 0

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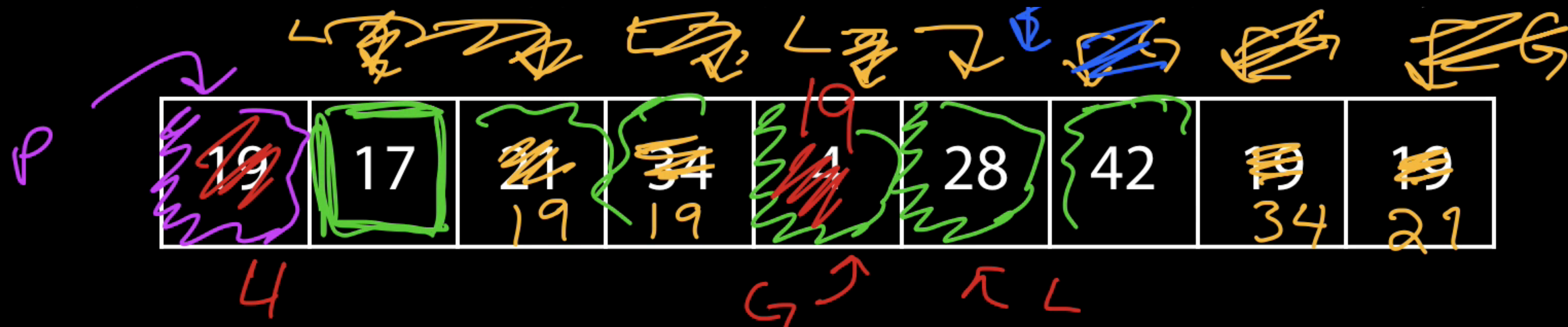
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Repeat until pointers cross:

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Pick the best sort

Suppose we do the following:

- Read 1,000,000 integers from a file into an array of length 1,000,000.
- Use merge sort to sort these integers.
- Randomly select one integer and change it.
- Sort using algorithm *S* of your choice.

Which sorting algorithm would be the fastest choice for *S*?

- A. Selection sort
- B. Heap sort
- C. Merge sort
- D. Insertion sort

Almost sorted arrays

For arrays that are almost sorted, insertion sort does very little work.

[illegible]

Find Sum

Interview Question

Given an integer **sum** and a sorted array **numbers** of **N** distinct integers, implement a function to find if there exist indices **i** and **j** such that **numbers[i] + numbers[j] == x**.

```
bool findSum(const vector<int> &numbers, int sum) {  
    for (int i = 0; i < numbers.size(); i += 1) {  
        for (int j = 0; j < numbers.size(); j += 1) {  
            if (numbers[i] + numbers[j] == sum) {  
                return true;  
            }  
        }  
    }  
    return false;  
}
```

Find Sum

Interview Question

Given an integer **sum** and a sorted array **numbers** of **N** distinct integers, implement a function to find if there exist indices **i** and **j** such that **numbers[i] + numbers[j] == x**.

```
bool betterFindSum(const vector<int> &numbers, int sum);
```

Implement a better, more efficient version of the algorithm.