

# Algorithm Design and Analysis

David N. JANSEN, Bohua ZHAN

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# 算法设计与分析

詹博华，杨大卫

# This week's content

- Today Wednesday:
  - Recap Simple Sort Algorithms
  - Chapter 6: Heapsort and Priority Queues
  - Exercises
- Tomorrow Thursday:
  - Exercise solutions
  - Chapter 7: Quicksort
  - Chapter 8: Linear sorting

# 这周的内容

- 今天周三：
  - 复习简单的排序算法
  - 第6章：堆排序，  
优先队列
  - 练习
- 明天周四：
  - 练习题解答
  - 第7章：快速排序
  - 第8章：线性时间排序

# Exercises

# 练习

# 4.3-7

- Using the master method in Section 4.5, you can show that the solution to the recurrence  $T(n) = 4T(n/3) + n$  is  $T(n) = \Theta(n^{\log_3 4})$ . Show that a substitution proof with the assumption  $T(n) \leq cn^{\log_3 4}$  fails. Then show how to subtract off a lower-order term to make a substitution proof work.
- 使用4.5节中的主方法，可以证明  $T(n) = 4T(n/3) + n$  的解为  $T(n) = \Theta(n^{\log_3 4})$ 。说明基于假设  $T(n) \leq cn^{\log_3 4}$  的代入法不能证明这一结论。然后说明如何通过减去一个低阶项完成代入法证明。

# 4.3-7

- Using  $T(n) \leq cn^{\log_3 4}$  it is not possible to prove the upper bound of the recurrence solution:
  - We attempt a strong induction proof.
  - **Induction base:**  $T(1) \leq 1$  holds if  $c \geq 1$ .
  - **Induction step:** Assume  $T(m) \leq cm^{\log_3 4}$  for all  $m \leq n$ . We have to prove  $T(n+1) \leq c(n+1)^{\log_3 4}$ .

$$\begin{aligned} \text{But } T(n+1) &= 4T(\lfloor (n+1)/3 \rfloor) + n+1 \leq 4c((n+1)/3)^{\log_3 4} + n+1 \\ &= 4c(n+1)^{\log_3 4} / 3^{\log_3 4} + n+1 \\ &= c(n+1)^{\log_3 4} + n+1. \end{aligned}$$

We can only prove the required inequality if  $n+1 \leq 0$ , which is false.

# 4.3-7

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  - **Induction base:**  $T(1) \leq 1$  holds if  $c \geq 1$ .
  - **Induction step:** Assume  $T(m) \leq cm^{\log_3 4}$  for all  $m \leq n$ . We have to prove  $T(n+1) \leq c(n+1)^{\log_3 4}$ .  
But 
$$\begin{aligned} T(n+1) &= 4T(\lfloor (n+1)/3 \rfloor) + n+1 \leq 4c((n+1)/3)^{\log_3 4} + n+1 \\ &= 4c(n+1)^{\log_3 4} / 3^{\log_3 4} + n+1 \\ &= c(n+1)^{\log_3 4} + n+1. \end{aligned}$$
  
We can only prove the required inequality if  $n+1 \leq 0$ , which is false.

# 4.3-7

- Using  $T(n) \leq cn^{\log_3 4}$  it is not possible to prove the upper bound of the recurrence solution:
  - We need to prove  $T(6) \leq c 6^{\log_3 4} = c (2 \times 3)^{\log_3 4} = c 2^{\log_3 4} \times 3^{\log_3 4} = c 2^{\log_3 4} \times 4$
  - But if we use  $T(2) \leq c 2^{\log_3 4}$ , then we can only prove  $T(6) \leq 4T(2) + 6 \leq 4 c 2^{\log_3 4} + 6$ , which is not  $\leq c 2^{\log_3 4} \times 4$ .

# 4.3-7

- Now try using  $T(n) \leq cn^{\log_3 4} + dn$ :
  - We prove the inequation by strong induction.
  - **Induction base:**  $T(1) \leq 1$  holds if  $c + d \geq 1$ .
  - **Induction step:** Assume  $T(m) \leq cm^{\log_3 4} + dm$  for all  $m \leq n$ . We have to prove  $T(n+1) \leq c(n+1)^{\log_3 4} + d(n+1)$ .

$$\begin{aligned} \text{But } T(n+1) &= 4T(\lfloor (n+1)/3 \rfloor) + n+1 \leq 4c((n+1)/3)^{\log_3 4} + 4d \lfloor (n+1)/3 \rfloor + n+1 \\ &\leq 4c(n+1)^{\log_3 4} / 3^{\log_3 4} + 4d(n+1)/3 + n+1 \\ &= c(n+1)^{\log_3 4} + 4d(n+1)/3 + n+1 \\ &= c(n+1)^{\log_3 4} + d(n+1) + \underbrace{d(n+1)/3 + n+1}_{\text{needs to be } \leq 0} \end{aligned}$$



# 4.3-7

- It remains to be proven:  $d(n+1)/3 + n+1 \leq 0$ .  
iff  $n+1 \leq -d(n+1)/3$   
iff  $3(n+1) \leq -d(n+1)$   
iff  $3 \leq -d$   
iff  $-3 \geq d$
- To satisfy  $c + d \geq 1$  and  $d \leq -3$ , we choose  $c = 4$  and  $d = -3$ .

# 4.3-9

- Solve the recurrence

$$T(n) = 3T(\sqrt{n}) + \lg n$$

by making a change of variables. Your solution should be asymptotically tight. Do not worry about whether values are integral.

- 使用改变变量的方法求解归式

$$T(n) = 3T(\sqrt{n}) + \lg n$$

你的解应该是渐近紧确的。不必担心数值是否是整数。

# 4.3-9

- In  $T(n) = 3T(\sqrt{n}) + \lg n$ ,  
try to find a substitution  $T'(m) = T(g(m))$   
such that the recurrence becomes  $T'(m) = aT'(m/b) + \dots$  for some  $a$  and  $b$ .
- So we need a function  $g$  that satisfies: If  $n = g(m)$ , then  $\sqrt{n} = g(m/b)$ .  
Possible solution:  $g(m) = 2^m$ . Then  $b = 2$  because  $\sqrt{n} = \sqrt{g(m)} = \sqrt{2^m} = 2^{m/2}$ .
- $T'(m) = 3T'(m/2) + m$

The recurrence for  $T'$  can be solved normally; for example, by the master method,  $a = 3$  and  $b = 2$ ,  $f(m) = m = O(m^{\log_b a - \varepsilon})$  for  $\varepsilon = 0.58$ , so the first case applies, and  $T'(m) = O(m^{\lg 3})$ .

Therefore,  $T(n) = T(2^m) = O(m^{\lg 3}) = O((\lg n)^{\lg 3}) = O(3^{\lg \lg n})$ .

# 6.4-1

- Using Figure 6.4 as a model, illustrate the operation of HEAPSORT on the array  $A = \langle 5, 13, 2, 25, 7, 17, 20, 8, 4 \rangle$ .
- 参照图6-4的方法, 说明HEAPSORT在数组 $A = \langle 5, 13, 2, 25, 7, 17, 20, 8, 4 \rangle$ 上的操作过程。

# Initial array

5

13

2

25

7

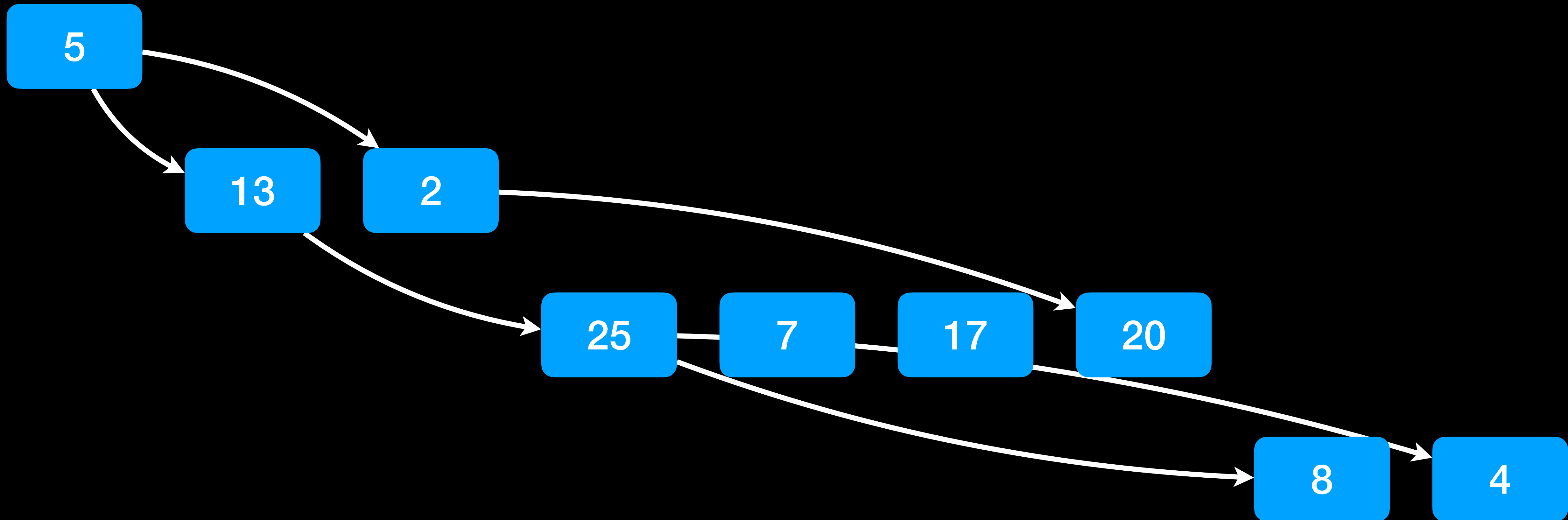
17

20

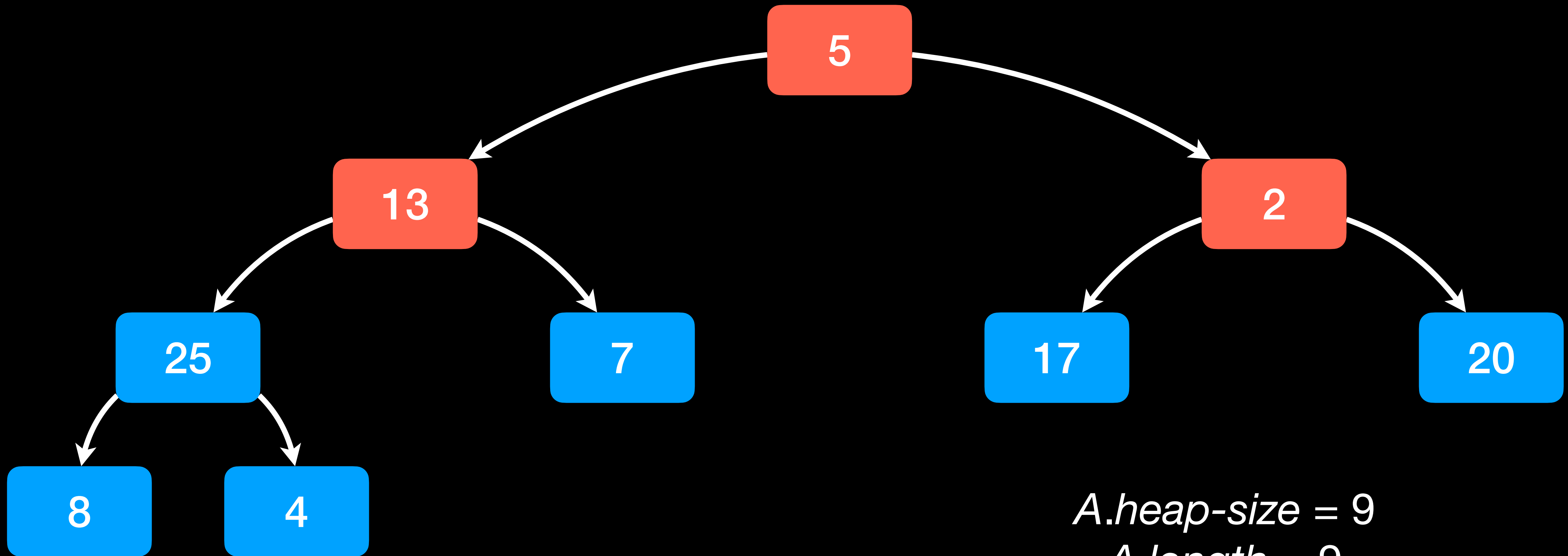
8

4

# Initial heap



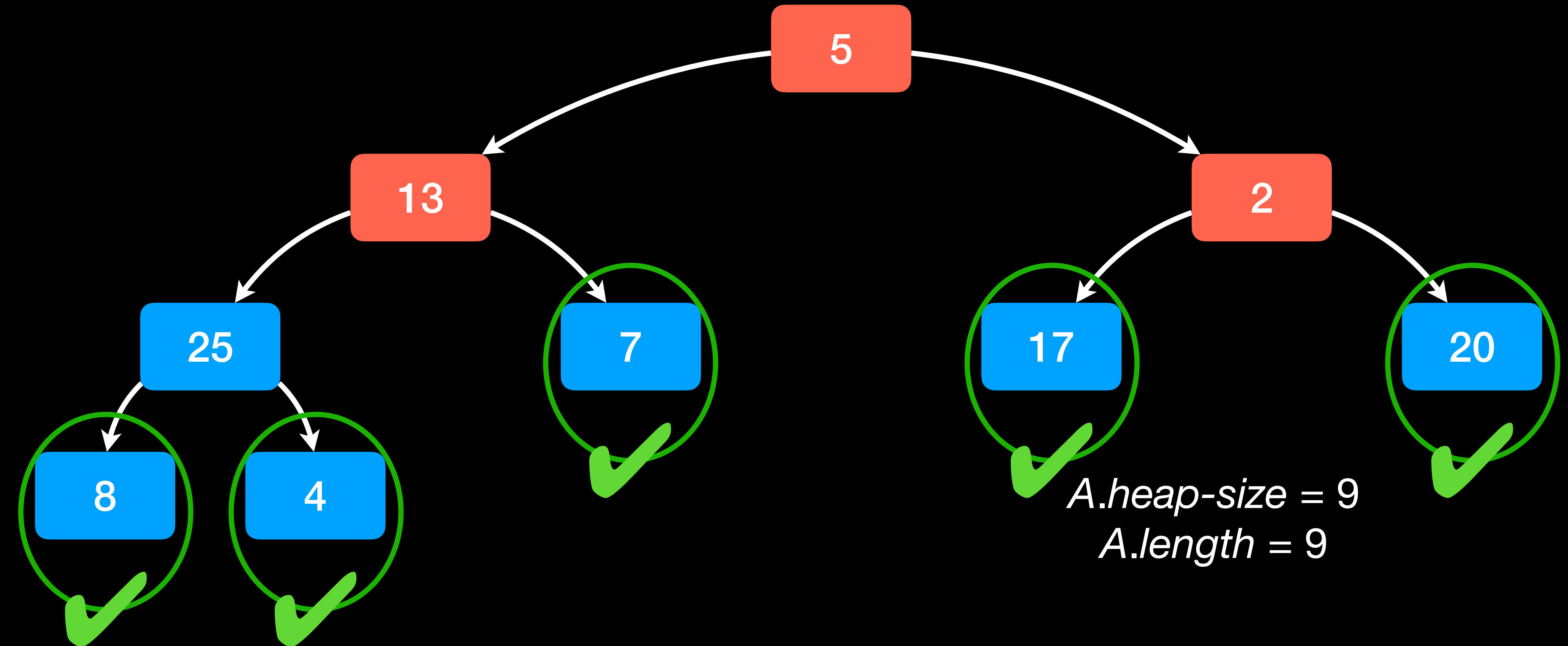
# Initial heap



*A.heap-size = 9*

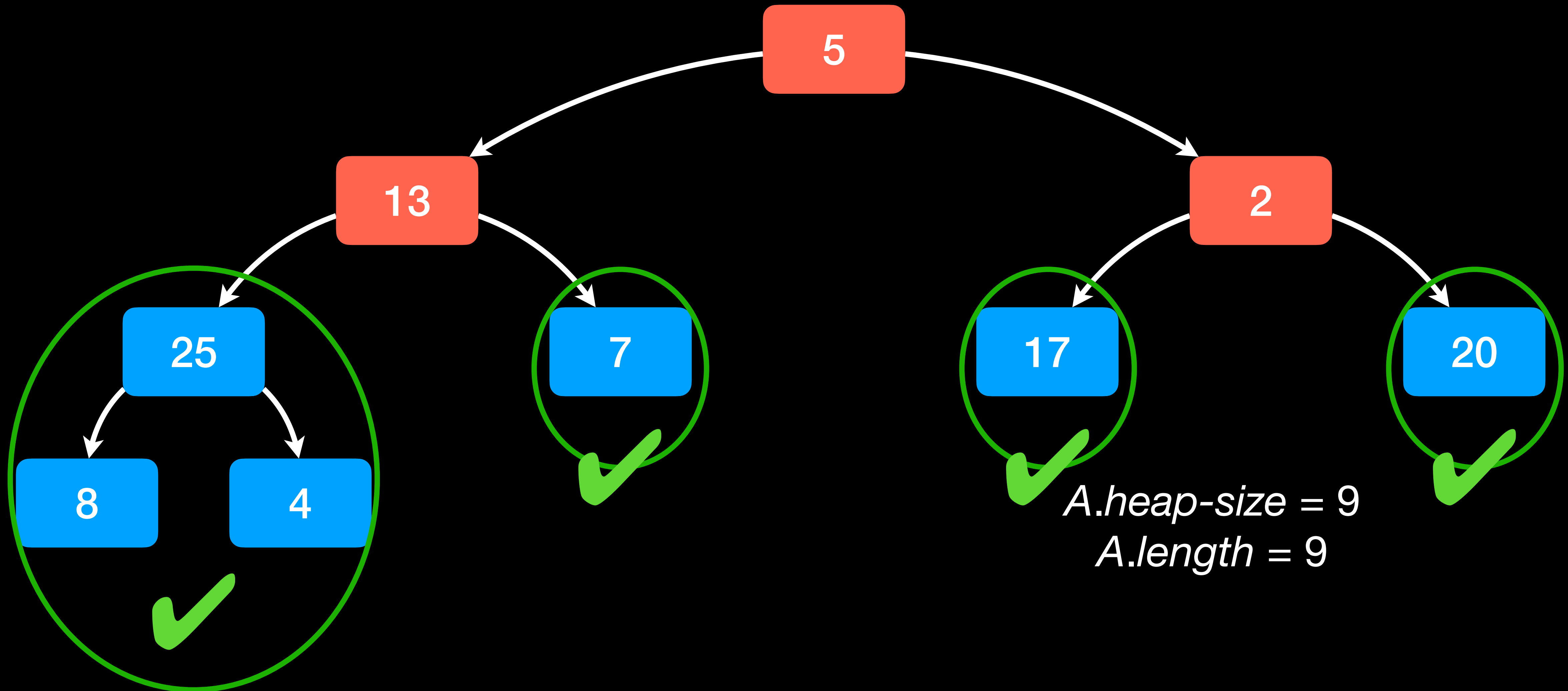
*A.length = 9*

# BUILD-MAX-HEAP

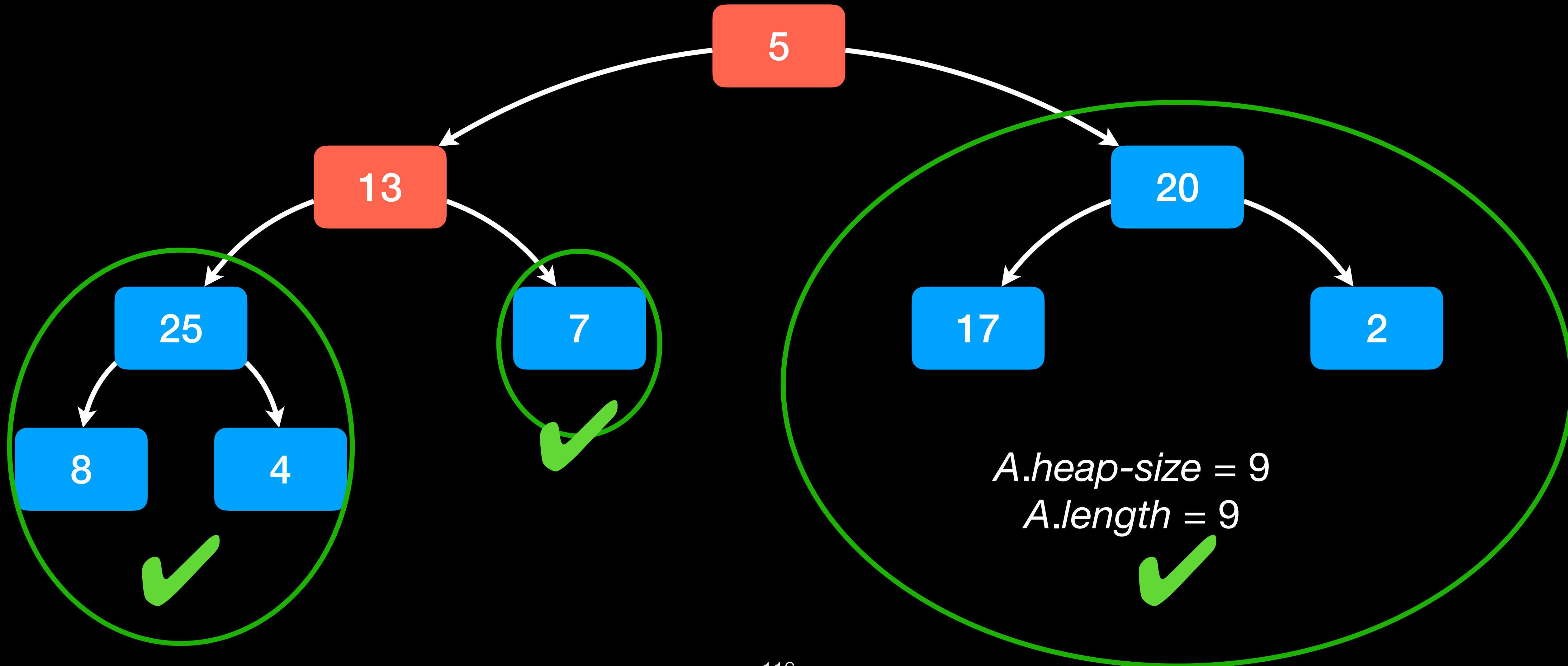




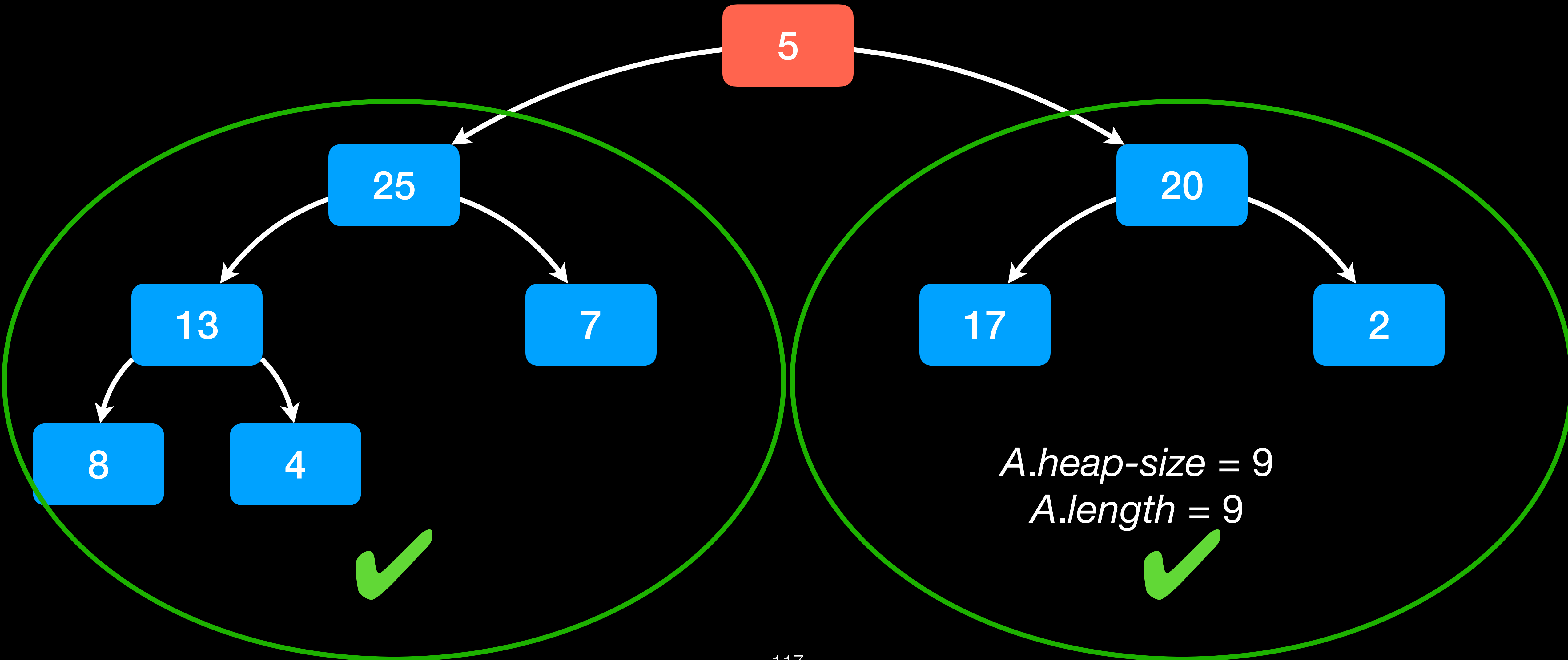
# BUILD-MAX-HEAP



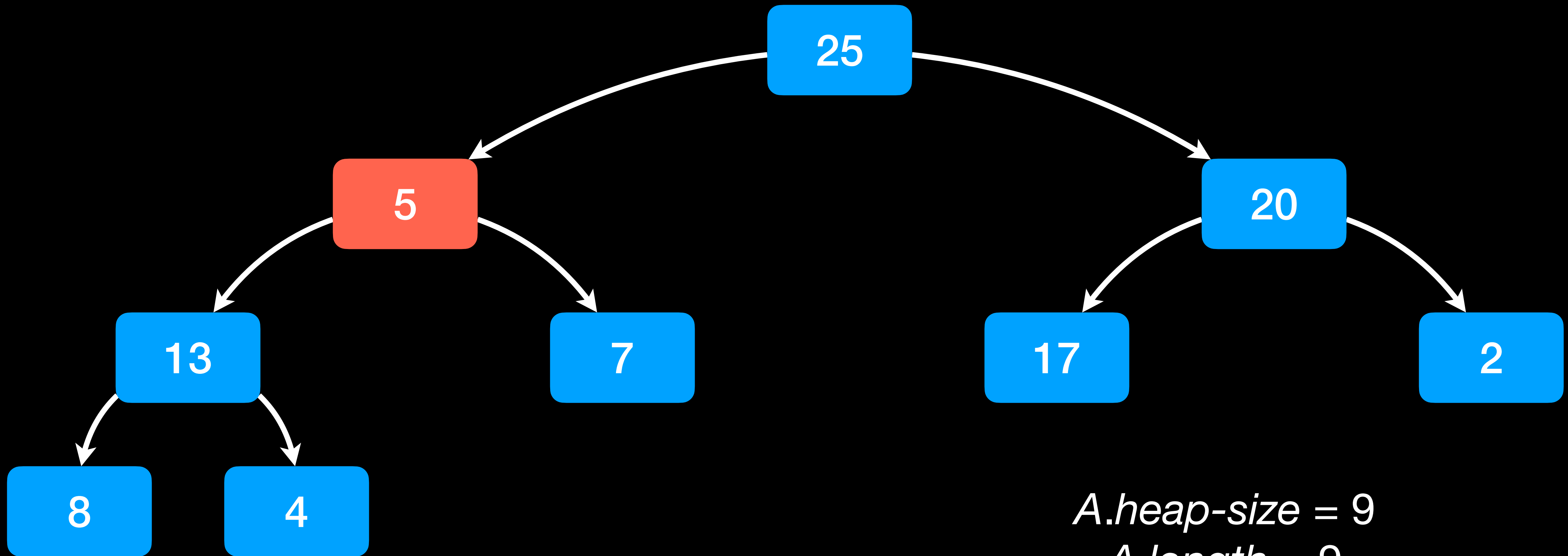
# BUILD-MAX-HEAP



# BUILD-MAX-HEAP

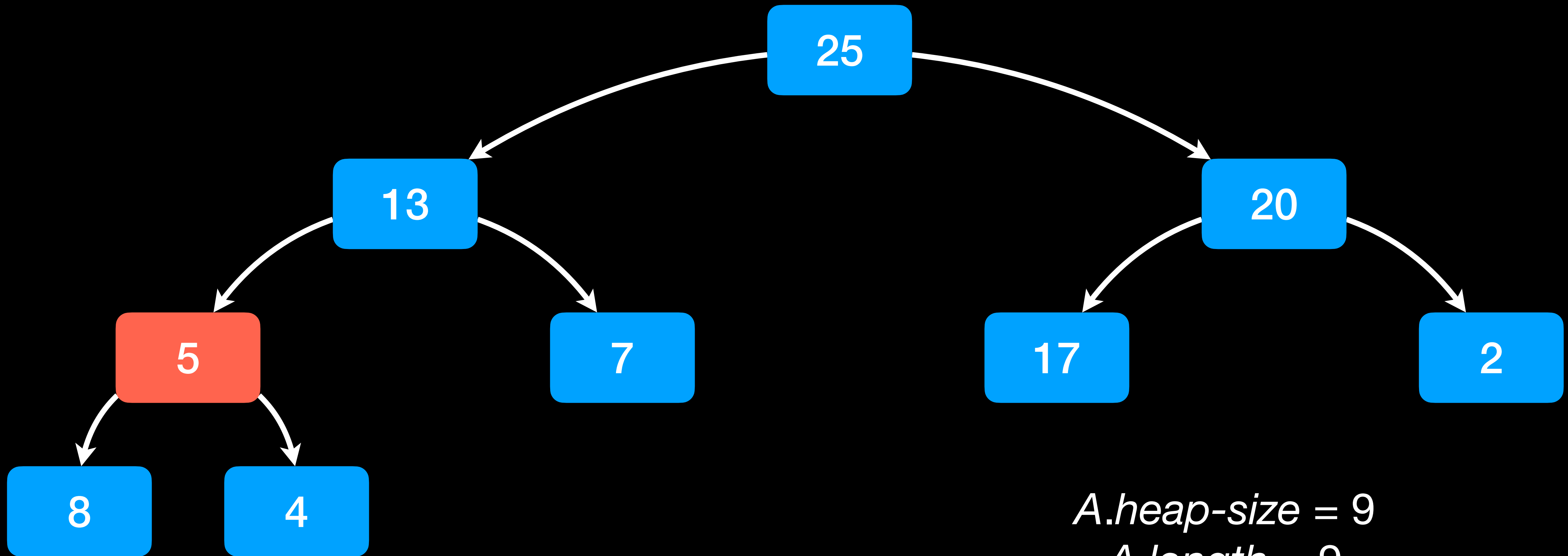


# BUILD-MAX-HEAP



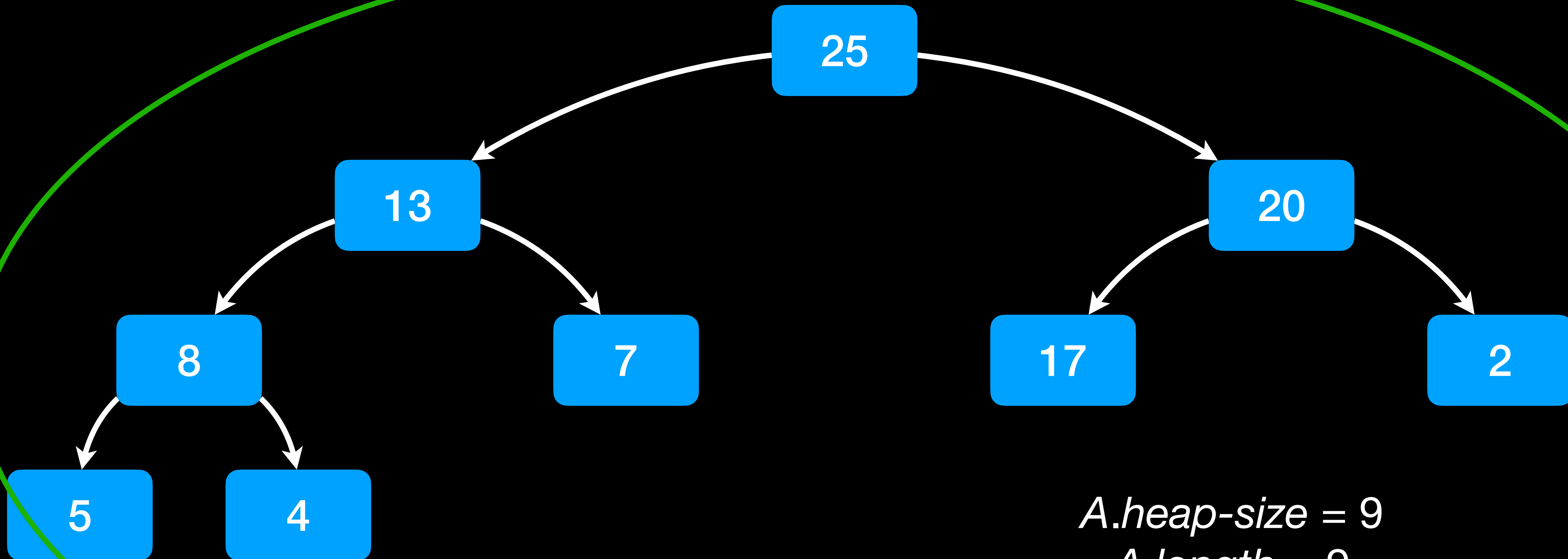
*A.heap-size = 9*  
*A.length = 9*

# BUILD-MAX-HEAP



*A.heap-size = 9*  
*A.length = 9*

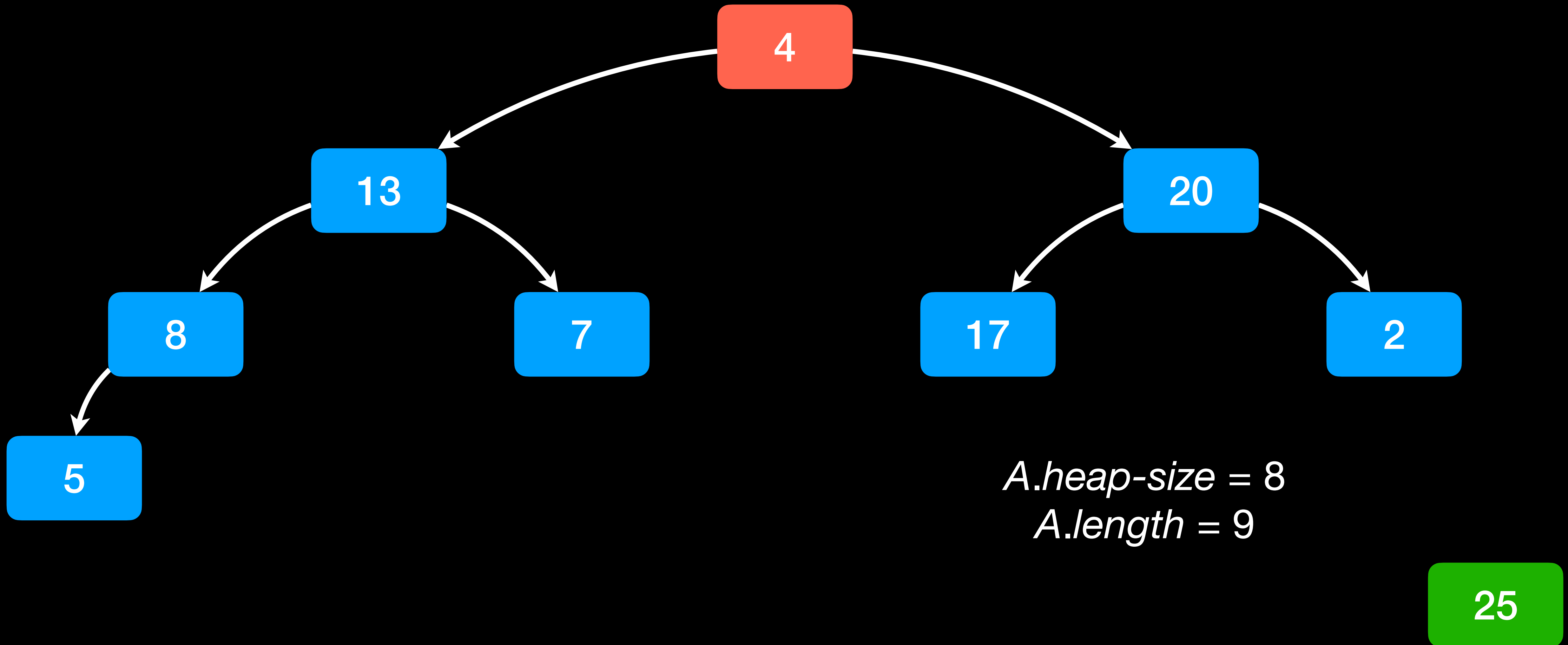
# BUILD-MAX-HEAP



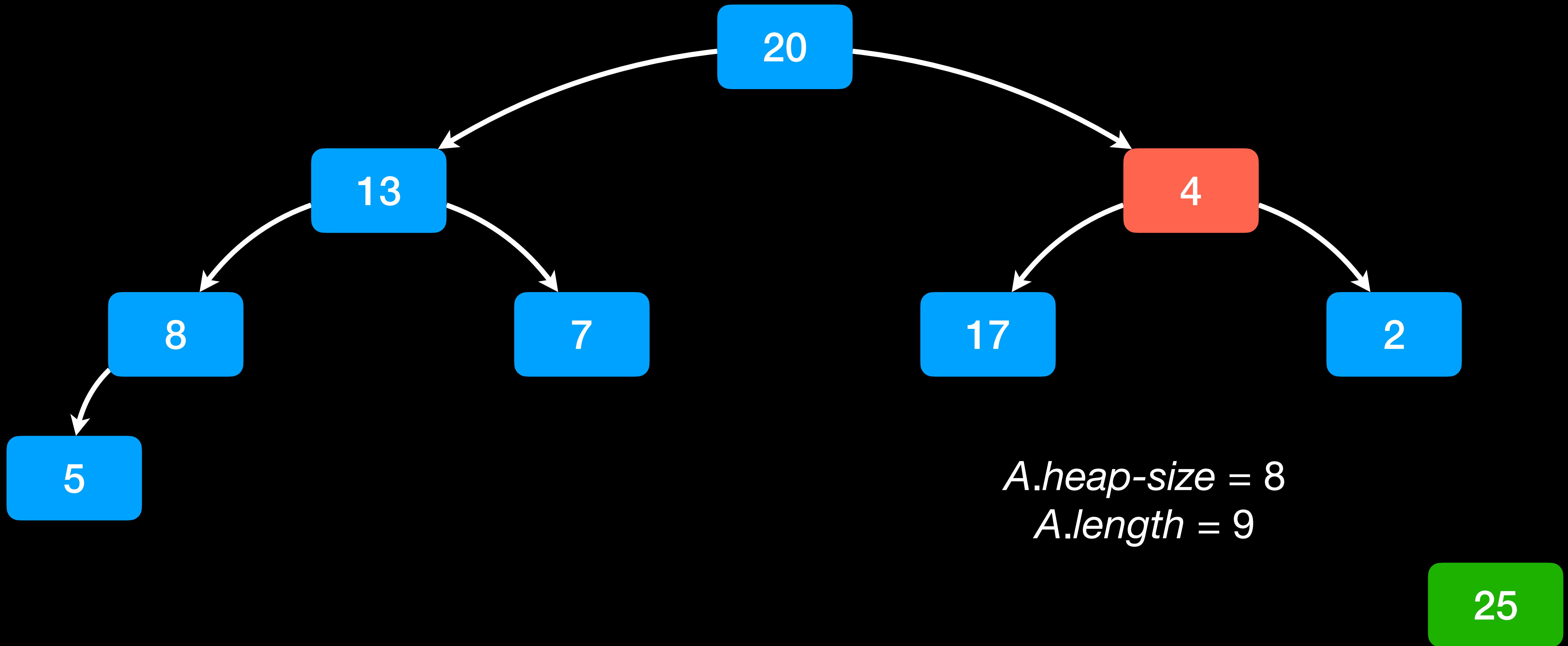
*A.heap-size = 9*  
*A.length = 9*



# Extract one element

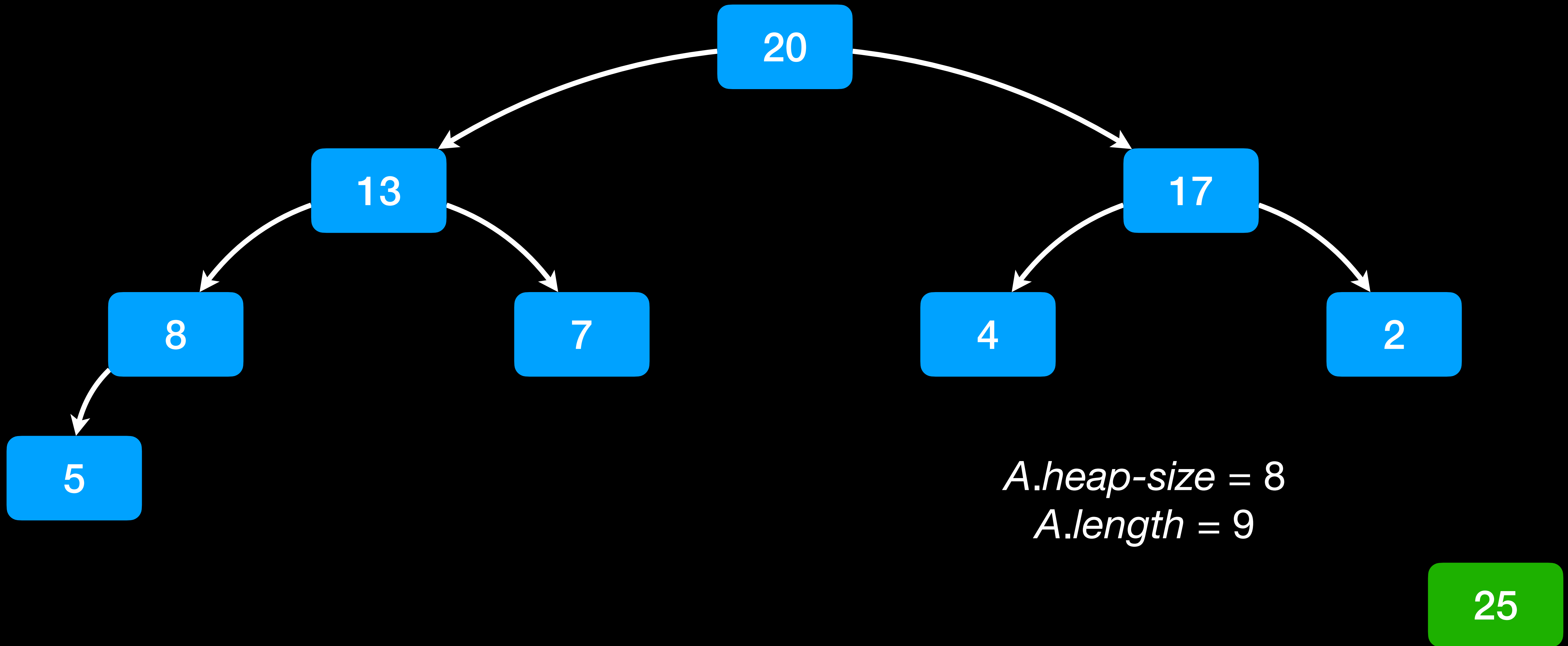


# MAX-HEAPIFY

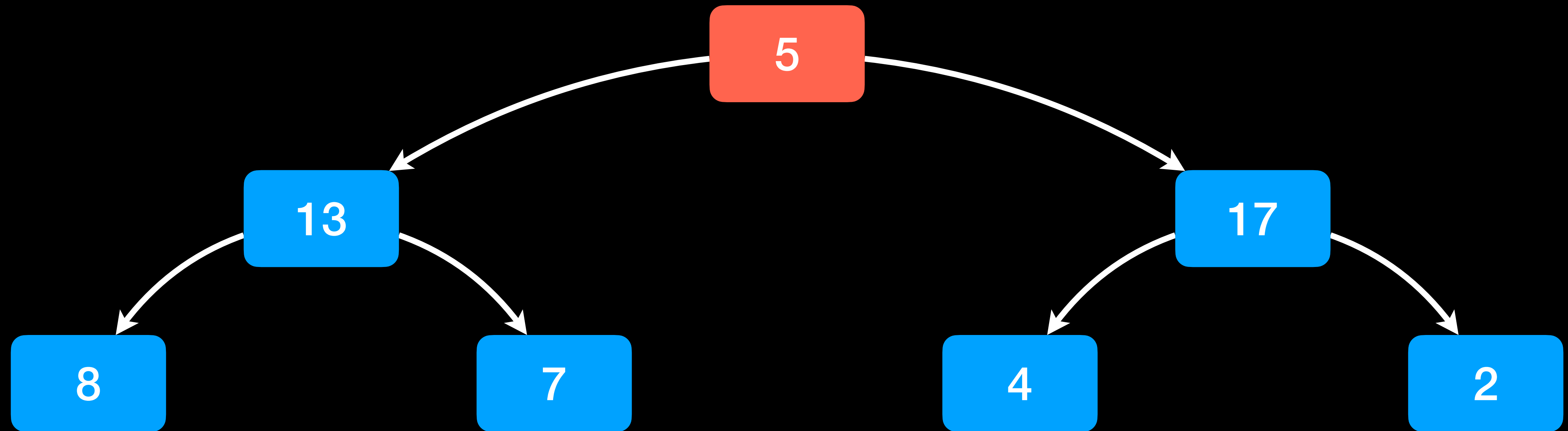




# MAX-HEAPIFY



# Extract one element

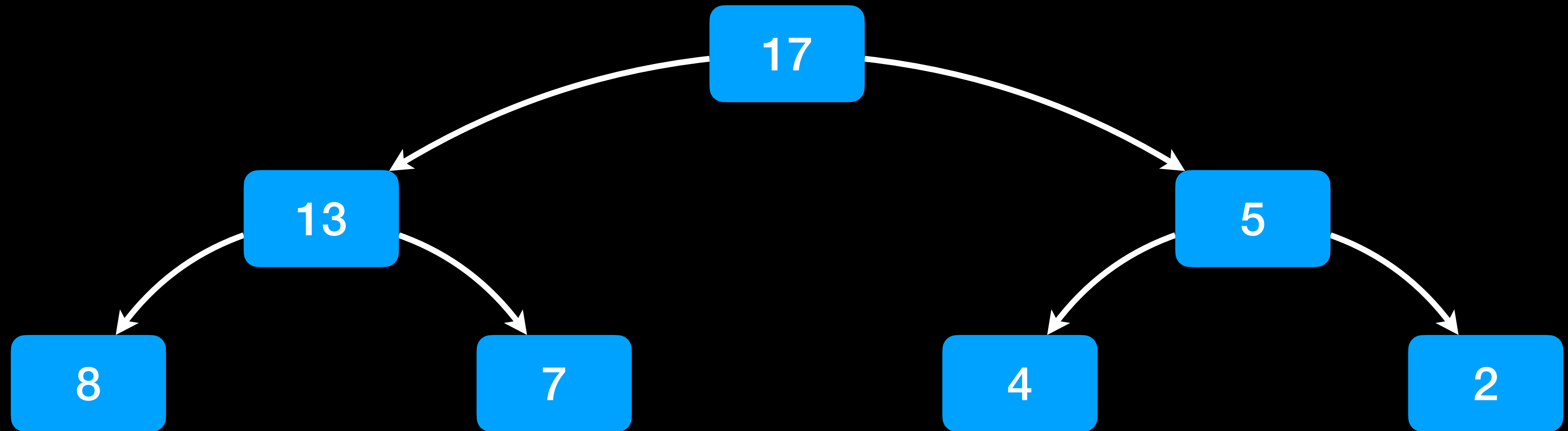


*A.heap-size = 7*  
*A.length = 9*

20

25

# MAX-HEAPIFY

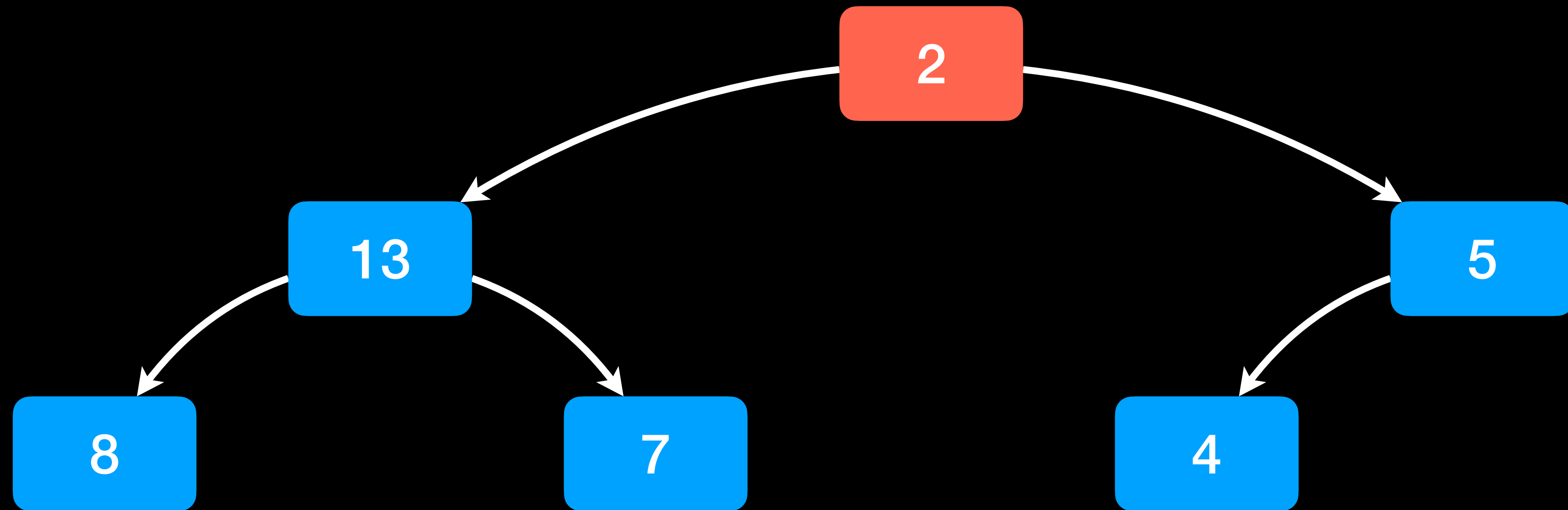


*A.heap-size = 7*  
*A.length = 9*

20

25

# Extract one element



*A.heap-size = 6*

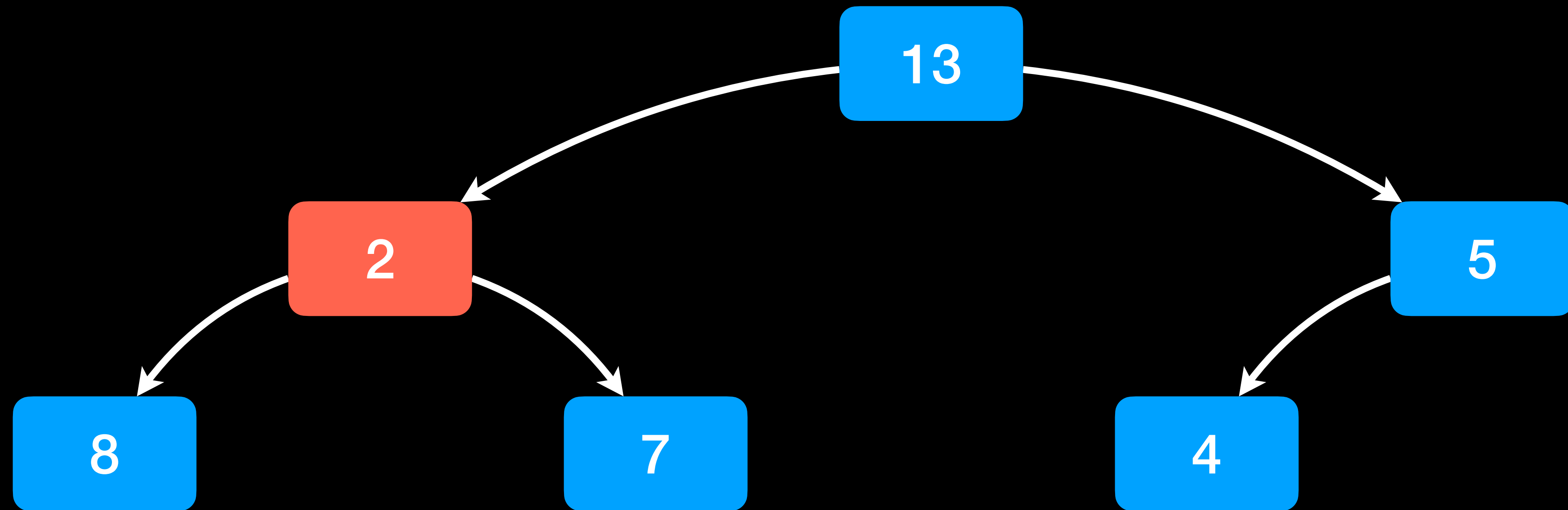
*A.length = 9*

17

20

25

# MAX-HEAPIFY



*A.heap-size = 6*

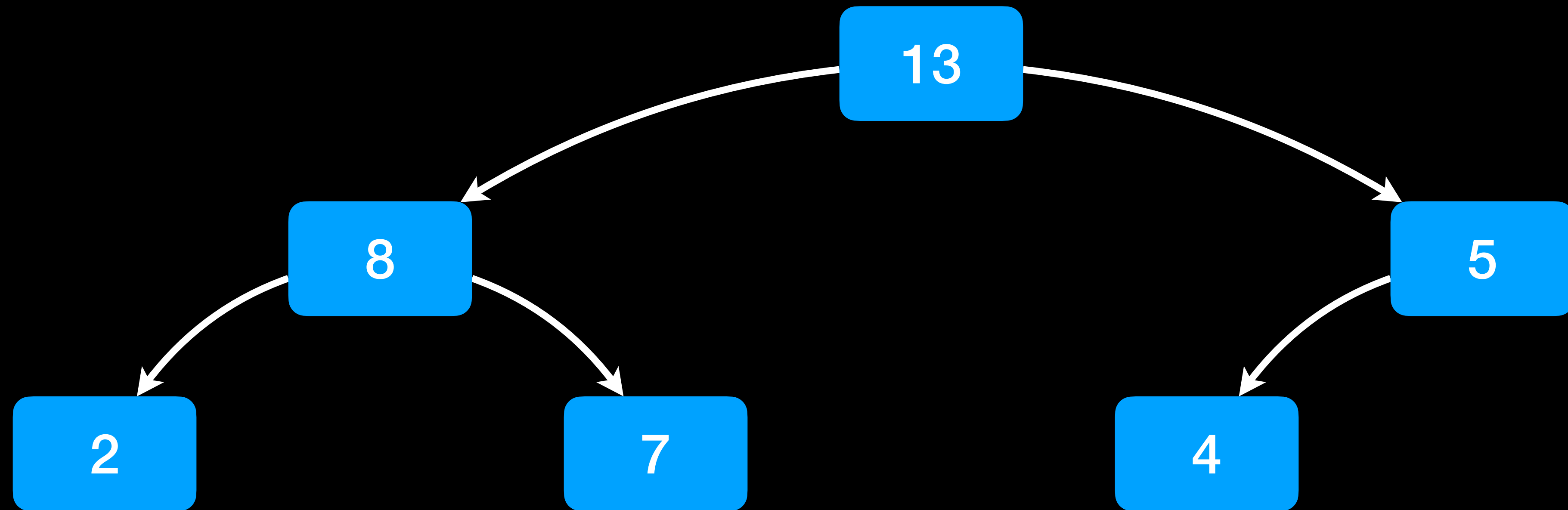
*A.length = 9*

17

20

25

# MAX-HEAPIFY



*A.heap-size = 6*

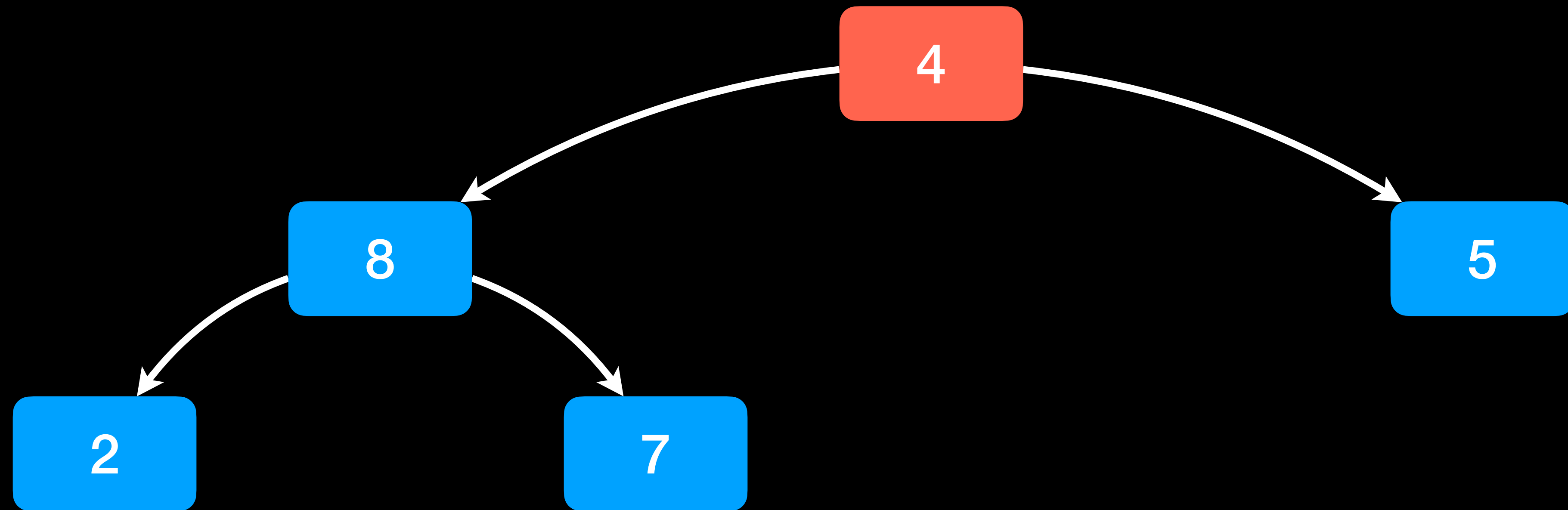
*A.length = 9*

17

20

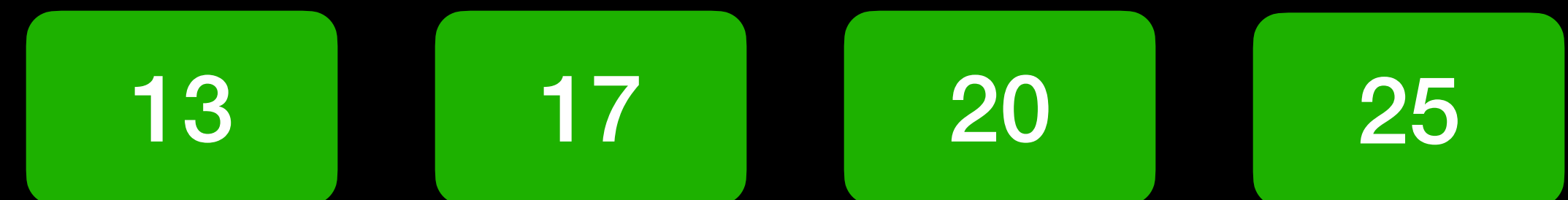
25

# Extract one element

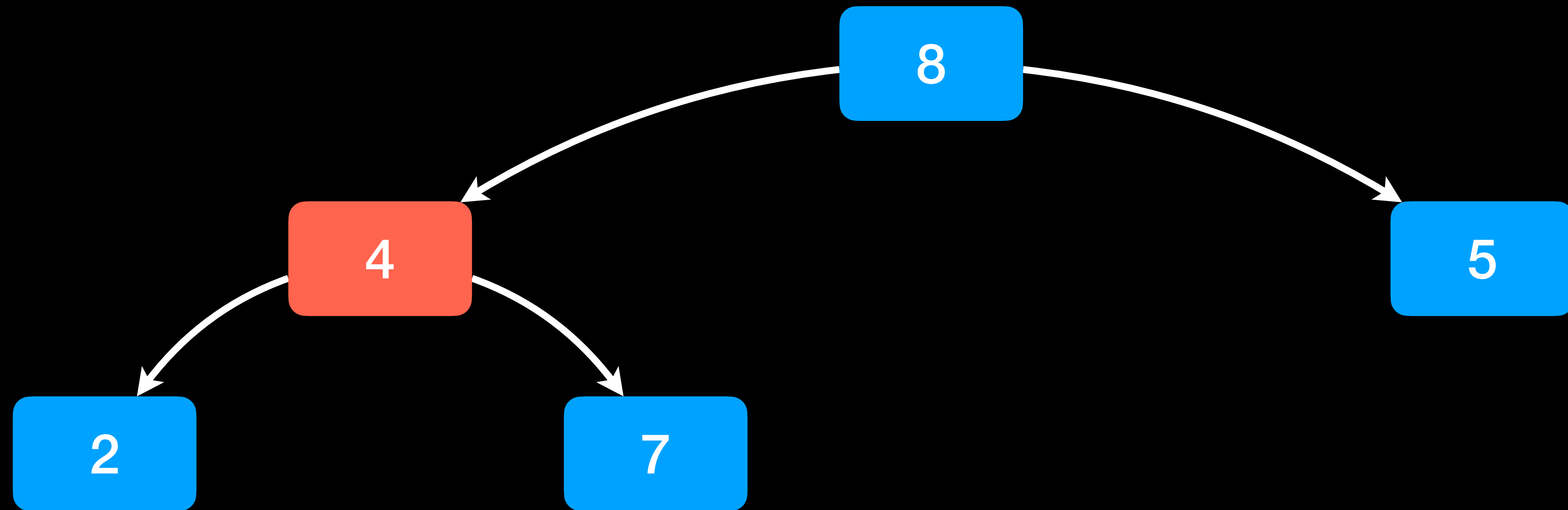


*A.heap-size = 5*

*A.length = 9*

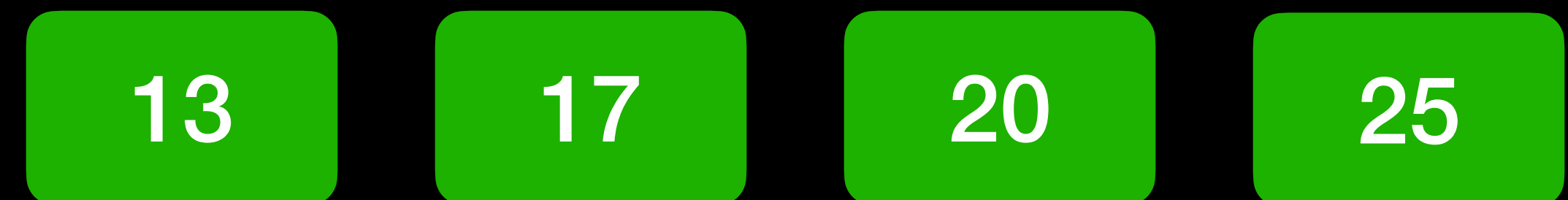


# MAX-HEAPIFY



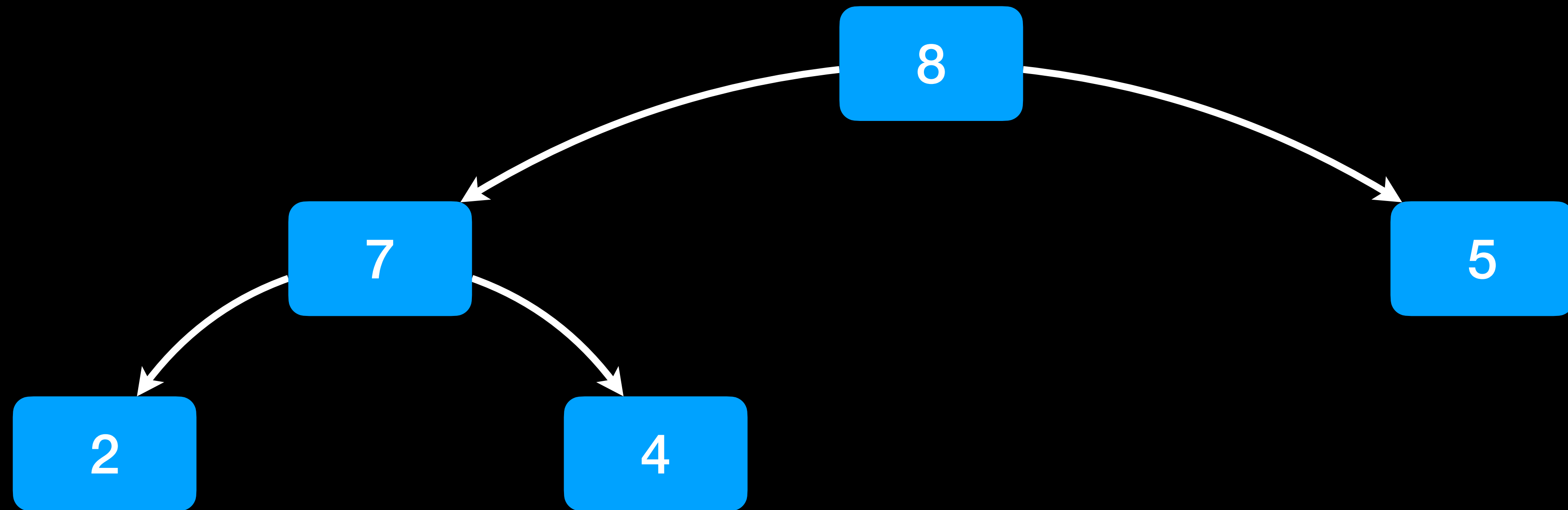
*A.heap-size = 5*

*A.length = 9*



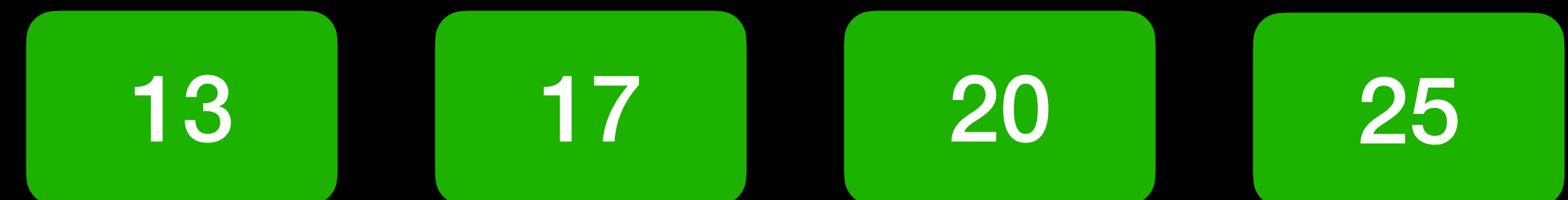


# MAX-HEAPIFY

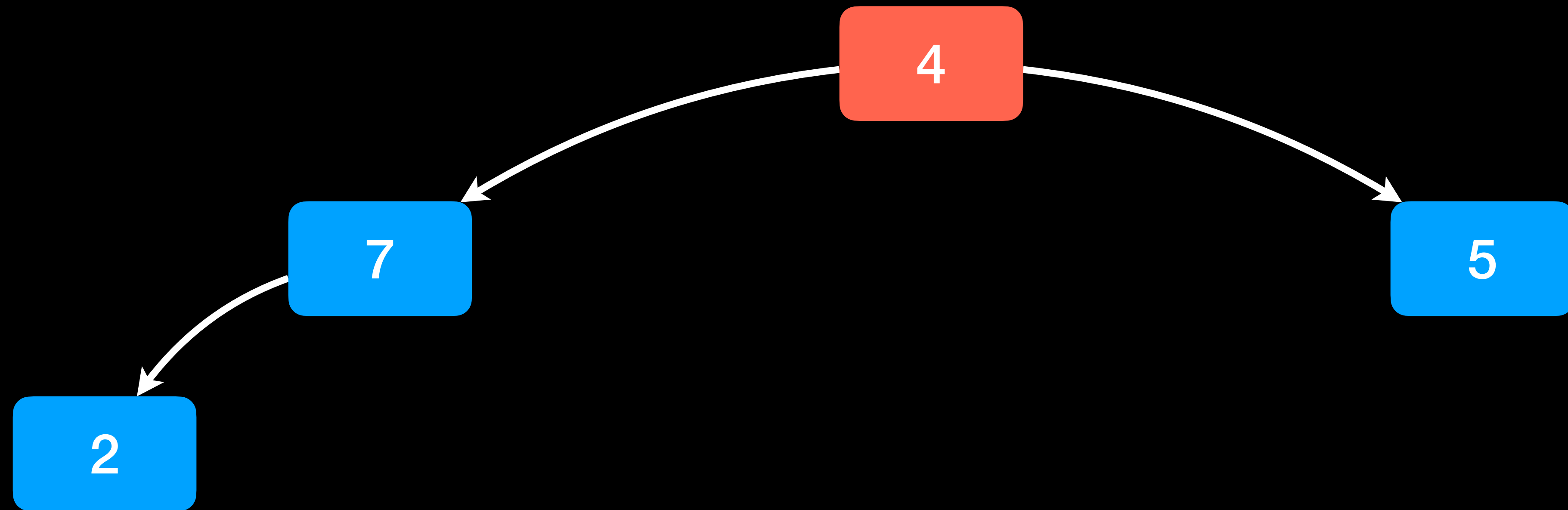


*A.heap-size = 5*

*A.length = 9*



# Extract one element



*A.heap-size = 4*

*A.length = 9*

8

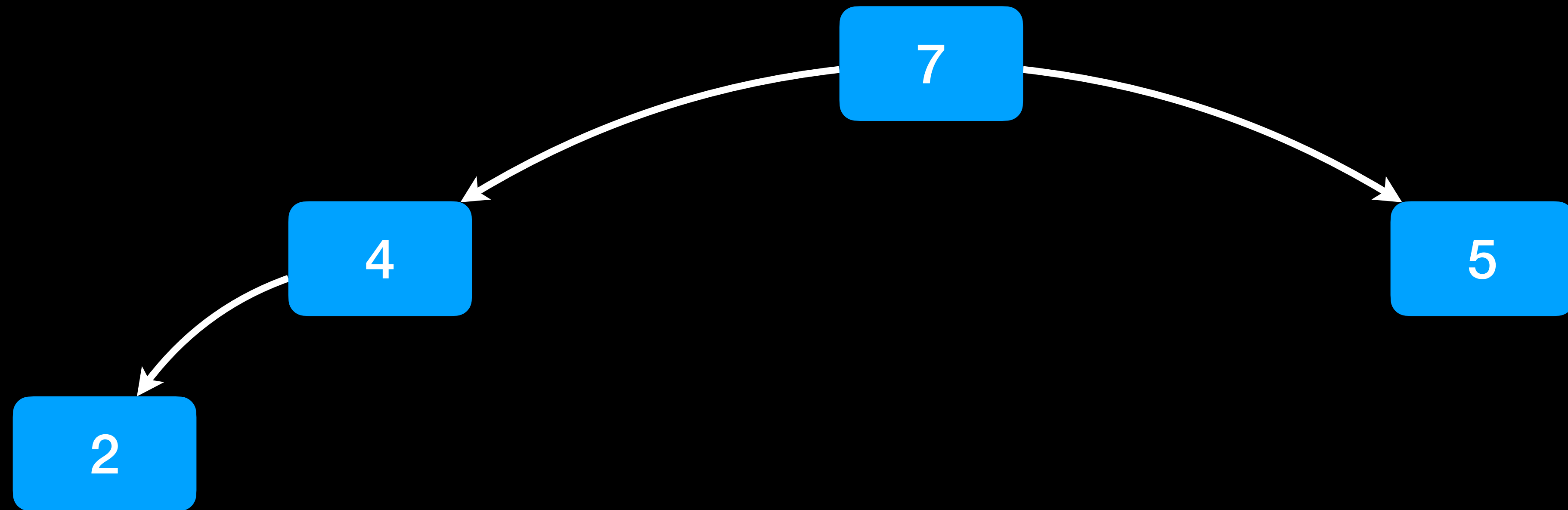
13

17

20

25

# MAX-HEAPIFY



*A.heap-size = 4*

*A.length = 9*

8

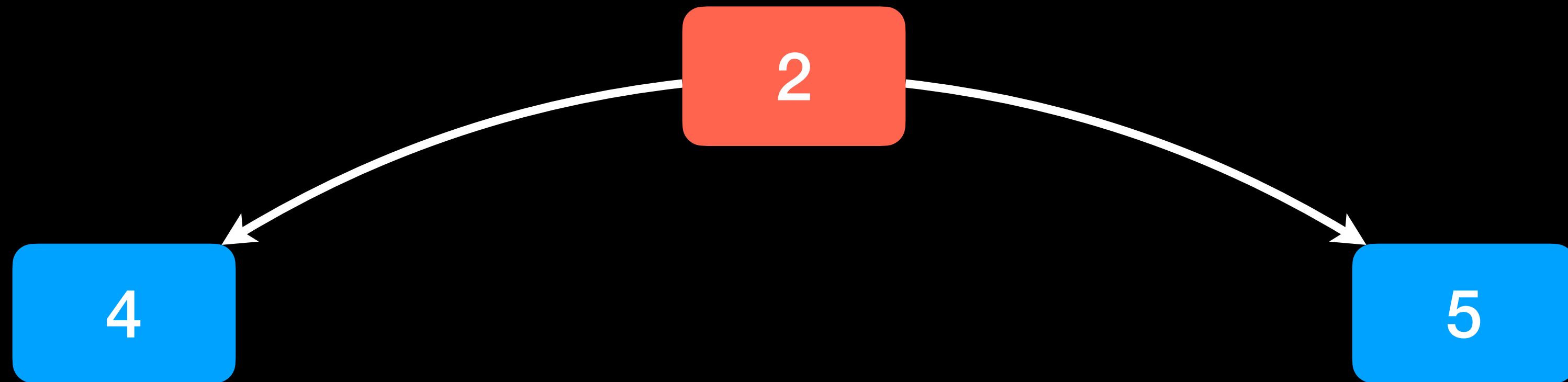
13

17

20

25

# Extract one element



*A.heap-size = 3*

*A.length = 9*

7

8

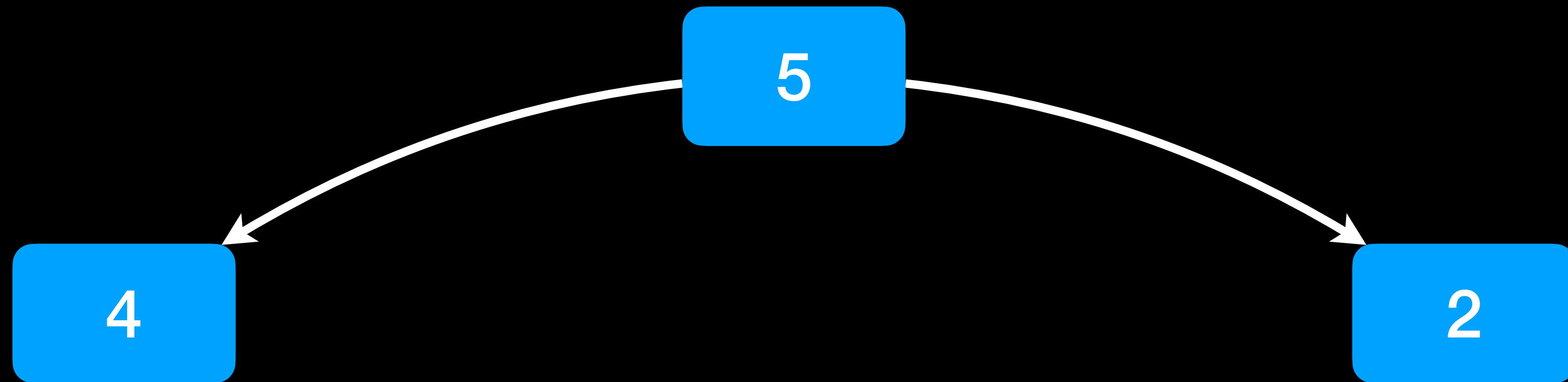
13

17

20

25

# MAX-HEAPIFY



*A.heap-size = 3*

*A.length = 9*

7

8

13

17

20

25

# Extract one element



*A.heap-size = 2*  
*A.length = 9*



# MAX-HEAPIFY



*A.heap-size = 2*  
*A.length = 9*



# Extract one element

2

*A.heap-size = 1*  
*A.length = 9*

4

5

7

8

13

17

20

25



# Finished

2

4

5

7

8

13

17

20

25

*A.heap-size = 0*

*A.length = 9*

# Emergency Queue

- Assume that the priority queue in an hospital emergency ward is implemented using heaps. Draw the heap that results after each of the steps on the following slide.

# 急诊室队列

- 假设医院急诊病房中的优先级队列是使用堆来实现的。绘制每个下一张幻灯片上步骤后的结果堆。

# Emergency Queue

1. Patient A arrives with urgency 7.
2. Patient B arrives with urgency 3.
3. Patient C arrives with urgency 5.
4. The doctor calls one patient for treatment.
5. Patient D arrives with urgency 8.
6. The doctor calls one patient for treatment.
7. Patient E arrives with urgency 4.
8. Patient B leaves the hospital without treatment.
9. The urgency of patient E changes to 6.
10. The doctor calls one patient for treatment.
11. The doctor calls one patient for treatment.

# 急诊室队列

1. 病人 A 到达记者们，紧急度7。
2. 病人 B 到达记者们，紧急度3。
3. 病人 C 到达记者们，紧急度5。
4. 医生叫一个病人来治疗。
5. 病人 D 到达记者们，紧急度8。
6. 医生叫一个病人来治疗。
7. 病人 E 到达记者们，紧急度4。
8. 病人 B 未经治疗就出院了。
9. 病人 E 的紧急度增加到6。
10. 医生叫一个病人来治疗。
11. 医生叫一个病人来治疗。

# Patient A arrives

7 / A

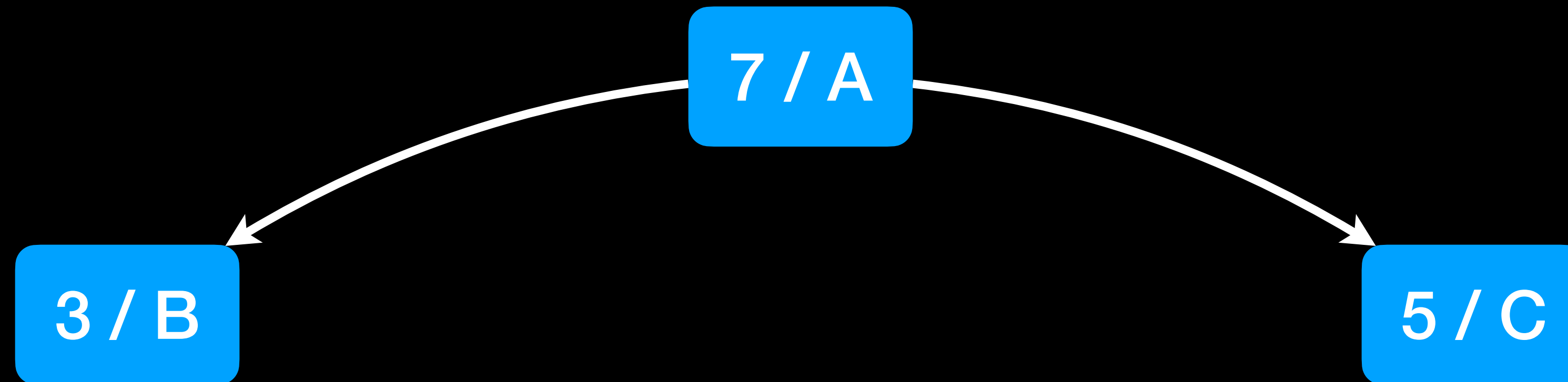
*A.heap-size = 1*

# Patient B arrives



*A.heap-size = 2*

# Patient C arrives



*A.heap-size = 3*

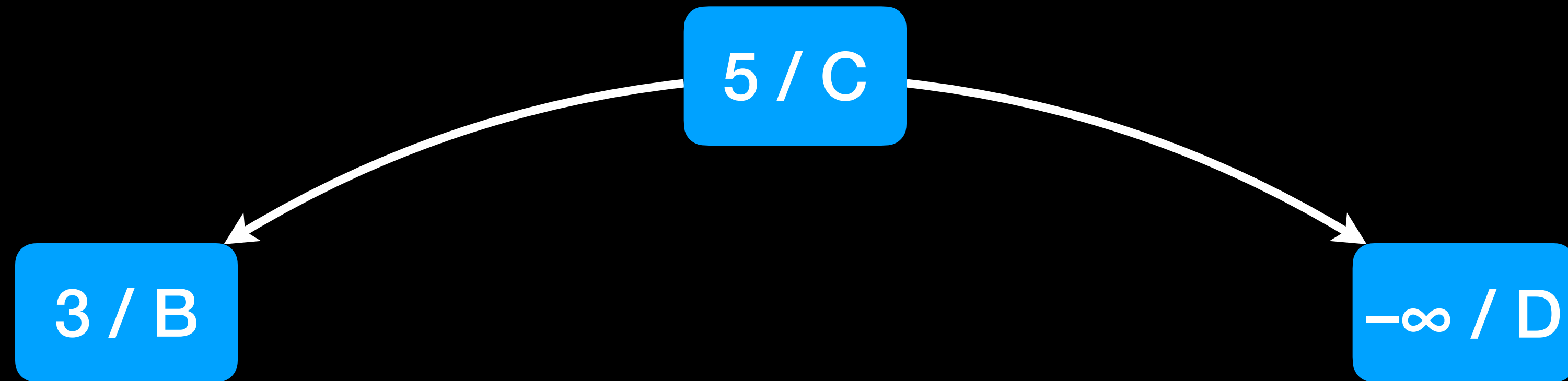
# The doctor calls one patient



*A.heap-size = 2*

7 / A

# Patient D arrives

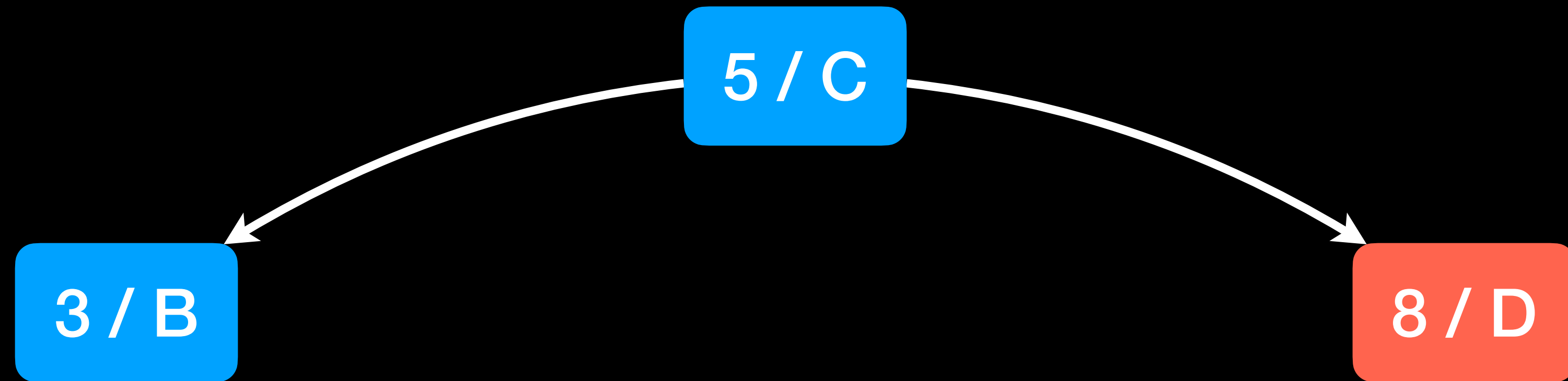


*A.heap-size = 3*

7 / A



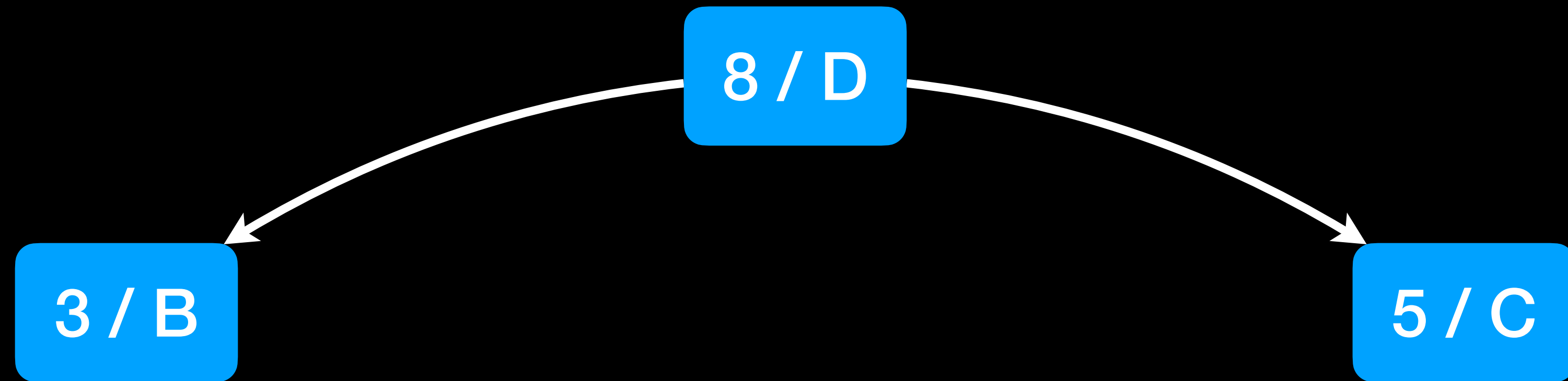
# HEAP-INCREASE-KEY



*A.heap-size = 3*

7 / A

# HEAP-INCREASE-KEY



*A.heap-size = 3*

7 / A

# The doctor calls one patient

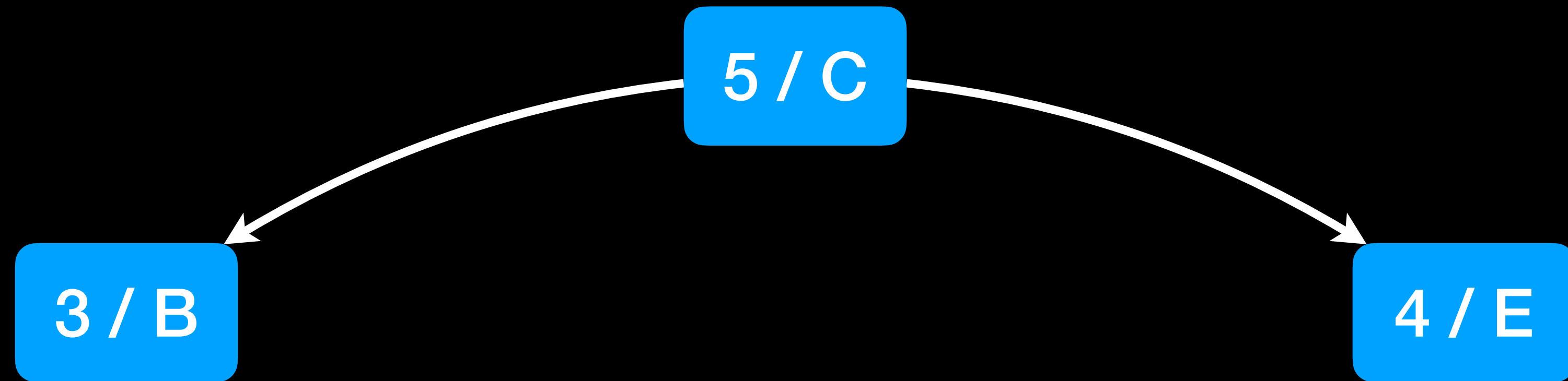


*A.heap-size = 2*

7 / A

8 / D

# Patient E arrives

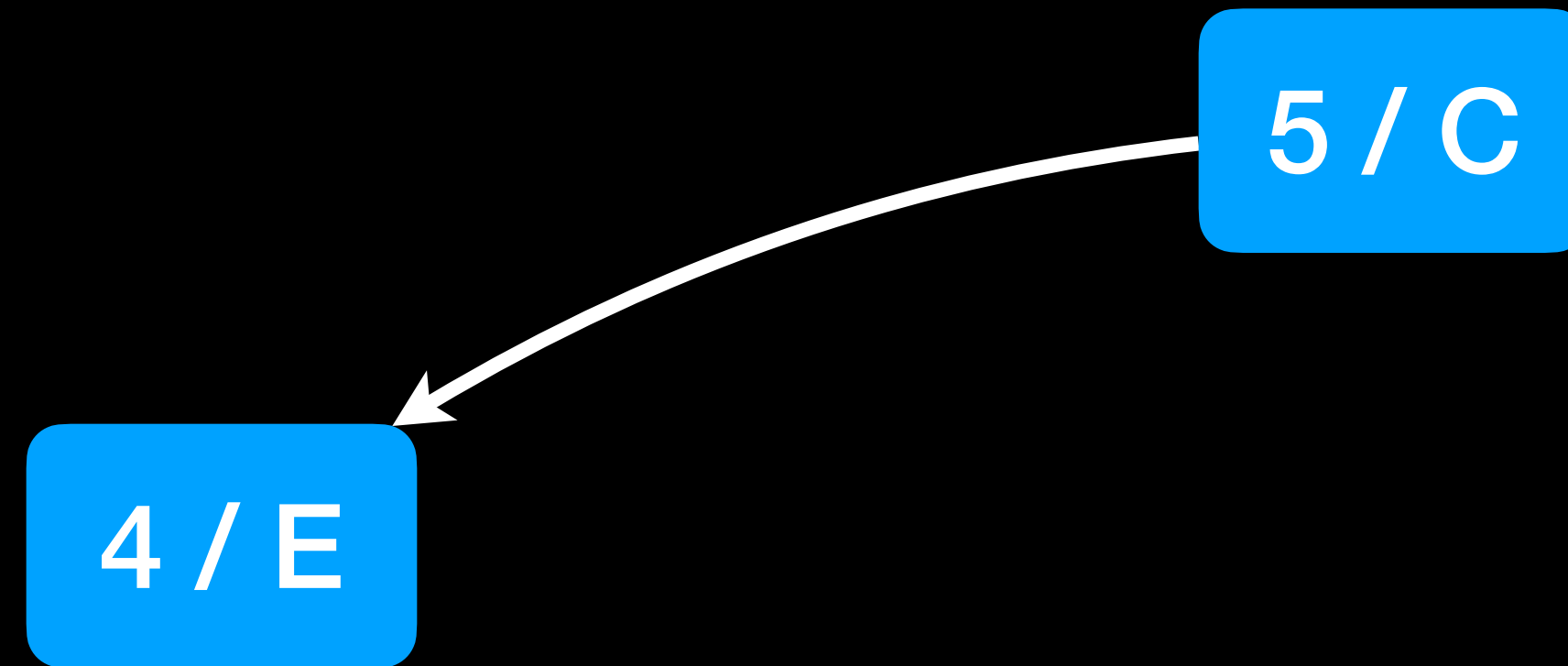


*A.heap-size = 3*

7 / A

8 / D

# Patient B leaves



*A.heap-size = 2*

7 / A

8 / D

# Patient E becomes more urgent



*A.heap-size = 2*

7 / A

8 / D

# HEAP-INCREASE-KEY



*A.heap-size = 2*

7 / A

8 / D

# The doctor calls one patient

5 / C

*A.heap-size = 1*

7 / A

8 / D

6 / E



# The doctor calls one patient

*A.heap-size = 0*

7 / A

8 / D

6 / E

5 / C

# Quicksort

# 快速排序

# Quicksort

- Divide-and-Conquer algorithm:
  1. partition the array into “small” and “large” elements
  2. sort “small” elements recursively
  3. sort “large” elements recursively
- What definition of “small” and “large” is general enough to apply to every array?
  - ➡ smaller/larger than a **sample** from the array, called **pivot**

# 快速排序

- 分析策略算法：
  1. 把数组划分  
找到“小的”和“大的”元素
  2. 递归排序“小的”元素
  3. 递归排序“大的”元素
- 什么“小”和“大”的定义是通用的，  
这样可以用在所有的数组？
  - ➡ 小于/大于一个数组中的**示例元素**，  
成为**主元**（pivot = 枢轴）。

# Partition example

# 划分的例子

2

9

12

1

4

11

8

6

# Choose pivot

# 选主元



pivot/主元

$\leq$  pivot  $\geq$  pivot

# Find small element

# 找到小的元素

2

9

12

1

4

11

8

6

$\leq$  pivot

$\geq$  pivot

pivot/主元

# Find large element

# 找到大的元素

2

9

12

1

4

11

8

6

$\leq$  pivot

$\geq$  pivot

pivot/主元

# Find large element

# 找到大的元素





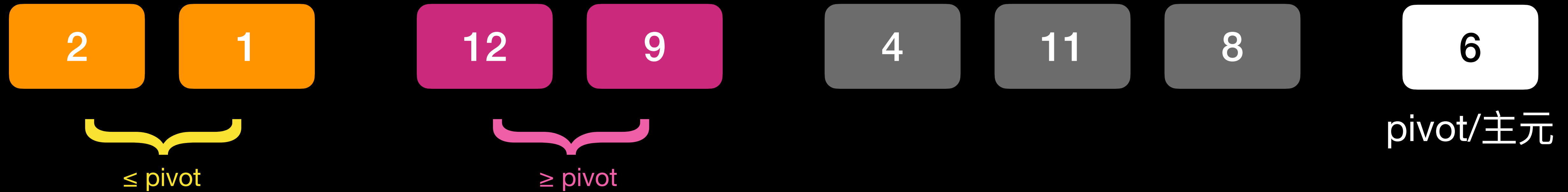
# Find small element

# 找到小的元素



# Find small element

# 找到小的元素



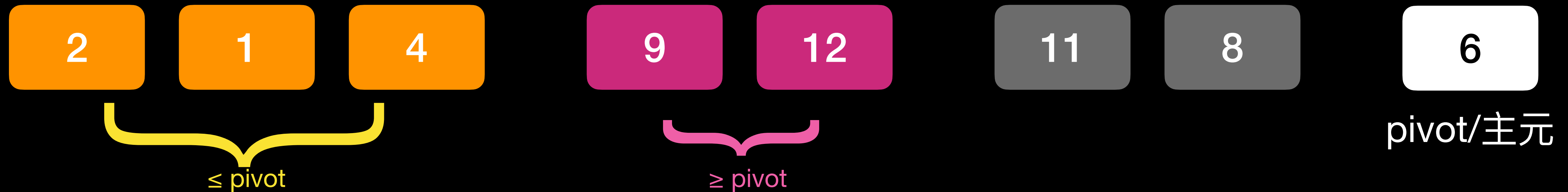
# Find small element

# 找到小的元素



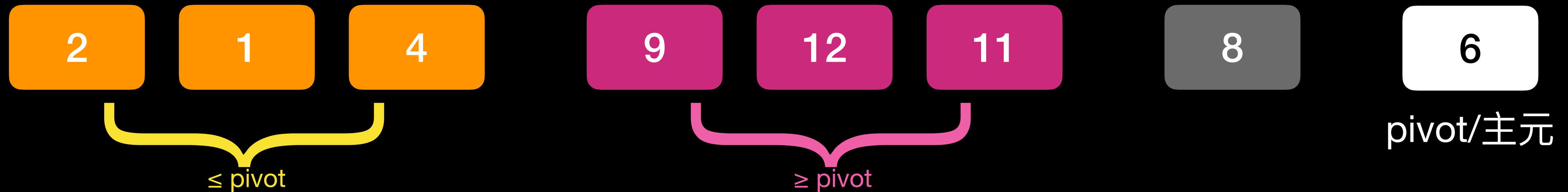
# Find large element

# 找到大的元素



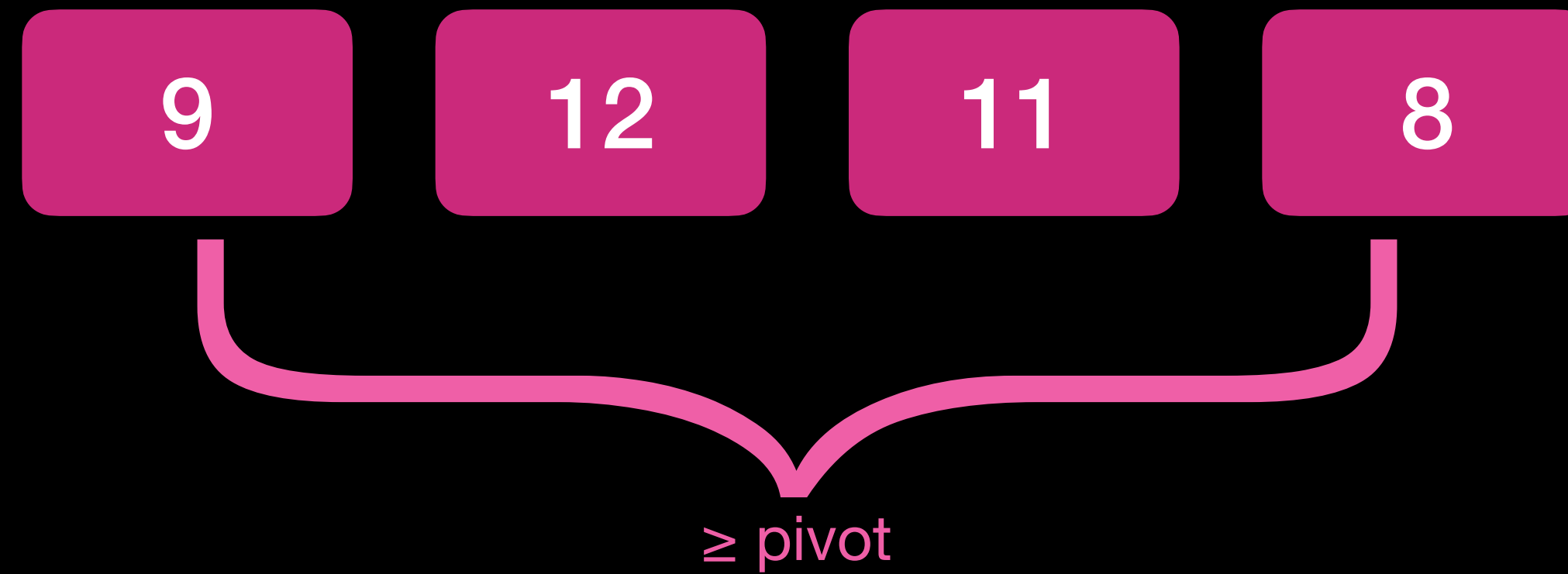
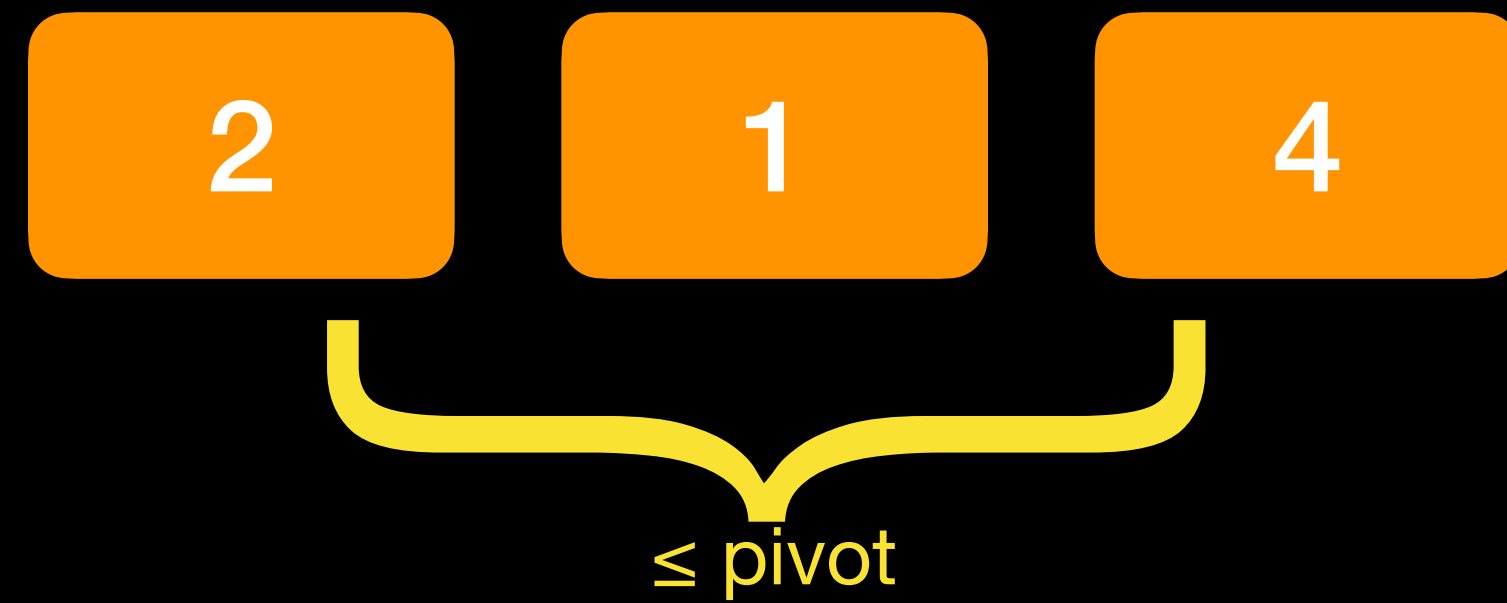
# Find large element

# 找到大的元素



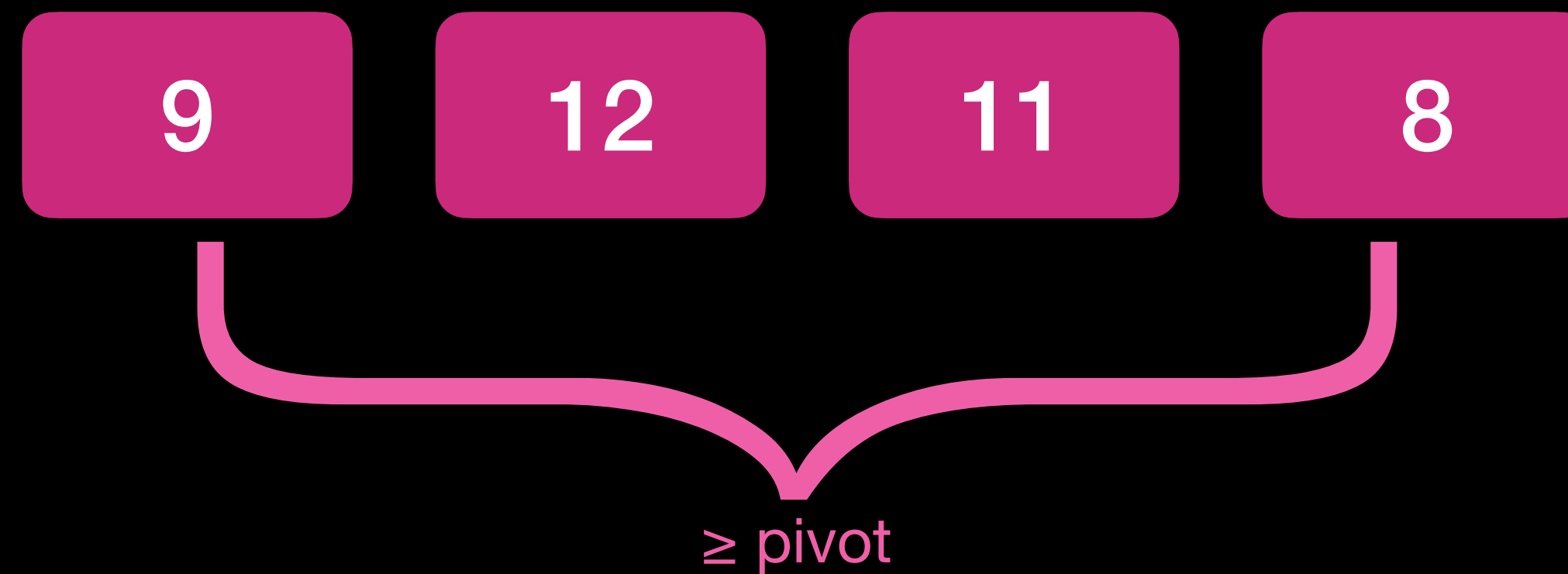
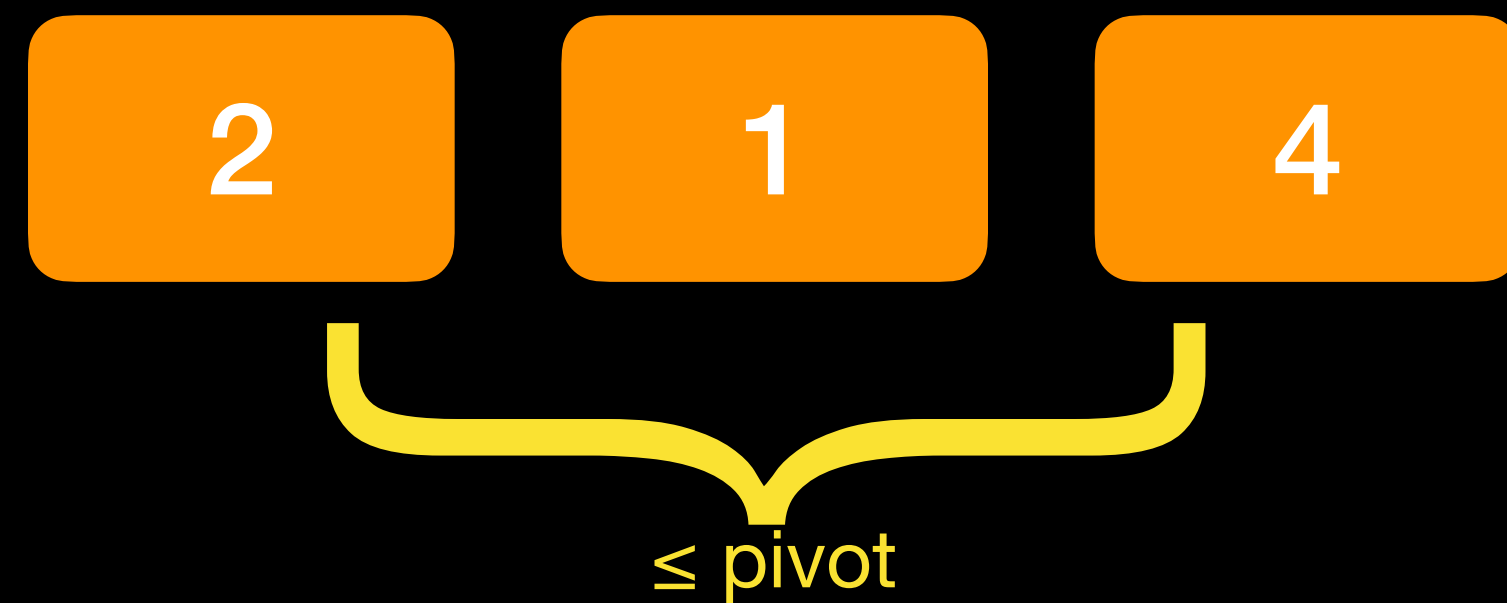
# Find large element

# 找到大的元素

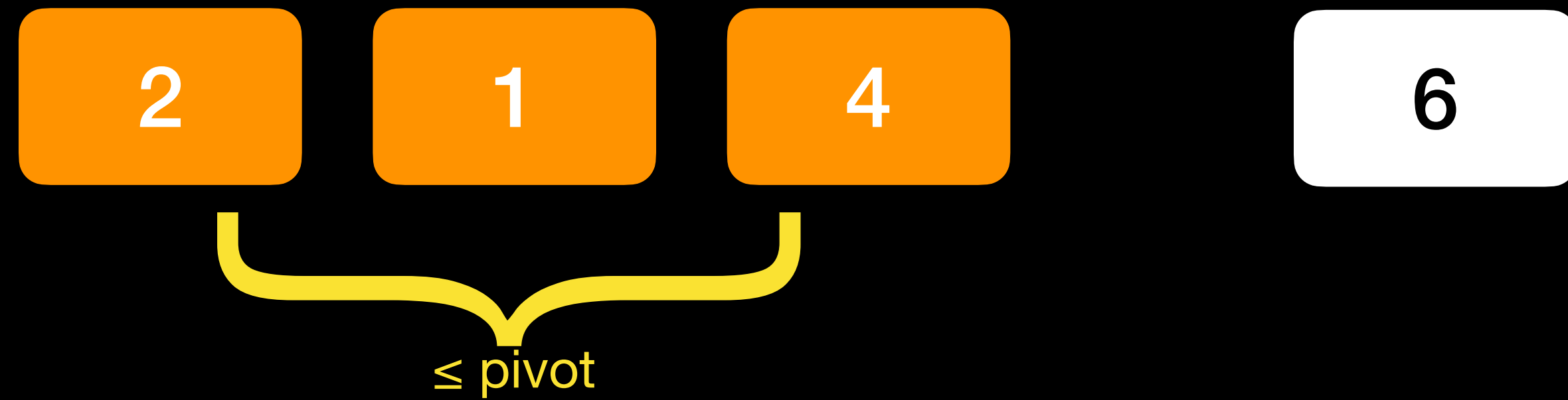


# Place pivot correctly

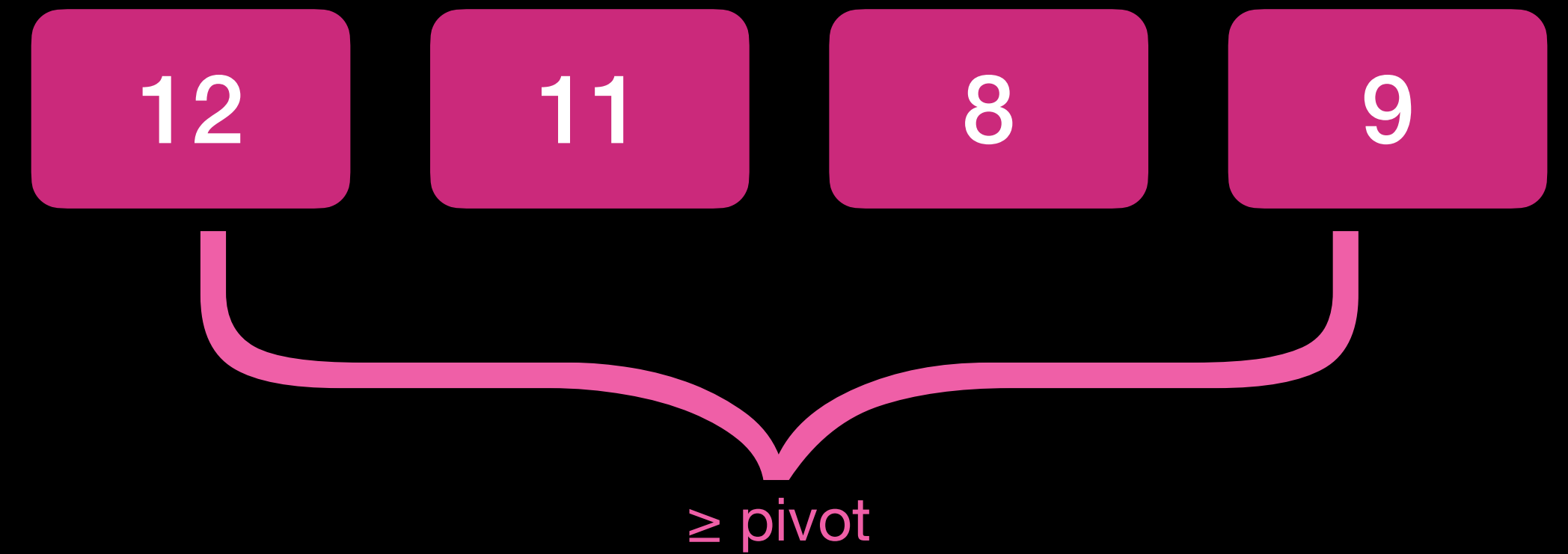
# 校正主元的位置



# Partition finished



# 划分结束





# PARTITION

```
PARTITION(A, first, last) // partition A[first] ... A[last]  
pivot = A[last]  
last-small = first - 1 // last of the small elements  
for j = first to last - 1  
    if A[j] ≤ pivot  
        last-small = last-small + 1  
        Exchange A[last-small] with A[j]  
Exchange A[last-small + 1] with A[last]  
return last-small + 1 // return new position of pivot
```

*A[first] ... A[last-small]* 都是 ≤ *pivot*.  
*A[last-small+1] ... A[j-1]* 都是 ≥ *pivot*.  
*A[last]* = *pivot*.

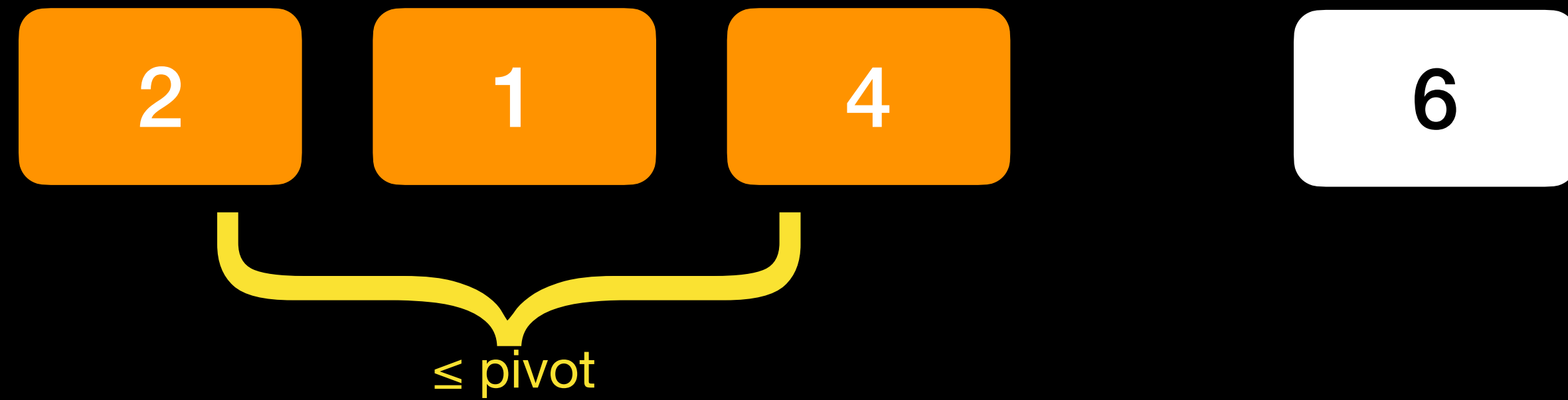
# PARTITION

- Specification: PARTITION returns a value *mid* with the property:  
PARTITION permutes the elements of  $A[first] \dots A[last]$  such that
  - $A[first] \dots A[mid-1]$  are all  $\leq A[mid]$
  - $A[mid+1] \dots A[last]$  are all  $\geq A[mid]$
- PARTITION runs in time  $O(last-first+1)$ .

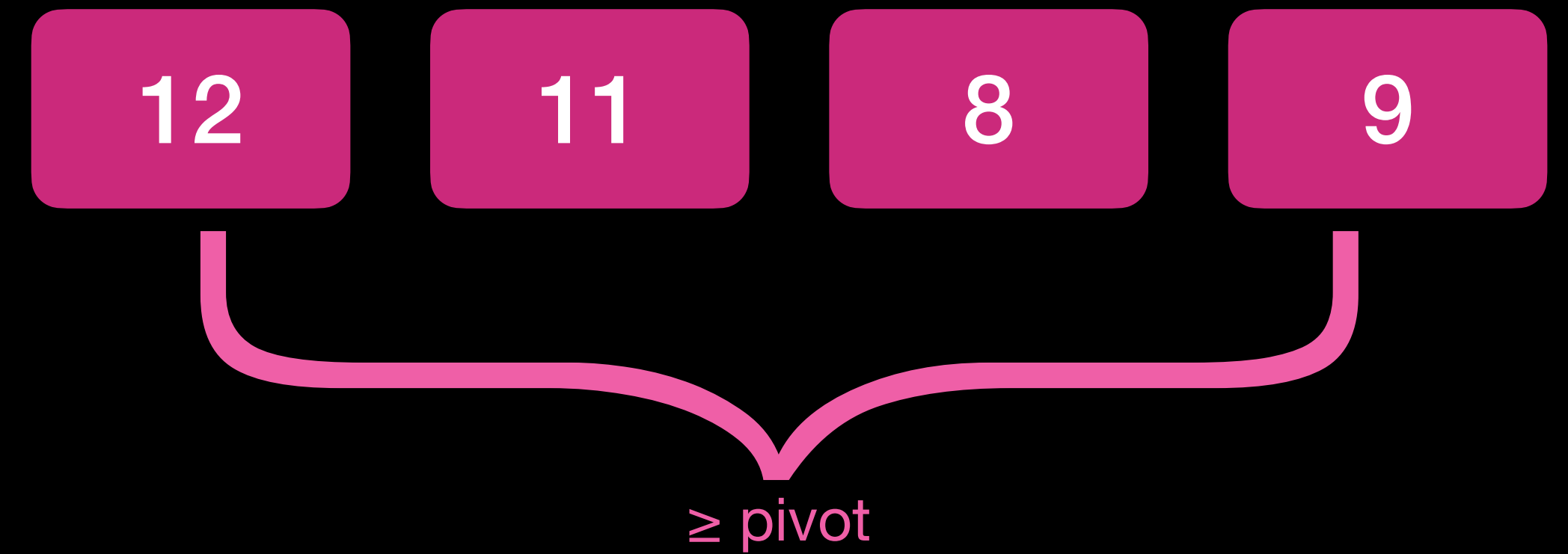
# QUICKSORT

```
QUICKSORT(A, first, last)  // sort A[first] ... A[last]  
if first < last  
    mid = PARTITION(A, first, last)  
    QUICKSORT(A, first, mid−1)  
    QUICKSORT(A, mid+1, last)
```

# Partition finished



# 划分结束



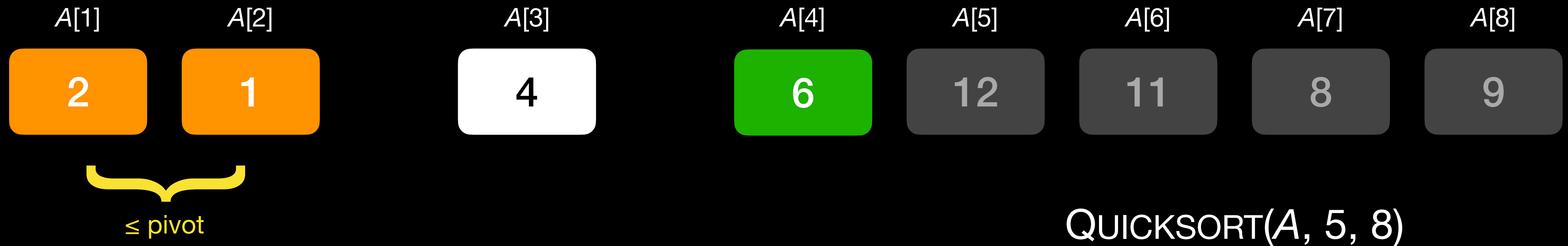
# Partition finished

# 划分结束



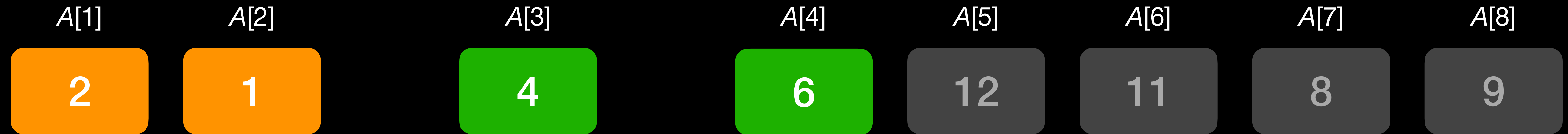
# Quicksort left part

# 排序左边的部分



# Quicksort left part

# 排序左边的部分

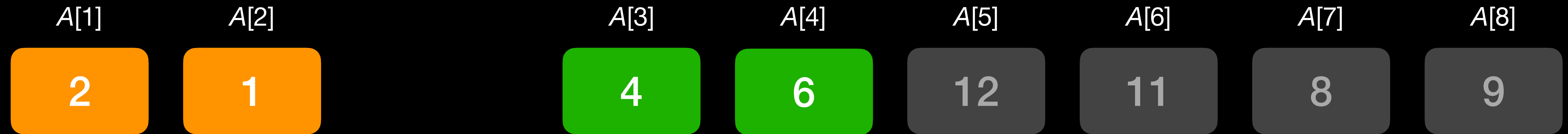


QUICKSORT(A, 1, 2)

QUICKSORT(A, 5, 8)

# Quicksort left part

# 排序左边的部分



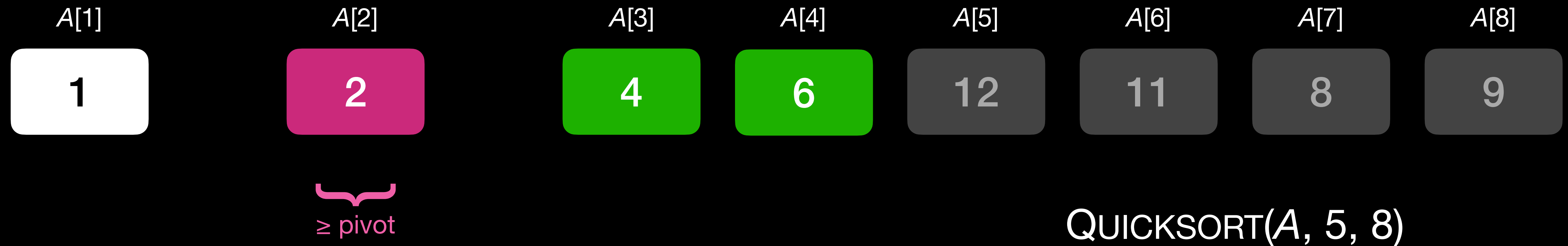
QUICKSORT(A, 1, 2)

QUICKSORT(A, 5, 8)



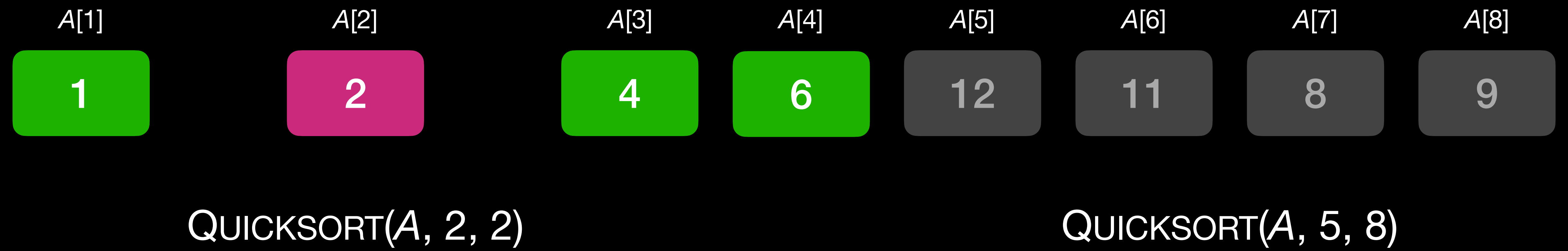
# Quicksort left part

# 排序左边的部分



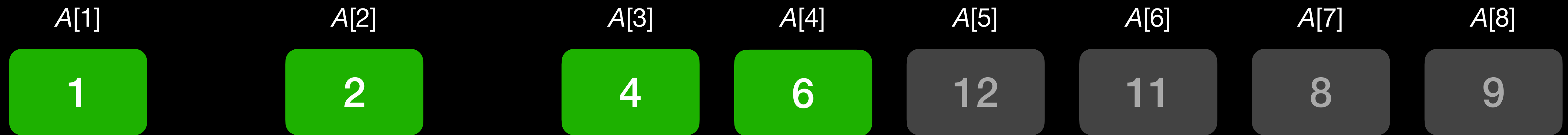
# Quicksort left part

# 排序左边的部分



# Quicksort left part

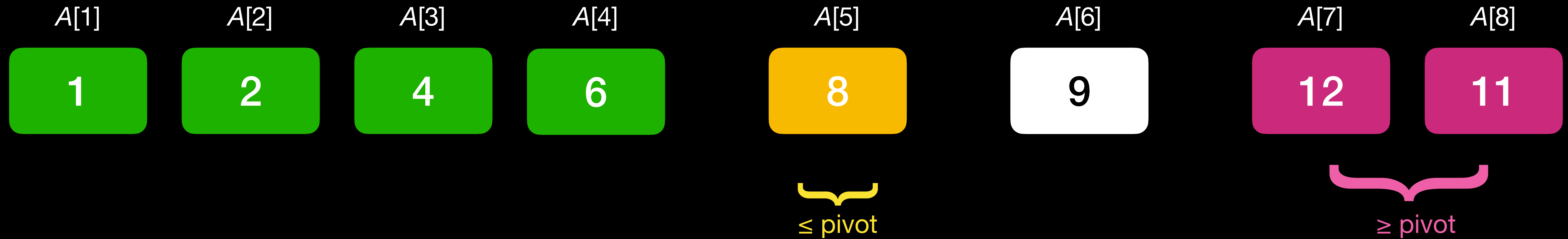
# 排序左边的部分



QUICKSORT(A, 5, 8)

# Quicksort right part

# 排序右边的部分



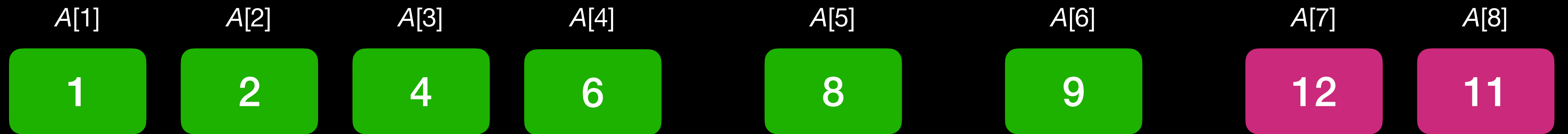
Quicksort right part

排序右边的部分



# Quicksort right part

# 排序右边的部分



QUICKSORT( $A$ , 7, 8)

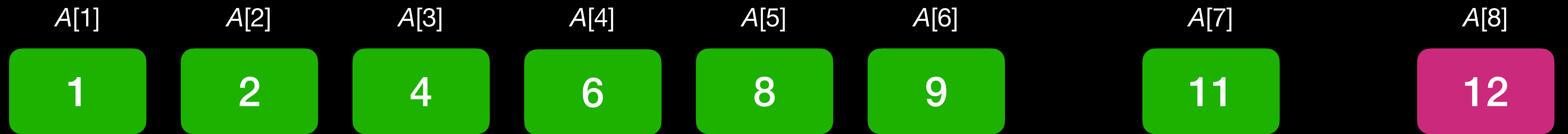
# Quicksort right part

# 排序右边的部分



# Quicksort right part

# 排序右边的部分



QUICKSORT(A, 8, 8)



# Quicksort right part

# 排序右边的部分

A[1]	A[2]	A[3]	A[4]	A[5]	A[6]	A[7]	A[8]
1	2	4	6	8	9	11	12

# Quicksort: timing

- Worst-case outcome of PARTITION:  
all elements  $\leq$  pivot  
(or all elements  $\geq$  pivot)

$$T(n) = T(n-1) + \Theta(n)$$

$$\hookrightarrow T(n) = \Theta(n + n-1 + n-2 + \dots) = \Theta(n^2)$$

- Best-case outcome of Partition:  
50%  $\leq$  pivot, 50%  $\geq$  pivot

$$T(n) = 2T((n-1)/2) + \Theta(n)$$

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

# 快速排序：运行时间

- 最差的PARTITION的结果：  
所有的元素  $\leq$  主元  
(或者所有的元素  $\geq$  主元)

$$T(n) = T(n-1) + \Theta(n)$$

$$\hookrightarrow T(n) = \Theta(n + n-1 + n-2 + \dots) = \Theta(n^2)$$

- 最优的PARTITION的结果：  
50%  $\leq$  主元, 50%  $\geq$  主元

$$T(n) = 2T((n-1)/2) + \Theta(n)$$

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

# Quicksort: timing

- Expected time?
- To get a running time close to the worst case, almost all calls to PARTITION have to be close to the worst case.
- Probability that most calls to PARTITION are bad is very small.
- Therefore, the expected time is in  $O(n \log n)$ .
- Please read “Intuition for the average case” in Section 7.2.  
It is not necessary to read detailed Section 7.4.

# 快速排序：运行时间

- 平均运行时间？
- 为了使运行时间接近最坏的情况，几乎所有对PARTITION的调用都必须接近最坏情况。
- 大多数对PARTITION的调用都是坏的概率非常小。
- 因此，预期时间为  $O(n \log n)$ 。
- 请阅读第7.2节中的“对于平均情况的直观观察”。无需阅读第7.4节的详细内容。

# Summary of Comparison Sort Algorithms

排序

# Sort Algorithms

# 各种排序算法

Name 名称	Running time 运行时间	Stable? 稳定?	In-place? 原址?
Insertion Sort 插入排序	best-case: $\Theta(n)$ worst-case: $\Theta(n^2)$	Yes	是
Selection Sort 选择排序	$\Theta(n^2)$	否	Yes
Merge Sort 合并排序	$O(n \log n)$	是	No
Heapsort 堆排序	$O(n \log n)$	否	Yes
Quicksort 快速排序	worst-case: $\Theta(n^2)$ expected: $\Theta(n \log n)$	No	是*

# Sort Algorithms

- An algorithm is **stable** if it keeps the order of elements with equal keys.  
(important, for example, for multiple patients with the same urgency in the emergency ward)
- An algorithm is **in-place** if it only uses  $O(1)$  additional memory.
  - \* (Quicksort actually uses  $O(\log n)$  memory for the recursive calls, but that is mostly ignored.)

# 各种排序算法

- 排序算法称为**稳定的**：相同之的元素在输出数组中的相对次序与他们在输入中的次序相同。  
(例如：急诊室里可能有多个同样紧急的病人)
- 排序算法称为**原址的**：除了输入数组以外仅需要 $O(1)$ 大的存储。
  - \* (因为快速排序是递归算法，实际使用  $O(\log n)$  大的存储，大部分选择忽略这个情况。)

# Sort Algorithms

# 各种排序算法

- For small arrays, use insertion sort.
- In practice quicksort is mostly the fastest algorithm (for large arrays); heapsort takes about 2× the time of quicksort.
- If it is acceptable that (very seldomly) a sort operation takes a longer  $O(n^2)$  time, I suggest to use quicksort.
- Heapsort can be used as a fallback if time  $O(n \log n)$  must be guaranteed.

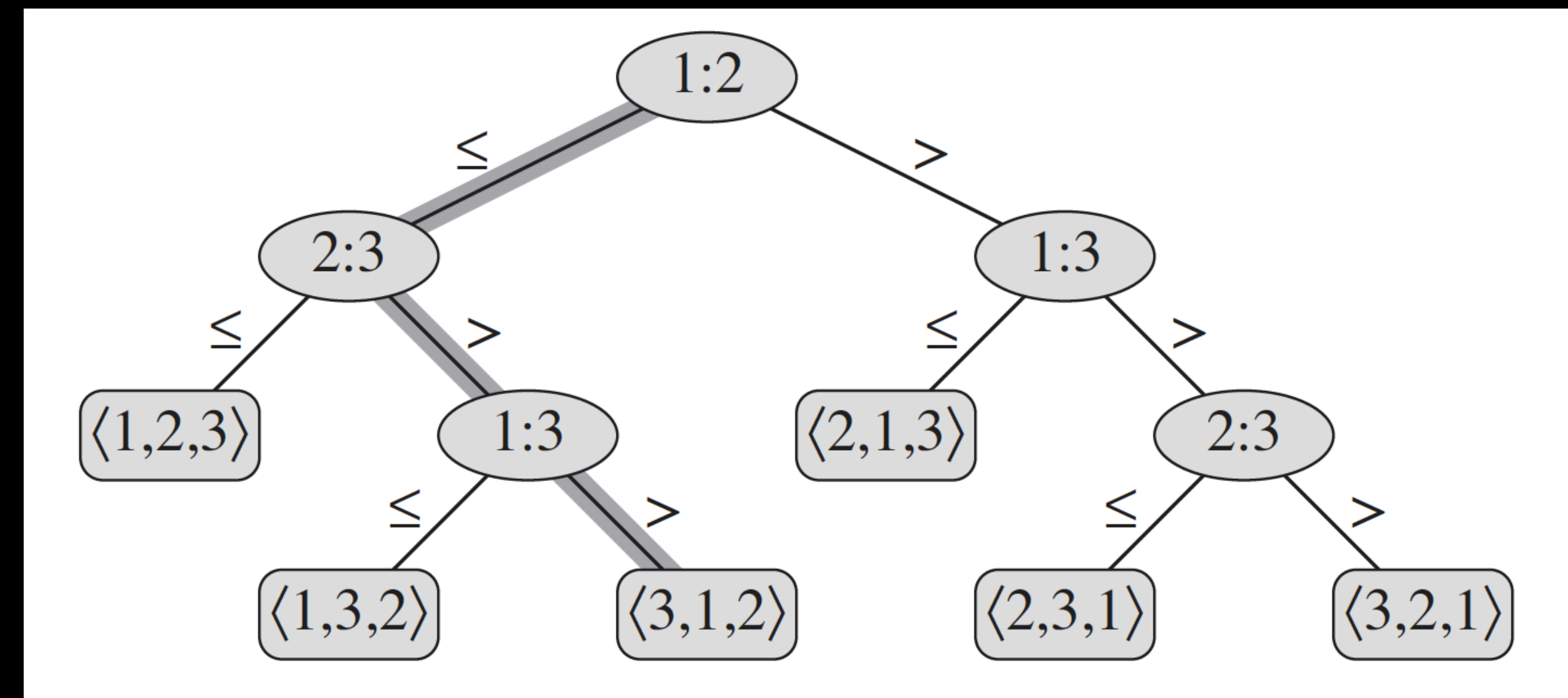
# Comparison Sort

- What is the lowest possible bound for sorting algorithms?
- We assume that no additional information is given beforehand. The algorithm must allow every permutation as a possible result.
- decision tree
- 排序算法的最低可能界限是什么?
- 假设事先没有提供任何额外信息。  
算法必须允许每个排列作为可能的结果。

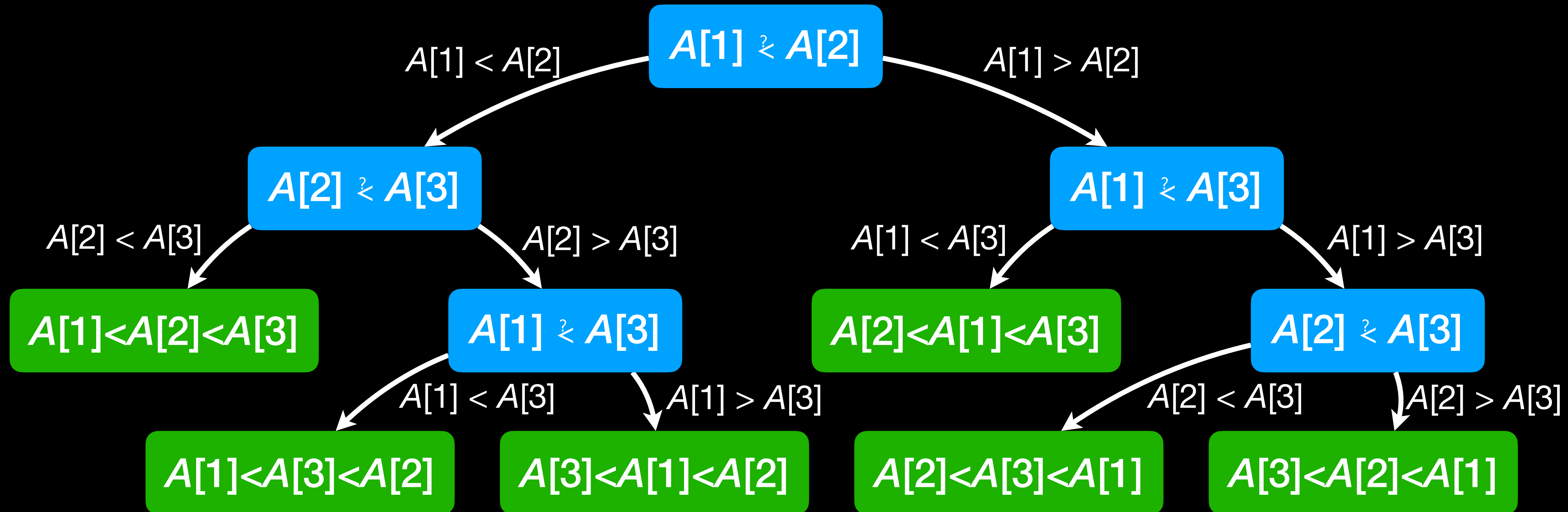


# Decision tree

- Every comparison of  $A[i]$  with  $A[j]$  allows two outcomes:  $A[i] < A[j]$  or  $A[i] > A[j]$
- Decision tree := A (complete) binary tree that represents the comparisons between elements that are performed by a particular sorting algorithm operating on an input of a given size.

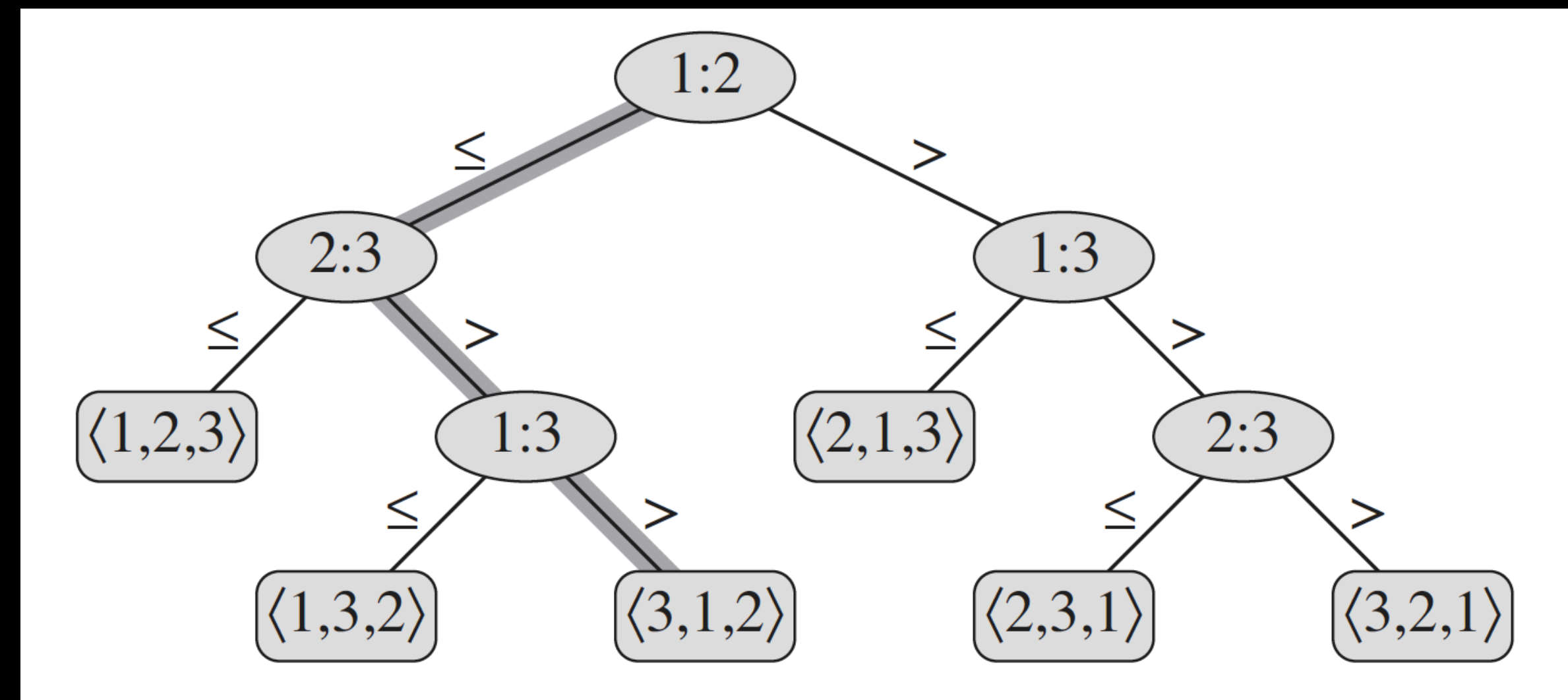


# Decision tree



# Decision tree

- A tree with height  $h$  has at most  $2^h$  leaves. The height in the decision tree indicates the number of comparisons.
- $n$  elements have  $n!$  permutations. Every permutation must appear at least once.  $\Rightarrow 2^h \geq n! \Rightarrow h \geq \lg n! = \Omega(n \log n)$ .
- A sort algorithm must make at least  $\Omega(n \log n)$  comparisons in the worst case.



# Sorting in Linear Time

线性时间的排序

# Use additional information!

- Counting sort:  
elements are in a small set  $\{0, 1, \dots, k\}$ .
- Radix sort:  
elements are tuples from a small set  $\{0, 1, \dots, k\}^d$ .
- ~~Bucket sort:~~  
~~elements are uniformly distributed in~~  
 ~~$[0, 1]$ .~~

# Counting Sort

- Idea: Because the elements are in a small set  $\{0, \dots, k\}$ , we can count how many elements have a certain value.
- If there are  $j$  elements  $\leq A[i]$ , then  $A[i]$  should be moved to  $A[j]$  (with a small change if multiple elements have the same value).

# Counting sort

Counting-Sort( $A, B, k$ )

Let  $C[0 \dots k]$  be a new array

Initialize every element of  $C$  to 0

**for**  $j = 1$  **to**  $A.length$

$C[A[j]] = C[A[j]] + 1$

**for**  $i = 1$  **to**  $k$

$C[i] = C[i] + C[i-1]$

**for**  $j = A.length$  **downto** 1

$B[C[A[j]]] = A[j]$

$C[A[j]] = C[A[j]] - 1$

- input: array  $A$ , containing elements in  $\{0, \dots, k\}$
- output: array  $B$
- additional array  $C$  is used to count how many elements are  $\leq$  a value.

# Counting Sort

	1	2	3	4	5	6	7	8
<i>A</i>	2	5	3	0	2	3	0	3

	0	1	2	3	4	5
<i>C</i>	2	0	2	3	0	1

C after first for loop:  
 $C[i]$  = number of  
elements with value  $i$

	0	1	2	3	4	5
<i>C</i>	2	2	4	7	7	8

C after second for loop:  
 $C[i]$  = number of  
elements with value  $\leq i$



# Counting Sort

	1	2	3	4	5	6	7	8
<i>A</i>	2	5	3	0	2	3	0	3

	1	2	3	4	5	6	7	8
<i>B</i>							3	

	0	1	2	3	4	5
<i>C</i>	2	2	4	6	7	8

# Counting Sort

	1	2	3	4	5	6	7	8
<i>A</i>	2	5	3	0	2	3	0	3

	1	2	3	4	5	6	7	8
<i>B</i>		0					3	

	0	1	2	3	4	5
<i>C</i>	1	2	4	6	7	8

# Counting Sort

	1	2	3	4	5	6	7	8
<i>A</i>	2	5	3	0	2	3	0	3

	1	2	3	4	5	6	7	8
<i>B</i>		0				3	3	

	0	1	2	3	4	5
<i>C</i>	1	2	4	5	7	8

# Counting Sort

	1	2	3	4	5	6	7	8
<i>A</i>	2	5	3	0	2	3	0	3

	1	2	3	4	5	6	7	8
<i>B</i>		0		2		3	3	

	0	1	2	3	4	5
<i>C</i>	1	2	3	5	7	8

# Counting Sort

	1	2	3	4	5	6	7	8
<i>A</i>	2	5	3	0	2	3	0	3

	1	2	3	4	5	6	7	8
<i>B</i>	0	0		2		3	3	

	0	1	2	3	4	5
<i>C</i>	0	2	3	5	7	8

# Counting Sort

	1	2	3	4	5	6	7	8
<i>A</i>	2	5	3	0	2	3	0	3

	1	2	3	4	5	6	7	8
<i>B</i>	0	0		2	3	3	3	

	0	1	2	3	4	5
<i>C</i>	0	2	3	4	7	8

# Counting Sort

	1	2	3	4	5	6	7	8
<i>A</i>	2	5	3	0	2	3	0	3

	1	2	3	4	5	6	7	8
<i>B</i>	0	0		2	3	3	3	5

	0	1	2	3	4	5
<i>C</i>	0	2	3	4	7	7

# Counting Sort

	1	2	3	4	5	6	7	8
<i>A</i>	2	5	3	0	2	3	0	3

	1	2	3	4	5	6	7	8
<i>B</i>	0	0	2	2	3	3	3	5

	0	1	2	3	4	5
<i>C</i>	0	2	2	4	7	7



# Counting sort

- This variant of counting sort is stable.
- Running time:
  - initialize  $C$ :  $\Theta(k)$
  - first for loop:  $\Theta(n)$
  - second for loop:  $\Theta(k)$
  - third for loop:  $\Theta(n)$
  - total time:  $\Theta(n + k)$
- Memory needed:  $\Theta(n + k)$  — not in-place

# Radix Sort

# 基数排序

- Sorting numbers with many digits: one can sort by one digit at a time
- Because there are few possible values for one digit, use counting sort for every digit.
- Which digit to sort first?

# Radix Sort

329

457

657

839

436

720

355

# Radix Sort

Sort on the **most** significant digit first ?

5 tiles

3	29
3	55
4	57
4	36
6	57
7	20
8	39

# Radix Sort

Sort on the **most** significant digit first ?

7 tiles

329
355
436
457
657
720
839

# Radix Sort

Sort on the **most** significant digit first ?

7 tiles

329
355
436
457
657
720
839

If  $d$  digits, then  
 $10^d$  tiles in the worst case,  
and each tile needs to be  
sorted independently

# Radix Sort

Sort on the **least** significant digit first

720

355

436

457

657

329

839

# Radix Sort

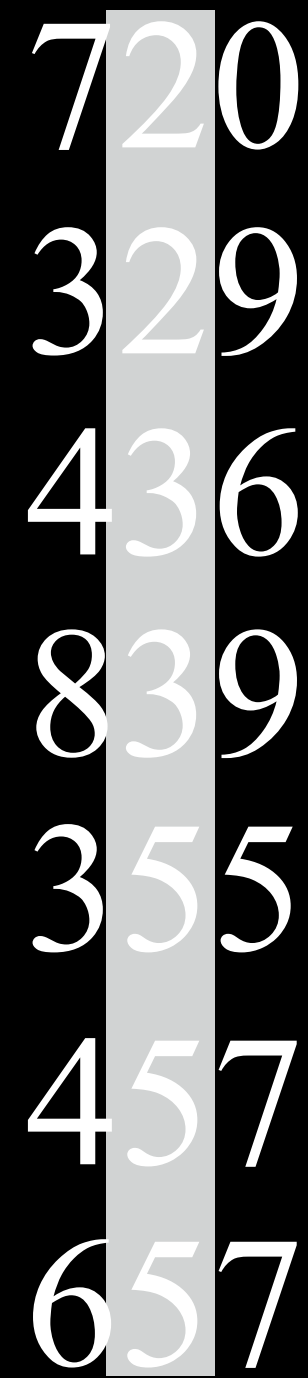
Sort on the **least** significant digit first

720
355
436
457
657
329
839



# Radix Sort

Sort on the **least** significant digit first



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

# Radix Sort

Sort on the **least** significant digit first

3	29
3	55
4	36
4	57
6	57
7	20
8	39

# Radix sort

RADIX-SORT( $A, d$ )

**for**  $i = 1$  **to**  $d$

Call a stable sort to sort  $A$  on digit  $i$

If  $j < k$ , then the digits  $i-1, \dots, 1$  of  $A[j]$  are  $\leq$  the digits of  $A[k]$ . If they are equal, then  $A[j]$  and  $A[k]$  are in the same order as in the original input.

# 基数排序

- input: array  $A$ , containing elements in  $\{0, \dots, k\}^d$
- output: sorted array  $A$

如果  $j < k$ , 则  $A[j]$  的数字  $i-1, \dots, 1$  小于等于  $A[k]$  的数字。  
如果它们相等, 则  $A[j]$  和  $A[k]$  的顺序与原始输入中的顺序相同。

# Radix sort

# 基数排序

- Suggest to use counting sort for the stable sort
- Running time:  
 $d \times$  running time of the sort algorithm.

If one uses counting sort,  $O(d(n + k))$ .

# Summary

- Heap data structure: a binary tree that satisfies the max-heap property  
堆的数据结构：满足最大堆性质的二叉树
- Main use of heap: heapsort  $O(n \log n)$ , priority queue  
堆的主要用途：堆排序，优先级队列
- Quicksort: in practice quickest known general sort algorithm;  
may with a very low probability be  $\Omega(n^2)$   
快速排序：在实践中已知的最快的通用排序算法（最坏运行时间 $\Omega(n^2)$ ，可能性很低）
- Sorting faster than  $O(n \log n)$  is only possible if one has additional information about the data.

# Open office

- I want to offer a time to ask questions every week.

# 开放时间

- 每周有时间可以问我问题。