

# **Data Structures & Algorithms**

**Subodh Kumar**

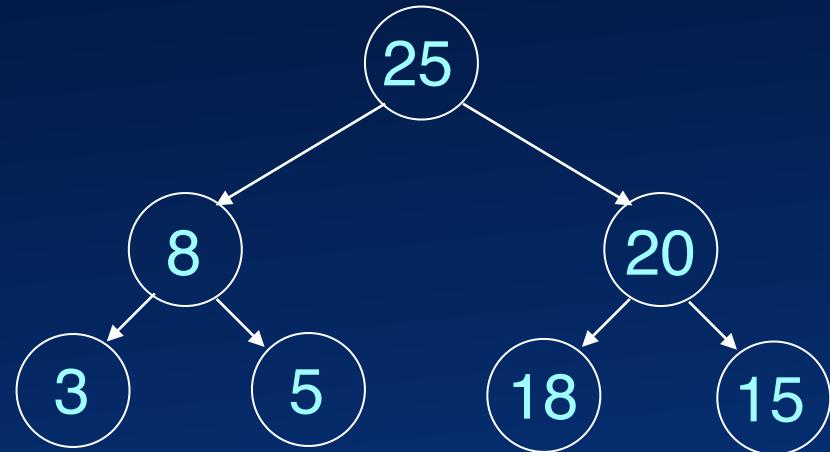
**([subodh@iitd.ac.in](mailto:subodh@iitd.ac.in), Bharti 422)**

**Dept of Computer Sc. & Engg.**



# Heap

- Left-complete tree
- Comparable keys
- “Top” key in the root
  - For every subtree

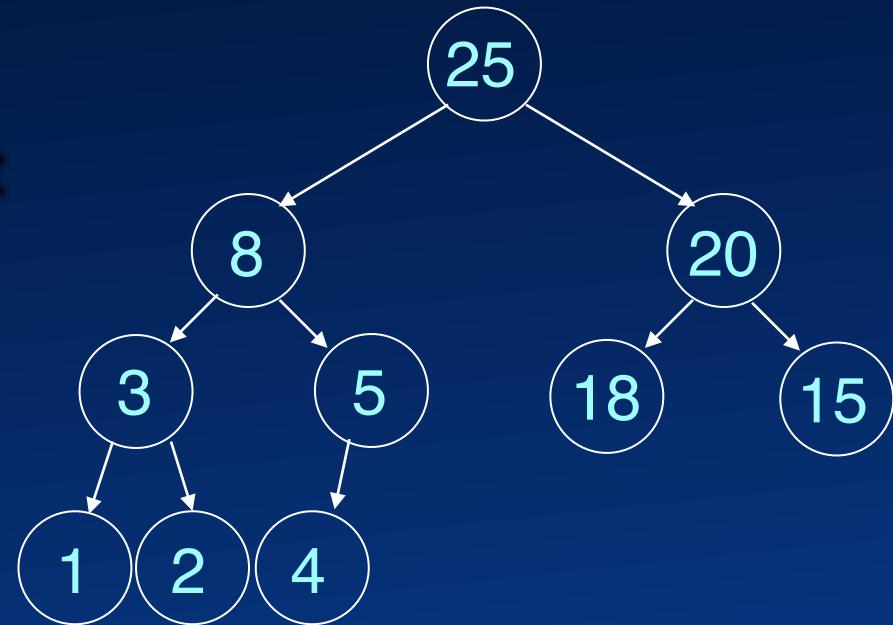


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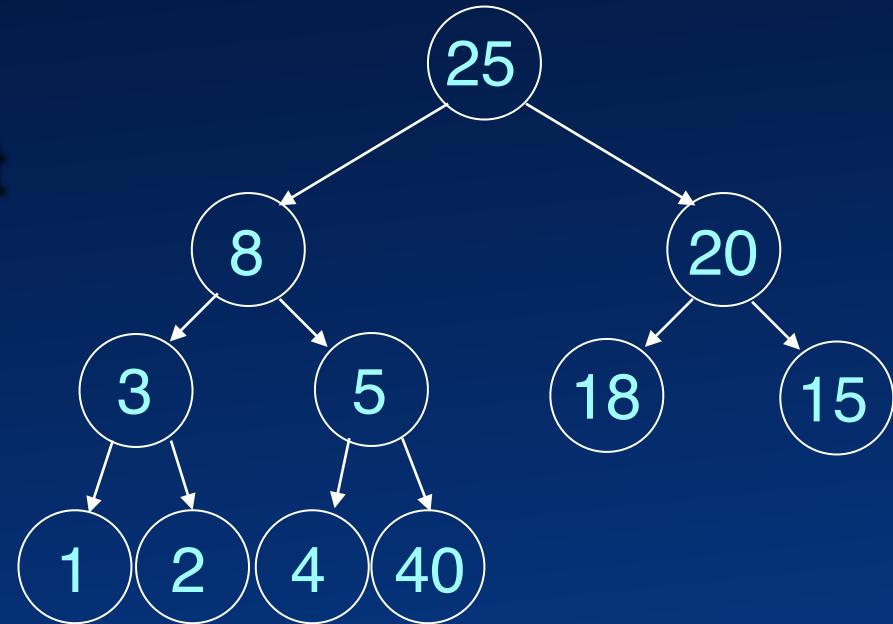


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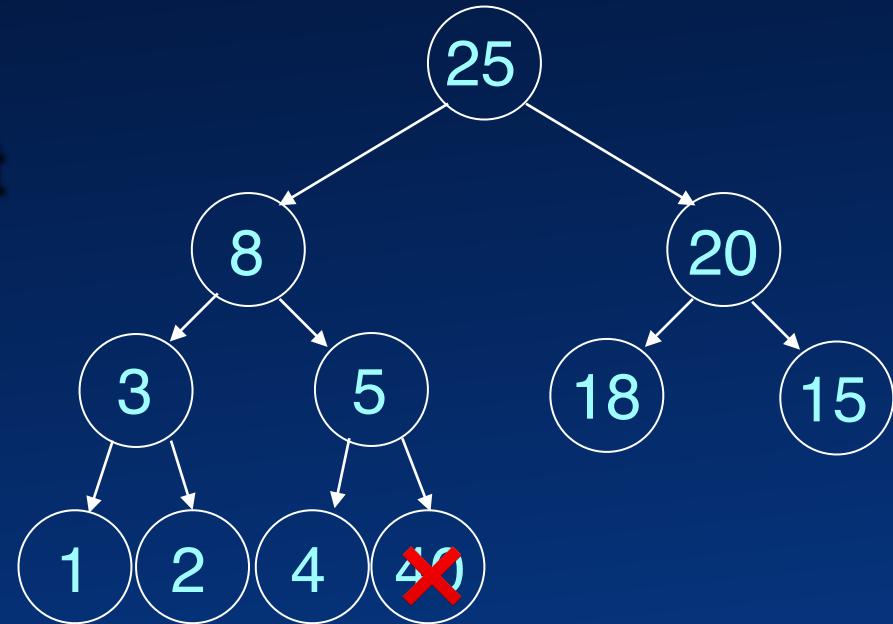


Heap



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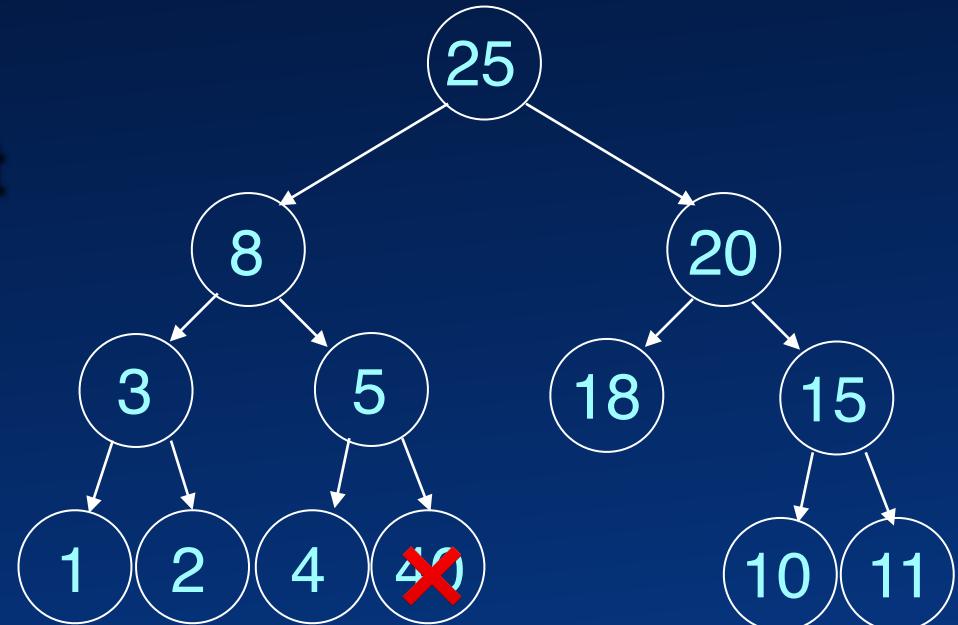


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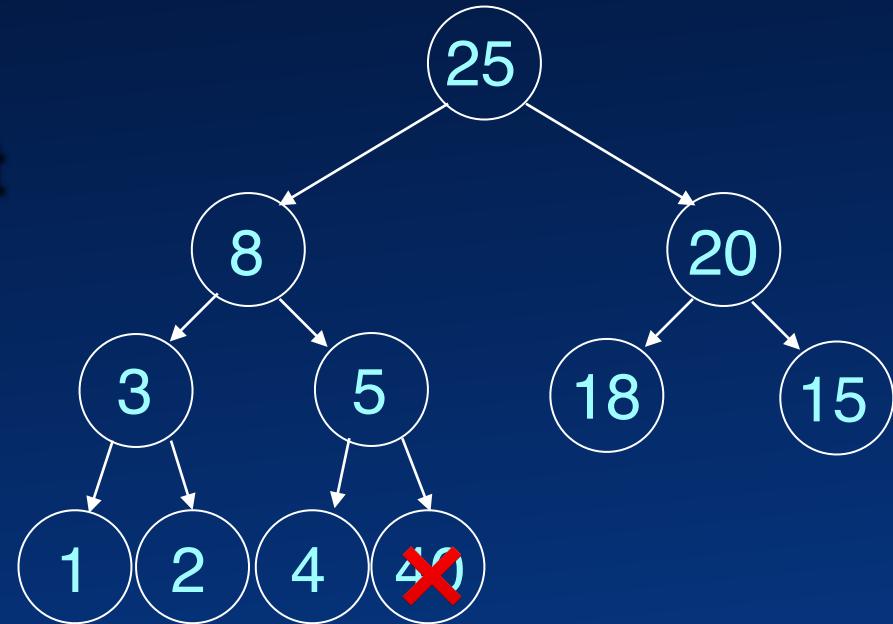


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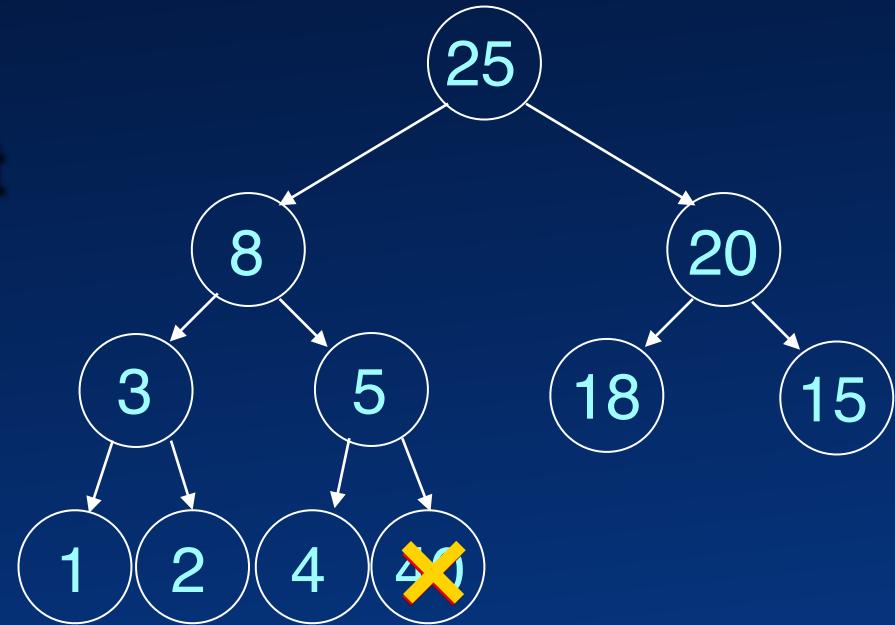


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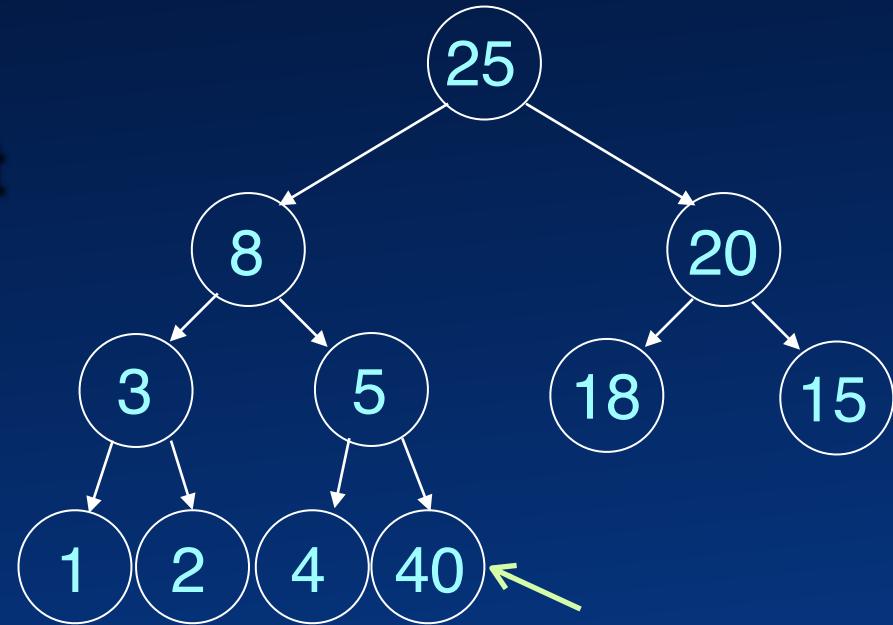


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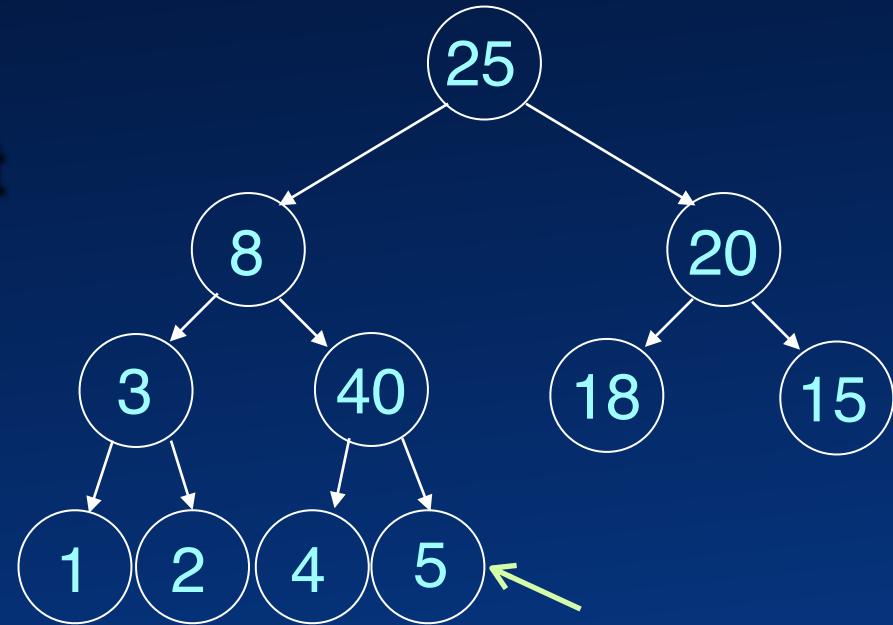


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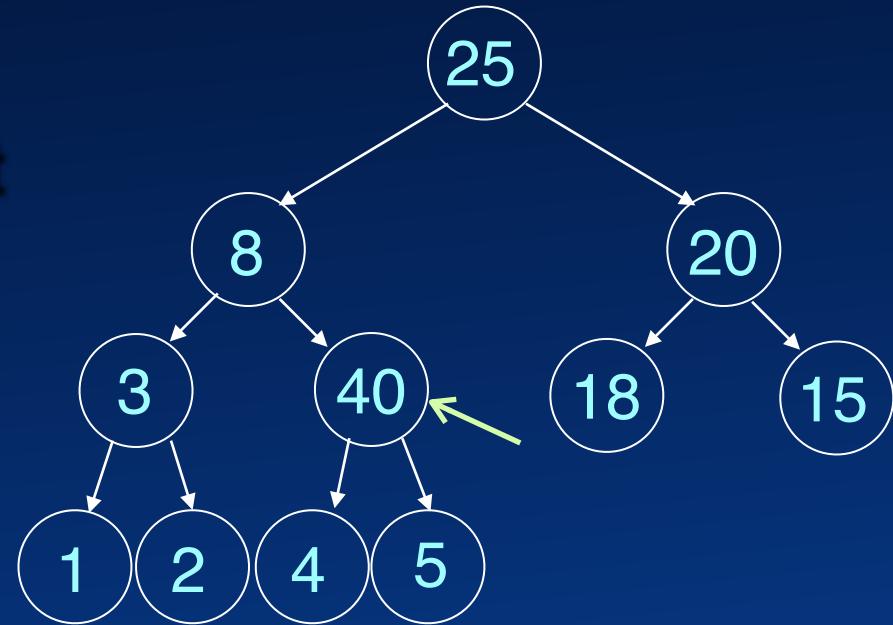


Heap



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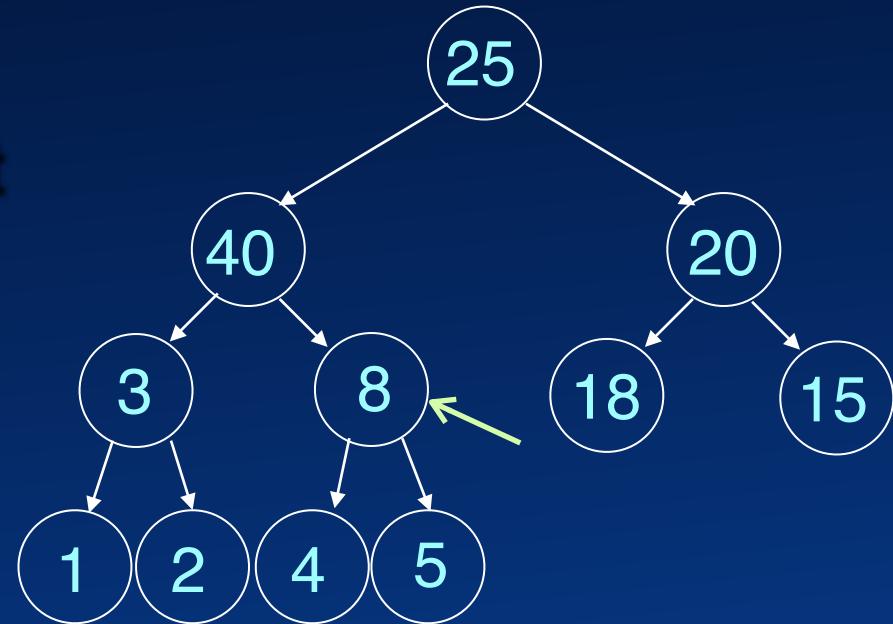


Heap



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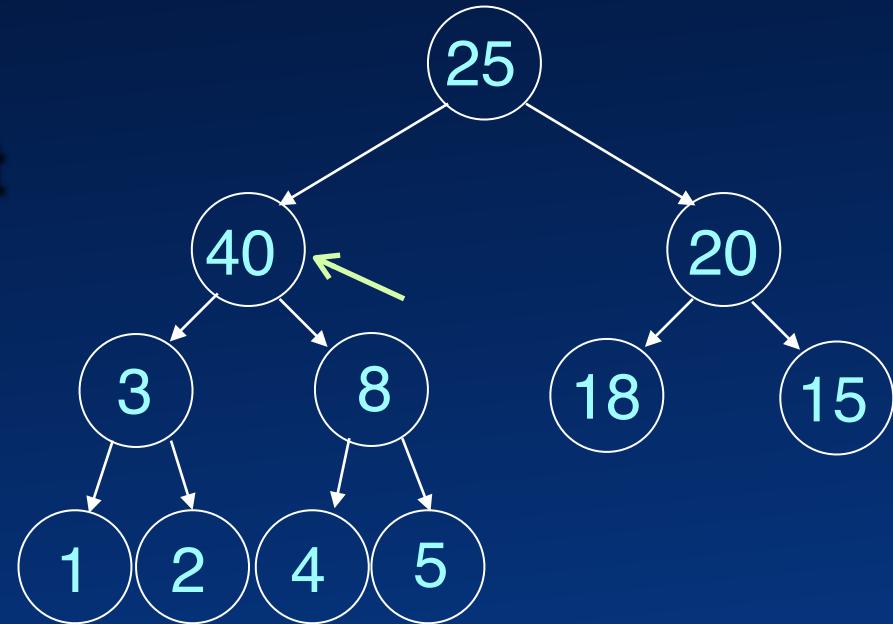


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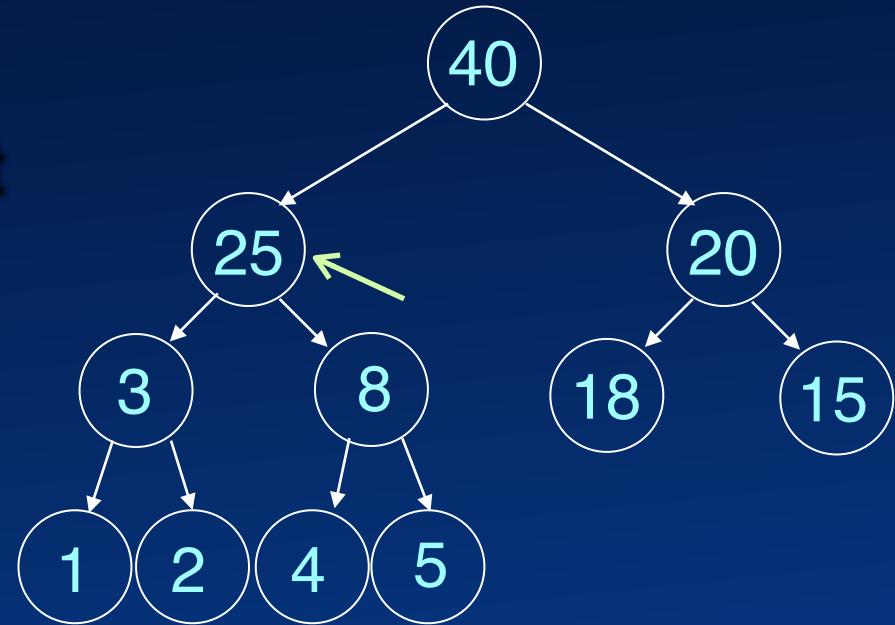


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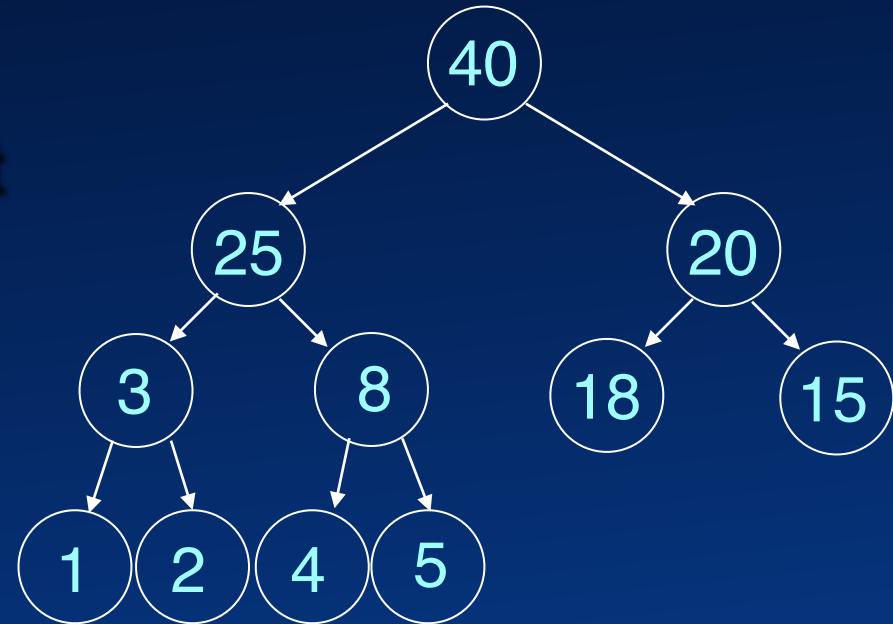


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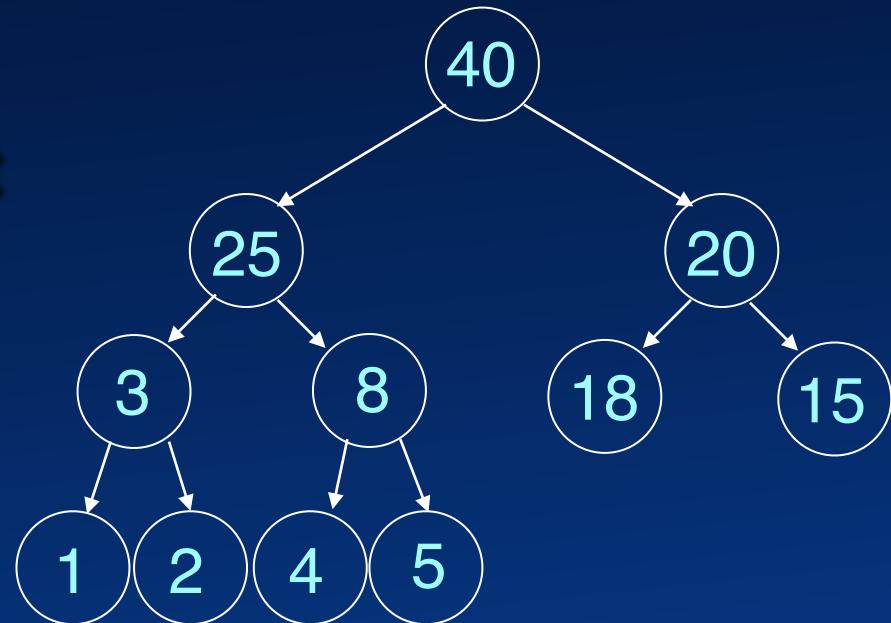
Heap



# Heap

- Left-complete tree
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- “Top” key in the root
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Inserted 40

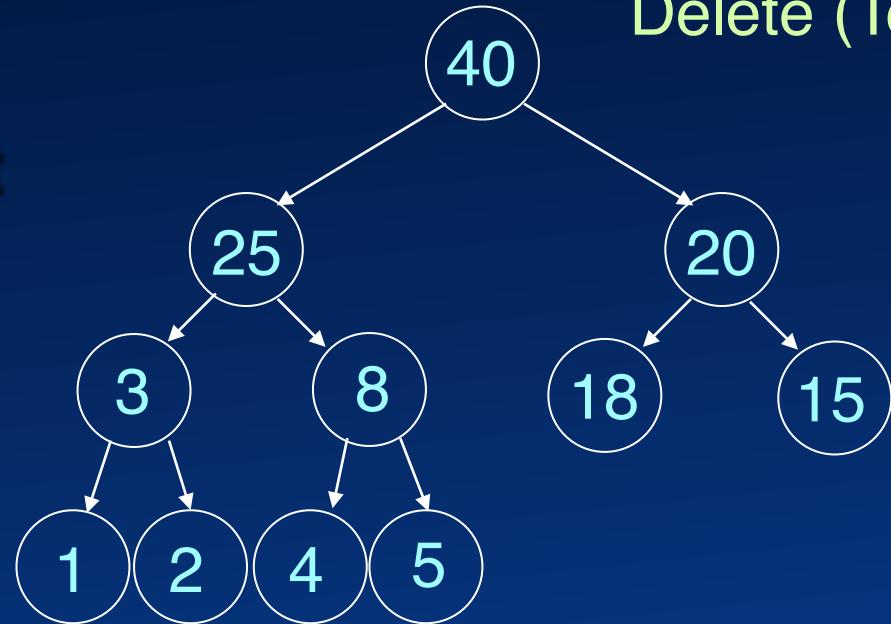


Heap



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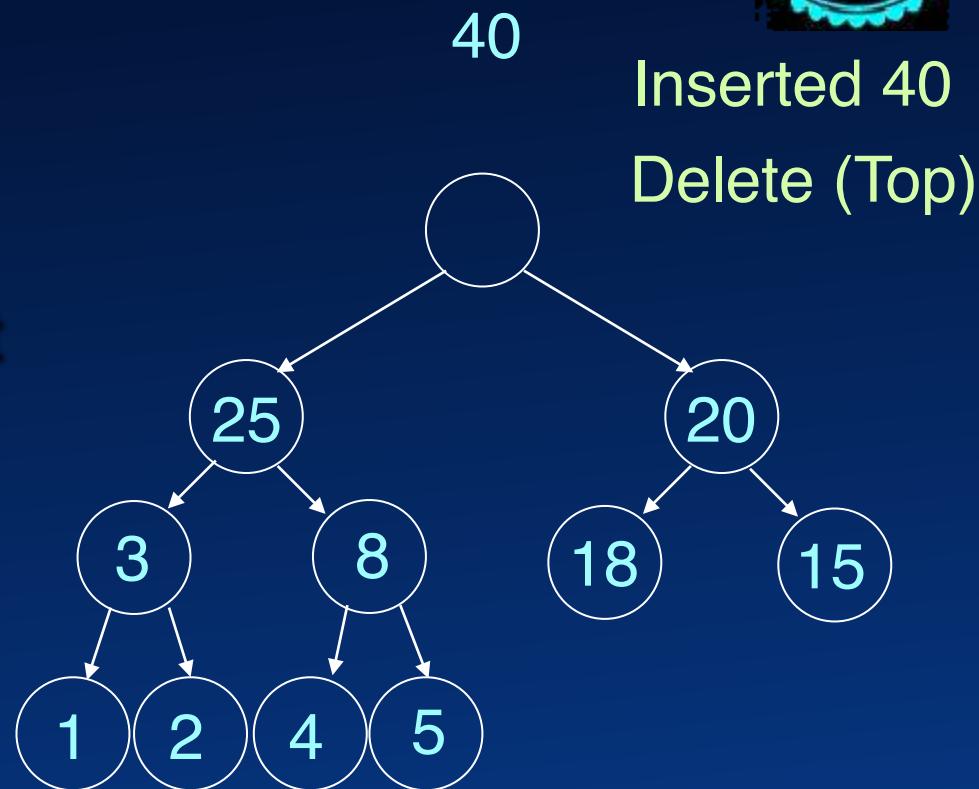


Heap



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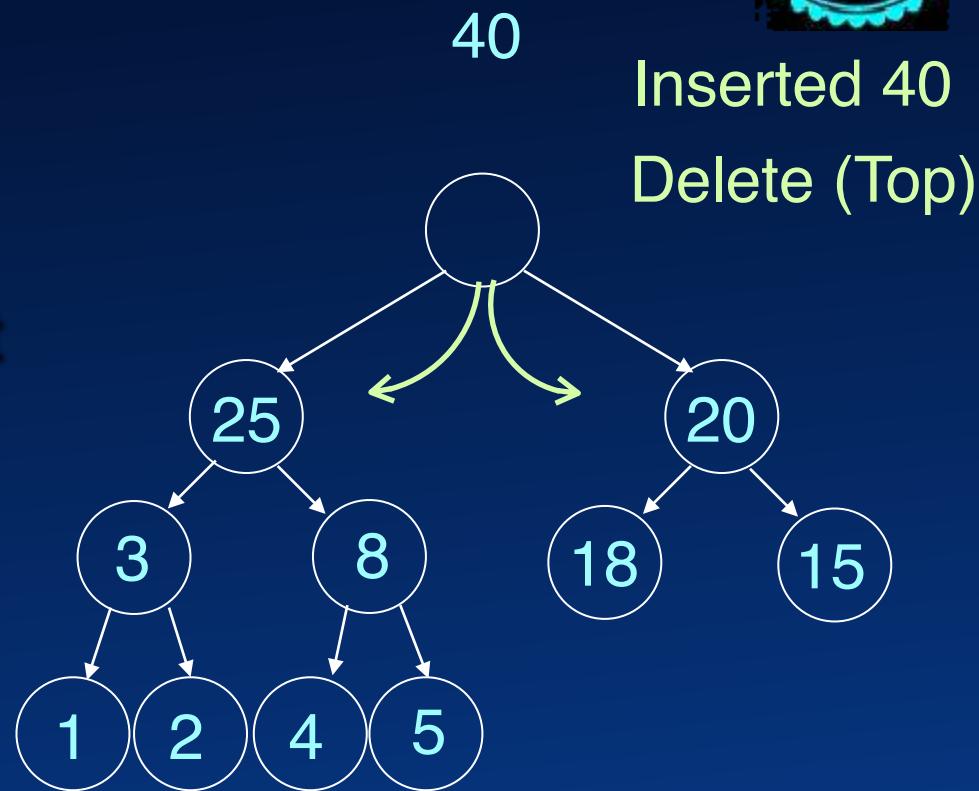
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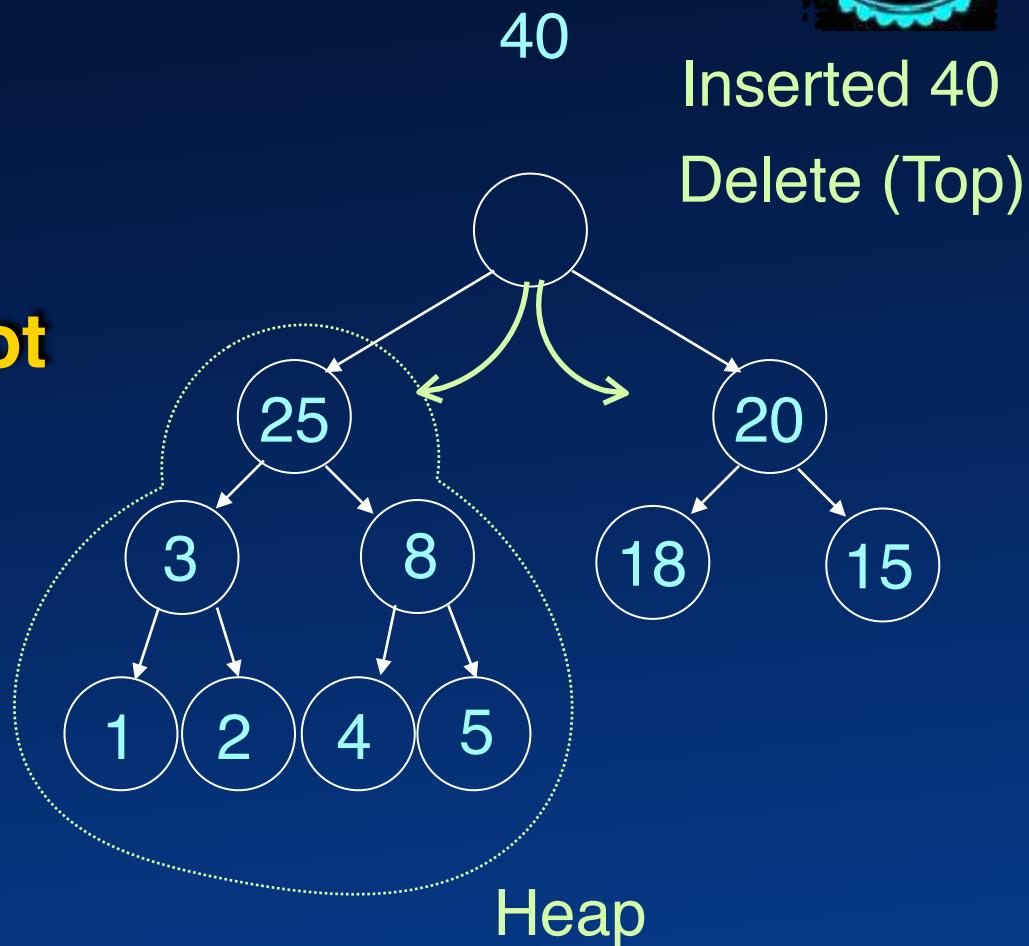
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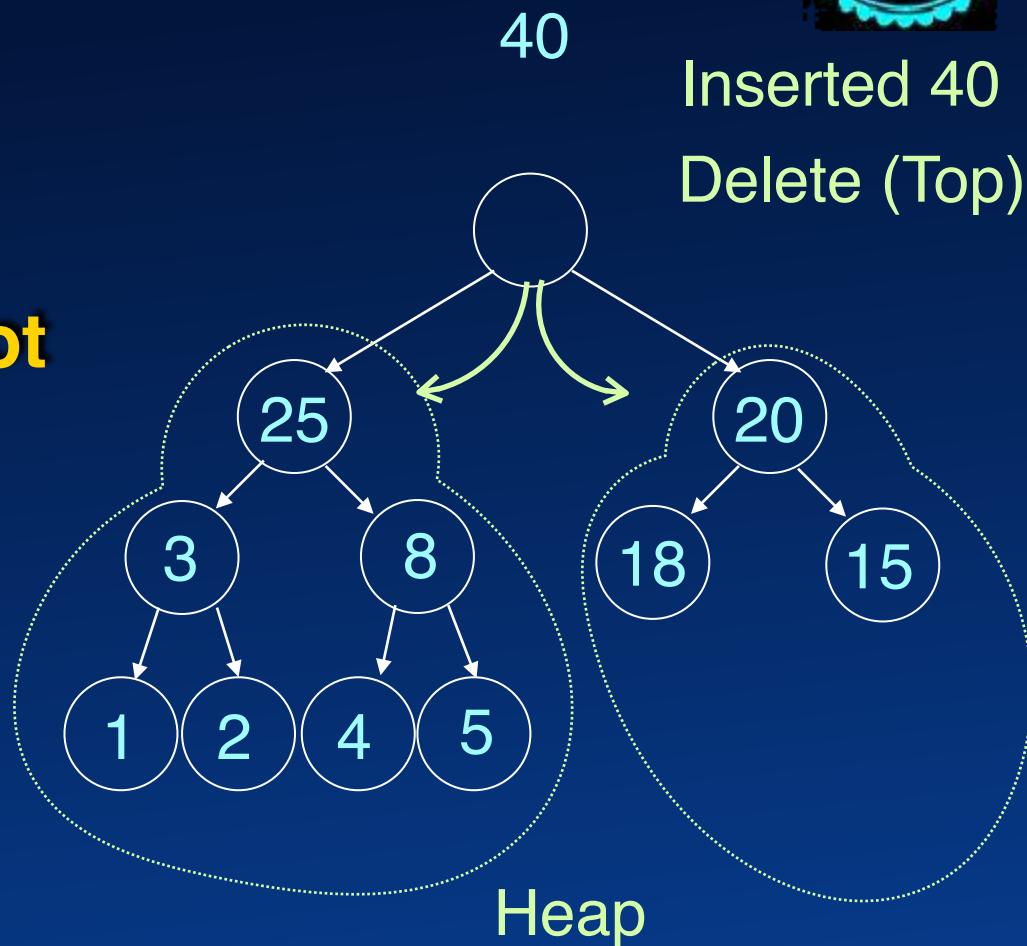
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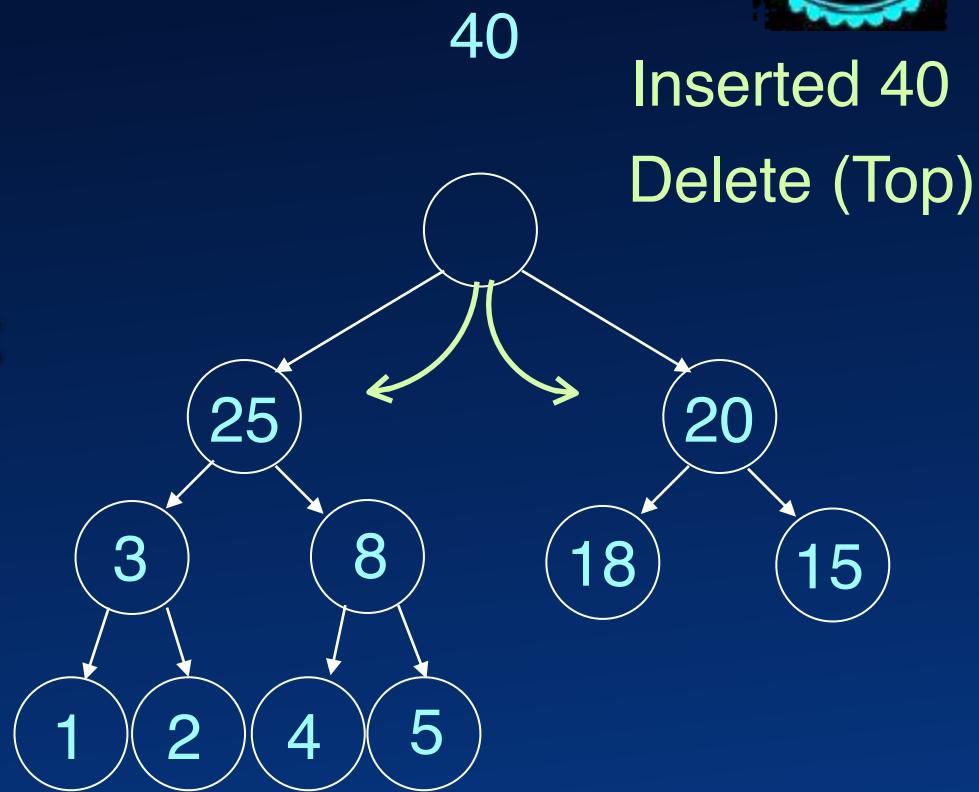
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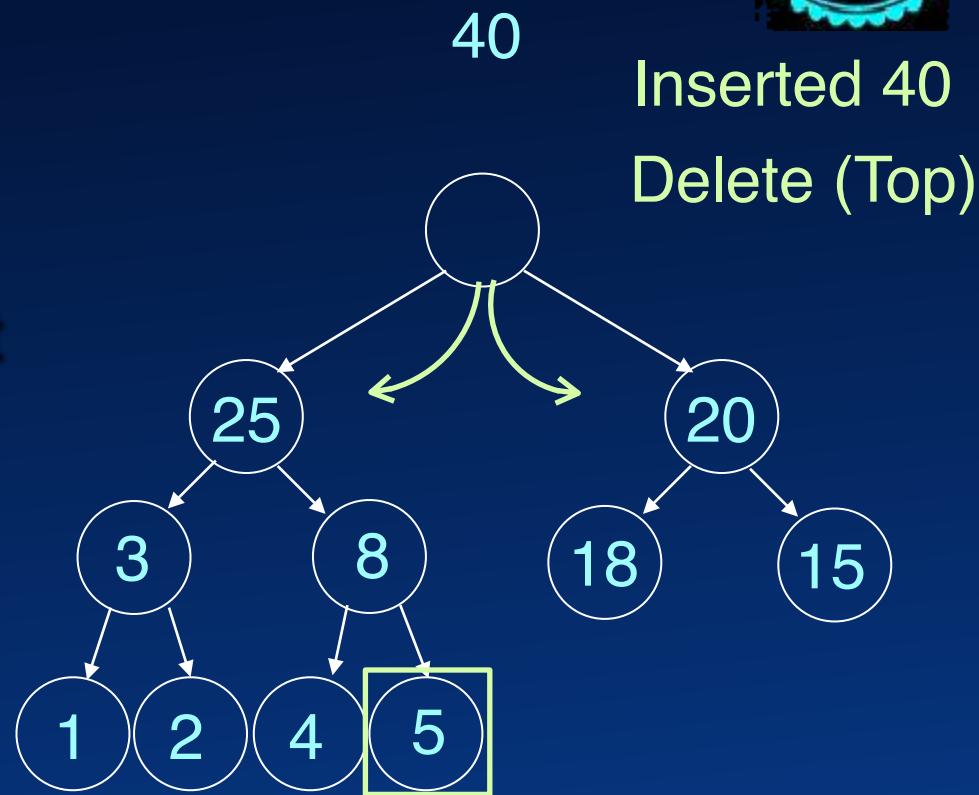
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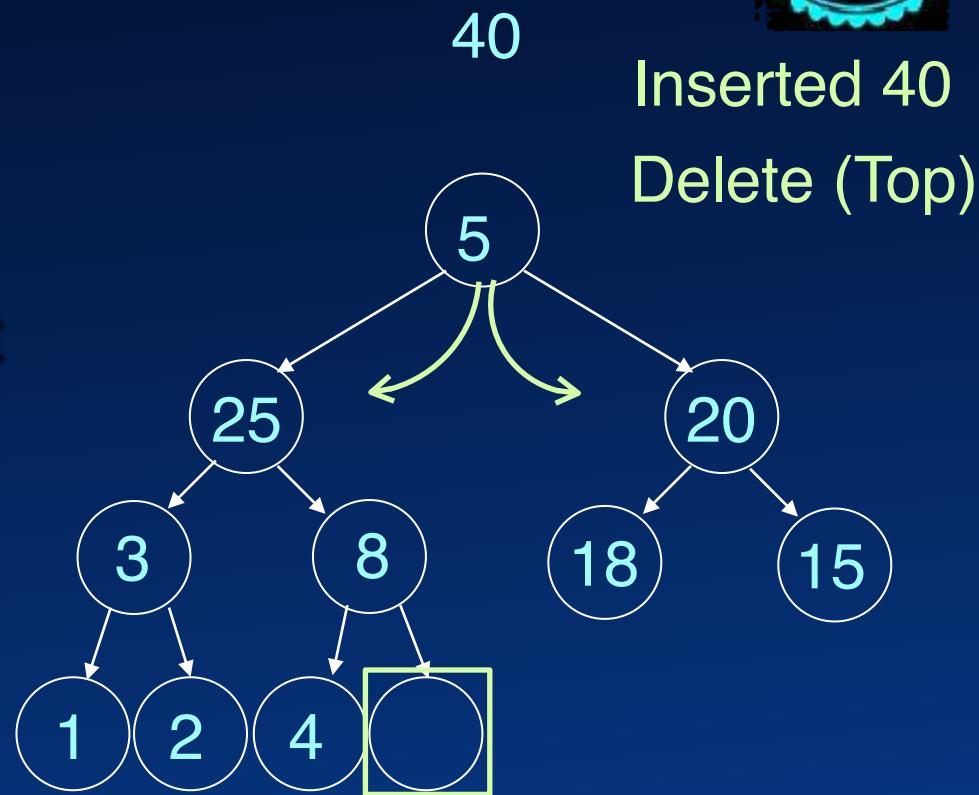


Heap



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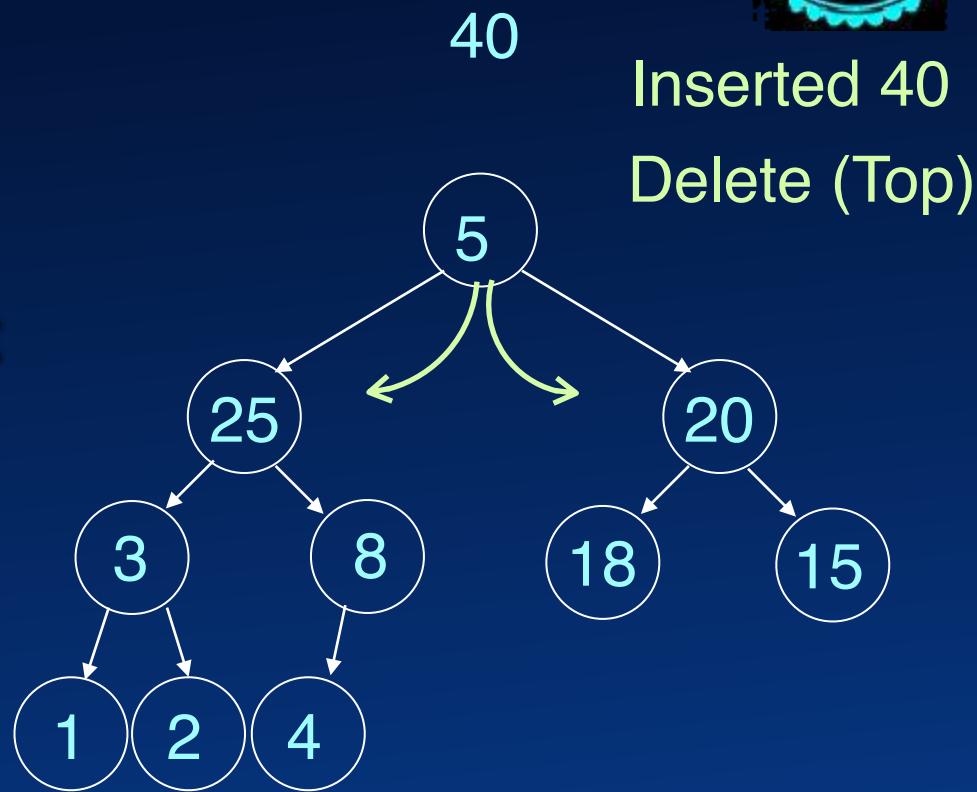
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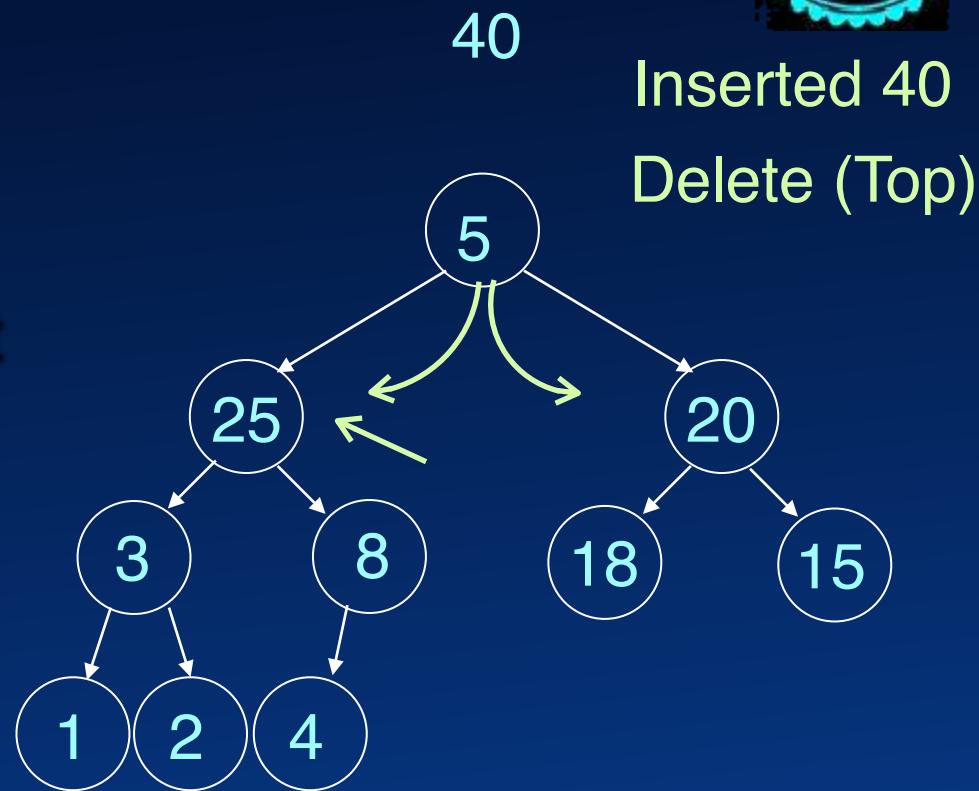
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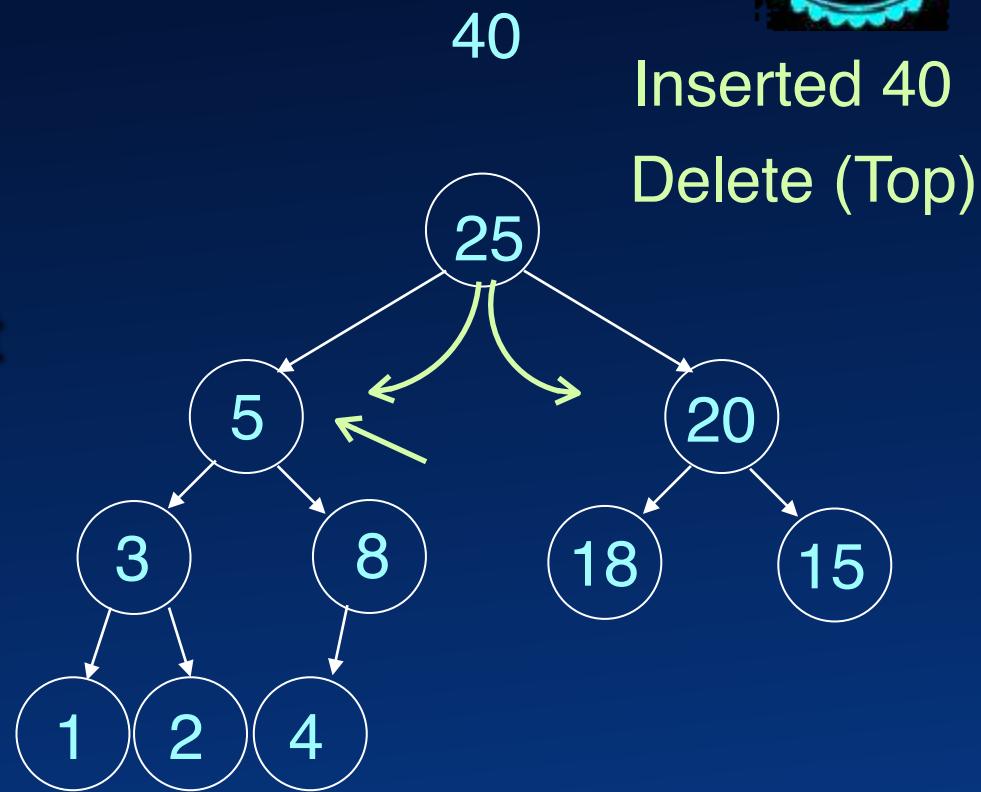


Heap



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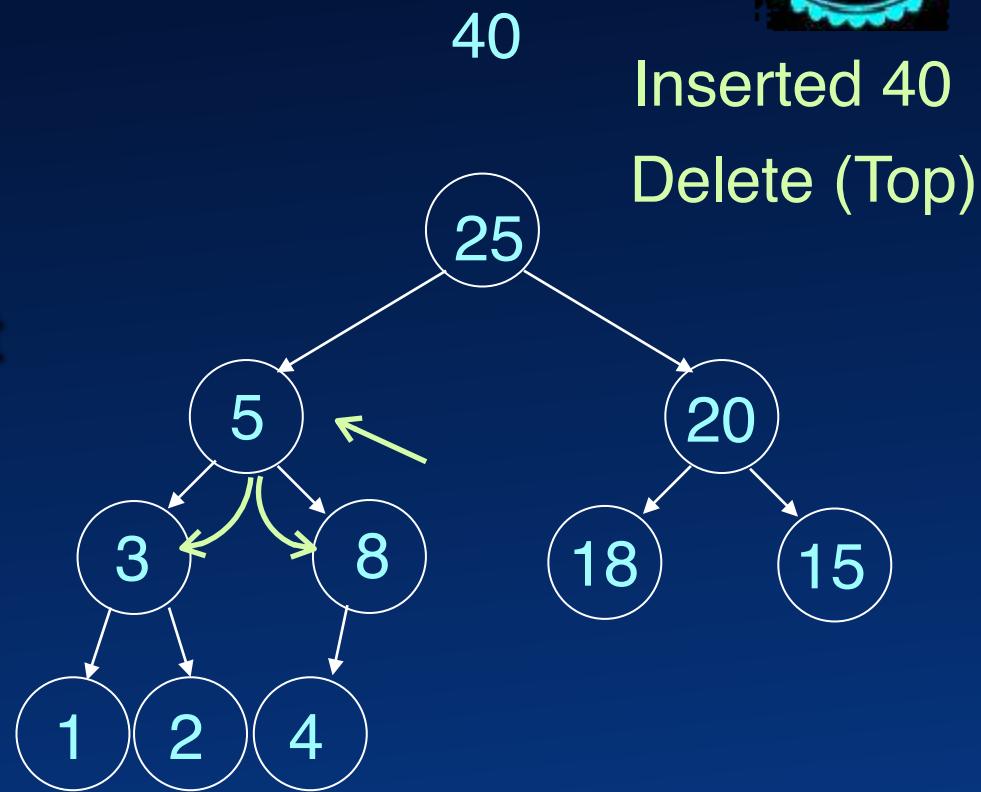


Heap



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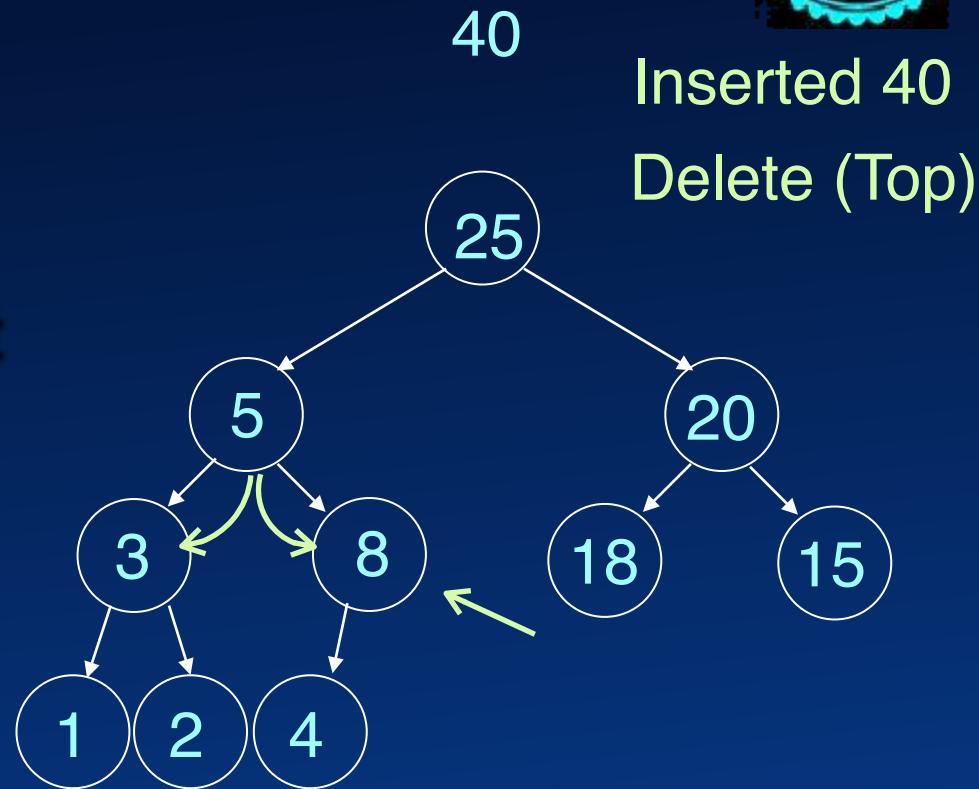


Heap



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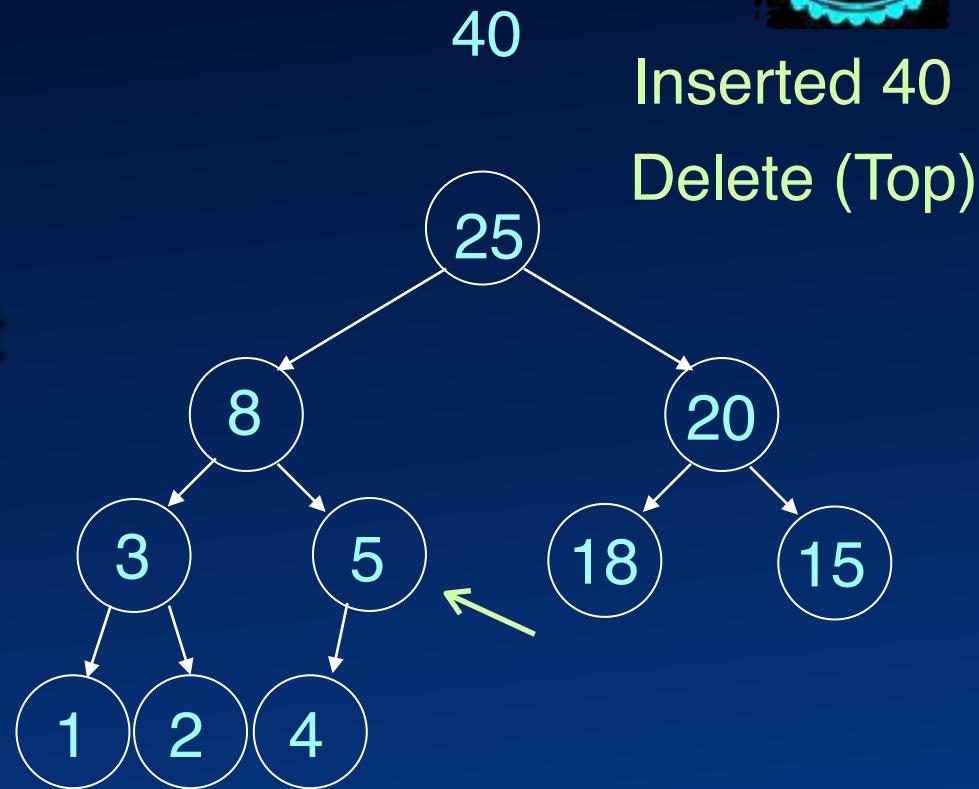


Heap



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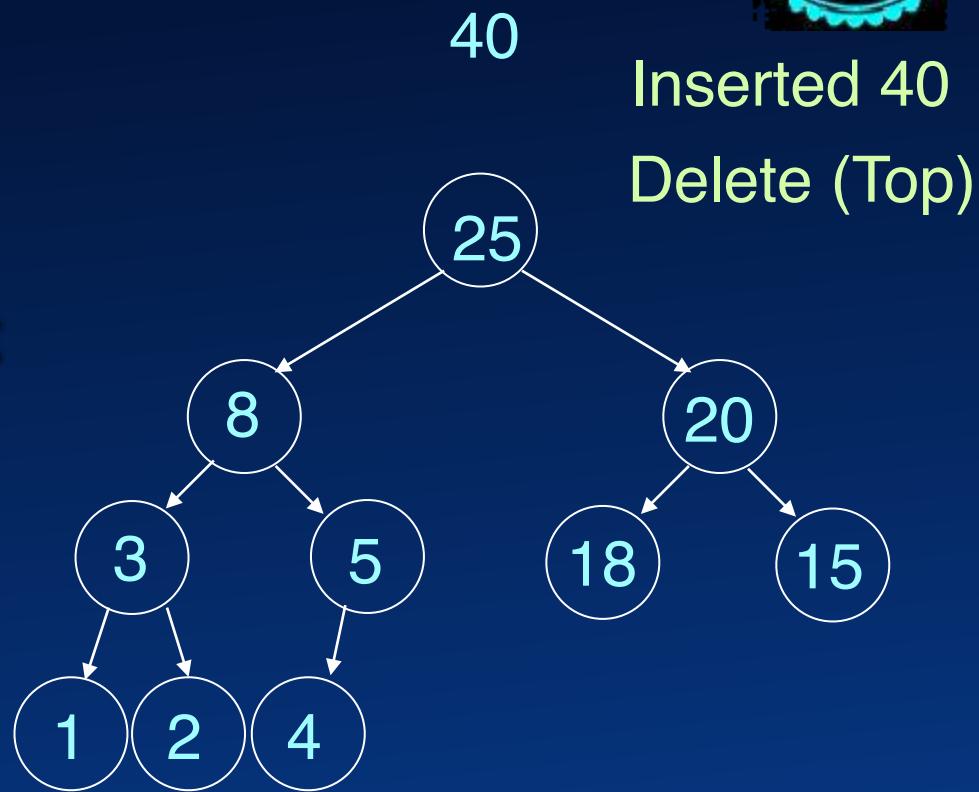
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Heap



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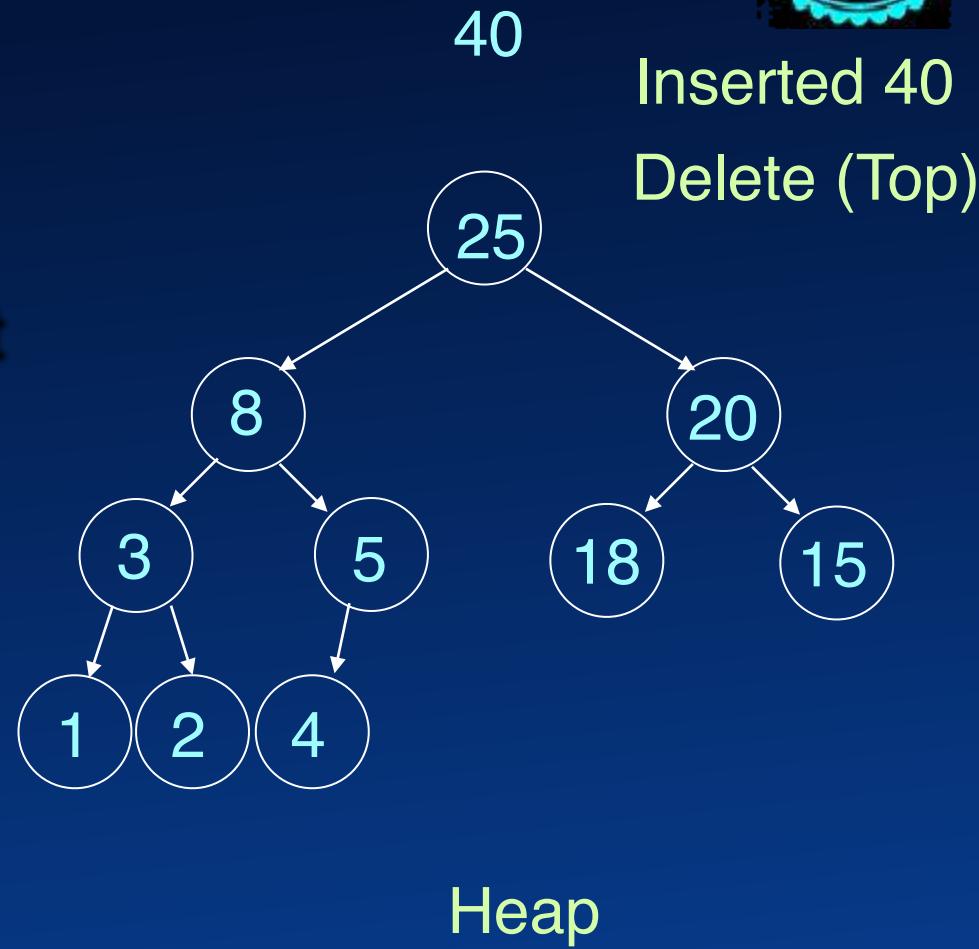
- **Left-complete tree**
- **Comparable keys**
- **“Top” key in the root**
  - **For every subtree**

Insert:

Add node at next spot  
Bubble-up

Delete:

Remove root  
Replace with last spot  
Bubble-down





# Heap

Bubble up:

if no parent

if(key lower-than parent.key)

swapwith(parent)

parent.bubbleup()

Insert:

Add node at next spot

Bubble-up

Delete:

Remove root

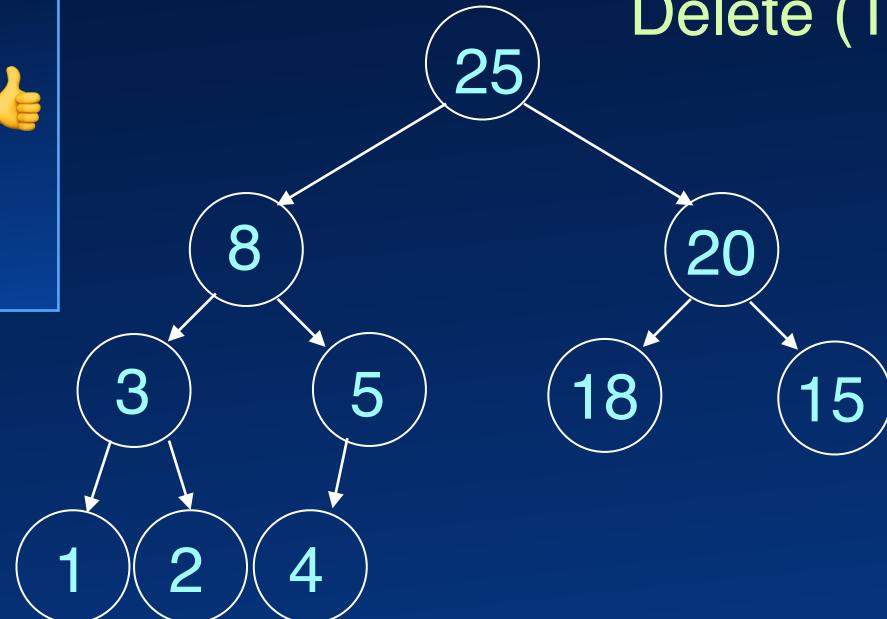
Replace with last spot

Bubble-down

40

Inserted 40

Delete (Top)



Heap



# Heap

Bubble down:

Bubble up:

if no parent

if(key lower-than parent.key)

swapwith(parent)

parent.bubbleup()

Insert:

Add node at next spot

Bubble-up

Delete:

Remove root

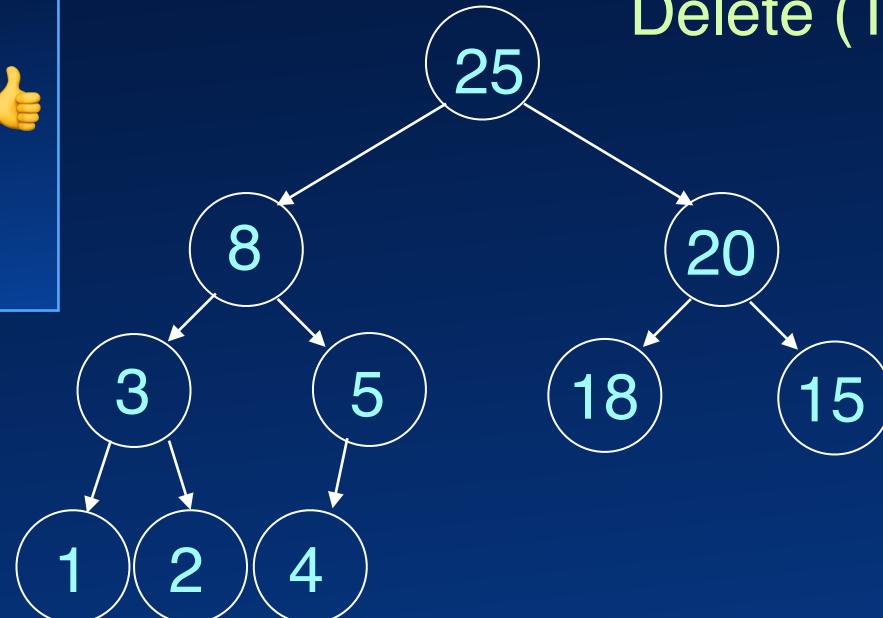
Replace with last spot

Bubble-down

40

Inserted 40

Delete (Top)



Heap



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Bubble down:

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if no parent

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Insert:

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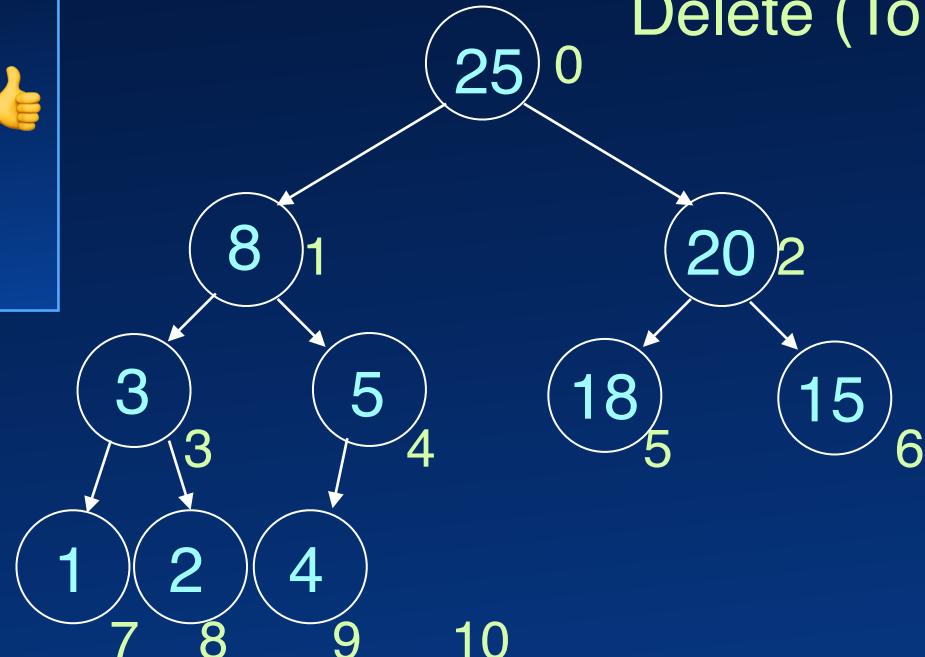
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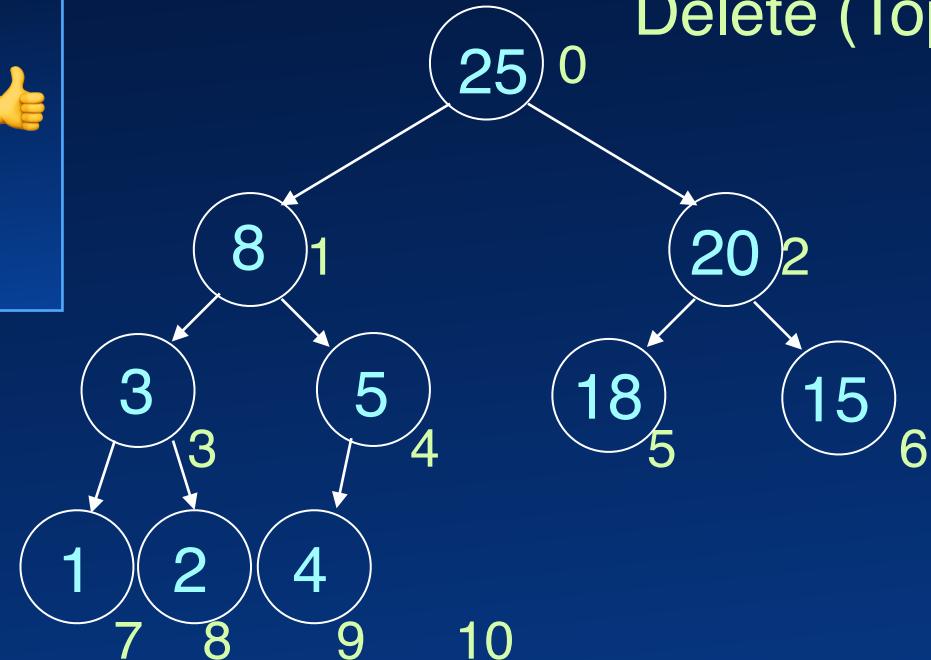
Replace with last spot

Bubble-down

40

Inserted 40

Delete (Top)



Heap

child-index = 2\*parent-index + {1,2}  
parent-index = (child-index-1)/2

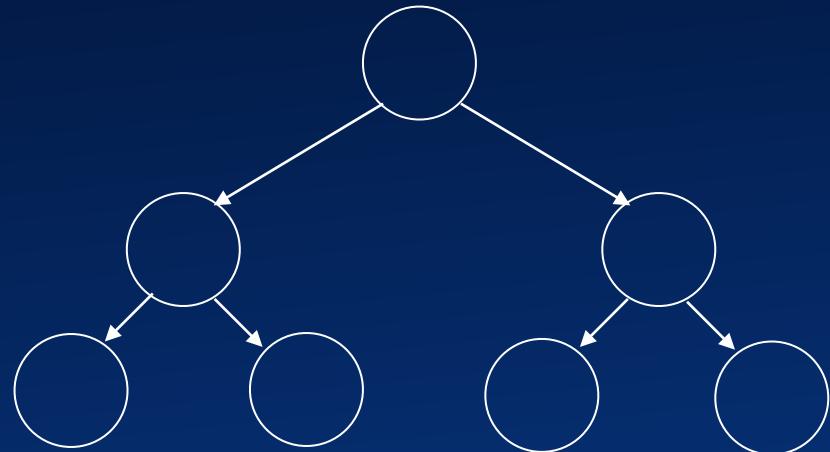
# In which node may the third largest element of a heap be?



mail: [col106quiz@cse.iitd.ac.in](mailto:col106quiz@cse.iitd.ac.in)

format: 1,2,3,4,5,6

- 1
- 2
- 3
- 4
- 5
- 6



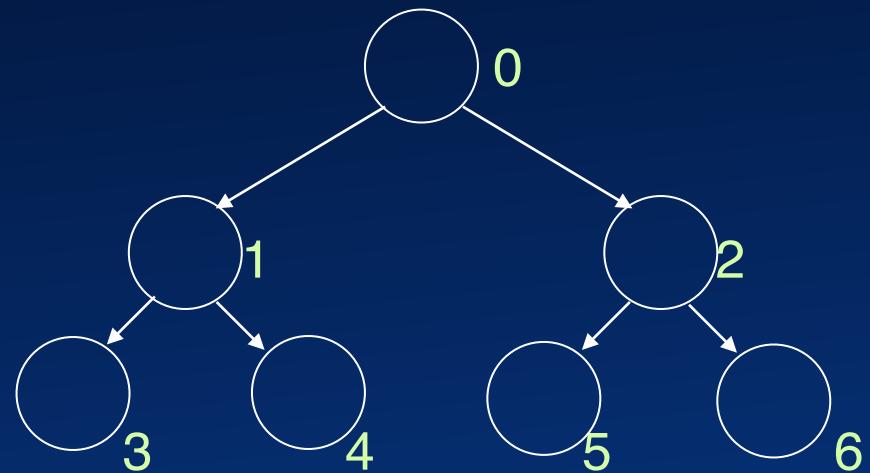
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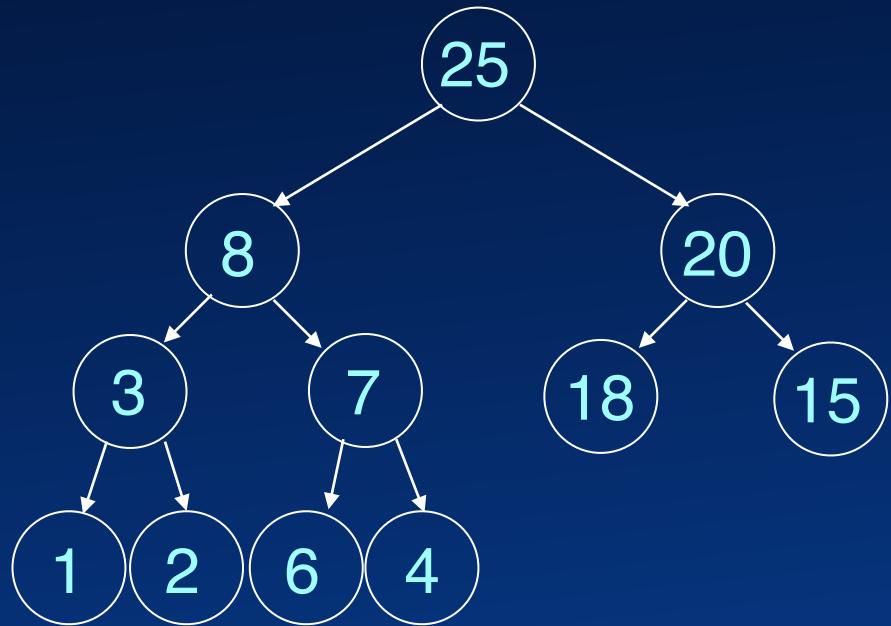
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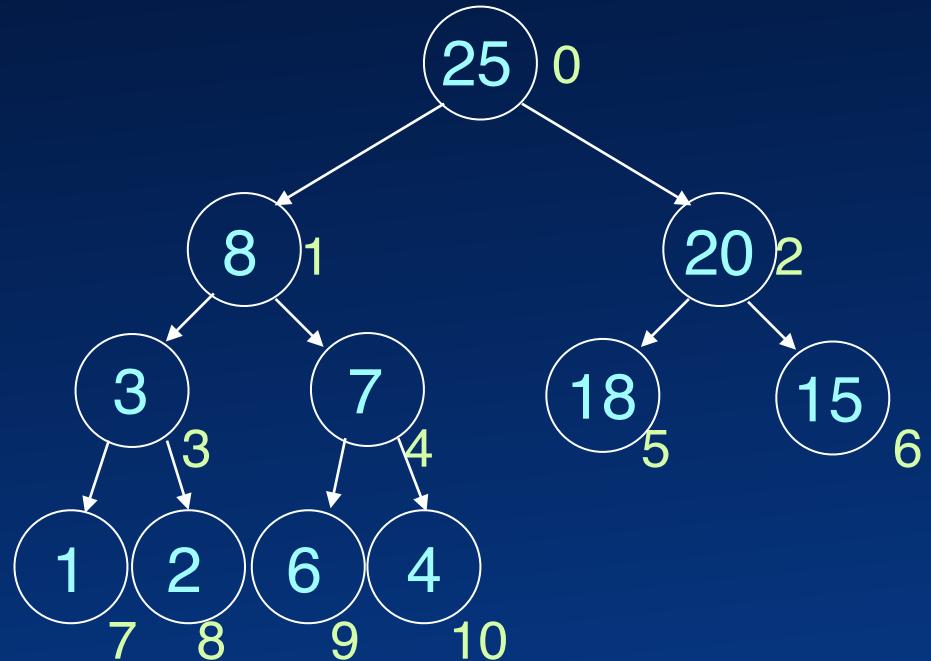
# Heap



Heap



# Heap

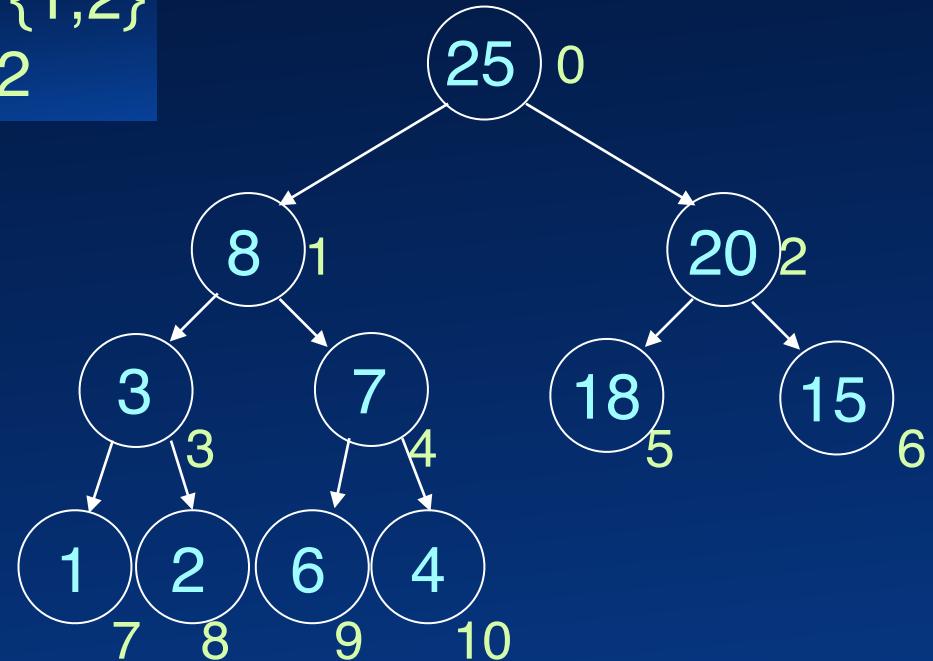


Heap



# Heap

child-index =  $2 * \text{parent-index} + \{1, 2\}$   
parent-index =  $(\text{child-index}-1)/2$

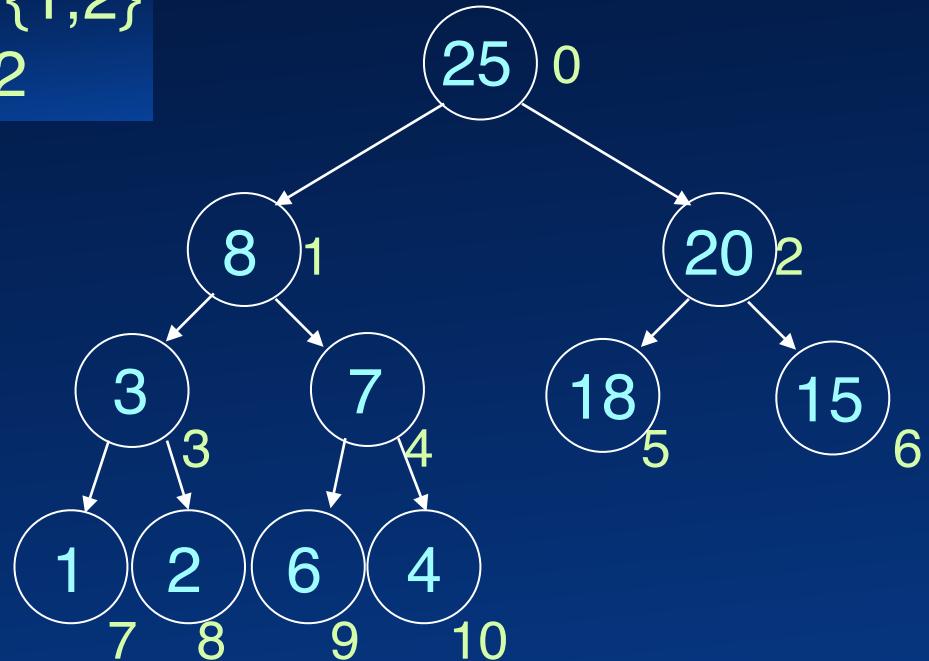


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child-index =  $2 * \text{parent-index} + \{1, 2\}$   
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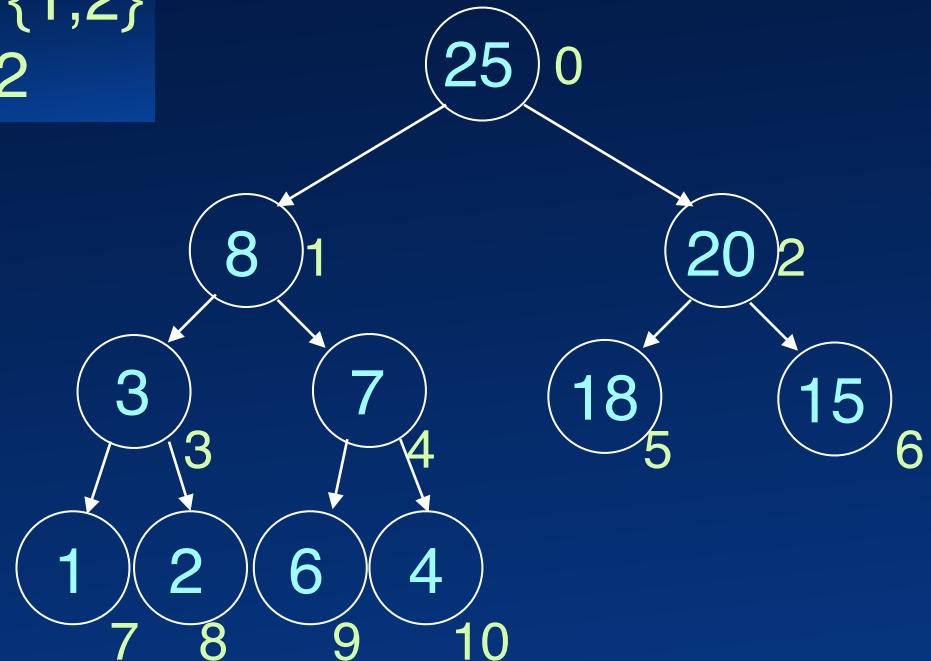
25 8 20 3 7 18 15 1 2 6 4

Heap



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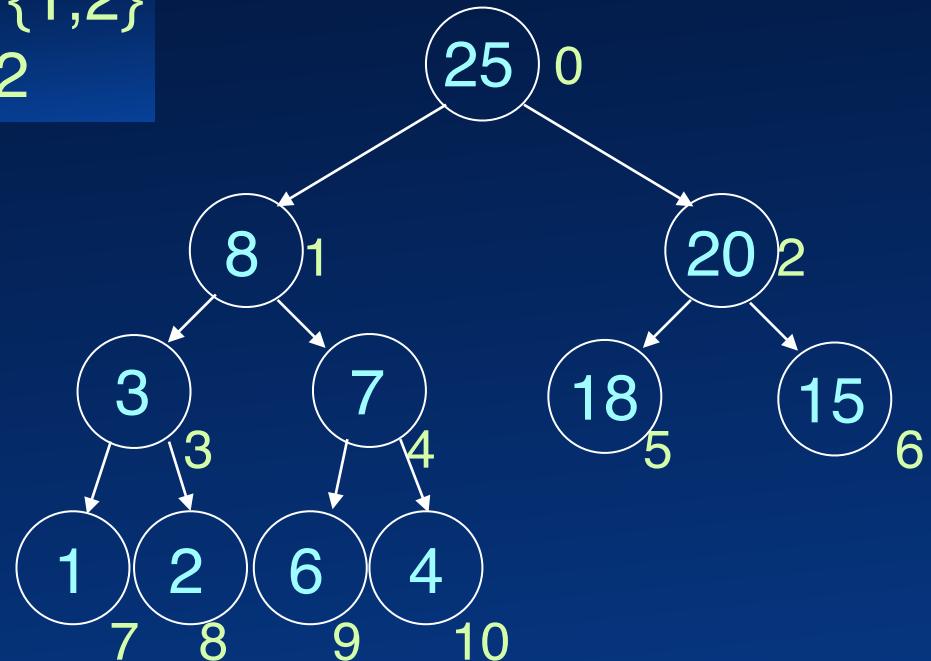
25	8	20	3	7	18	15	1	2	6	4	
0	1	2	3	4	5	6	7	8	9	10	11

Heap



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child-index =  $2 * \text{parent-index} + \{1, 2\}$   
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25	8	20	3	7	18	15	1	2	6	4	
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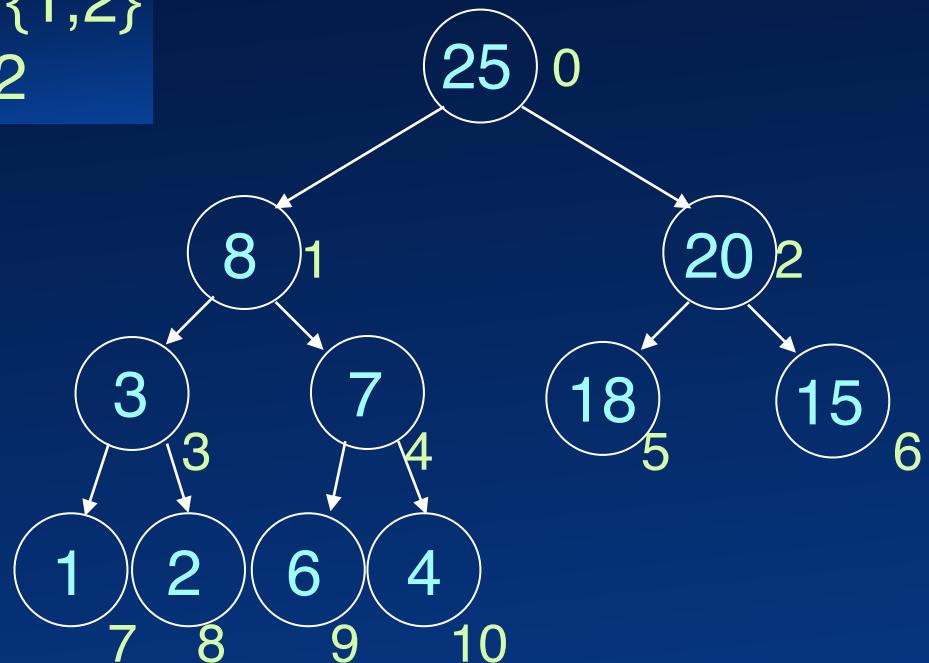


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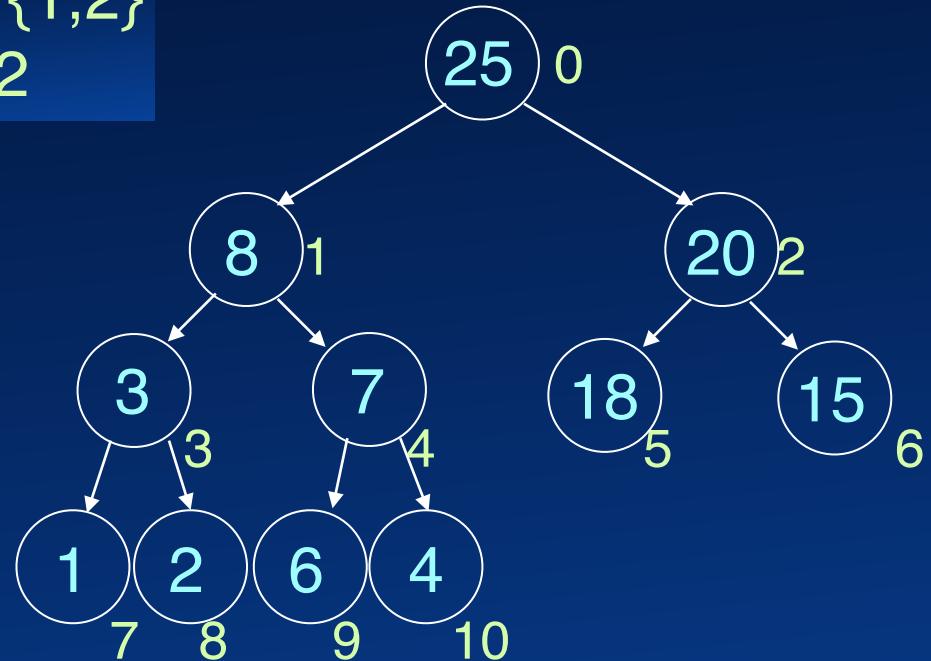
↑ next

Heap



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25 8 20 3 7 18 15 1 2 6 4

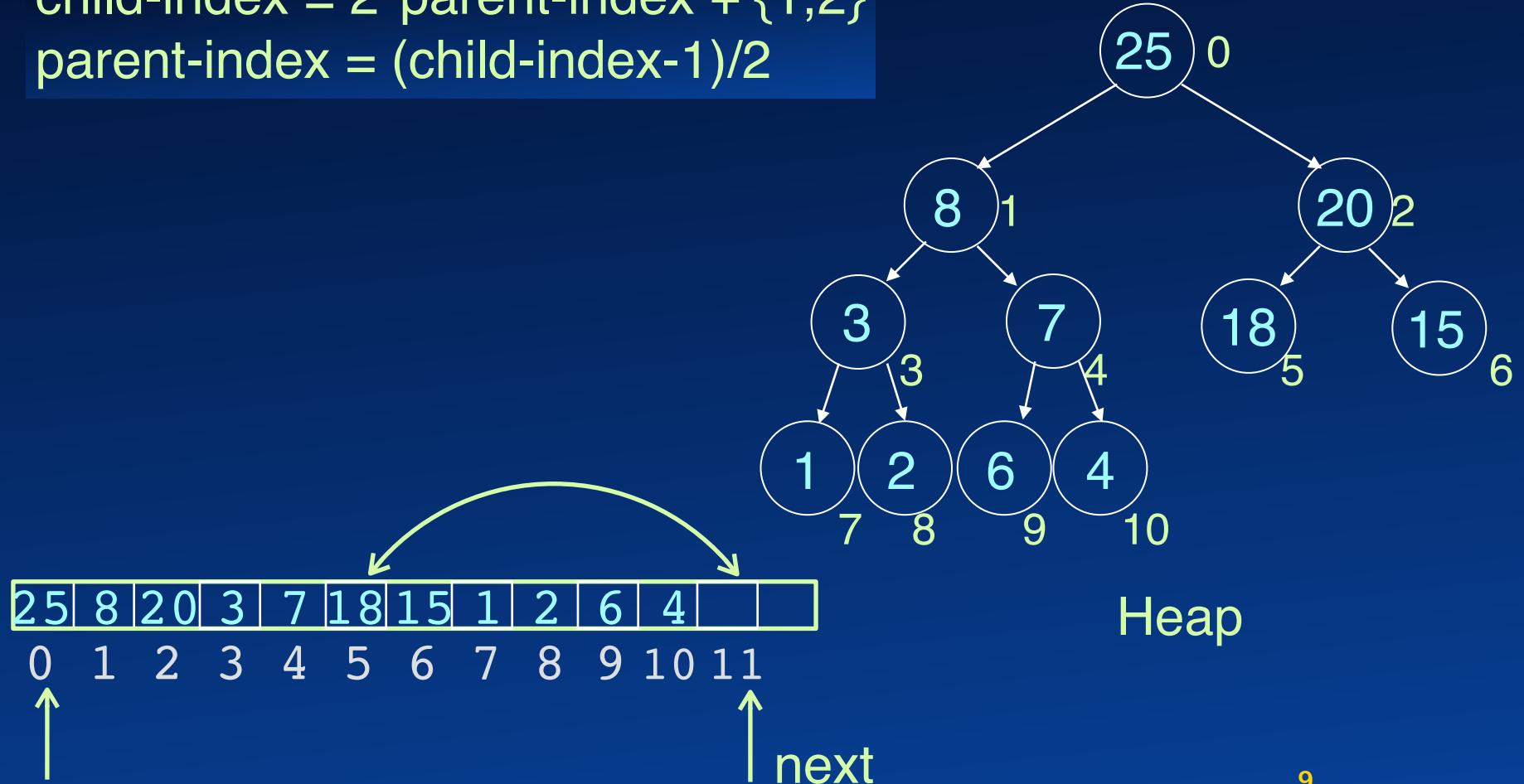
0 1 2 3 4 5 6 7 8 9 10 11  
↑  
next

Heap



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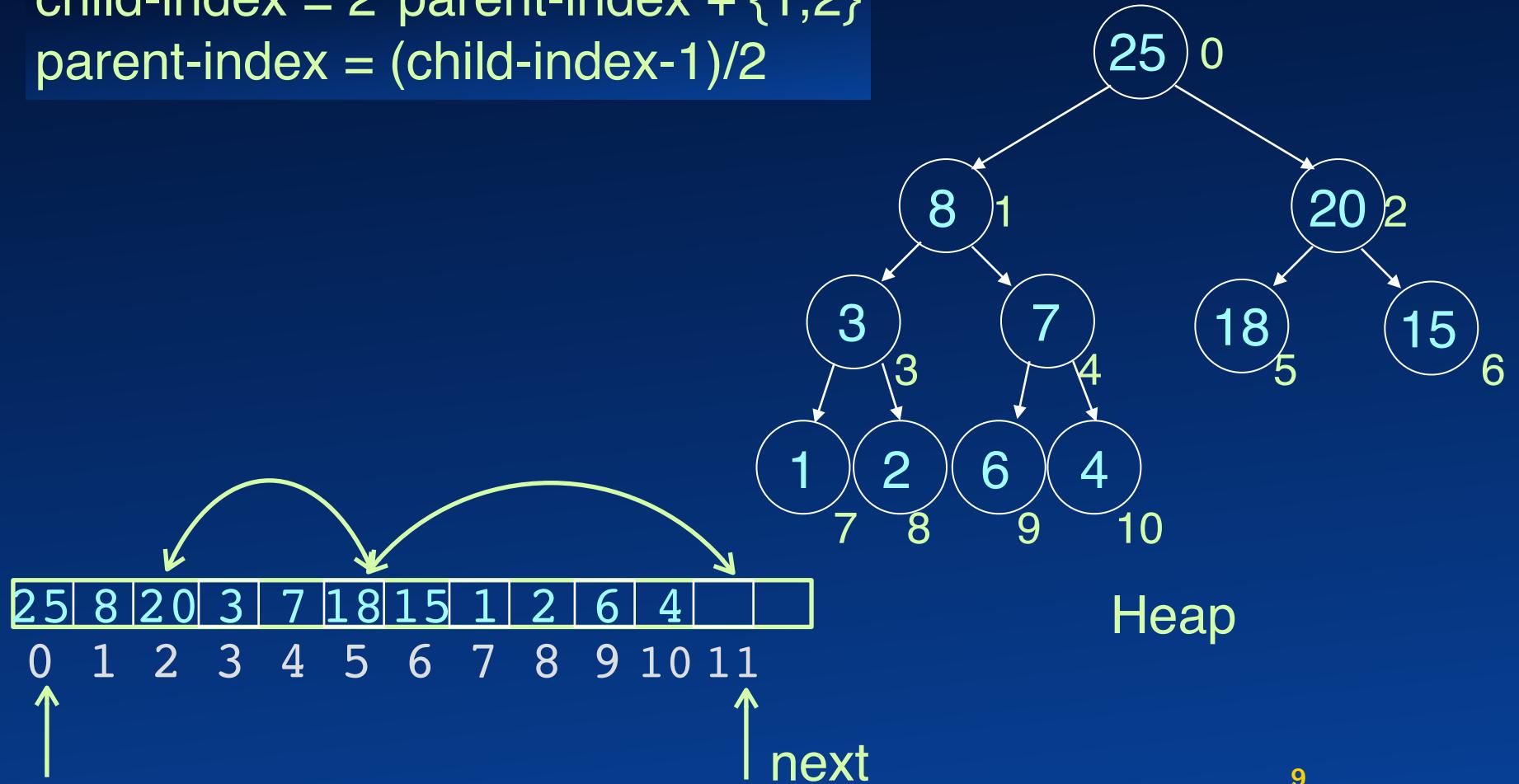
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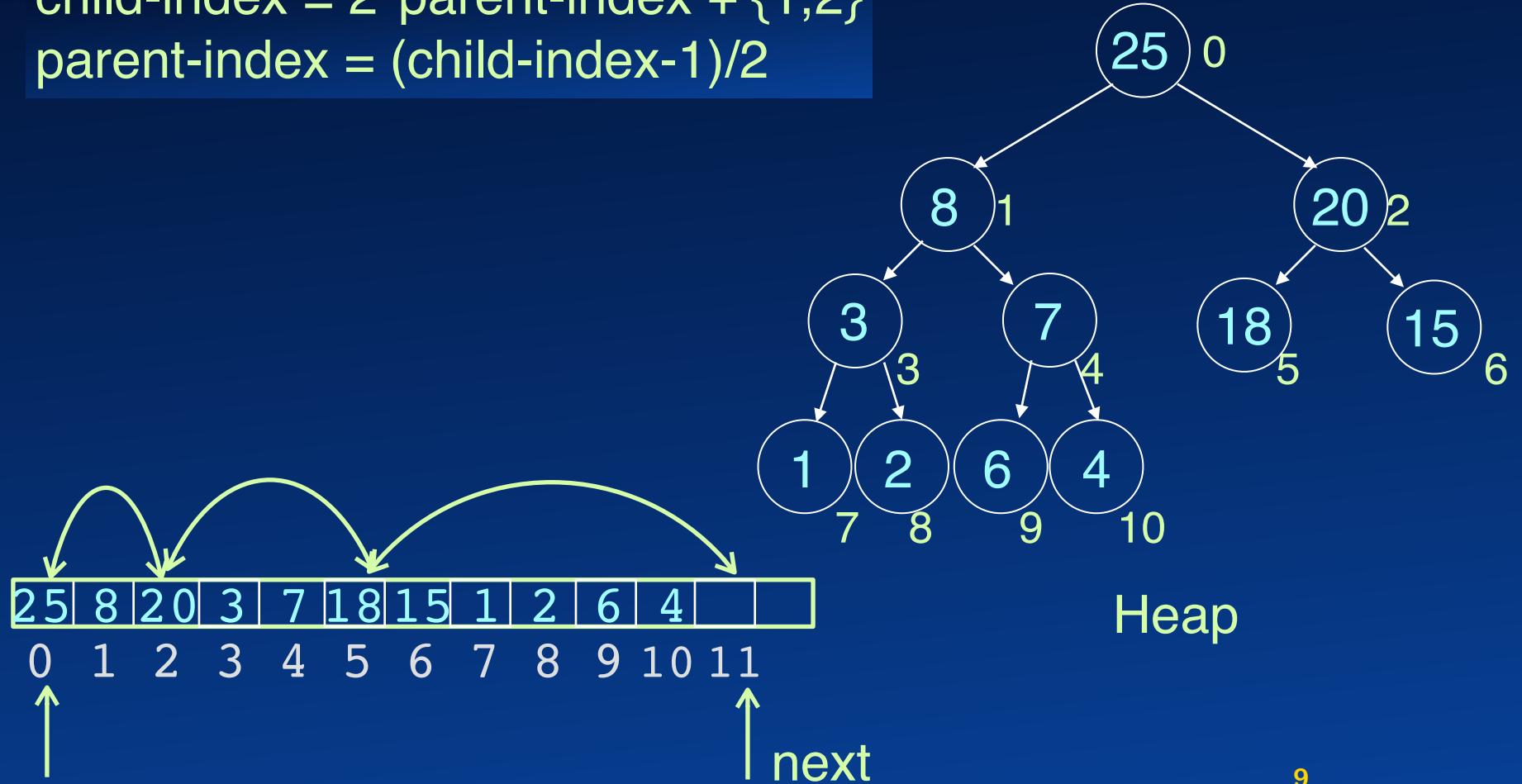
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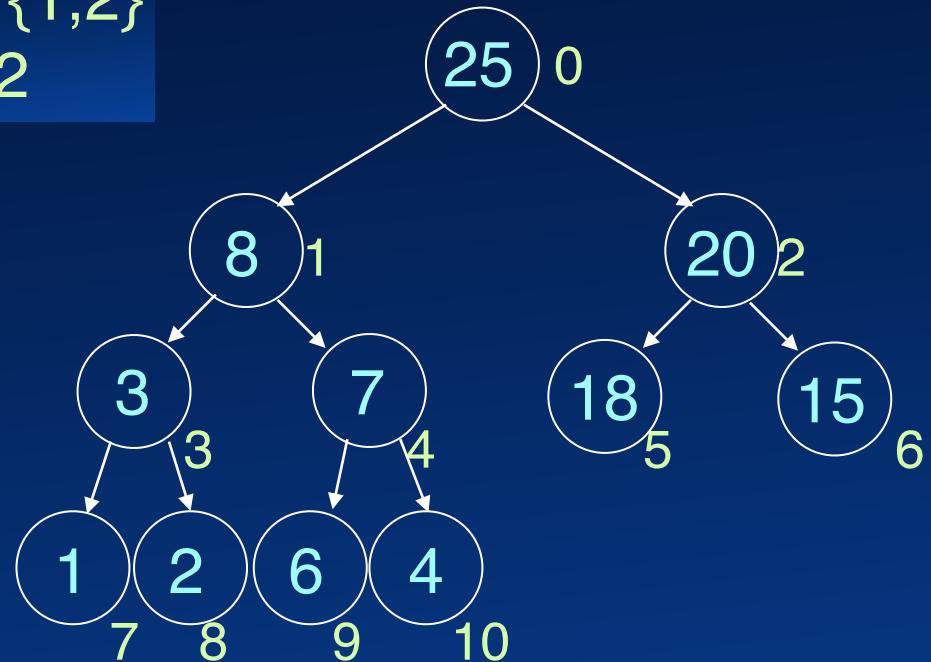
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25 8 20 3 7 18 15 1 2 6 4

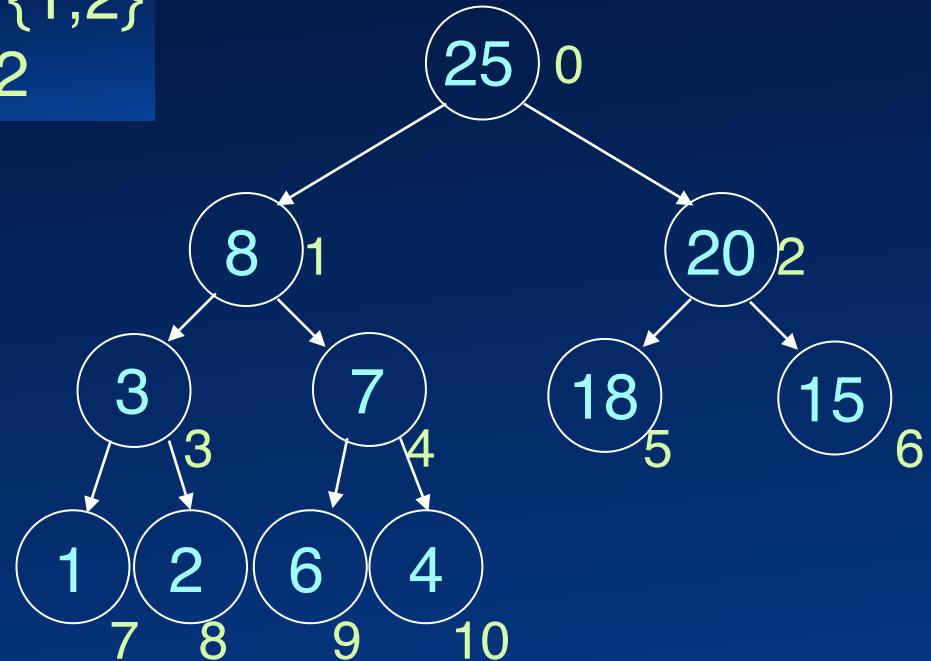
0 1 2 3 4 5 6 7 8 9 10 11  
↑  
next ↑

Heap



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	8	20	3	7	18	15	1	2	6	4	
--	---	----	---	---	----	----	---	---	---	---	--

0 1 2 3 4 5 6 7 8 9 10 11  
↑

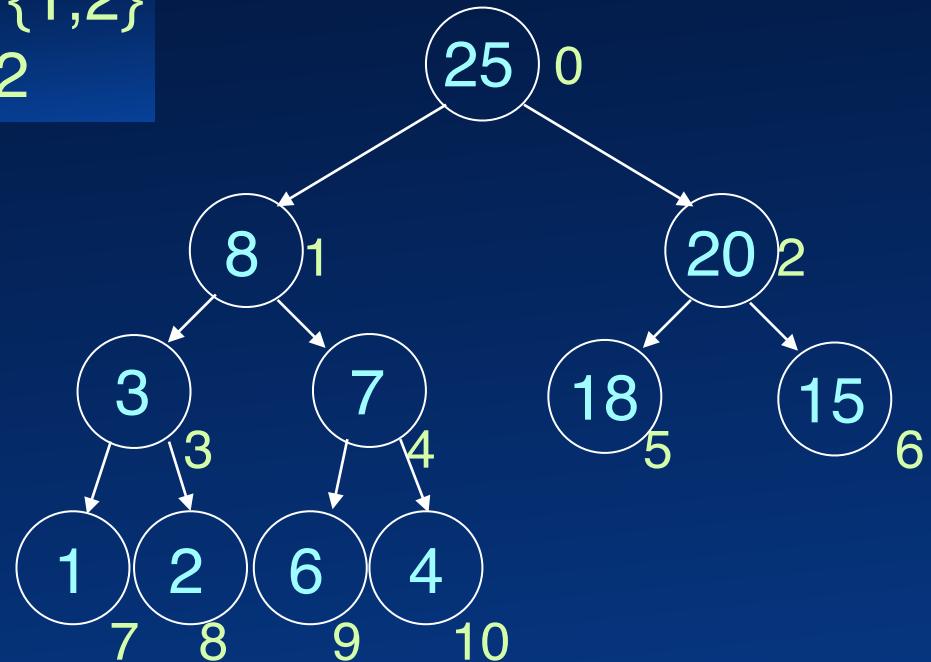
↑ next

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	8	20	3	7	18	15	1	2	6	4	
--	---	----	---	---	----	----	---	---	---	---	--

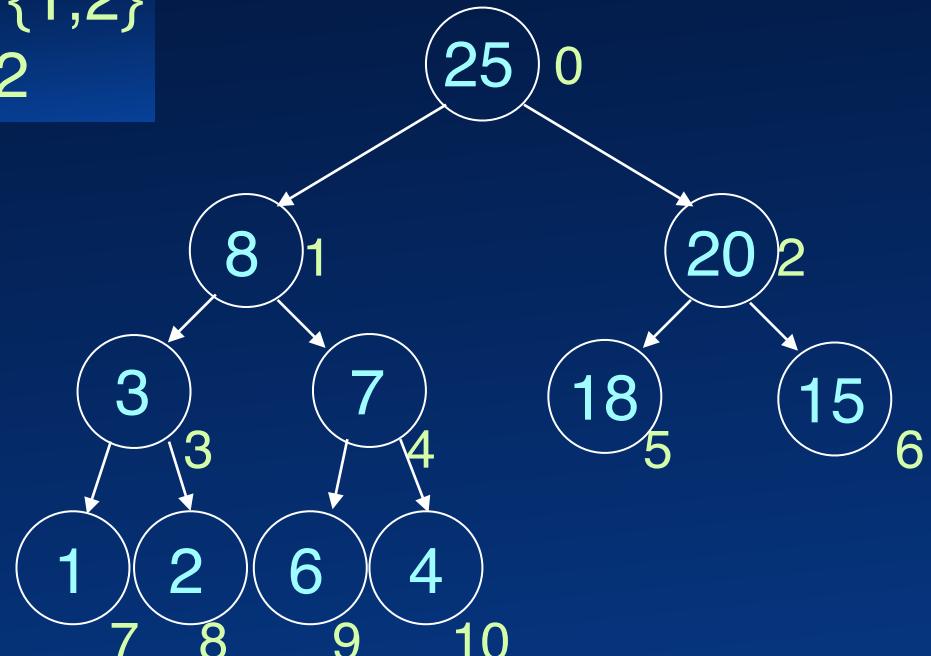


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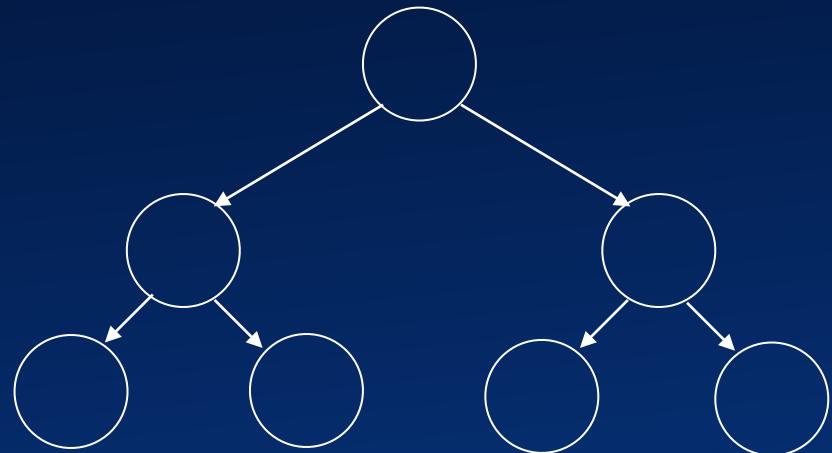
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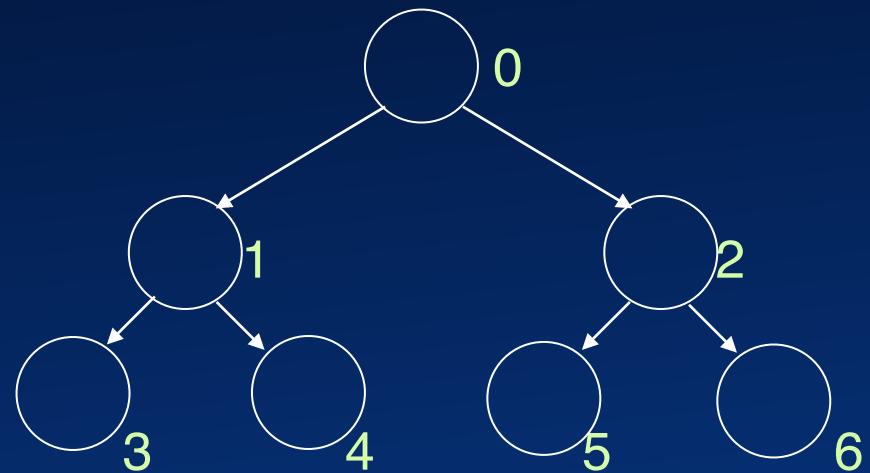
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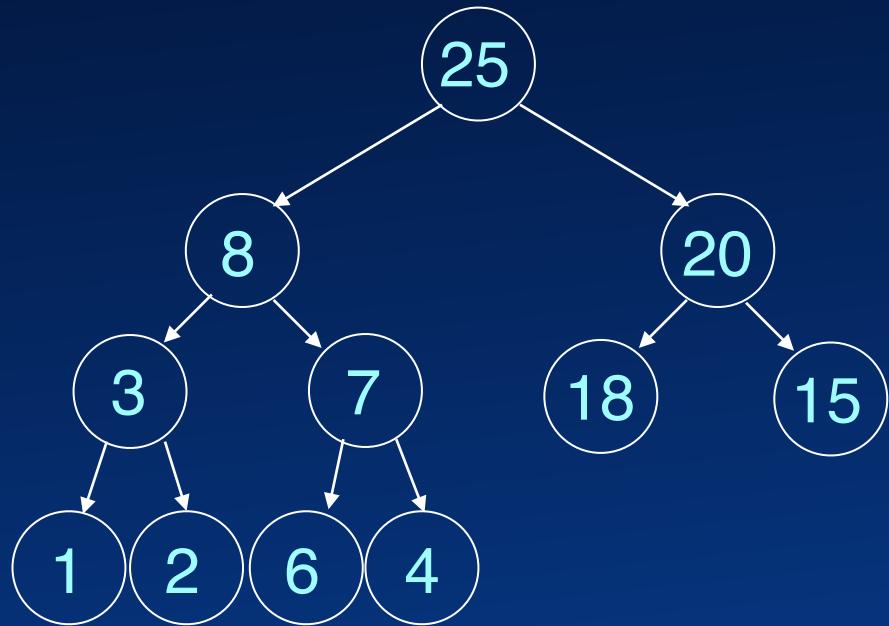
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# Heap Construction

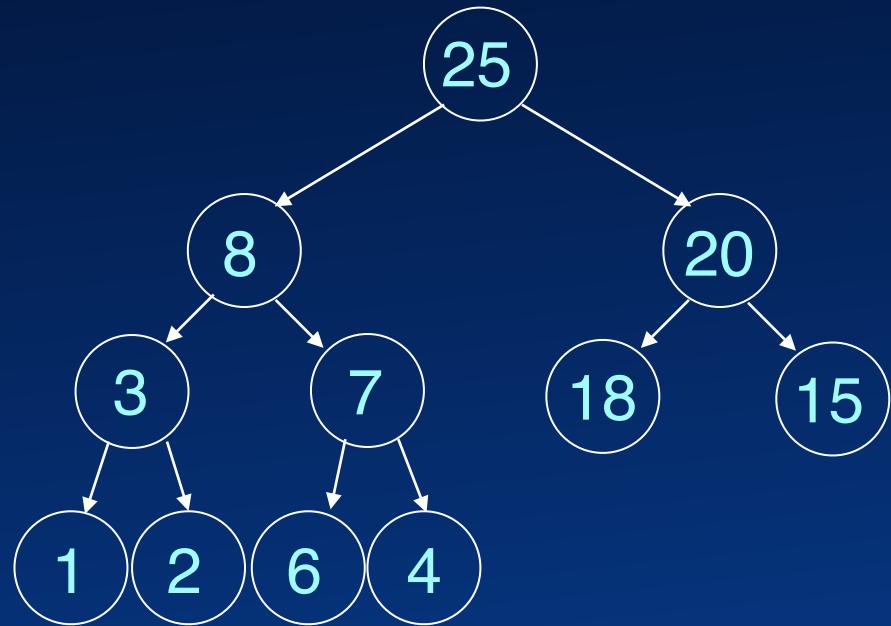


Heap



# Heap Construction

?  $\leq \lg 1 + \lg 2 + \lg 3 + \dots \leq ?$



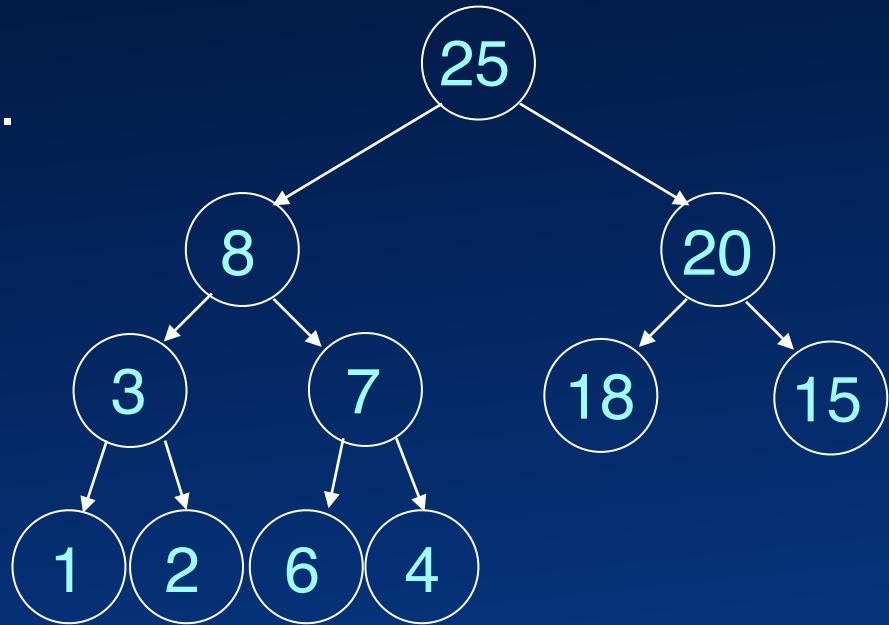
Heap



# Heap Construction

?  $\leq \lg 1 + \lg 2 + \lg 3 + \dots \leq ?$

$\lg 1 + 1 + \lg 2 + 1 + \lg 3 + 1 \dots$



Heap

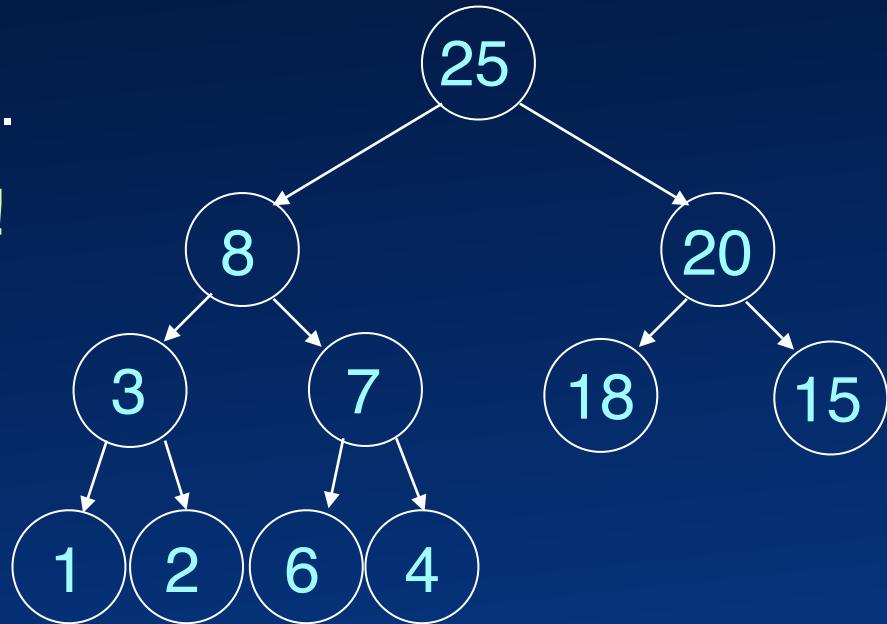


# Heap Construction

?  $\leq \lg 1 + \lg 2 + \lg 3 + \dots \leq ?$

$\lg 1 + 1 + \lg 2 + 1 + \lg 3 + 1 \dots$

$\lg (1 * 2 * 3 \dots n-1) = \lg (n-1)!$



Heap



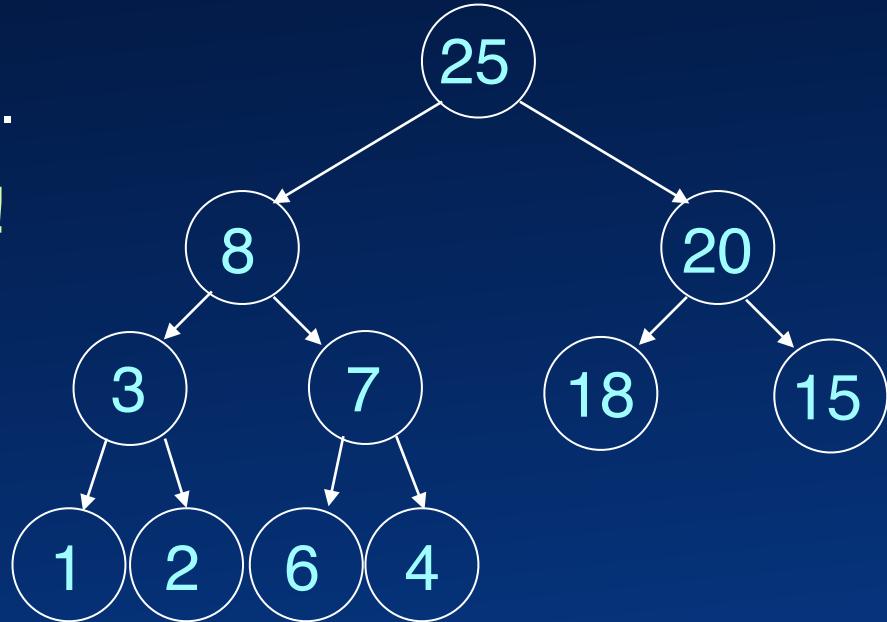
# Heap Construction

?  $\leq \lg 1 + \lg 2 + \lg 3 + \dots \leq ?$

$\lg 1 + 1 + \lg 2 + 1 + \lg 3 + 1 \dots$

$\lg (1 * 2 * 3 \dots n-1) = \lg (n-1)!$

$\Theta(n \lg n)$



Heap



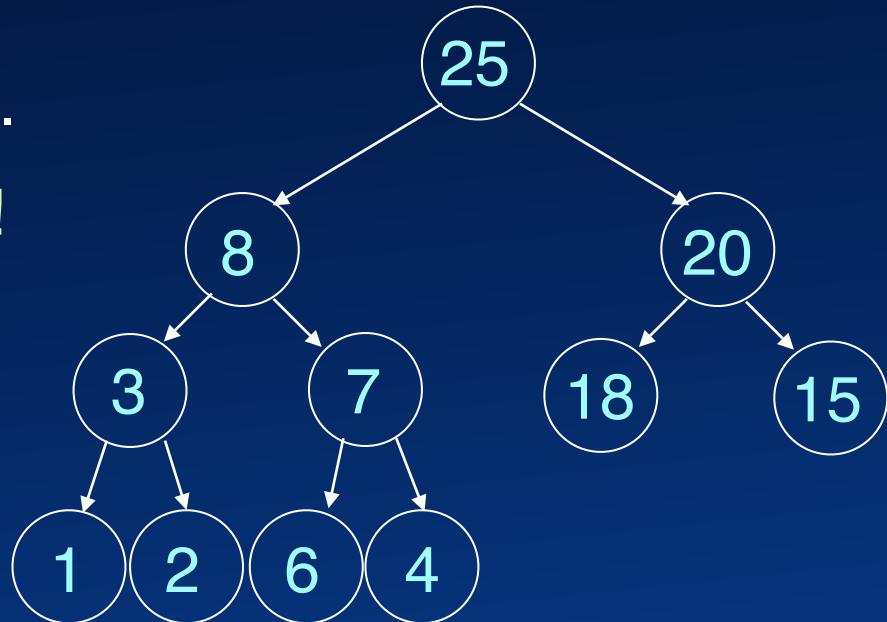
# Heap Construction

?  $\leq \lg 1 + \lg 2 + \lg 3 + \dots \leq ?$

$\lg 1 + 1 + \lg 2 + 1 + \lg 3 + 1 \dots$

$\lg (1 * 2 * 3 \dots n-1) = \lg (n-1)!$

$\Theta(n \lg n)$



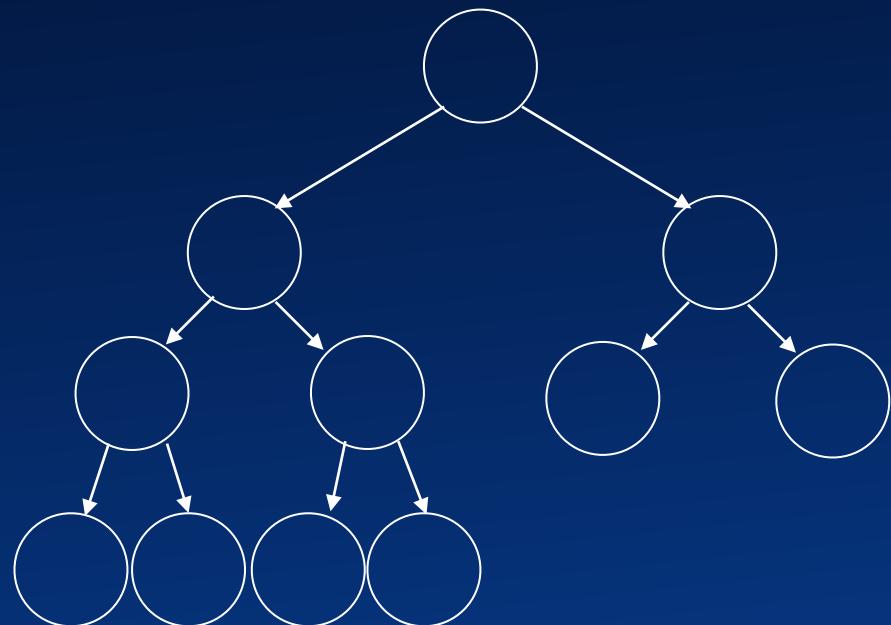
$(n/2)^{n/2} < n! < n^n, n > 1$

Heap



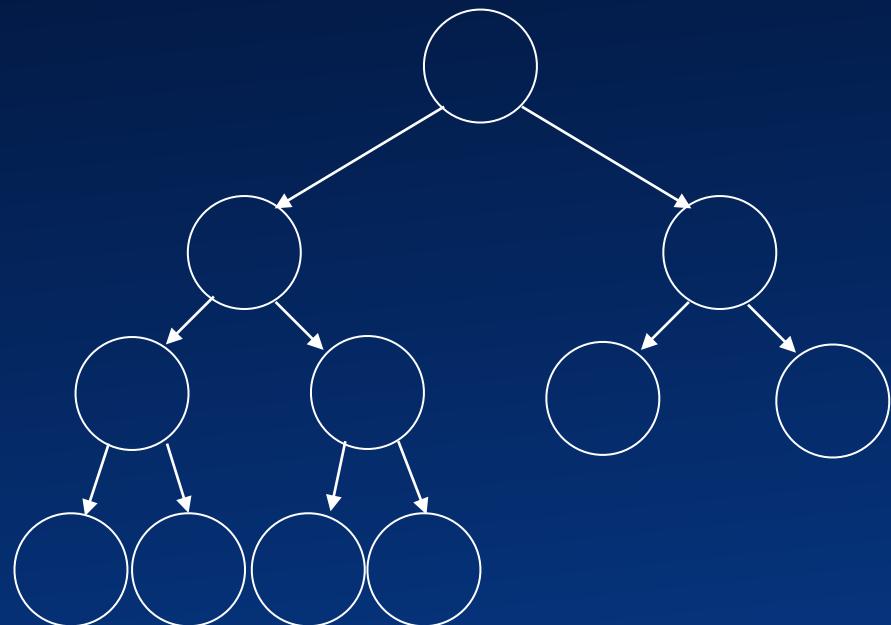
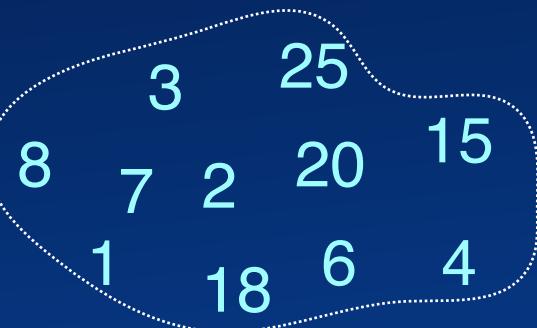
# Heap Construction

3      25  
8      20  
7      15  
2      18  
1      6      4



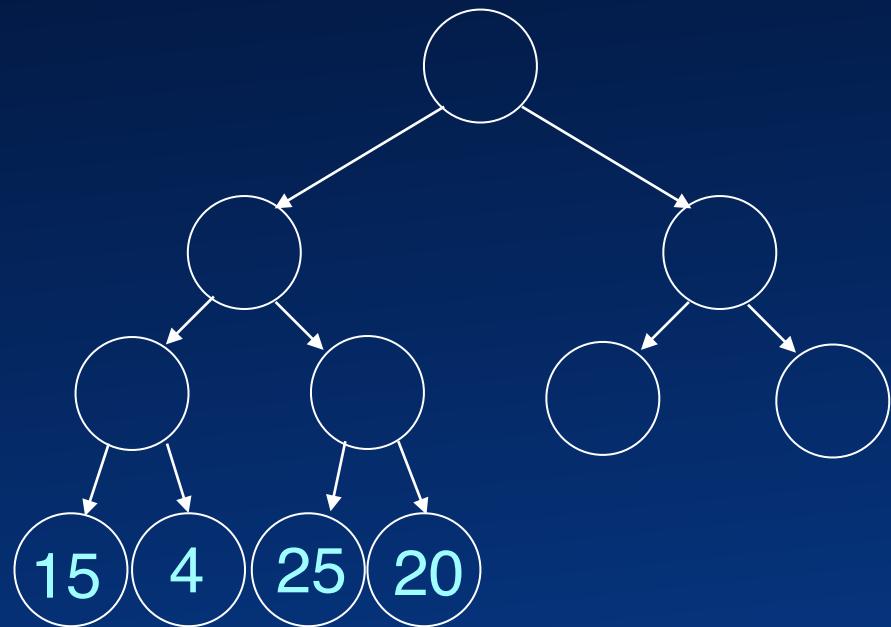
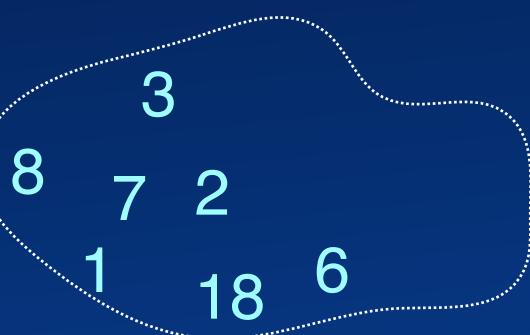


# Heap Construction



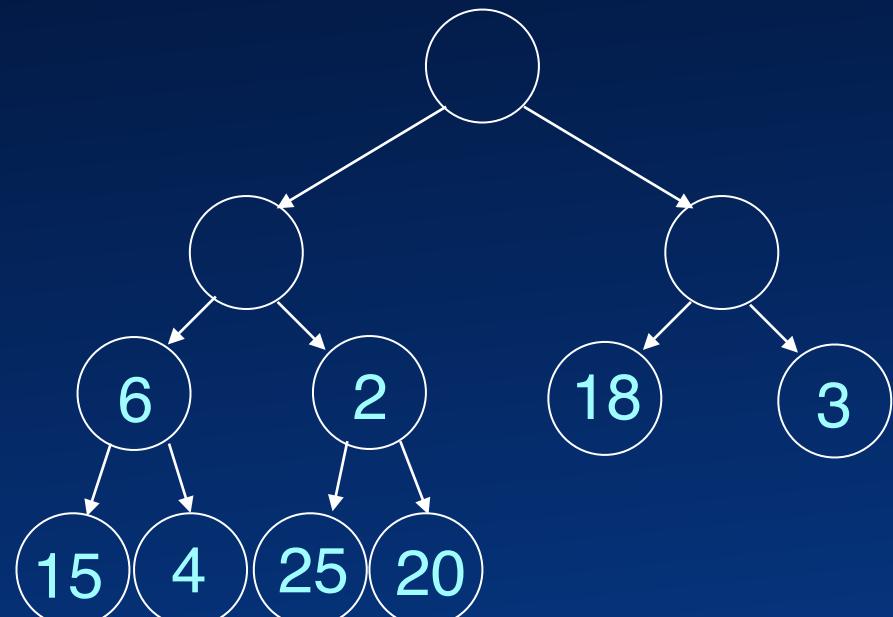


# Heap Construction



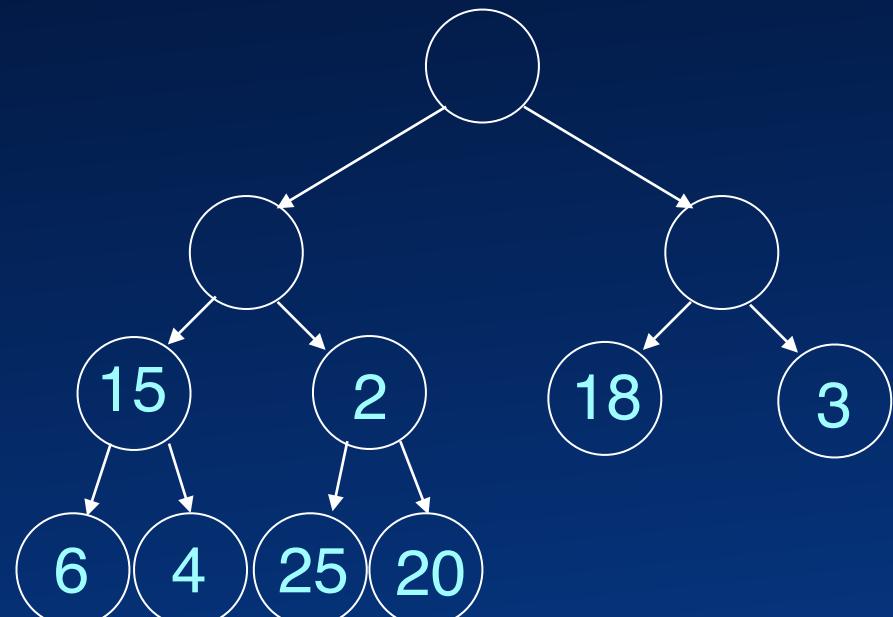


# Heap Construction



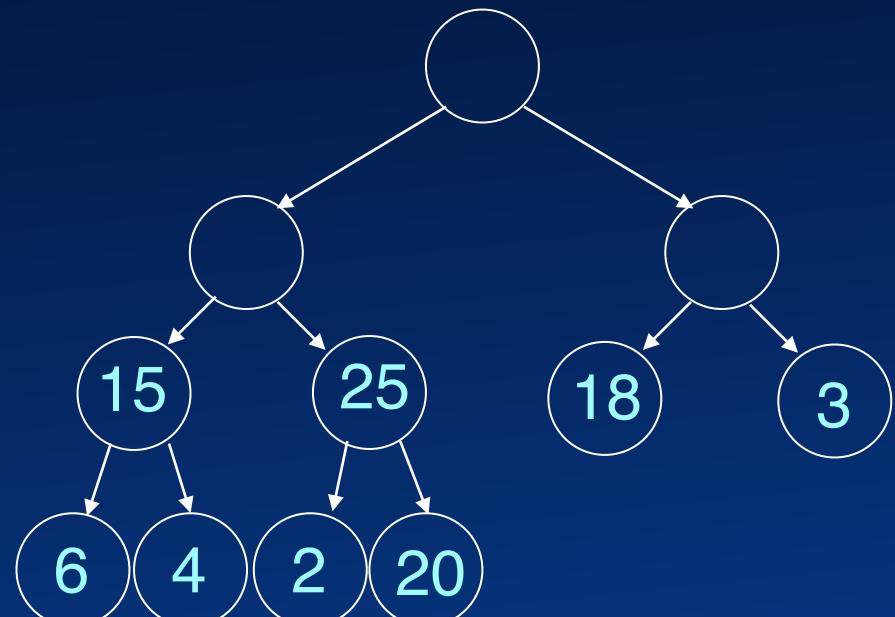


# Heap Construction



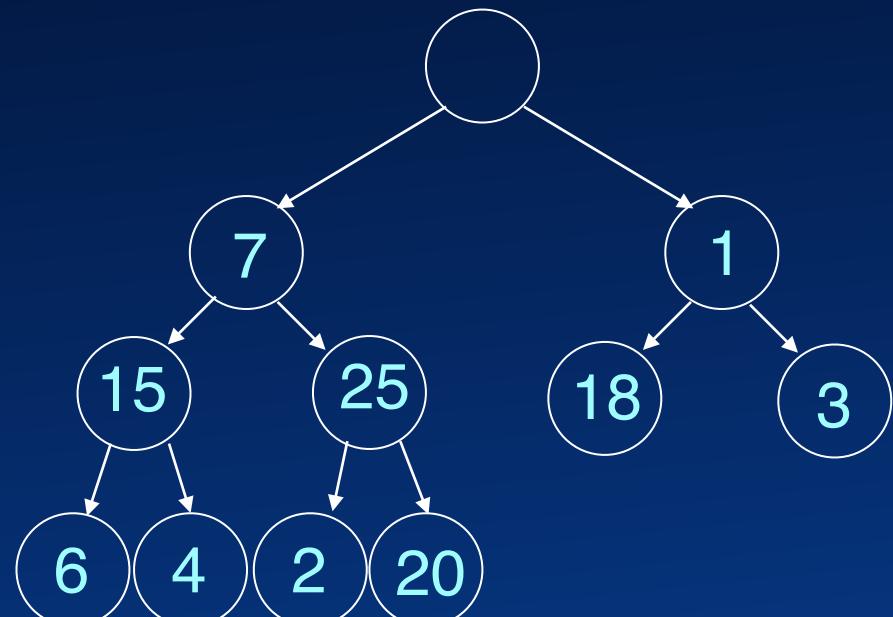


# Heap Construction



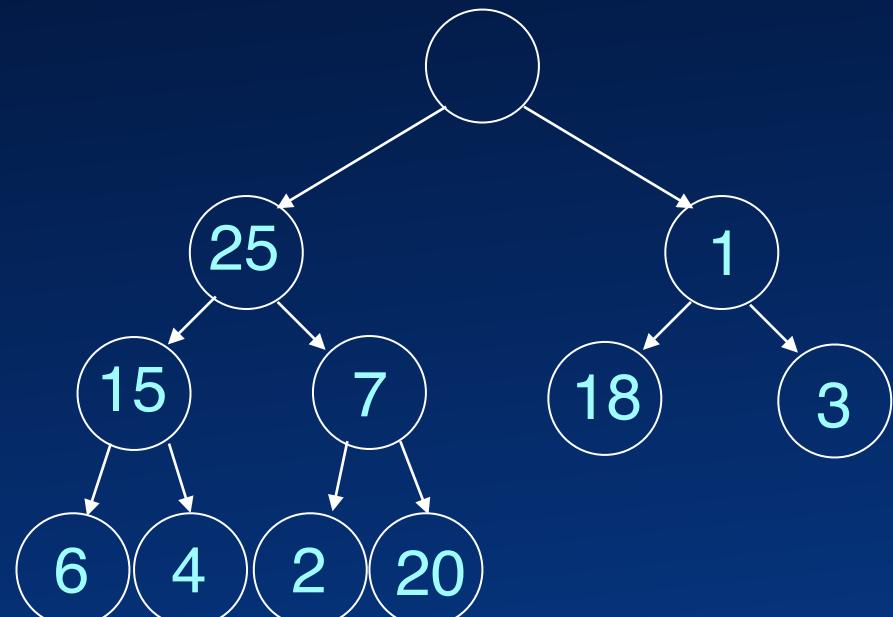


# Heap Construction





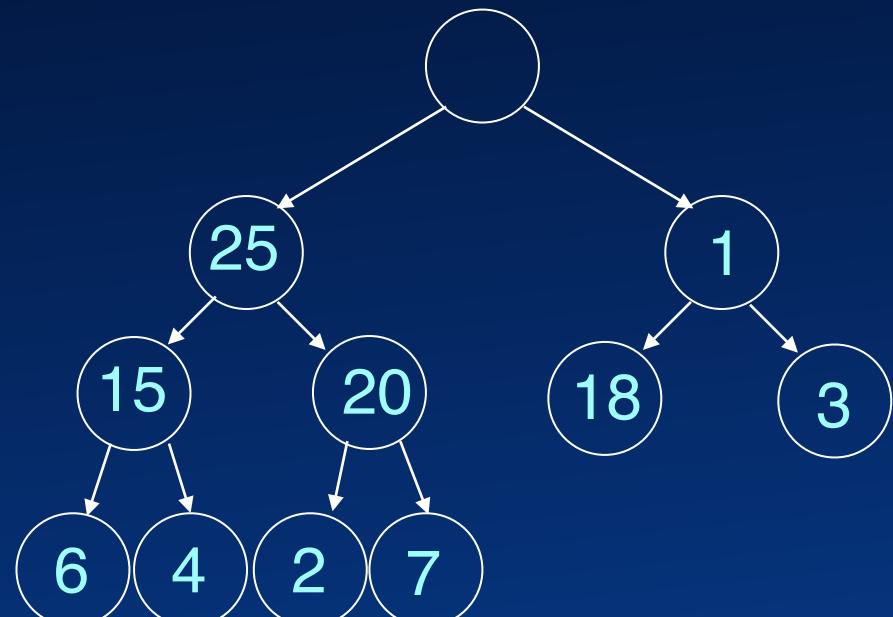
# Heap Construction



8

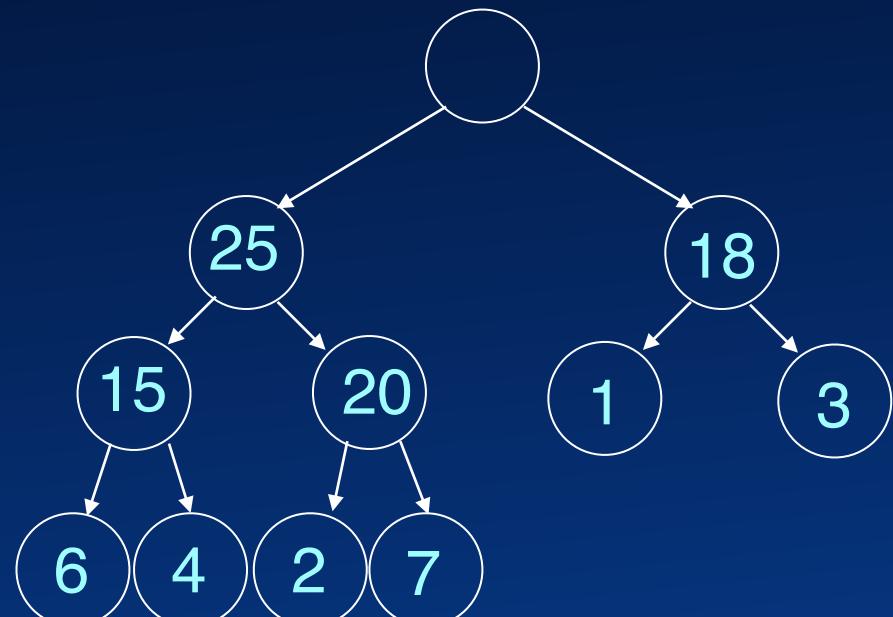


# Heap Construction





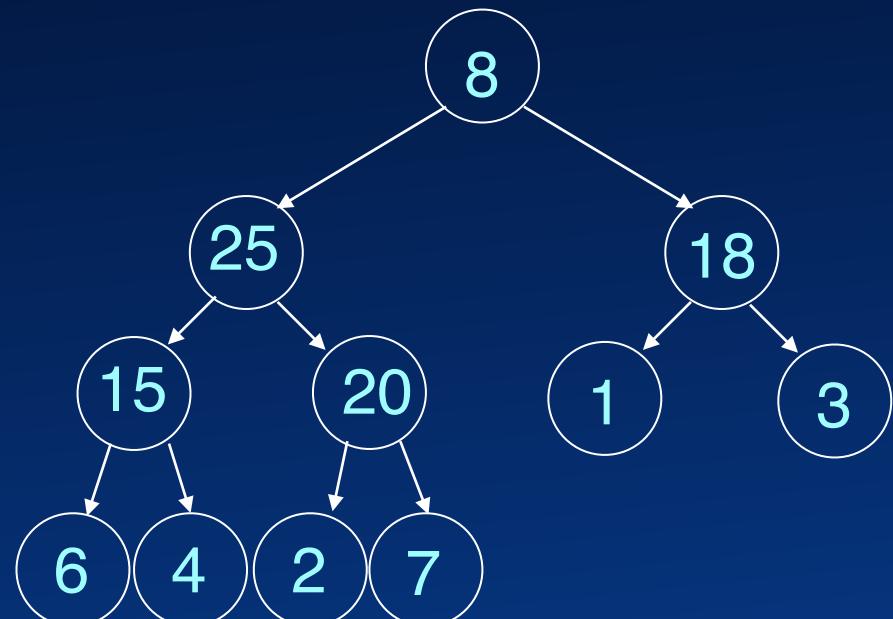
# Heap Construction



8

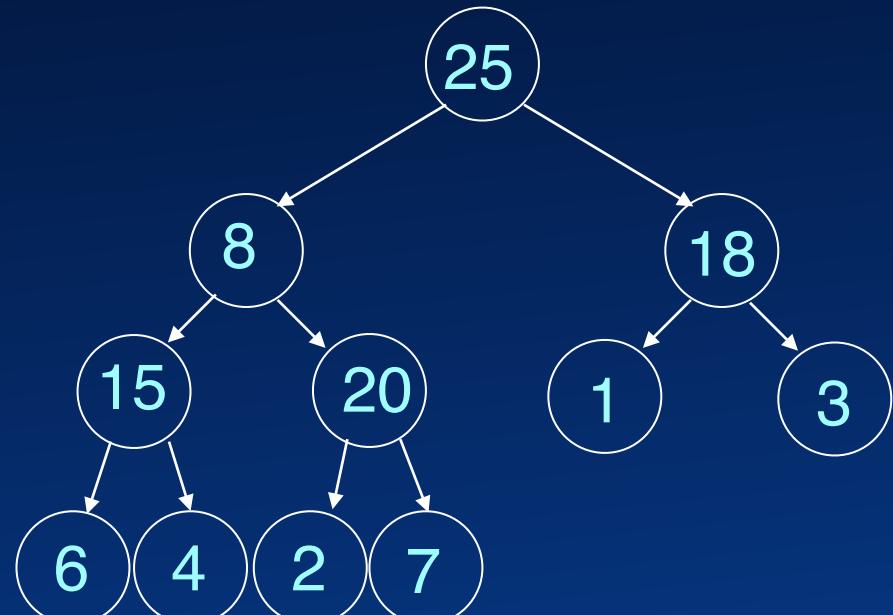


# Heap Construction



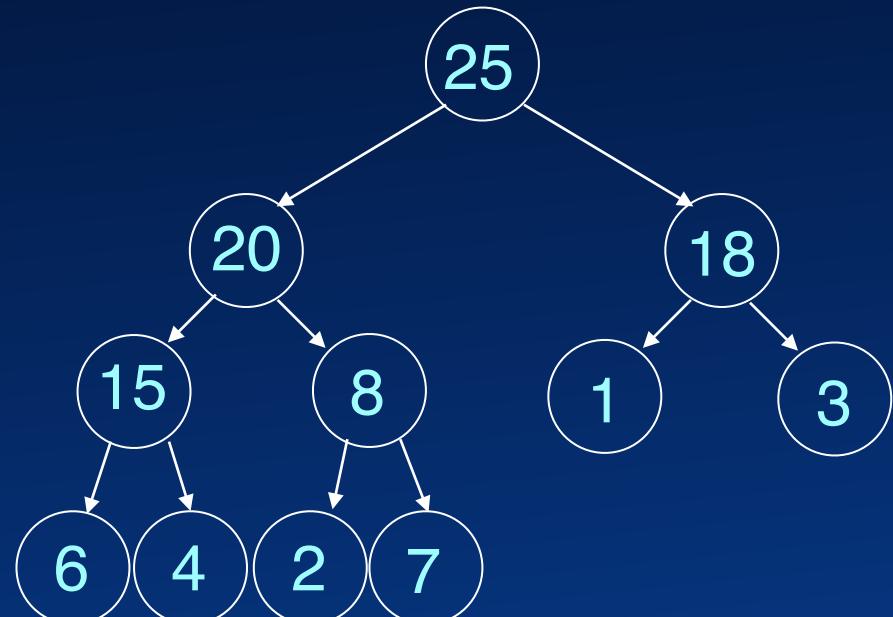


# Heap Construction



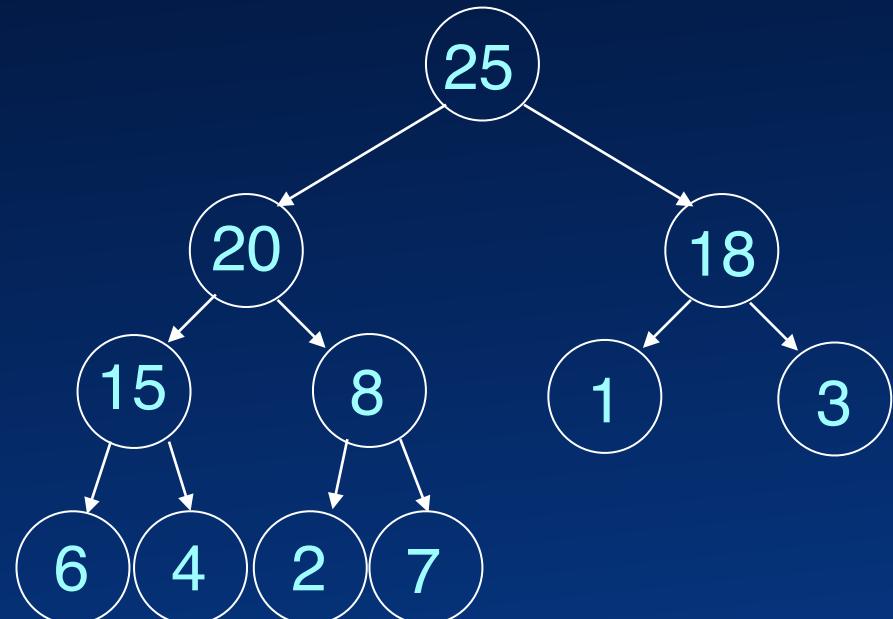


# Heap Construction





# Heap Construction

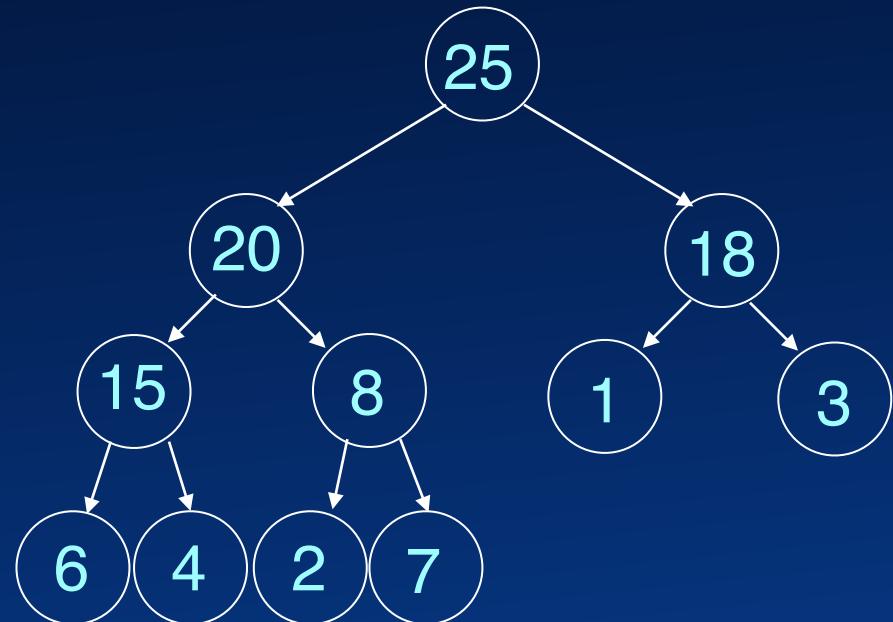


Heap



# Heap Construction

$$T(n) \leq (n/2) + 2(n/4) + 3(n/8) + 4(n/16)$$



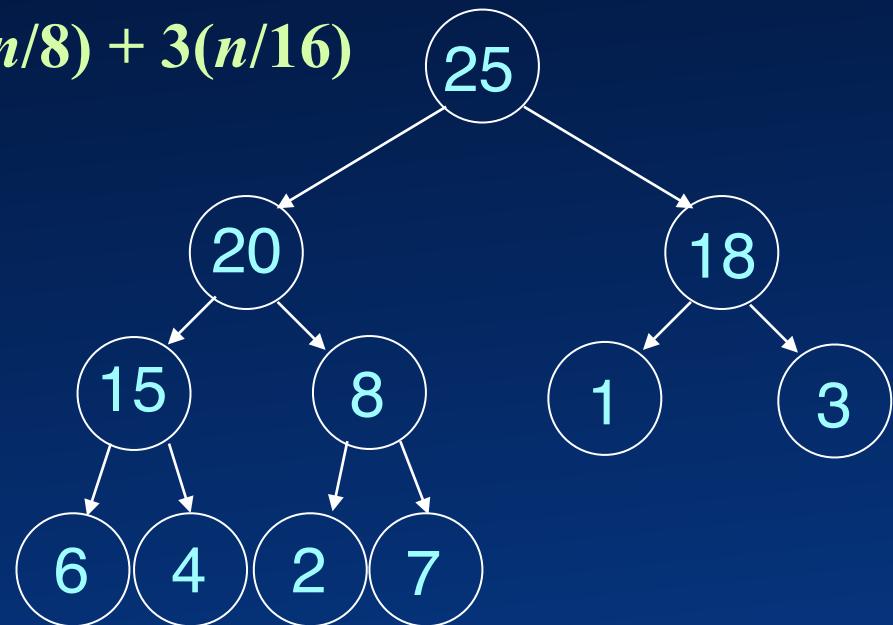
Heap



# Heap Construction

$$T(n) \leq (n/2) + 2(n/4) + 3(n/8) + 4(n/16)$$

$$= n/2 + n/4 + n/8 + .. (n/4) + 2(n/8) + 3(n/16)$$



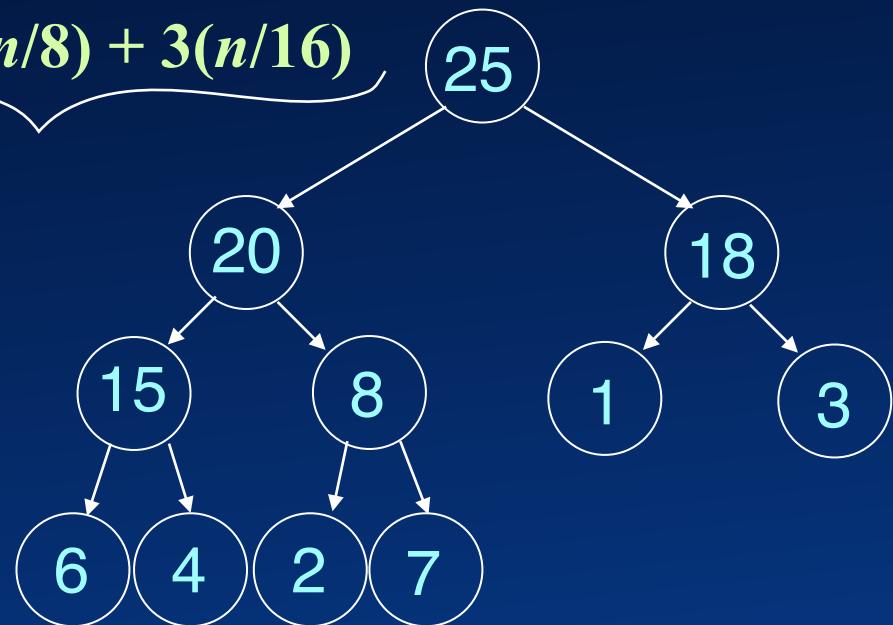
Heap



# Heap Construction

$$T(n) \leq (n/2) + 2(n/4) + 3(n/8) + 4(n/16)$$

$$= n/2 + n/4 + n/8 + .. (n/4) + 2(n/8) + 3(n/16)$$



Heap

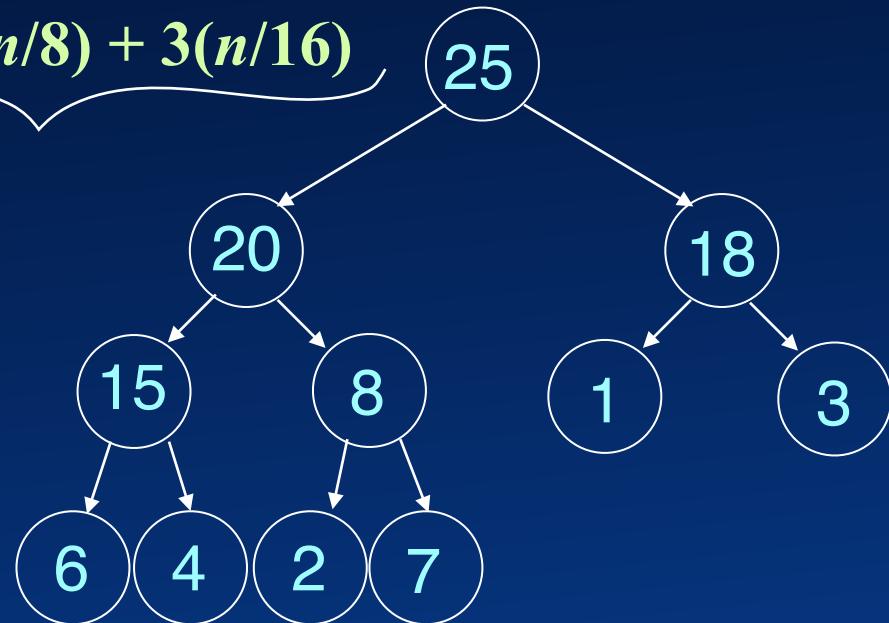


# Heap Construction

$$T(n) \leq (n/2) + 2(n/4) + 3(n/8) + 4(n/16)$$

$$= n/2 + n/4 + n/8 + \dots + (n/4) + 2(n/8) + 3(n/16)$$

$$T(n) \leq (n-1) + T(n/2)$$



Heap



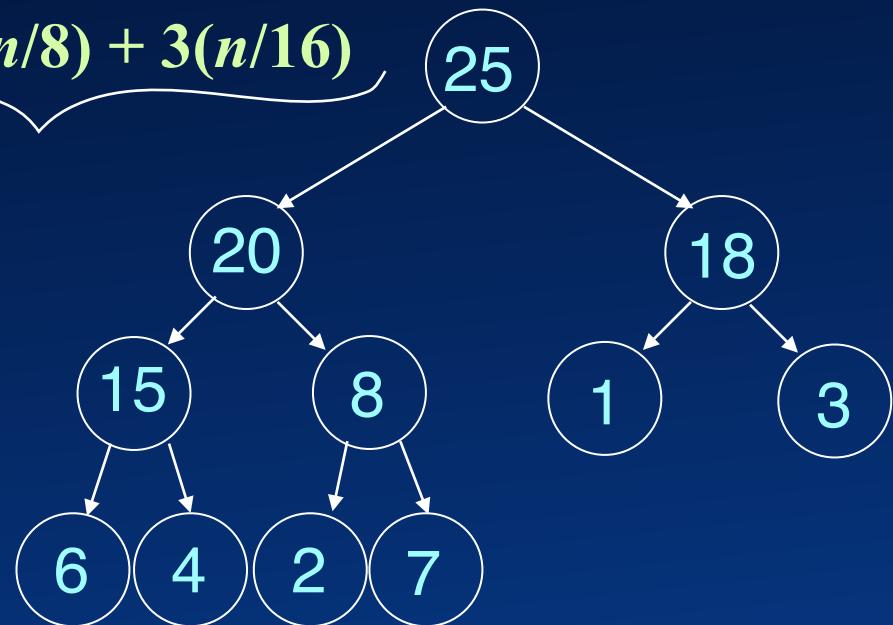
# Heap Construction

$$T(n) \leq (n/2) + 2(n/4) + 3(n/8) + 4(n/16)$$

$$= n/2 + n/4 + n/8 + \dots + (n/4) + 2(n/8) + 3(n/16)$$

$$\boxed{T(n) \leq (n-1) + T(n/2)}$$

$$= (n-1) + (n/2 - 1) \dots$$



Heap

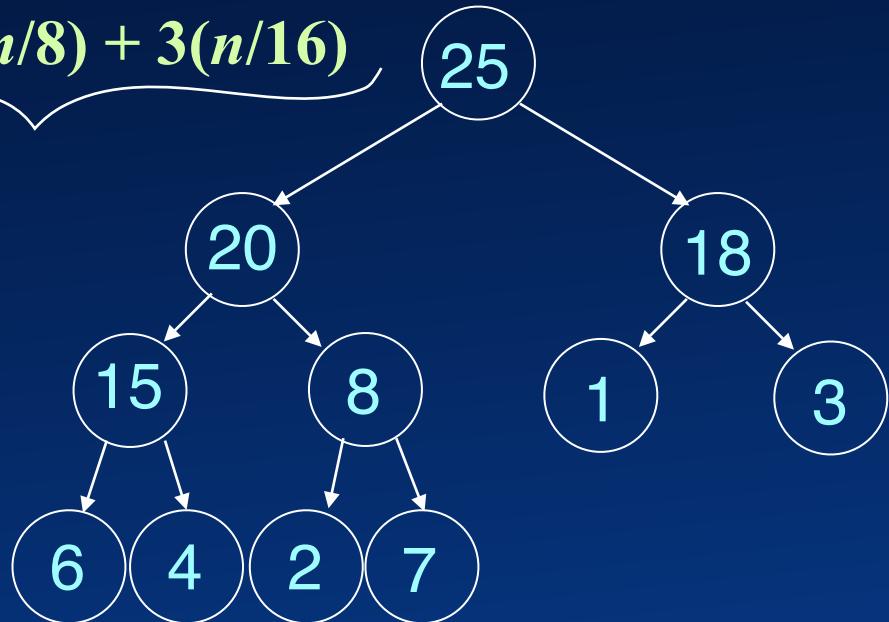


# Heap Construction

$$T(n) \leq (n/2) + 2(n/4) + 3(n/8) + 4(n/16)$$

$$= n/2 + n/4 + n/8 + \dots + (n/4) + 2(n/8) + 3(n/16)$$

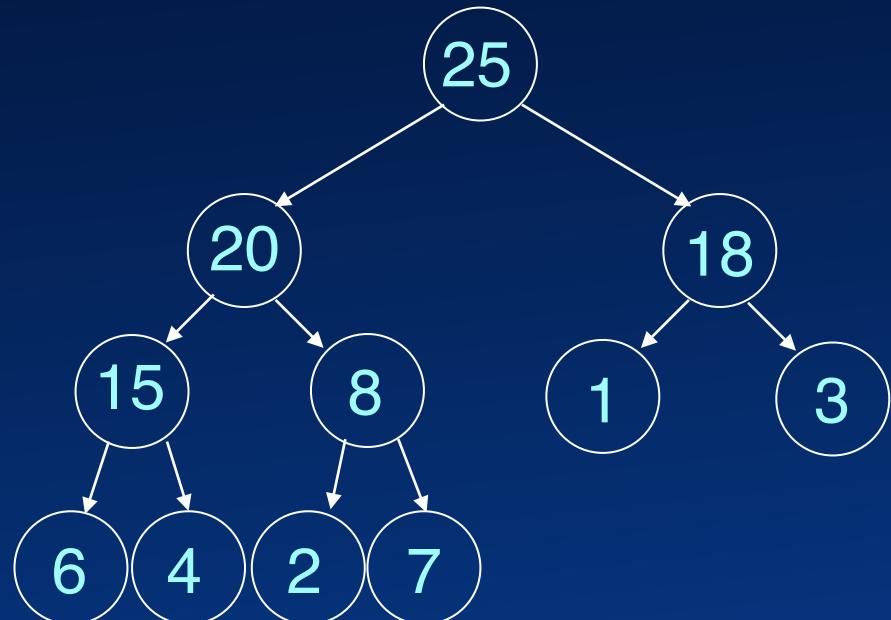
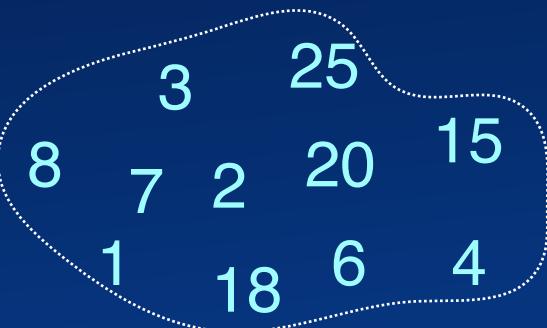
$$\begin{aligned} T(n) &\leq (n-1) + T(n/2) \\ &= (n-1) + (n/2 - 1) \dots \\ &= \Theta(n) \end{aligned}$$



Heap



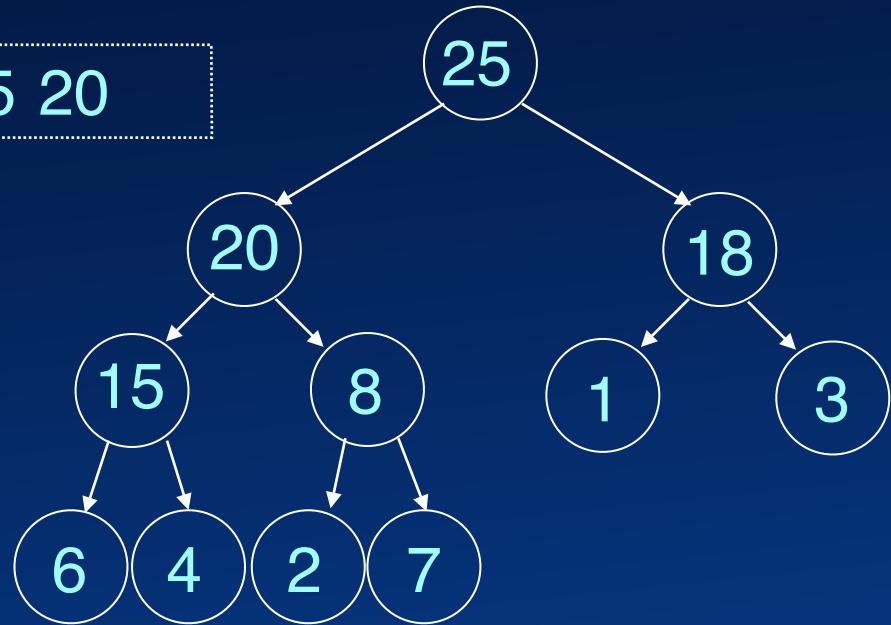
# Heap Construction





# Heap Construction

8 7 1 6 2 18 3 15 4 25 20

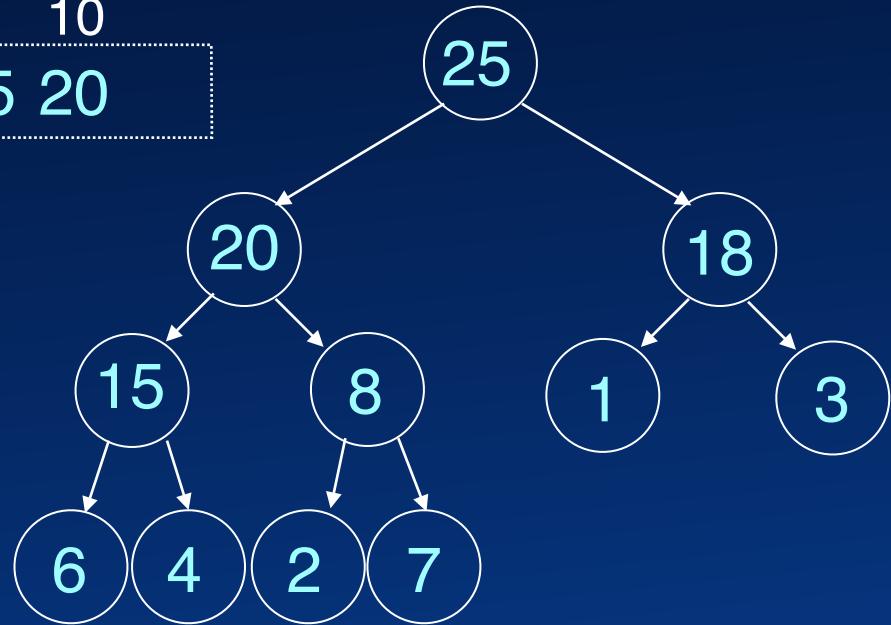


Heap



# Heap Construction

0 1 2 3 4 5 6 7 8 9 10  
8 7 1 6 2 18 3 15 4 25 20

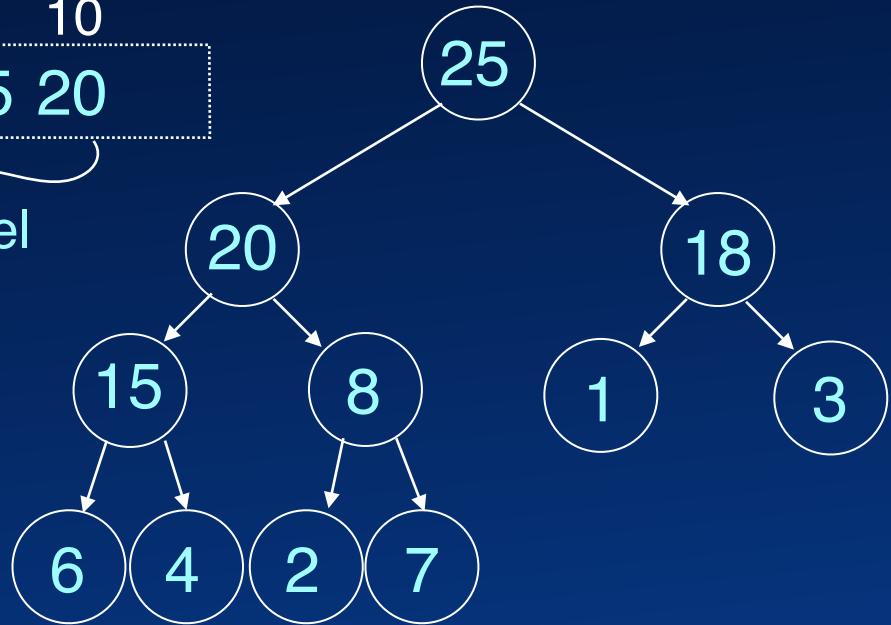


Heap



# Heap Construction

0 1 2 3 4 5 6 7 8 9 10  
8 7 1 6 2 18 3 15 4 25 20



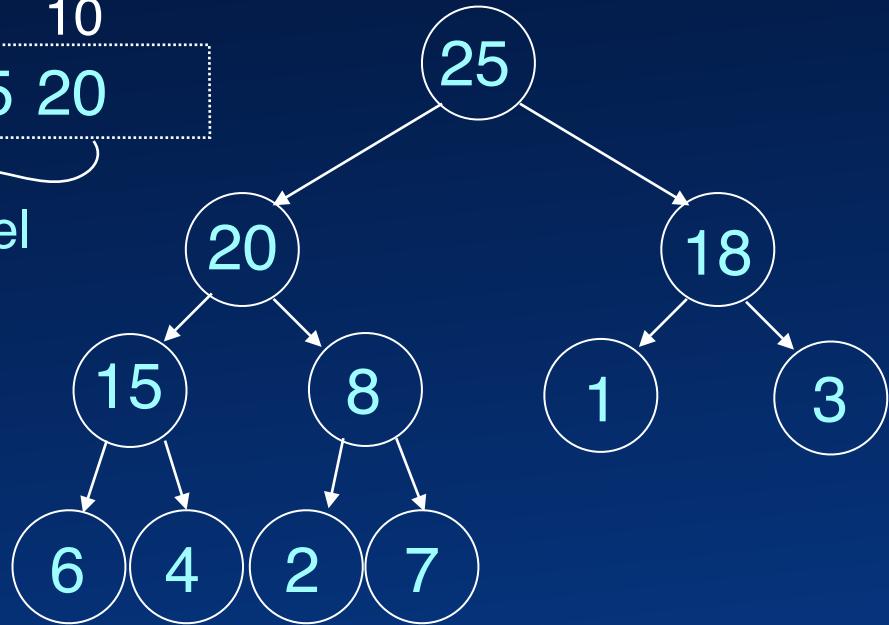
Heap



# Heap Construction

0 1 2 3 4 5 6 7 8 9 10  
8 7 1 6 2 18 3 15 4 25 20

last level



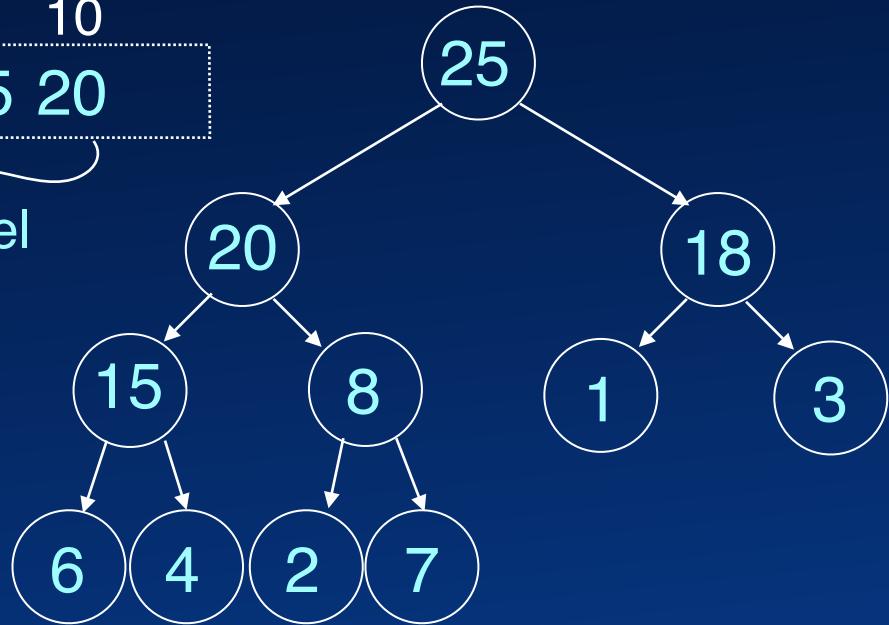
Heap



# Heap Construction

0 1 2 3 4 5 6 7 8 9 10  
8 7 1 6 2 18 3 15 4 25 20

↑  
last level



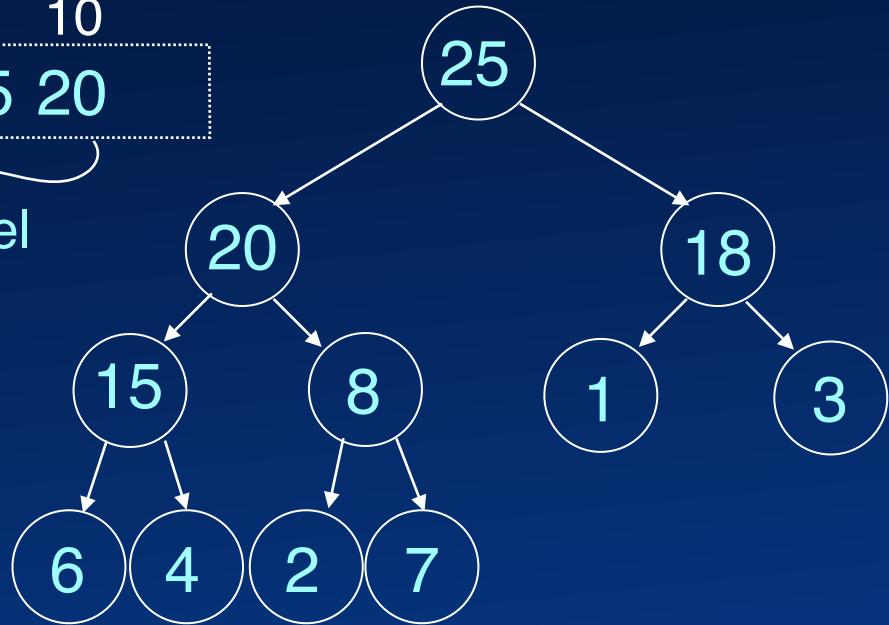
Heap



# Heap Construction

0 1 2 3 4 5 6 7 8 9 10  
8 7 1 6 2 18 3 15 4 25 20

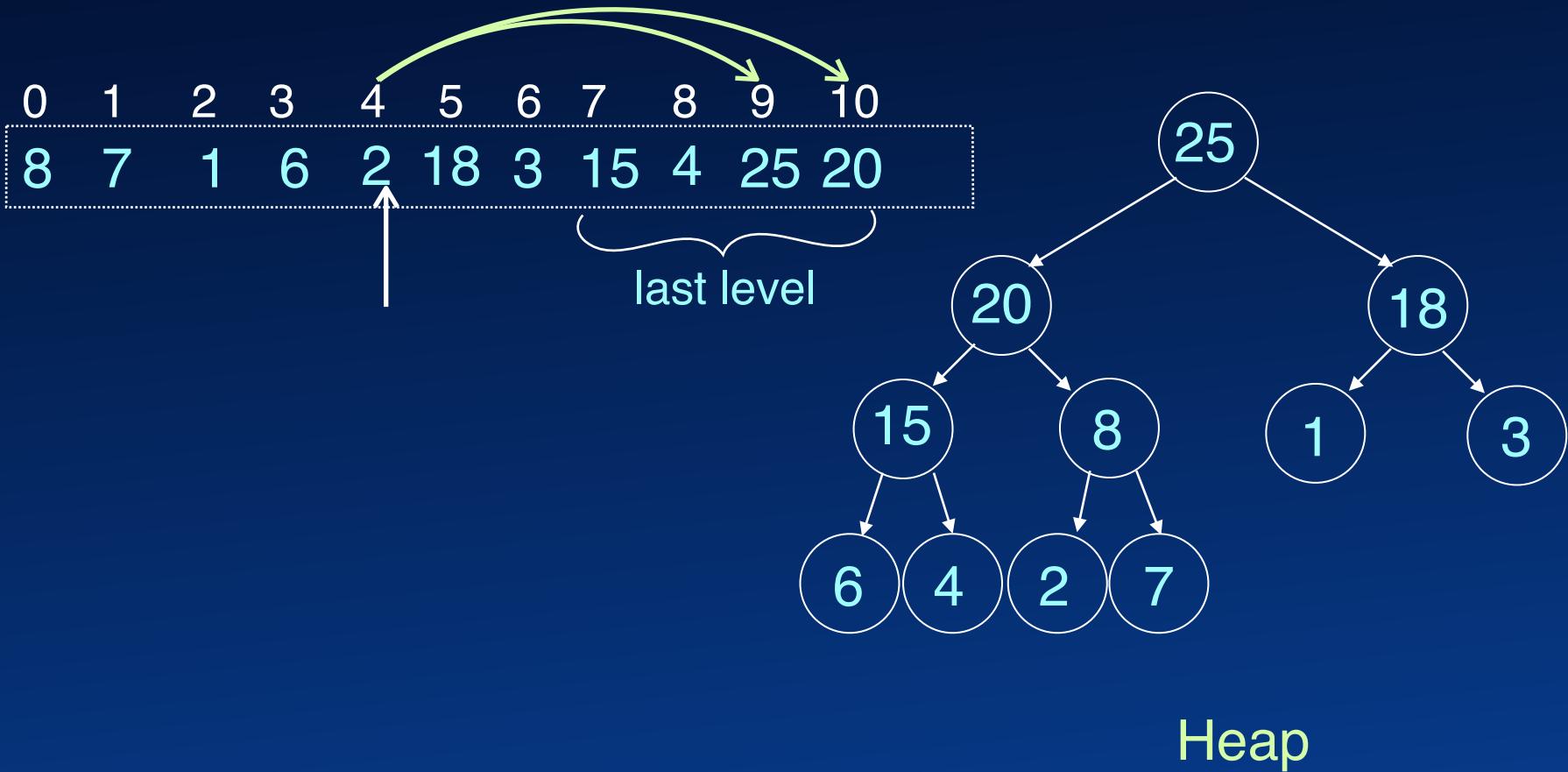
last level



Heap

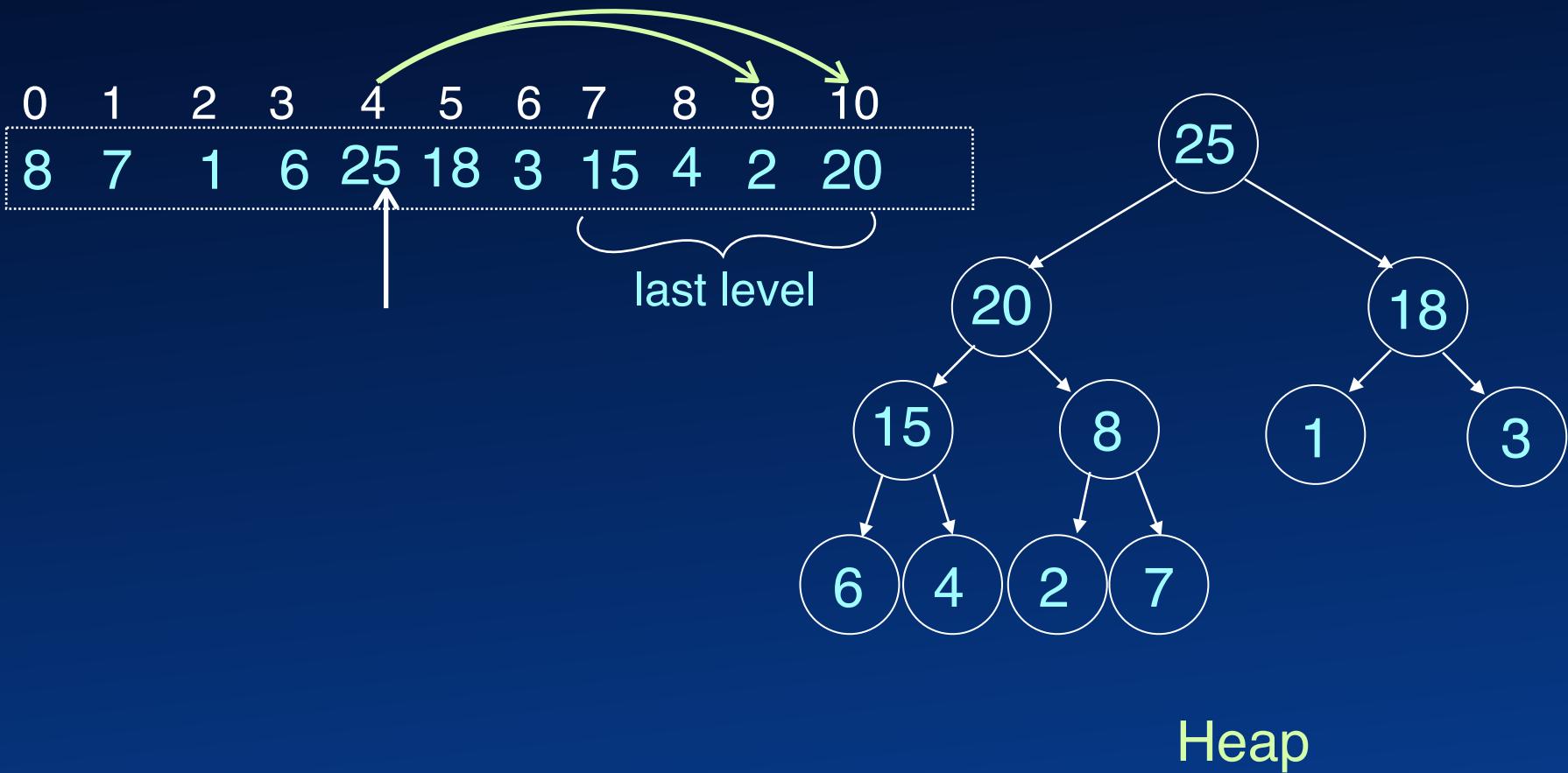


# Heap Construction





# Heap Construction

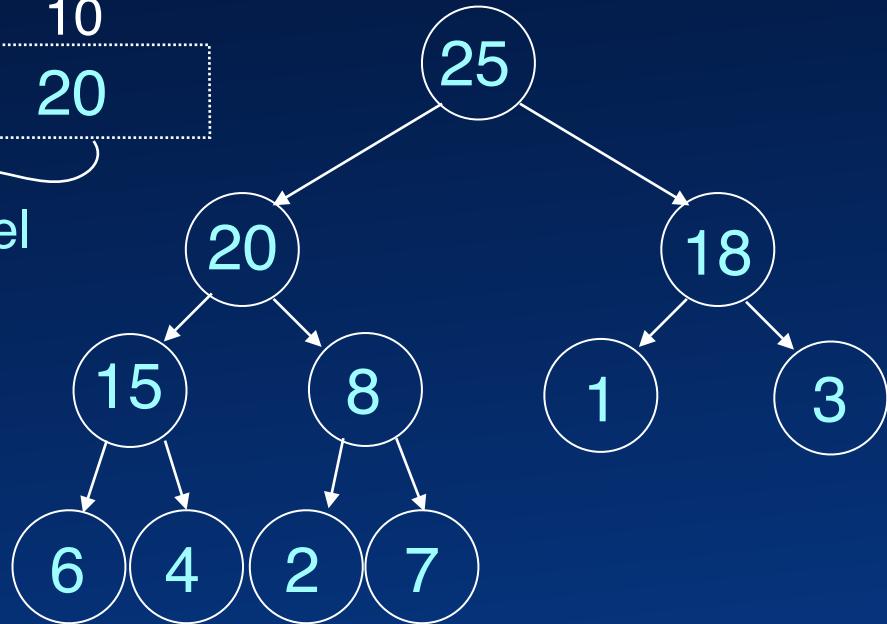




# Heap Construction

0 1 2 3 4 5 6 7 8 9 10  
8 7 1 6 25 18 3 15 4 2 20

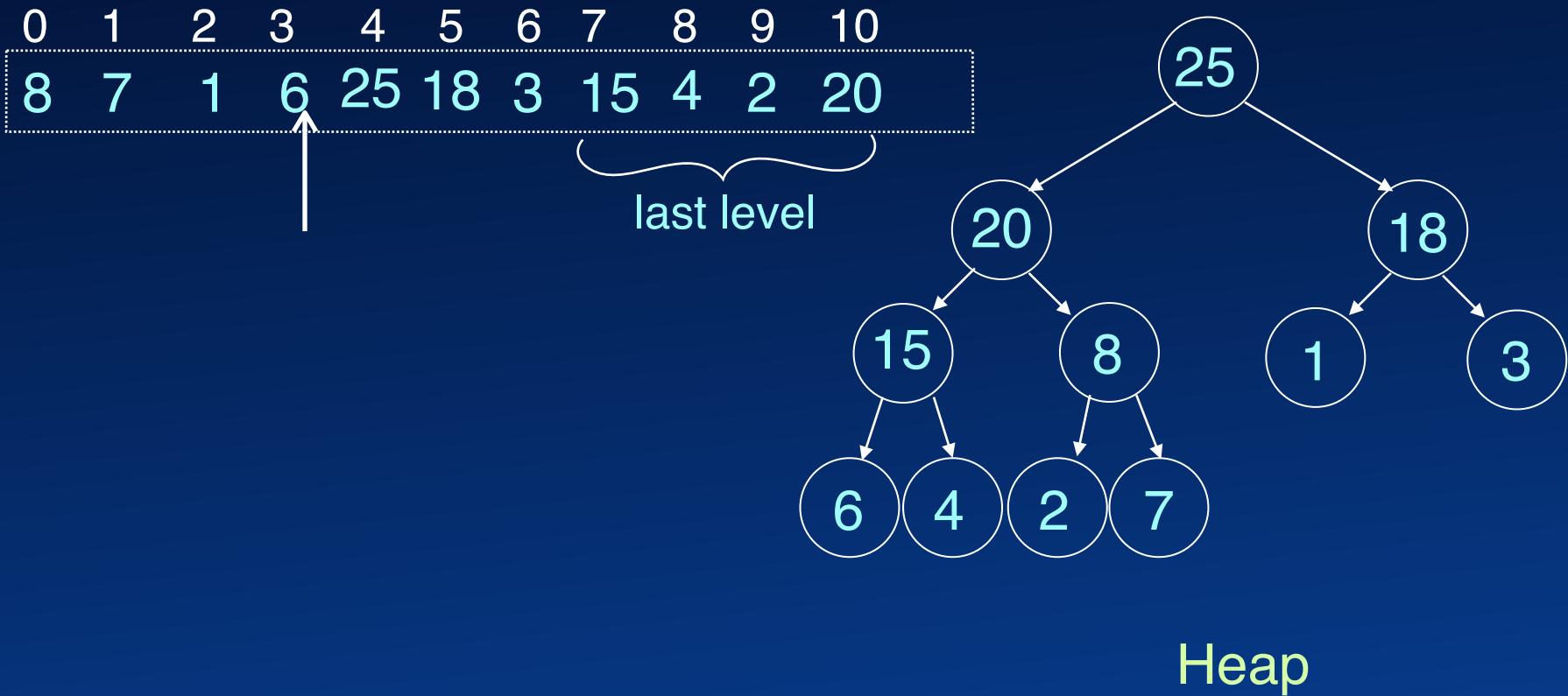
last level



Heap

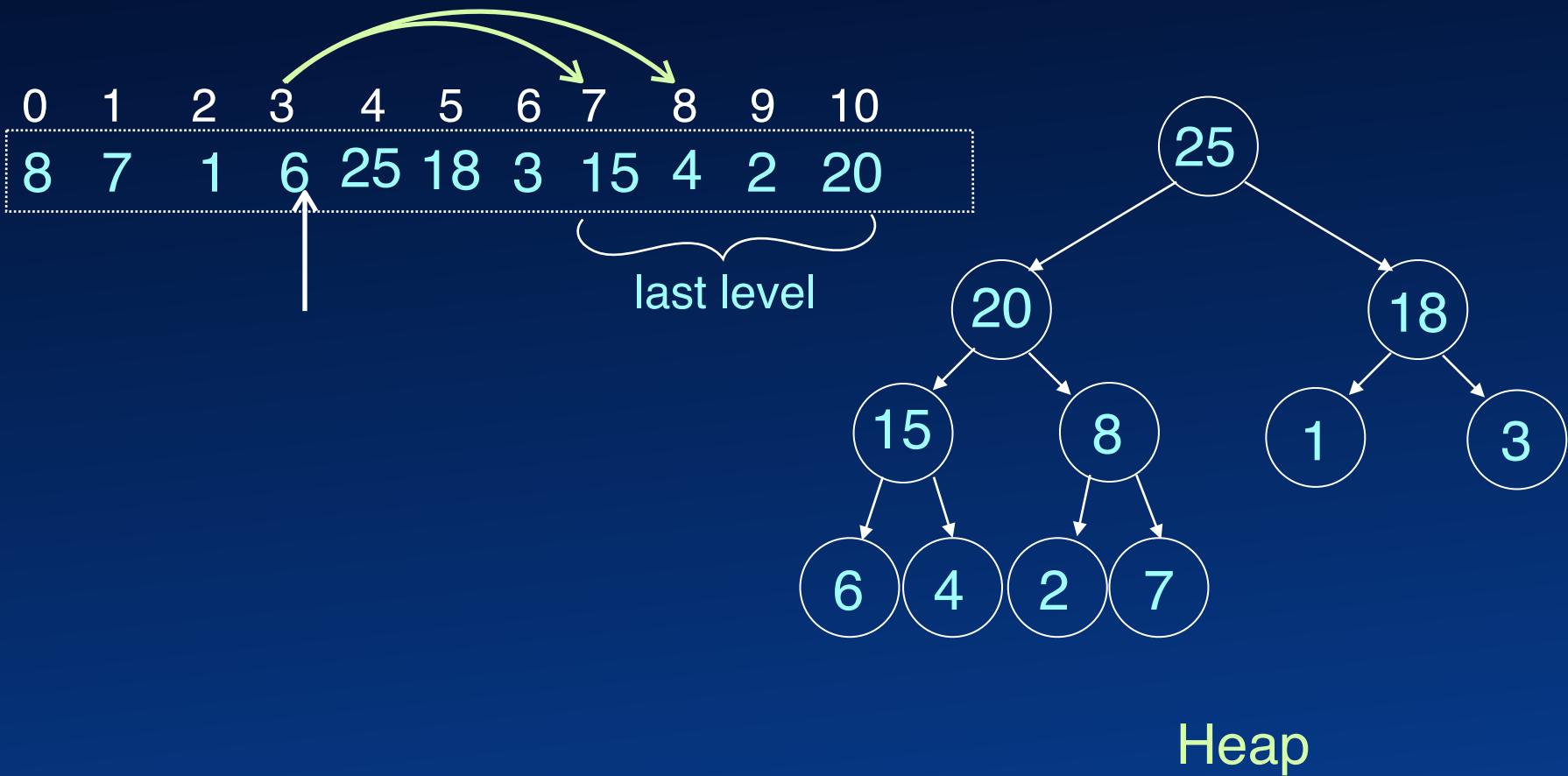


# Heap Construction





# Heap Construction

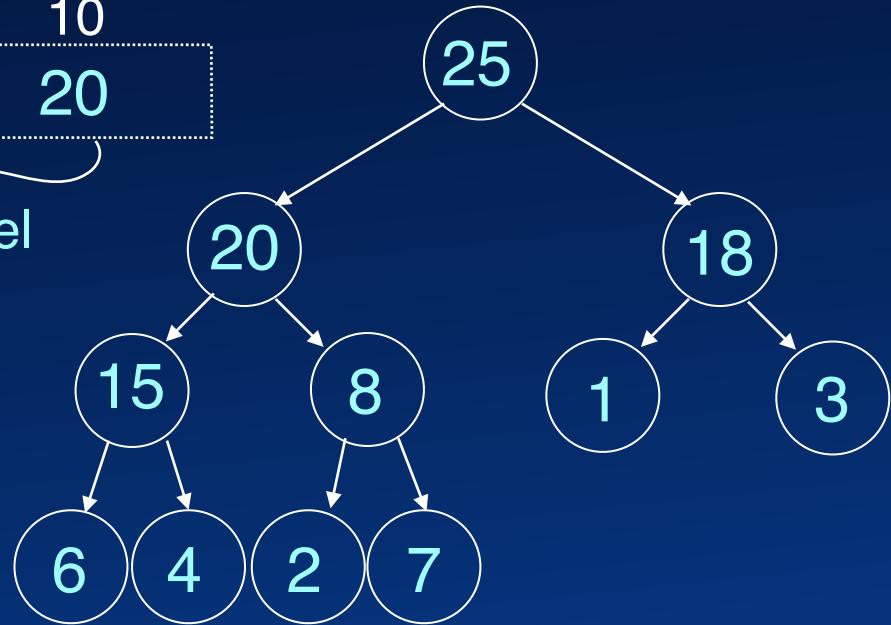




# Heap Construction

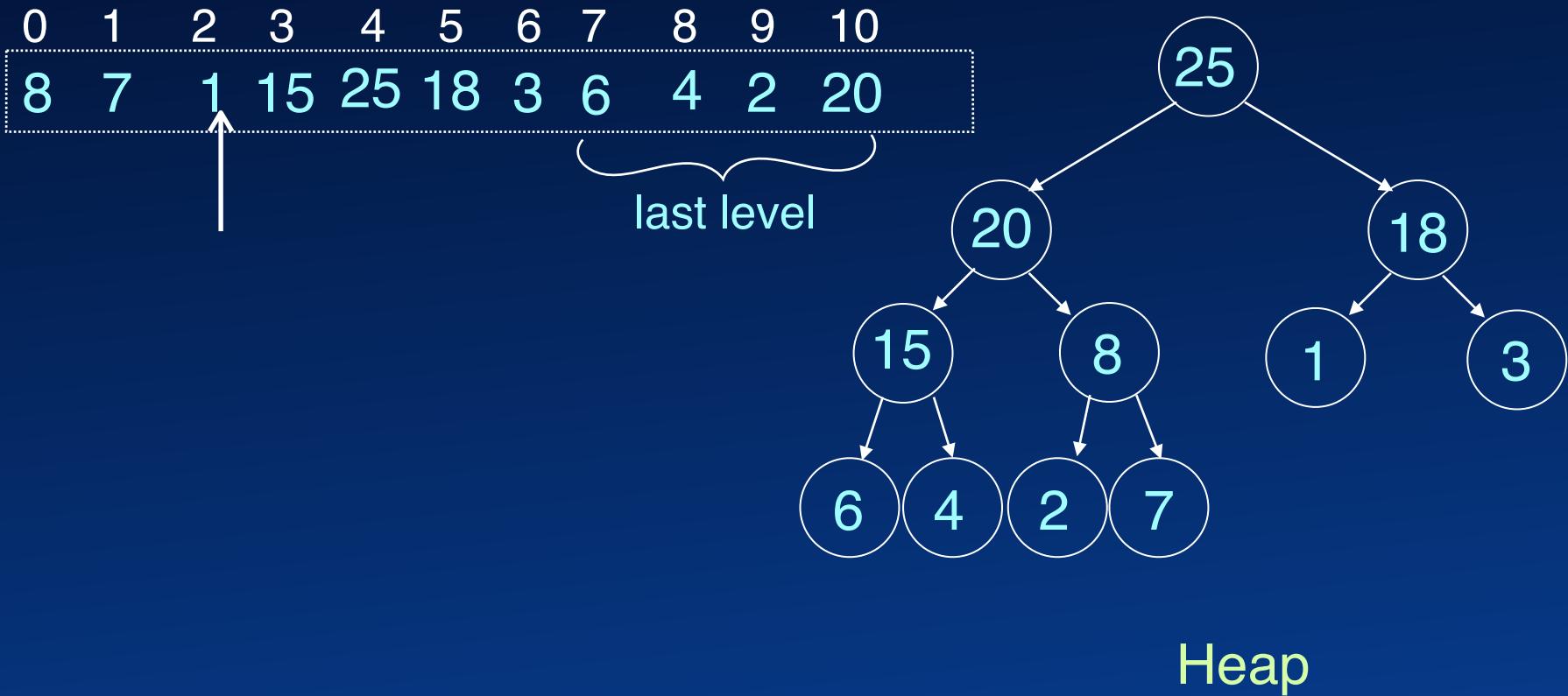
0 1 2 3 4 5 6 7 8 9 10  
8 7 1 15 25 18 3 6 4 2 20

last level



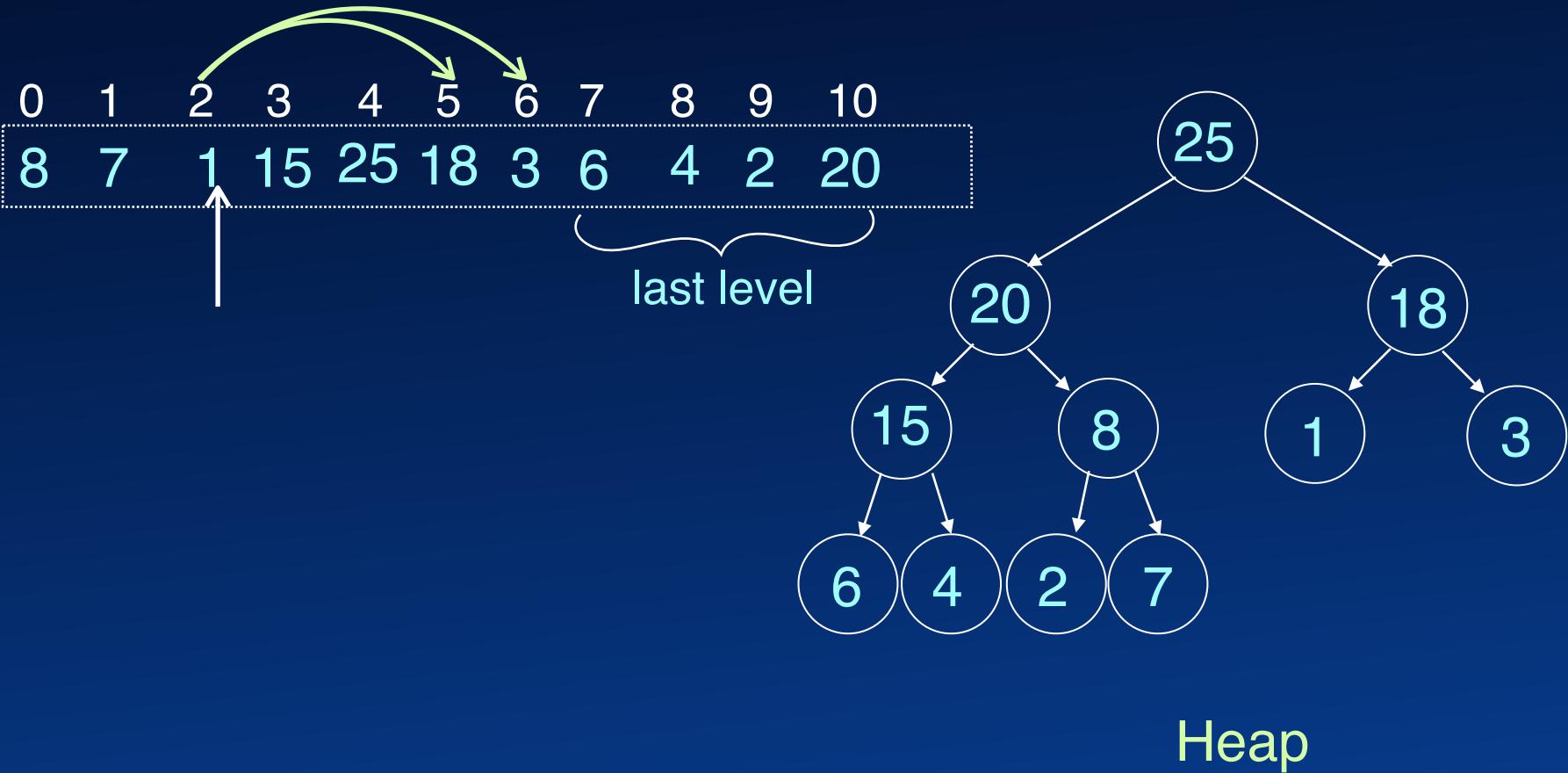


# Heap Construction



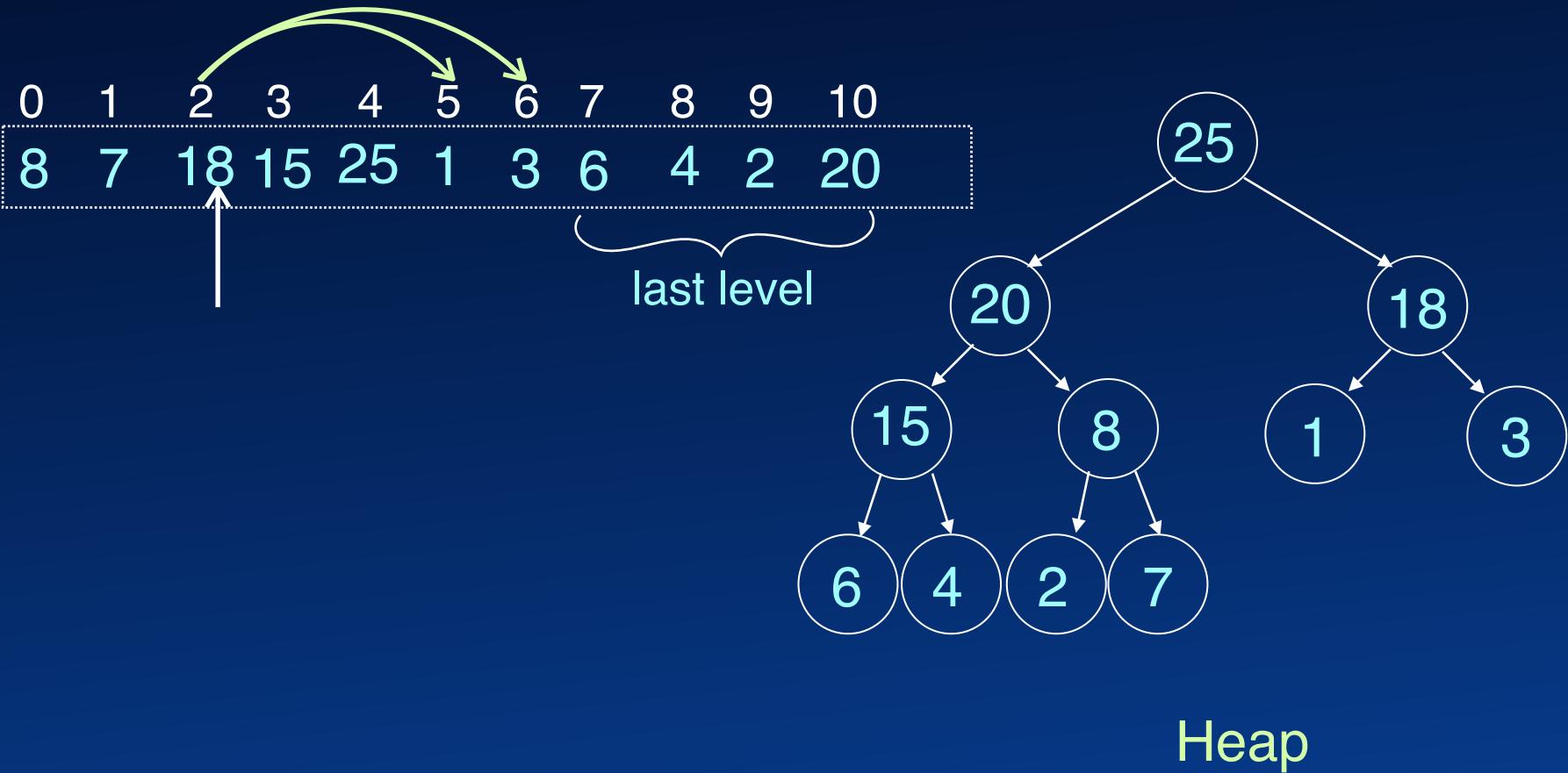


# Heap Construction



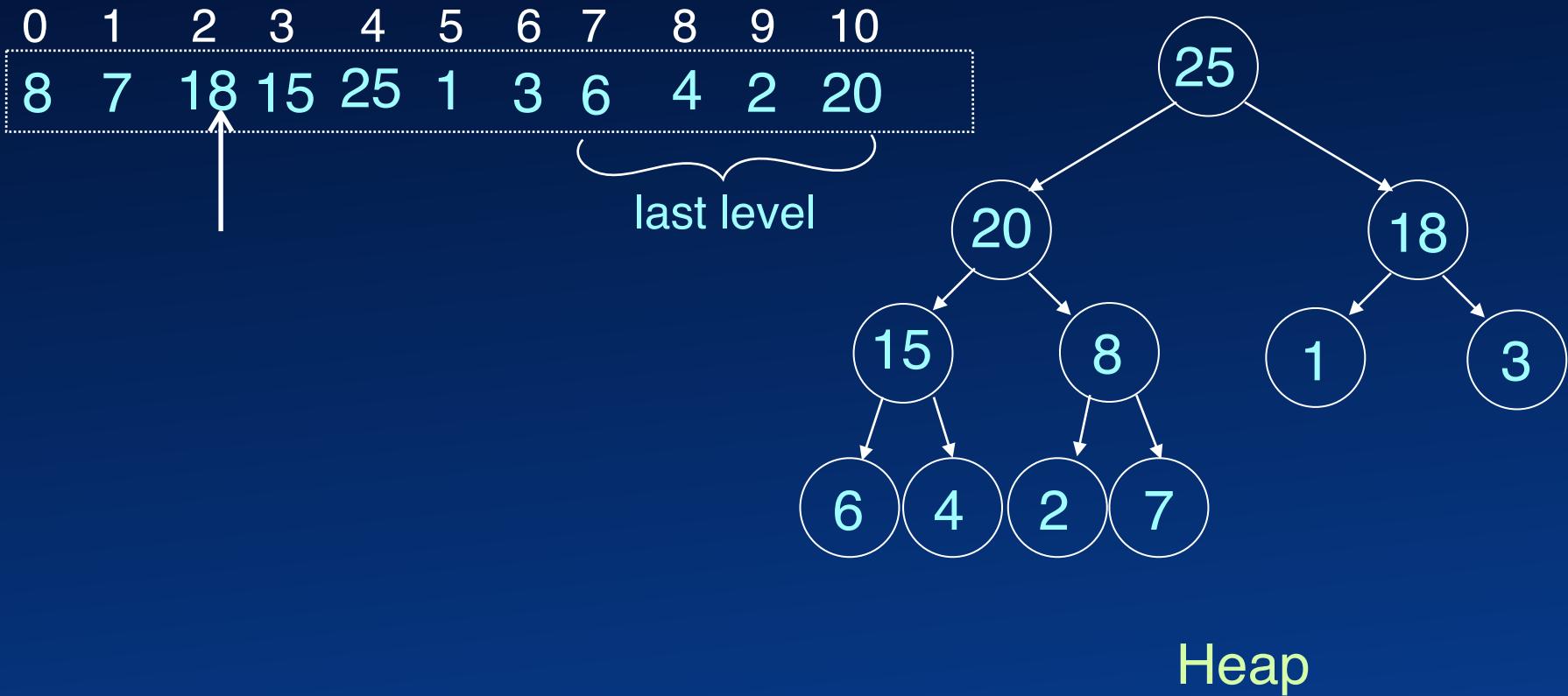


# Heap Construction



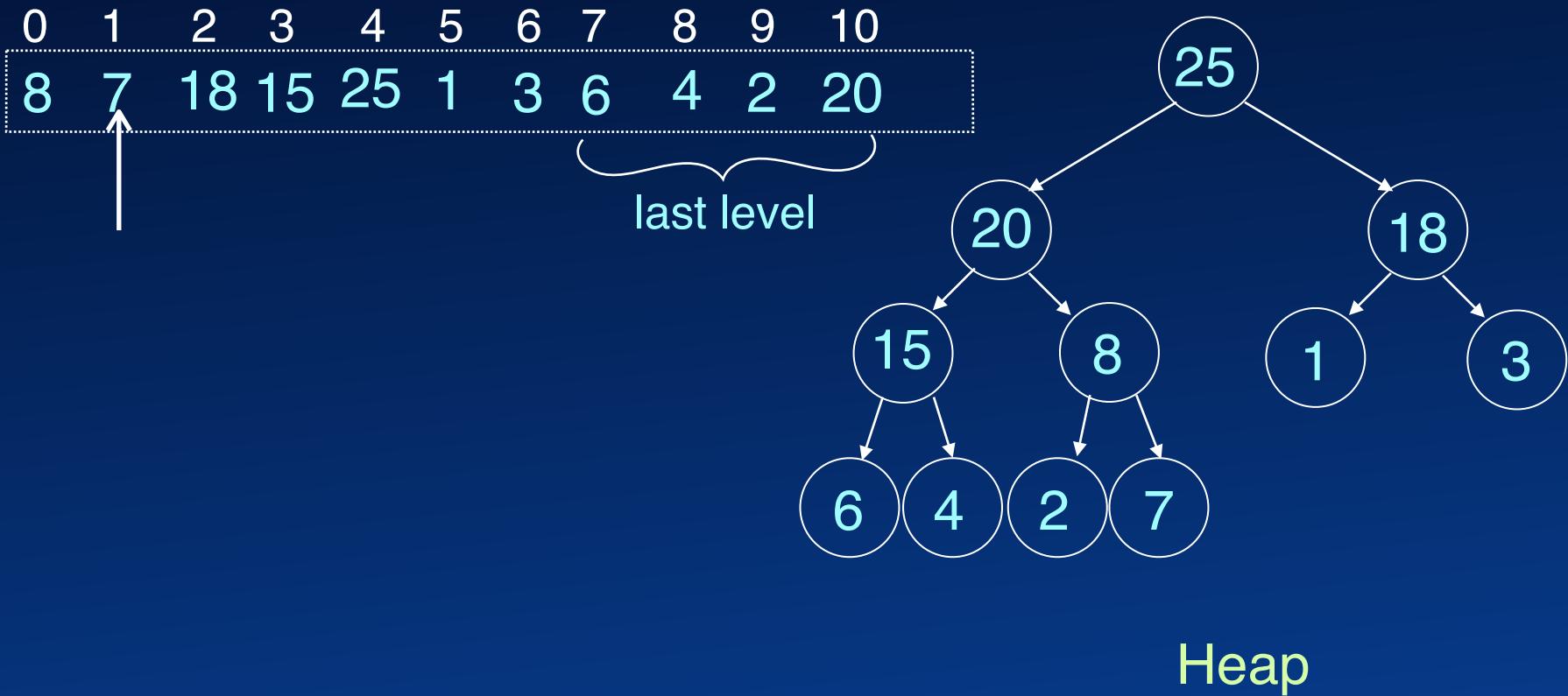


# Heap Construction



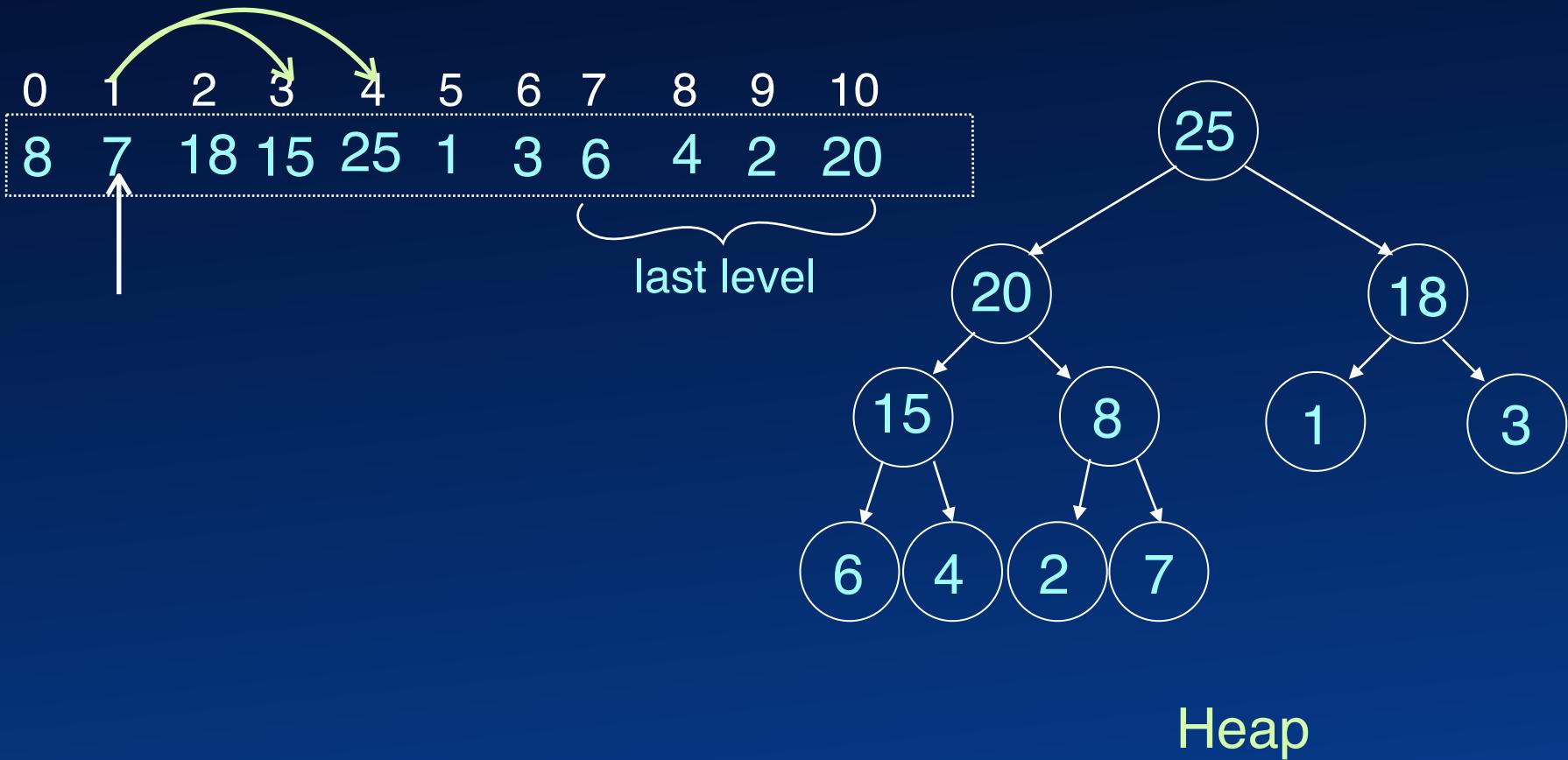


# Heap Construction





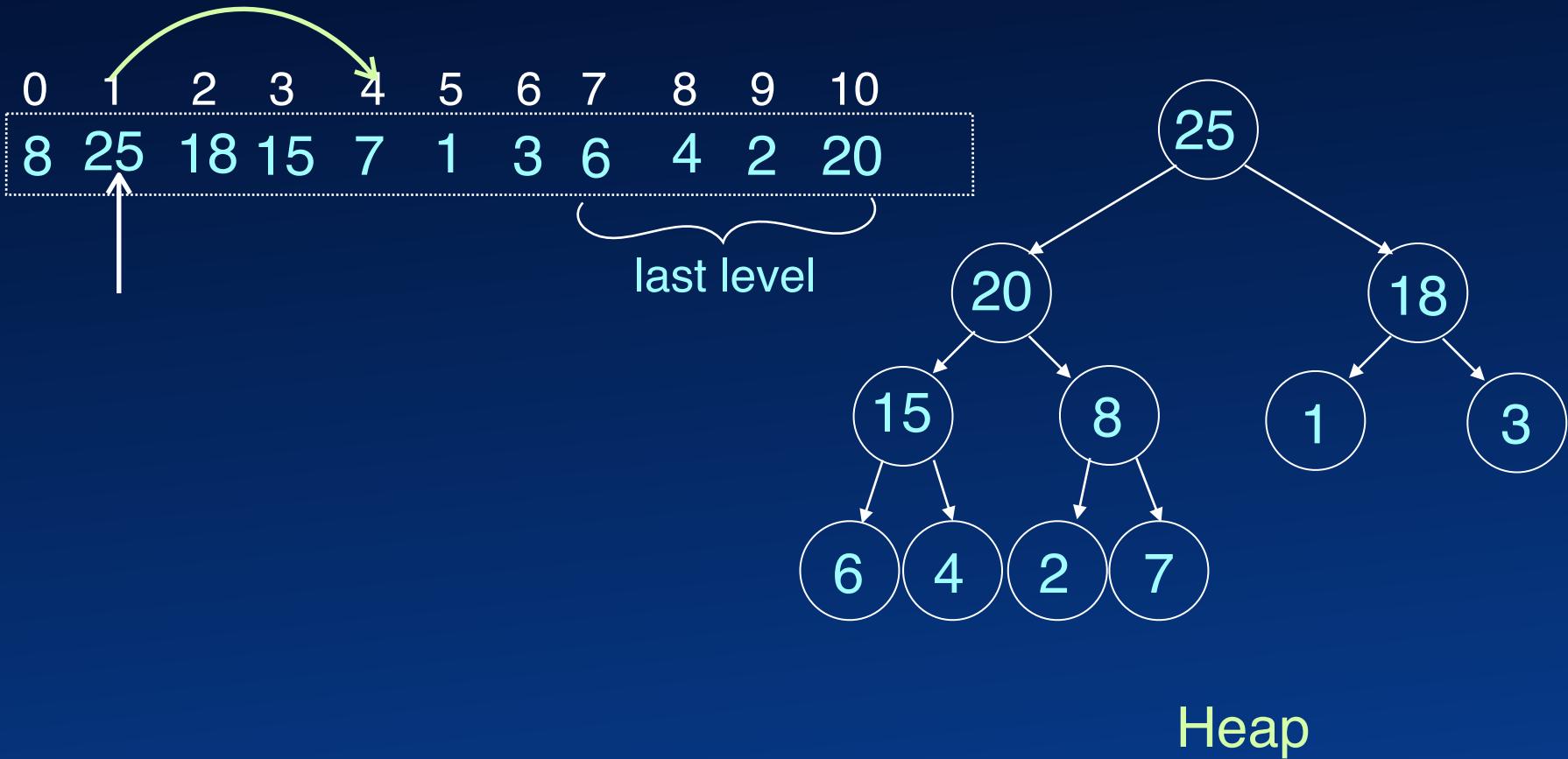
# Heap Construction



Heap

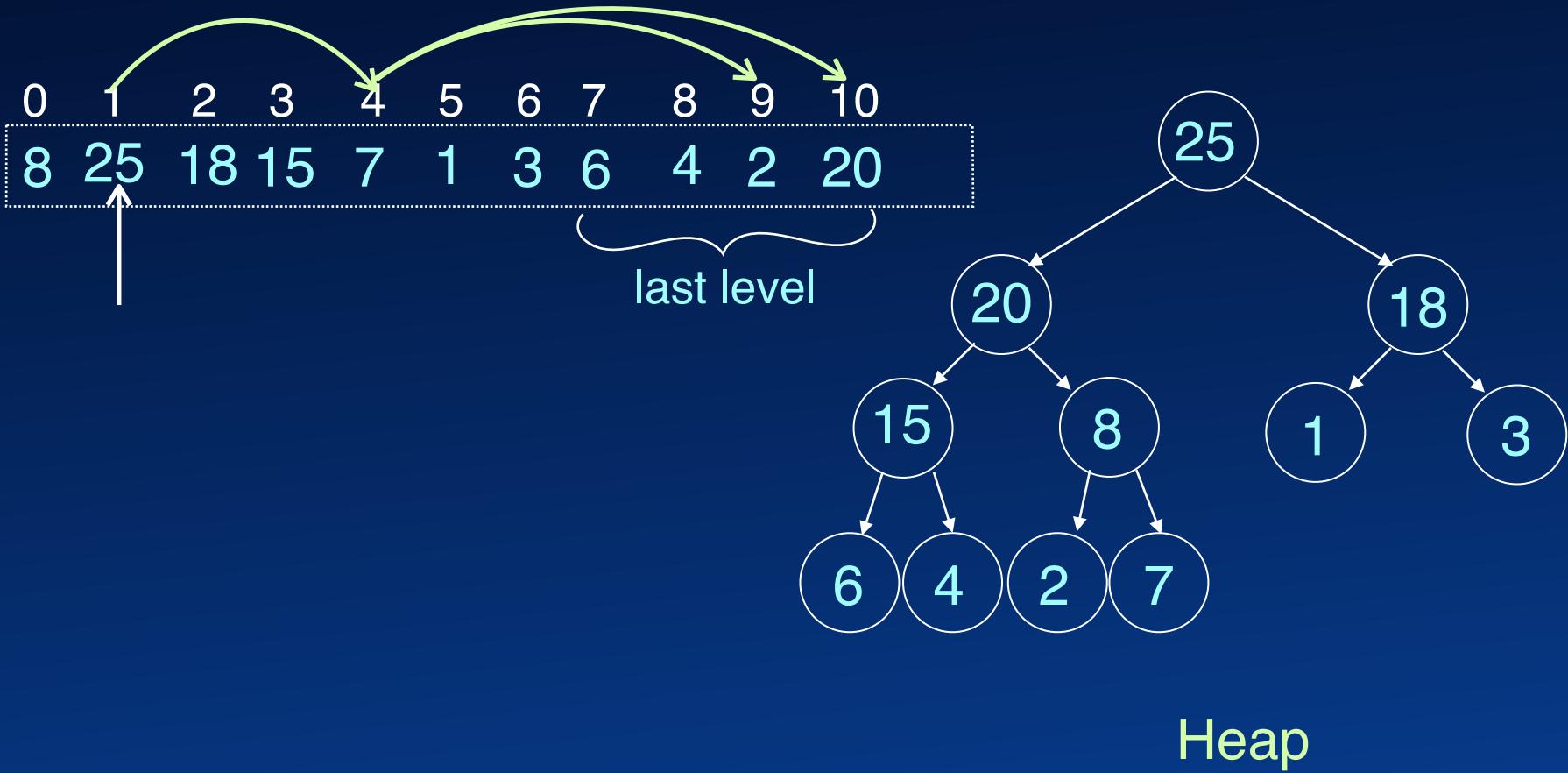


# Heap Construction



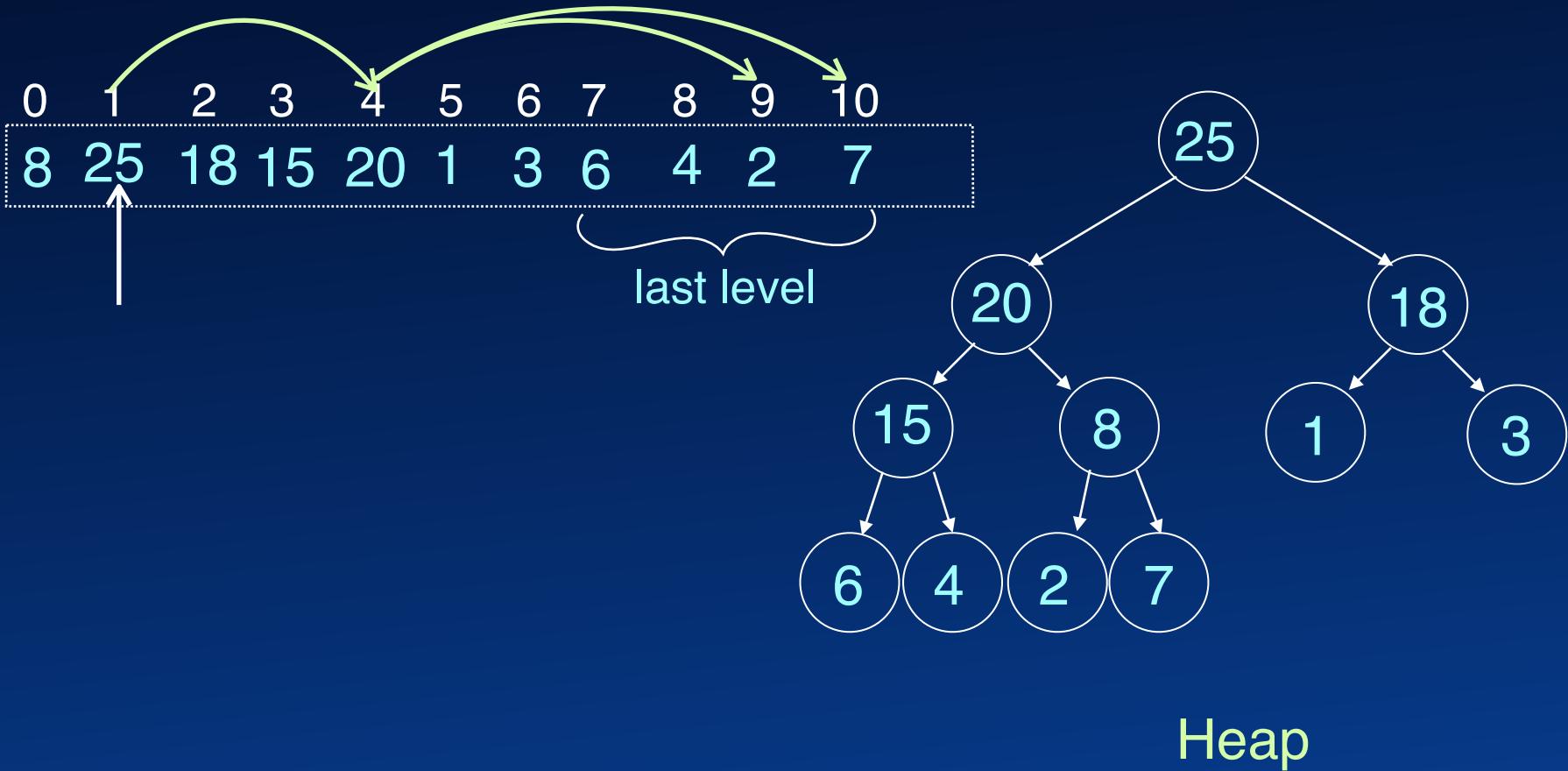


# Heap Construction



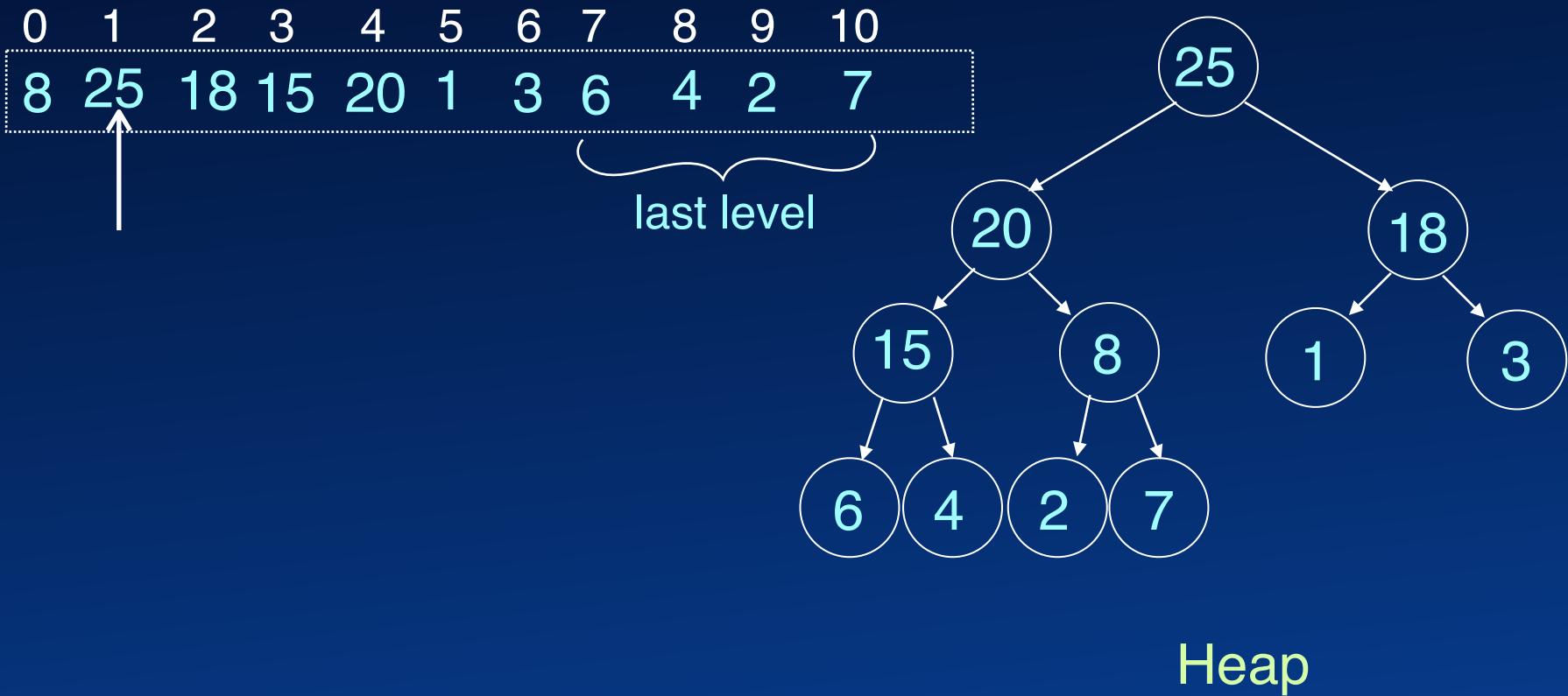


# Heap Construction



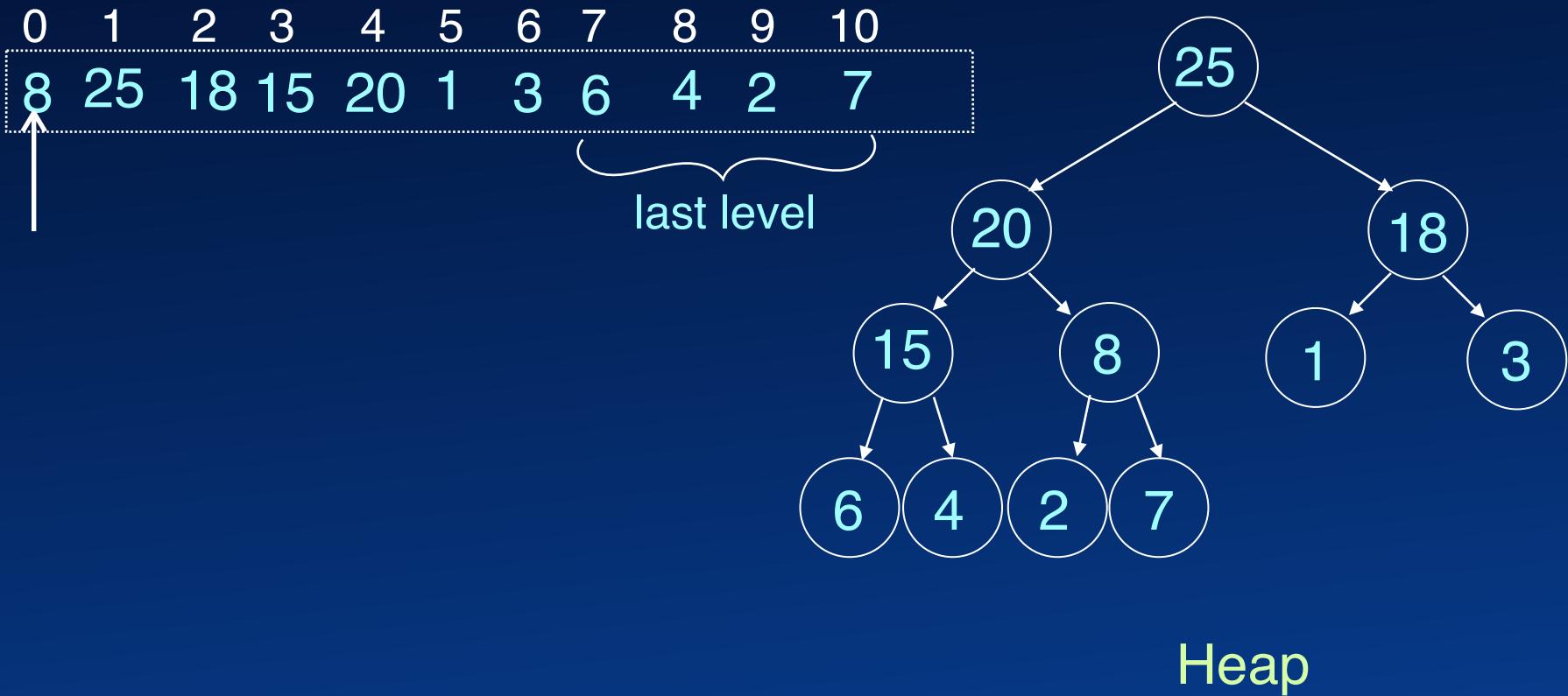


# Heap Construction



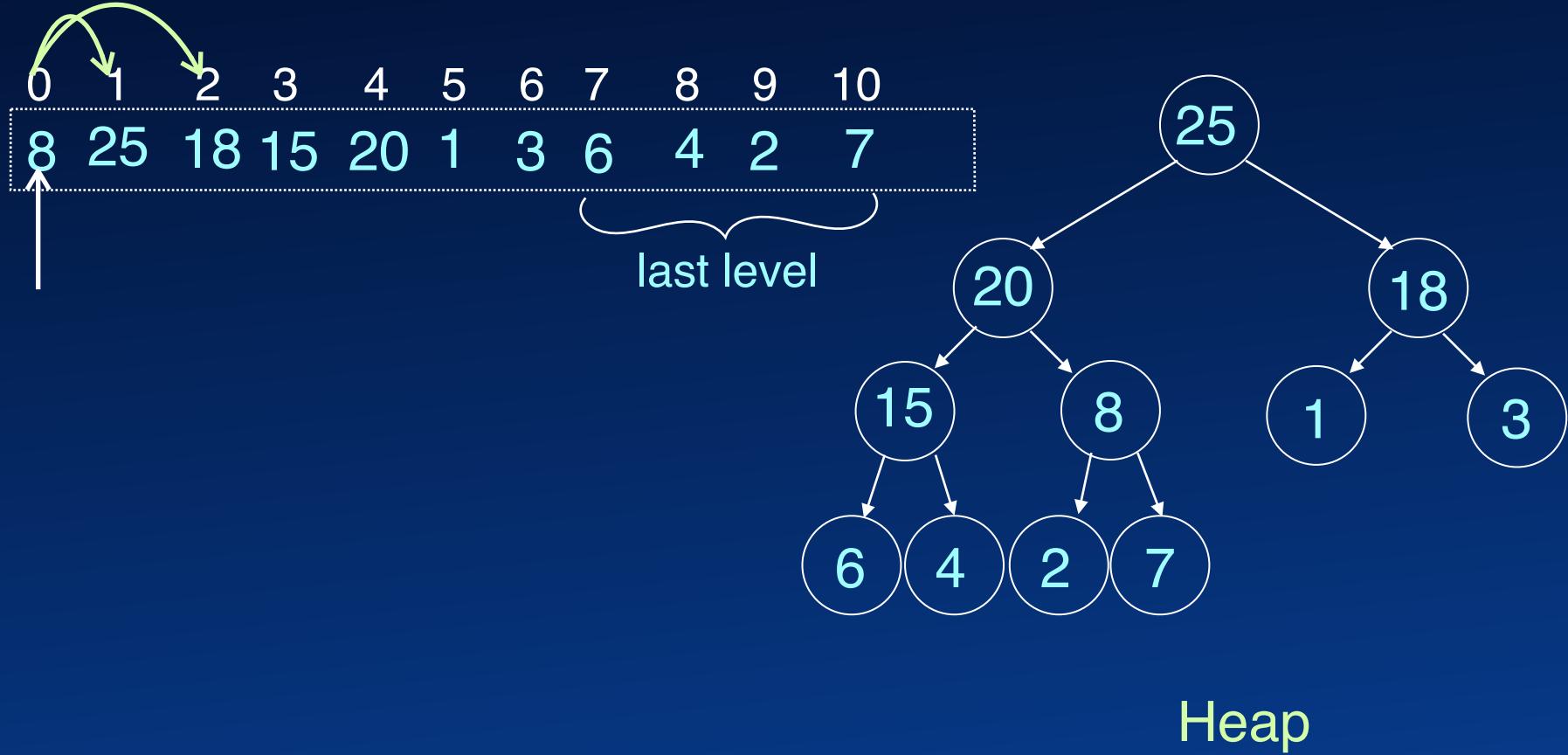


# Heap Construction



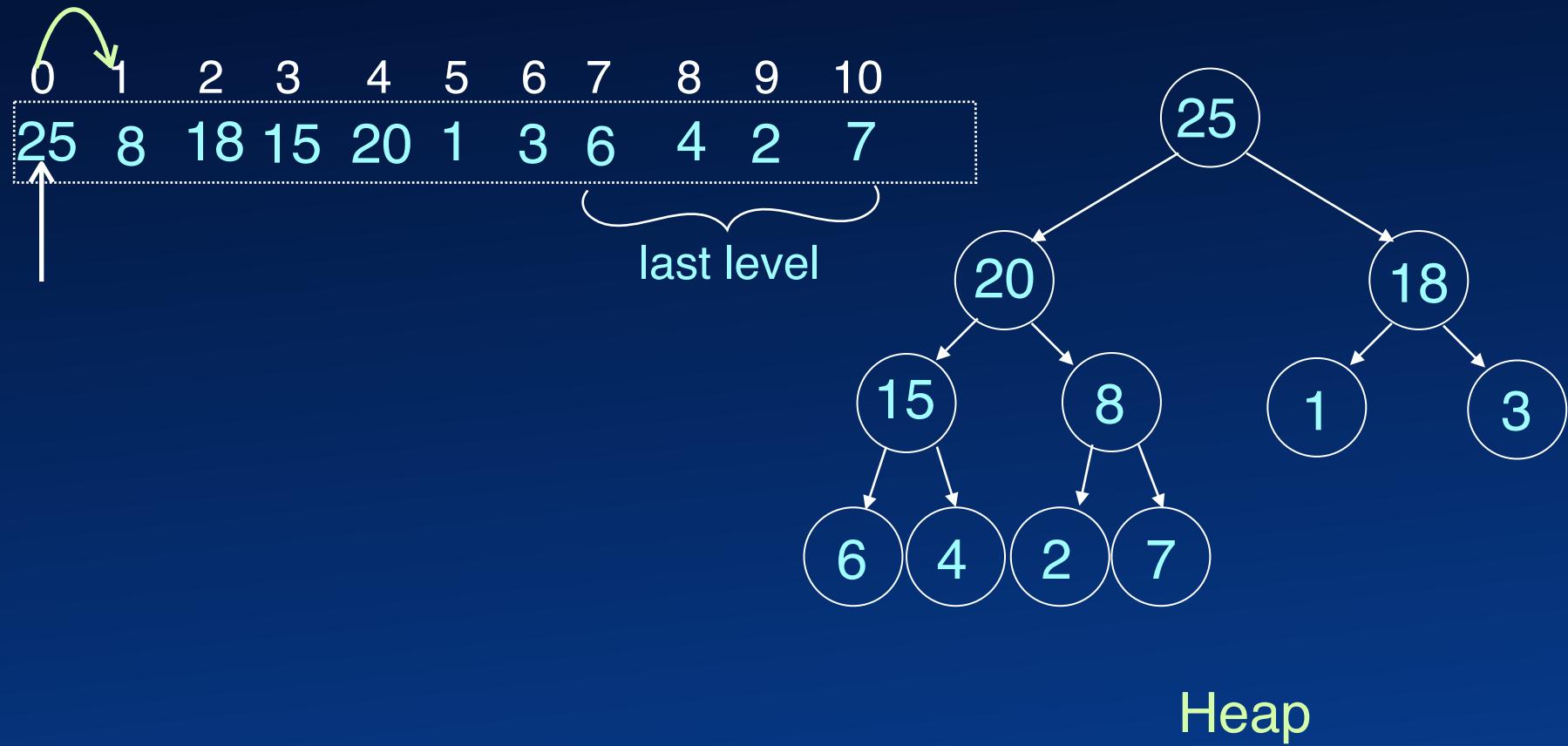


# Heap Construction



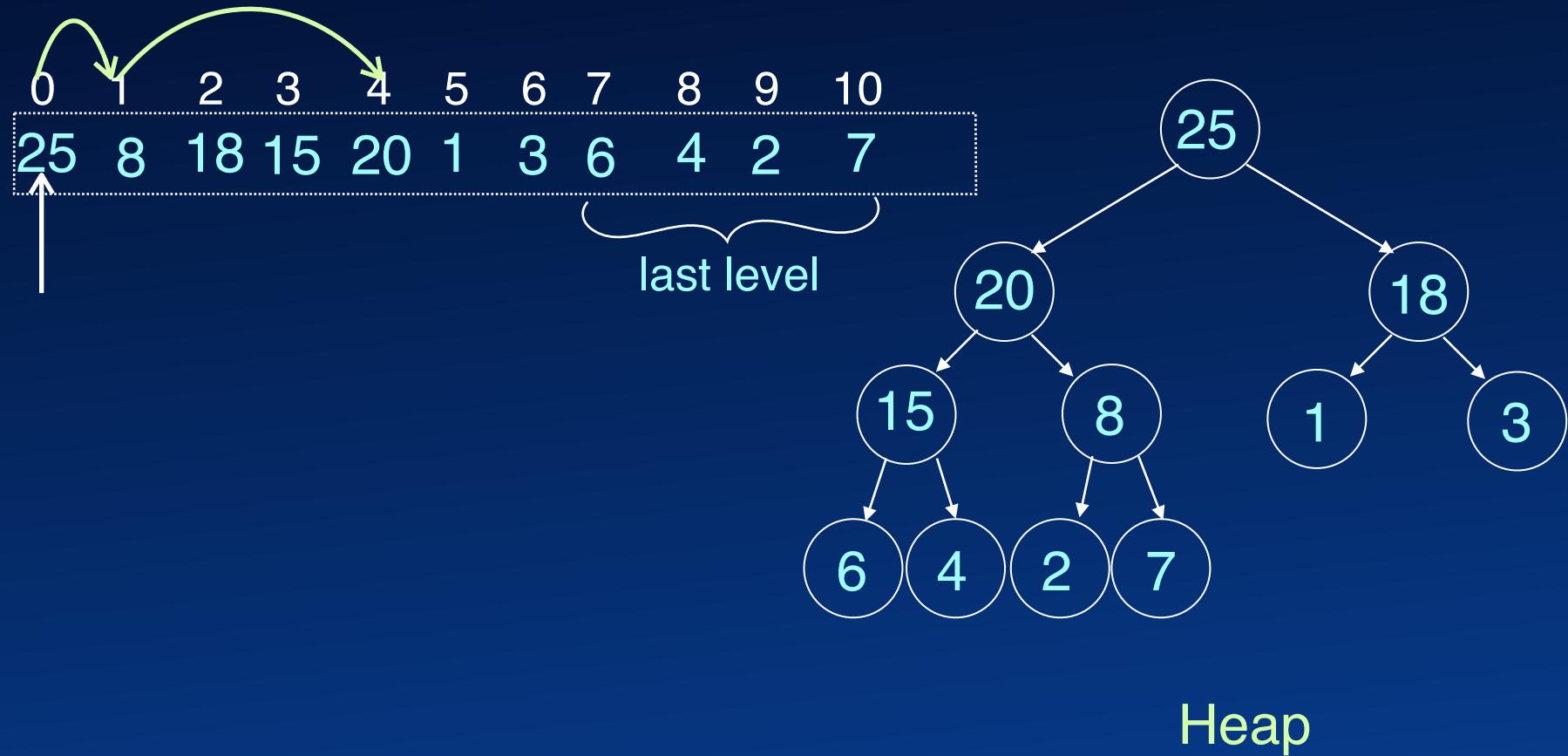


# Heap Construction



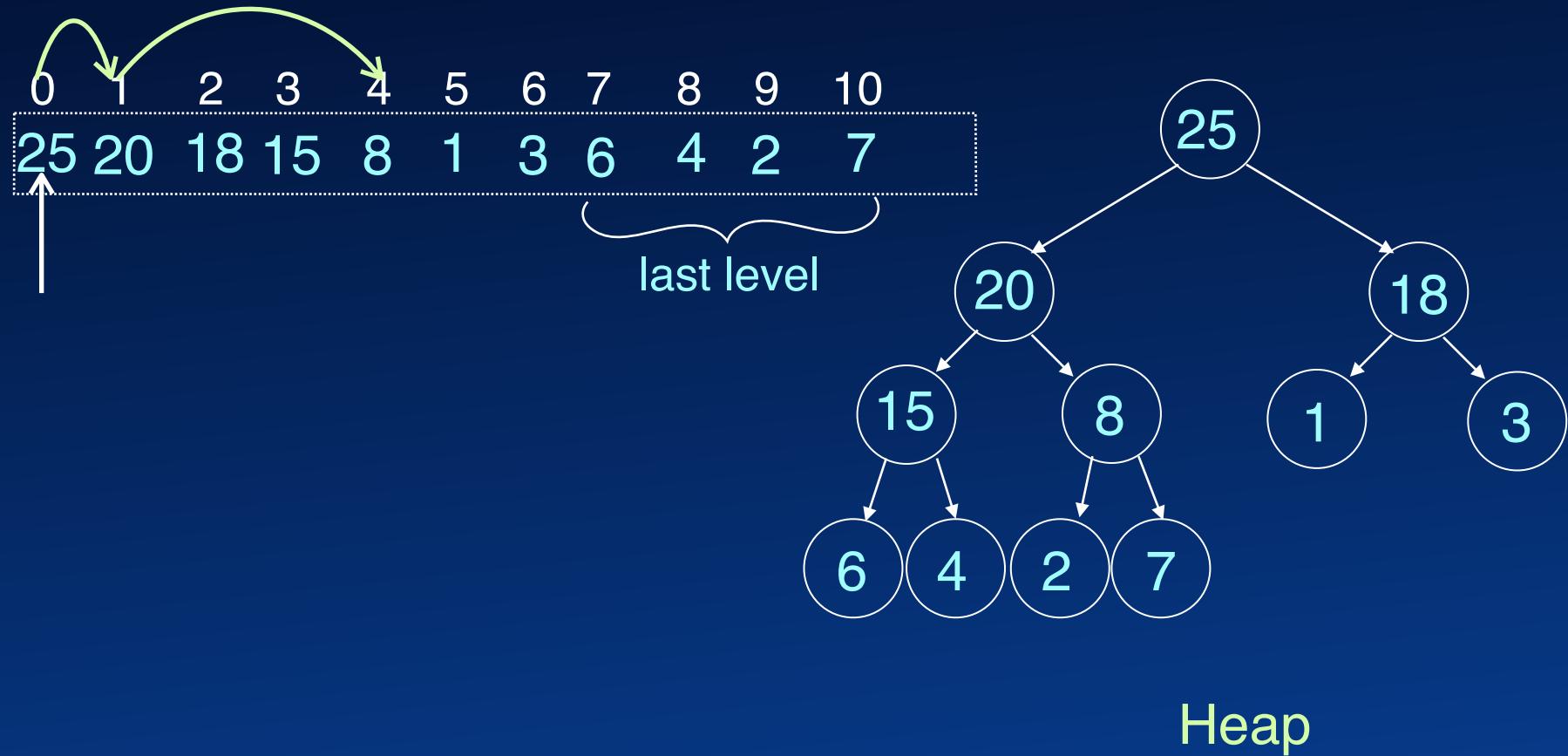


# Heap Construction



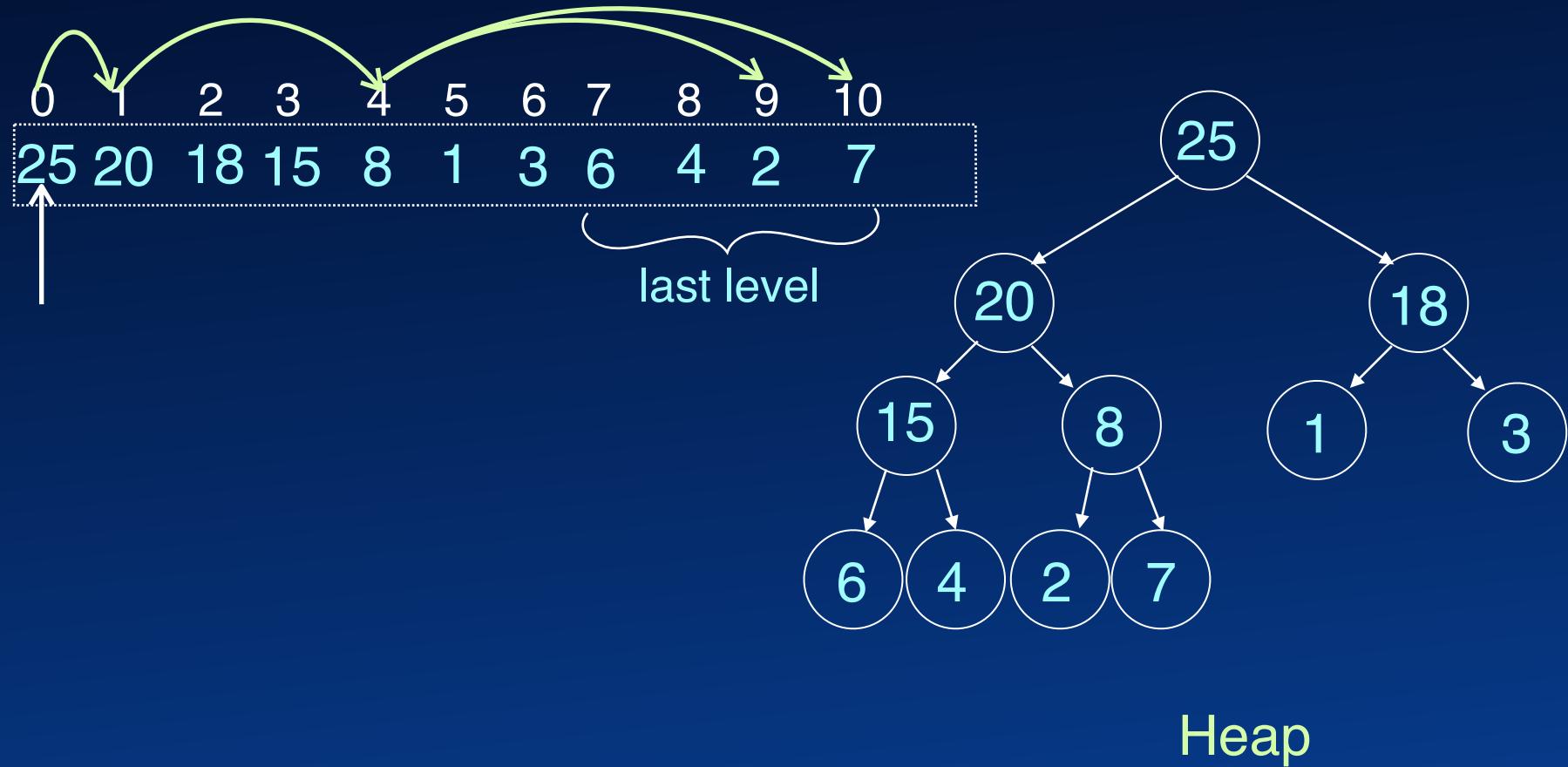


# Heap Construction



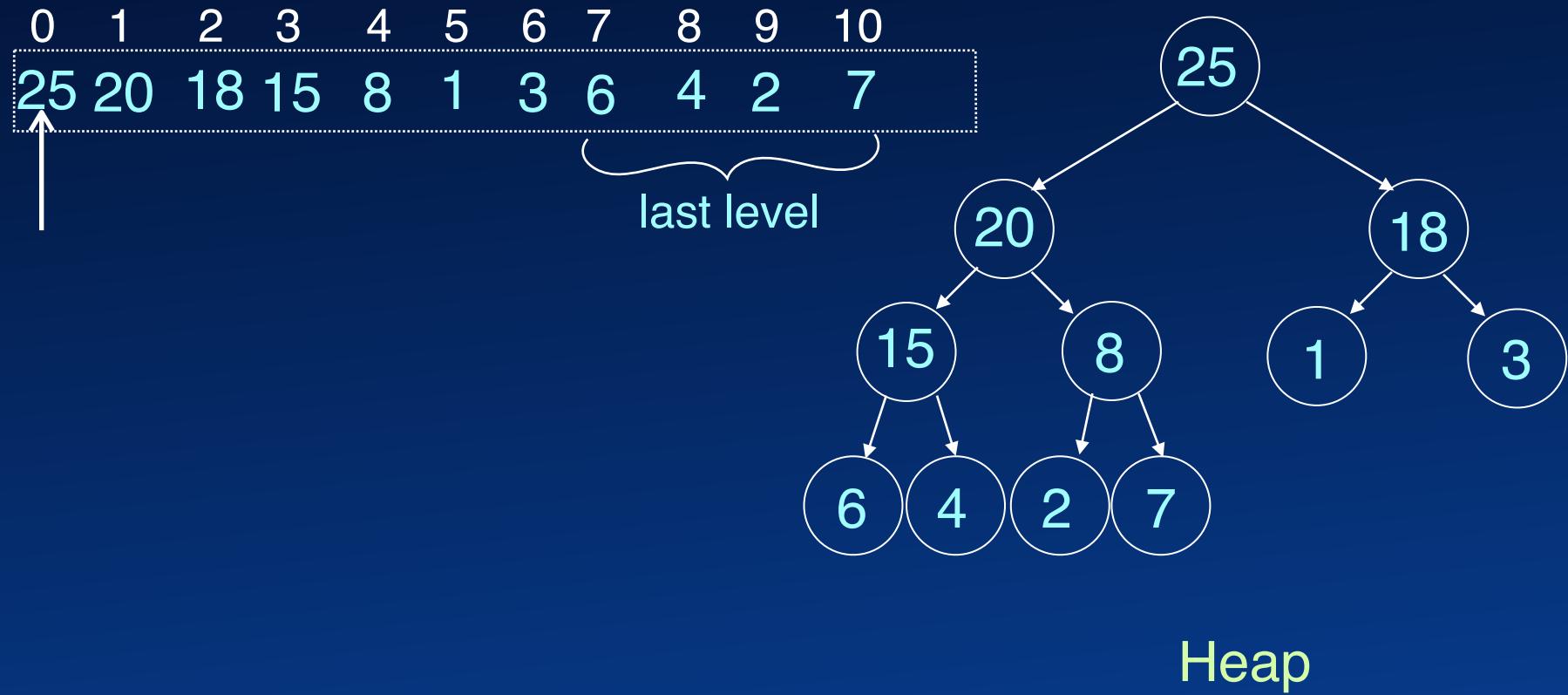


# Heap Construction



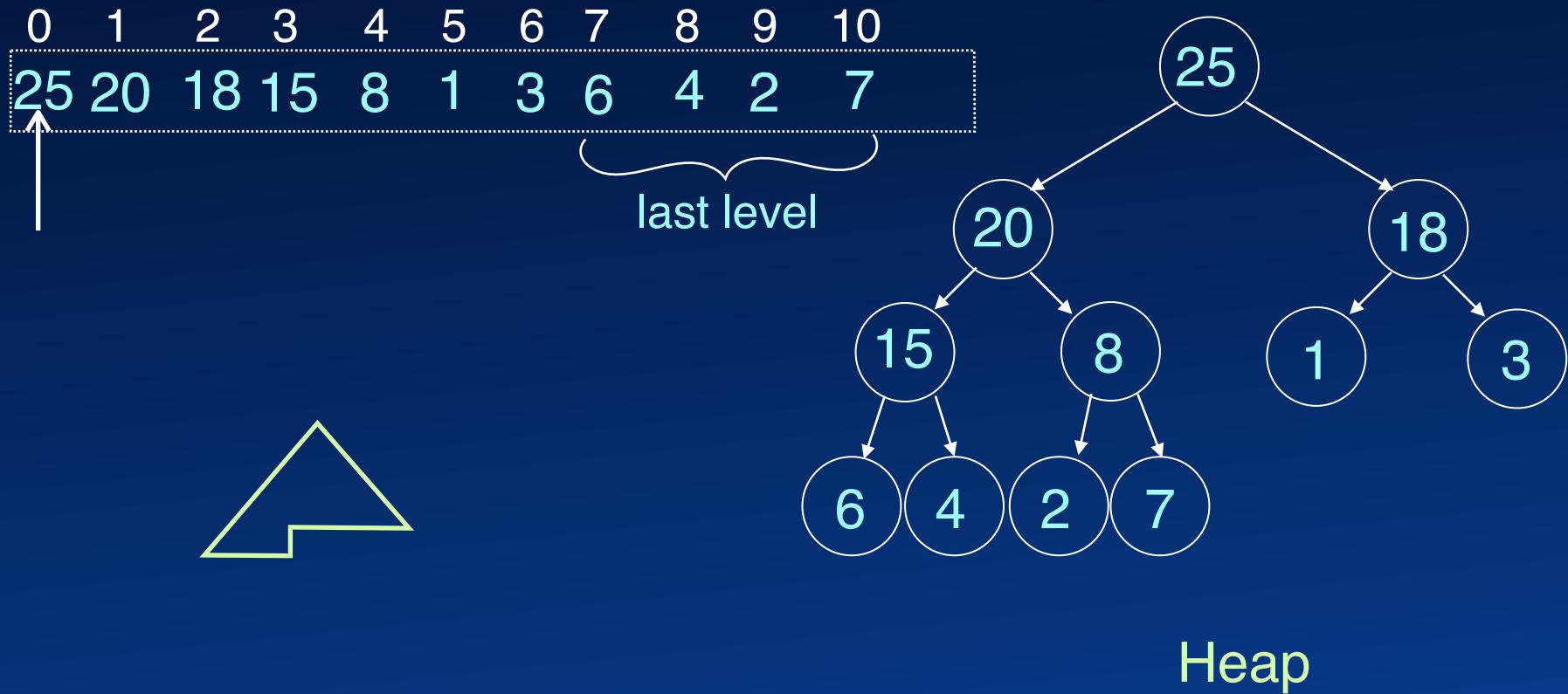


# Heap Construction





# Heap Construction

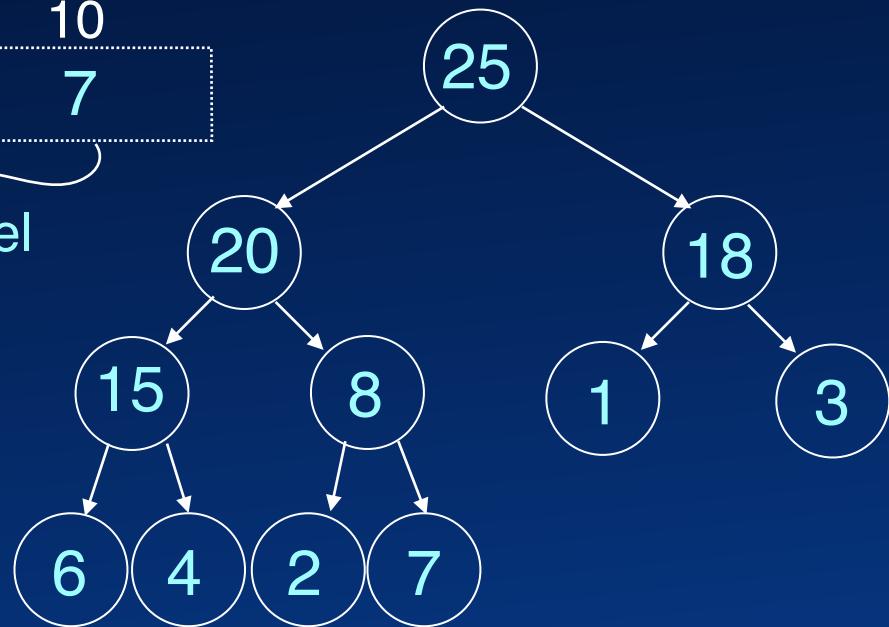




# Heap Construction



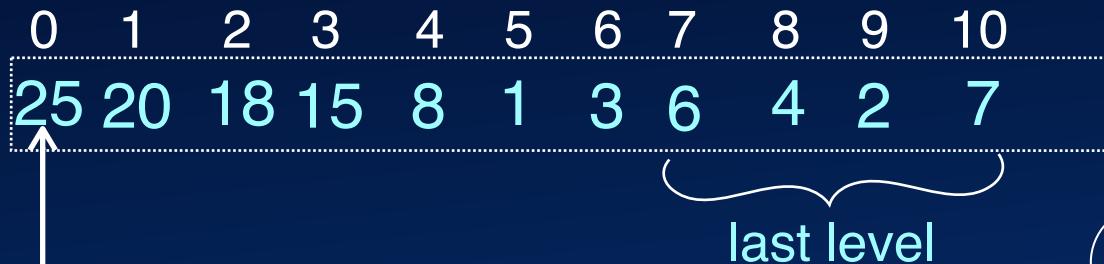
$$\text{height } h = \lceil \lg n+1 \rceil - 1$$



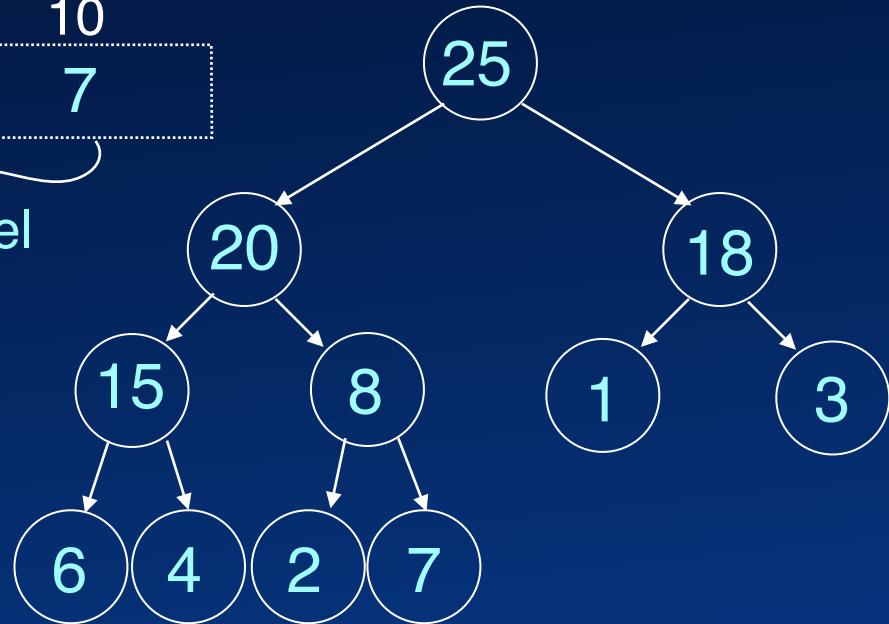
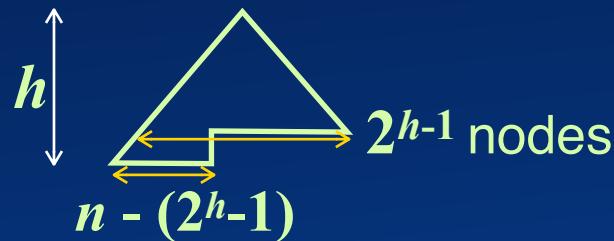
Heap



# Heap Construction



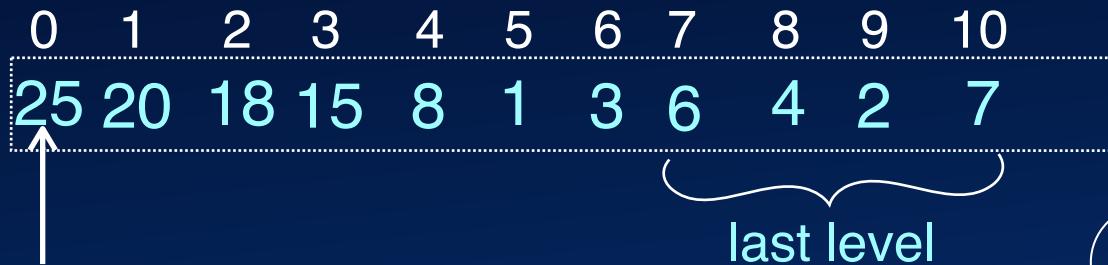
$$\text{height } h = \lceil \lg n+1 \rceil - 1$$



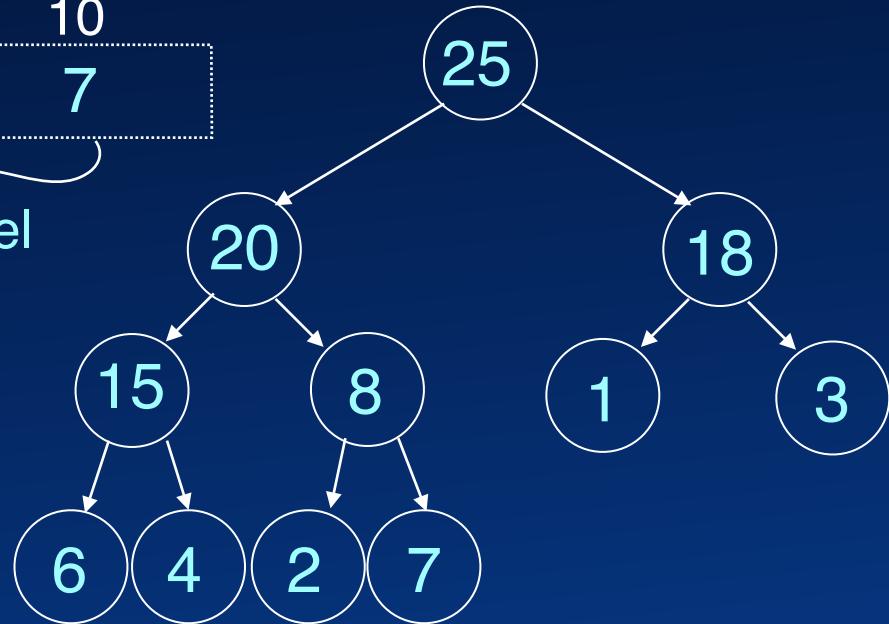
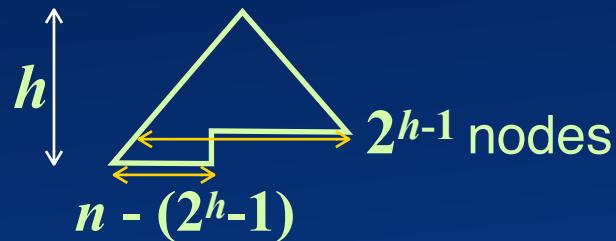
Heap



# Heap Construction



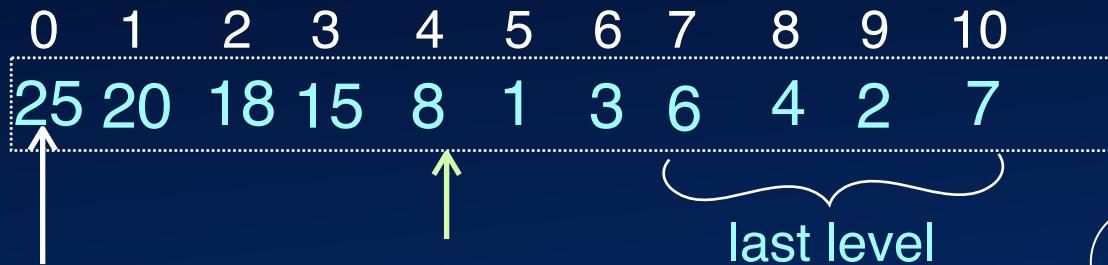
$$\text{height } h = \lceil \lg n+1 \rceil - 1$$



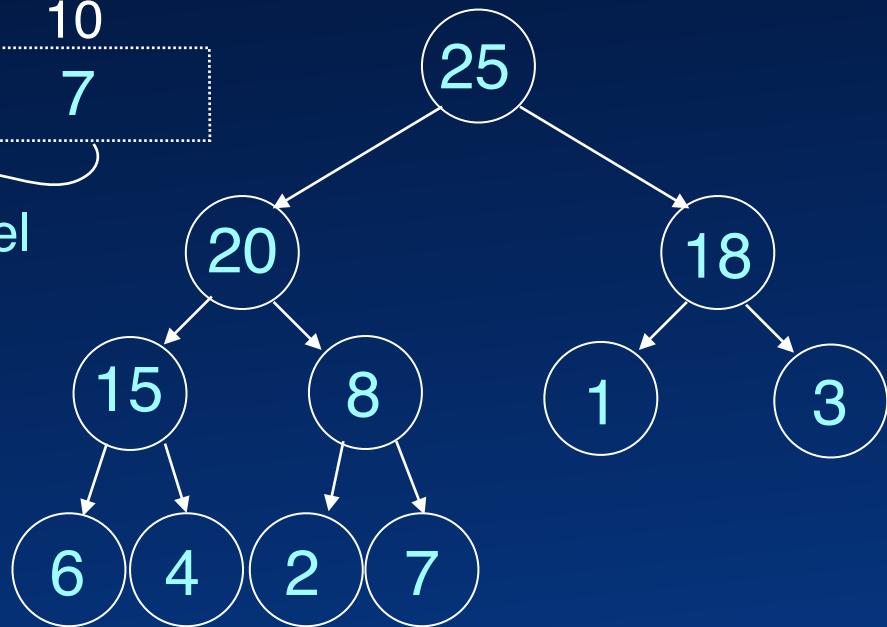
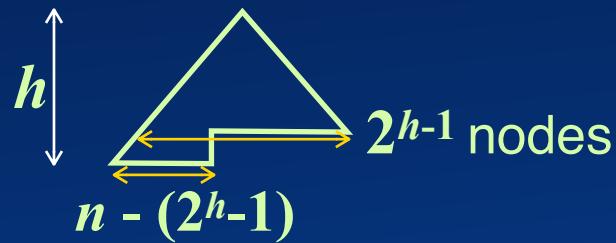
Heap



# Heap Construction



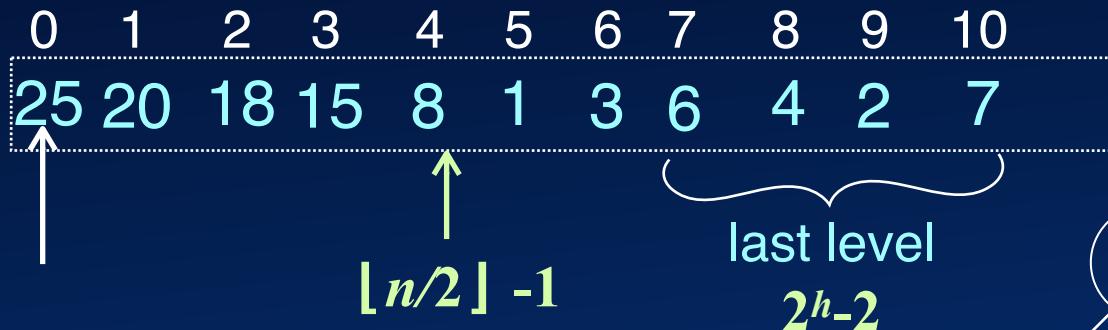
$$\text{height } h = \lceil \lg n+1 \rceil - 1$$



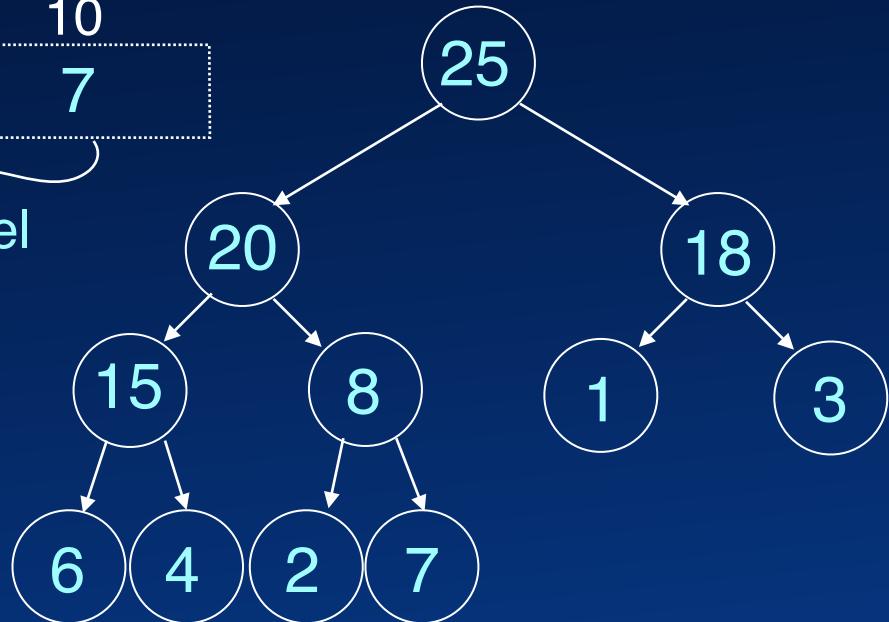
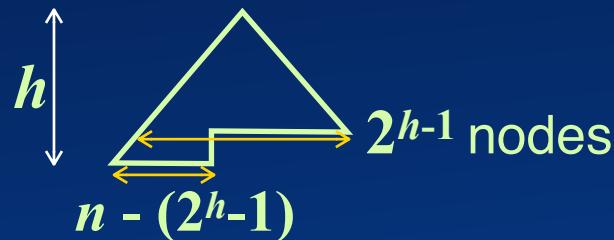
Heap



# Heap Construction



$$\text{height } h = \lceil \lg n+1 \rceil - 1$$



Heap



# Quiz

**Time required to turn an array of  $n$  comparable objects into a heap is:**

- a.  $\Theta(1)$
- b.  $\Theta(n)$
- c.  $O(\log n)$
- d.  $\Theta(n \log n)$
- e. None of the above

mailto: [col106quiz@cse.iitd.ac.in](mailto:col106quiz@cse.iitd.ac.in)  
format: b



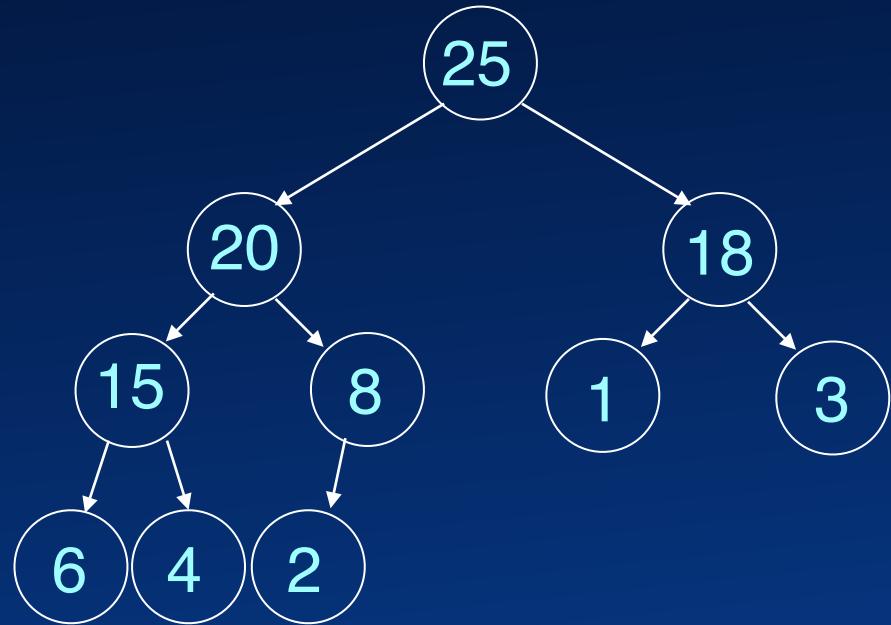
# Priority Queue

- Heap
- Balanced tree
- Skip list



# Priority Queue

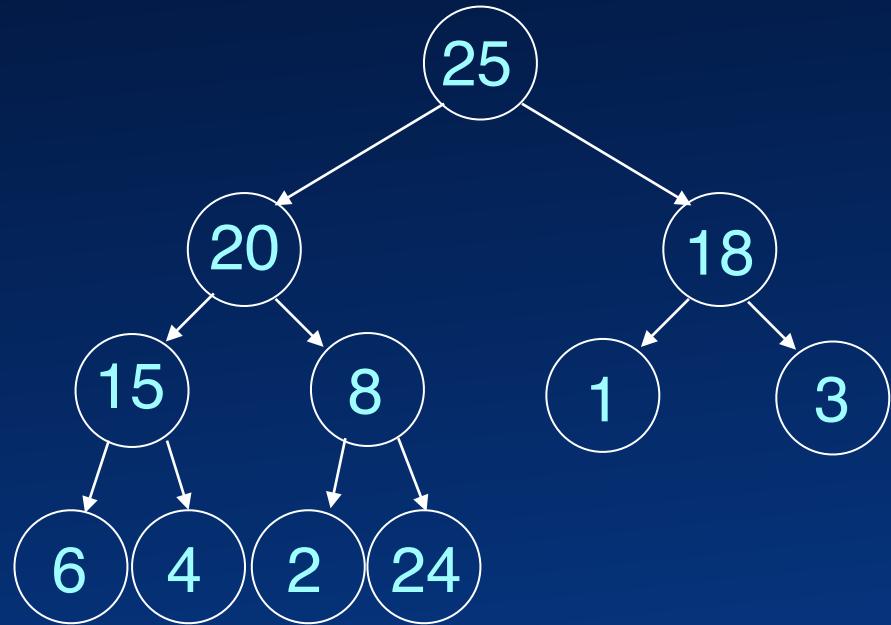
- Heap
- Balanced tree
- Skip list





# Priority Queue

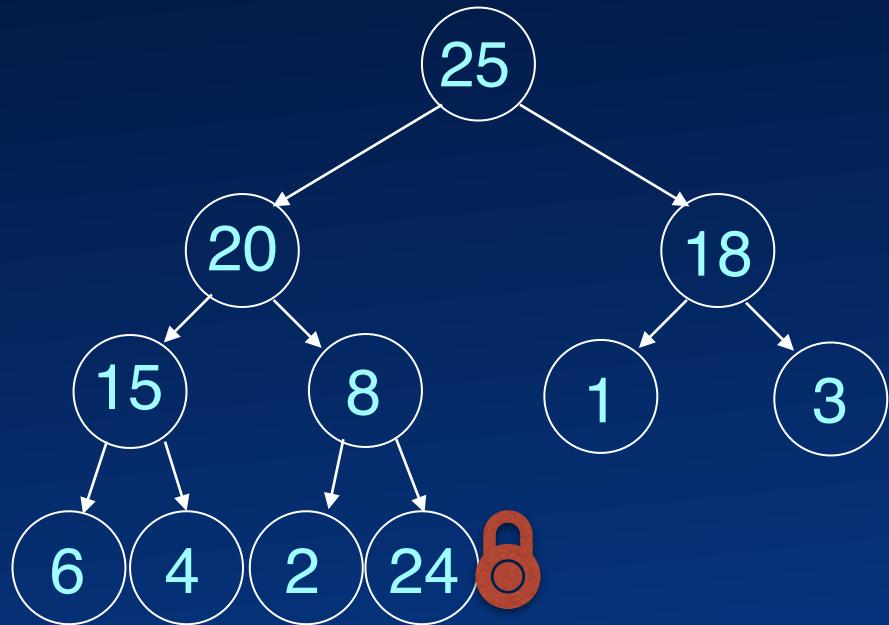
- Heap
- Balanced tree
- Skip list





# Priority Queue

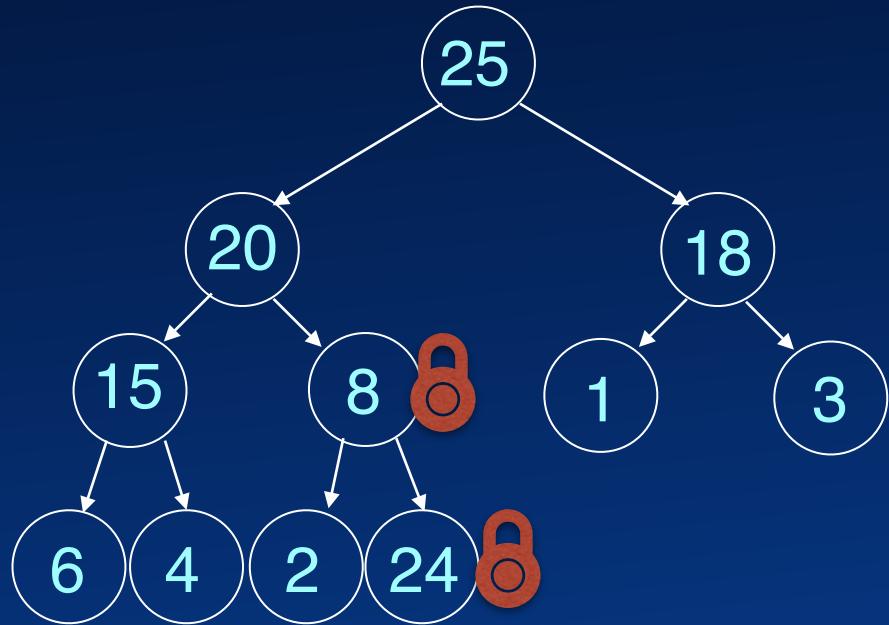
- Heap
- Balanced tree
- Skip list





# Priority Queue

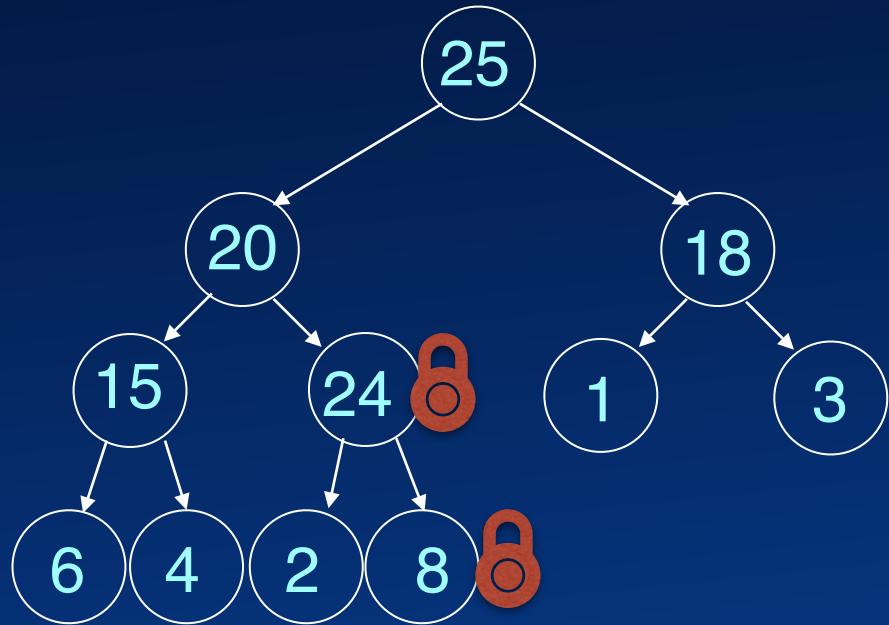
- Heap
- Balanced tree
- Skip list





# Priority Queue

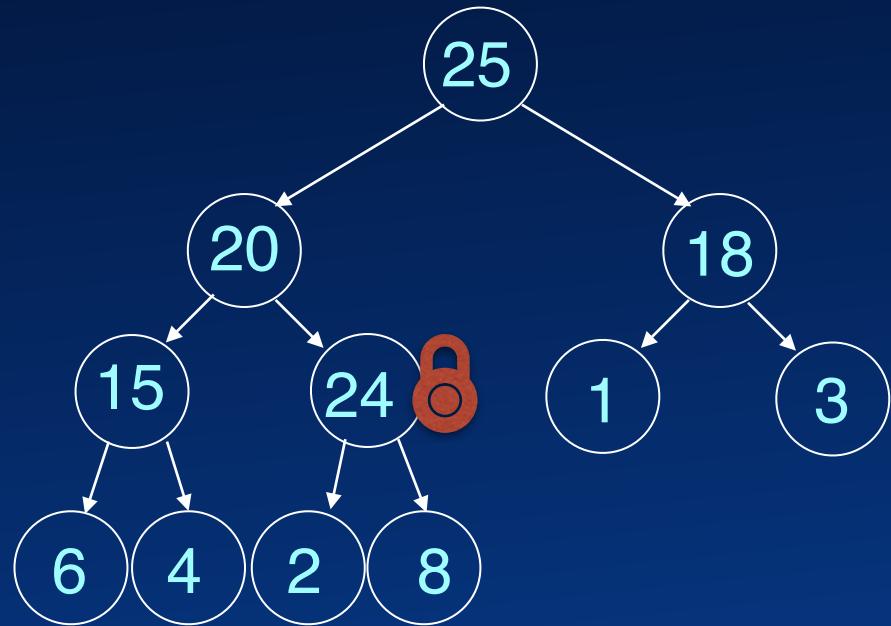
- Heap
- Balanced tree
- Skip list





# Priority Queue

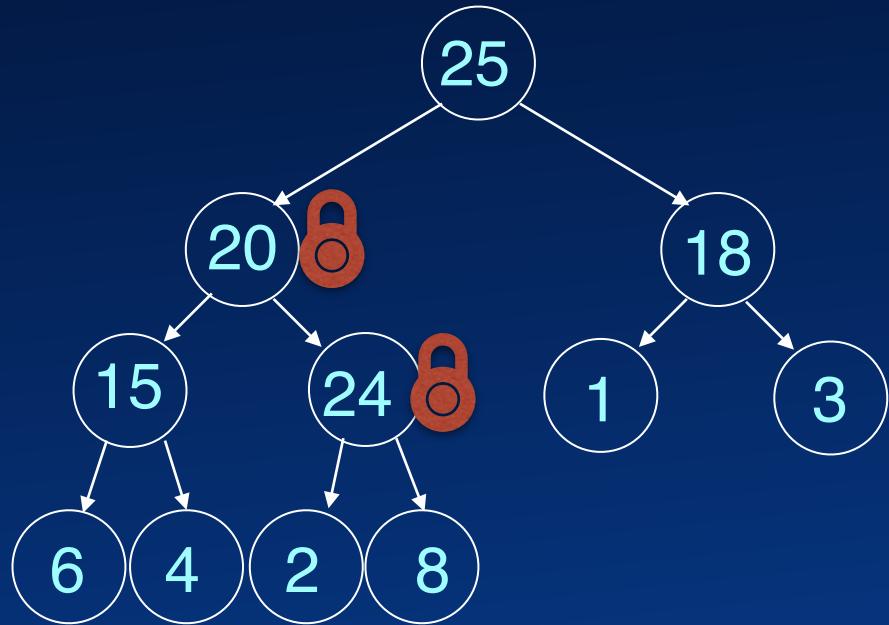
- Heap
- Balanced tree
- Skip list





# Priority Queue

- Heap
- Balanced tree
- Skip list





# Priority Queue

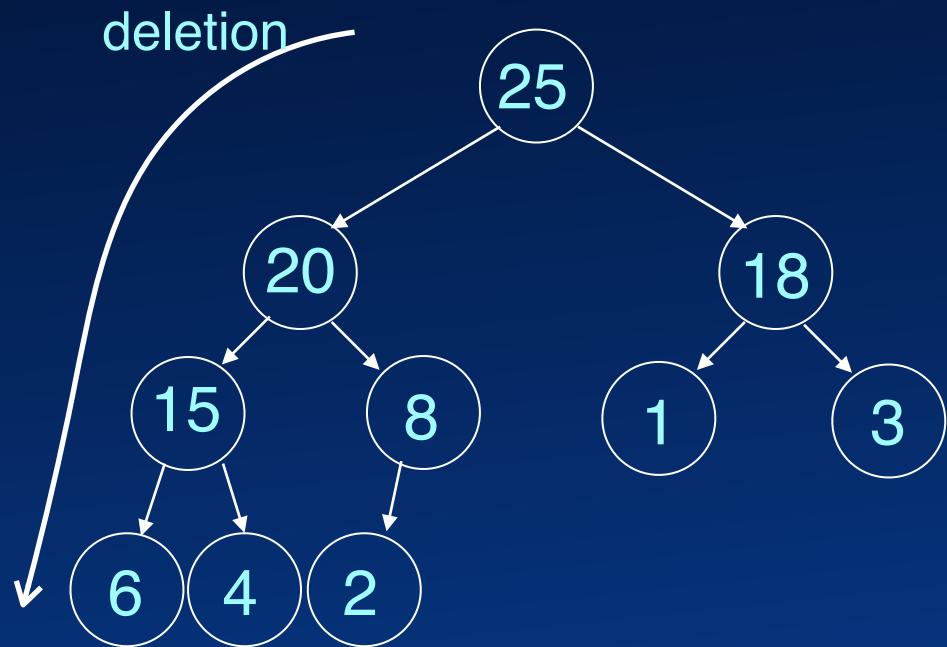
- Heap
- Balanced tree
- Skip list





# Priority Queue

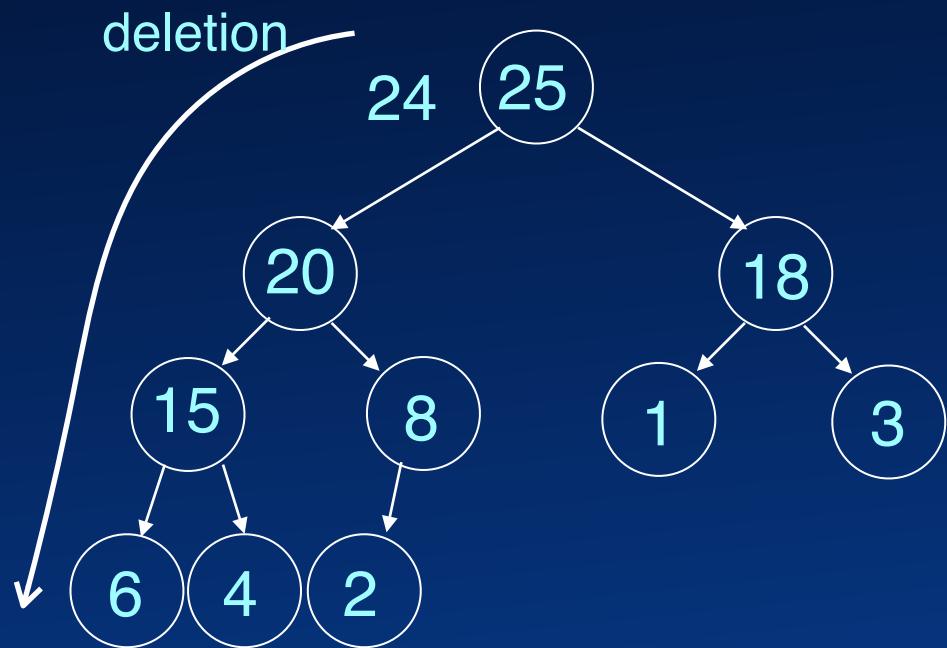
- Heap
- Balanced tree
- Skip list





# Priority Queue

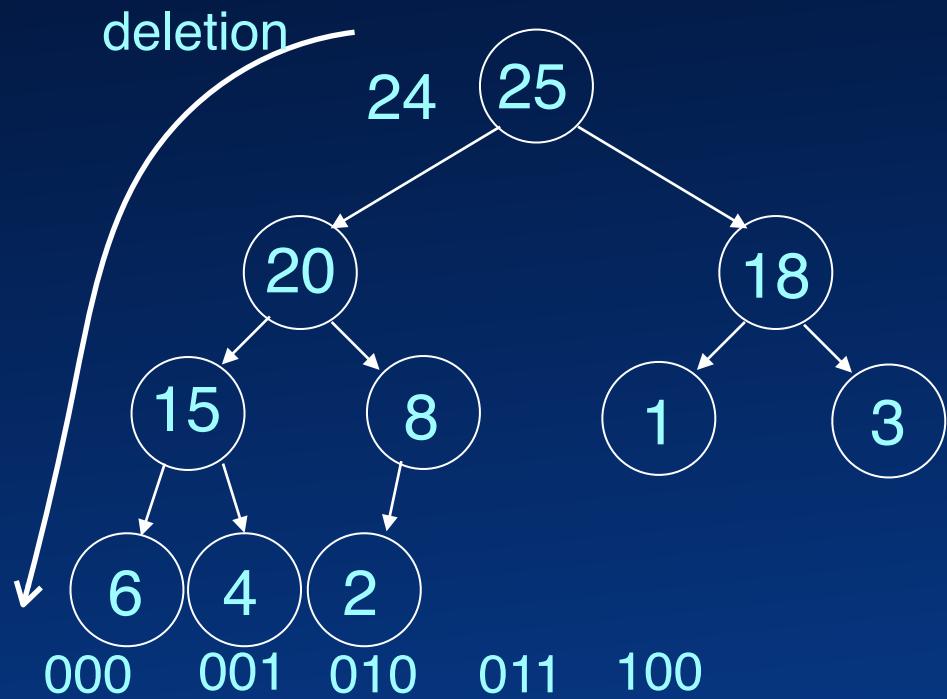
- Heap
- Balanced tree
- Skip list





# Priority Queue

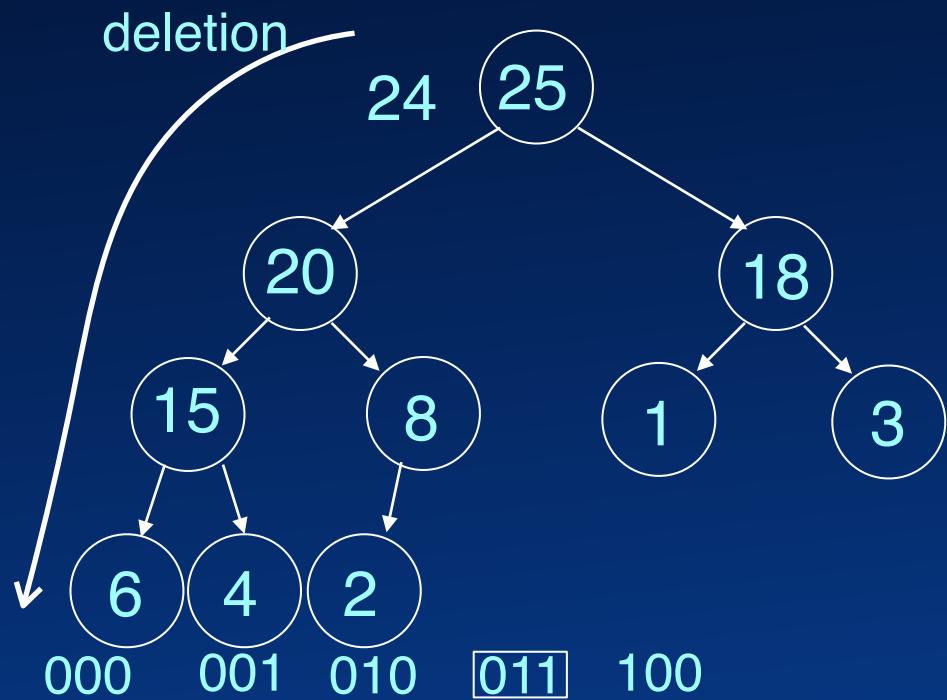
- Heap
- Balanced tree
- Skip list





# Priority Queue

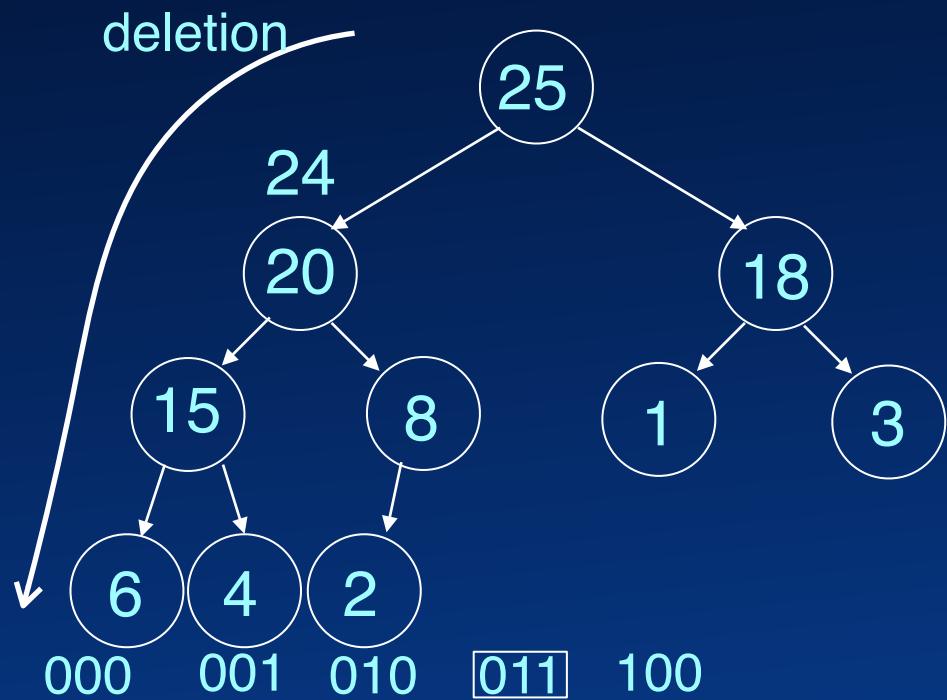
- Heap
- Balanced tree
- Skip list





# Priority Queue

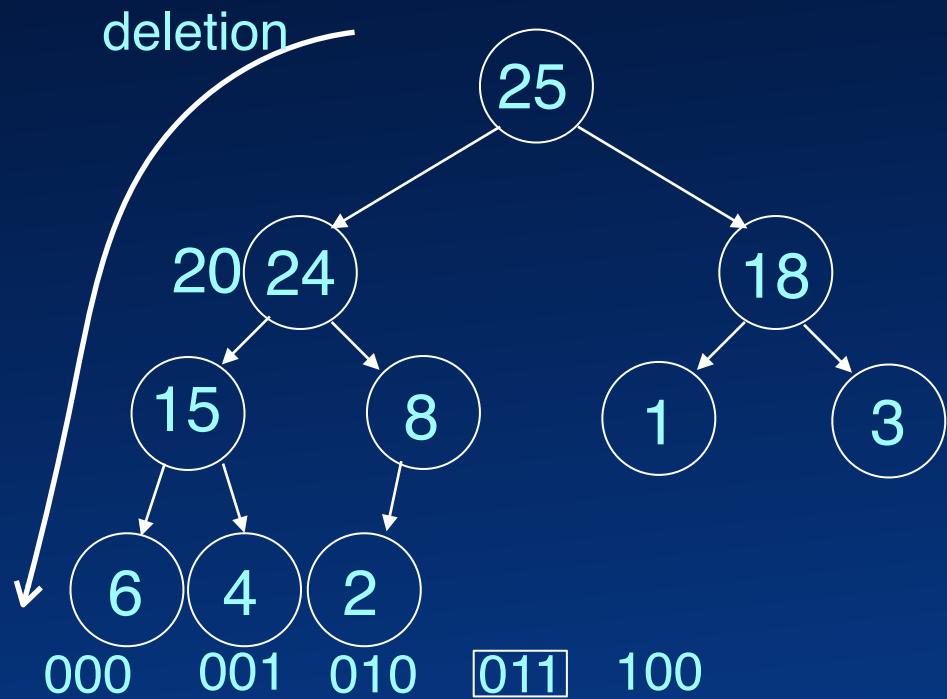
- Heap
- Balanced tree
- Skip list





# Priority Queue

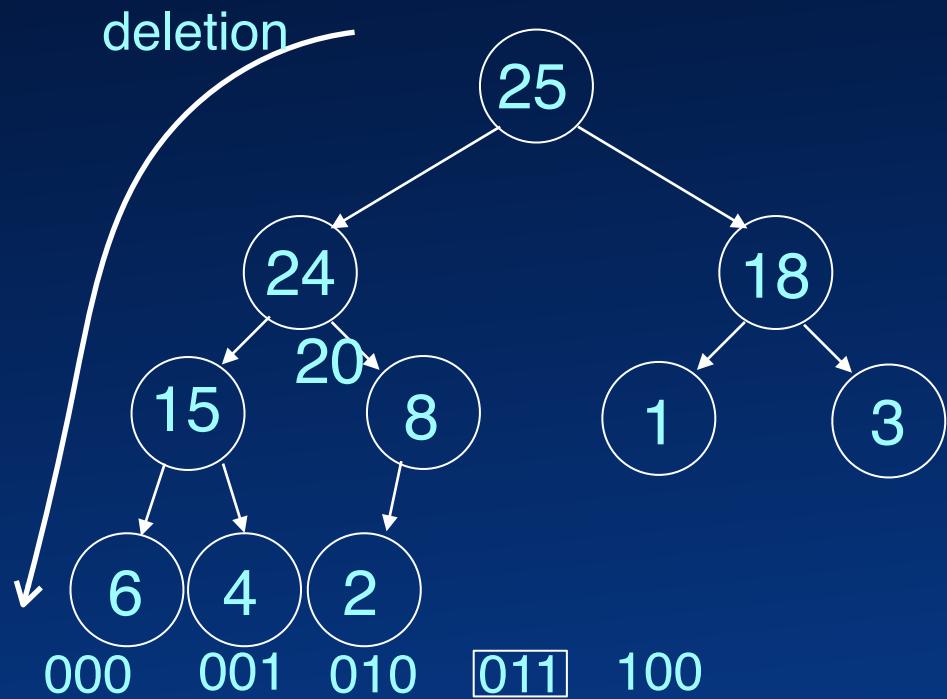
- Heap
- Balanced tree
- Skip list





# Priority Queue

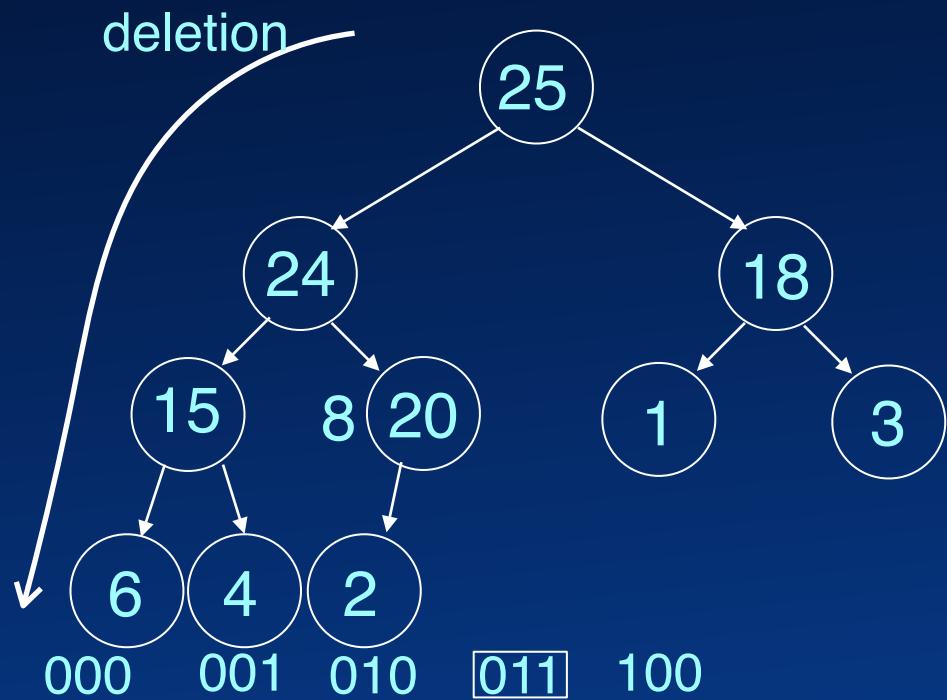
- Heap
- Balanced tree
- Skip list





# Priority Queue

- Heap
- Balanced tree
- Skip list





# Priority Queue

- Heap
- Balanced tree
- Skip list

