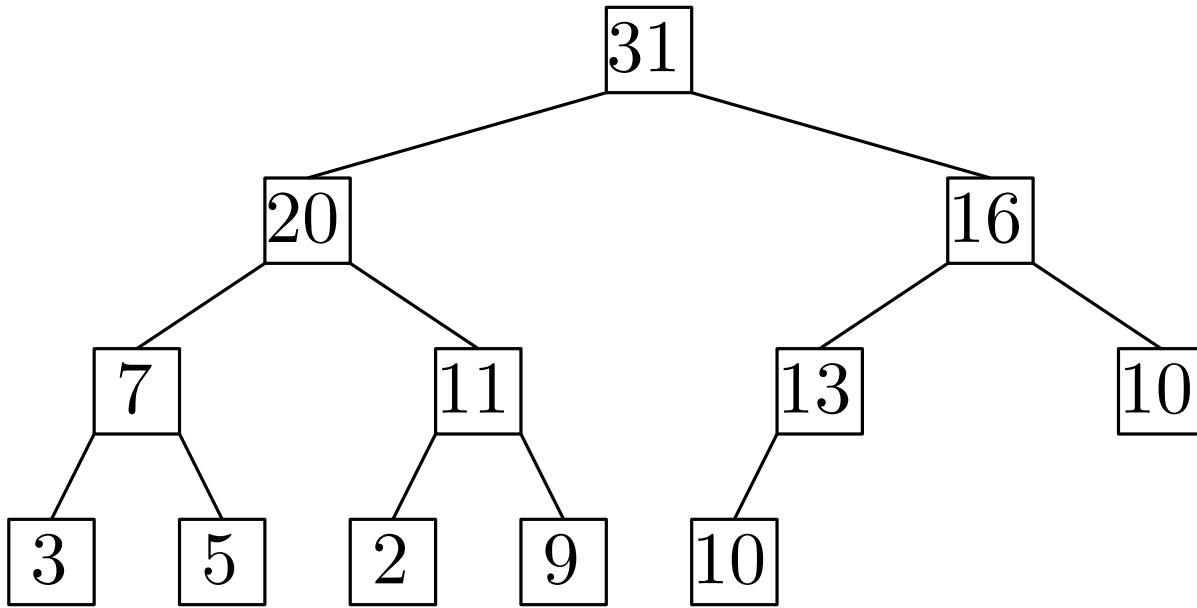


# Prioritetskøer, høbe og heap sort



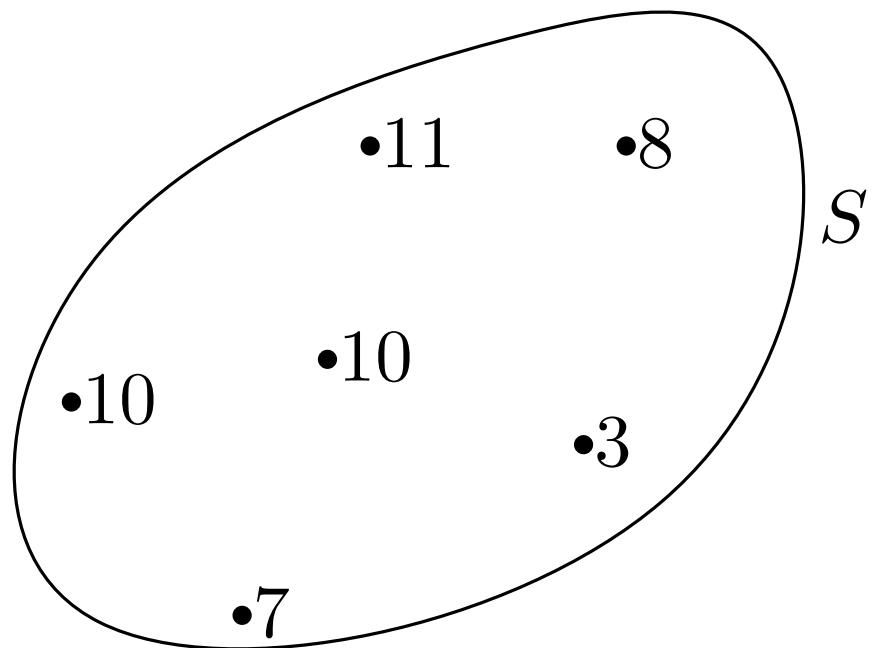
Mikkel Abrahamsen

# Prioritetskø

Dynamisk multi-mængde  $S$  af nøgler.

To (vigtigste) operationer:

- Extract-Max( $S$ ): fjern og returnér største nøgle.
- Insert( $S, k$ ): tilføj  $k$  til  $S$ .



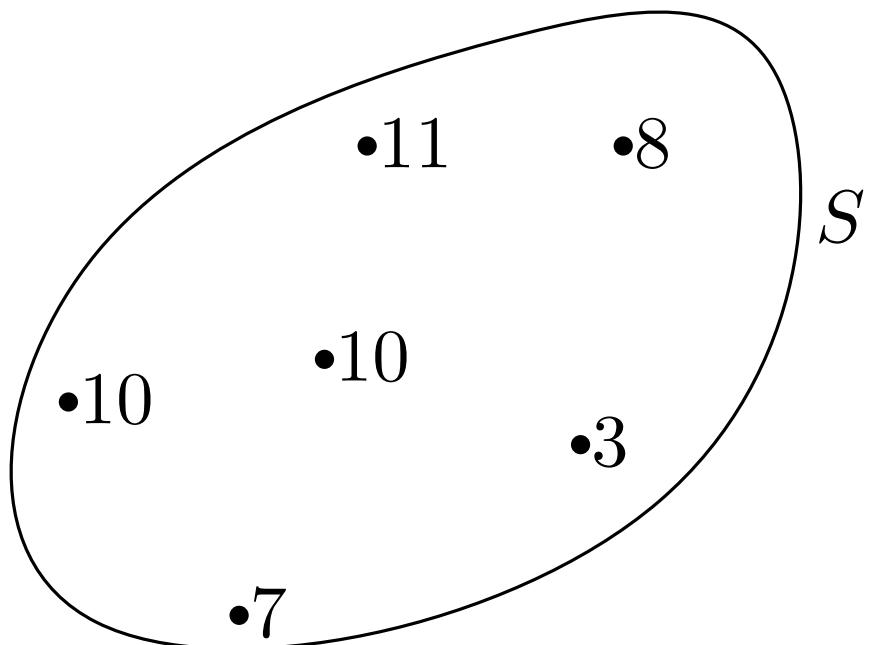
# Prioritetskø

Dynamisk multi-mængde  $S$  af nøgler.

To (vigtigste) operationer:

- Extract-Max( $S$ ): fjern og returnér største nøgle.
- Insert( $S, k$ ): tilføj  $k$  til  $S$ .

Extract-Max( $S$ )



# Prioritetskø

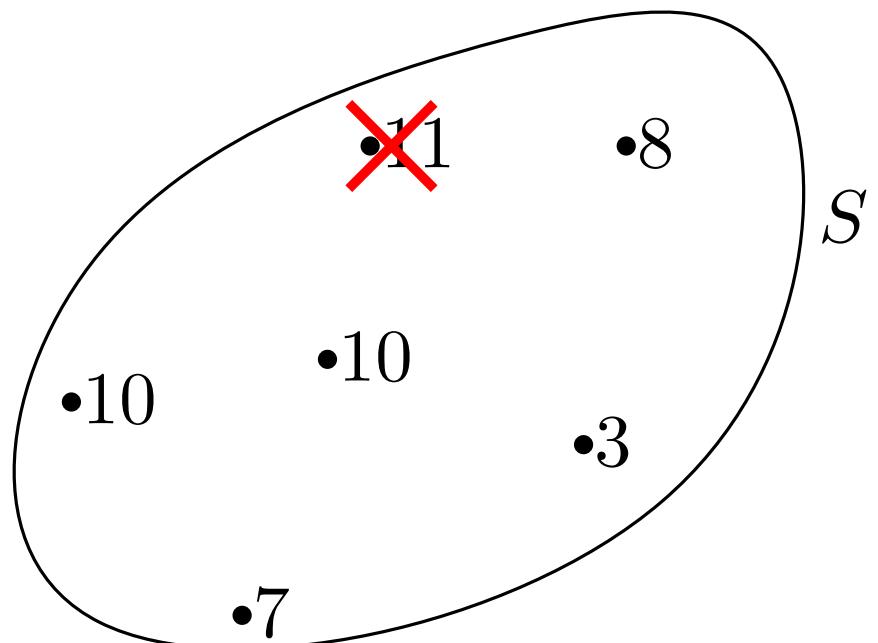
Dynamisk multi-mængde  $S$  af nøgler.

To (vigtigste) operationer:

- Extract-Max( $S$ ): fjern og returnér største nøgle.
- Insert( $S, k$ ): tilføj  $k$  til  $S$ .

Extract-Max( $S$ )

returnér 11



# Prioritetskø

Dynamisk multi-mængde  $S$  af nøgler.

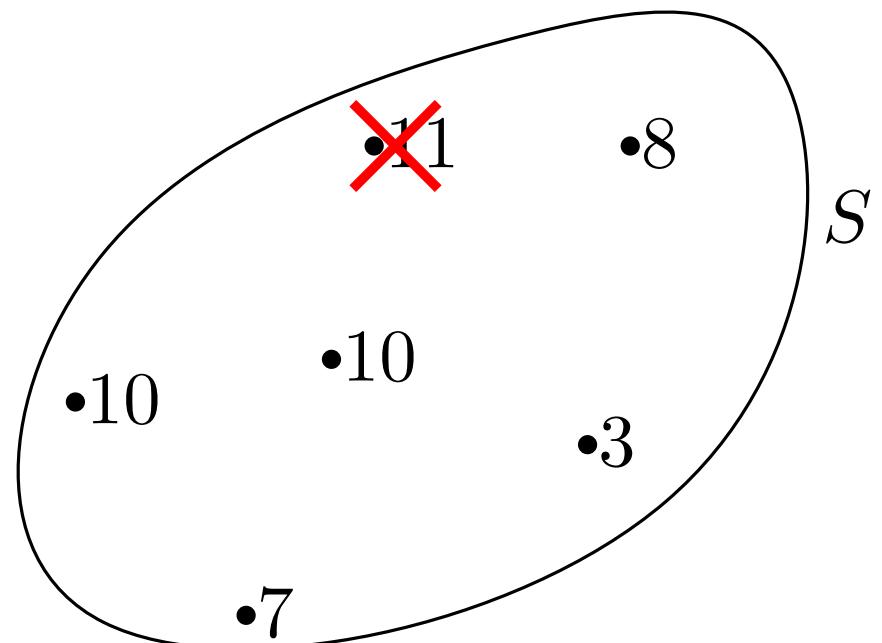
To (vigtigste) operationer:

- Extract-Max( $S$ ): fjern og returnér største nøgle.
- Insert( $S, k$ ): tilføj  $k$  til  $S$ .

Extract-Max( $S$ )

returnér 11

Extract-Max( $S$ )



# Prioritetskø

Dynamisk multi-mængde  $S$  af nøgler.

To (vigtigste) operationer:

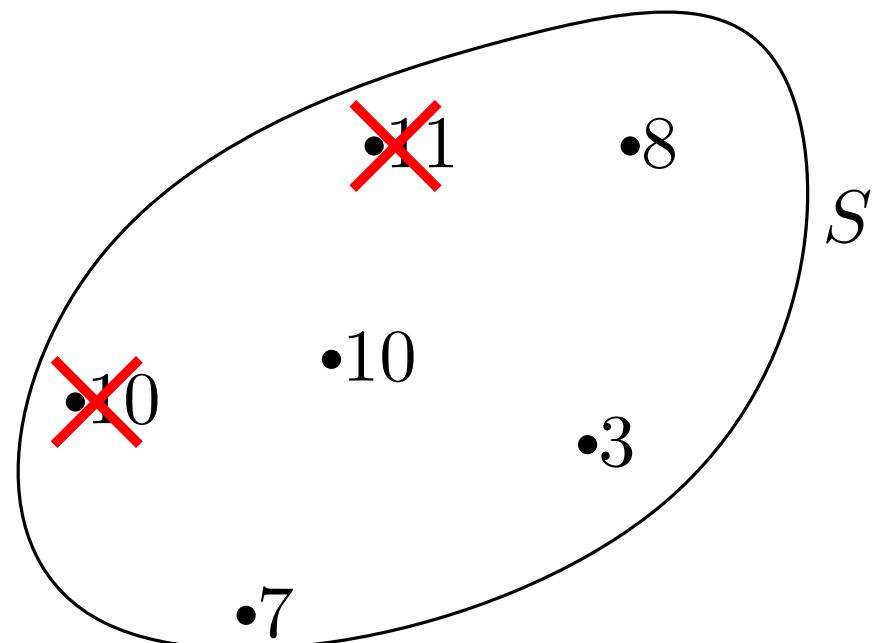
- Extract-Max( $S$ ): fjern og returnér største nøgle.
- Insert( $S, k$ ): tilføj  $k$  til  $S$ .

Extract-Max( $S$ )

returnér 11

Extract-Max( $S$ )

returnér 10



# Prioritetskø

Dynamisk multi-mængde  $S$  af nøgler.

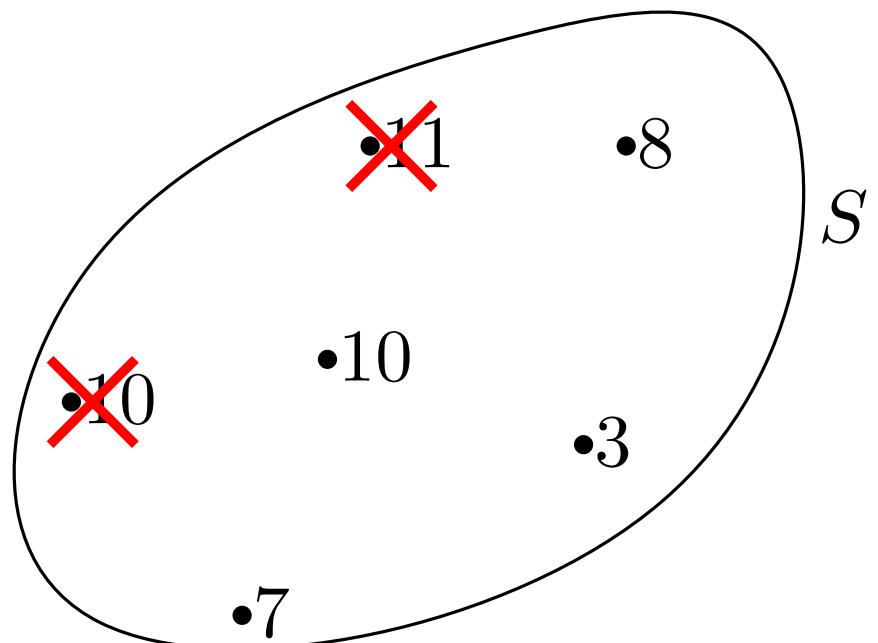
To (vigtigste) operationer:

- Extract-Max( $S$ ): fjern og returnér største nøgle.
- Insert( $S, k$ ): tilføj  $k$  til  $S$ .

Extract-Max( $S$ )      returnér 11

Extract-Max( $S$ )      returnér 10

Insert( $S, 13$ )



# Prioritetskø

Dynamisk multi-mængde  $S$  af nøgler.

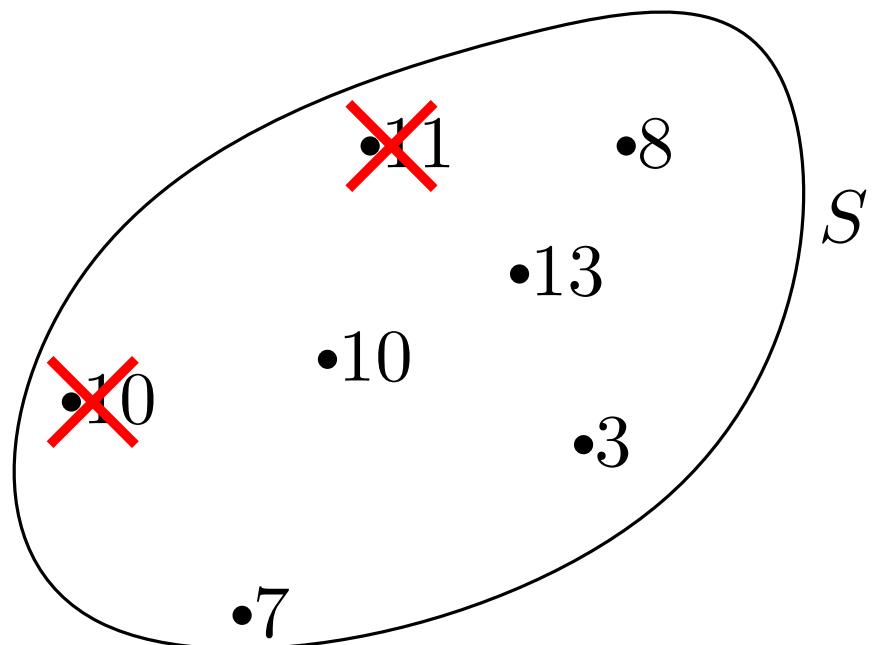
To (vigtigste) operationer:

- Extract-Max( $S$ ): fjern og returnér største nøgle.
- Insert( $S, k$ ): tilføj  $k$  til  $S$ .

Extract-Max( $S$ )      returnér 11

Extract-Max( $S$ )      returnér 10

Insert( $S, 13$ )



# Prioritetskø

Dynamisk multi-mængde  $S$  af nøgler.

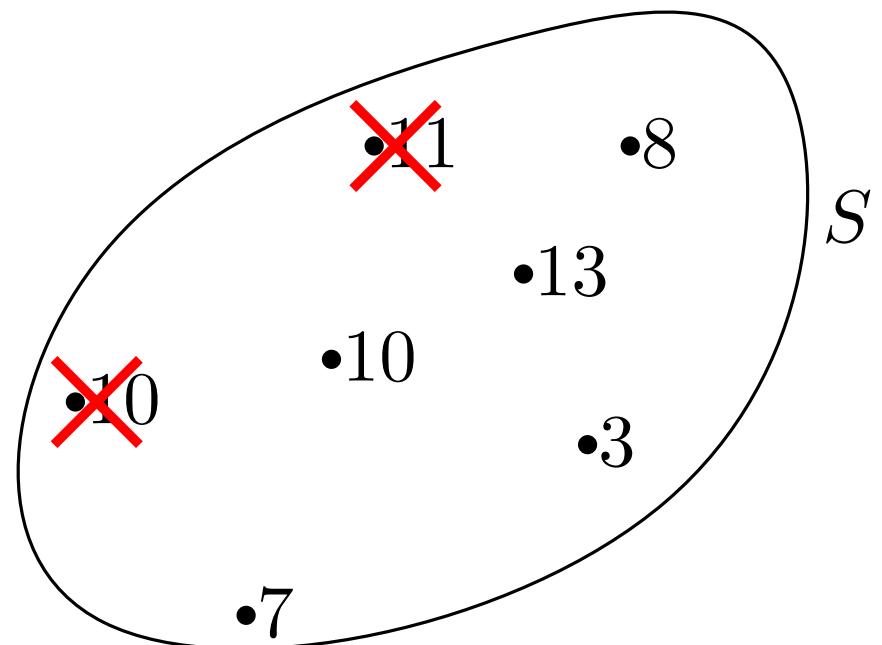
To (vigtigste) operationer:

- Extract-Max( $S$ ): fjern og returnér største nøgle.
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Extract-Max( $S$ )      returnér 11

Extract-Max( $S$ )      returnér 10

Insert( $S, 13$ )



I praksis: Vi gemmer hver nøgle sammen med *sattelitdata*:  $(k, \text{data})$

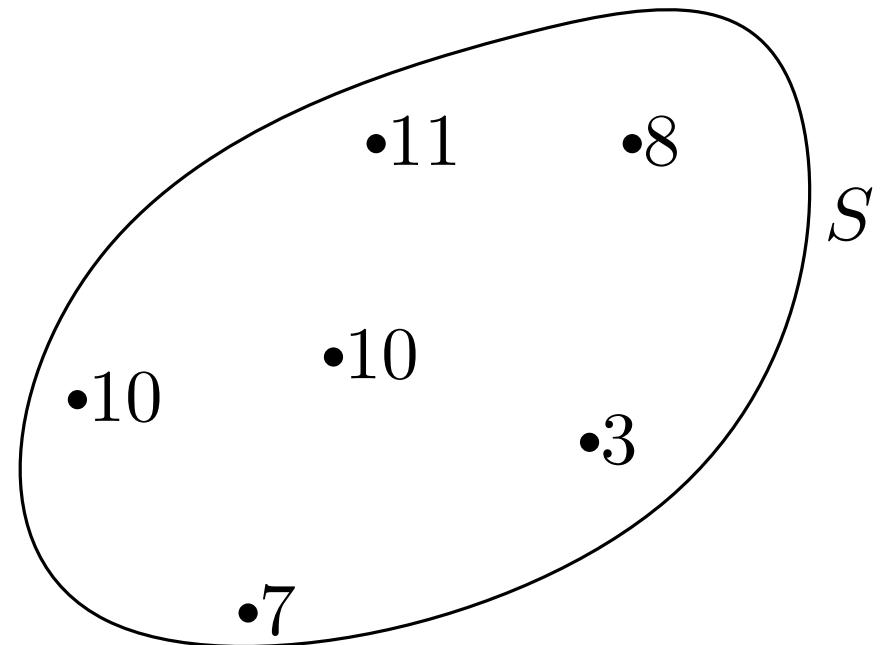
# Kendte teknikker

Array:

0	1	2	...				
3	10	7	11	8	10		

Extract-Max( $S$ ):  $\Theta(n)$  tid.

Insert( $S, k$ ):  $\Theta(1)$  tid.



# Kendte teknikker

Array:

0	1	2	...				
3	10	7	11	8	10		

Extract-Max( $S$ ):  $\Theta(n)$  tid.

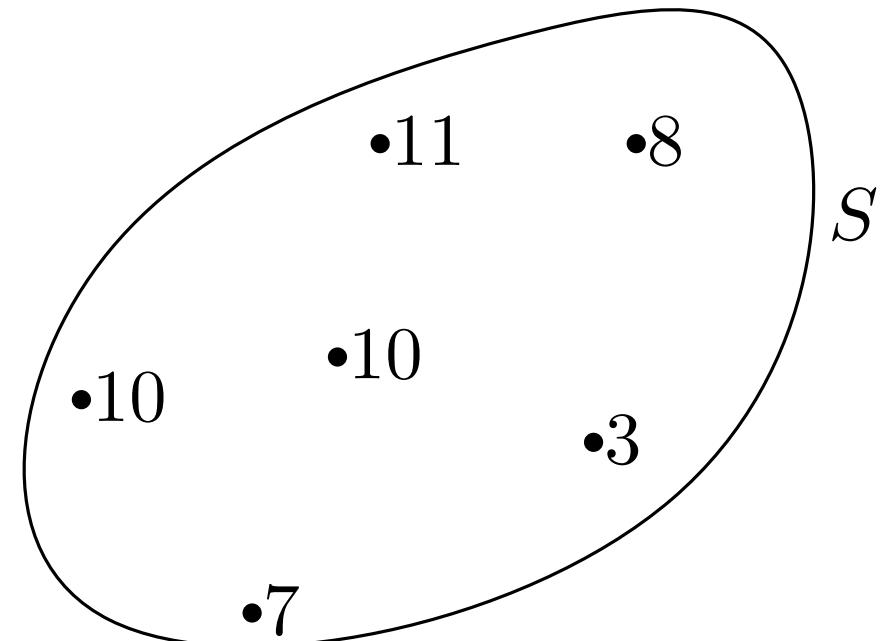
Insert( $S, k$ ):  $\Theta(1)$  tid.

Sorteret array:

0	1	2	...				
3	7	8	10	10	11		

Extract-Max( $S$ ):  $\Theta(1)$  tid.

Insert( $S, k$ ):  $\Theta(n)$  tid.



# Kendte teknikker

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Extract-Max( $S$ ):  $\Theta(n)$  tid.

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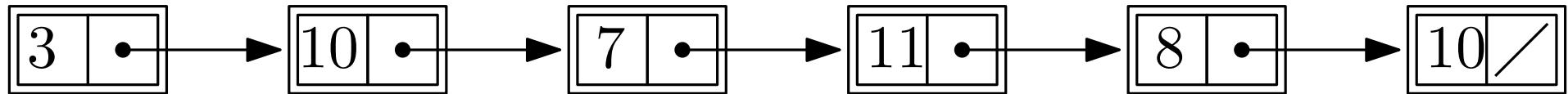
Sorteret array:

0	1	2	...				
3	7	8	10	10	11		

Extract-Max( $S$ ):  $\Theta(1)$  tid.

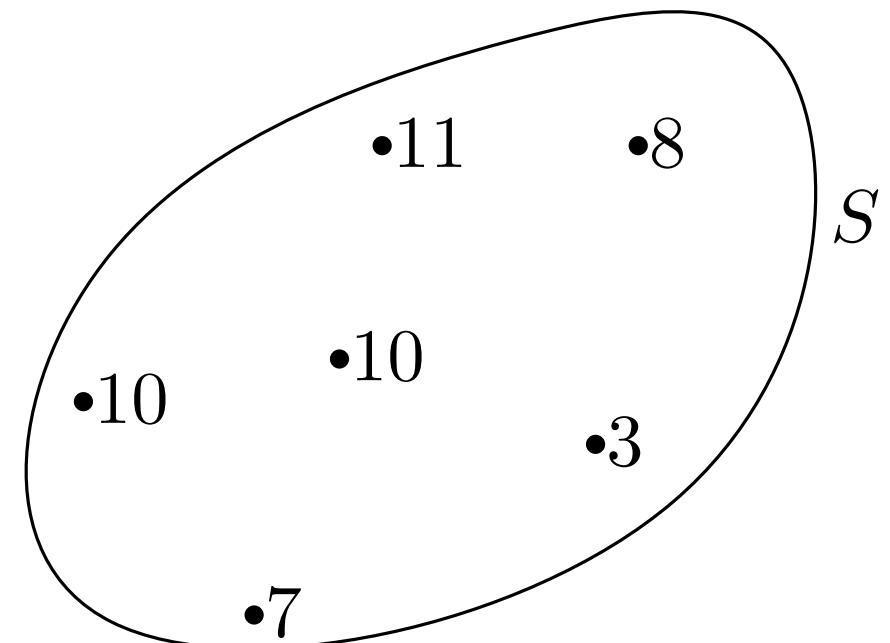
Insert( $S, k$ ):  $\Theta(n)$  tid.

Hægtet liste:



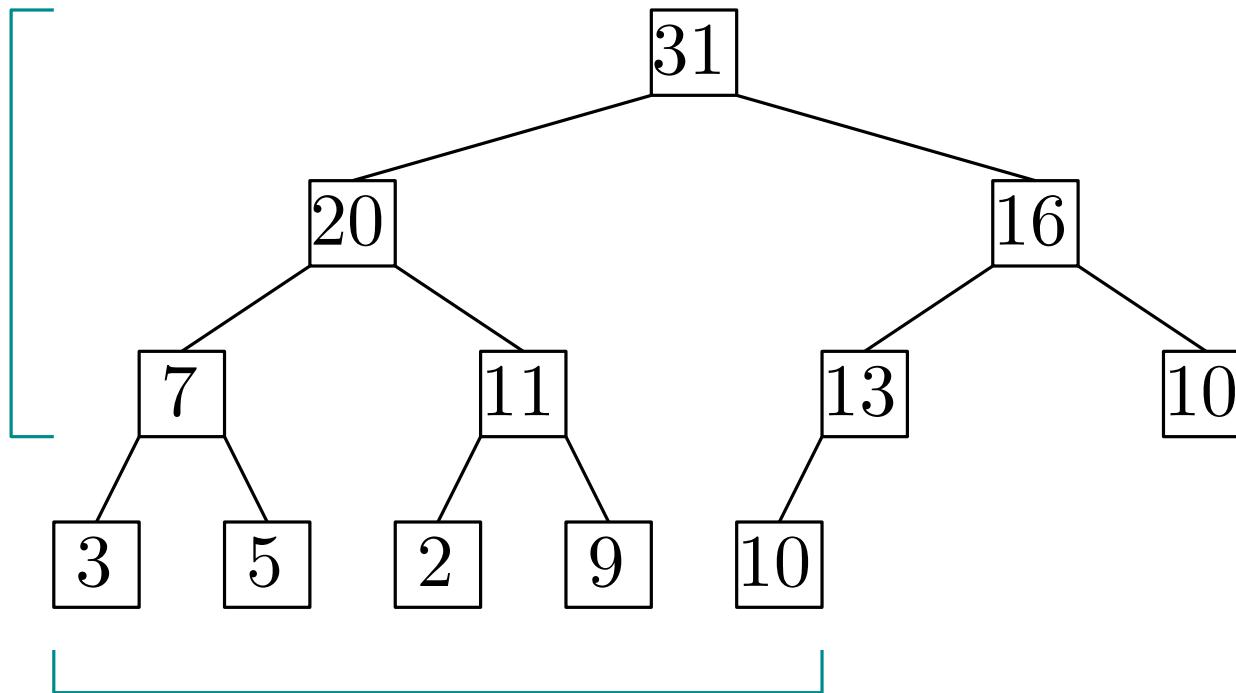
Extract-Max( $S$ ):  $\Theta(n)$  tid.

Insert( $S, k$ ):  $\Theta(1)$  tid.



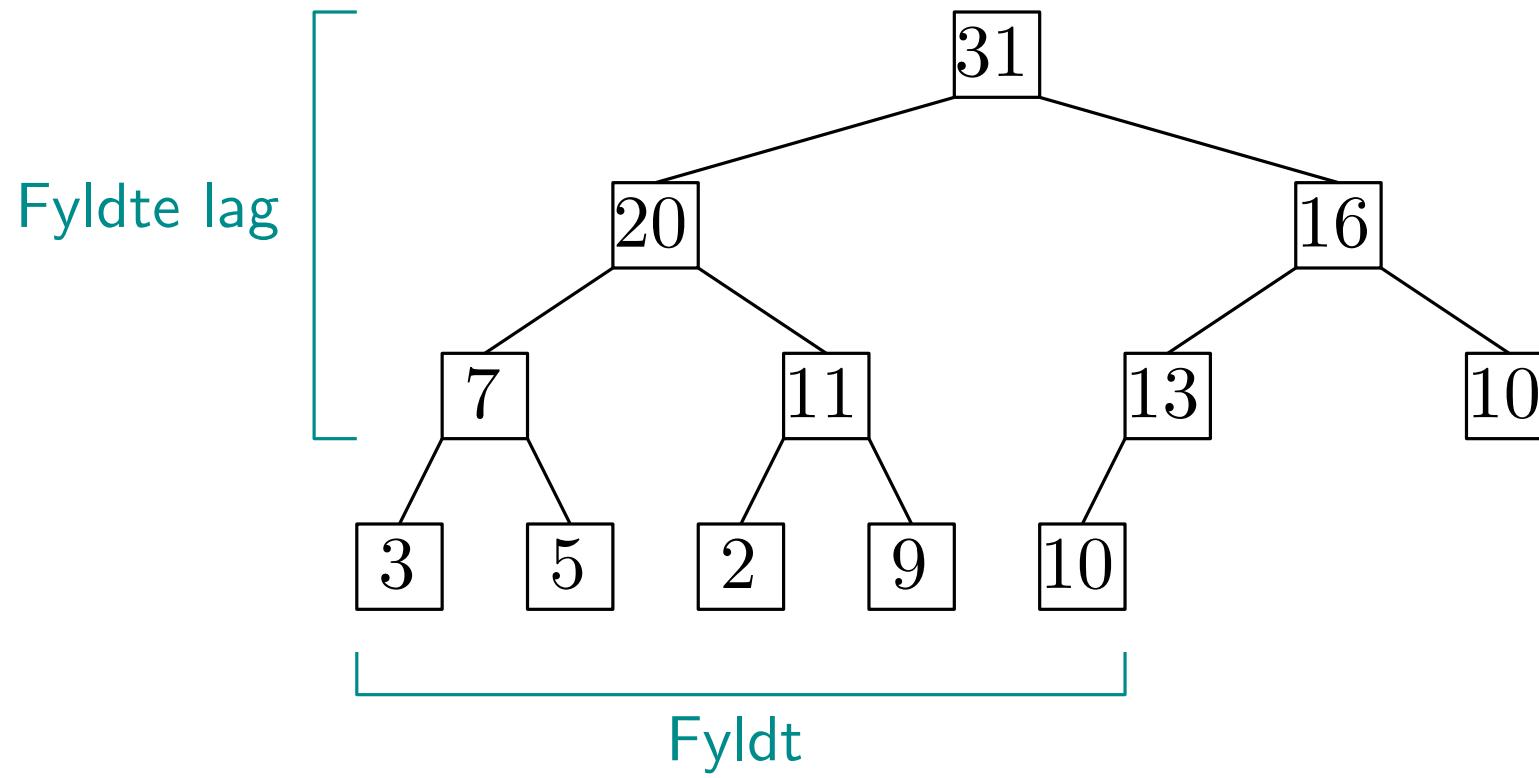
# Hob

Fyldte lag

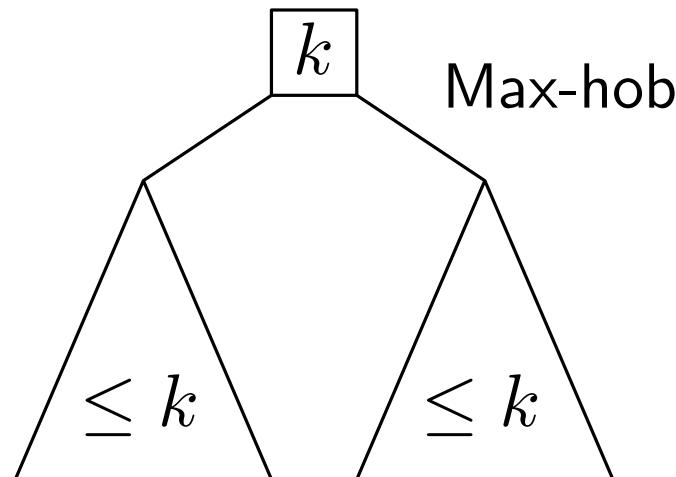


Fyldt

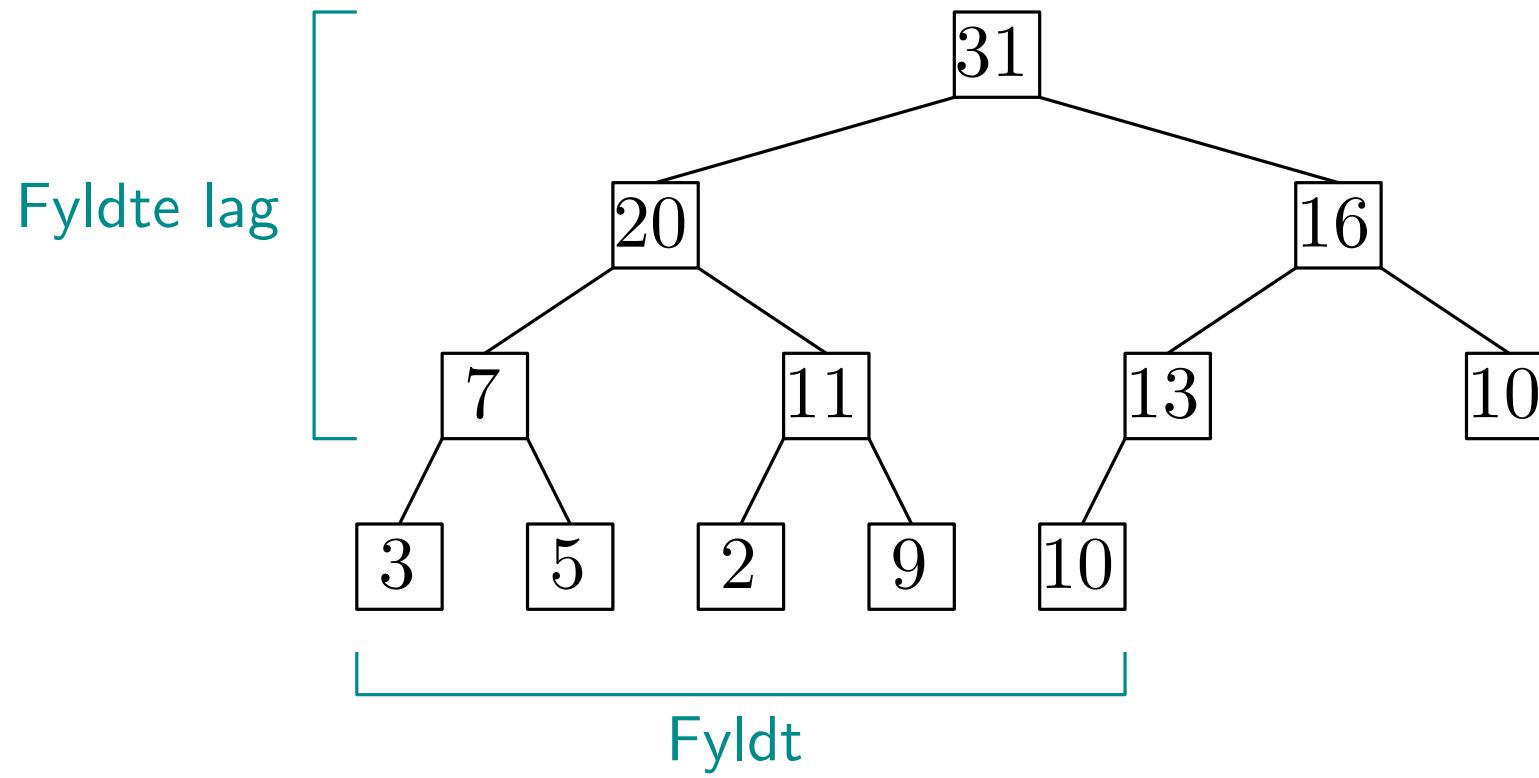
Hob



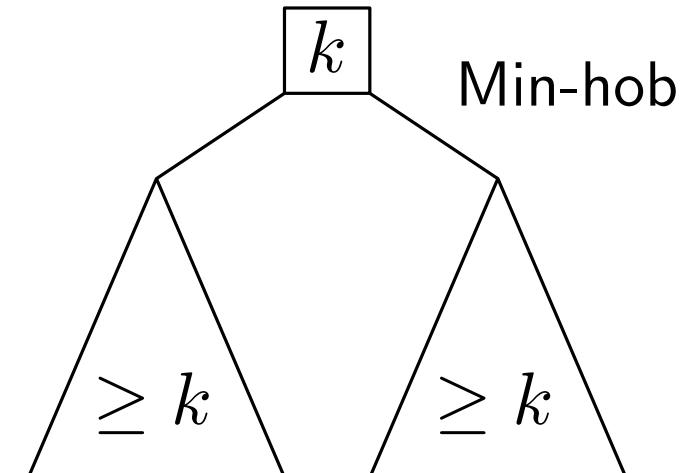
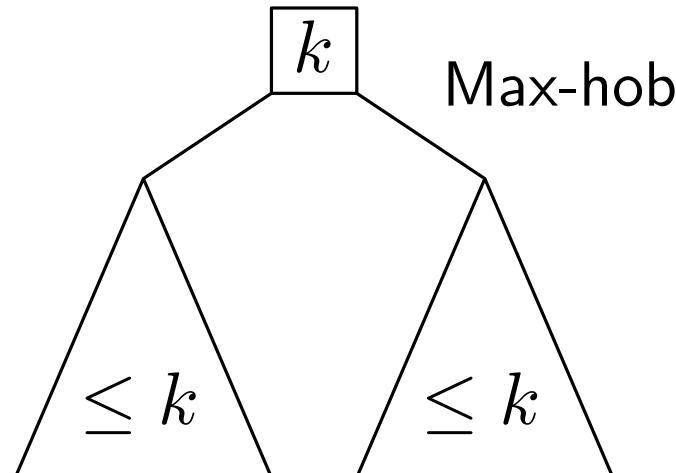
Hobeordenen:



# Hob

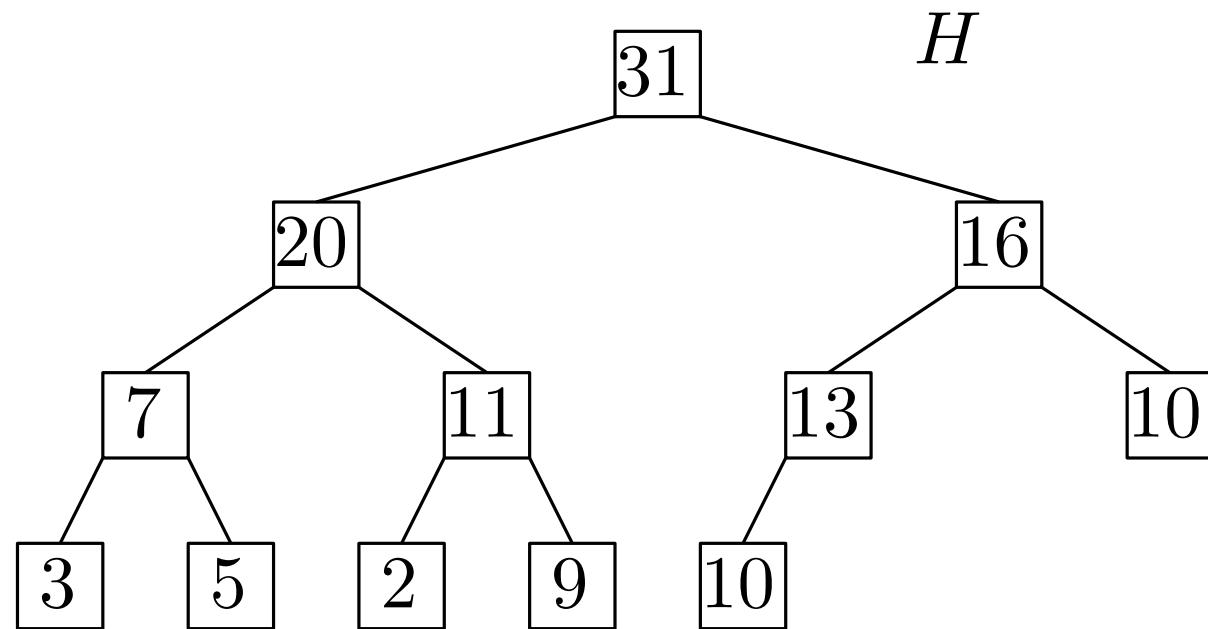


Hobeordenen:



# Extract-Max

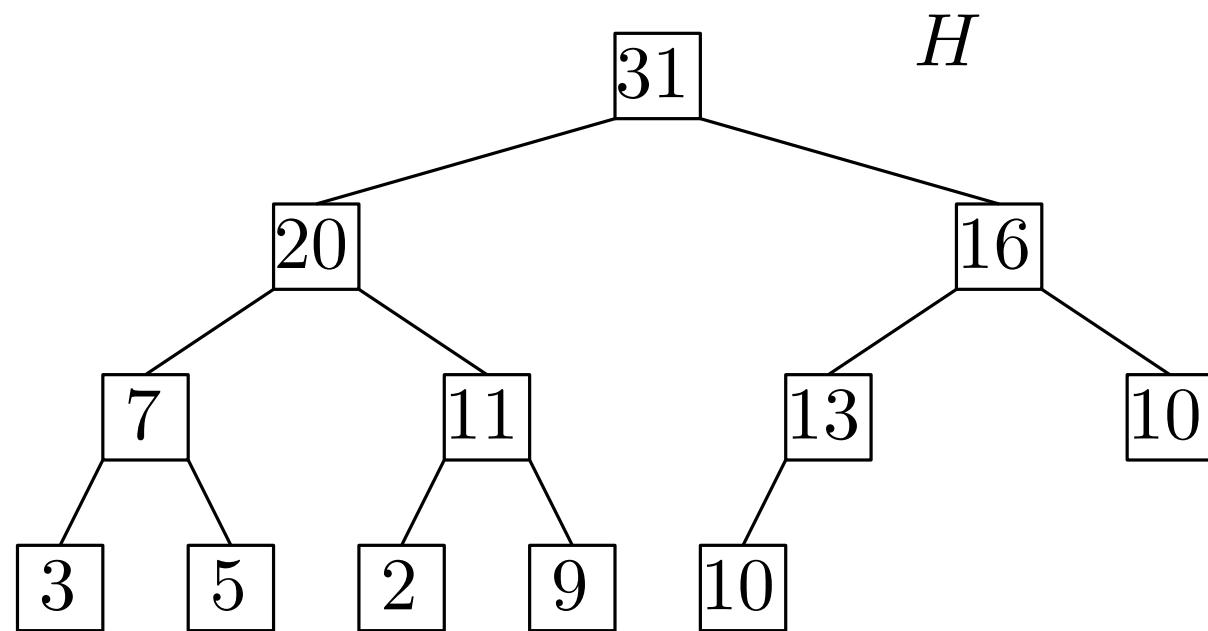
Extract-Max( $H$ )



# Extract-Max

Extract-Max( $H$ )

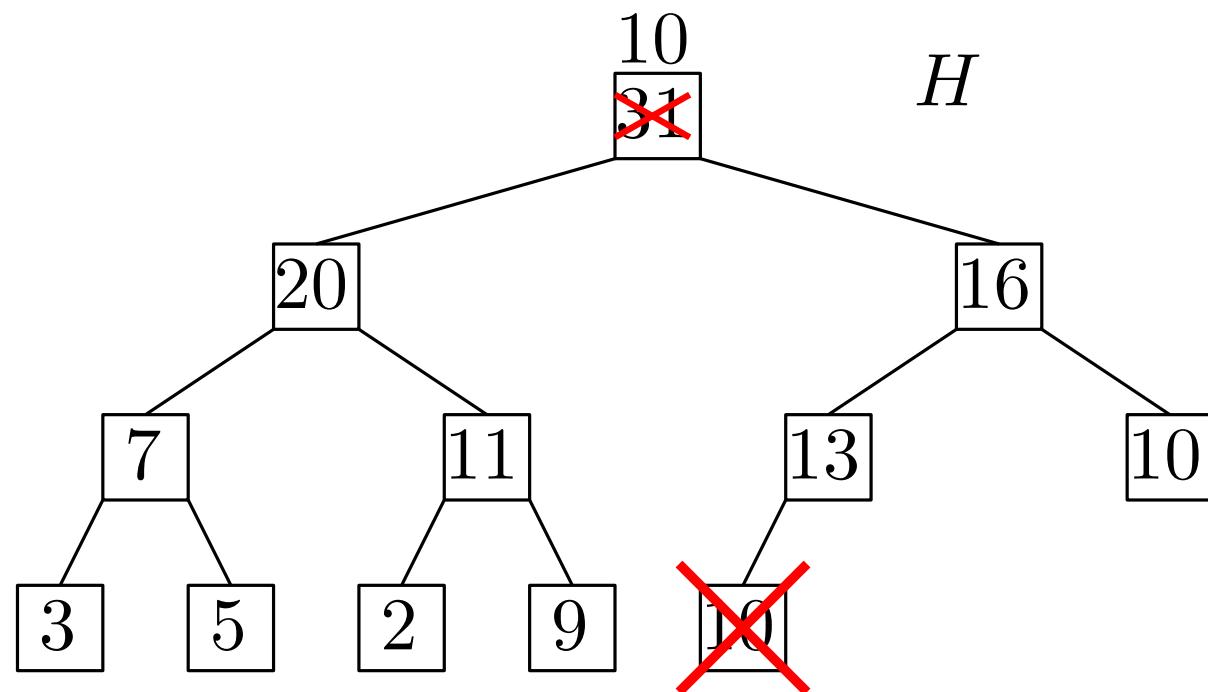
$$\max = 31$$



# Extract-Max

Extract-Max( $H$ )

$$\max = 31$$

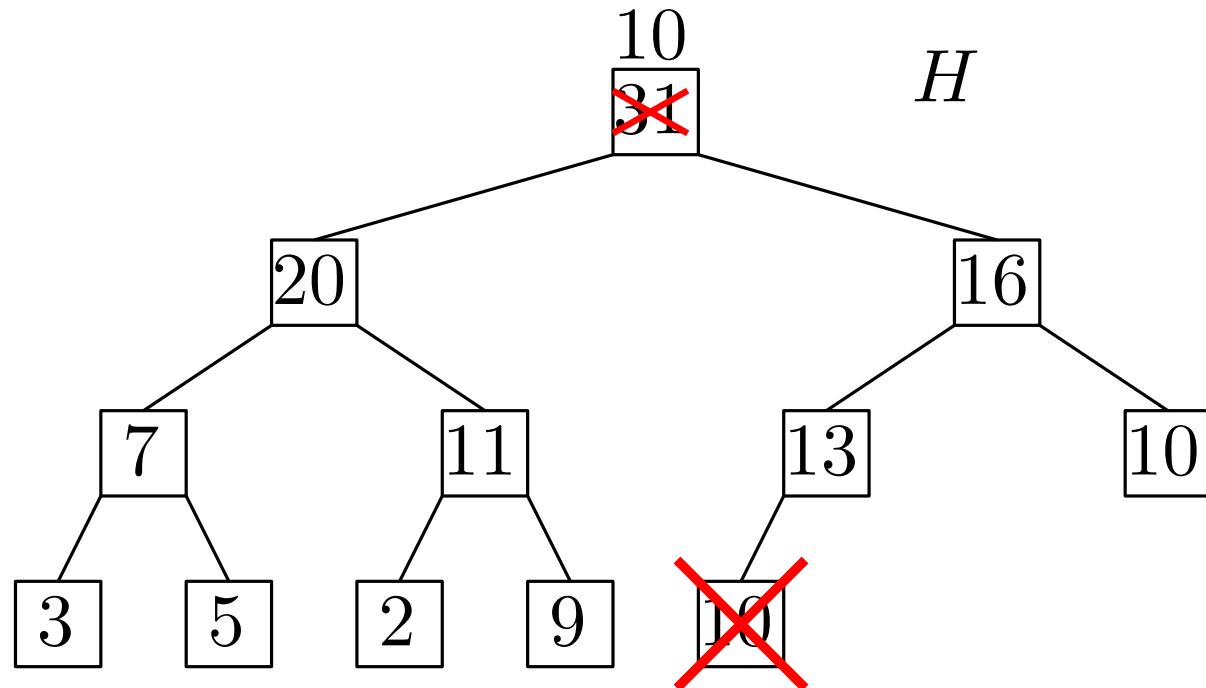


# Extract-Max

Extract-Max( $H$ )

$$\max = 31$$

10 “bobler ned”  
(Max-Heapify)

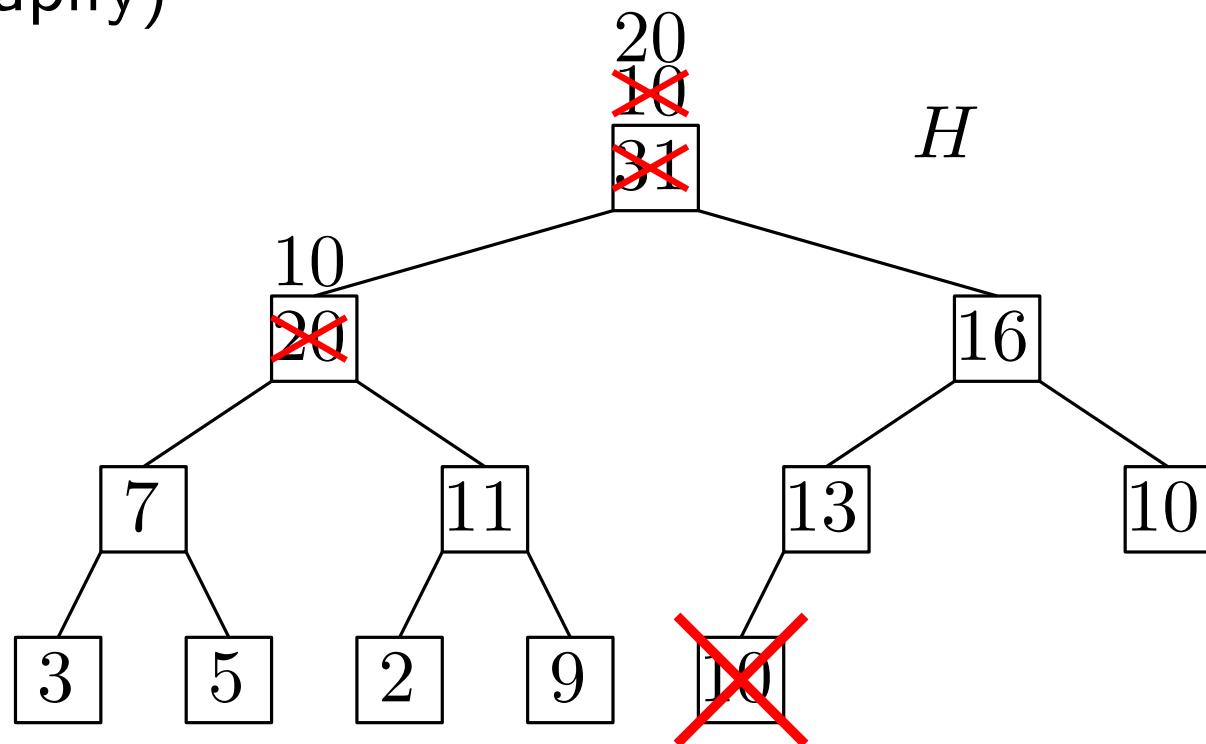


# Extract-Max

Extract-Max( $H$ )

$$\max = 31$$

10 “bobler ned”  
(Max-Heapify)

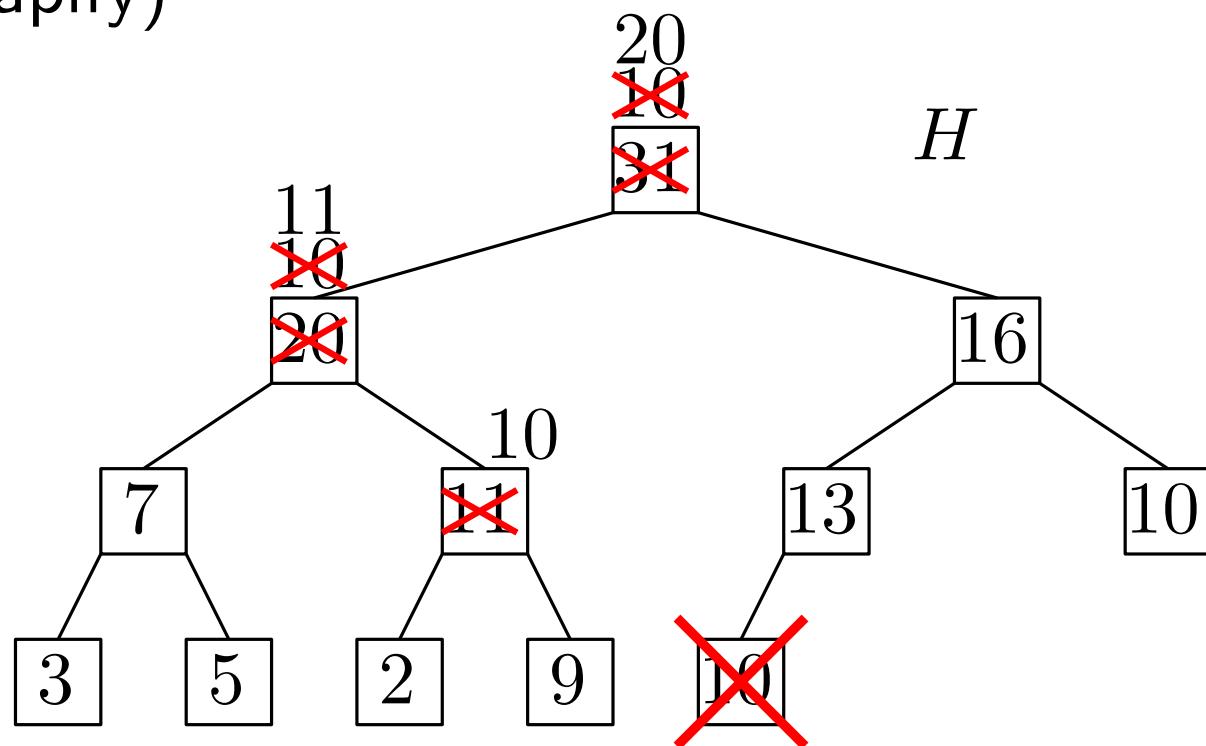


# Extract-Max

Extract-Max( $H$ )

$$\max = 31$$

10 “bobler ned”  
(Max-Heapify)



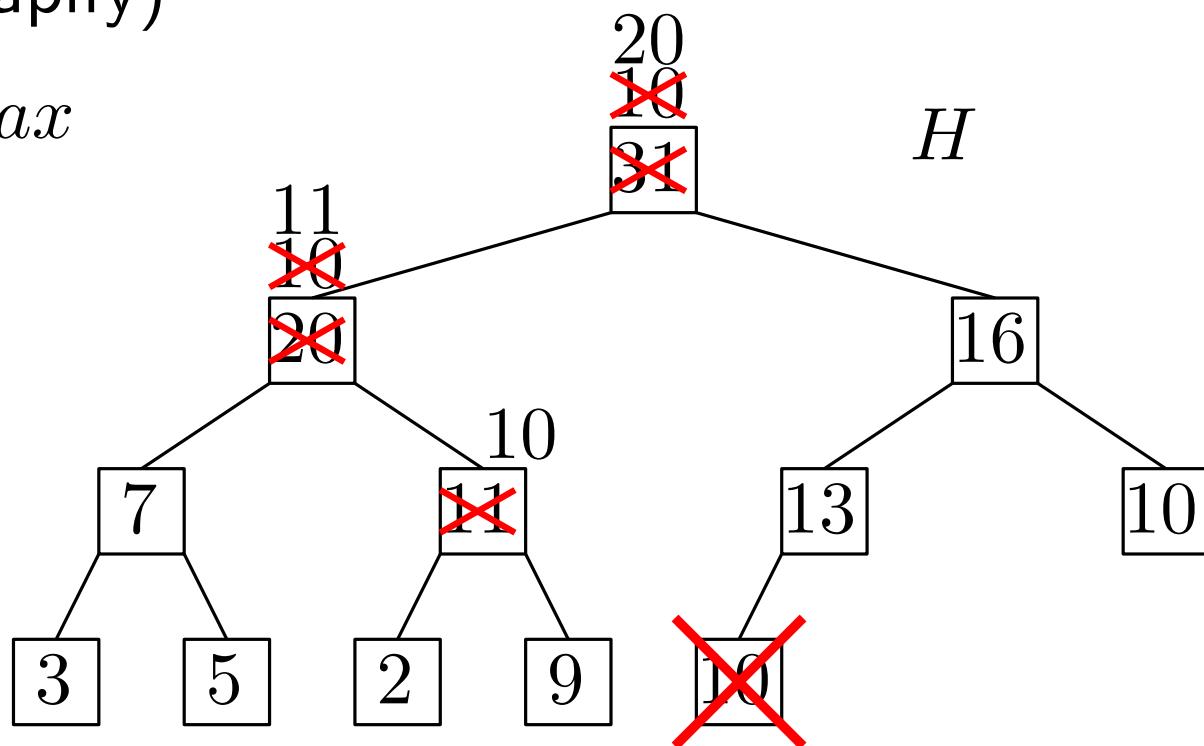
# Extract-Max

Extract-Max( $H$ )

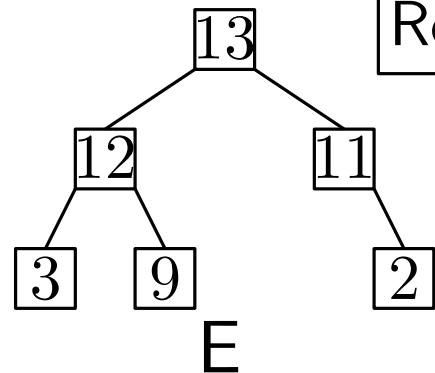
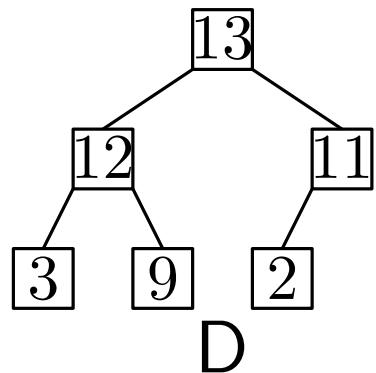
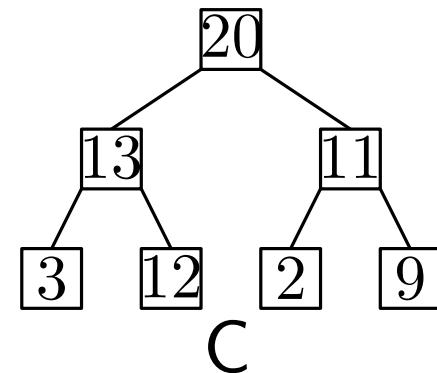
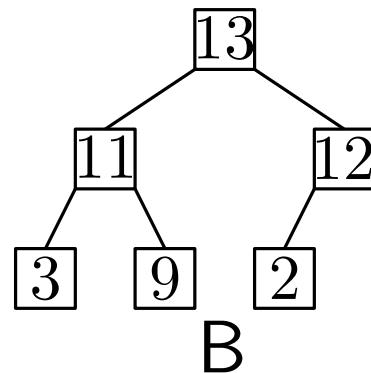
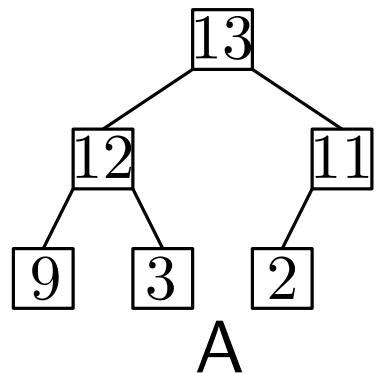
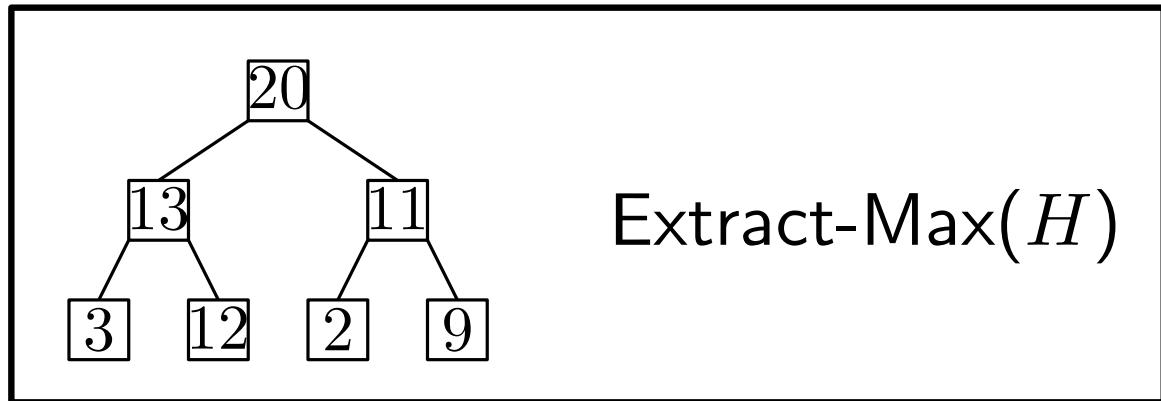
$max = 31$

10 “bobler ned”  
(Max-Heapify)

return  $max$



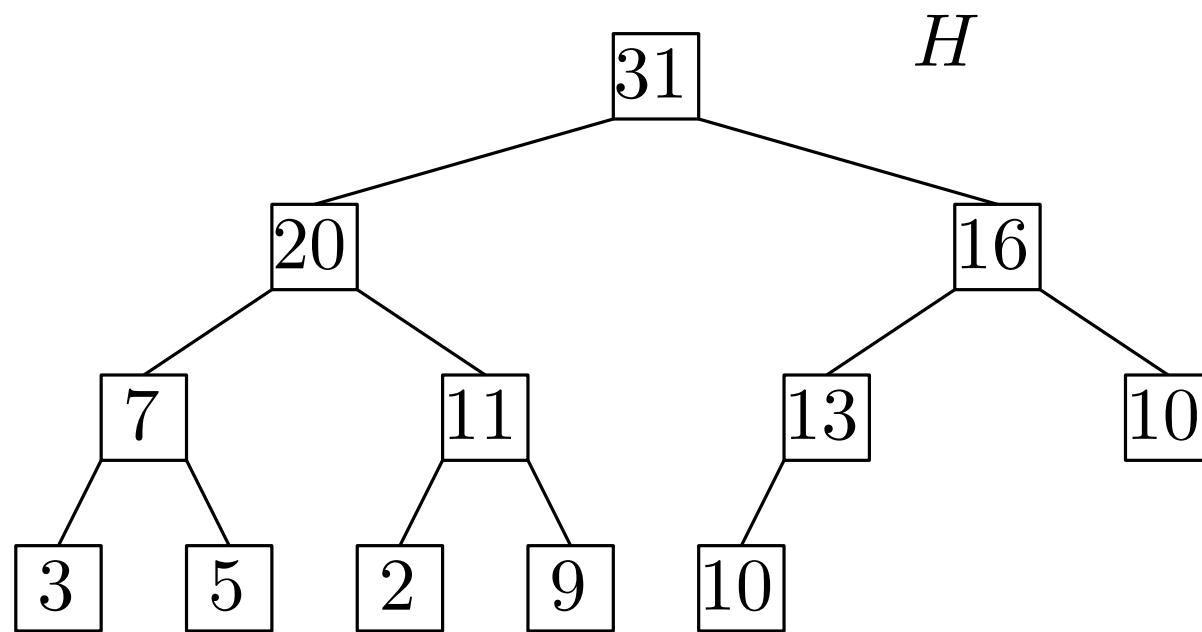
# Hvordan ser hoben ud til sidst?



socrative.com → Student login,  
Room name: ABRAHAMSEN3464

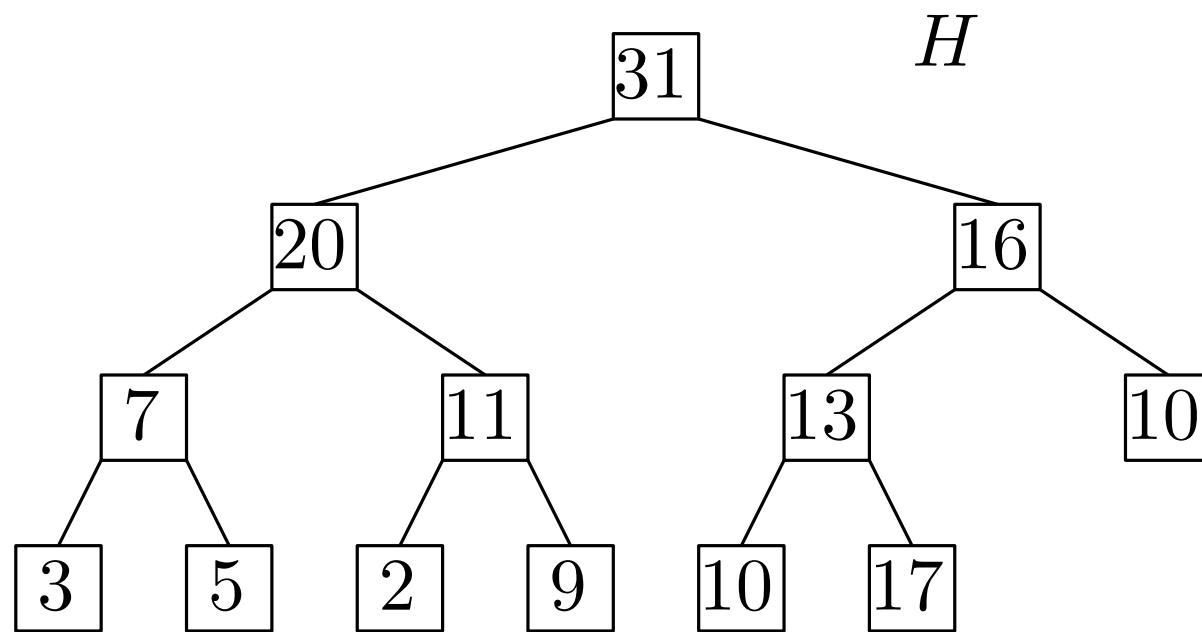
# Insert

Insert( $H$ , 17)



# Insert

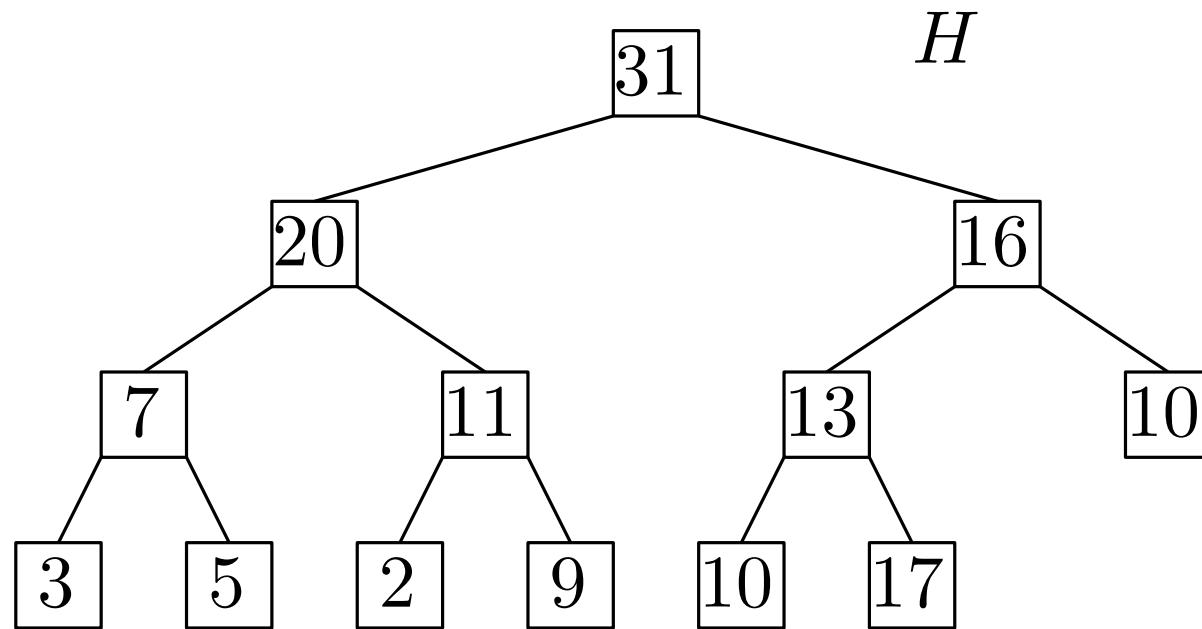
Insert( $H$ , 17)



# Insert

Insert( $H$ , 17)

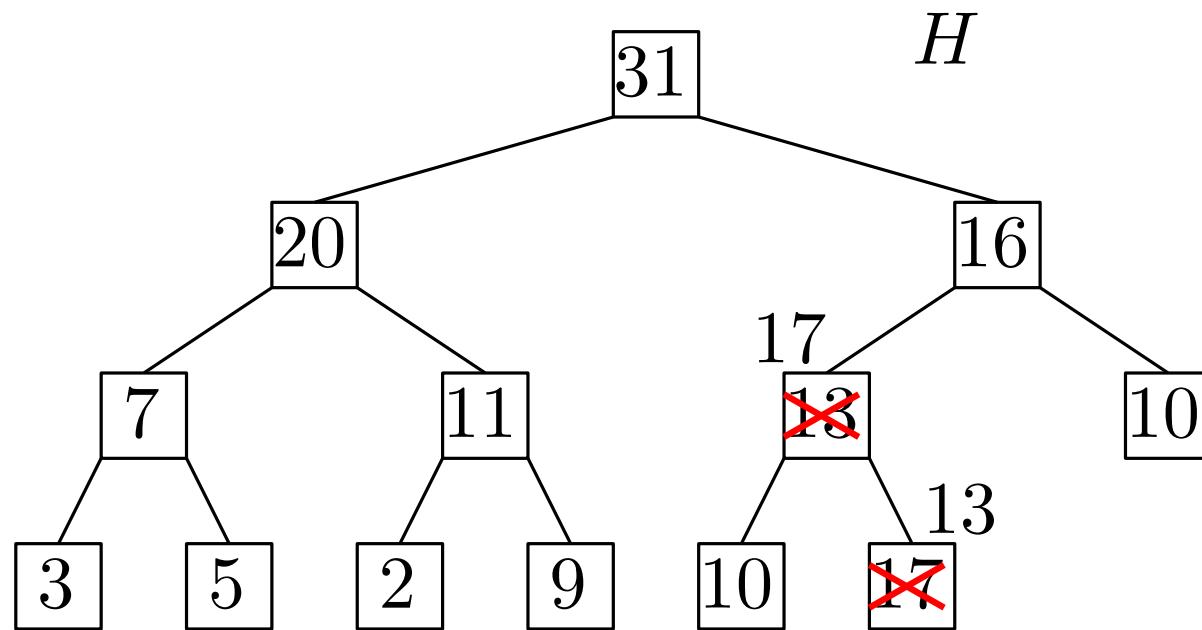
17 “bobler op”



# Insert

Insert( $H$ , 17)

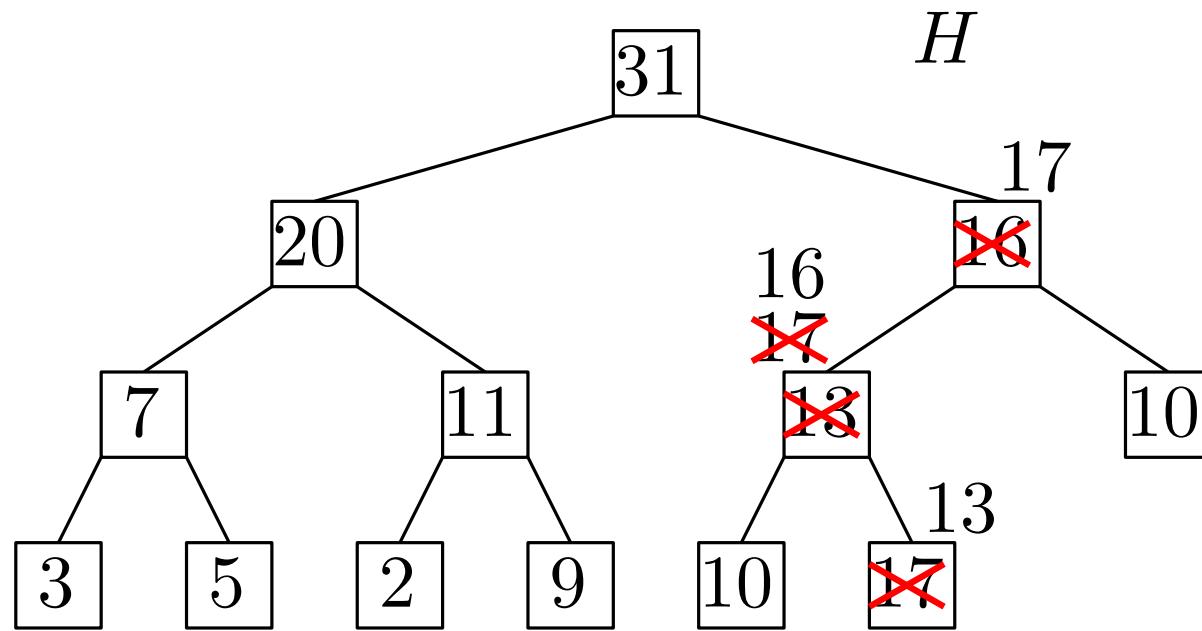
17 “bobler op”



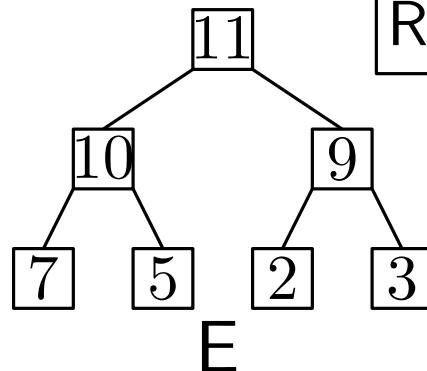
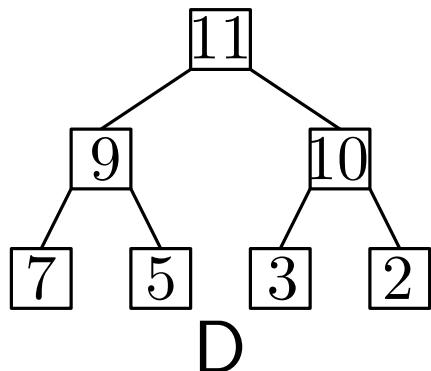
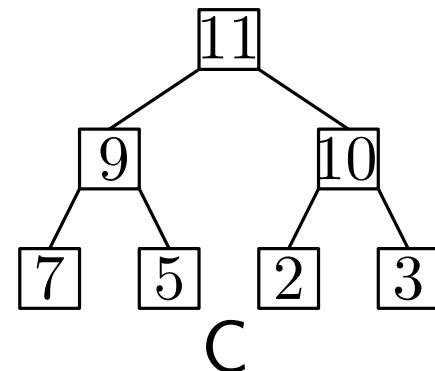
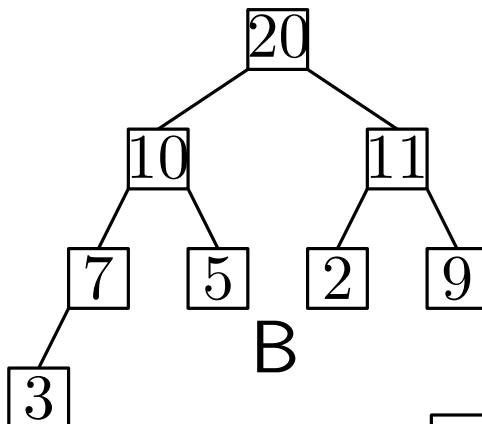
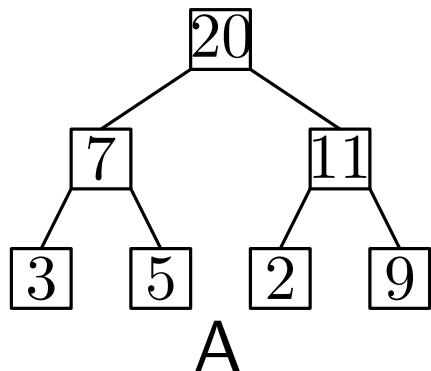
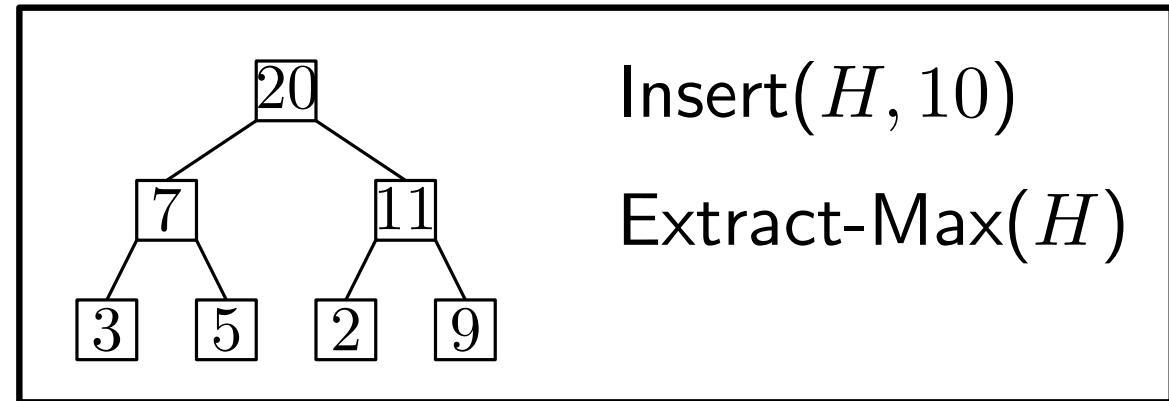
# Insert

Insert( $H$ , 17)

17 “bobler op”



# Hvordan ser hoben ud til sidst?



socrative.com → Student login,  
Room name: ABRAHAMSEN3464

# Køretider

Insert: Boble op

Extract-Max: Boble ned

## Køretider

Insert: Boble op

Extract-Max: Boble ned

I begge tilfælde er  $T(n) = \Theta(h)$ ,  
hvor  $h$  er højden af hoben.

## Køretider

Insert: Boble op

Extract-Max: Boble ned

I begge tilfælde er  $T(n) = \Theta(h)$ ,  
hvor  $h$  er højden af hoben.

$$n = 2^0 = 1$$

$$h = 0$$

•

## Køretider

Insert: Boble op

Extract-Max: Boble ned

I begge tilfælde er  $T(n) = \Theta(h)$ ,  
hvor  $h$  er højden af hoben.

$$n = 2^0 = 1$$

$$h = 0$$

•

$$n = 2^1 = 2$$

$$h = 1$$



# Køretider

Insert: Boble op

Extract-Max: Boble ned

I begge tilfælde er  $T(n) = \Theta(h)$ ,  
hvor  $h$  er højden af høben.

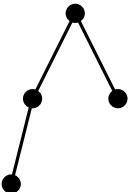
$$n = 2^0 = 1$$

$$h = 0$$
  


$$n = 2^1 = 2$$

$$h = 1$$
  


$$n = 2^2 = 4$$

$$h = 2$$
  


# Køretider

Insert: Boble op

Extract-Max: Boble ned

I begge tilfælde er  $T(n) = \Theta(h)$ ,  
hvor  $h$  er højden af høben.

$$n = 2^0 = 1$$

$$h = 0$$



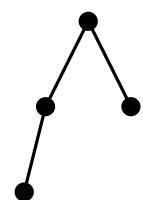
$$n = 2^1 = 2$$

$$h = 1$$



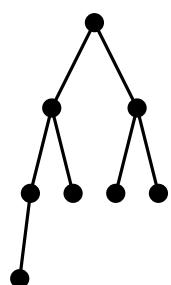
$$n = 2^2 = 4$$

$$h = 2$$



$$n = 2^3 = 8$$

$$h = 3$$



# Køretider

Insert: Boble op

Extract-Max: Boble ned

I begge tilfælde er  $T(n) = \Theta(h)$ ,  
hvor  $h$  er højden af hoben.

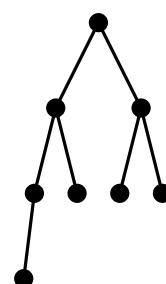
$$n = 2^0 = 1$$

$$h = 0$$



$$n = 2^3 = 8$$

$$h = 3$$



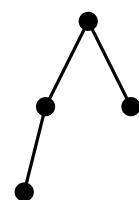
$$n = 2^1 = 2$$

$$h = 1$$



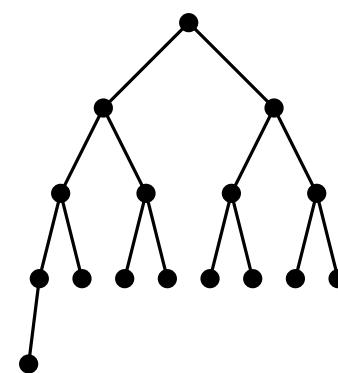
$$n = 2^2 = 4$$

$$h = 2$$



$$n = 2^4 = 16$$

$$h = 4$$



# Køretider

Insert: Boble op

Extract-Max: Boble ned

I begge tilfælde er  $T(n) = \Theta(h)$ ,  
hvor  $h$  er højden af hoben.

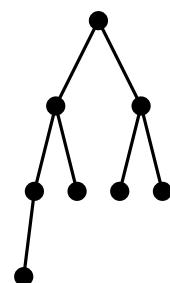
$$n = 2^0 = 1$$

$$h = 0$$



$$n = 2^3 = 8$$

$$h = 3$$



$$1 + 1 + 2 + 4 + \dots + 2^{h-1}$$

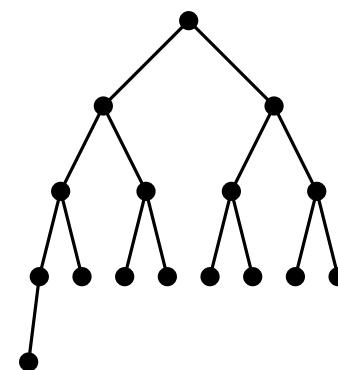
$$n = 2^1 = 2$$

$$h = 1$$



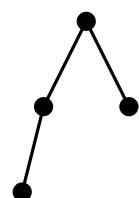
$$n = 2^4 = 16$$

$$h = 4$$



$$n = 2^2 = 4$$

$$h = 2$$



# Køretider

Insert: Boble op

Extract-Max: Boble ned

I begge tilfælde er  $T(n) = \Theta(h)$ ,  
hvor  $h$  er højden af hoben.

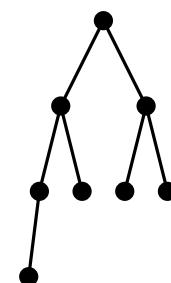
$$n = 2^0 = 1$$

$$h = 0$$



$$n = 2^3 = 8$$

$$h = 3$$



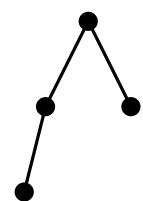
$$n = 2^1 = 2$$

$$h = 1$$



$$n = 2^2 = 4$$

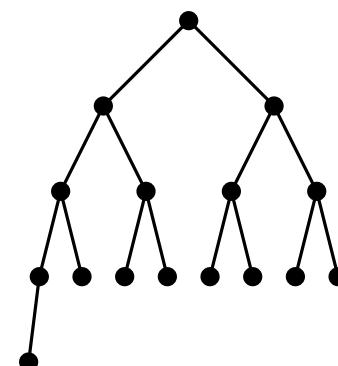
$$h = 2$$



$$\left[ \frac{1 + 1}{2} + 2 + 4 + \dots + 2^{h-1} \right]$$

$$n = 2^4 = 16$$

$$h = 4$$



# Køretider

Insert: Boble op

Extract-Max: Boble ned

I begge tilfælde er  $T(n) = \Theta(h)$ ,  
hvor  $h$  er højden af hoben.

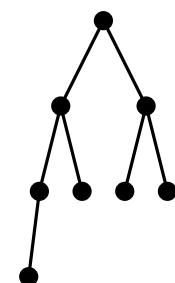
$$n = 2^0 = 1$$

$$h = 0$$



$$n = 2^3 = 8$$

$$h = 3$$



$$1 + 1 + 2 + 4 + \dots + 2^{h-1}$$

$$\underbrace{1 + 1}_{2} + \underbrace{2 + 4}_{4} + \dots + 2^{h-1}$$

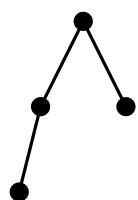
$$n = 2^1 = 2$$

$$h = 1$$



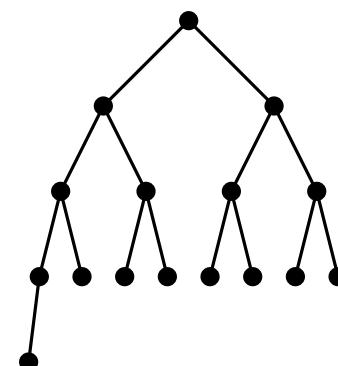
$$n = 2^2 = 4$$

$$h = 2$$



$$n = 2^4 = 16$$

$$h = 4$$



# Køretider

Insert: Boble op

Extract-Max: Boble ned

I begge tilfælde er  $T(n) = \Theta(h)$ ,  
hvor  $h$  er højden af hoben.

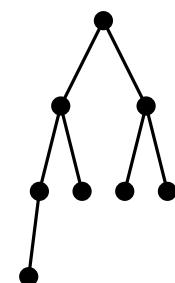
$$n = 2^0 = 1$$

$$h = 0$$



$$n = 2^3 = 8$$

$$h = 3$$



$$1 + 1 + 2 + 4 + \dots + 2^{h-1}$$

2

4

8

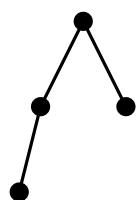
$$n = 2^1 = 2$$

$$h = 1$$



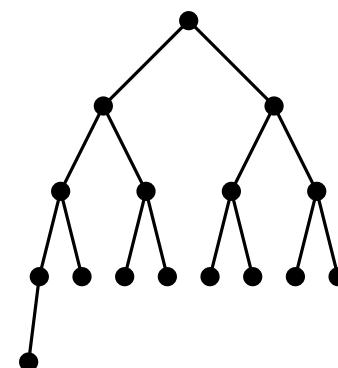
$$n = 2^2 = 4$$

$$h = 2$$



$$n = 2^4 = 16$$

$$h = 4$$



# Køretider

Insert: Boble op

Extract-Max: Boble ned

I begge tilfælde er  $T(n) = \Theta(h)$ ,  
hvor  $h$  er højden af høben.

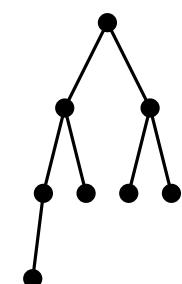
$$n = 2^0 = 1$$

$$h = 0$$



$$n = 2^3 = 8$$

$$h = 3$$



$$1 + 1 + 2 + 4 + \dots + 2^{h-1}$$

$$2$$

$$4$$

$$8$$

$$2^h$$

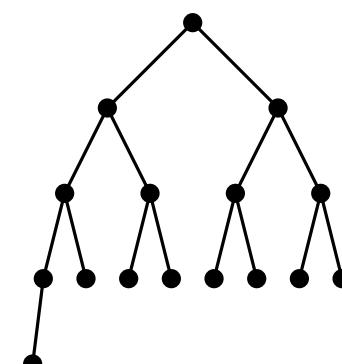
$$n = 2^1 = 2$$

$$h = 1$$



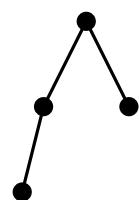
$$n = 2^4 = 16$$

$$h = 4$$



$$n = 2^2 = 4$$

$$h = 2$$



# Køretider

Insert: Boble op

Extract-Max: Boble ned

I begge tilfælde er  $T(n) = \Theta(h)$ ,  
hvor  $h$  er højden af høben.

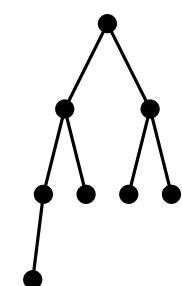
$$n = 2^0 = 1$$

$$h = 0$$



$$n = 2^3 = 8$$

$$h = 3$$



$$1 + 1 + 2 + 4 + \dots + 2^{h-1}$$

$$\begin{array}{c} \boxed{2} \\ \boxed{4} \\ \boxed{8} \end{array}$$

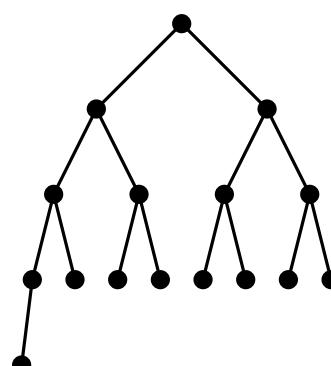
$$n = 2^1 = 2$$

$$h = 1$$



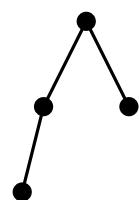
$$n = 2^4 = 16$$

$$h = 4$$



$$n = 2^2 = 4$$

$$h = 2$$

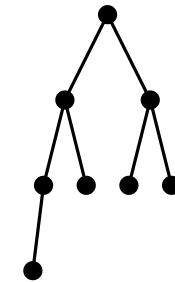
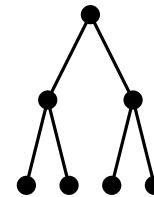
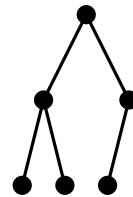
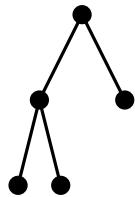
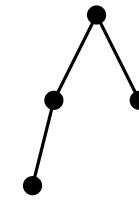
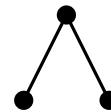


$h = \lfloor \lg n \rfloor$ , så  
 $T(n) = \Theta(\log n)$ .

$$2^h$$

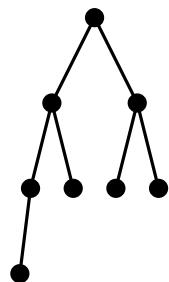
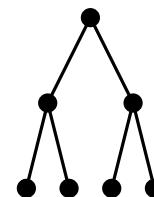
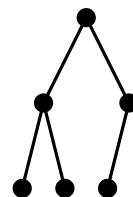
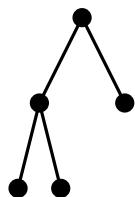
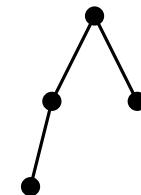
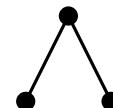
# Hvor mange blade er der?

*Blad:* knude uden børn



# Hvor mange blade er der?

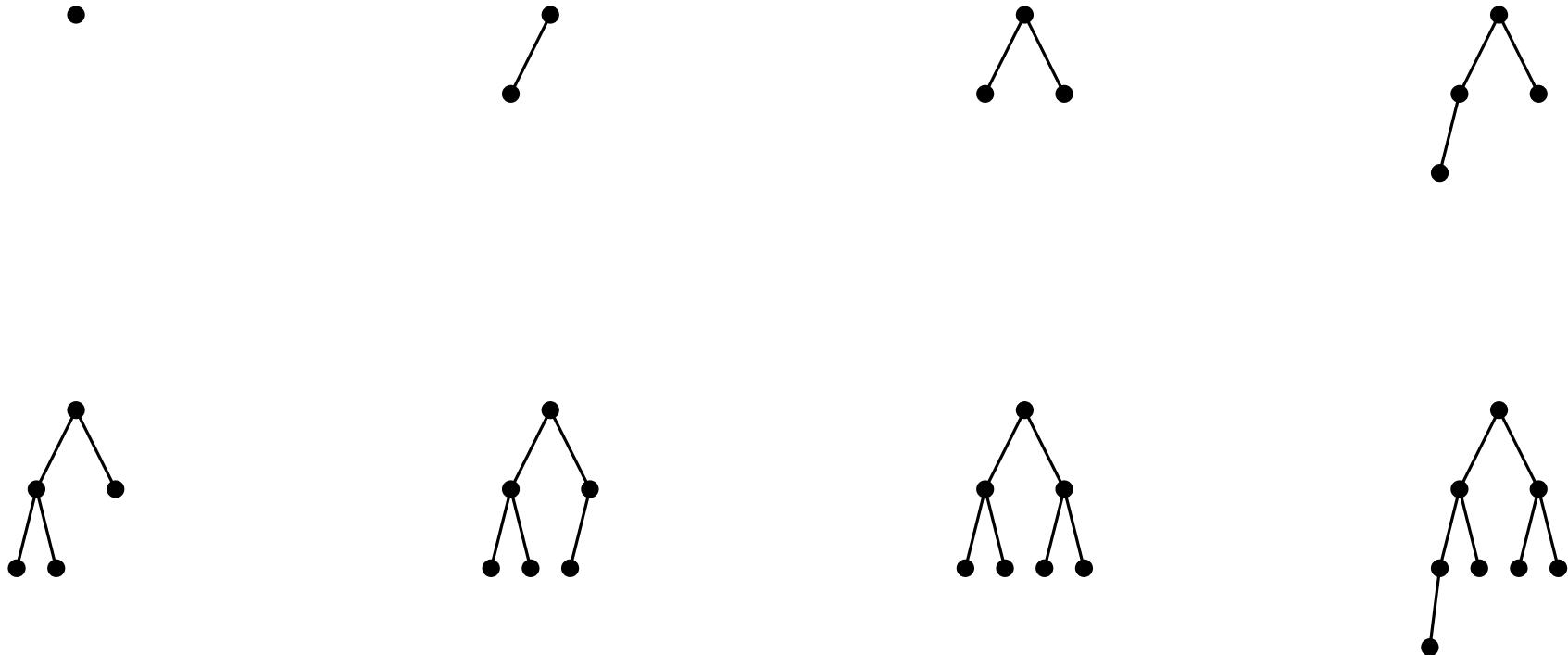
*Blad:* knude uden børn



Hver anden gang vi tilføjer en knude er antallet uændret, de andre gange vokser det med én. Derfor:  $\#\text{blade} = \lceil \frac{n}{2} \rceil$ .

# Hvor mange blade er der?

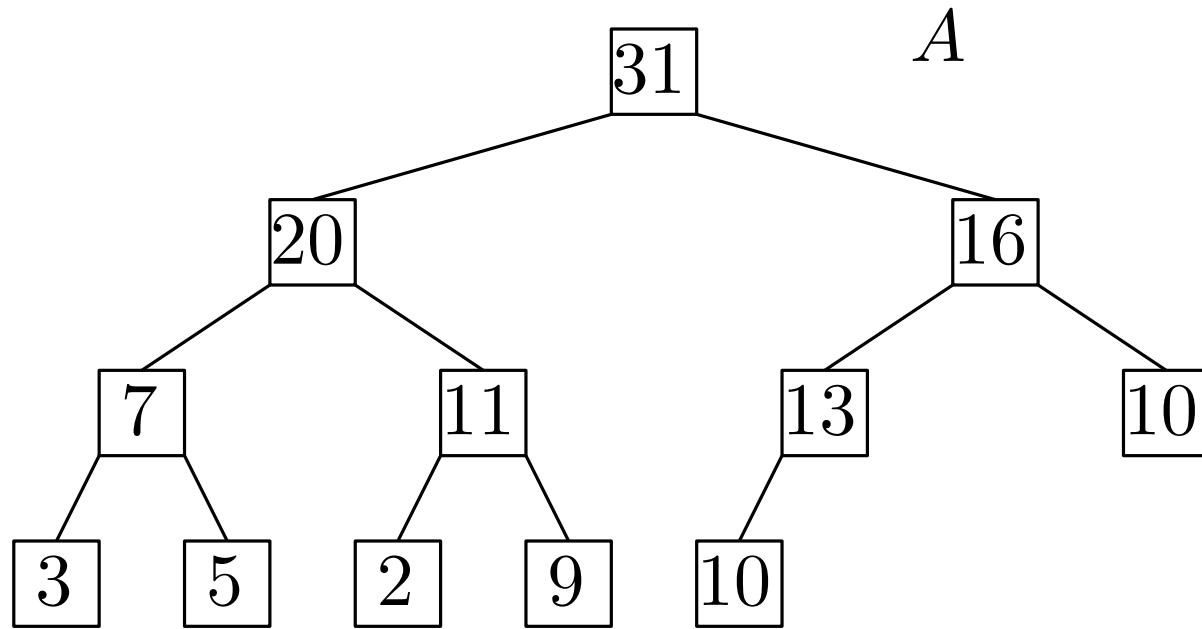
*Blad:* knude uden børn



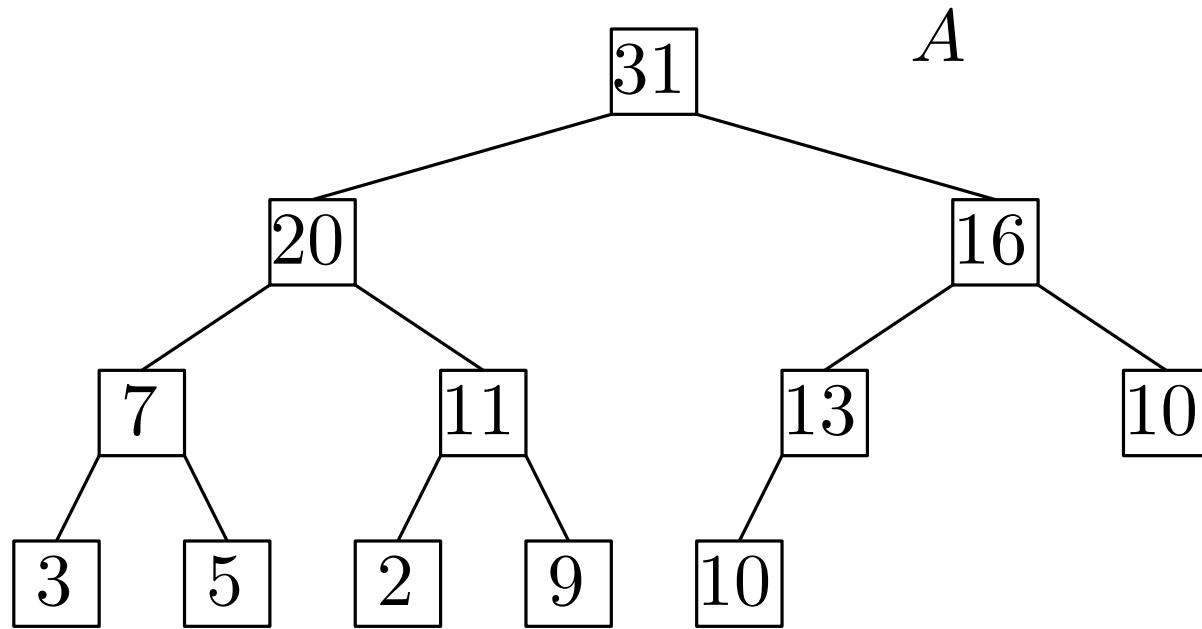
Hver anden gang vi tilføjer en knude er antallet uændret, de andre gange vokser det med én. Derfor:  $\#\text{blade} = \lceil \frac{n}{2} \rceil$ .

$$\begin{aligned}\text{Højde} &= \lfloor \lg n \rfloor \\ \text{Blade} &= \lceil \frac{n}{2} \rceil\end{aligned}$$

# Repræsentation med array

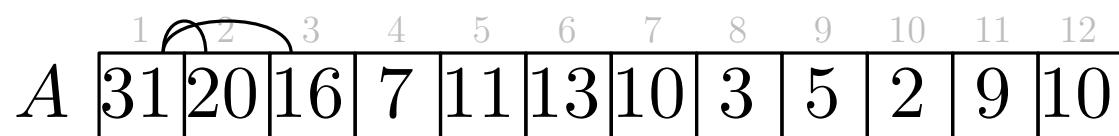
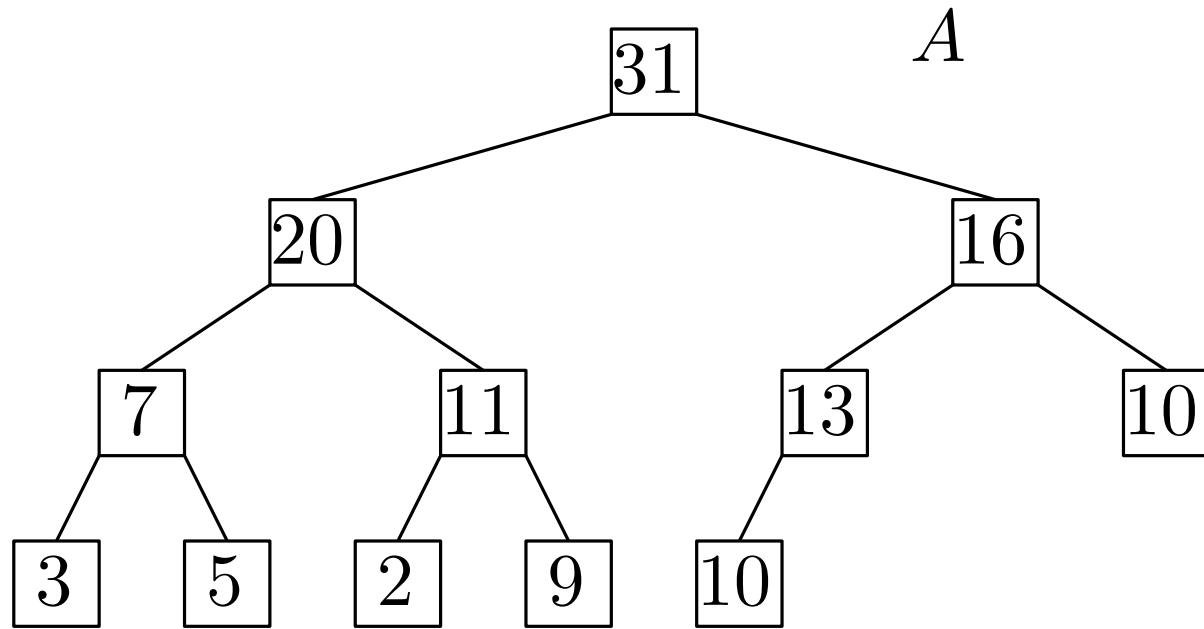


# Repræsentation med array

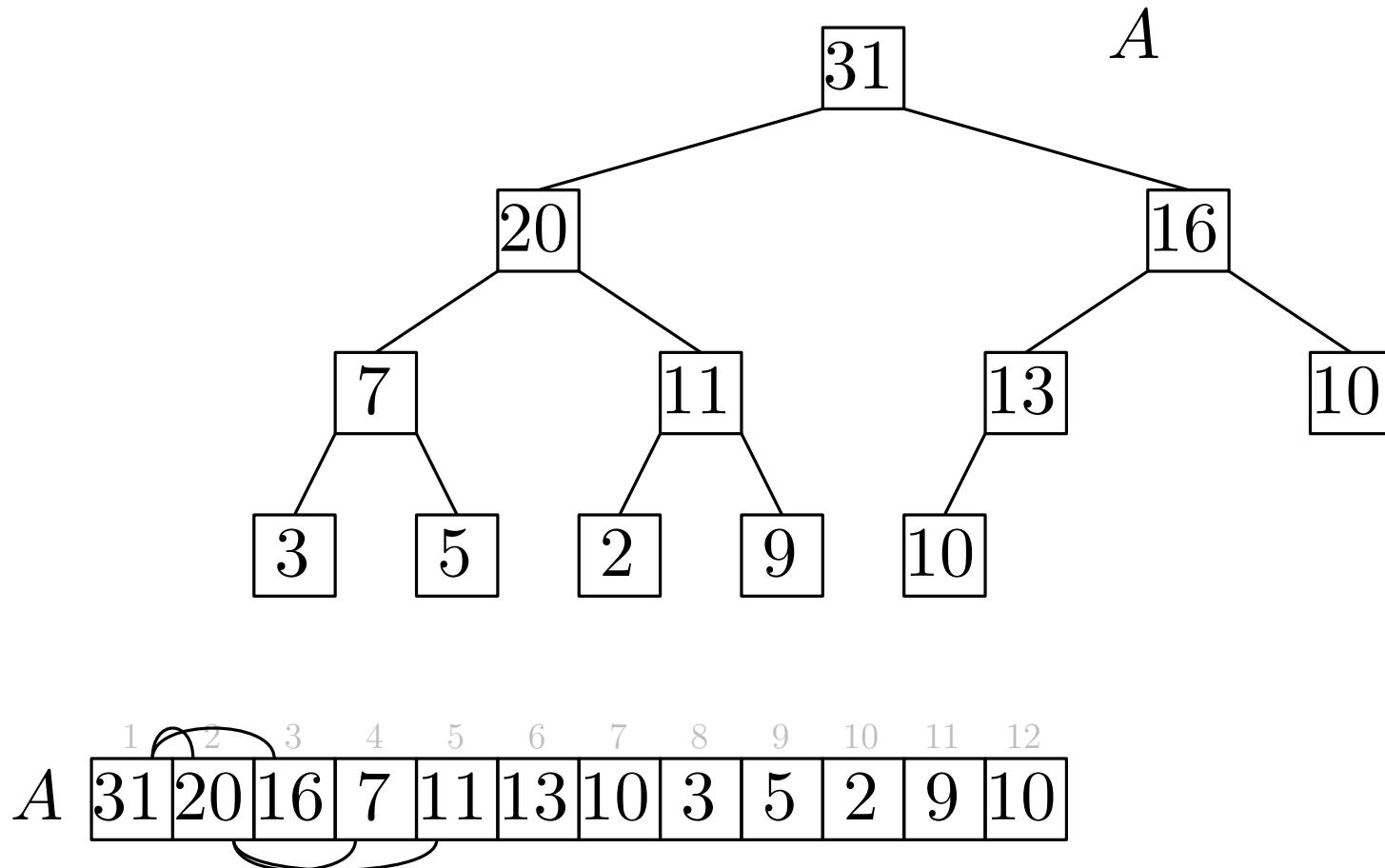


1	2	3	4	5	6	7	8	9	10	11	12	
$A$	31	20	16	7	11	13	10	3	5	2	9	10

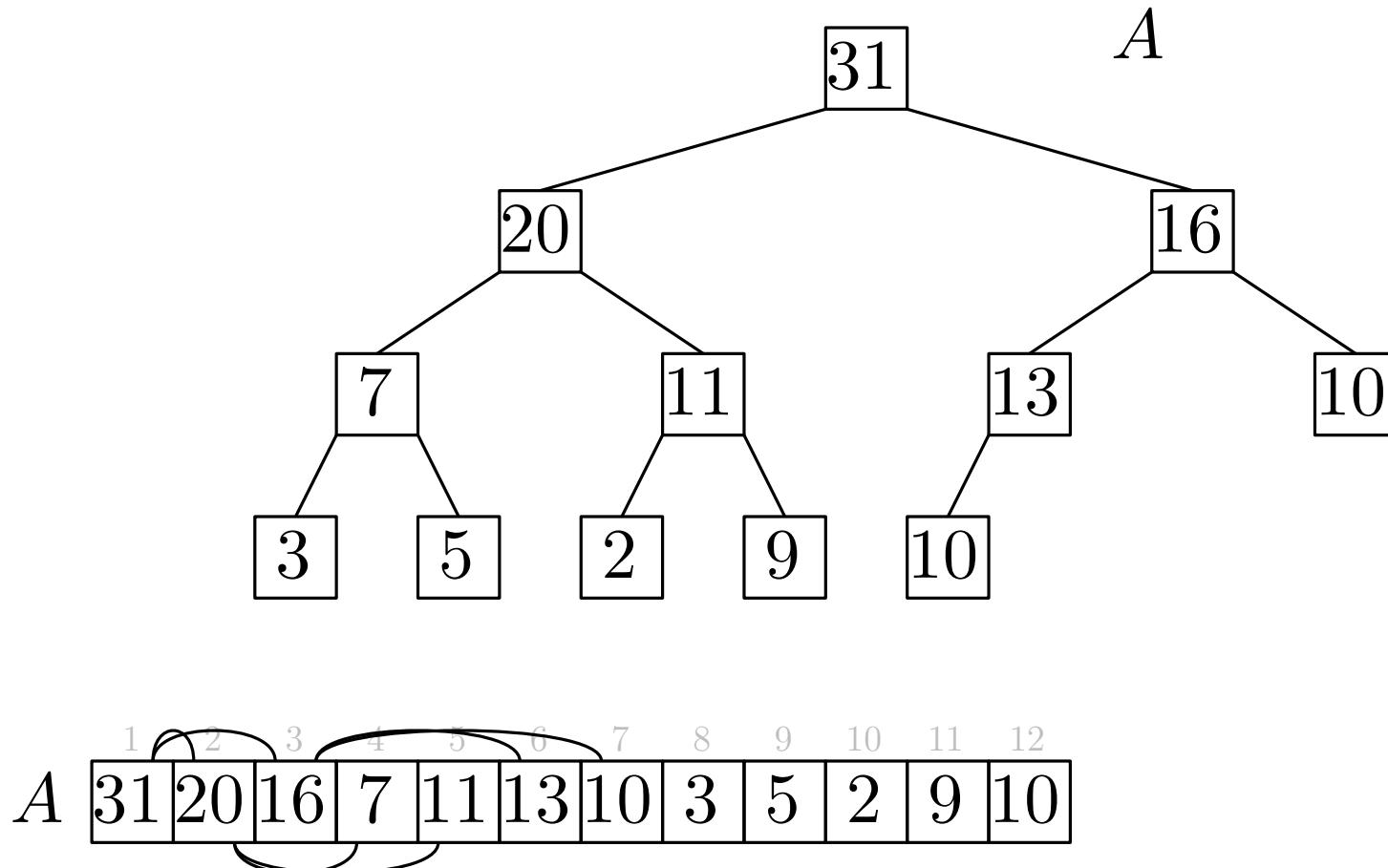
# Repræsentation med array



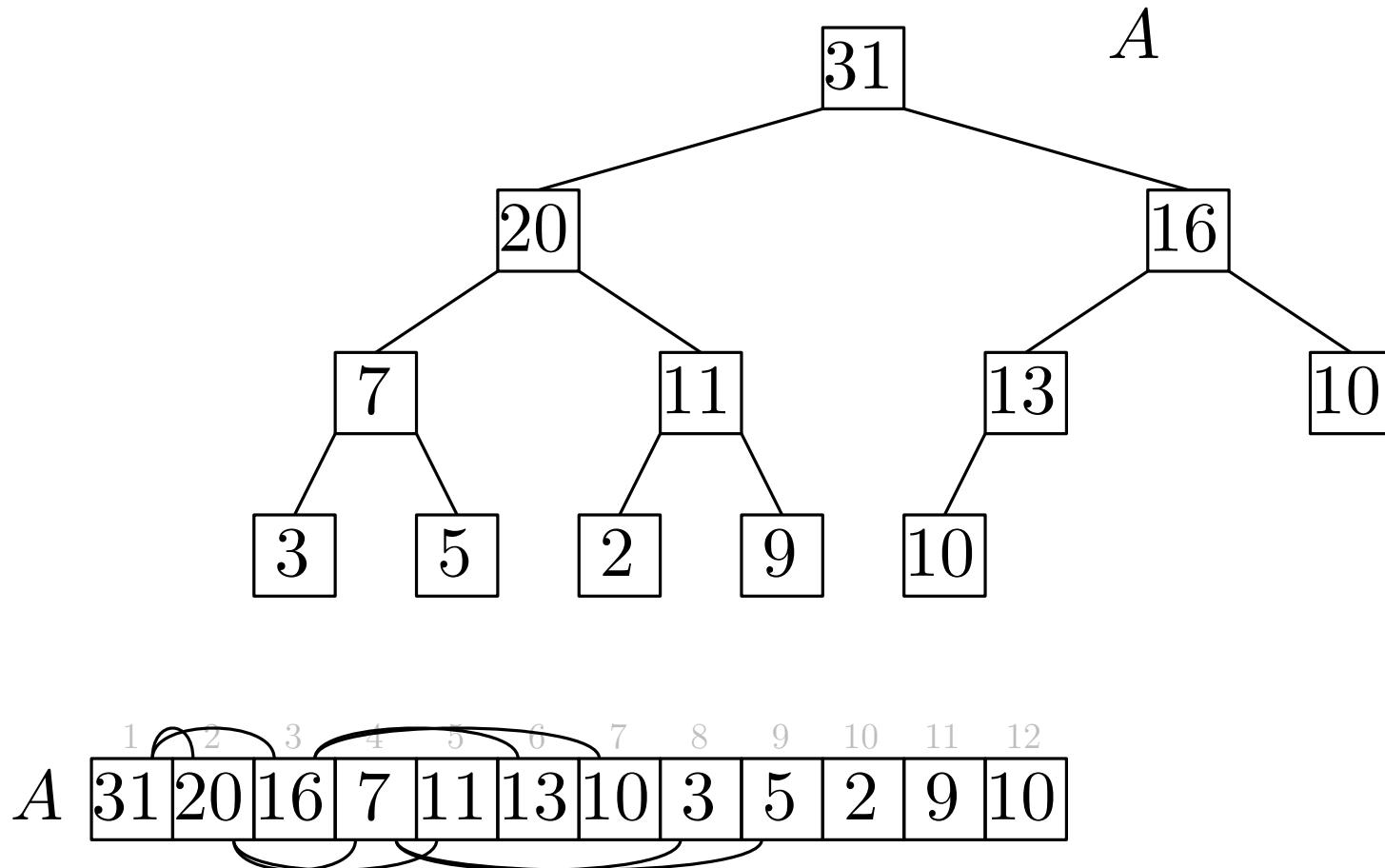
# Repræsentation med array



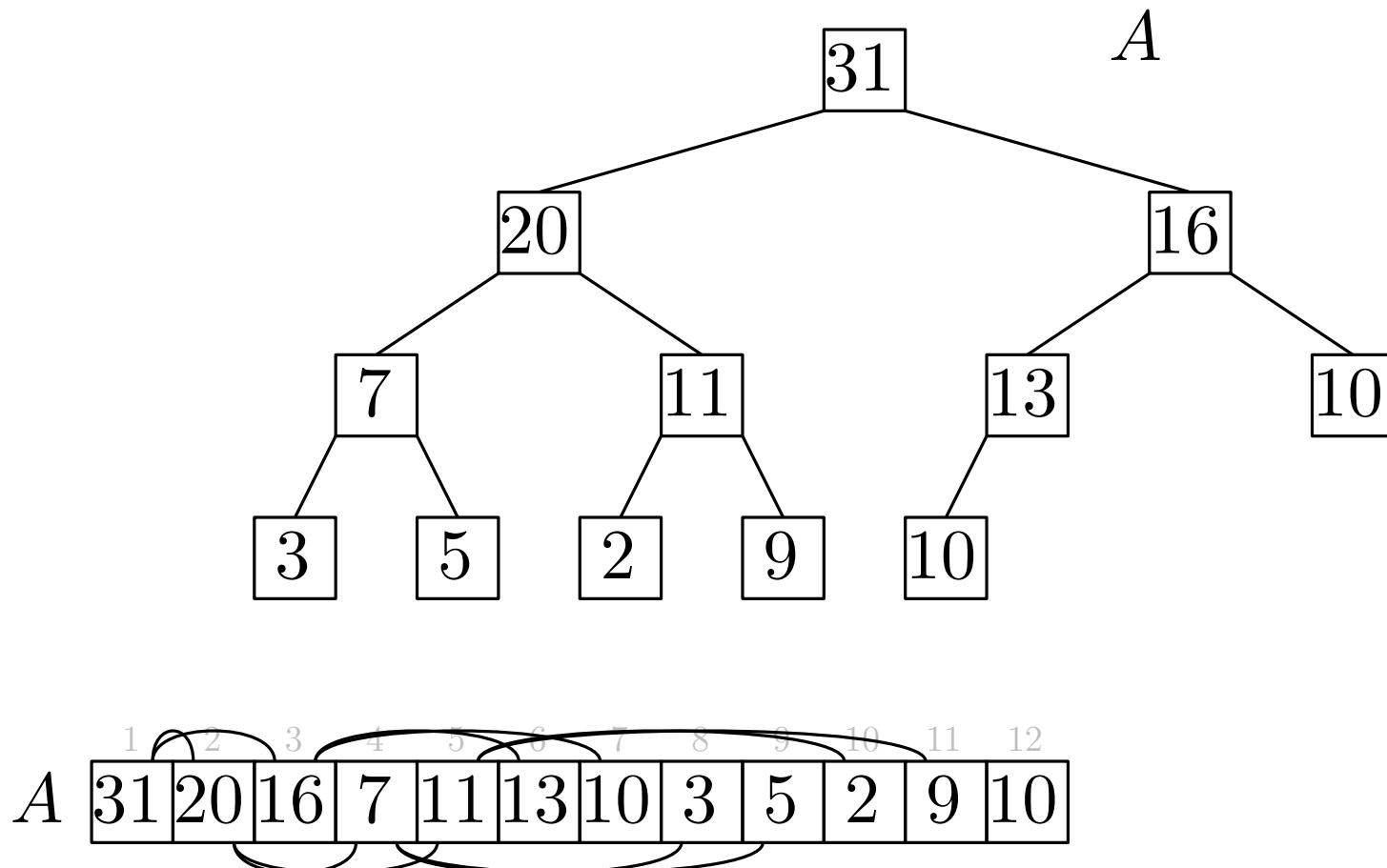
# Repræsentation med array



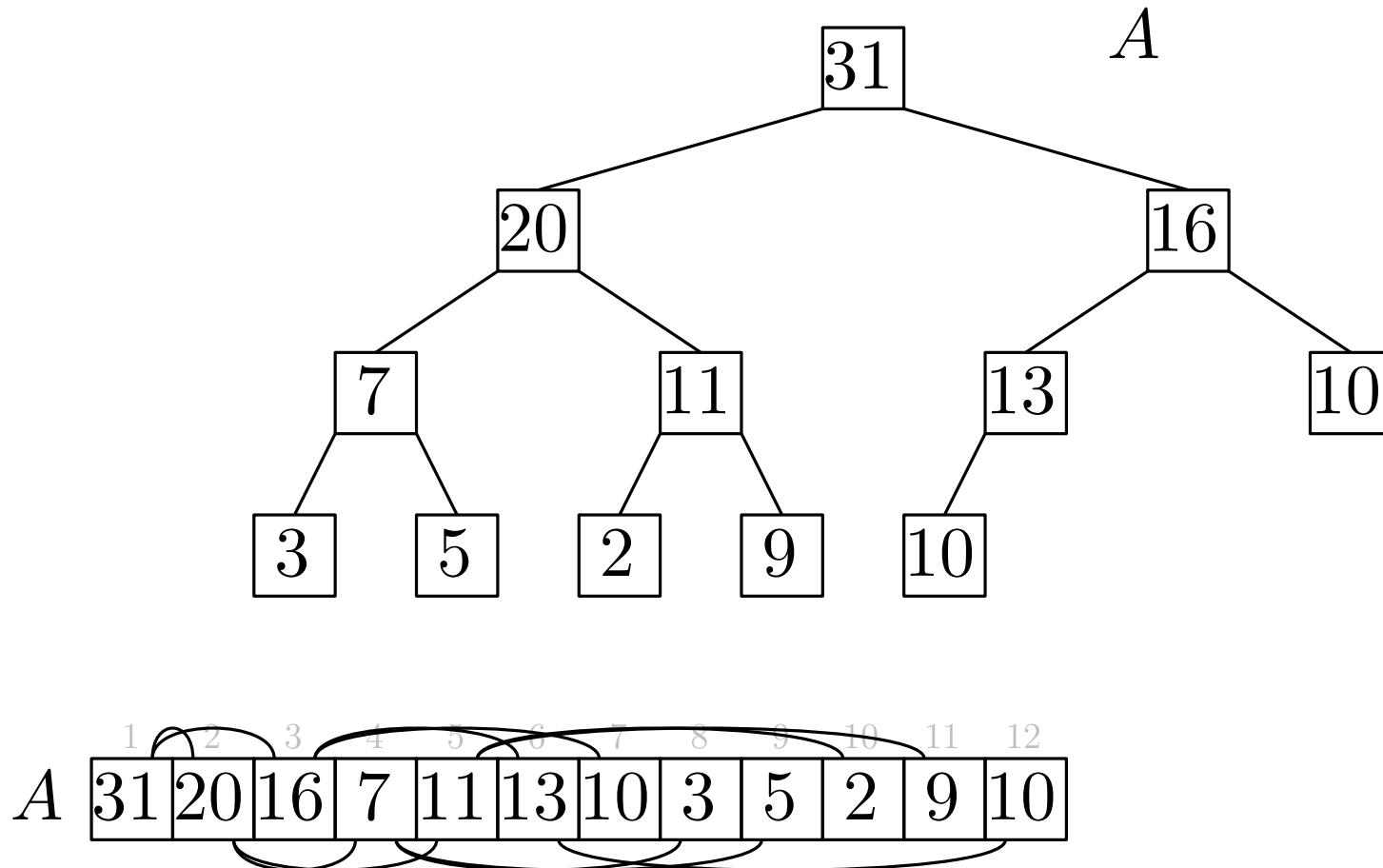
# Repræsentation med array



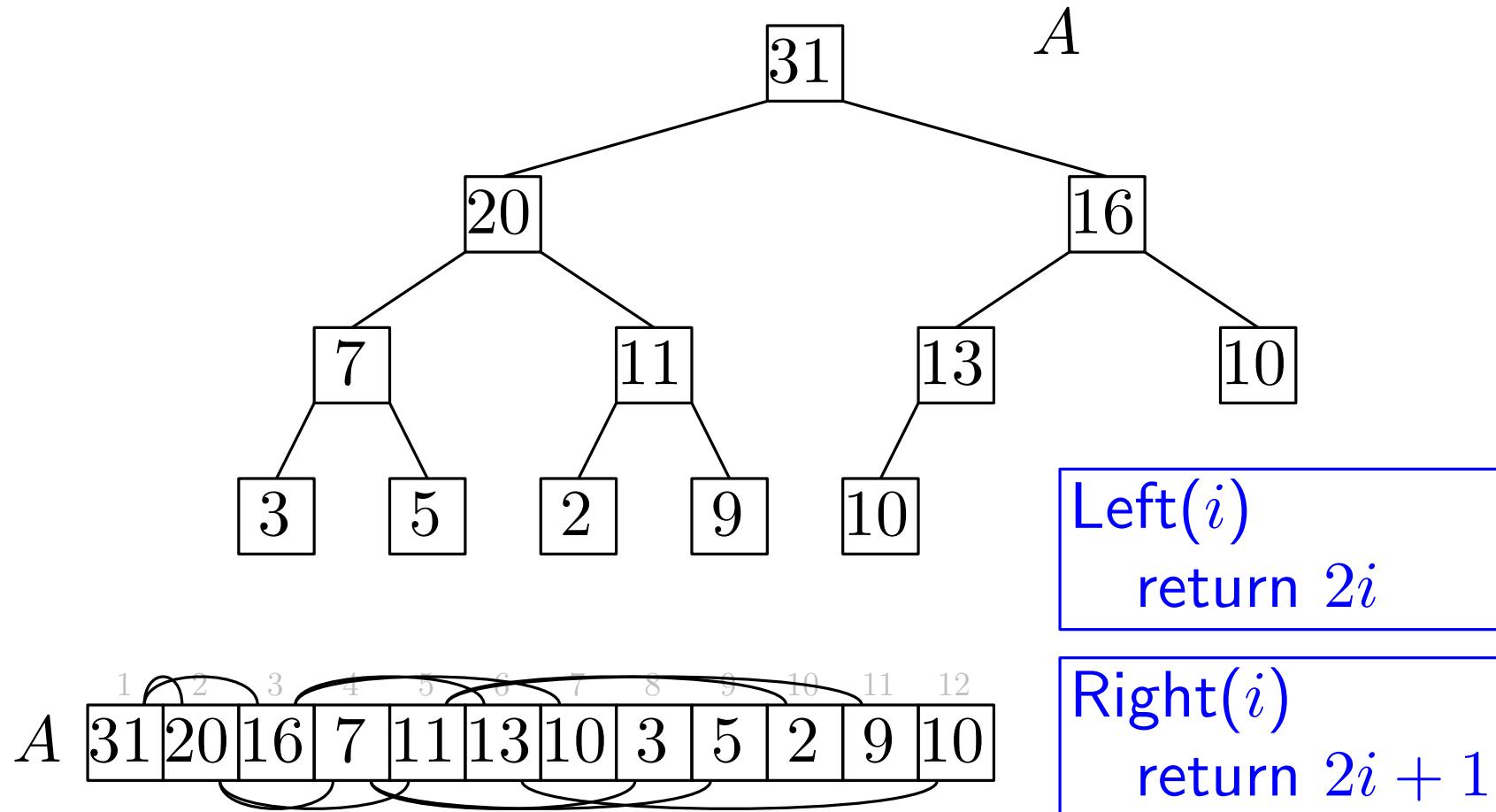
# Repræsentation med array



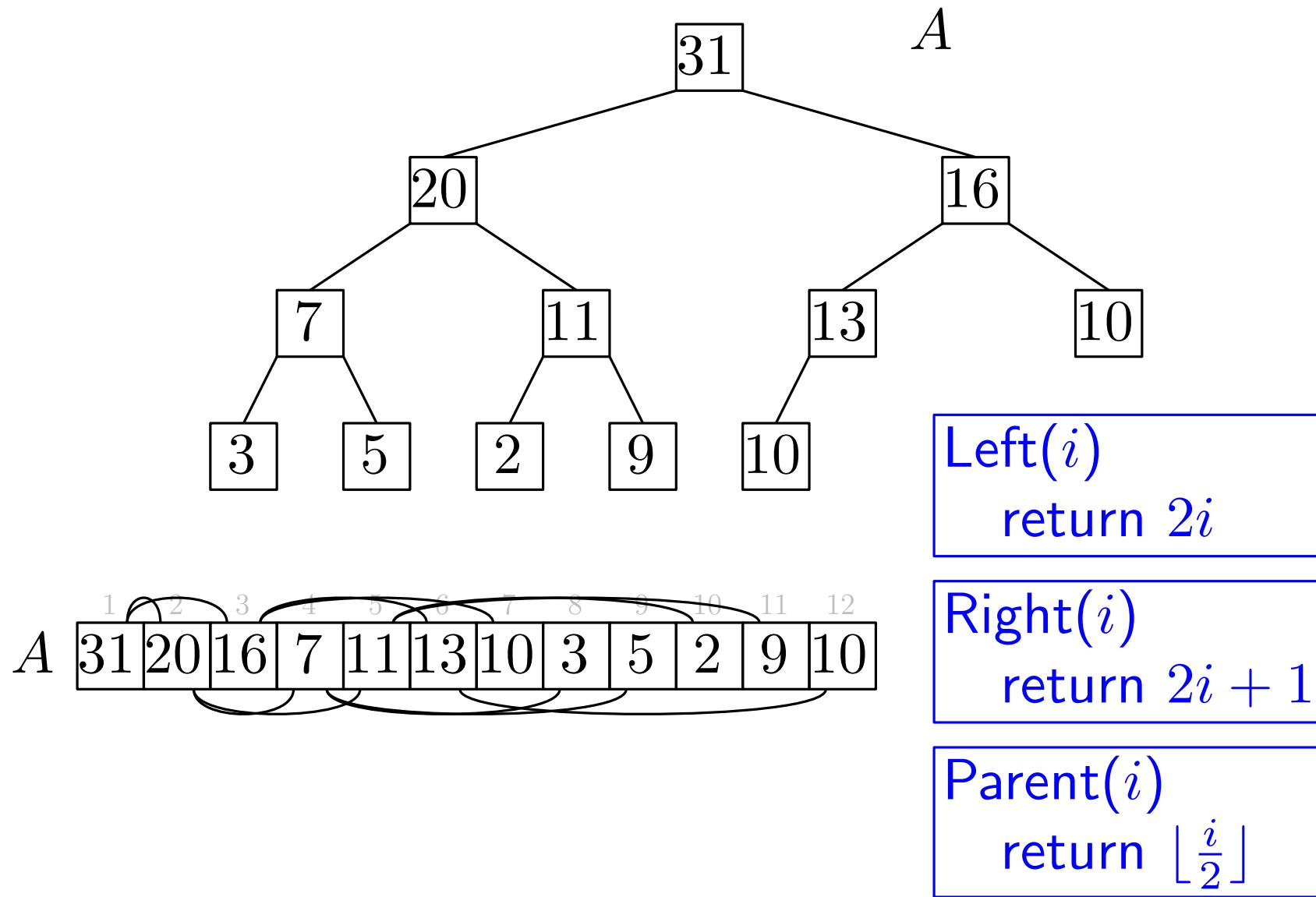
# Repræsentation med array



# Repræsentation med array



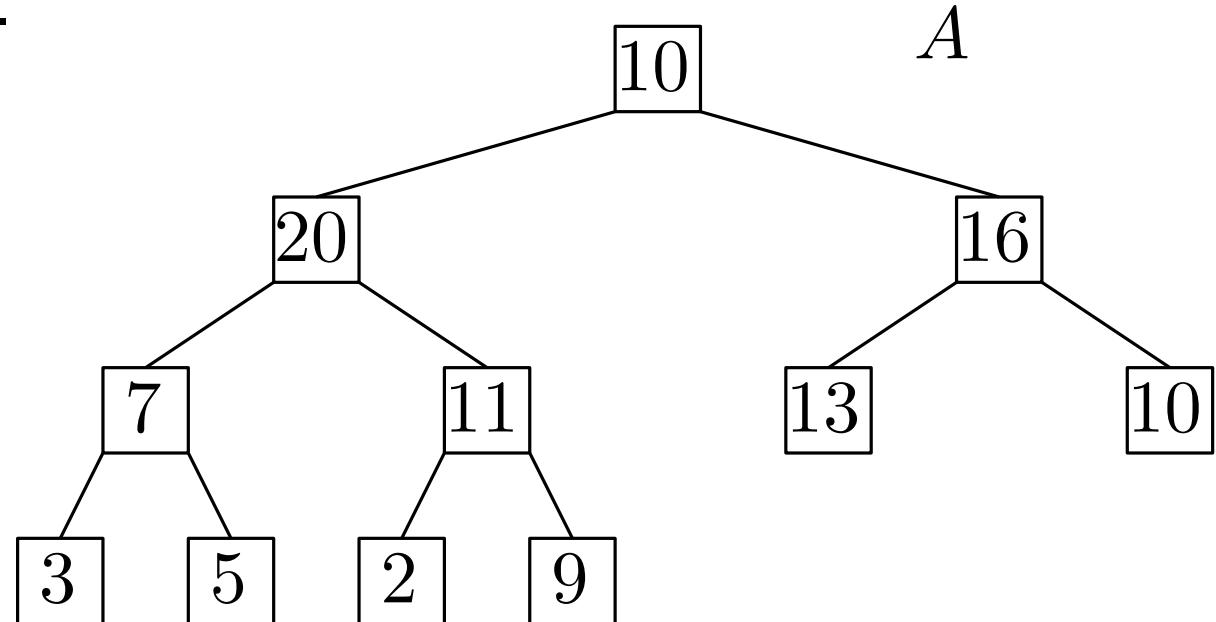
# Repræsentation med array



# Max-Heapify

Vi lader 10 “boble ned”.

Max-Heapify( $A, 1$ )



Max-Heapify( $A, i$ )

$l = \text{Left}(i)$

$r = \text{Right}(i)$

$largest = i$

if  $l \leq A.\text{heap-size}$  and  $A[l] > A[largest]$

$largest = l$

if  $r \leq A.\text{heap-size}$  and  $A[r] > A[largest]$

$largest = r$

if  $largest \neq i$

swap  $A[i]$  and  $A[largest]$

Max-Heapify( $A, largest$ )

Left( $i$ )

return  $2i$

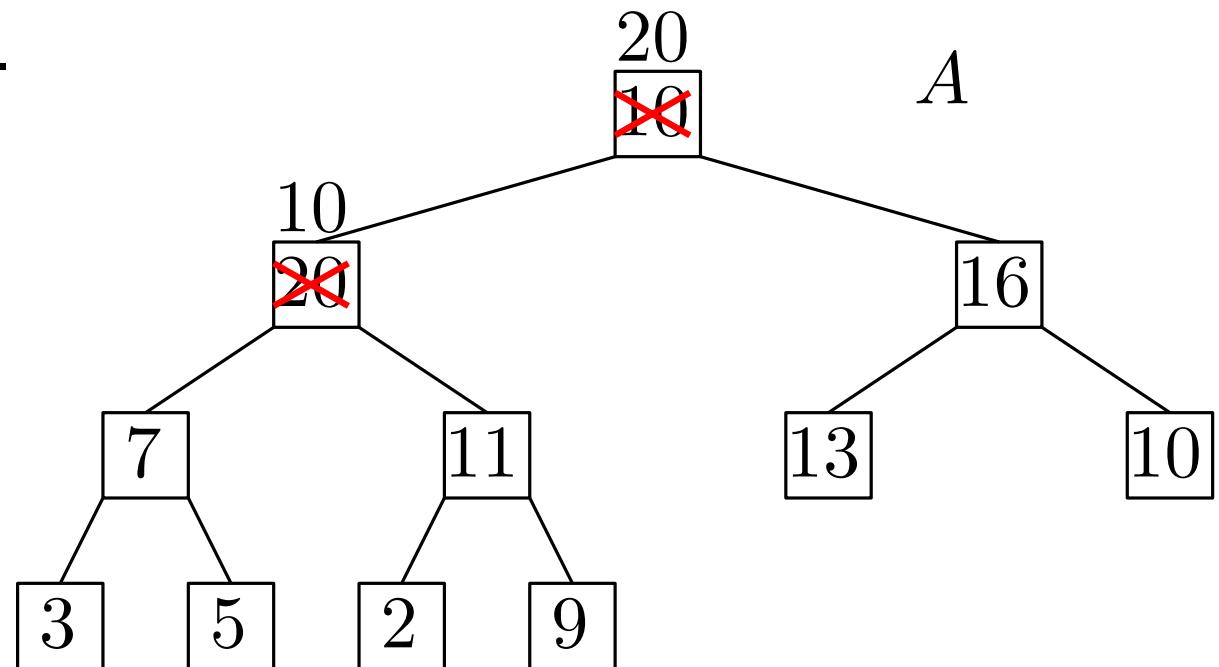
Right( $i$ )

return  $2i + 1$

# Max-Heapify

Vi lader 10 "boble ned".

Max-Heapify( $A, 1$ )



Max-Heapify( $A, i$ )

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if  $largest \neq i$

swap  $A[i]$  and  $A[largest]$

Max-Heapify( $A, largest$ )

Left( $i$ )

return  $2i$

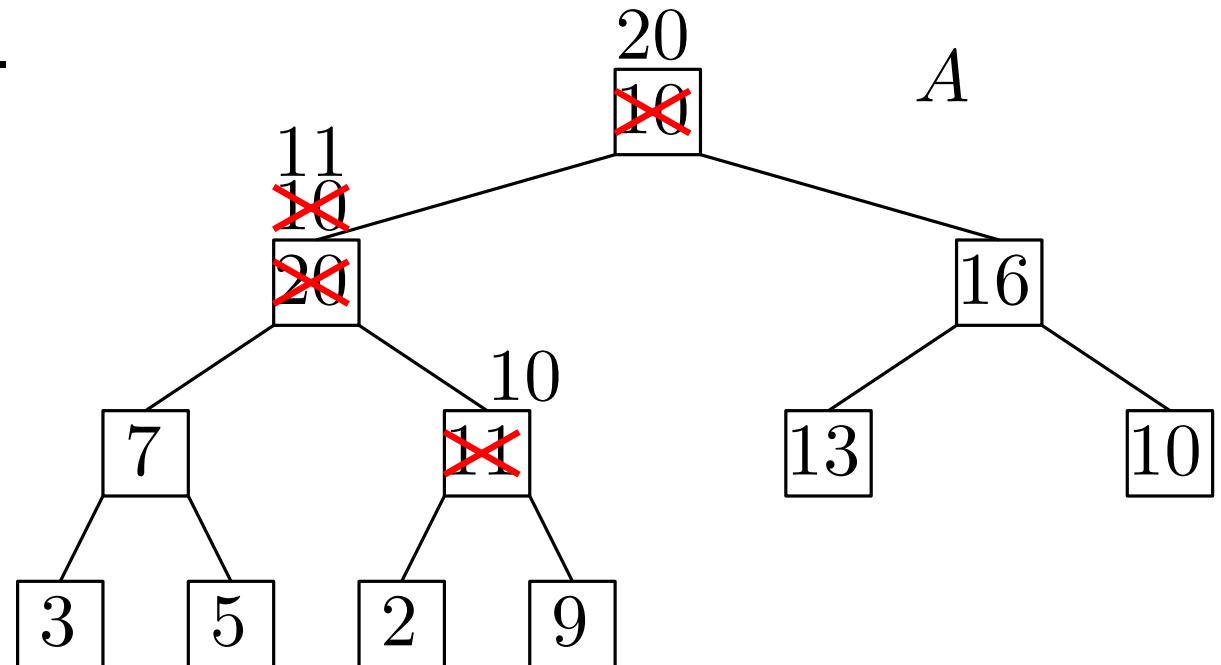
Right( $i$ )

return  $2i + 1$

# Max-Heapify

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Max-Heapify( $A, 1$ )



Max-Heapify( $A, i$ )

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$largest = r$

if  $largest \neq i$

swap  $A[i]$  and  $A[largest]$

Max-Heapify( $A, largest$ )

Left( $i$ )

return  $2i$

Right( $i$ )

return  $2i + 1$

# Insert

Insert( $A, k$ )

$A.heap\text{-}size = A.heap\text{-}size + 1$

$i = A.heap\text{-}size$

$A[i] = k$

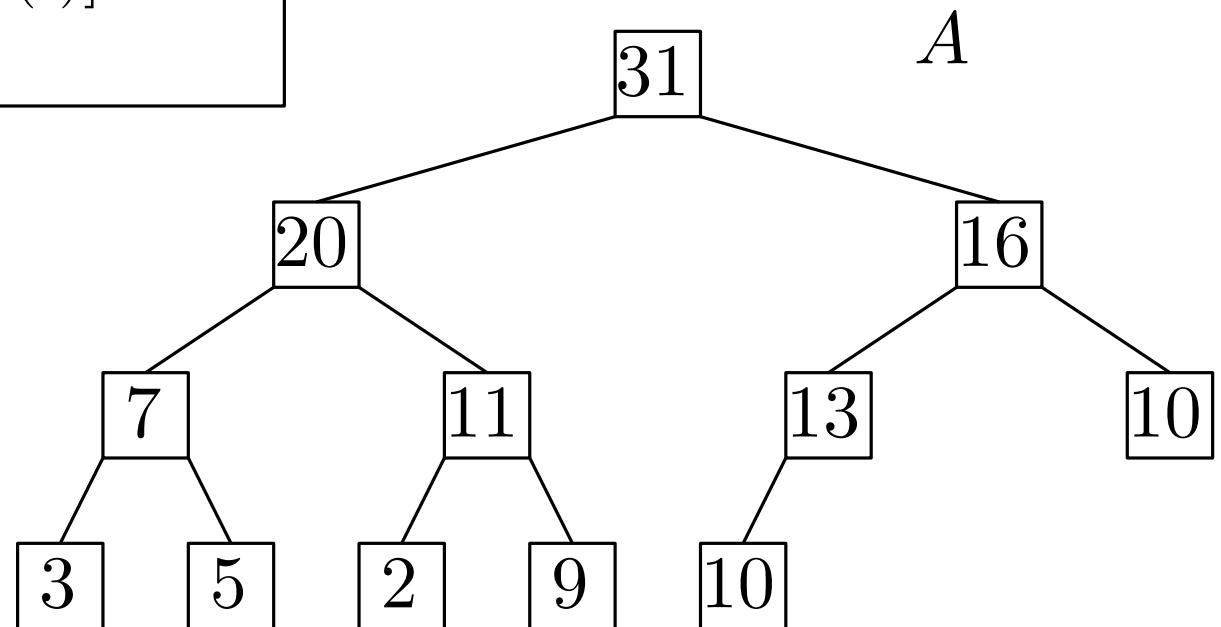
while  $i > 1$  and  $A[\text{Parent}(i)] < A[i]$

    swap  $A[i]$  and  $A[\text{Parent}(i)]$

$i = \text{Parent}(i)$

Parent( $i$ )

return  $\lfloor \frac{i}{2} \rfloor$



# Insert

Insert( $A, k$ )

$A.heap\text{-}size = A.heap\text{-}size + 1$

$i = A.heap\text{-}size$

$A[i] = k$

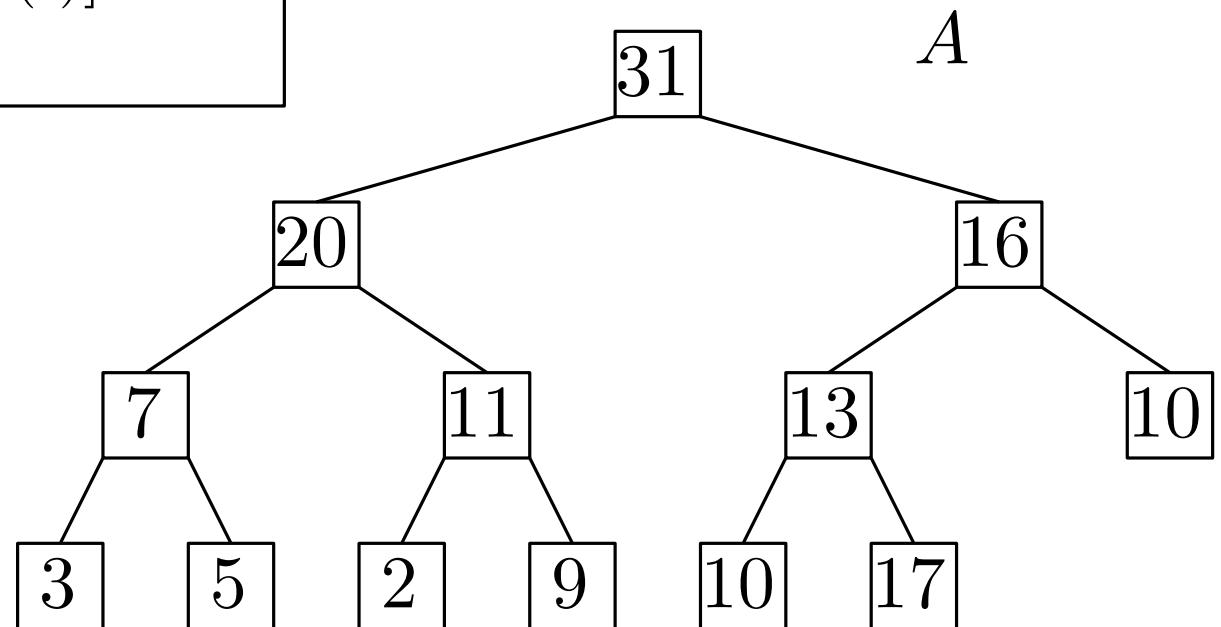
while  $i > 1$  and  $A[Parent(i)] < A[i]$

    swap  $A[i]$  and  $A[Parent(i)]$

$i = Parent(i)$

Parent( $i$ )

return  $\lfloor \frac{i}{2} \rfloor$



# Insert

Insert( $A, k$ )

$A.heap\text{-}size = A.heap\text{-}size + 1$

$i = A.heap\text{-}size$

$A[i] = k$

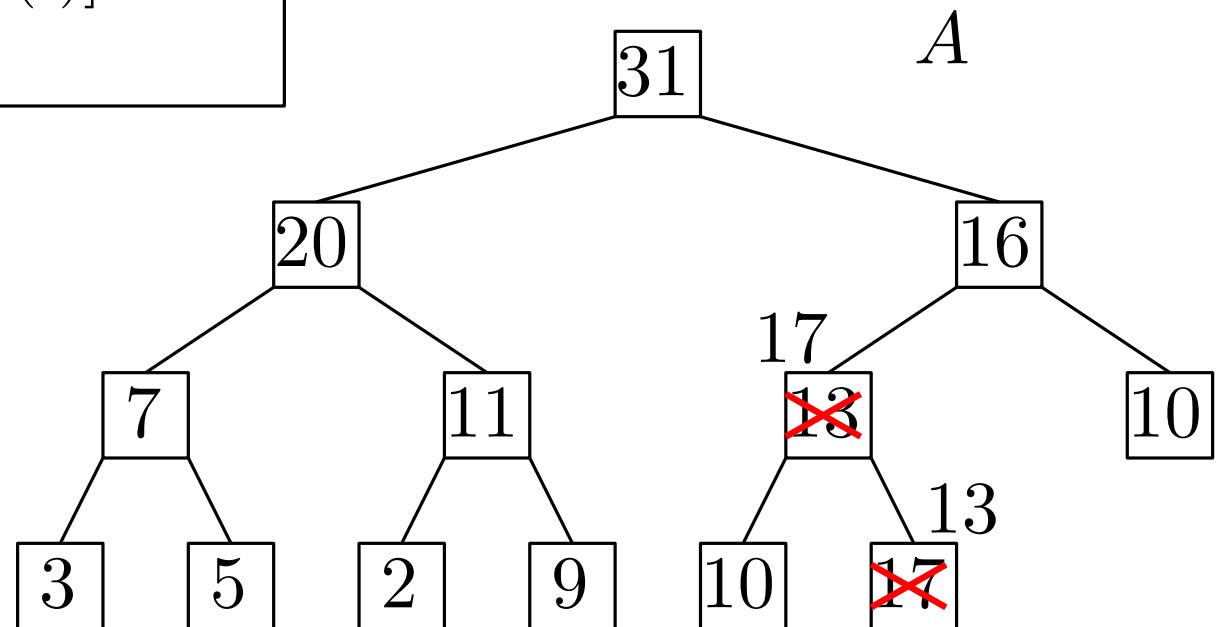
while  $i > 1$  and  $A[Parent(i)] < A[i]$

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return  $\lfloor \frac{i}{2} \rfloor$



# Insert

Insert( $A, k$ )

$A.heap\text{-}size = A.heap\text{-}size + 1$

$i = A.heap\text{-}size$

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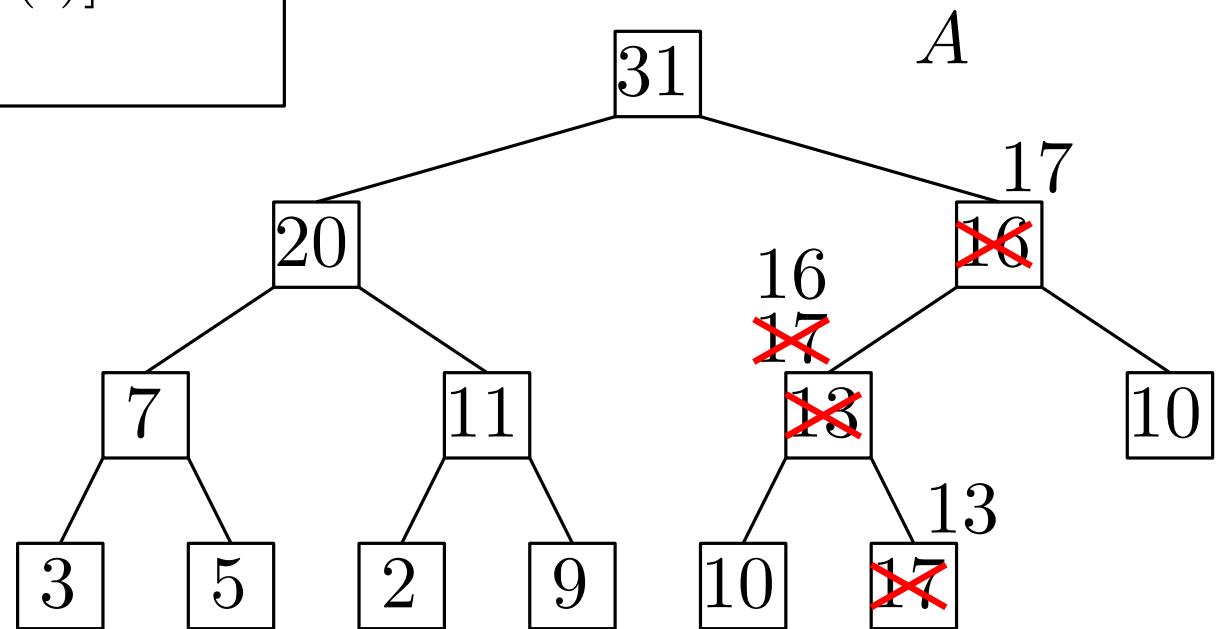
while  $i > 1$  and  $A[\text{Parent}(i)] < A[i]$

    swap  $A[i]$  and  $A[\text{Parent}(i)]$

$i = \text{Parent}(i)$

Parent( $i$ )

return  $\lfloor \frac{i}{2} \rfloor$



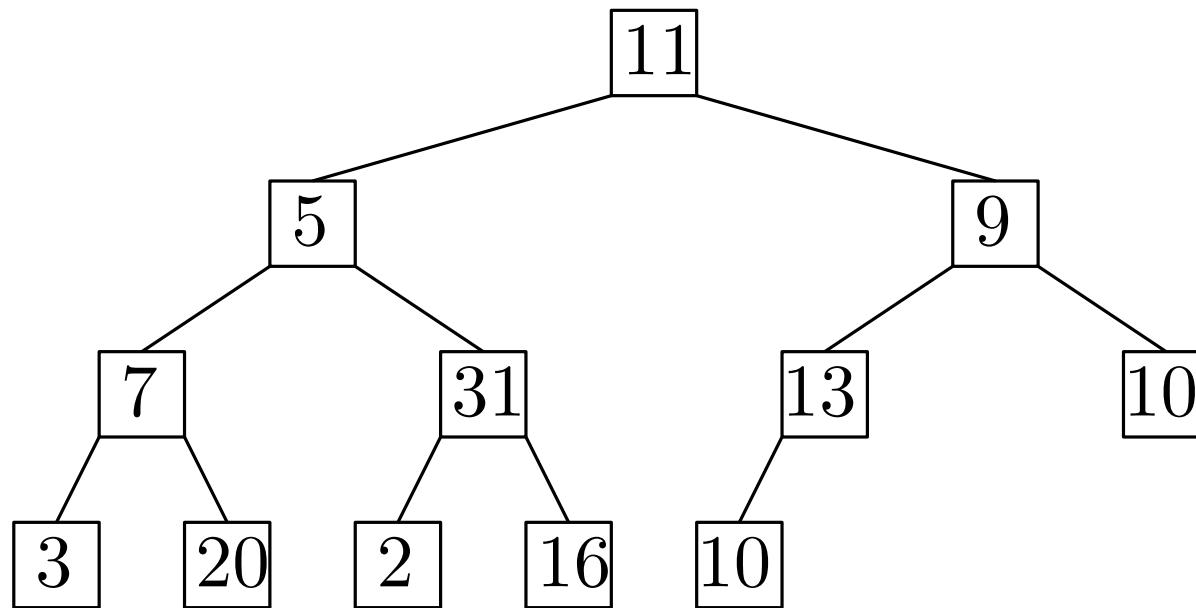
# Konstruktion af høb

Build-Max-Heap( $A$ )

$A.heap-size = A.length$

for  $i = \lfloor \frac{A.length}{2} \rfloor$  downto 1

Max-Heapify( $A, i$ ) // Lad  $A[i]$  boble ned



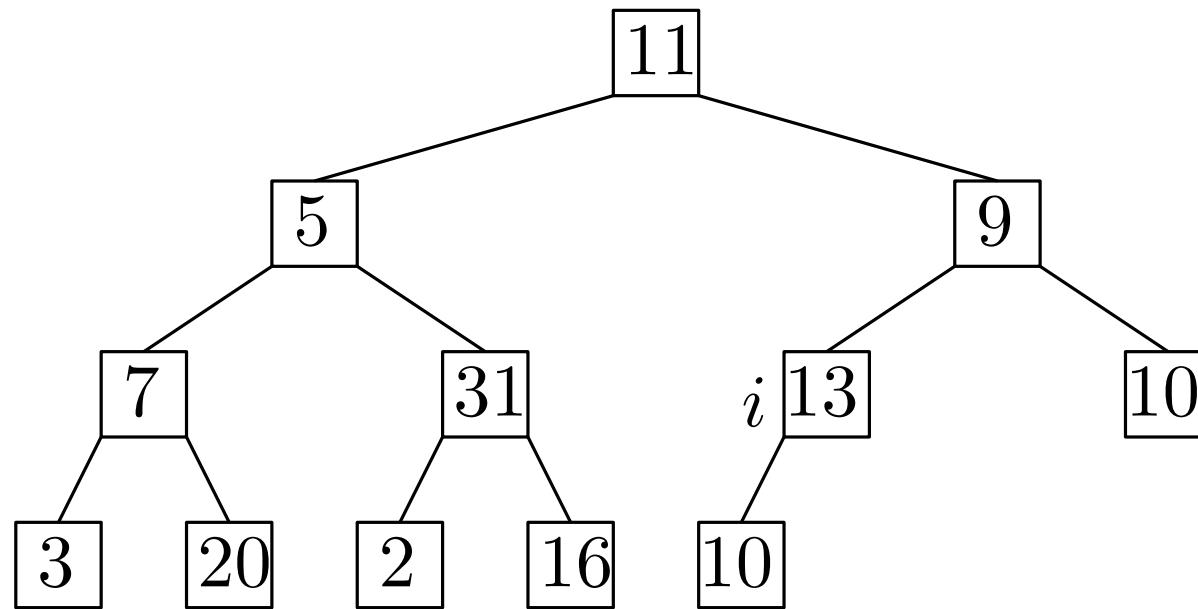
11	5	9	7	31	13	10	3	20	2	16	10
----	---	---	---	----	----	----	---	----	---	----	----

# Konstruktion af høb

Build-Max-Heap( $A$ )

$$A.heap\_size = A.length \quad = A.length - \lceil \frac{A.length}{2} \rceil$$

for  $i = \lfloor \frac{A.length}{2} \rfloor$  downto 1  
    Max-Heapify( $A, i$ ) // Lad  $A[i]$  boble ned



11	5	9	7	31	13	10	3	20	2	16	10
----	---	---	---	----	----	----	---	----	---	----	----

$i$

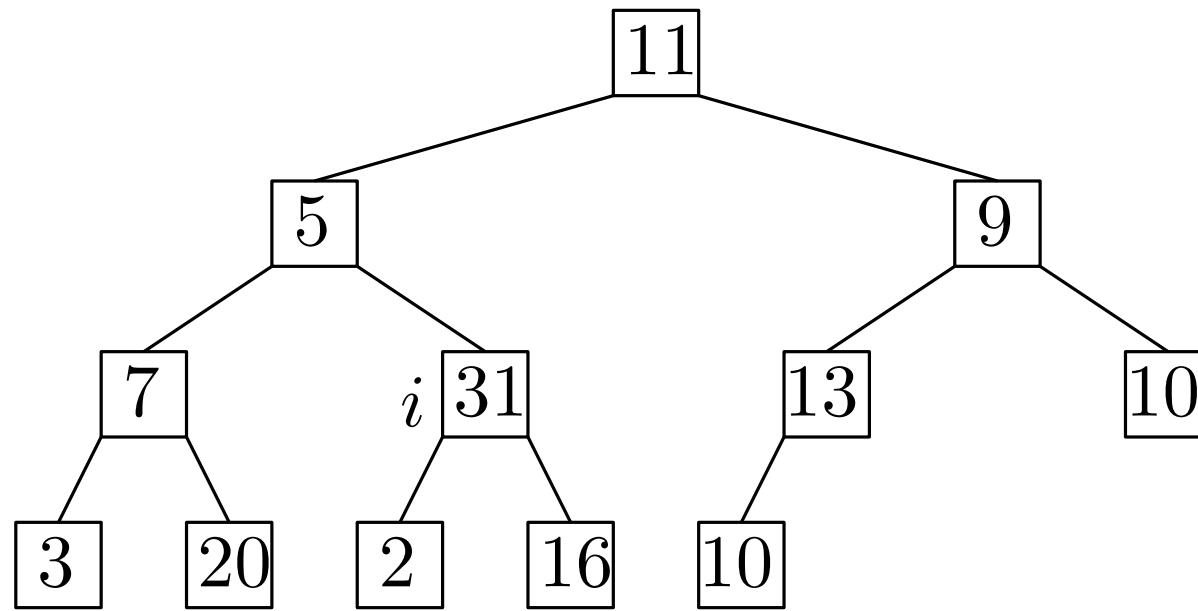
## Konstruktion af hob

## Build-Max-Heap( $A$ )

$$A.heap\_size = A.length - \lceil \frac{A.length}{2} \rceil$$

for  $i = \left\lfloor \frac{A.length}{2} \right\rfloor$  downto 1 Sidste knude med et barn

Max-Heapify( $A, i$ ) // Lad  $A[i]$  buble ned



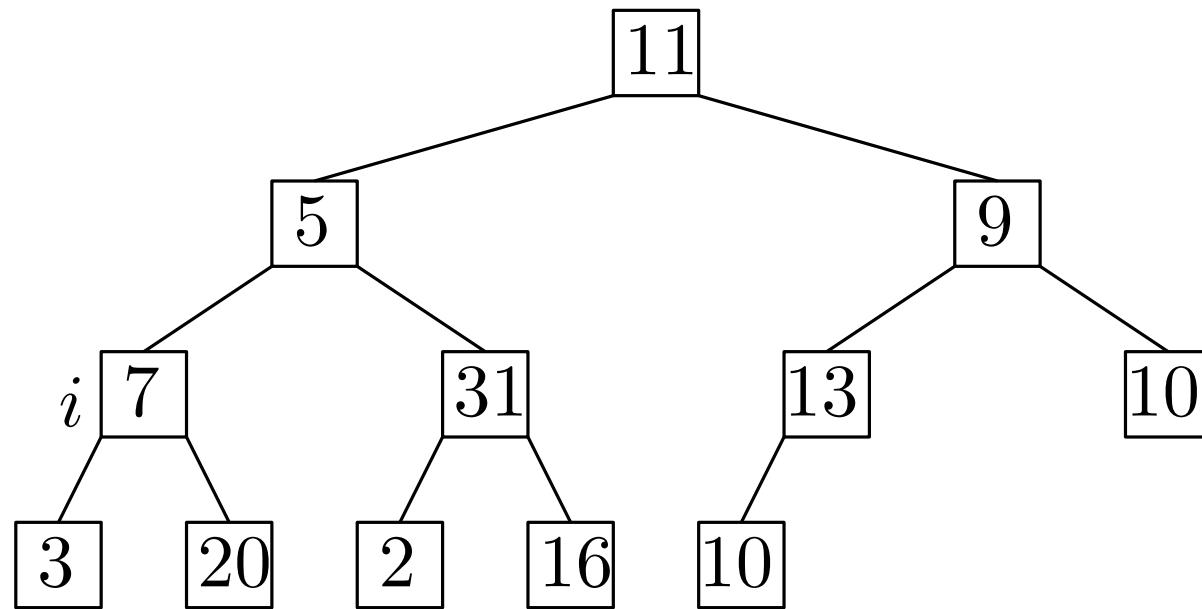
## Konstruktion af hob

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$$A.heap\_size = A.length - \lceil \frac{A.length}{2} \rceil$$

for  $i = \lfloor \frac{A.length}{2} \rfloor$  downto 1 Sidste knude med et barn

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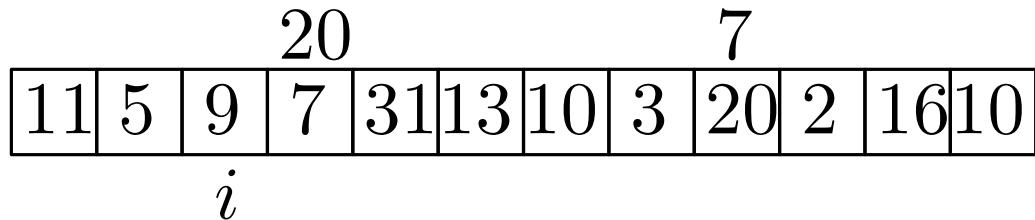
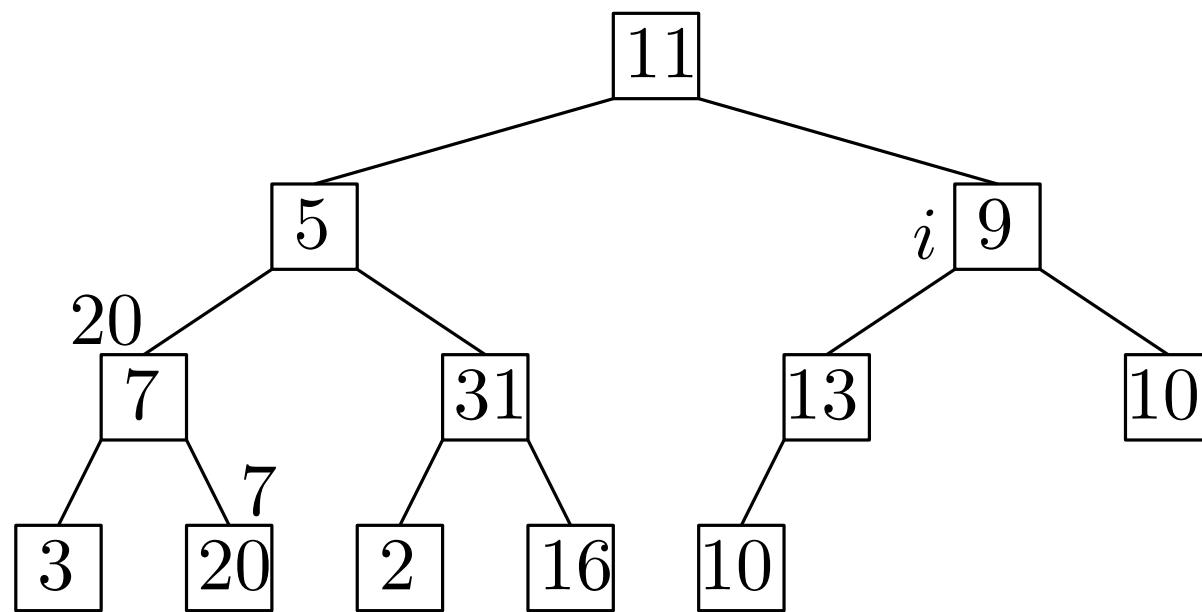
## Konstruktion af hob

## Build-Max-Heap( $A$ )

$$A.heap\_size = A.length - \lceil \frac{A.length}{2} \rceil$$

for  $i = \left\lfloor \frac{A.length}{2} \right\rfloor$  downto 1 Sidste knude med et barn

Max-Heapify( $A, i$ ) // Lad  $A[i]$  buble ned



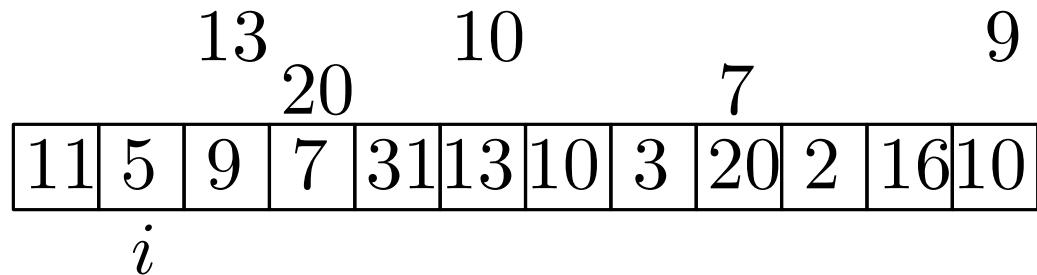
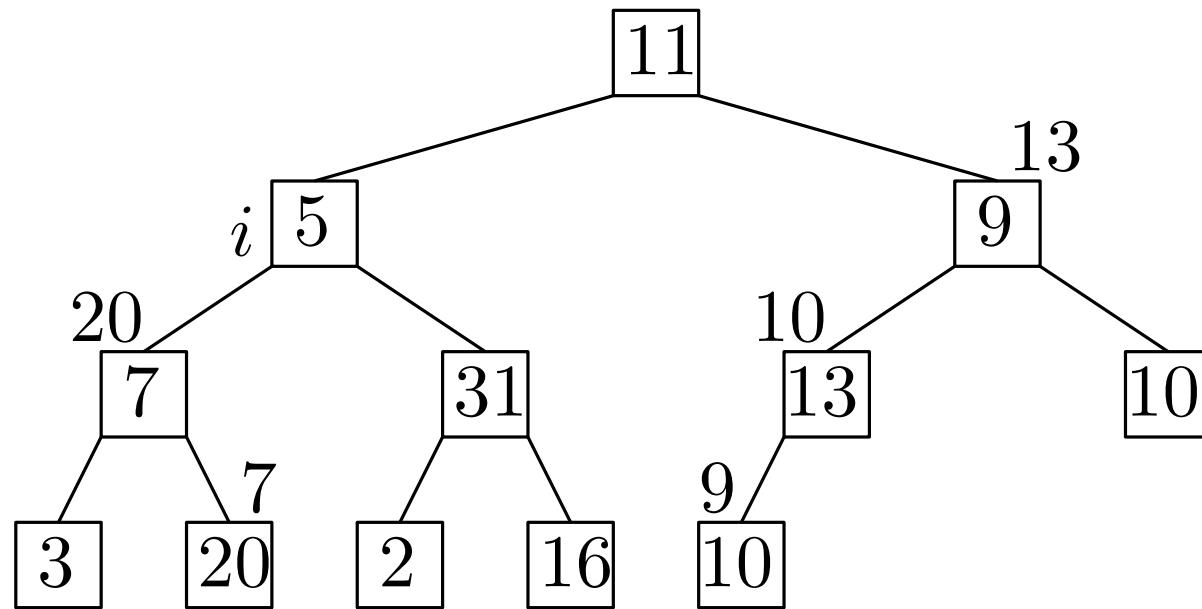
# Konstruktion af høj

Build-Max-Heap( $A$ )

$$A.\text{heap-size} = A.\text{length} = A.\text{length} - \lceil \frac{A.\text{length}}{2} \rceil$$

for  $i = \lfloor \frac{A.\text{length}}{2} \rfloor$  downto 1  
Sidste knude med et barn

Max-Heapify( $A, i$ ) // Lad  $A[i]$  boble ned



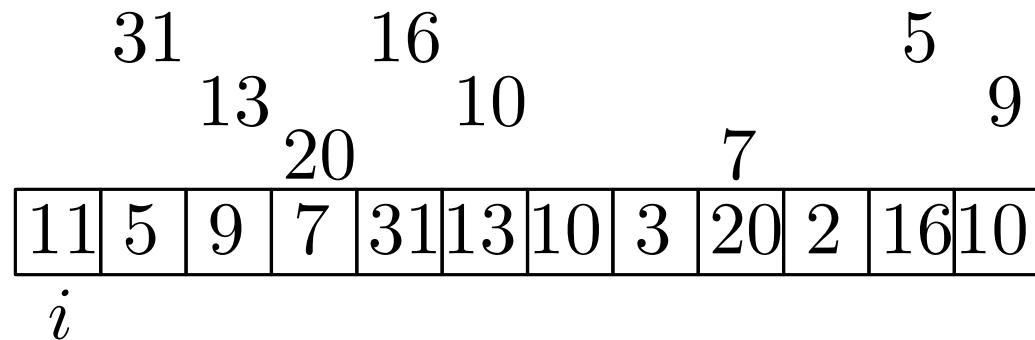
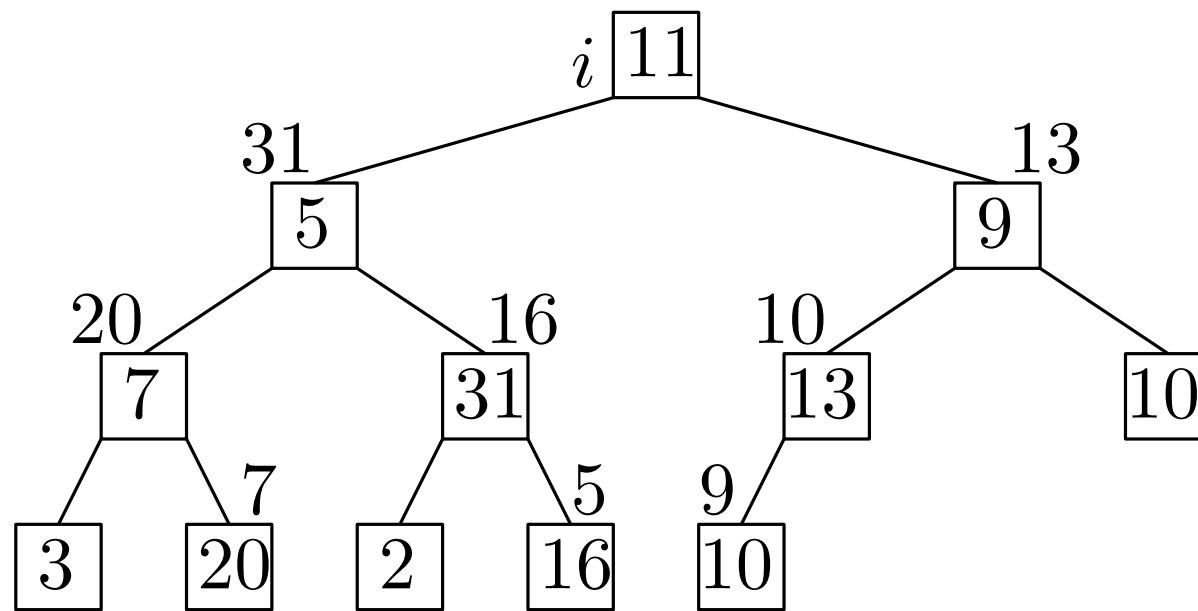
# Konstruktion af høj

Build-Max-Heap( $A$ )

$$A.\text{heap-size} = A.\text{length} = A.\text{length} - \lceil \frac{A.\text{length}}{2} \rceil$$

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Sidste knude med et barn

Max-Heapify( $A, i$ ) // Lad  $A[i]$  boble ned

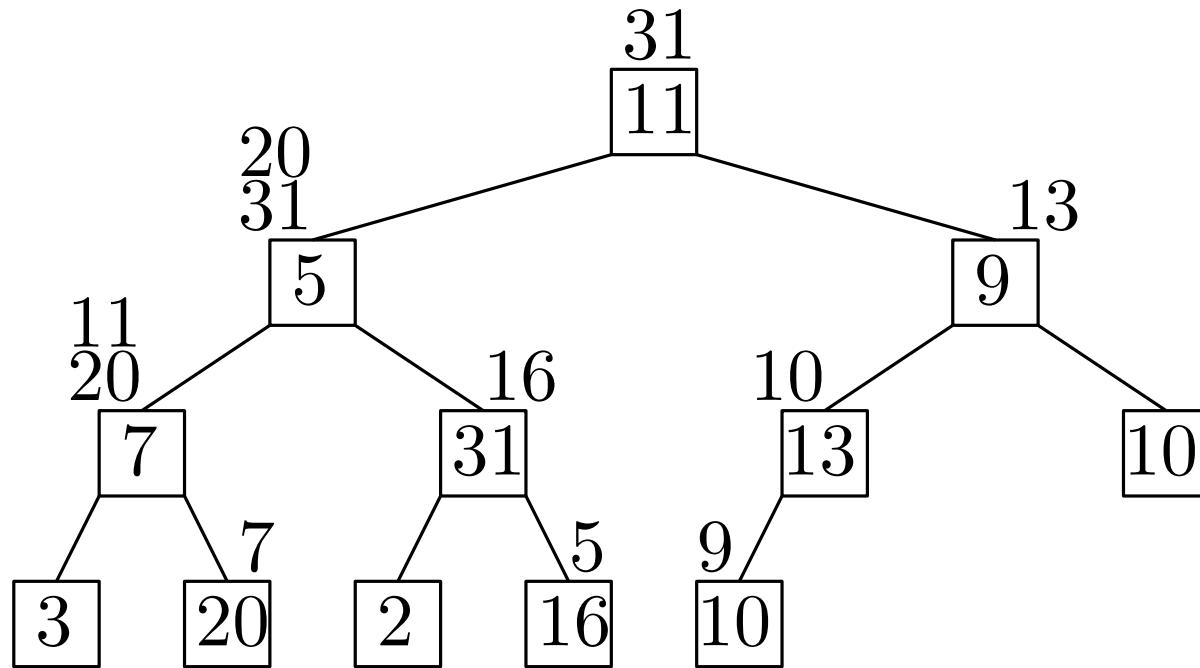


# Konstruktion af høj

Build-Max-Heap( $A$ )

$$A.\text{heap-size} = A.\text{length} = A.\text{length} - \lceil \frac{A.\text{length}}{2} \rceil$$

for  $i = \lfloor \frac{A.\text{length}}{2} \rfloor$  downto 1  
    Max-Heapify( $A, i$ ) // Lad  $A[i]$  boble ned



31	20	11	16	5	9
31	13	10	20	7	
20	20	13	31	16	
11	5	9	7	31	13
				10	10

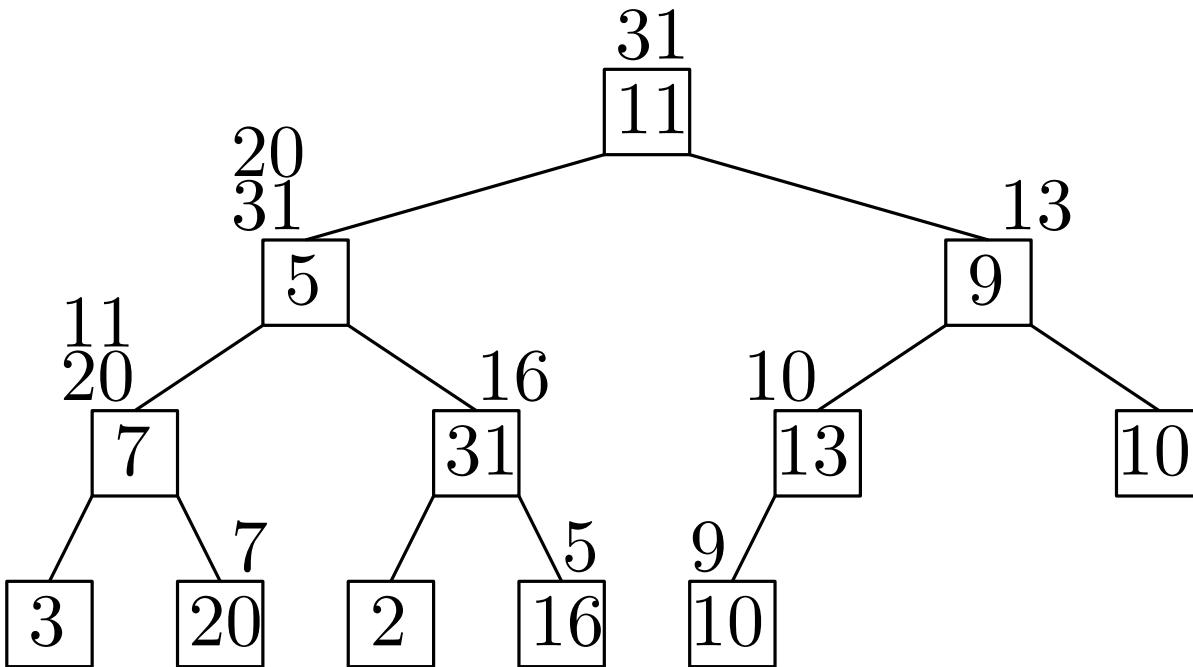
$i$

# Konstruktion af høb

Build-Max-Heap( $A$ )

$A.heap\_size = A.length$   
for  $i = \lfloor \frac{A.length}{2} \rfloor$  downto 1  
    Max-Heapify( $A, i$ ) // Lad  $A[i]$  boble ned

$= A.length - \lceil \frac{A.length}{2} \rceil$   
Sidste knude med et barn



31	20	11	16	5	9
31	13	16	10		
13	20	10	7		
20	31	13	10	3	20
11	5	9	7	2	16
				10	

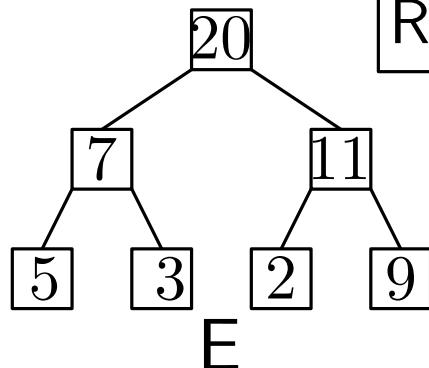
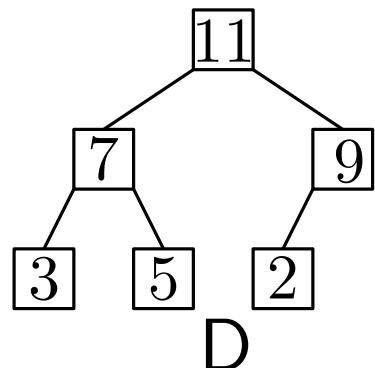
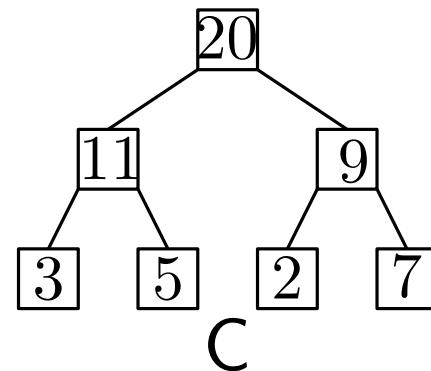
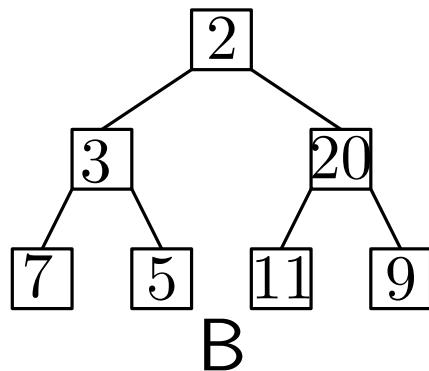
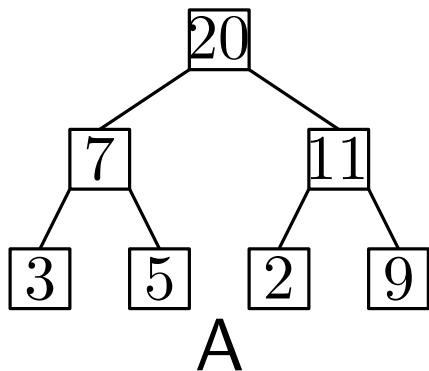
Køretid: Max-Heapify tager  $O(\log n)$  tid. I alt  $O(n \log n)$ .  
Bedre analyse:  $\Theta(n)$ .

# Hvordan ser hoben ud til sidst?

Build-Max-Heap( $A$ )

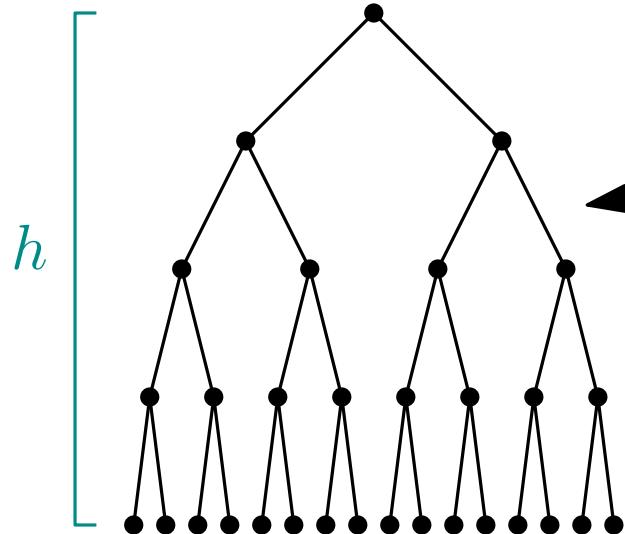
$A :$ 

2	3	20	7	5	11	9
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socrative.com → Student login,  
Room name: ABRAHAMSEN3464

# Bedre analyse af Build-Max-Heap

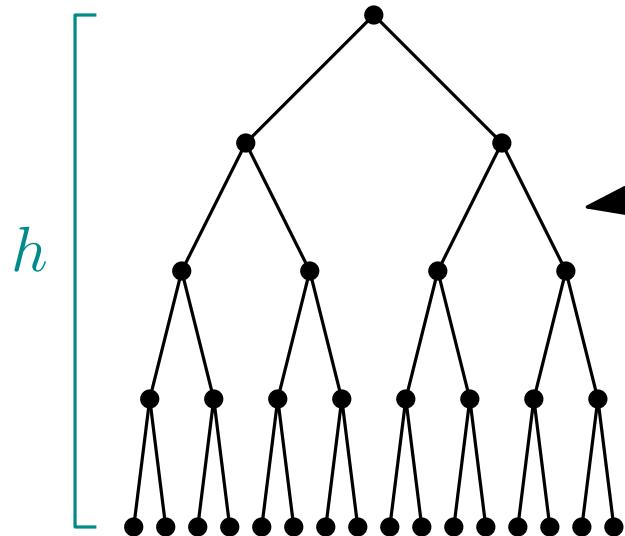


$$n = 2^{h+1} - 1$$

Her:  $h = 4$ ,  $n = 2^5 - 1 = 31$ .

$$B = 2^{h-1} \cdot 1 + 2^{h-2} \cdot 2 + 2^{h-3} \cdot 3 + \dots + 2^0 \cdot h$$

# Bedre analyse af Build-Max-Heap



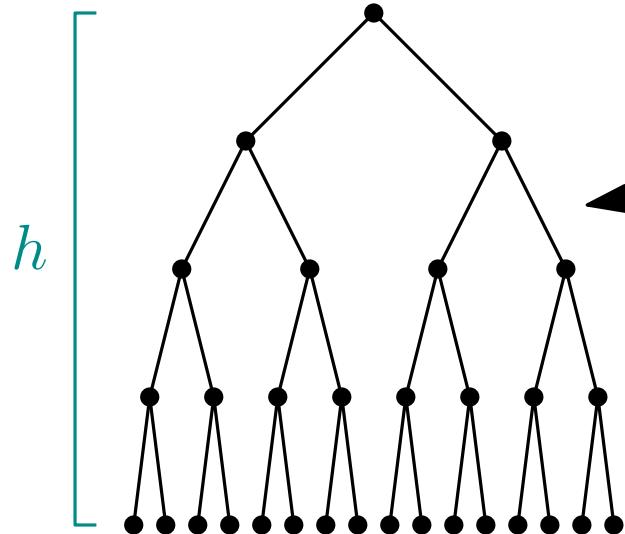
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$$B/2 = B - B/2$$

# Bedre analyse af Build-Max-Heap



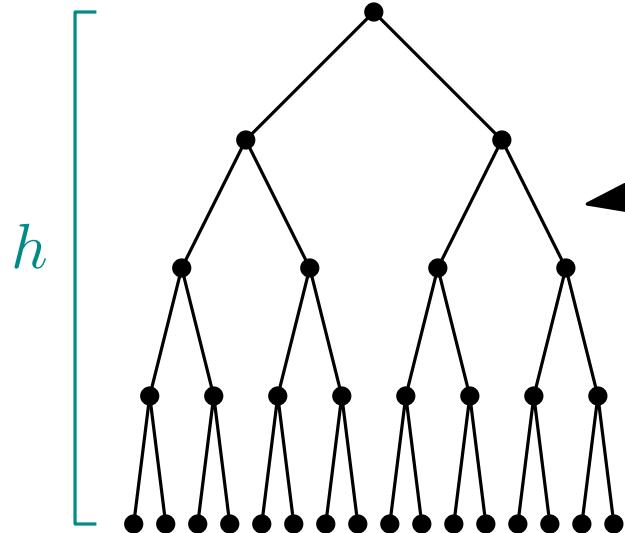
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$$\begin{aligned} B/2 &= B - B/2 \\ &= 2^{h-1} \cdot 1 + 2^{h-2} \cdot 2 + 2^{h-3} \cdot 3 + \dots + 2^0 \cdot h \\ &\quad - 2^{h-2} \cdot 1 - 2^{h-3} \cdot 2 - \dots - 2^0 \cdot (h-1) - 2^{-1} \cdot h \end{aligned}$$

# Bedre analyse af Build-Max-Heap



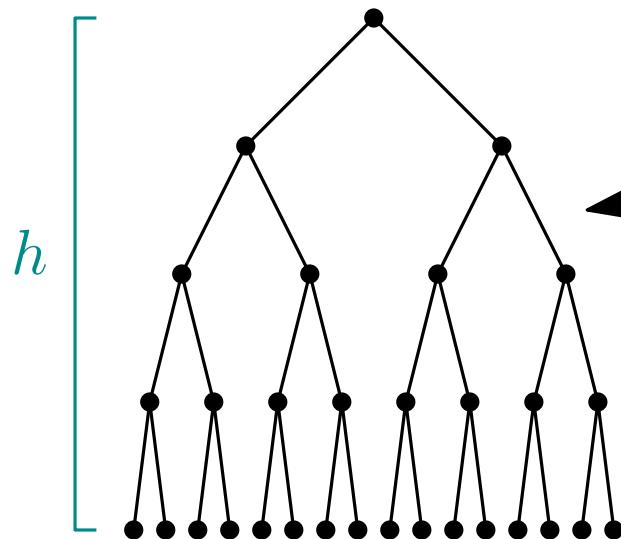
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# Bedre analyse af Build-Max-Heap

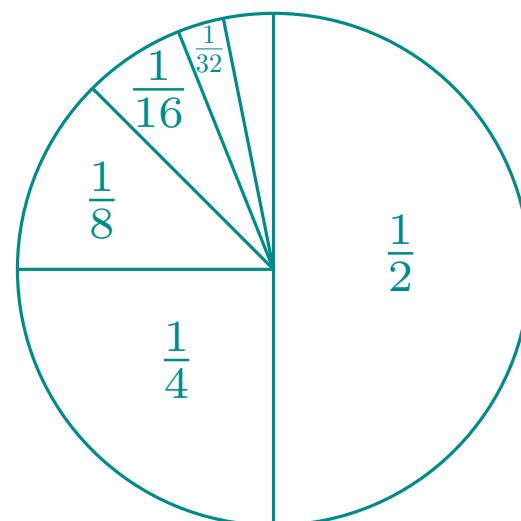


$$n = 2^{h+1} - 1$$

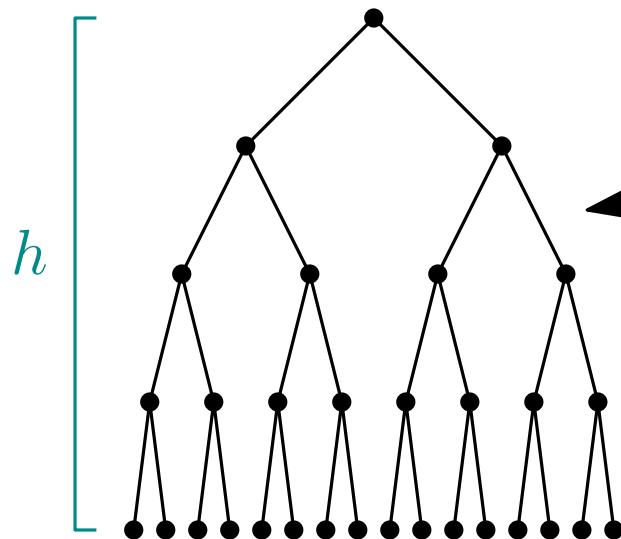
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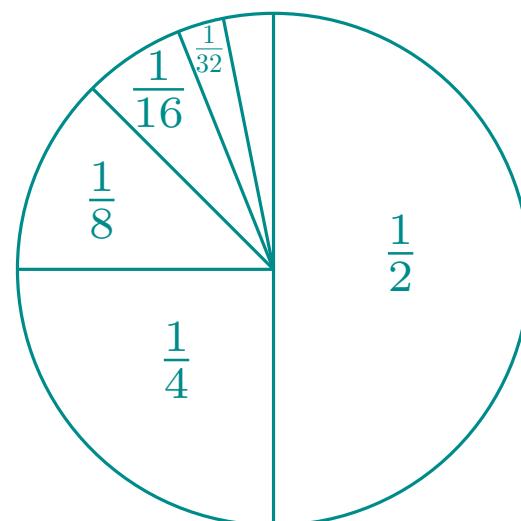


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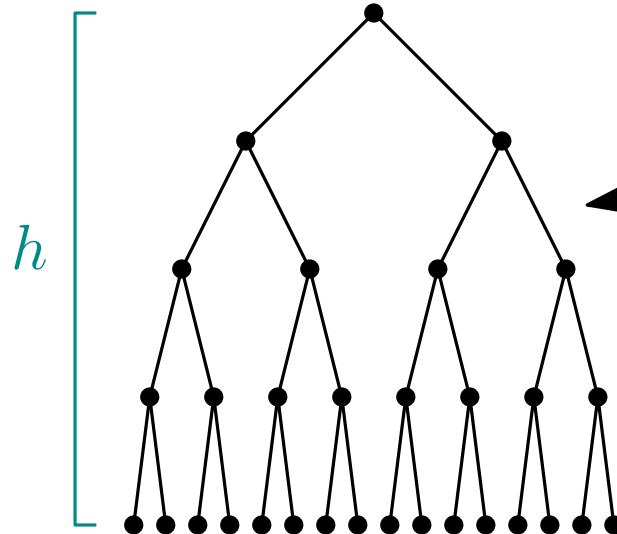
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# Bedre analyse af Build-Max-Heap



$$n = 2^{h+1} - 1$$

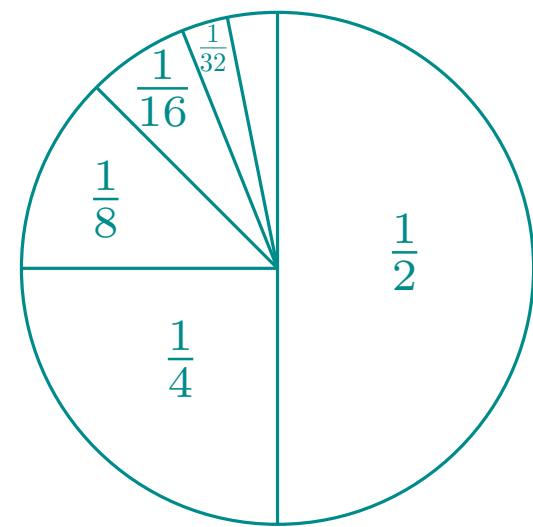
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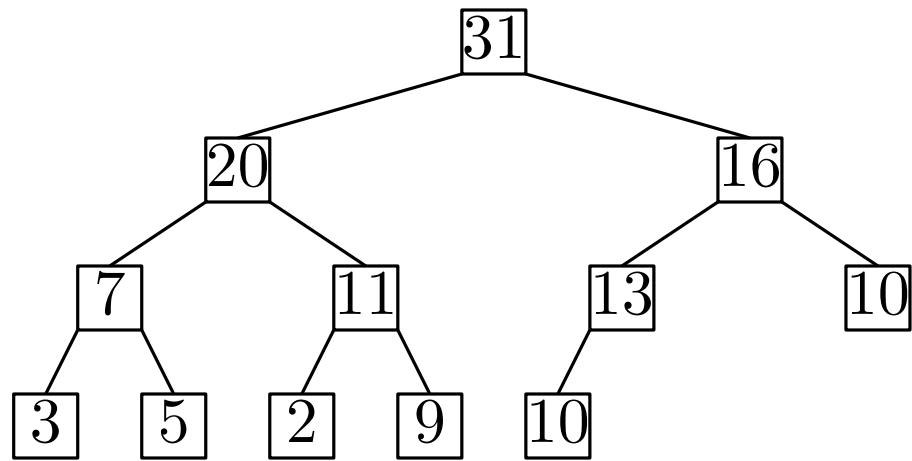
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Konklusion:  $B < 2^{h+1}$ , så  $B \leq 2^{h+1} - 1 = n$ .

Køretid for Build-Max-Heap:  $\Theta(n)$ .

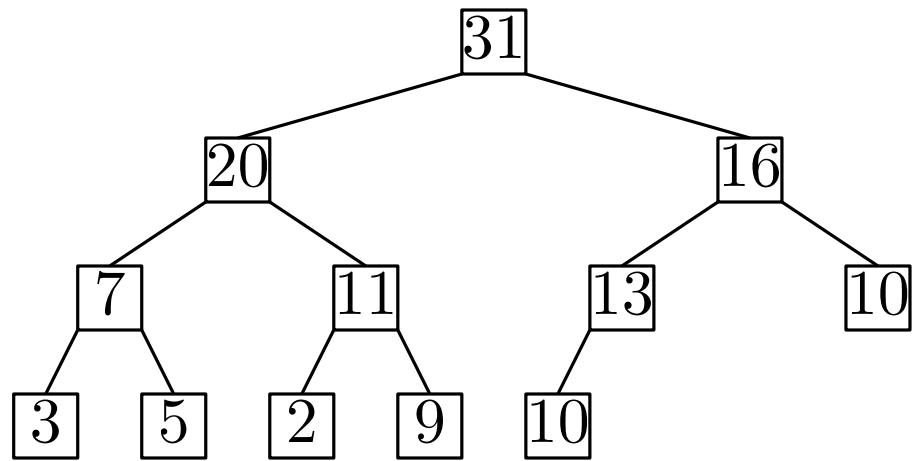


# Opsummering



“Fyldt op”  
Hobeordenen

# Opsummering

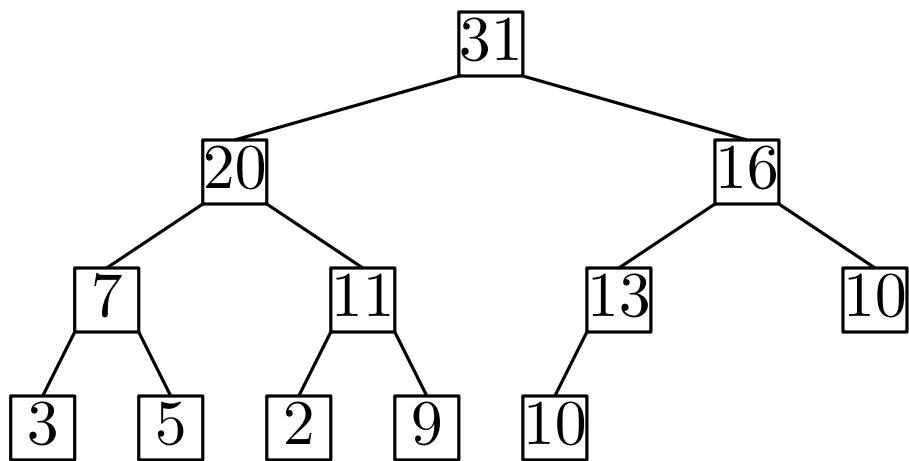


“Fyldt op”  
Hobeordenen

Som array:



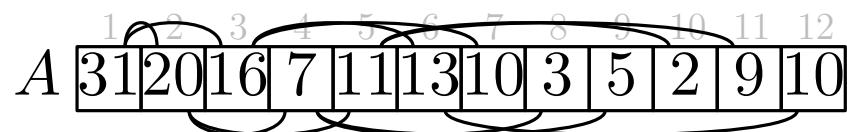
# Opsummering



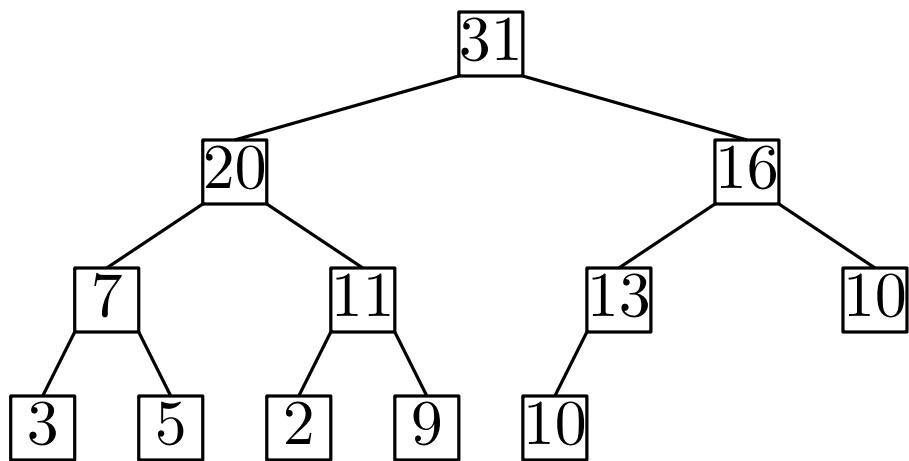
**Extract-Max:** Overskrive rod med sidste tal. Boble ned (**Max-Heapify**).  
**Insert:** Tilføje tal til sidst. Boble op.  
Begge:  $\Theta(\log n)$  tid.

“Fyldt op”  
Hobeordenen

Som array:



# Opsummering

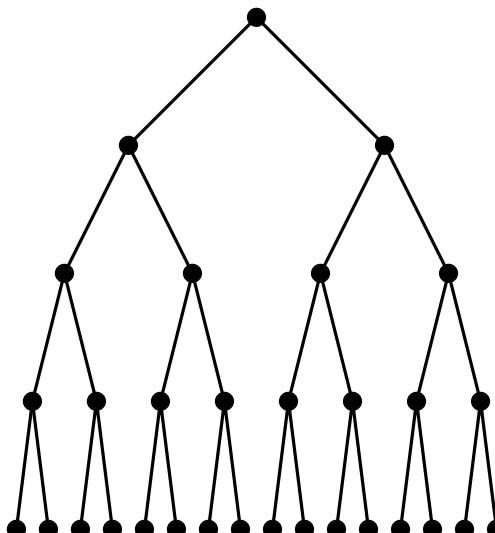


“Fyldt op”  
Hobeordenen

Som array:



**Extract-Max:** Overskrive rod med sidste tal. Boble ned (**Max-Heapify**).  
**Insert:** Tilføje tal til sidst. Boble op.  
Begge:  $\Theta(\log n)$  tid.



**Build-Max-Heap:** Brug Max-Heapify fra  $\lfloor n/2 \rfloor$  ned til 1.  
Nem grænse for køretid:  $O(n \log n)$ .  
Mere omhyggelig:  $\Theta(n)$ .  
Alternativ algoritme: Brug Insert  $n$  gange giver  $\Theta(n \log n)$ .

# Heapsort

```
Heapsort( $A$ )
```

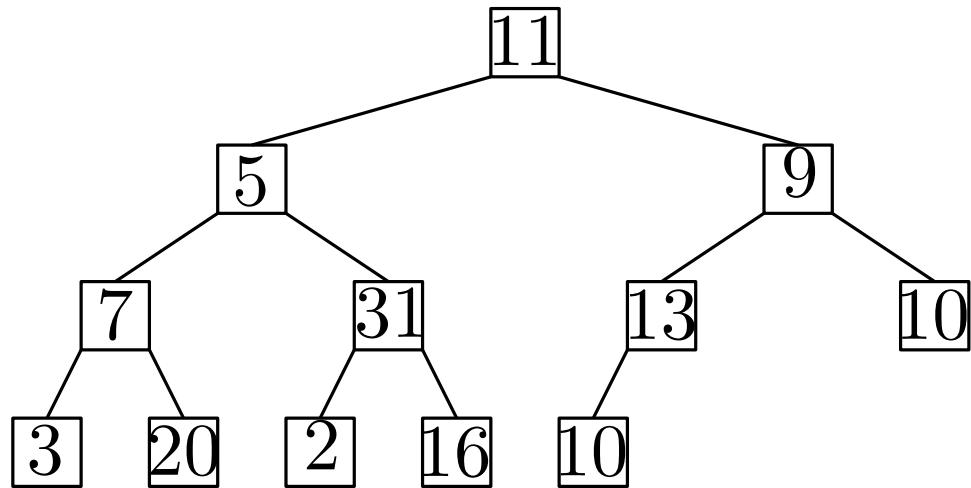
```
    Build-Max-Heap( $A$ )
```

```
    for  $i = A.length$  down to 2
```

```
        swap  $A[1]$  and  $A[i]$ 
```

```
         $A.heap-size = A.heap-size - 1$ 
```

```
        Max-Heapify( $A, 1$ )
```



# Heapsort

Heapsort( $A$ )

Build-Max-Heap( $A$ )

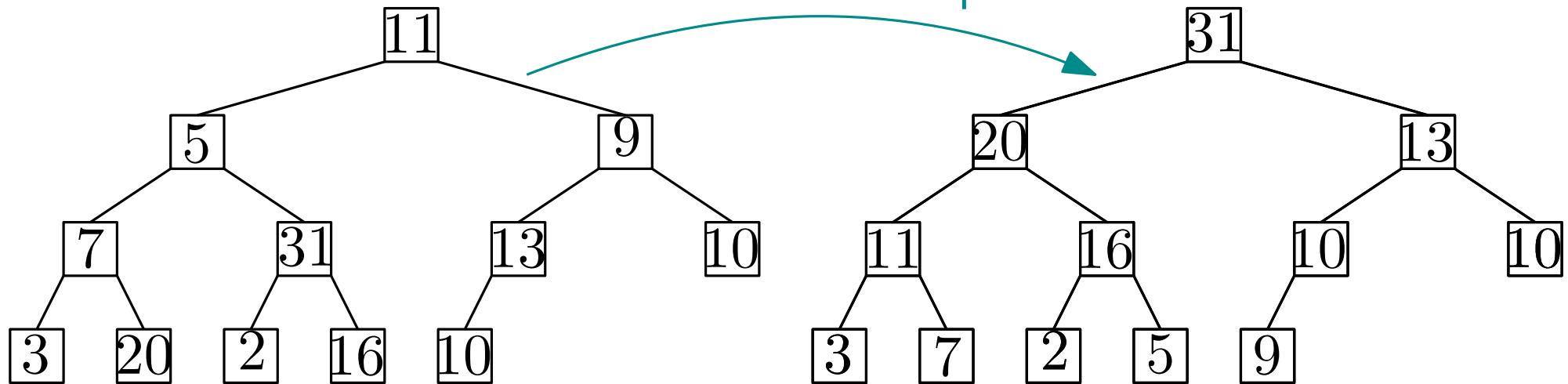
for  $i = A.length$  downto 2

swap  $A[1]$  and  $A[i]$

$A.heap-size = A.heap-size - 1$

Max-Heapify( $A, 1$ )

Build-Max-Heap



# Heapsort

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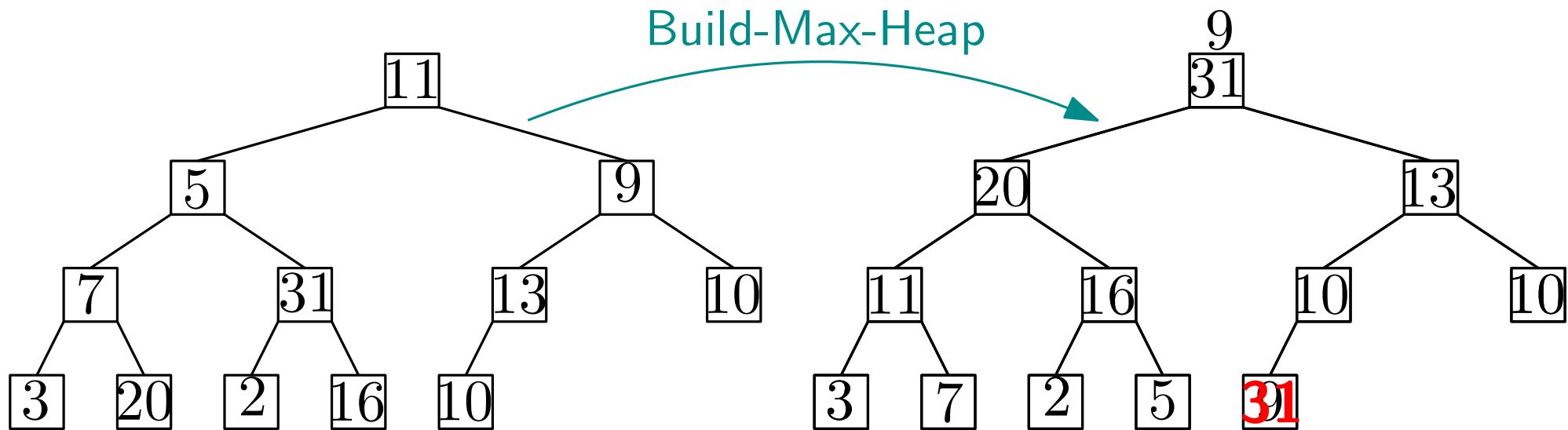
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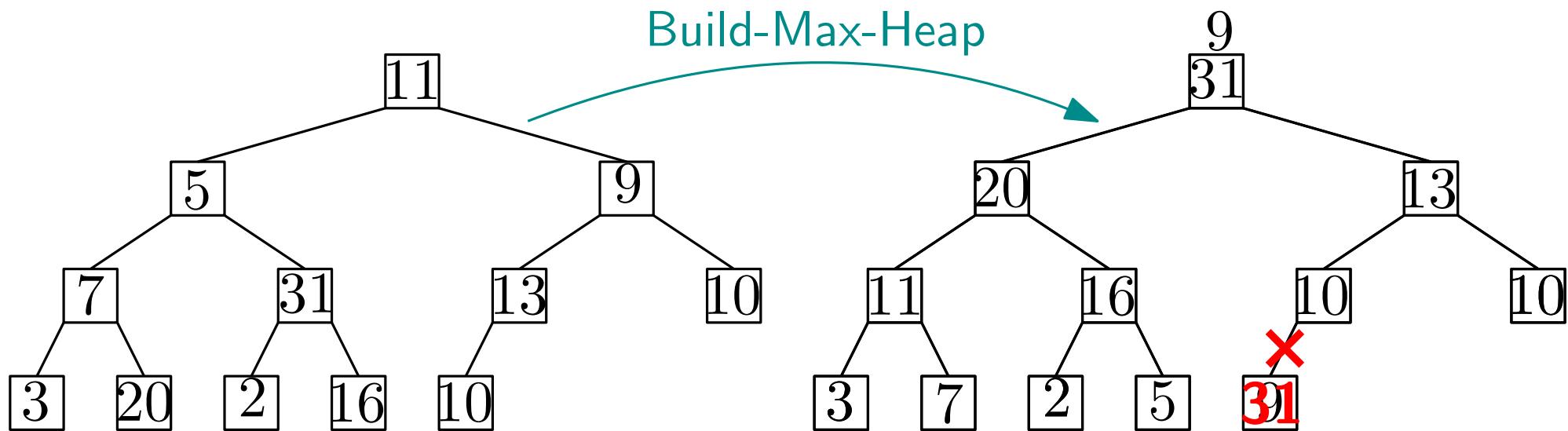
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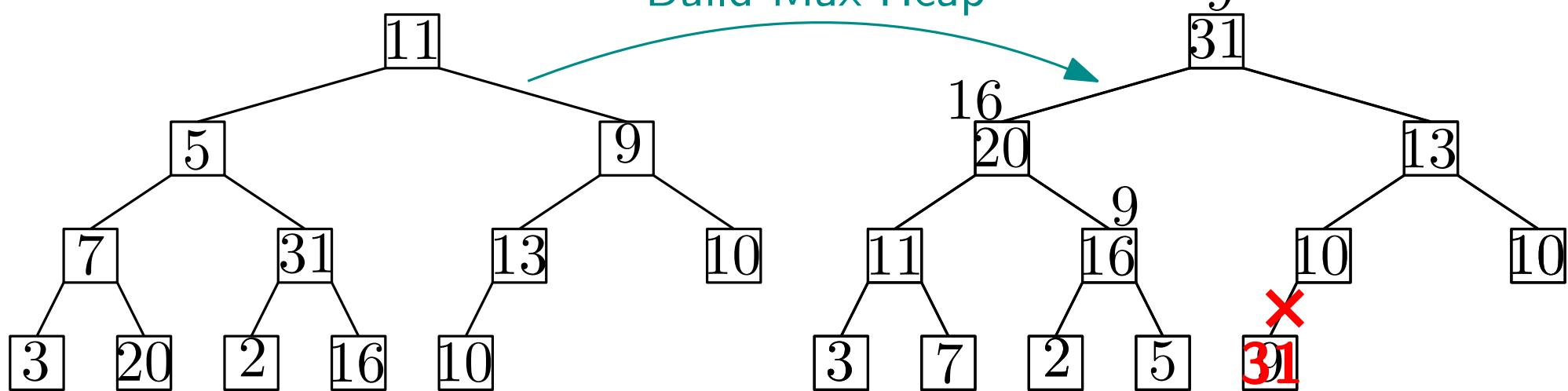
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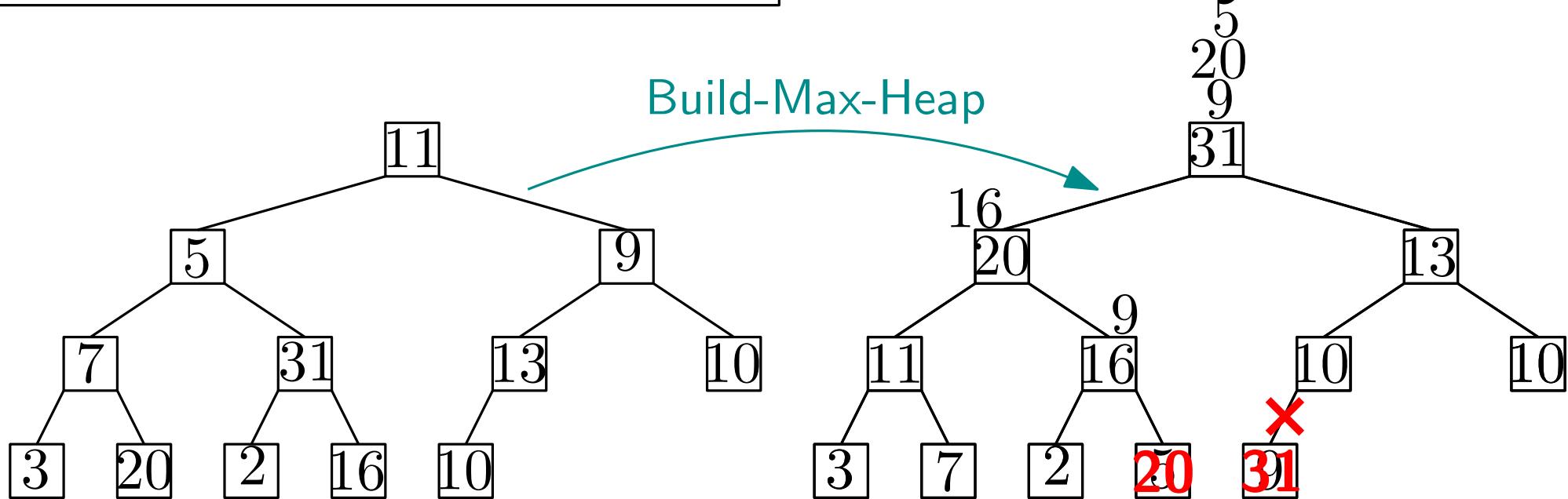
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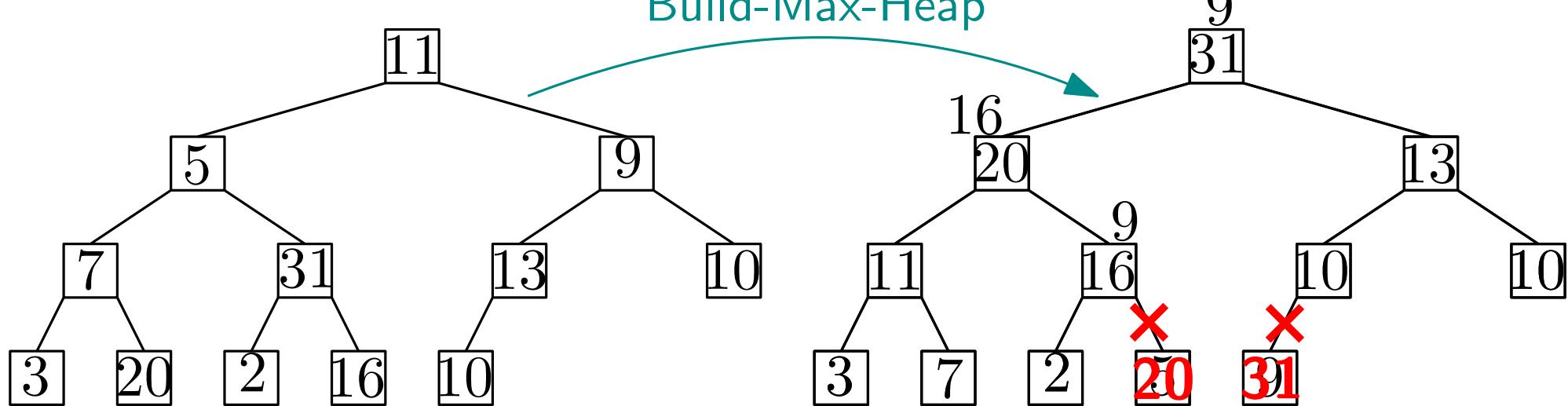
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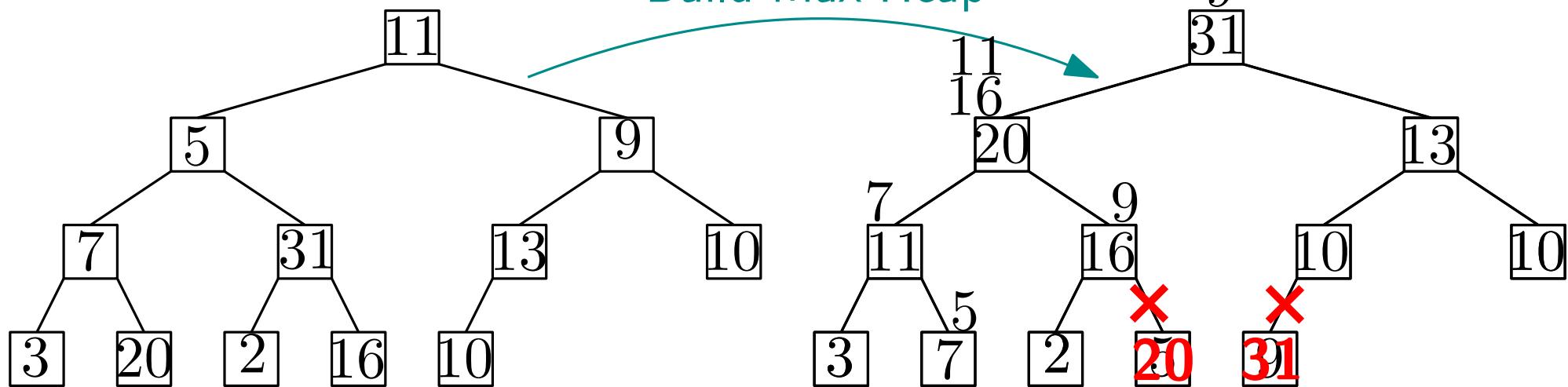
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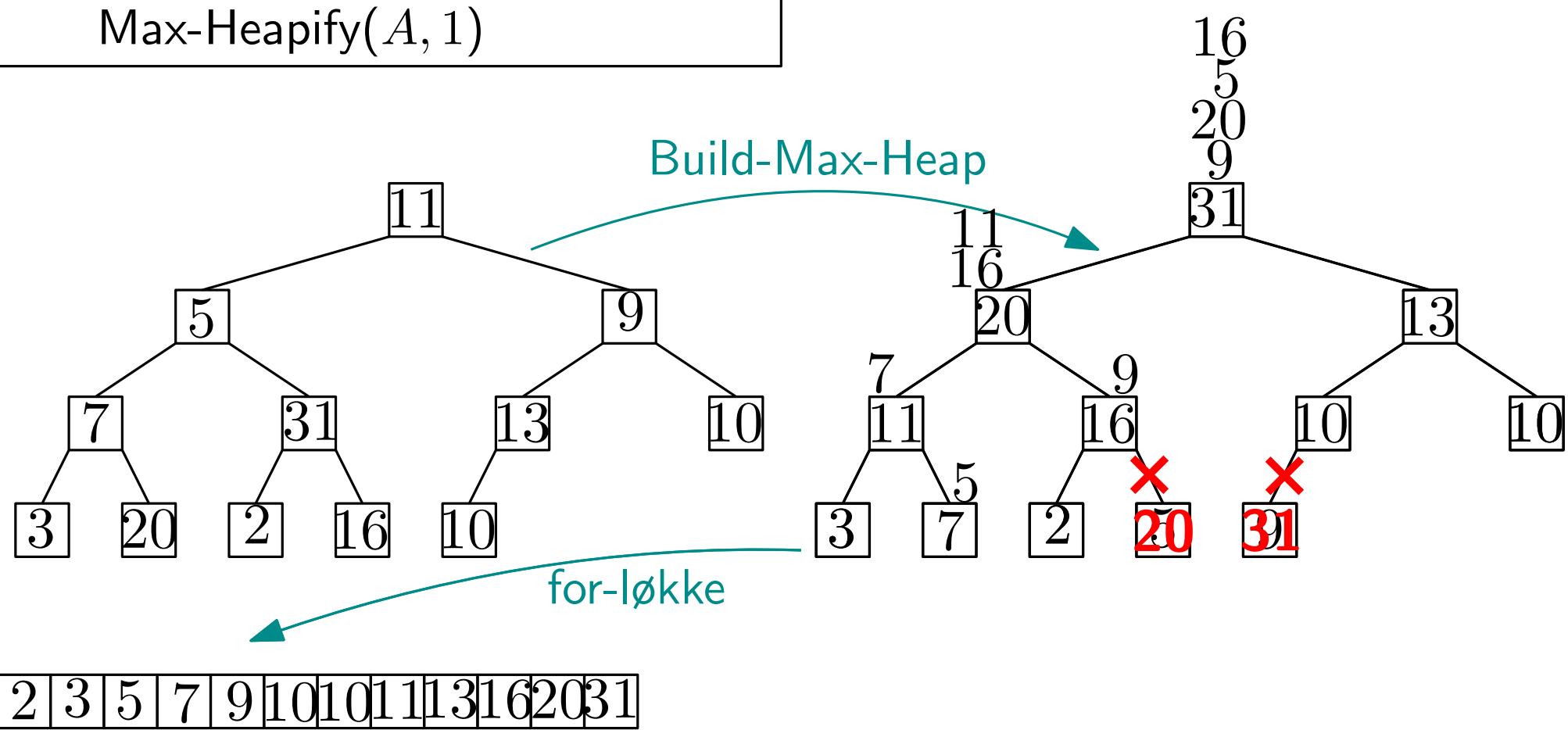
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swap  $A[1]$  and  $A[i]$

$A.heap-size = A.heap-size - 1$

Max-Heapify( $A, 1$ )



# Køretid

Heapsort( $A$ )	Tid	Gange
Build-Max-Heap( $A$ )	$\Theta(n)$	1
for $i = A.length$ downto 2		
swap $A[1]$ and $A[i]$	$\Theta(1)$	$n$
$A.heap-size = A.heap-size - 1$		
Max-Heapify( $A, 1$ )	$O(\log n)$	$n$

# Køretid

Heapsort( $A$ )	Tid	Gange
Build-Max-Heap( $A$ )	$\Theta(n)$	1
for $i = A.length$ downto 2		
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Køretid:  $T(n) = O(n \cdot 1) + O(1 \cdot n) + O(\log n \cdot n) = O(n \log n)$ .

Der gælder også  $T(n) = \Omega(n \log n)$ , så  $T(n) = \Theta(n \log n)$ .

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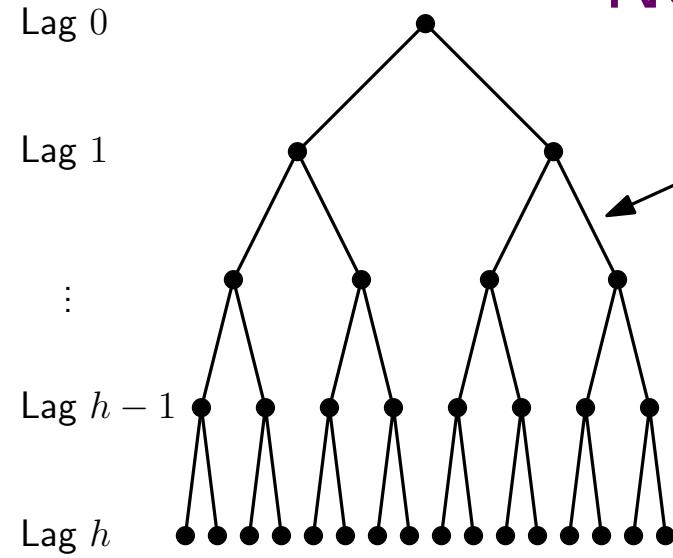
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Ekstra plads:  $\Theta(1)$ .

Bemærk: Merge-Sort bruger  $\Theta(n)$  ekstra plads!

# Nedre grænse for køretid



$$n = 2^{h+1} - 1$$

Her:  $h = 4$ ,  $n = 2^5 - 1 = 31$ .

Nøgleværdier:  $\{1, 2, \dots, n\}$ , én af hver.

Største  $n/2$  værdier kaldes *store*.

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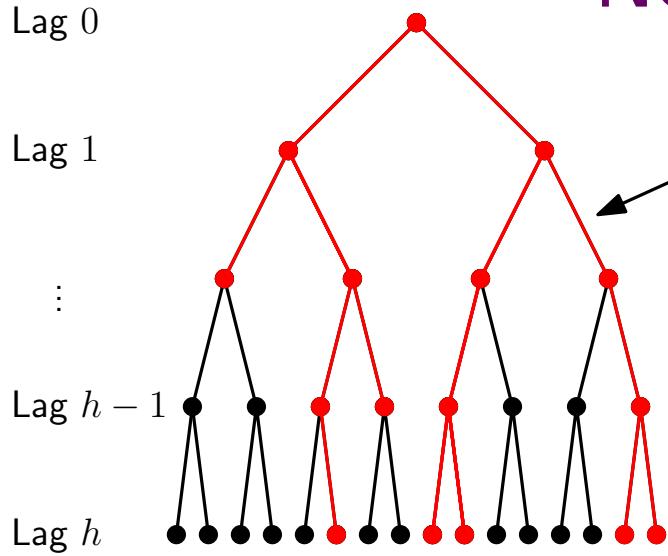
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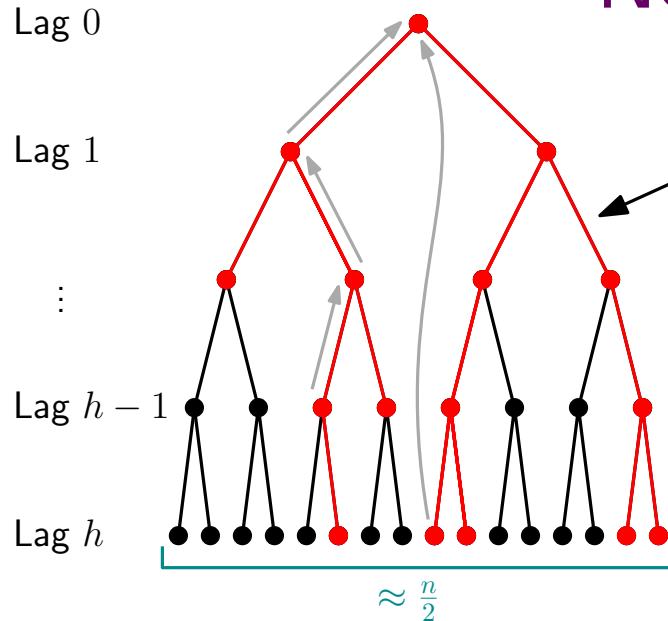
Største  $n/2$  værdier kaldes *store*.

**Observation 1:** Efter Build-Max-Heap danner de store værdier et (sammenhængende) **træ**.



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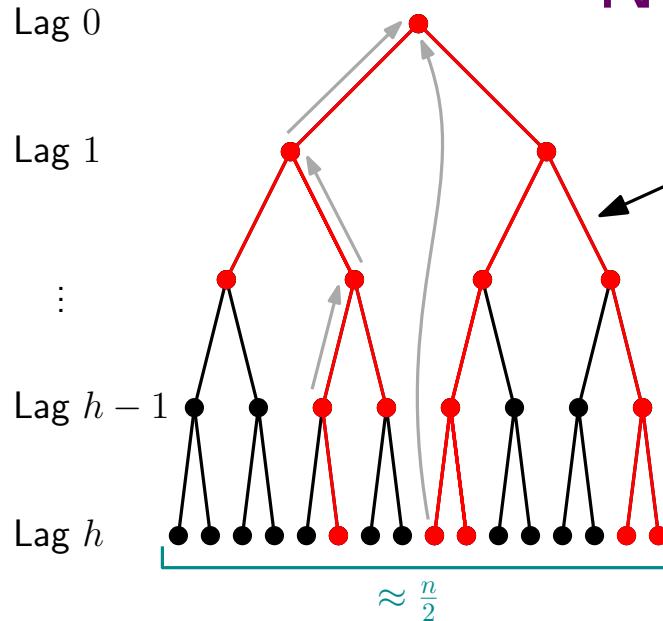
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**Observation 2:** Enhver stor værdi der starter i lag  $h-1$ , bevæger sig til roden og bliver fjernet i løbet af  $n/2$  iterationer. Dvs.  $\Omega(\log n)$  skridt op.

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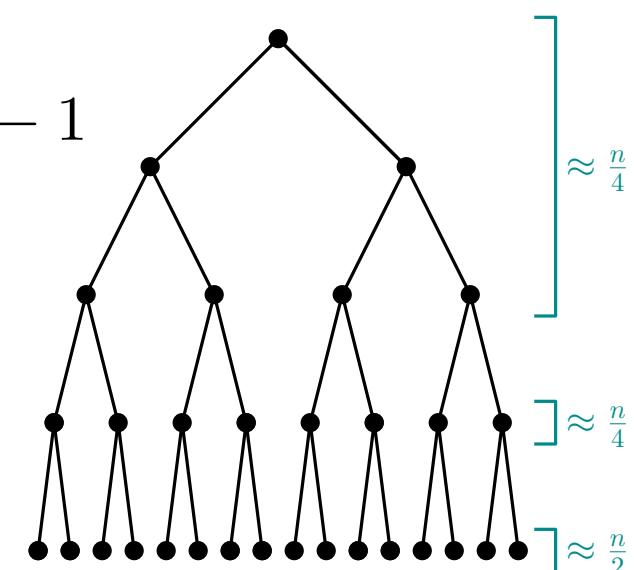
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```

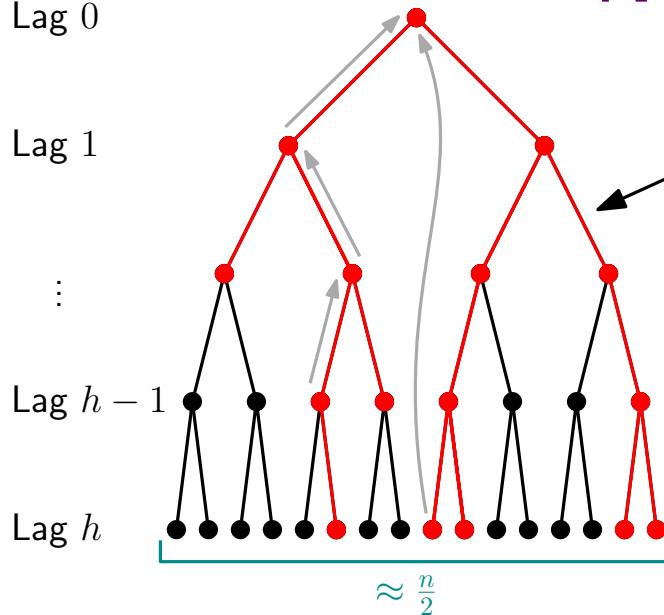
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     $A.heap-size = A.heap-size - 1$ 
Max-Heapify( $A, 1$ )

```

**Observation 3:** Mindst  $n/4$  store værdier i lag  $h-1$  og  $h$  tilsammen.



# Nedre grænse for køretid



$$n = 2^{h+1} - 1$$

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Største  $n/2$  værdier kaldes *store*.

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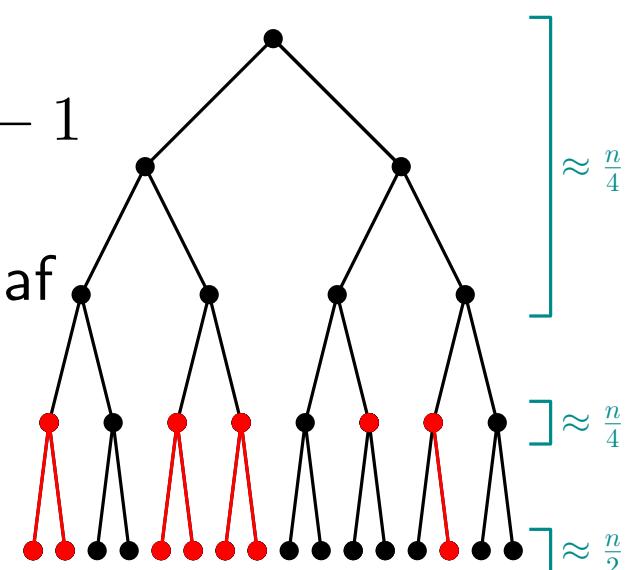
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Build-Max-Heap( $A$ )
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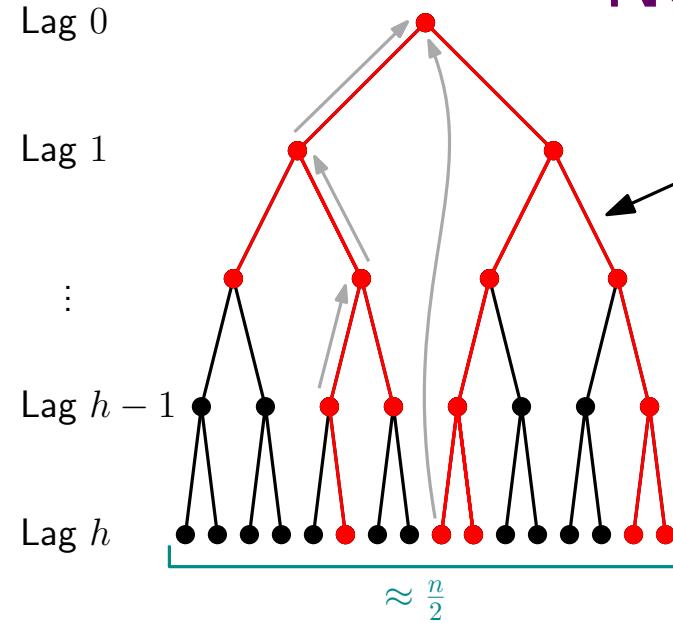
```

**Observation 3:** Mindst  $n/4$  store værdier i lag  $h-1$  og  $h$  tilsammen.

**Observation 4:** Lag  $h-1$  indeholder mindst  $1/3$  af alle store værdier i lag  $h-1$  og  $h$   $\Rightarrow$  mindst  $n/12 = \Omega(n)$  store værdier i lag  $h-1$ .



# Nedre grænse for køretid



$$n = 2^{h+1} - 1$$

Her:  $h = 4$ ,  $n = 2^5 - 1 = 31$ .

Nøgleværdier:  $\{1, 2, \dots, n\}$ , én af hver.

Største  $n/2$  værdier kaldes *store*.

**Observation 1:** Efter Build-Max-Heap danner de store værdier et (sammenhængende) **træ**.

**Observation 2:** Enhver stor værdi der starter i lag  $h-1$ , bevæger sig til roden og bliver fjernet i løbet af  $n/2$  iterationer. Dvs.  $\Omega(\log n)$  skridt op.

```

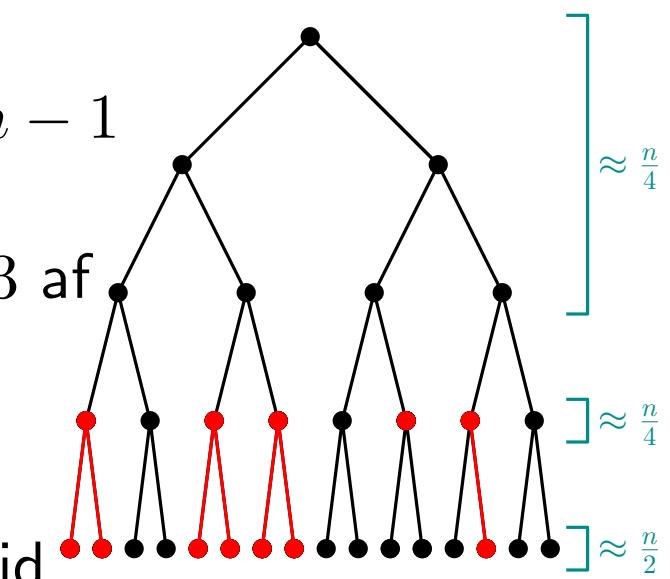
Heapsort( $A$ )
Build-Max-Heap( $A$ )
for  $i = A.length$  downto 2
    swap  $A[1]$  and  $A[i]$ 
     $A.heap-size = A.heap-size - 1$ 
Max-Heapify( $A, 1$ )

```

**Observation 3:** Mindst  $n/4$  store værdier i lag  $h-1$  og  $h$  tilsammen.

**Observation 4:** Lag  $h-1$  indeholder mindst  $1/3$  af alle store værdier i lag  $h-1$  og  $h$   $\Rightarrow$  mindst  $n/12 = \Omega(n)$  store værdier i lag  $h-1$ .

**Konklusion:** Observation 2+4 giver  $\Omega(n \log n)$  tid.



# Hvor meget forstod du af beviset?

socrative.com → Student login,  
Room name: ABRAHAMSEN3464

Det hele.

A

Det meste.

B

Noget.

C

Kun en lille smule.

D

Ingenting.

E